

Analysis and Processing of Mechanically Stimulated  
Electrical Signals for the Identification of  
Deformation in Brittle Materials

by

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*Dedicated to my parents and siblings*

## Abstract

The fracture of brittle materials is of utmost importance for civil engineering and seismology applications. A different approach towards the aim of early identification of fracture and the prediction of failure before it occurs is attempted in this work.

Laboratory experiments were conducted in a variety of rock and cement based material specimens of various shapes and sizes. The applied loading schemes were cyclic or increasing and the specimens were tested to compression and bending type loading of various levels.

The techniques of Pressure Stimulated Current and Bending Stimulated Current were used for the detection of electric signal emissions during the various deformation stages of the specimens. The detected signals were analysed macroscopically and microscopically so as to find suitable criteria for fracture prediction and correlation between the electrical and mechanical parameters.

The macroscopic proportionality of the mechanically stimulated electric signal and the strain was experimentally verified, the macroscopic trends of the PSC and BSC electric signals were modelled and the effects of material memory to the electric signals were examined. The current of a time-varying RLC electric circuit was tested against experimental data with satisfactory results and it was proposed as an electrical equivalent model.

Wavelet based analysis of the signal revealed the correlation between the frequency components of the electric signal and the deformation stages of the material samples. Especially the increase of the high frequency component of the electric signal seems to be a good precursor of macrocracking initiation point. The additional electric stimulus of a dc voltage application seems to boost the frequency content of the signal and reveals better the stages of cracking process. The microscopic analysis method is scale-free and thus it can confront with the problems of size effects and material properties effects.

The AC conductivity time series of fractured and pristine specimens were also analysed by means of wavelet transform and the spectral analysis was used to differentiate between the specimens. A non-destructive technique may be based on these results.

Analysis has shown that the electric signal perturbation is an indicator of the forthcoming fracture, as well as of the fracture that has already occurred in specimens.

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## Nomenclature

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### ABBREVIATIONS

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3PB	Three Point Bending
AE	Acoustic Emission
BSC	Bending Stimulated Current
CDM	Continuum Damage Mechanics
CWT	Continuous Wavelet Transform
DWT	Discrete Wavelet Transform
FBM	Fibre Bundle Model
FRP	Fibre Reinforced Polymer
FT	Fourier Transform
GEV	Generalised Extreme Value
GPIB	General Purpose Interface Bus
MCD	Moving Charged Dislocations
PCHIP	Piecewise Cubic Hermite Interpolation Polynomial
PDF	Probability Density Function
PSC	Pressure Stimulated Current
SES	Seismic Electric Signals
STFT	Short Time Fourier Transform
WT	Wavelet Transform

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### NOTATION

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$\sigma$	stress
$\varepsilon$	strain
$\nu$	Poisson's ratio
$Y$	Young's modulus
$J$	electric current density
$Q$	electric charge
$\sigma_{ac}$	ac conductivity
$\psi^{a,b}$	mother wavelet

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# Chapter 1

## Introduction

# 1 Introduction

## 1.1 Motivation and perspectives of research

Electronic engineering development and the technological advancements during the last decades, has led to the infiltration of electronics into every single discipline of research. Electronics as core technology in mobile communications, computers, nanoelectronics and artificial intelligence applications have changed everyday life of modern world, but they have also acted as a powerful enabler for the development of other long-established sciences. Mechanical and chemical engineering, as well as biology and medicine have been offered powerful electronic and computer tools that facilitate accuracy, integrity, minimisation of errors, speed of processing, minimisation of costs, high quality products and services, sophisticated solutions of complex problems and transfer of human experience to machines.

Geotechnology and seismology have been benefited by the expansion of computer networks and datalogging systems as well as of the latest research in satellite based remote sensing. Civil engineering has been influenced by the advantages of computer parallel processing and finite element methods to model and solve complex problems. Between the two aforementioned sciences no evident correlation exists, but they share a common interest for fracture phenomena and processes.

Looking deeper in their objectives, the two sciences are trying to predict the fracture occurrence by identifying and evaluating the causes behind it. Civil engineering focuses of the stresses distribution, tries to predict their values and keep it within tolerance limits, whereas seismology seeks for geological precursory evidence and periodicity of phenomena to predict the evolution of crust fracture and therefore the resulting earthquake.

The common fracture properties of brittle construction materials and geomaterials, alongside with the consensus about the existence of electromagnetic signal which is precursory to fracture, were the basic motivations of this work. Electric signal can be detected and measured with accuracy owing to the available devices and sensors and sophisticated tools for processing of the signal can reveal information that were 'invisible' with conventional processing tools.

Therefore a better understanding and more accurate prediction of the fracture based on localised data and correlation of fracture with respect to its results (i.e. electric signal emission) instead to its causes, would be beneficial for both sciences. Upon the results of this core research topic, civil engineering applications such as self-healing buildings and

non-destructive testing, as well as the most crucial quest of seismology, i.e. the earthquake prediction, would obtain long perspectives of development.

## 1.2 Objectives and contribution of this work

The ultimate objective of this work is to correlate the resulting strain and fracture of a material sample, because of stress application, to the corresponding electric signal emission. The success of this objective involves primary and secondary aims that are given concisely below.

- ⊕ Verification of the existence of mechanically stimulated electric signals for a variety of brittle materials; the universality of brittle fracture induced phenomena.
  - ⊕ Comparison between mechanically stimulated electric signals of different materials to reveal differences and similarities.
- ⊕ Settlement of standard experimental techniques for the detection of mechanically stimulated electric signal flowing out of brittle material specimens.
  - ⊕ Design of mechanical and electrical setup for standard compression and bending laboratory fracture tests.
  - ⊕ Selection of measuring equipment and appropriate measurement settings.
  - ⊕ Specification of material, shape and positioning of sensing elements, to enable signal detection and avoid mutual coupling and signal interference.
  - ⊕ Identification of the ambient experimental setup parameters that may affect the signal; quantification of their influence and minimisation within acceptable tolerances.
  - ⊕ Amendments in the experimental techniques, so as to focus on specific fracture related properties of the signal.
- ⊕ Analysis of the detected signal and correlation with its mechanical properties.
  - ⊕ Noise level analysis and filtering of the signal
  - ⊕ Differentiation between the signal that is related to permanent mechanical deformation and the signal related to dynamic deformation.
  - ⊕ Evaluation of the influence of memory and size effects on the signal.
  - ⊕ Identification of the signal trends and their correlation to the stage of deformation and the type of loading.
  - ⊕ Identification of the most reliable parameter of the signal to evaluate for concluding on the deformation it has suffered and its remaining strength.

- ⊕ Definition of signal evaluation criteria for the prediction of the forthcoming failure before the stage of unstable crack evolution.
  - ⊕ Testing of various stress modes effect on signal close to fracture region of the material samples.
  - ⊕ Advanced mathematics processing for failure precursory information of the signal.

In this work we have focus in most of the aforementioned research goals and we have contributed with some innovative ideas concerning the signal processing and the experimental techniques.

### 1.3 Roadmap of the thesis

This thesis follows a bottom up approach in the presentation of information. Following to the initial chapter of introduction, we present in Chapter 2 the basic theoretical knowledge in the scientific fields that are involved in this multidisciplinary work. We analyse in separate subsections the mechanical and civil engineering basic ideas that are used for experiments and for interpretation of data, as well as the related work on the domain of electric signals triggered by mechanical stimuli, which is conducted by other researchers. Another subsection of Chapter 2 is dedicated to the advanced mathematical tool of signal processing known as Wavelet analysis that has been extensively used in this work.

In Chapter 3 we have gathered together the experimental techniques used in this work. We have referred to the properties of the materials under examination and to the specification of the measuring systems that have been used. We have presented the experimental techniques by separating them into two domains the real time and the non-real time. The former was analysed separately into the two consisting parts i.e. the PSC and the BSC experimental techniques respectively. The non-real time experimental process has one representative, namely the ac-conductivity time series experimental technique.

The analysis of the signals recorded by the aforementioned experimental techniques is presented in Chapters 4 and 5 from the macroscopic and microscopic point of view respectively. Chapter 4 contains the macroscopic parameters of the PSC and BSC signals evolution and modelling. It focuses on the trends of the signal during cyclic and increasing loading and shows the effects of material memory into the signal. It also presents some comparative analysis between signals of different materials and a framework for the understanding of electrification mechanisms according to the deformation stages. Chapter 5 is dedicated to microscopic analysis of the signal via the powerful tool of wavelet



transform. The signal is depicted in form of scalograms in order to emphasise on its frequency content. Time-scale analysis of both PSC and BSC signals is presented in this chapter. A subsection is dedicated to the wavelet analysis results for the differentiation of pristine and fractured specimens through the evaluation of spectral analysis of ac conductivity time series.

In Chapter 6 the results of this work are summarised and the guiding lines for the next research steps are given. Future work that can be based on the outcome of this research is presented as a triggering for innovative research projects.

## Chapter 2

# Theoretical Background

## 2 Theoretical background

### 2.1 Introduction

This work is multidisciplinary and it involves some basic knowledge of civil engineering and fracture mechanics, as well as signal processing and wavelets analysis that are mostly used in electronic engineering for processing and compressing signals. The necessary background theory for understanding this work ideas and concepts are addressed in the following sections.

### 2.2 Fracture mechanics and physical models

#### 2.2.1 Stress and strain basic concepts

Stress is the internal response of a homogenous body to an externally applied force. The body shown in Figure 2.1a is by hypothesis in a static equilibrium and thus according to action and reaction principle when an external force  $F_{\text{ext}}$  is applied the body reacts by an equivalent force  $F_{\text{int}}$ , which acts in the cross sectional area  $A$ . The stress  $\sigma$  is given by equation (2.2.1) in the idealised case that external force is perpendicular to area  $A$ .

$$\sigma = \frac{F}{A} \quad (2.2.1)$$

Generally for any force on a specimen other for geometrically regular prism specimens or for any continuous and homogenous body the external force  $F_{\text{ext}}$  can be analysed into a perpendicular force  $F_P$  and a tangential force  $F_T$  to the cross sectional plane. These two

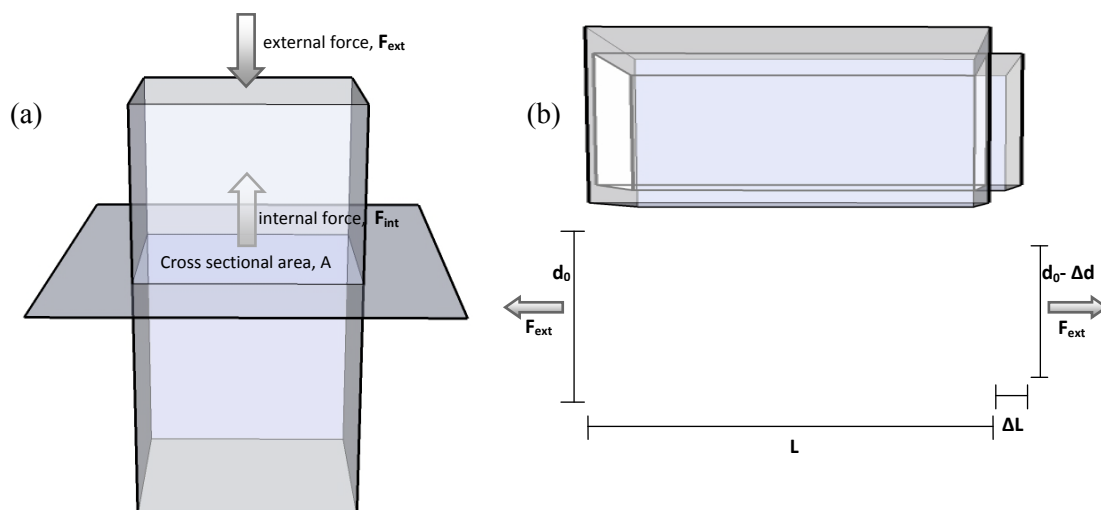


Figure 2.1 (a) Stress in a column as a result of an externally applied force  $F_{\text{ext}}$  (b) longitudinal and lateral strain in an elongated beam by means of external tensile force.

forces are used to define the normal stress  $\sigma$  and the shear stress  $\tau$ , for a specific point just by minimizing area  $A$  to infinitesimal dimensions, as shown in equation (2.2.2).

$$\sigma = \lim_{A \rightarrow 0} \frac{|F_P|}{A} \quad \text{and} \quad \tau = \lim_{A \rightarrow 0} \frac{|F_T|}{A} \quad (2.2.2)$$

Both  $\sigma$  and  $\tau$  vary in a body and depend upon the cross sectional plane orientation in the point of interest. Therefore the stress is better defined by a stress tensor, which represents the mean forces acting on an infinitesimal cube that is defined around the point. A more detailed description of this tensor analysis of stress can be found in (Sanford, 2003).

The result of the stress in a body is the deformation, either contraction in case of compressive stress or elongation in tensile stress case, as shown in Figure 2.1b. Strain  $\varepsilon$  is an absolute number expressing the ratio of the elongation  $\Delta L$  to the initial length  $L$  of the body, as shown in equation (2.2.3a) and the ratio of the width decrease  $\Delta d$  to the original width  $d_0$ , as shown in equation (2.2.3.b). The two expressions of strain are known as the longitudinal and lateral strain respectively.

$$\varepsilon_{longitudinal} = \frac{\Delta L}{L} \quad \text{and} \quad \varepsilon_{lateral} = -\frac{\Delta d}{d_0} \quad (2.2.3)$$

The ratio expressing strain is usually extremely small and thus values are given in  $\mu\text{m/m}$ , multiplied by a factor of  $10^6$ .

The relation between stress and strain is a typical cause and effect relation. For low stress values a linear relation between stress and strain is observed, which is described by the so called modulus of elasticity  $Y$  or Young's Modulus, named after Thomas Young a pioneer physicist.

$$Y = \frac{\sigma}{\varepsilon} \quad (2.2.4)$$

Equation (2.2.4) is the definition of Young's modulus. As far as a stressed material sample follows this linear relation known as Hooke's law of elasticity is considered to be in the elastic region, as opposed to the plastic region, both regions are shown in Figure 2.2.

The relation between the two different directions of strain are characteristic for each material and it is expressed by a proportional constant, known as Poisson's ratio, which is given by equation (2.2.5).

$$\nu = \frac{\varepsilon_{lateral}}{\varepsilon_{longitudinal}} \quad (2.2.5)$$

Typical value for Poisson's ratio of steel and iron is 0.3, for aluminium is 0.34 and for concrete and rocks is considerably lower at 0.1. These values may be taken into account for the selection of the specimen dimensions in the experiments.

The stress-strain curve can depict graphically the relationship between stress and strain. It can also give information about the mechanical stages of a material sample and about its corresponding behaviour. In Figure 2.2 is shown a typical stress-strain curve and the stages of the mechanical deformation of a brittle material, beginning from the stage that the material is considered to be pristine up to the stage of failure and collapse. The experiments that lead to these results are conducted by either increasing the stress monotonically or by loading in stress relaxation mode, which is equivalent to keep strain increase constant. The basic stages of the material fracture are briefly explained using the stress as parameter of control.

- i. The first stage is the closing of cracks stage, which corresponds to the initial part of the stress-strain curve and it is characterised by a quick and non linear increase of strain as the stress increases. The stress on the material sample leads to the compression and closing of the inherently present cracks even at a theoretically pristine sample.

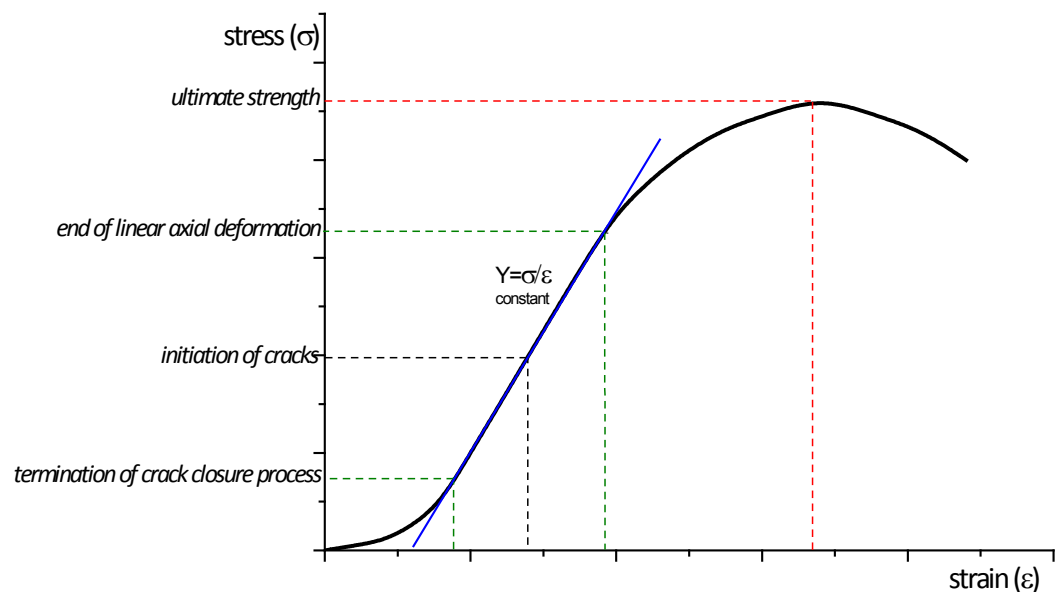


Figure 2.2 The stages of deformation and fracture of brittle materials in uniaxial stress and the corresponding relationship between stress and strain in compression

- ii. The second stage is known as the elastic region of the material, because deformation is not permanent, if the material sample is subjected to cyclic loading of these stress levels. Despite the linear relation between stress and strain in this stage, the “elasticity” in brittle materials is different to this of ductile materials. At a specific stress level of this stage the pre-existing cracks in the bulk of the material start to propagate. The propagation is normal, which means that the increase of stress is followed by a stable

pace crack propagation and if no stress is further applied the crack propagation stops (Bieniawski, 1967).

- iii. Further increase in the stress level has a severe impact on the strain of the material sample. Linearity is no longer maintained and the deformation of the material is permanent and irreversible. The crack growth is unstable and even in the case that the increase of stress stops, the propagation of the crack does not. The higher stress level that a material can bear is denoted in Figure 2.2 by a red dotted line and corresponds to the ultimate strength of a material sample. It is a key parameter for the experiments of this work that characterises the material under examination and is equivalent to the peak value of a stress-strain curve.
- iv. The last part of axial test of a brittle material sample is characterised by the negative slope of the stress-strain curve. Although the strain increases, the stress drops and that is the precursor of the complete disintegration of the rock specimen. The exact moment of the violent failure of the specimen cannot be easily predicted and it depends on various parameters of the specimen, the loading machine and the loading scheme.

The stages of axial stress tests that lead pristine rocks to rupture are analysed in (Bieniawski, 1989) and more details on the stress-strain curves and the way that can be used for determining the compressive and tensile stress, as well as the values of Poisson's ratio of rock material is given in (Jaeger, Cook, & Zimmerman, 2007). In the following chapters, the experiments will be described in the frame of the aforementioned classification of brittle materials deformation, although separation between the stages is not always evident in practice. Unless, thorough evaluation of all parameters is made stress-strain curve can be deceiving. In the case of the linear part of the stress-strain curve for example, which is considered as an indication of elastic behaviour of the material, although in reality can be the resultant of simultaneous crack closing and fracture propagation, as explained in (Glover P. W., Gomez, Meredith, Sammonds, & Murrel, 1997).

### **2.2.2 Memory effect in fracture of brittle materials**

Mechanical loading of rocks and brittle materials in general is accompanied by damage accumulation that results in changes of their physical properties. The phenomenon of non-reproducibility of acoustic emission during cyclic loading of rock samples to the level of the previous cycle was initially observed on sandstone specimens in (Kaiser J. , 1953) and thus it is known as 'Kaiser effect', named after the researcher. The Kaiser effect for acoustic emission was proved to be a generic effect of fracture of brittle materials which

was observed in a variety of rocks (Lavrov, 2003). This property of non-reproducibility, i.e. the ability of rocks to retain "imprints" from former treatment, is known as memory and it has been observed for various accompanying phenomena of mechanical deformation yielding from cyclic loading, which are referred as 'memory effects'.

Memory effects are defined in (Shkuratnik & Lavrov, 1999), as the changes of physical properties of brittle materials, which are subjected to repetitive mechanical loading, that occur when the stress or strain approximates or overcomes the value of the highest previously memorised stress or strain level accordingly. Manifestation of the memory phenomena in brittle materials has been observed in acoustic emissions (Kaiser J. , 1953), (Pestman & Van Munster, 1996) and in electromagnetic emissions that accompany deformation, as in the case of earthquake precursory EM signal (Kapiris, Balasis, Kopanas, Antonopoulos, Peratzakis, & Eftaxias, 2004). In accordance with the before-mentioned phenomena, memory effects were also examined in the case of infrared emissions and particularly the intensity of infrared radiation was correlated with stress level by (Sheinin, Levin, Motovilov, Morozov, & Favorov, 2001). Reviews of memory effects in non-elastic deformation, commonly known as strain hardening, as well as memory effects in fractoemission, in elastic wave velocity, in electric properties and permeability are given in (Yamshchikov, Shkuratnik, & Lavrov, 1994), (Filimonov, Lavrov, Shafarenko, & Shkuratnik, 2001) and (Lavrov, 2005).

Although memory effects refer to diverse physical properties of materials subjected to loading, they all exhibit some common features, probably because the changing of physical properties is the result of the same causal phenomenon, which is the crack formation and propagation. The most universal characteristic of memory is the decay in the course of time, which means that memory effects dwindle when the time interval between events increases. Another characteristic is that 'water' (i.e., moistening of the material in the intervals between successive loadings) is a parameter that also reduces the existence of memory effects. However, the most important parameter to evaluate is the exact repetition of the same loading level and direction of stress. It has been observed by (Lavrov, 2005) that even minor changes in the stress axes between  $10^\circ$  and  $15^\circ$  can lead to the vanishing of the memory effect and thus memory effects are prone not only to loading scheme and level, but also to direction of the applied loading.

This is an open issue in memory effects research field, as the results of experimental work on uniaxial stress are far from the triaxial stresses and the complex loadings of real world.

A part of this work is based on the theory of dynamic changes of electric properties of axially loaded materials and memory phenomena related to it. Another key issue and open problem seeking for answers is the time of complete vanishing of ‘memory’, if any.

### 2.2.3 Size effects in fracture

Specimens of the same material, but of different size, exhibit different physical properties, as their tensile strength for example. This phenomenon was initially observed by Griffith, who attributed it to the pre-existing microcracks in the bulk of the material and by Weibull, who proposed a statistical model based on the concept of the weakest link in a chain. Both theories were later amended and merged into the Fractal Geometry Theory, which justifies the unexpected experimental and real construction observation that the material strength decreases with increasing body size. The underlying reason that the material strength is not constant for every specimen size is the material heterogeneity (Carpinteri, 1996). The manifestation of the size effect is apparent in the curve of the nominal tensile strength versus the structural size scale shown in Figure 2.3, which depicts that as the size increases the nominal strength decreases proportionally to  $b^{-1/2}$ .

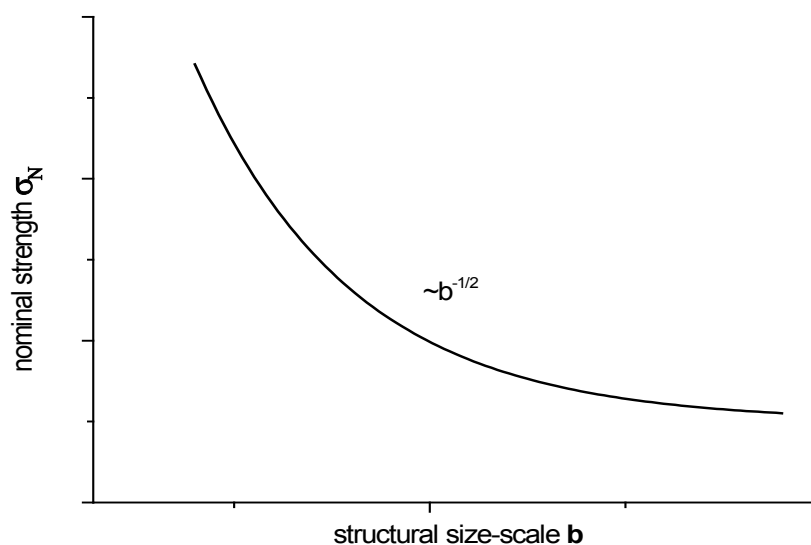


Figure 2.3 Tensile strength size effect based on Carpinteri 1996 size effect analysis

The size effect was considered by (Bazant, 1984), as the transition from the strength criterion of traditional strength theory to the linear elastic fracture mechanics predicted linear behaviour. In this outstanding work the *Blunt Crack Band Theory* is regarded as the best coinciding approach with real data and the aggregate size in a material sample is examined as a key parameter of the size effect. More specifically, the width of the crack band front  $w_c$  is defined by means of the maximum aggregate size for cement and grain



size for rocks  $d_a$  and the empirical constant  $n$  which is approximately  $n=3$  and  $n=5$ , for concrete and rock respectively .

$$w_c = nd_a \quad (2.2.6)$$

The initial approach by Bazant that the sample strength is relevant to the ratio of sample size to aggregate size was further investigated by (Baker G. , 1996). The general trend that the tensile strength increases as the aggregate size decreases was verified, but the impossibility of scaling the aggregate effects was also alleged. It is therefore a better practice to study size effect against specimen size and size effect against aggregate diameter instead of calculating their ratio which may lead to false conclusions, according to (Baker G. , 1996). The latter idea is also supported by experimental work on mortar-aggregate interfaces in concrete by (Lee, Buyukozturk, & Oumera, 1992) and (Hearing, 1997). The experimental data have shown that interface between the paste and the aggregate in mortar and the grain boundary between the grains in rocks exhibit lower toughness values of 30% to 60% approximately than the toughness in paste, in aggregates and in grains accordingly. This observation practically means that cracking starts from the interfaces or grain boundaries and thus size effect is closely related to the aggregate effect. Summarising, the size effects for cementitious materials and for rocks are similar, as the fracture mechanisms are common (microcracking fracture). Thus for the materials studied in this work the governing principles of size effect are similar. The need to analyse and quantify the size effects is vital for the up-scaling of the results of our experimental work, which was conducted in reduced scale, compared to real constructions.

#### **2.2.4 Power laws and self-similarity in fracture phenomena**

Fractals from the Latin word ‘fractus’ as they were defined by (Mandelbrot, 1983) govern the rock and generally brittle material fracture (Heping, 1993). A manifestation of the governing power laws was initially presented by (Mogi, 1962), who correlated the magnitude distribution of generated ‘elastic shocks’, i.e. acoustic emissions, with the heterogeneity of materials. The distribution of frequency versus maximum amplitude of the elastic shocks was proved to follow power law for granite, pumice and andesite specimens, regardless of the mode of stress application, i.e. constant or increasing. The magnitude-frequency relation of earthquakes, known as the Gutenberg – Richter law and the magnitude-frequency of acoustic emission of fractured rock specimens, was initially identified by (Mogi, 1962) and it was further examined by (King, 1983). The latter introduced the generic concept of three-dimensional self similar fault geometry as the

underlying cause of the empirically observed Gutenberg – Richter law and more specifically of the b-value of unity, which is globally observed in earthquakes.

The spatial distribution of acoustic emission hypocentres is another key property of fracture, which exhibits fractal characteristics as analysed by (Hirata, Satoh, & Ito, 1987). Furthermore, they derived that the fractal dimension decreases alongside with the evolution of fracture and thus can serve as a precursor of failure.

Towards the creation of a model to synthesise earthquake catalogues (Kagan & Knopoff, 1981) and (Kagan, 1982), Kagan and his colleagues delved into the properties of earthquake process, i.e. time series of seismic process, and the interaction of events, revealing a set of characteristics that follow fractal laws. The seismic energies that follow a power law distribution, as well as fore and after – shocks, whose occurrence rate follows power law, in case of shallow earthquakes, are such characteristics and constitute an inner look of the general idea of self similarity in fracture, which is expressed by (Mandelbrot, 1983). The self-similarity of seismic process was also observed through the power law distribution of the energies of fore and after – shocks and even through the spatial distribution of the seismic events themselves as examined by (Hirata, 1989). In the work by (Main, Peacock, & Meredith, 1990) the seismic waves were shown to follow power law relation with respect to frequency. The fractal dimension was calculated between 1.5 and 1.75 and the results were correlated with the earth's crust and the geological and crack-related heterogeneities that characterise it. In a series of papers the fractal geometry of fracture was analysed and in the paper by (Main, Sammonds, & Meredith, 1993) an amended Griffith criterion was proposed to interpret the AE statistics that were observed during the compressional deformation of pristine rocks and artificially pre-notched rocks.

More recent studies on the microfracturing phenomena, propose models for the emulation of such power law behaviours and manifestation of self-organised criticality. Models proposed by (Zapperi, Vespignani, & Stanley, 1997) and (Turcotte, Newman, & Shcherbakov, 2003) can very well emulate experimental results and observed power laws by using either quasi-static, or fibre bundle or continuum damage models that are discussed in the following subsections.

The latest experimental and numerical results showing self-similarity of waiting times in fracture systems, based on statistical analysis of acoustic emissions are given by (Nicolini, Bosia, Carpinteri, Lasidogna, Manuello, & Pugno, 2009), that analyse heterogeneous materials and observe properties that show similarities with earthquakes. Power laws were also observed in the Pressure Stimulated Currents (PSC) that are recorded during

deformation of rocks (Vallianatos & Triantis, 2008). The properties of the electric signal that follow fractal laws are the frequency – energy distribution, following the Gutenberg-Richter law, as well as the PSC waiting time distribution. Further analysis of scaling in PSC will be given in following chapters.

### 2.2.5 Brittle fracture models

In this section a brief overview of key points that are involved in the brittle fracture of materials is given. Brittle fracture that occurs in brittle materials, as opponent to ductile fracture that occurs in metallic materials is analysed, because the materials that are examined in this work are considered to be brittle. Namely rocks (marble and amphibolite) as well as cement based materials exhibit brittle fracture properties.

The problem of brittle fracture has been modelled by many researchers from multiple points of view, focusing on a specific mechanism each time. Brittle fracture is a very complex phenomenon that involves many mechanisms and the selection of the dominant among them is not obvious. However the similarity in cracking patterns, which is observed in brittle materials, leads to the clue that common mechanisms of fracture exist for different brittle materials like concrete (Shrive & El-Rahman, 1985) and rock (Peng & Podnieks, 1972).

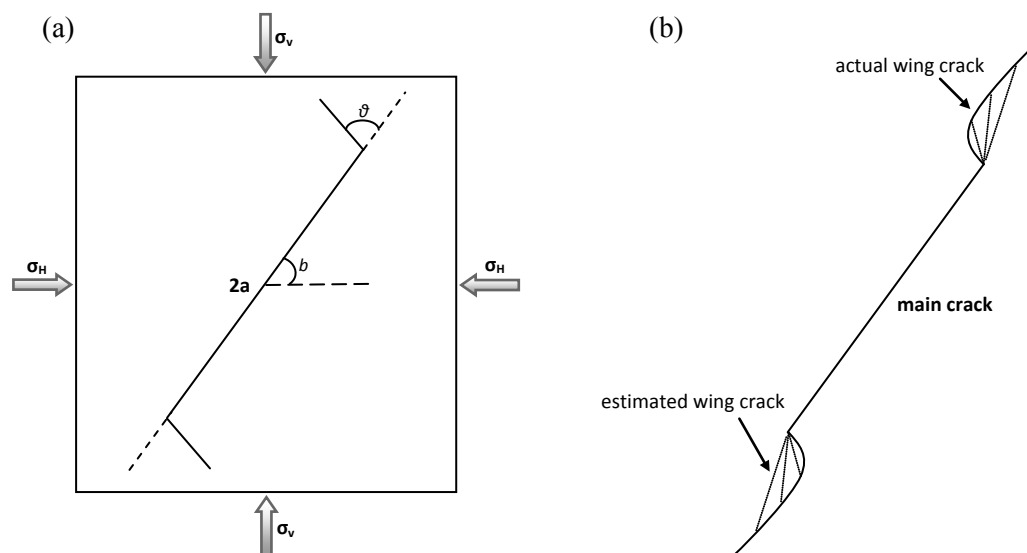


Figure 2.4 (a) Geometry used for calculations of a sliding crack under compression (b) actual wing crack and linearly estimated crack with angle depending on length

An overview of the most common models which have been used for calculations concerning the brittle fracture in compression is given below.

The *energy model* was introduced in (Glucklish, 1963) and was based on thermodynamics stating that the propagation of fracture is possible provided that the dissipated energy is

less than the released energy because of the increase of fracture surfaces. The model was revised and analysed in (Kendall, 1978), (Karihaloo, 1984) and its weaknesses are thoroughly described in (El-Rahman, 1989).

The *sliding crack model* is a micromechanical model, which was proposed in the same period with the energy model in a paper by (Brace & Bombolakis, 1963). The basic concept of the model is the growth of a wing shaped crack initiating at the tip of the main crack, when the effective shear stress exceeds a critical value. A typical geometric representation of the model is shown in Figure 2.4a and it corresponds to the linear estimation of the actual wing crack propagation pattern that is presented in Figure 2.4b. The model was experimentally confirmed in (Nemat-Nasser & Horii, 1982) and analytical methods were proposed for exact calculation of the stress intensity factor at the site of wing crack initiation by (Horii & Nemat-Nasser, 1985) and (Kemeny & Cook, 1987). The equation for the angle  $\vartheta$  was derived in (Lawn, 1993) and it was calculated to be  $\pm 70.5^\circ$ . The sliding crack model justifies the curving propagation of the wing cracks in the direction of the main axial compression, because of increasing axial load. It also explains microscopic scale observations as far as crack initiation, growth and clustering is concerned (Cannon, Schulson, Smith, & Frost, 1990).

Although this model captures many key aspects of brittle fracture, it has been criticised by (Nemat-Nasser & Obata, 1988) based on microscopic electron observations that lead to the adaptation of a complex pattern of tension cracks instead of the wing cracks adopted by this model. Thus, not all fundamental mechanisms of brittle fracture in compression of concrete and rock are included in the sliding crack model (Wang & Shrive, 1995).

The *lattice model* was introduced in (Brandtzaeg, 1927) and it was further amended by (Baker A., 1959). The material is handled as a set of brittle bars or beams with specific material properties for each element or with exact distribution of material properties along each element. Emulation of crack propagation is possible by eliminating the lattice elements that exceed their tensile strength. The lattice model has been verified against experimental compression test results and it seems to coincide with the material fracture features (Schantz & van Mier, 1992). This model has been criticised in (Santiago & Hilsdorf, 1973) because of non physical similarity with concrete, although the calculations based on the model are close to observed stress – strain behaviour of concrete.

The *Continuum Damage Mechanics (CDM) models* have been adopted in two basic forms, the stress-based CDM models and the strain-based CDM models, which consider the crack

growth and clustering as a stress and strain driven mechanism accordingly (Simbeya & Shrive, 1990). The basic factors in a typical CDM model are, the damage definition, the evolutionary equation of damage and the constitutive equation governing the stress or strain relation to damage (Allix & Hild, 2002). The initiation phase of damage in most CDM models is well described by sparse voids or cracks (Krajcinovic & Fanella, 1986) distributed randomly in the material under examination. However, in macroscale and real world applications the interaction between defects has to be estimated and in most cases arbitrary assumptions are made for well-behaved model to be exported, which fit to specific experimental data (Dvorak, 1993). Therefore, the relationship between discrete and continuum damage mechanics is a controversial problem, which is discussed in (Hild, 2002). A still open issue is therefore that the CDM models ought to trade off between the aforementioned problem of simplifications based on assumptions and the computational inefficiency which is described in (Krajcinovic, Basista, & Sumarac, 1991).

A great number of models have taken advantage of the increasing computational power of modern processors and have been developed based on the finite element analysis. Such models have shown very good compliance with experimental results (Yamagushi & Chen, 1991) and gain ground the last decade over analytical models. A Monte-Carlo simulation based model of concrete structure and crack propagation is proposed in (Zaitsev & Wittmann, 1981). One crack was assumed to be present in any polygon of the material element and the prediction of crack extension was based on the calculated fracture mechanics parameters, in this model. Other worth-mentioning models are presented in (Yuan, Lajtai, & Ayari, 1993), (Bazant & Ozbolt, 1992) and (Barquins, Petit, Maugis, & Ghalayini, 1992).

### **2.2.6 Griffith's theory basic elements**

Theories of brittle failure of rocks aim in the prediction of the macroscopic fracture stress by looking into the problem from two different points of view. A part of these theories have been based on specific type of experiments and empirical observations related to them in order to suggest certain failure criteria. The most common selected criteria of failure are the stress limit on certain points or planes and the strain energy limits. Distinguishing works in both subcategories of stress-oriented and strain-oriented theories have been proposed by Coulomb & Mohr, which was commented by (Paul, 1961) and by Becker, which was commented by (Griggs, 1935) respectively. Another part of these theories propose a physical model open to theoretical approach. These theories are not

totally based on empirical observations and thus can capture the main concepts and mechanisms of brittle fracture in a more robust and generic way. The main representative theory of this approach is the Griffith's theory of brittle fracture, which is concisely presented in this subsection.

The Griffith's theory emerged so as to explain the observation that the strength of mechanically treated brittle material samples compared to pristine samples of the same material is drastically lower. The basic idea of the model and corresponding theory is the concentration of the energy and the stress at the flaws of a sample, i.e. the lack of homogeneity in a material sample may be considered as a kind of inherently present crack-like defects on the microscale. Griffith's theory mathematical solutions are still in use for some brittle materials in its original form (Griffith, 1924). For example, the stress at failure based on the energy criterion, may be predicted in the typical case of a axially applied macroscopic tensile stress  $\sigma$ , by equation (2.2.7) given below

$$\sigma = \sqrt{\beta \frac{E\gamma}{\alpha}} \quad (2.2.7)$$

where  $\beta$  is a numerical constant, which is determined by Poisson's ratio, E is the Young's modulus,  $\alpha$  is half the length of the crack,  $\gamma$  is the surface energy.

Although calculation methods have been amended since the original work of Griffith the concepts of the theory have been useful for the understanding of brittle fracture. A

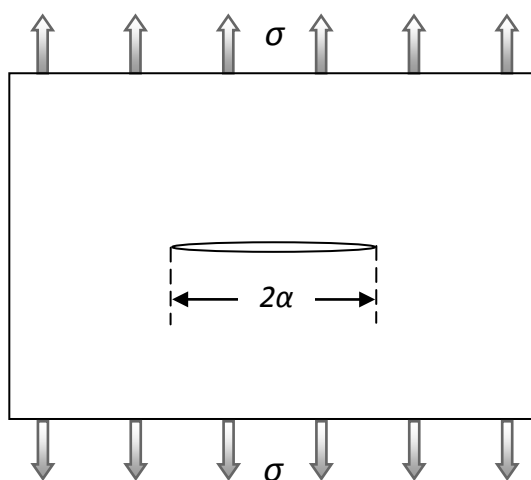


Figure 2.5 Axially applied tensile stress to infinite body with crack of  $2\alpha$  length

thorough study on the dependence of the equation (2.2.7) upon some aspects as, the shape of the crack, the local failure criterion and the dynamic features is presented by (Paterson

& Wong, 2005). The basic ideas and elements of Griffith's theory to explain some aspects of brittle fracture are the following

- i. Fine cracks are inherently present inside materials. This is the reason why real material samples exhibit lower strength limits compared to pristine materials, which have strength values near the theoretical strength. Therefore, the initial presence of small cracks in brittle materials is considered by Griffith as the governing material property of their strength.
- ii. The stress concentration factor for some cracks gets a maximum value, because they are in the same direction with the applied load. Considering a random distribution of orientations of the cracks of specific length, the one that begins to extend is the one that its major axis is similar to the direction of the applied stress. Therefore analysis of cracks at arbitrary angles can be omitted, provided that there is no interaction between each other, i.e. cracks are adequately separated in space (Paterson & Wong, 2005).
- iii. Theoretical strength is reached at the crack tip of one of the aforementioned cracks resulting in the growth of the crack. Analysis of an extreme value problem for the most vulnerable space oriented crack, where the stress component around the crack overcomes the inter-atomic cohesion, is the result of such an approach.
- iv. The energy that causes the crack propagation is the released strain energy owing to the crack extension. In other words the strain energy, which becomes available while the crack extends, is the energy given to the crack and allows its propagation. This property will be verified in the following chapters in experiments of constant high level axially applied stress.
- v. Surface energy increases as a result of the crack growth. By this statement a direct link between the surface energy which is measurable and the energy released because of the creation of new surfaces inside the material is made. (Sanford, 2003).
- vi. The crack growth is possible only when the released strain energy exceeds the energy required for the formation of a new surface, and thus equilibrium of energy may serve as a criterion for crack growth. The sum of the three components of the energy i.e. the surface energy of the created crack surface, the difference in the elastic strain energy of the body, the difference in the potential energy provided by the loading machine has to be zero or negative, in order for the crack to propagate. The energy criterion is equivalent to the thermodynamic criterion of failure (Murrell & Digby, 1972) and it is expressed as the minimisation of Gibbs potential, which is the thermodynamic equivalent of energy equilibrium (Paterson & Wong, 2005).

The elements of Griffith's theory will be used for the interpretation of phenomena and the theoretical support of some of the modelling and analysis conducted in the thesis.

### 2.2.7 Fibre Bundle model

The Fibre Bundle Models (FBM) constitute a separate class of fracture models that capture some basic properties of brittle fracture and emulate accurately the avalanche of cracking that leads to failure. The models became popular, as they capture some key properties of material fracture and damage through a simplified scheme. Moreover they can serve as realistic models of fibre containing composite materials, used for retrofitting of constructions, like Fiber Reinforced Polymers (FRP).

The model was initially proposed by (Daniels, 1945), where the basic concept of bundle made by a set of parallel threads of equal length, which are subjected to tension and extend equally, was introduced. This work was further developed by (Harlow & Phoenix, 1978), who evaluated additionally to the equal loading rule of classical approach, the local sharing rule, which was proved to be more accurate for composite materials. Typically in FBMs the parallel threads that emulate fibres, have statistically distributed strength. The bundle is loaded parallel to the direction of fibres and each thread failure occurs once the applied

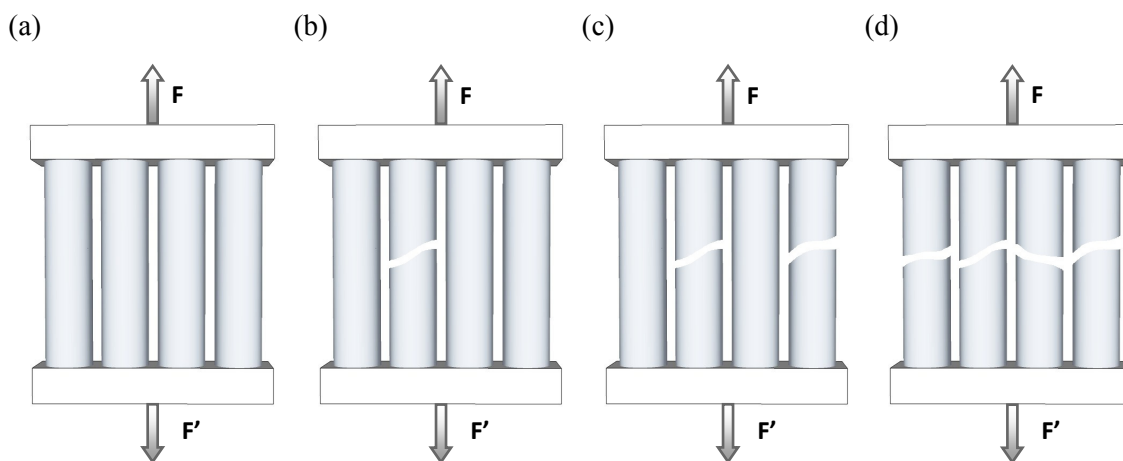


Figure 2.6 (a) The load on each fibre equals to one fourth of the total load, (b) the load on each undamaged fibre is one third of the total, (c) each of the remaining fibre carries half of the total load and (d) all fibres have failed - no load is carried

load exceeds its strength. After the failure of a fibre, it is considered as carrying no load anymore, following an *on-off* concept of failure. The concept of the evolution of such experiments, according to the assumption of the 'global load transfer', is given in Figure 2.6. Initially the load is uniformly shared between the fibres of the bundle and once a fibre



collapses, the load is equally distributed to the remaining fibres. Next failure will occur in any of the candidate fibres with equal probability according to this approach. However, composite materials, whose neighbouring fibres exhibit cohesive properties, are characterized by mechanical interaction. This case was emulated by the *chain of bundles model*, which was introduced by (Phoenix & Smith, 1983) . According to this model the load previously carried by the failed fibre is equally transferred to the two nearest fibres that have not failed. Another approach by (Kun, Zapperi, & Herrmann, 2000) studies the four fibres in each direction of the failing one, taking into account the matrix created from the cross-sectional plane of the specimen and defines an area of radius 2 as the range of interaction. Either in the case of strongly connected composite materials that are governed by local load sharing in the vicinity of failure, or in the case of weakly connected materials, where the load is equally shared everywhere in the material, Phoenix and his team have given mathematical tools for analysis (Phoenix & Beyerlein, 2000) and (Mahesh, Phoenix, & Beyerlein, 2002). The statistical distribution of strength in fibrous composite materials, subjected to tension parallel to the direction of fibres, can be calculated by these models, provided that fibres follow Weibull statistical distribution of strength. The effect of matrix material between fibres to evaluate 3D models was examined by (Curtin & Takeda, 1998) and results shown that both the average tensile strength, as well as the tensile strength statistical distribution are not influenced by the fibres geometry i.e. square or hexagonal and therefore models that consider square matrix fibre arrangements can be accurate for any fibre shape. Geometrical and other characteristics of fibrous composite materials were analysed by (Phoenix, Ibnabdeljalil, & Hui, 1997) and compared against Monte Carlo simulations. The probability distribution of the strength of the composite materials in the cross section is calculated with respect to fibre length and strength, as well as with the population of fibres in the cross section in this work and the resulting distribution is Gaussian. Outstanding work by (Krajcinovic & Silva, 1982) addresses the influence of non-linear fibre behaviour into the micromechanical models that emulate distribution of strength of the material.

The FBM models are still developing, because the composite fibrous materials constitute excellent materials for real applications of concrete constructions retrofitting and will be used in the following chapters as theoretical basis for the interpretation of FRP electrical behaviour during cracking.

## 2.3 Electric signal in brittle materials; mechanisms and models

### 2.3.1 Electric signal emission physical mechanisms in brittle materials

The initial notions for electric signal induced by mechanical treatment (stress and fracture) of non conducting materials originate from seismology and geophysics and especially from studies on earthquake precursors for earthquake prediction methods. In the work by (Mizutani, Ishido, Yokokura, & Ohnishi, 1976) clues about earthquake related electrokinetic phenomena are presented. The phenomena are attributed to water diffusion and are measured by means of changes in the electric potential of the earth's crust. Similar electric signals are systematically detected and analysed by (Varotsos & Alexopoulos, 1984) and are given the name Seismic Electric Signals (SES). Their basic attributes are (a) their duration which varies from 1 min to 1.5 hours and (b) the time interval between their occurrence and the seismic event which was 6 to 115 hours (Varotsos, Alexopoulos, Nomicos, & Lazaridou, 1986). In later work they have determined the correlation between the variation of the electric field and the distance between the source and the measuring point (Varotsos, Sarlis, Lazaridou, & Kaporis, 1998) and they have introduced the term Pressure or (Stress) Stimulated Currents which is adopted in our work.

The phenomenon of electric signal had already been observed for quartz containing rocks by (Finkelstein, Hill, & Powell, 1973) but (Varotsos, Sarlis, Lazaridou, & Kaporis, 1998) shown that the signal exists, even if no piezoelectric minerals are present. Simultaneously to the observations from the Earth's crust, such signals were detected in the laboratory when rock samples were subjected to mechanical deformation. The piezoelectric and the electrokinetic effect were proposed by (Yoshida, Clint, & Sammonds, 1998) as the dominant sources of precursory signals based on the experimental testing of saturated and dry sandstones and basalts. The effect of pore water movement was further investigated In the work by (Nitsan, 1977) the fracture of quartz-bearing rocks is studied in the laboratory and the generating mechanism of the electromagnetic emission is suggested to be of piezoelectric nature. In this pioneering work the spectral content of the transient signal is correlated to the grain sizes, which implicitly corresponds to the small cracks creation that is discussed in following chapters. In experiments that were conducted at very slow strain rates on granites and sandstones by (Yoshida, 2001), the electric current that flowed before the fracture was correlated to the water flow rate showing the effects of water movement to the electric signals during deformation.

Spectroscopic analysis of the visible and near-infrared emissions was presented by (Brady & Rowell, 1986), who performed experiments in different ambient environmental conditions i.e. argon, helium and air, vacuum of  $1 \times 10^{-6}$  torr and water. Their conclusion was that an exoelectron excitation of the ambient atmosphere constitutes the generating light emission mechanism during fracture. The electrokinetic electrification mechanism has been considered the source of electric signal during rock rupture in many papers, the most prominent of which are referred below. The measurement of electric field of granite samples in a variety of frequencies (10Hz to 100kHz) was used for the determination of the generated electric dipole and the evaluation of mechanisms of electrification by (Ogawa, Oike, & Miura, 1985). Similar granitic material samples were tested in the laboratory by (Yamada, Masuda, & Mizutani, 1989) and acoustic and electric emissions were recorded simultaneously. In this paper, the correlation between recordings led to the conclusion that the electrification of a fresh surface due to cracking is the source of electromagnetic emissions. In a slightly different approach (Enomoto & Hashimoto, 1990) also recorded acoustic and electric emissions, but separated the detected particles to ions and electrons. They observed high electron and ion emission intensities during parts of the loading cycle when cracking occurred around the indent. They also outline the influence of moisture and the type of material under deformation on the particle emission. Transient variations of the electric field were also detected by (Hadjicontis & Mavromatou, 1994) prior to the failure of rock samples that were subjected to axial stress and were compared and analysed against earthquake precursory signals. Conclusions on the piezoelectric nature of the emitted electric current are presented in the work by (Yoshida, Uyeshima, & Nakatani, Electric potential changes associated with slip failure of granite: Preseismic and coseismic signals, 1997) alongside with a model that matches to exponentially decaying electric signals that are characterised as coseismic in this work.

The electric properties variation is examined by (Glover P. W., Gomez, Meredith, Boon, Sammonds, & Murrell, 1996) and more specifically the complex electrical conductivity correlation with the stress-strain behavior of rocks. The point of view in this work is different compared to the electric potential and electric current signal recording, yet it verifies that fracture is the generating source of electric properties variation and perturbation of the corresponding signals.

The generation of weak electric signal in rocks and generally in brittle materials, which are subjected to stress, lead researchers to seek for physical models that would interpret the physical mechanisms of electrification. A quite audacious model for electric signal

generation in stressed igneous rocks is proposed in a series of papers (Freund F. , 2000), (Freund F. , 2002) and (Freund, Takeuchi, & Lau, 2006). The electric signal is separated into two currents in this work, one current by electrons and one by p-holes from the oxygen anion sublattice. An attempt to project the laboratory observations into the field observations prior to earthquakes is also presented in these papers. This model is quite complex and sophisticated; however it is adapted to specific materials (igneous) and is formed with respect to their properties, although the electrification phenomenon is apparently more generic and appears during fracture of any brittle material that has been examined.

Physics based explanation of the phenomena is also the aim of models that were presented by (Varotsos, Alexopoulos, & Lazaridou, 1993) and (Slifkin, 1993) towards a better understanding of the electric current generation mechanisms during seismic and preseismic events. The later attempt resulted in the qualitative description of the known as Moving Charged Dislocations (MCD) model, which was further quantitatively developed by (Vallianatos & Tzani, 1998).

### 2.3.2 The Moving Charged Dislocations model

The MCD model is built on the basis of the ionic electrical charge that is present on dislocations of non-metallic crystals. The dislocations are the result of the excess or lack of half-plane of atoms, at the edge of which plane the dislocation line is created. It is the absence or excess of a line row of ions along the dislocation line that leads the dislocation to be charged. Thermal equilibrium between the dislocation jogs and the point defects has to be established in the bulk of the material as stated in (Whitworth, 1975) and thus during transient phenomena neutrality cannot be maintained because of the moving charge related to the charged dislocations move.

The transverse polarisation  $P$ , which is created because of the moving charged dislocations, can be given by the following equation

$$P = \delta\Lambda \cdot q_l \cdot \frac{\delta x}{\sqrt{2}} \quad (2.3.1)$$

where  $\delta\Lambda = \Lambda^+ - \Lambda^-$  the difference between the density of edge dislocations of two opposite types,  $q_l$  the charge per unit length (approximately  $3 \times 10^{-11}$  C/m – (Slifkin, 1993)) and  $\delta x$  is the distance that the dislocations move. In a crystal lattice, the magnitude and direction of lattice distortion of dislocation, i.e. the spacing between lattice planes, is

denoted  $\mathbf{b}$  and is the so called Burger's vector. The plastic contribution to strain, can therefore be expressed by means of vector  $\mathbf{b}$  as shown in equation (2.3.2)

$$\varepsilon = \delta\Lambda \cdot \mathbf{b} \cdot \frac{\delta x}{2} \quad (2.3.2)$$

The electric current density  $J$  is by definition equal to the rate of polarization change and by substituting to equations (2.3.1) and (2.3.2), we can derive equation (2.3.3),

$$J = \frac{\partial P}{\partial t} \Rightarrow J = \frac{\sqrt{2}}{\beta} \cdot \frac{q_l}{\mathbf{b}} \cdot \frac{d\varepsilon}{dt}, \text{ where } \beta = \frac{\Lambda^+ + \Lambda^-}{\Lambda^+ - \Lambda^-} \quad (2.3.3)$$

which is the mathematical expression of the relation between the non-stationary accumulation of deformation and the observed transient electric signal. Predicted values of  $J$  were close to the measured in uniaxial stress experiments using the Pressure Stimulated Current (PSC) technique, which is thoroughly analysed in the following chapters. Assuming values of  $\beta$  for rocks close to the upper limit of the range given for alkali halides in (Whitworth, 1975) and deformation rates approximately equal to those observed in seismic events i.e.  $\partial\varepsilon/\partial t \approx 10^{-4} s^{-1}$ , the MCD model predicts an electric current density  $J \approx 10^{-6} A/m^2$  that is similar to the PSC recording as referred in (Vallianatos, Triantis, Tzani, Anastasiadis, & Stavarakas, 2004). The MCD model is based on the theory that all rocks contain crystalline substances with defects, as charged dislocations, because of former loading or initial formation processes. As far as the physical mechanism of electric current generation, the experimental observations are interpreted by a mechanism of superposition of a great number of dipole sources. Each dipole is formed by a propagating crack or a group of simultaneously moving dislocations. In the laboratory experiments, it was verified that the recorded PSC follows a relationship with strain rate that is given in equation (2.3.3) and expresses the following proportionality  $J \propto d\varepsilon/dt$ .

However, based on equation (2.2.4) that expresses the proportionality of stress and strain in the elastic region where the Young's modulus is constant, it can be inferred that electric current density is also proportional to stress rate  $J \propto d\sigma/dt$ . As far as the inelastic region is concerned, the observation that the PSC amplitude drops according to equation (2.3.4)

$$\sigma = Y_{eff} \cdot \varepsilon \quad (2.3.4)$$

where  $Y_{eff}$  is the effective Young's modulus that is not constant, is partially right. Of course in the inelastic region especially in cyclic loading of high stress levels the PSC peaks are lower but neither proportionality between  $Y_{eff}$  and PSC peaks is observed, nor

PSC amplitude always decreases when the stress rate remains constant, as PSC peaks are observed for rocks under constant high level stress. It is also possible for the PSC peaks to drop for applied low stress level (elastic region) when cycles of loading are close and memory effect is present, as it is going to be analysed in the following section.

The MCD model and relation between PSC and strain rate seem to be valid even in the inelastic region as it will be later discussed and thus MCD model will be used in this work as the model for interpretation of phenomena from the physics perspective.

### **2.3.3 Experiments and recordings of mechanically stimulated electric signals**

The experimental recordings for a variety of brittle materials either in the field or in the laboratory allow no doubt about the existence of mechanically stimulated electric signals or about the possibilities to be used as failure precursors. However, the diversity of the parameters that affect the phenomena of electric emission, especially in large systems like the earth's crust, cause uncertainty and therefore the researchers' consensus on a physical model seems difficult. Attempt on correlating field observations and laboratory results by (Vallianatos, Triantis, Tzani, Anastasiadis, & Stavrakas, 2004) have led to conclusion that there might be a scale-free governing law for the interpretation of these phenomena. Furthermore, the research field of mechanically stimulated electric signals has drawn the attention of construction society and more specifically the cement related research and non-destructive testing of brittle materials for construction. Experimental laboratory work on cement and composites have shown that electric signals exist also for these materials. The aforementioned clue indicates that maybe not only a scale free but also a material independent (brittle) law may govern the concurrent of fracture electric phenomena.

The MCD model conclusions alongside with extensive experimental laboratory work and interpretation of phenomena by (Triantis, Anastasiadis, & Stavrakas, 2008), (Anastasiadis, Triantis, & Hogarth, 2007), (Kyriazopoulos, Anastasiadis, Triantis, & Stavrakas, 2006), (Anastasiadis, Triantis, Stavrakas, & Vallianatos, 2004) provided a framework for the research presented in the following chapters.

In this section we present some of the recordings by other researchers that have used similar techniques with the PSC and BSC technique that was used in this work and their recordings coincide in broad terms with the recordings of our work supporting the speculation of a common law for electric signal correlation with brittle fracture.

Laboratory experiments for studying the piezoelectric properties of reinforced concrete and cement that were presented in (Sun M. , Liu, Li, & Hu, 2000) as well as experiments for

detection of electric emissions in mortar under low compression (Sun M. , Liu, Li, & Wang, 2002), have shown significant resemblance with PSC signals. Characteristic recordings from the two papers are shown in Figure 2.7a and b respectively.

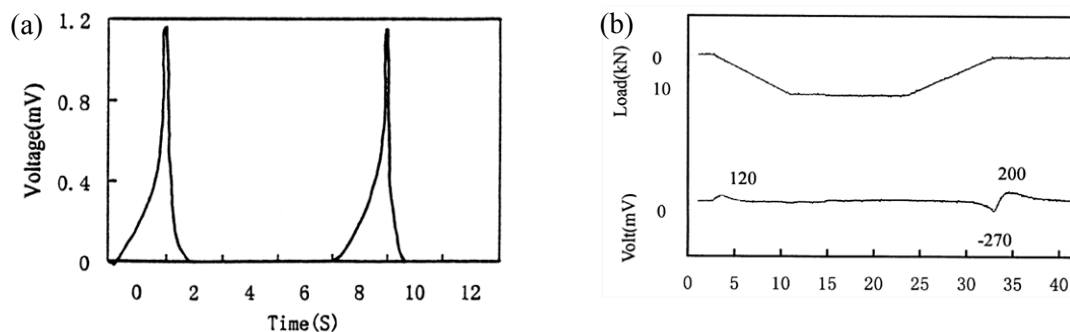


Figure 2.7 (a) Time vs. voltage generated by the plain cement paste (4 kN/s) – taken from (Sun M. , Liu, Li, & Hu, 2000) and (b) The electrical emission in mortar (the loading rate is 1 kN/s) – taken from (Sun M. , Liu, Li, & Wang, 2002)

In the earlier work by (Freund F. , 2002) on igneous rock related electric phenomena, as well as in the latest work by (Takeuchi, 2009) the recorded electric signal as presented in Figure 2.8a and b showed similar scheme to the recorded PSC that will be analysed in the following chapters. The typical form of perturbation comprises a signal peak, which is followed by a relaxation to the background and it is common in both cases either the electrode records voltage or current. Especially current recordings by (Takeuchi, 2009) exhibit considerable similarity with PSC recordings in both cyclic loading and single abrupt stepwise loading.

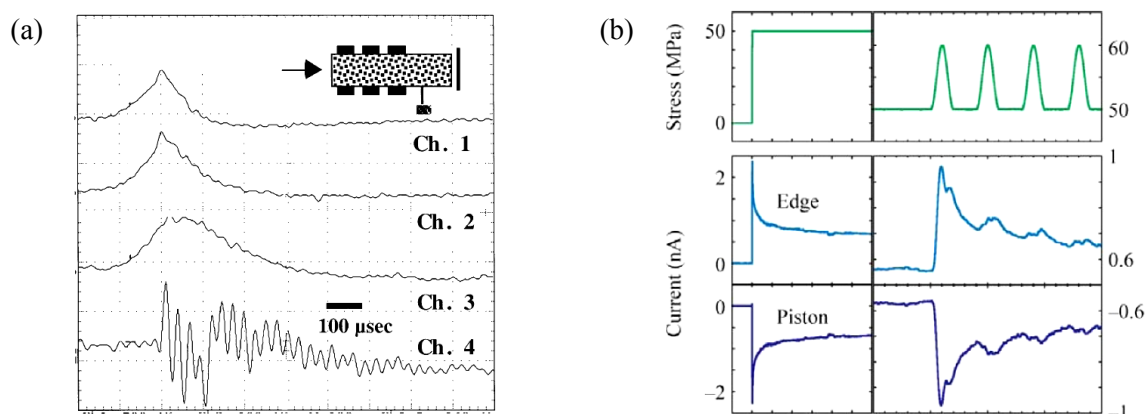


Figure 2.8 (a) Channels 1-3 three ring collector electrodes 500, 100 and 20mV respectively – taken from (Freund F. , 2002) and (b) Example of experimental results – taken from (Takeuchi, 2009)

Last but not least, a recently published work by (Aydin, Prance, Prance, & Harland, 2009) has been based on an identical electrical and mechanical setup with the one used for our

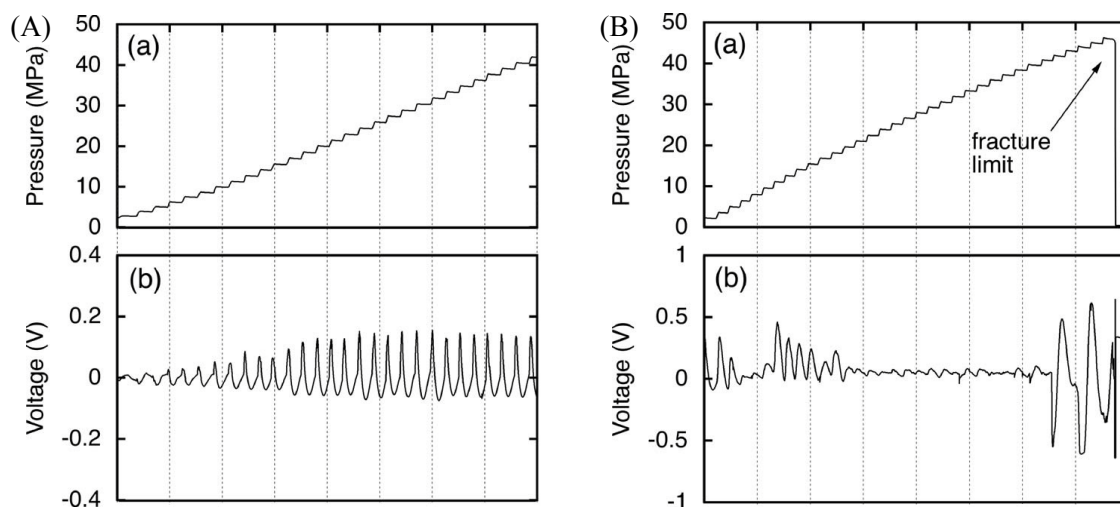


Figure 2.9 (A) Experimental data from granite sample (a) applied pressure and (b) differential voltage and (B) experimental data from marble sample (a) applied pressure and (b) differential voltage – taken from (Aydin, Prance, Prance, & Harland, 2009)

signal recordings. An electric potential sensor has been chosen instead of the electrode sensor that we have proposed for the detection of electric signals. Yet, the form of signal exhibits similar macroscopic properties with the PSC signal recordings. Such signals are presented for demonstration purposes in Figure 2.9.

Comparing all the aforementioned mechanically stimulated electric signals regardless of the details in the experimental technique, the type and shape of the material specimens, the absolute values of stress and electric signal, the kind of the electric signal i.e. current, voltage, electric potential, the same trends are observed. The universality of the phenomenon is worth mentioning and promising for multiple applications from earthquake prediction and real civil engineering constructions to laboratory evaluation of materials strength and mechanical properties.

## 2.4 Wavelets as a mathematic tool for signal processing

### 2.4.1 The Wavelets evolution review

Wavelet analysis is an advanced mathematical tool that is used for signal processing and it gains ground over the traditional methods of frequency domain analysis. In this section we refer to introductory information and concepts of Wavelets and Wavelet Transform without insisting on mathematic details, but on the advantages that make it useful and appealing to many research disciplines, including this work.



The expansion of wavelets is quite recent, although the first and simplest wavelet the ‘Haar Wavelet’ was proposed a century ago by (Haar, 1910). The first ideas of wavelet handling can be found in (Calderón & Torchinsky, 1974) who dealt with dilation and translation concepts. However, the term “Wavelets” was first introduced by (Morlet, Arens, Fourgeau, & Giard, 1982) for the analysis of seismic signal and it was widely adopted since then. In the 1980s and 1990s, notable mathematicians and engineers expanded the initial idea into a domain of research. Many different tools were developed and the corresponding theorems and mathematic formalities were proved and amended. Milestone of the wavelet research history can be considered the work on multiresolution decomposition of the signal that was simultaneously proposed by (Mallat, 1986) and (Meyer Y. , 1986). The key point for wavelet expansion is the flexibility on the selection of the suitable basis for each specific application. Some of the essential works on this domain are referred in the following section dedicated to wavelet families. The initial ideas for WT discrete analysis is attributed to Mallat’s work and the pyramidal decomposition that he proposed in (Mallat, 1989). Another popular approach is the ‘a trous’ discrete algorithm for decomposition of signal proposed by (Holschneider & Tchamitchian, 1990). Following the Fourier example faster and more effective algorithms were developed, like the Fast Wavelet Transform by (Beylkin, Coifman, & Rokhlin, 1991) and the Wavelet Packet by (Coifman, Meyer, & Wickerhauser, 1992).

For the theoretical understanding of this mathematical tool (statements and proofs of theorems) comprehensive books have been written by the main contributors of this research domain (Daubechies, 1992), (Meyer Y. , 1993) and (Mallat, 1999). A quick though complete introduction to the topic can be found in the paper by (Graps, 1995) and a practical point of view in the paper by (Torrence & Compo, 1998). A good book on the Geoscience applications of Wavelets, which is related to this work, is written by (Foufoula-Georgiou & Kumar, 1994).

Many others have also delved into the applications of the wavelet transform on real problems during the last years in the research fields of earthquake-prediction, speech recognition and music, image processing and compression, processing of medical signals and in any processing that inherent periodicity of Fourier Transform results are poor.

## 2.4.2 From Fourier to Wavelets

The extraction of signal information is probably the biggest challenge in science and engineering applications and the Wavelet Transform seems to be a rather effective tool towards this aim.

The presentation of signal in time domain can provide information about its amplitude with respect to time, whereas the pioneering transform that J. Fourier proposed two centuries ago enables the signal presentation in the frequency domain i.e. the amplitude of the signal at each specific frequency. The Fourier Transform (FT) mathematical form is expressed by equation (2.4.1)

$$\mathcal{F} f(\omega) = \frac{1}{\sqrt{2\pi}} \int f(t) \cdot e^{-i\omega t} dt \quad (2.4.1)$$

The FT graphical presentation (spectrogram) is unable to show short living components of specific frequency content, because their contribution to overall spectrum may be insignificant. A partial solution to the need for presentation of the signal frequency content locally in time was proposed by (Gabor, 1946). The windowed or Short Time Fourier Transform (STFT), which is the Gabor's idea is the application of the Fourier Transform in a specific window of the signal localised in time. The STFT can be mathematically expressed as shown in equation (2.4.2)

$$\mathcal{F}^{win} f(\omega, t) = \int f(s) g(s-t) e^{-i\omega s} ds \quad (2.4.2)$$

To follow discrete analysis we have to substitute continuous time and frequency by discrete, regularly spaced values i.e.  $t = nt_0$  and  $\omega = m\omega_0$ , provided that  $m, n \in \mathbb{Z}$  (Daubechies, 1992). Therefore, the discrete STFT is given by equation (2.4.3)

$$\mathcal{F}_{m,n}^{win} f = \int f(s) g(s - nt_0) e^{-im\omega_0 s} ds \quad (2.4.3)$$

The typically used windows for time localisation, like Hamming, Gauss, Bartlett and Blackman, are all characterised by smoothness and most of them have compact support (Mallat, 1999). The time-frequency plane analysis provided by STFT has a drawback though. The window of analysis is constant and thus one has to sacrifice either high or low frequency characteristics of the signal by selecting a constant time parameter for the window. The aforementioned steps of signal analysis can be visualised in Figure 2.10a, b and c accordingly.

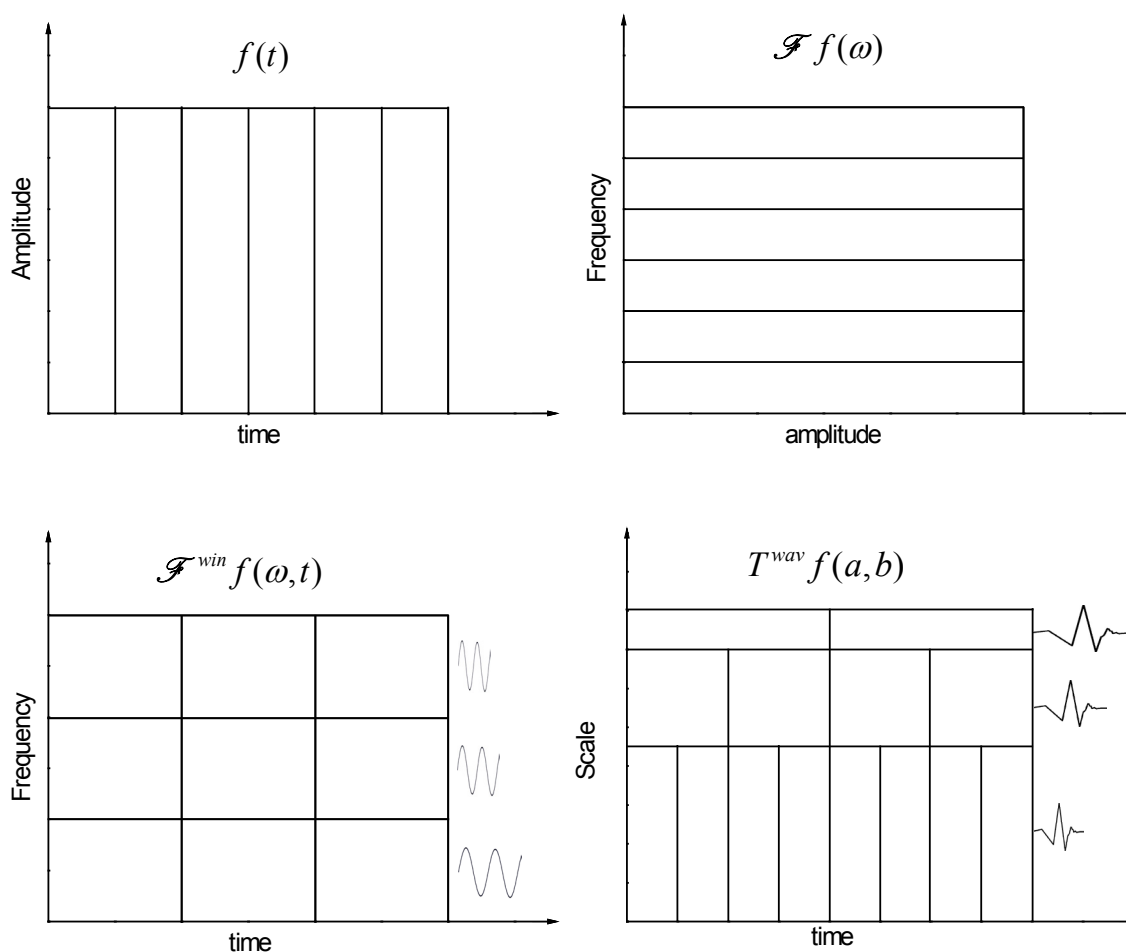


Figure 2.10 (a) Time domain amplitude (signal graph – temporal evolution) (b) Frequency domain (Fourier Transform – spectrogram) (c) Short Time Fourier Transform (time localisation of frequency components- equispaced windowed analysis) and (d) Wavelet Transform time scale

The creation of a varying window, according to the frequency under examination, was the next reasonable step that led to the Wavelets evolution. The flexibility in tiling schemes may be considered as the main asset of the WT over the STFT. Processing of signal with wavelets as the analysing kernels, allows the studying of the signal features with the detail that matches to each scale, i.e. broad features of the signal on large scales and fine features on small scales. The picturesque description of this property “*the result in wavelet analysis is to see both the forest and the trees*”, can be found in the paper by (Graps, 1995).

This is possible for WT because it allows a variable window size, following the scheme of broader time localisation for high scales and narrow time window for low scales. This tiling method is depicted in Figure 2.10d. The fact that the frequency space is layered with resolution cells of varying dimensions does not break the *uncertainty principle*, which states that arbitrary high precision in both time and frequency cannot be achieved, because

the dimensions of the cells are functions of scale such that they have a constant area. Summarising, even the amelioration of FT, i.e. the STFT, is less accurate tool for the localization of the energy of a signal, as it is thoroughly discussed by (Kaiser G. , 1994) and (Daubechies, 1992).

### 2.4.3 The Wavelet Transform

The Wavelet Transform mathematical formula is given in (2.4.4) and it is obviously defined in a similar way to the FT shown in (2.4.2)

$$T^{wav} f(a,b) = |a|^{-1/2} \int f(t) \psi\left(\frac{t-b}{a}\right) dt \quad (2.4.4)$$

The discrete Wavelet Transform is also similar to the Discrete FT and the equation that describes it, is given in (2.4.5) (Daubechies, 1992)

$$T^{wav} f(a,b) = a_0^{-m/2} \int f(t) \psi\left(a_0^{-m}t - nb_0\right) dt \quad (2.4.5)$$

The WT provides time-frequency domain analysis by analogy to the STFT and this is the explanation of the similarity of mathematical expression between them. Despite the mathematical similarity there is a crucial difference that constitutes an advantage of WT over the STFT.

In STFT the analysing function is the  $g^{\omega,t}$ , whereas for WT the analysing function is the  $\psi^{a,b}$ . This analysing function is called “Wavelet” or “mother wavelet” or “basis wavelet” in literature and can be defined according to rules, so as to satisfy certain signal analysis needs. The WT is based on wavelets instead of sinusoidal functions and thus it allows more flexible analysis. The variety of shapes of the analysing functions is the key point for its advantages over the STFT. Furthermore, the wavelet inherent good localisation in both time and frequency has a significant impact on the good localisation that WT provides compared to STFT (Farge, 1992).

Comparing the analysing functions individually we note that the influence of parameters  $a$  and  $b$  on  $\psi$  are similar to the influence of  $\omega$  and  $t$  on  $g$ . The changes of parameter  $a$  affect inversely the frequency of the wavelet and thus  $a$  is called *scale* or *dilation* parameter because small values of scale correspond to high frequencies and large values of scale to low frequencies. The parameter  $b$  acts as a shifting of the centre of the wavelet in time and thus is called *translation* or time *shifting* parameter. The effect of changing of parameters on the wavelet is concisely depicted in the graphs of the paradigm shown in Figure 2.11.

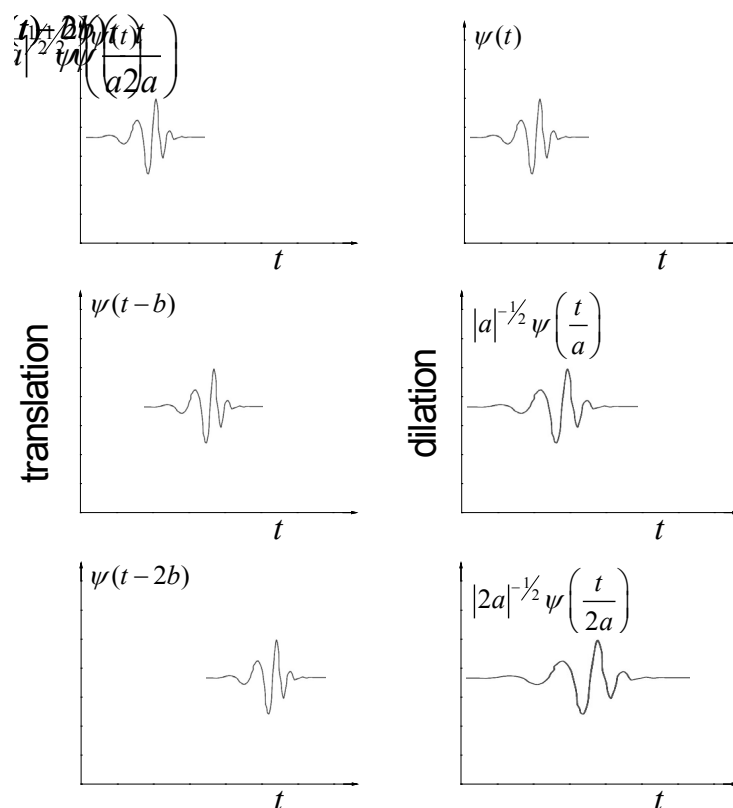


Figure 2.11 The effect of parameters  $a$  and  $b$  on mother wavelet  $\psi$  (the translation and dilation of the mother wavelet with respect to time when parameters  $a$  and  $b$  increase)

The graphs of the left column in Figure 2.11 depict the translation of the wavelet, as the  $b$  parameter increases, i.e.  $\psi(t-b)$ . The right column graphs of Figure 2.11 show the dilation of the mother wavelet, as scale increases, i.e.  $|a|^{-1/2} \psi\left(\frac{t}{a}\right)$ . The combination of the two processes can give translated and dilated versions of the original wavelet that are expressed by equation (2.4.6)

$$\psi^{a,b}(t) = |a|^{-1/2} \psi\left(\frac{t-b}{a}\right) \quad (2.4.6)$$

where  $a, b \in \mathbb{R}$ ,  $a \neq 0$  and  $\psi \in L^2(\mathbb{R})$ . Furthermore, the integral of a valid wavelet function must be zero, as expressed by equation (2.4.7)

$$\int \psi(t) dt = 0 \quad (2.4.7)$$

The *admissibility condition* is shown in the following equation

$$C_\psi = 2\pi \int_{-\infty}^{\infty} |\hat{\psi}(\xi)|^2 |\xi|^{-1} d\xi < \infty \quad (2.4.8)$$

and constitutes the condition which is required to be met for a wavelet to be admissible. The  $C_\psi$  constant of equation (2.4.8) depends on  $\psi$  and is defined for the reconstruction of the signal from its WT through the following equation

$$f = C_\psi^{-1} \int_{-\infty}^{\infty} \int_{-\infty}^{\infty} \langle f, \psi^{a,b} \rangle \frac{\psi^{a,b}}{a^2} da db \quad (2.4.9)$$

where  $\langle f, \psi^{a,b} \rangle$  is the  $L^2$  inner product of function and wavelet. The formula for reconstruction in (2.4.9) is known as the *resolution of identity* and by using it every function  $f(t) \in L^2(\mathbb{R})$  can be reconstructed by superposition of translated and dilated wavelets (Vetterli & Kovacevic, 1995).

The final result of wavelet transform is the representation of a signal process by an infinite series expansion of dilated and translated versions of a mother wavelet, each multiplied by an appropriate coefficient. The colouration of the time scale plane according to the value of the aforementioned coefficients is known as *scalogram* (Flandrin, 1988) and constitutes the result of the wavelet analysis.

Wavelet Transform is superior to Fourier Transform (FT), because of its advanced features, which were described above. Its suitability for transient, non-stationary and time-varying phenomena and for signals that have short lived transient components at different scales can justify and explain why it is chosen as tool of analysis for the PSC signal and the time series of ac conductivity in this work.

#### 2.4.4 Wavelet Families

Wavelet function  $\psi^{a,b}$  is, as discussed above, a flexibility parameter in our analysis. The freedom in the analysing function selection makes the selection of wavelet a key point for the effectiveness of analysis, since it has a direct impact on the results of WT. Since 1930s when Paul Levy proved that Haar wavelet is more suitable for Brownian motion analysis compared to sinusoidal functions provided by Fourier a great number of wavelets have been discovered. Wavelets comprise an evolving domain of research and new wavelets can be created once the already existing ones do not satisfy the needs of an application. Theoretical approach on the construction of new wavelets can be found in (Mallat, 1999), while the same topic is discussed from a practical point of view by (Misiti, Misiti, Oppenheim, & Poggi, 2005). In this section we will refer to the most popular wavelets, some of which have been used in this work.

- *The Haar Wavelet* is the first wavelet proposed and the first wavelet that has compact support. It is symmetrical and orthogonal, but it is neither continuous nor continuously differentiable. It belongs to the Daubechies family (1<sup>st</sup> order member).
- *The Meyer Wavelets* is the family introduced by (Meyer Y. , 1986) and they are continuously differentiable. They are orthonormal bases for  $L^2(\mathbb{R})$  and can provide orthogonal analysis. The Fourier Transform of Meyer Wavelets is smooth, providing a faster decay in time (Mallat, 1999) as shown in Figure 2.12a. Though the decay is not exponential and has been proved that it could not be for orthogonal wavelets that are  $C^\infty$  (Daubechies, 1992).

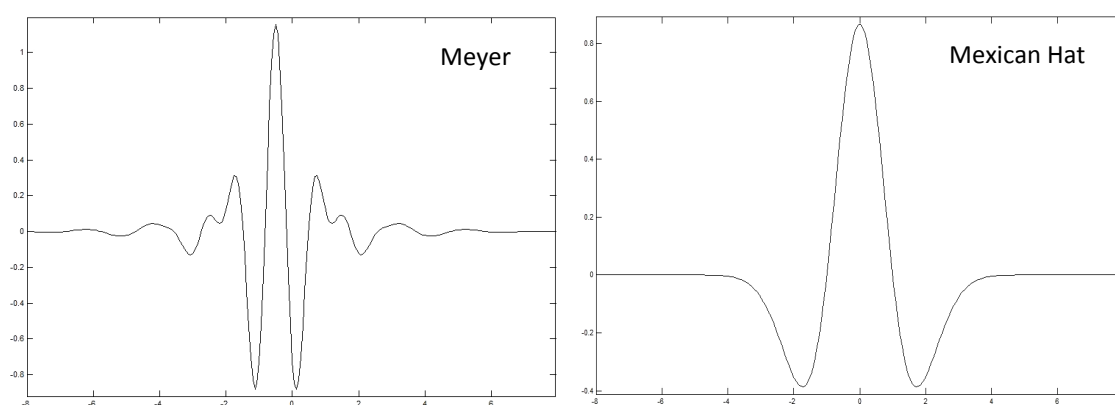


Figure 2.12 The graphs of  $\psi$  wavelet functions (plotted in Matlab wavelet toolbox) for (a) the Meyer Wavelet and (b) the Mexican Hat wavelet

- *The Battle-Lemarié Wavelets* were proposed simultaneously by (Battle, 1987) and (Lemarie, 1988), who conclude to the same orthonormal bases using different methods. These wavelets are polynomial splines and assuming piecewise polynomial of  $n$  degree then  $n-1$  continuous derivatives at knots exist. They are less regular compared to Meyer wavelets, but their decay is faster (Mallat, 1999) i.e. exponential decay. If  $\phi$  is chosen to be the piecewise constant spline, then we get the Haar basis as explained in (Daubechies, 1992)
- *The Mexican Hat* is given by equation (2.4.10), which corresponds to the normalized second derivative of the Gaussian Probability Density Function (PDF)

$$\psi(x) = \frac{2}{\sqrt{3}} \pi^{-1/4} (1-x^2) e^{-x^2/2} \quad (2.4.10)$$

It belongs to the family of real wavelets and it is a smooth function with symmetry, as depicted in Figure 2.12b. The upper and lower scales are limited by the normalisation interval  $[0, 1]$  and the sampling interval of the signal, respectively (Mallat, 1999). The

Mexican hat is widely used for computer vision applications as well as for the detection of transients (Misiti, Misiti, Oppenheim, & Poggi, 2005).

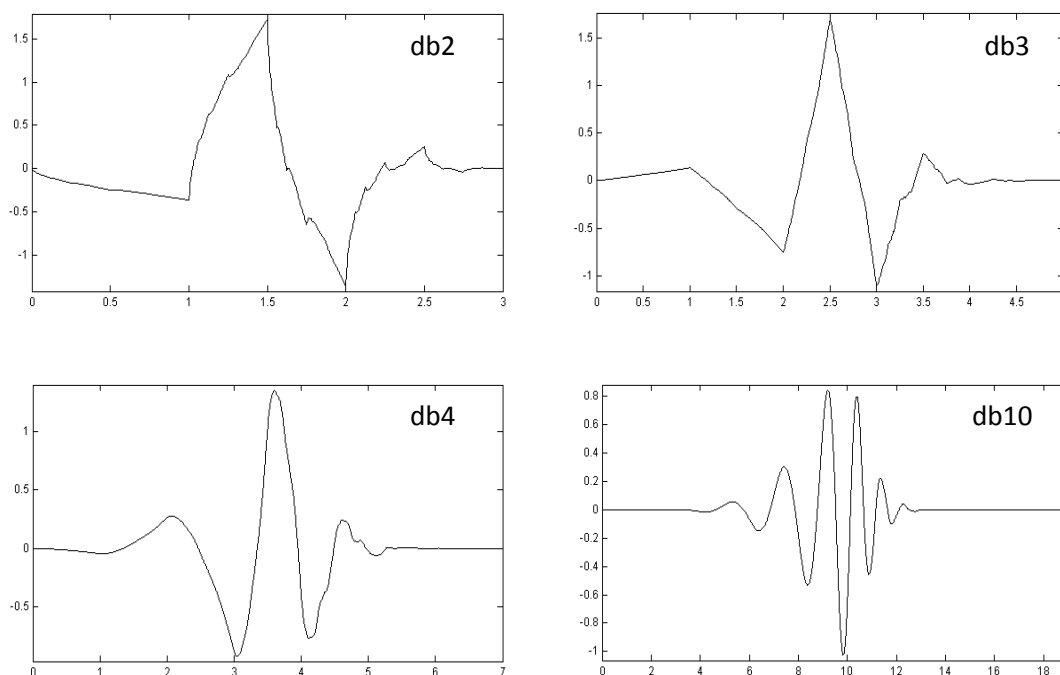


Figure 2.13 Daubechies wavelet family graphs (plotted in Matlab wavelet toolbox) of  $\psi$  wavelet function for the (a) 2<sup>nd</sup> Daubechies wavelet (b) 3<sup>rd</sup> Daubechies wavelet, (c) 4<sup>th</sup> Daubechies wavelet and (d) 10<sup>th</sup> Daubechies wavelet

- *The Daubechies Wavelets* are probably the most elegant and neatly defined wavelets. They were introduced as orthonormal bases with compact support by (Daubechies, 1988). They are a good tool for multiresolution analysis and they are characterised by their prominent asymmetry. They are suitable for any kind of analysis, either orthogonal or biorthogonal and they support Continuous and Discrete Transform, as well as fast algorithms. Extensive analysis of Daubechies wavelets, which are considered as the cornerstone of wavelets, is given in (Daubechies, 1992). The  $\psi$  functions of the most popular members of the family that are also used in this work are given in Figure 2.13.

Guidelines for the appropriate Wavelet family selection as well as for the suitable member of each for a certain application can be found in (Graps, 1995) as well as in (Torrence & Compo, 1998). A more theoretical approach on wavelet selection based on the source entropy is presented in (Mallat, 1999). Although a great variety of Wavelet families are available, the success of the tool lies on its versatile nature, which allows for a new wavelet design so as to be application adapted. A practical technique for this process is described in (Misiti, Misiti, Oppenheim, & Poggi, 2005).



## Chapter 3

# Experimental techniques

## **3 Experimental Techniques**

### **3.1 Introduction**

Experimental work may be considered the cornerstone of this work not only for the importance of the techniques accuracy for the recordings integrity and thus for the validity of signal processing and conclusions, but also because it may serve as basis for future work on real world applications. The experimental work is presented in this chapter by focusing individually to the elements and of the experimental process. We examine separately the materials, the measuring instrumentation, the auxiliary equipment and the sensors, the techniques of testing and the possible mechanical and electrical testing arrangements.

The combination of the available choices for each step of the experimental process leads to one of the possible conducted experiments.

### **3.2 Materials under examination**

Experimental work has been conducted on various materials of miscellaneous shapes and dimensions. The common characteristic of all materials is that exhibit brittle fracture properties during their mechanical deformation, as well as that are used for constructions either as composite materials for building and reinforcement or as natural building stones. This section is dedicated to the presentation of their basic physical properties and information about their containment in minerals as well as other chemical characteristics of interest. Specimens of the materials presented here have been tested against one of the techniques at least, while the most popular against all methods.

#### **3.2.1 Marble**

Marble is the most popular material in this work in the sense that it has been tested against all the techniques presented in the following sections i.e. real time monitoring of electric signal perturbation during fracture, as well as after stressing measurements of ac conductivity. Physical, chemical and mechanical properties of marble have been thoroughly studied in the past and thus it is a well characterised material for which comparative study is possible. Furthermore, conclusions about its electrical behaviour under stress and fracture would be beneficial for geosciences (i.e. seismology, geophysics and mining) because it is a quite common rock in earth's crust, as well as for civil engineering and archaeology applications since it constitutes one of the most common building stones for monuments and constructions in general.

Marble is a rock geomaterial, which is mostly extracted from mountainous areas and its properties vary according to generation and extraction conditions. A study on the physical and engineering properties of marbles from East Macedonia, Peloponnese and Thessaly in Greece, is presented by (Xeidakis & Samaras, 1996). Experimental data of this paper verify that marble is a rather versatile material and its properties are severally influenced by the ground depth it has been extracted from.

In our work the specimens under examination were collected from Mt. Penteli (Dionysos). The properties of this type of marble are close to those of the marbles of famous Greek monuments (Parthenon) and therefore the results would be useful for future restoration projects.

Mechanical characterisation of the material is a demanding process, because experimental data of mechanical properties exhibit significant variation, for example tensile strength varies between 2.38MPa and 19.4MPa, as reported by (Kourkoulis, Exadaktylos, & Vardoulakis, 1999). In the same study the anisotropy of the material is defined by the three characteristic directions – i.e. <sup>1</sup>. parallel to the layers, <sup>2</sup>. along the width of the web and <sup>3</sup>. along the thickness of the web – and the material is defined as orthotropic (9 constants for description). Extensive direct tension tests have led to the conclusion that the tensile strength in the first two cases is similar and therefore in (Pazis, Andrianopoulos, Vardoulakis, & Kourkoulis, 1996) the material is characterised as transversally isotropic and is characterised by 5 independent constants. The first four parameters were determined by compression and tension tests to be  $E=85\text{MPa}$  and  $E'=50\text{MPa}$  (the elasticity modulus) and  $\nu=0.26$  and  $\nu'=0.11$  (the Poisson's ratio). Further details on constants determination are discussed in (Vardoulakis & Kourkoulis, 1997). Experimental work on Dionysos-Pentelikon (D-P) marble has also shown significant influence of size effects (Vardoulakis, Exadaktylos, & Kourkoulis, 1998) on the strength of material. To emulate defects and cracks already present in the marbles of monuments in (Kourkoulis, Exadaktylos, & Vardoulakis, 1999) the specimens were U-notched and further bending tests were conducted to characterise the material. From the above mentioned, it is evident that adequate theoretical and experimental work has been conducted for D-P marble to enable comparison with the results of this work.

As far as its composition, Pentelicon marble contains calcite (98%) and other minerals i.e., 0.5% of muscovite, 0.3% of sericite, 0.1% of chlorite. It also contains 0.2% of quartz (Kourkoulis, Exadaktylos, & Vardoulakis, 1999). Its specific density is  $2730\text{ kg/m}^3$ , while pristine marble to 0.7% for specimens that have suffered natural weathering and have been

exposed to corrosive agents (Vardoulakis, Exadaktylos, & Kourkoulis, 1998). It also exhibits thermal expansion coefficient for temperature range from 15°C to 100°C equal to  $9 \times 10^{-6}$  per °C. It contains equally sized polygonal crystals (dimensions vary between  $900\mu\text{m} \times 650\mu\text{m}$  and  $950\mu\text{m} \times 874\mu\text{m}$ ) and its grain size is about  $0.43 \times 10^{-3}\text{m}$ . It has white in colour, but it is also characterised by thin vein like lines of ash-green colour owe to the chlorite and muscovite it contains (Tasogiannopoulos, 1986).

Specimens of various dimensions and shapes have been used for the each experimental test. Typical dimensions of specimens for ac conductivity time series evaluation experiments are  $12 \times 20 \times 40\text{mm}$ . In experiments of axial compression using the PSC technique, the marble specimens were of bigger size  $40 \times 40 \times 100\text{mm}$  and  $60 \times 60 \times 60\text{mm}$ . For bending experiments using the BSC technique typical dimensions of the beams under test were  $9 \times 25 \times 100\text{mm}$ . In all cases the specimens were selected so as not to have inherently serious lattice defects and they were handled so as to be kept as pristine as possible before the experiment. Special attention was given to the shape of prism like specimens and especially for the parallel surfaces of specimens that were subjected to compression. In ac conductivity measurements the aforementioned point is even more critical, whereas for bending experiments it is a non critical detail.

### 3.2.2 Amphibolite

The material under test was extracted from the drilling site of the German Continental Deep Drilling program (KTB) and was selected in order to evaluate our testing techniques for another geomaterial in addition to marble. Earthquake prediction techniques based on electromagnetic precursory phenomena of seismic events would be benefited by the understanding of the reaction of materials from super-deep boreholes to stress. The properties of the material, which are described in this section, are substantially different to marble properties. However amphibolite and marble exhibit similar brittle fracture properties and therefore trends of the results are comparable, as shown in following chapters. Note that amphibolite specimens were extracted from depths where the temperature was below 300°C, so no transition of rock properties from brittle to ductile are observed.

The exact location of drill site is in the Zone of Erbendorf – Vohenstraus in Bavaria. This region is characterised by the presence of amphibolite rocks, which have been studied through deep boreholes. The specimens that are examined in this work have been offered

by collaborating researchers from Mineralogisches Institut der Universität Bonn and they have been extracted from a borehole depth of about 6km.

In the KTB drilling, two categories of rocks were revealed i.e. the paragneisses and the metabasites. The amphibolite belongs to the second category and is subdivided to three types depending on the grains type. The material specimens we have examined belong to the fine-grained type. The maximum grain size was 400 $\mu\text{m}$  and the average was about 150 $\mu\text{m}$  whereas grains of few  $\mu\text{m}$  were also present (Nover, Heikamp, Kontny, & Duba, 1995). The material also contains inherent cracks in two directions, i.e. in the direction of rock texture because of foliation and lineation processes, as well as perpendicular to the horizontal stress because of temperature and pressure release. These reasons of cracking are thoroughly discussed by (Nover, Heikamp, Kontny, & Duba, 1995). Considerable anisotropy is observed due to the cracks in the parameters of conductivity and permeability, which strongly depend on the direction of measurement (Rauen & Lastovickova, 1995).

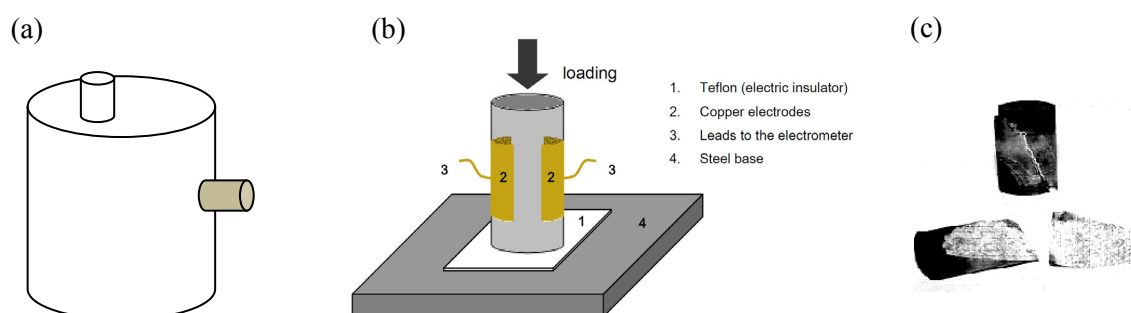


Figure 3.1 (a) Specimens were extracted either parallel or perpendicular to borehole axis, the coloured direction of extraction was selected for the experiments, (b) the experimental setup for testing amphibolite samples (c) specimen after failure, diagonal shearing plane – taken from (Triantis, Anastasiadis, Vallianatos, Kyriazis, & Nover, 2007)

The porosity of the specimens was about 2% which constitutes as typical value for metabasites. The conductivity was not high at the specimens under examination although they contained conducting ore minerals and graphite. However, these minerals were isolated in non-conducting lattice (Lich, Duyster, Godizart, Keyssner, & Wall, 1992) and therefore would not be expected to form conducting paths in the stress experiments we have conducted. The main rock forming minerals of the studied amphibolites were hornblende, plagioclase, garnet with minor quartz and biotite. Accessories included Ti-phases ilmenite 1–3%, opaques, K-feldspar, apatite and some zircon, titanite and ore minerals were also contained (Triantis, Anastasiadis, Vallianatos, Kyriazis, & Nover,

2007). The metamorphism properties and information about amphibolite facies conditions can be found in (Nover, Heikamp, Kontny, & Duba, 1995).

Two kinds of specimens were available from the borehole extraction as depicted in Figure 3.1a. Specimens were either parallel to the borehole axis or perpendicular to borehole axis. The latter direction was selected as suitable for our experiments. Data concerning foliation plane are discussed in (Lich, Duyster, Godizart, Keyssner, & Wall, 1992) and (Nover, Heikamp, Kontny, & Duba, 1995) and seem to be not horizontal, but they exhibit an inclination which is as steep as  $50^\circ$  to vertical in some cases. In the same papers foliation planes seem to exhibit conductive properties because of the conducting minerals they contain. Therefore, we have selected these specimens of perpendicular direction for our experiments that are depicted in Figure 3.1b. We have sacrificed the strength of material to loading for the sake of measurements at non conducting surfaces. Note that shearing crack has been occurred in the direction of foliation Figure 3.1c.

The amphibolite samples used in this experiment were cylindrical measuring 25mm in diameter and 50mm in height. The average fracture limit was measured to be approximately 85MPa in axial compression. As far as its mechanical behaviour is concerned amphibolite is characterised by an extended linear behaviour up to failure compared to other rock materials, according to (Heikamp & Nover, 2003).

### **3.2.3 Cement mortar and paste**

The cement may be considered as the most popular material for modern constructions and thus the understanding of its properties is of utmost importance. Cement exhibits brittle fracture properties and it is examined in this work as far as its electric behaviour during fracturing.

The material samples were created by the type of cement known as OPC Portland, which was provided by the Research and Development department of Titan Cement Company. As far as the mixture of the composite material is concerned, two different types were created, namely cement paste and cement mortar. The cement paste was constructed with water to cement ratio 1:2, whereas the cement mortar mixture was created with sand (fine grained) to water and cement ratio 3:0.5:1. Information about granulometric composition of the specimens and details are given by (Kyriazopoulos, 2009). After the initial mixing of the materials for two minutes as required for an homogeneous mixture to be made, we placed it in forming blocks of either cubic or prismatic shape to create columns beams and cubes with dimensions  $40 \times 40 \times 160$ mm and  $50 \times 50 \times 50$ mm respectively. In order to avoid

the entrapment of air inside the specimens the forming blocks were appropriately shocked via a vibrator plate. Specimens were at a satisfactory solid state in 24 hours, so they were extracted from the forming blocks. Note that precautions were taken for safe extraction by having applied some oil between the forming blocks and the cement mixture. The maturing of the specimens was performed under controlled humidity and temperature (high humidity of more than 70% is suggested to avoid indirect cracking occurrence).

The specimens were left for at least 40 days to dry before being subjected to bending or compression experiments. This time interval is considered adequate for the strength of the specimen to exceed 95% of its strength, while in most cases experiments were conducted 50 to 60 days after the specimens' construction.

### **3.2.4 Fibre Reinforced Polymer**

The construction industry seeks for durable materials with low weight, as well as with immunity to corrosion by water and other contaminants for the retrofitting and reinforcement of concrete structures. Since the early 1960s, owing to the needs of airspace technology for materials, the Fibre Reinforced Polymer Composites (FRP) were developed. Few years later the FRPs turned from composite materials for state of the art applications to popular materials for reinforcement of buildings and bridges. Historical review of the development of the composite materials of this kind is given by (Bakis, et al., 2002). FRPs are formed by resins like polyester, epoxy and polyurethane as well as by fibres made of materials like carbon, aramide, glass and polyester. The fibres are either lay within one direction or are woven in bidirectional or even multidirectional nets. The aforementioned materials, i.e. fibres and resins, are bound together through a standard process called pultrusion (Meyer R. W., 1985). Research on pultruded shapes and materials has lead to outstanding composite constructions known as sandwich constructions that exhibit better engineering properties compared to conventional materials (Davalos, Qiao, Xu, Robinson, & Barth, 2001).

FRP carbodur sheets that are used in the experiment are produced by S&P Clever Reinforcement Company (part no S&P CFK 150/2000). This composite material is formed by unidirectional carbon fibres (approximately 70%) covered by epoxy resin. These two materials are chemically and mechanically processed to form black FRP sheets of various width and thickness which correspond to different durability (Triantis, Anastasiadis, Kyriazopoulos, Kyriazis, & Alexis, 2006). The dimensions of the examined sample are (1.2×50×110mm), its density is 1.5gr/cm<sup>3</sup>, its modulus of elasticity 240-640GPa and its

tensile strength 2500-4000MPa. The specimens were subjected to standard three point bending (3PB) tests to study their electric behaviour during fracturing. The Fibre Bundle Model, which has been analysed in previous chapter, is the mechanical model that was used for understanding the processes of FRP deformation.

The basic features of FRP that makes it a best-selling material for a variety of civil engineering applications are its durability, corrosion resistance, low cost and weight, and ease of construction and use, especially when FRP sheets are externally bonded with adhesive resins to concrete structures (Ueda & Dai, 2005). However, in our work FRP is examined as an individual composite structure to avoid complex behaviour of interfaces and influence of concrete structure.

### 3.3 Equipments and software

The measuring equipments, the hardware basic specifications and the considerations concerning interoperability, integrity and accuracy issues are discussed in this section. We also refer to basic software that was used for interconnection of measuring devices, as well as collection and storage of data recordings. The aforementioned points are crucial for making reliable conclusions based on experimental results.

#### 3.3.1 Electrometers and electrodes

The basic idea of this work is the identification of cracks by means of electric signal emissions during fracture of brittle specimens. Electric signal seems to ‘flow’ within the specimens during fracture and our aim is to record and process it. The reasonable solution would be to use an ammeter for current measurements. However this signal emission level is very low because the materials under examination are non-conducting. Special measuring devices called electrometers are widely used for such low electric current detection and recording. The electrometers used in this work were manufactured by Keithley.

The programmable electrometer Keithley 617 has been used for single channel measurements. From the available measurement modes, i.e. current, resistance, voltage and charge, we have used the former function (current). The range of measurements it supports is from  $1 \times 10^{-16}$  A to  $2 \times 10^{-2}$  A. This measuring range provides two-digit accuracy, even for the low level electric signals in the order of pA. It can measure resistance up to  $5 \times 10^{16}$   $\Omega$  and its input resistance is higher than  $2 \times 10^{14}$   $\Omega$  for voltage measurements. The IEEE-488 (General Purpose Interface Bus – GPIB) interface enables programmable mode of the



electrometer and control through a PC. The device has a built in V- $\Omega$  guard switch to enable the minimisation of leakage current. Supplementary specifications concerning voltage and charge measurements can be found in the datasheets provided by the manufacturer.

The programmable electrometer Keithley 6514 was additionally used for measurements that require two channels for electric signal recording. Since it is a newer model it allows more accurate and faster measurements. Its noise level is lower than 1fA, while for measurements in the range of  $2 \times 10^{-14}$ A it supports resolution up to  $1 \times 10^{-16}$ A. It is also capable of measuring resistances up to 200T $\Omega$ . It supports communication through IEEE-488 interface and RS-232. We have used the former connection for compliance with the Keithley 617. Under specifications described by manufacturer the electrometer is able to make 500 readings/sec through the GPIB interface, whereas the use of internal buffer allows up to 1200 readings/sec. Design details about the cancellation of shunt resistor current and burden voltage are given by the manufacturer and should be used in the future for stand-alone sensors for electric signal detection.

The detection of electric signal was conducted via electrodes that were attached on the surface of the specimens under test. The shape of the electrodes was circular or oblong square. And their material was either copper (0.5mm thick sheets of pure copper) or gold-plated metal 2mm thick. The circular gold-plated electrodes (3cm diameter) were used in PSC experiments and were kept attached to prism specimens by springs. In order to create a conductive interface between specimen and electrodes, porous materials like cement paste were additionally painted with conductive paste. For cylindrical specimens we have selected thinner and more flexible copper electrodes to be attached to the specimens, as depicted in Figure 3.1b. Thin oblong square electrodes (30mm $\times$ 10mm $\times$ 0.5mm) were also used for BSC measurements in the lower part of bended beams. Strong adhesive material was used to attach the electrodes on the specimen and prevent them from moving or even from detaching the specimen during the experiment. Thin electrodes were attached in some specimens by using a flexible elastic rubber which was wrapped around the material sample to keep electrodes in place. A recent idea was to build the electrodes for measurement into the composite material samples for eliminating the problem of attachment, provided that the influence on the strength of the samples would be kept minimal.

Parameters that affect electric signal recordings are the dimensions of the electrodes and their material, as well as their active surface. For direct comparison of the absolute values

of experimental recordings, the aforementioned parameters have to be unchanged. Alternatively, a relativistic comparison approach has to be adopted and normalisation of the results is required.

The interface between the electrodes and the electrometer is the connecting wires. Cable capacitance is known as delay factor for the signal and might affect the accuracy in timing of the recordings. Additionally, the signal exhibits low amplitude and thus is prone to noise. Therefore, elimination of capacitance effects and shielding from noise are crucial parameters for cables. For conducting the measurements the Keithley low noise triax cable 237-ALG-2, ending to alligator clips for connection to the electrodes, is used.

### 3.3.2 Noise considerations; precautionary measures and solutions

Measurements of electric current signal may be considered trivial for electronic and electrical engineering; however measurements of mechanically stimulated electric signal have some unique characteristics, such as the non-conducting properties of the material under test and the very low signal level. Since the signal is related to cracking and the size of cracking to the size of the specimen, we can conclude that due to the size of the specimens the signal is even lower. The low level signal is vulnerable to noise, thus in the laboratory work that we have conducted, we have tried to detect and eliminate the sources of noise or immunise signal against it.

The basic sources of noise and consequently of erroneous measurement of mechanically stimulated electric signals are discussed by (Frenzel, 2007) and (Rako, 2007) and guidelines are given in the application notes for Keithley measuring equipment. Noise sources that exist in our experiments are described below.

- *Electrostatic coupling* occurs when electrically charged object is in contact with the specimen under test. Unless the experiment is conducted in a shielded place the measurements are severely influenced by the electrostatic charge. Human body is a source for static charges, therefore during experiments there was no human presence close to the test area.
- *Vibration & triboelectric effect* may cause serious problems in the recorded electric signal. The triboelectric effect is the result of the movement of a conductor towards an insulator and it mainly affects cables. It may be considered as a result of friction, but vibration may also trigger the triboelectric effect and therefore vibration and movement of the cables should be kept minimal. This is quite difficult, if we consider the unavoidable movements during mechanical tests.

- *Offset current drift* is the result of changes in temperature of either the measuring equipment or of the specimen or of both.
- *Leakage currents* may appear in the measurements because of contaminants on the electrodes surfaces, on the cables as well as on the material under test. Conducting as well as non conducting surfaces absorb dirt, moisture and other contaminants and therefore unwanted current paths may be created.
- *Light effects, electrochemical effects and thermal noise* are common sources of low current measurements that are not present in our experiments.
- *Piezoelectric effects and dielectric absorption* are characterised by (Frenzel, 2007) as possible sources of noise. In our experiments this electric signal not only is not characterised as noise but it has also to be detected and isolated from the rest of the signal as it contains valuable information for the mechanical treatment and conditions of the material under test, as discussed in following chapters.

The solution to the electrostatic coupling as well as to the ambient electromagnetic noise effects is the shielding of the measurement area. For this reason a Faraday shield was used to eliminate electromagnetic interference. The outer dimensions of the cage are approximately 50cm×50cm×60cm and the material used for inner coating is copper sheet, while the outer is iron based metal. Metal to metal connection between the two sheets alongside with grounding of the shield immunises the measurement to electromagnetic and electrostatic interference. The electrometers are kept outside the shield but cables are very tightly fixed together and are attached firmly to the electrodes so as to minimise movements and vibrations and thus reduce the triboelectric effects. For leakage current minimisation very careful cleaning of the specimens, of the electrodes as well as of the wires and even of the shield is carried out before an experiment with methanol and cotton cloth. This is the standard cleaning procedure of conducting and non-conducting surfaces as proposed by the manufacturer of the measuring system i.e. Keithley. Offset current drift is not crucial in these experiments, because they do not last long time and therefore ambient temperature change is not significant. However, precautions are taken in two directions to prevent this type of noise. The ambient temperature is controlled by air-conditioning system and is kept stable during experiments. Additionally, the measuring device is switched on and works for a certain warming up period to stabilise its components temperature, in order to give accurate results.

### 3.3.3 Mechanical setup; stress - strain sensors and controllers

In previous sections we have analysed materials and electrical setup of the experiments, problems that we faced and solutions. In this section we present the mechanical setup that is used in our experiments both in compression and bending.

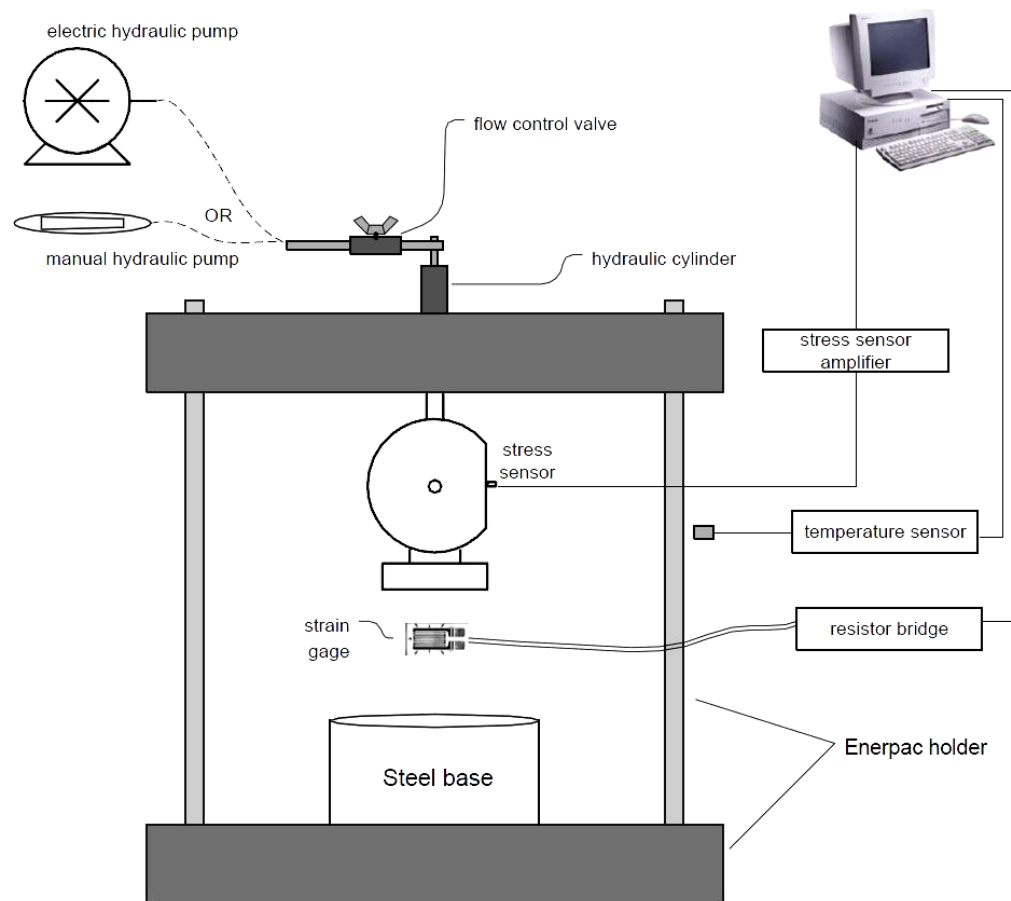


Figure 3.2 Mechanical setup for experiments of mechanically stimulated electric signal identification

The schematic diagram of the mechanical setup for the experiments of this work is depicted in Figure 3.2. The metallic frame which is oriented by two horizontal bases and two vertical bars is provided by Enerpac, as a holder for the experiments. The stress of either compressive or bending type is applied by the piston which moves down towards a steel base. A teflon sheet is placed between the steel base and the specimen in order to provide electric insulation and minimise the friction between the steel and the brittle material under test. The piston is driven by a 10 ton single acting hydraulic cylinder (Enerpac RC-106), which is driven either by a manual hydraulic pump (Enerpac P-142) or by an electric hydraulic pump (Enerpac PUJ-1200). Depending on the loading scheme that has been selected for an experiment the corresponding pump is used. For controlling the

flow, a manually operated valve (Enerpac V66) is inserted between the cylinder and the pump as presented in Figure 3.2.

The stress sensor that is shown in Figure 3.2 is connected via an amplifier to the PC for stress recording. Temperature monitoring is performed by a sensor, which is placed inside the Faraday shield and the temperature is shown and recorded in the PC.

Stain measurements are conducted by strain gage sensors of Kyowa. The stain gage is connected to a resistor bridge (Microlink-770) as described by the application notes of manufacturer so that the perturbation of the balance of the bridge to correspond to the stain variation. The output of the stain gage bridge and the stress sensor are connected to an A/D converter card, so that can be digitally recorded to the PC.

### 3.3.4 Measurements control and data acquisition software

The electrometers initialisation and control as well as the presentation and recording of mechanical and electrical measurements were performed by customised software, which was developed in VEE graphics based language of National Instruments.

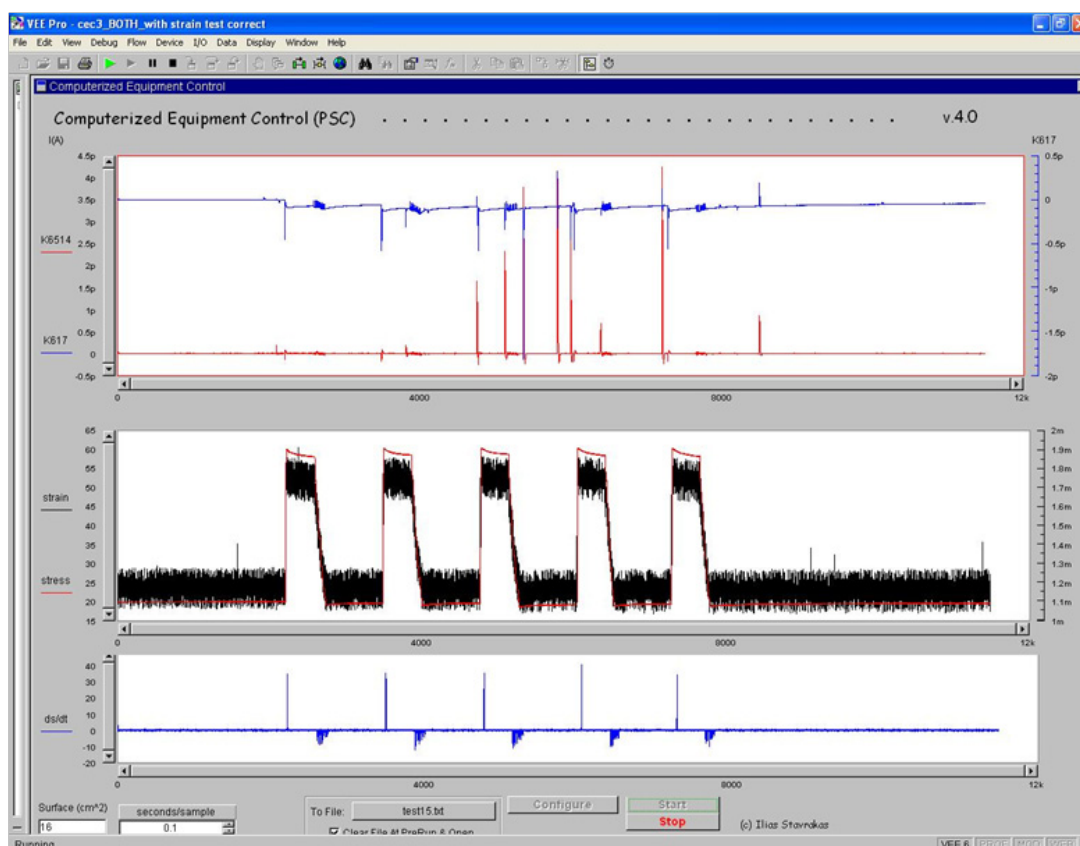


Figure 3.3 Screenshot of the control and measurements acquisition software

The user interface allows flexibility with axes of electric signal recordings from the two electrodes that correspond to the upper window of the screenshot shown in Figure 3.3. In the second window stress and strain recordings are presented (real time) in common time axis. The stress rate is calculated from the recorded data and is presented in the third window of the screenshot of Figure 3.3.

The recorded data are exported in a .txt file which can be easily imported in excel spreadsheets and other signal processing software for further analysis. Details on the software specifications can be found in (Stavrakas, 2005).

The ac time series conductivity were recorded by software interface also written in VEE, which enables the control of LCR meter that is analysed in the following section, as well as the recording of measurements to the PC.

### 3.3.5 The LCR meter

This LCR meter Agilent 4284A is a multipurpose measuring device that is used for evaluation of electronic components, semiconductors, quality tests and characterisation of systems. In this work the LCR meter was used in the laboratory experiments for a non-real time method of cracking identification in brittle materials. A dielectric test fixture (Agilent 16451B) was connected to the LCR meter and it was used as a specimen holder and measuring interface.

The Agilent 4284A according to specifications allows measurements at a frequency span of 20Hz to 1 MHz, which is adequate for dielectric spectroscopy as well as for dielectric measurement time series. The range of test signal levels is well adapted to our experiments and varies from  $5 \times 10^{-3}$  V to 2V.

The measurement accuracy is at the level of 0.05% regardless of the frequency and high resolution (six digits) is available for all ranges of the system. The precision in measurements is also verified by the measuring equipment initialisation and calibration before the measurement at a specific range. The calibration method is similar to the standard procedure for such measuring equipment, i.e. internal calibration of the equipment when the circuit is *open*, *short* and in the case of ideal  $50\Omega$  *load*. In each case a specific ideal part (i.e. resistance  $R = \infty$  or 0 or  $50\Omega$ ) is placed on the test fixture Agilent 16451B and the calibration procedure is triggered.

The measuring device is controlled through GPIB interface and measurements are stored in a PC, so as to create a user friendly test system for the characterisation of brittle materials according to the fatigue they have suffered.

### 3.4 Experimental Techniques

In this section we concisely present the combination methods of mechanical and electrical setups alongside with material samples and sensors, towards the creation of experimental techniques. Two techniques have been used for real time testing of materials in compression and bending accordingly, whereas for the former a possible amendment is proposed. Additionally, a technique for identification of defects in a material sample that has suffered mechanical deformation (plastic region) based on the ac conductivity time series recordings is analysed.

#### 3.4.1 Pressure Stimulated Current Technique

The technique of testing brittle material samples subjected to compression by evaluating the electric signal emissions is named after the signal and is known as Pressure Stimulated Currents technique. In previous chapter we have referred to the mechanically stimulated electric signal that is generated because of electrokinetic and piezoelectric phenomena, when a material sample is subjected to compression. The term Pressure Stimulated Current was used to indicate that the electric signal is related to the mechanical stimulation of compression. We have selected to differentiate between compression and bending for compliance with civil engineering notions, although the electric signal generating process is cracking regardless of the stress type.

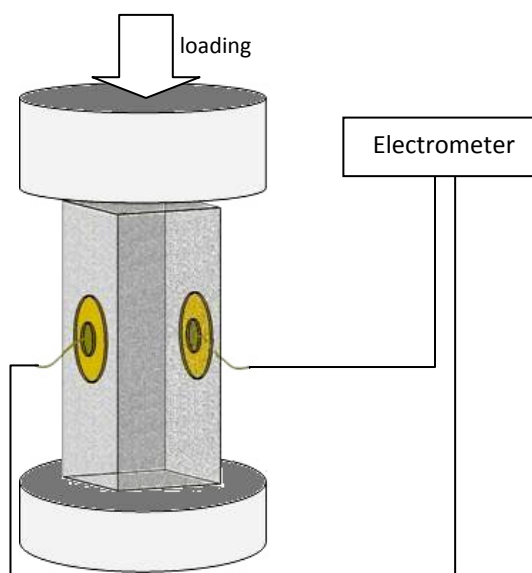


Figure 3.4 Basic measurement setup of Pressure Stimulated Currents technique

PSC technique is therefore an experimental procedure during which a cubic, a cylinder or a prism like specimen is subjected to axial compression. The material samples that are

selected for testing, i.e. marble, cement and amphibolites, exhibit brittle fracture properties. Regardless of the material under examination the corresponding signal was detected by means of electrodes that were positioned in direction perpendicular to the axis of loading. A typical example of PSC technique setup is shown in Figure 3.4, for a prism like specimen. It can be seen that electrodes are positioned parallel to each other. In the case of cylindrical specimens the electrodes are curved in order to attach to the sample and thus their middle point tangents have to be parallel to each other. The loading schemes that are used for mechanical stimulation of the specimens are analysed in a following section. Between the metallic cylinders shown in Figure 3.4 and the specimen, thin teflon sheets were positioned to absorb any friction and slipping effects. Electrometer is attached to the electrodes for measurements of electric signal perturbation during fracturing. Strain recordings were conducted by strain gage sensor that was placed on the free of electrodes surface of the prism.

### 3.4.2 Bending Stimulated Current Technique

The consistent results of the PSC technique motivated the research in another common material strength test of civil engineering, specifically the adaptation of PSC technique to the three-point bending test of a beam. The electric signal that corresponds to such deformation process is called Bending Stimulated Current and the technique is named after it. The materials that have been tested with this technique are also brittle, namely cement, marble and FRP. Their shape was either beam or sheet like and they were tested by the same loading machine with the PSC. However, for BSC technique the specimen is not lay on its base as in PSC technique, but it is placed on the edges of two supporting cylinder-like or wedge-like metallic objects (one at each end), while another one is placed in the middle of the upper surface, as shown in Figure 3.5.

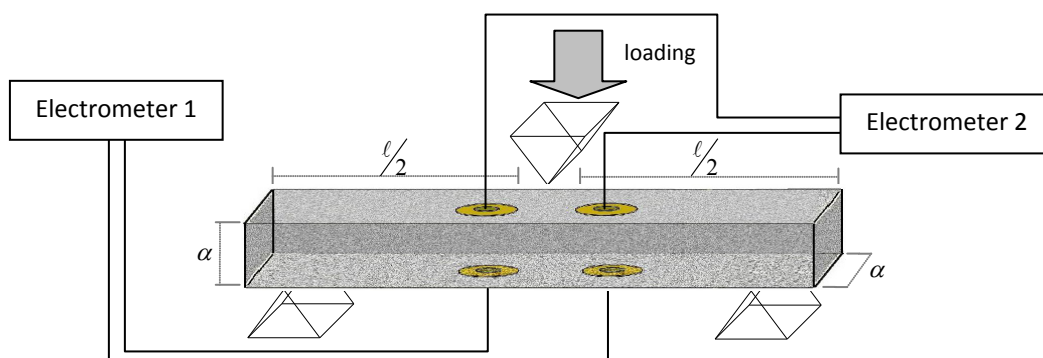


Figure 3.5 Basic measurement setup of Bending Stimulated Currents technique



The measurement of electric signal is conducted by two pairs of electrodes, placed as shown in Figure 3.5. One pair is placed on the lower side of the beam, which is tensed and more specifically on either side of the point that the crack initiation is expected. The other pair is placed on the upper part of the beam that is compressed. Again the electrodes are placed on either sides of the expected crack.

As claimed before the generating mechanisms are the same in the two techniques but BSC technique is characterised by the easily predicted plane of failure and the propagation of an initial crack instead of microcracks clustering. It is also characterised by the existence of two different regions of deformation i.e. compressed and tensed, which makes it more complicated to analyse as will be proved in next chapters.

### 3.4.3 Mechanical loading schemes

In the previous sections we presented two real time experimental testing techniques for strength evaluation of brittle materials by electric signal analysis. In both techniques the loading frame and machines were common for compression and bending and the loading schemes that were selected for mechanical stimulation of the material samples were also similar. In Figure 3.6 typical examples of the four loading types that have been used in this work are presented in unified axes.

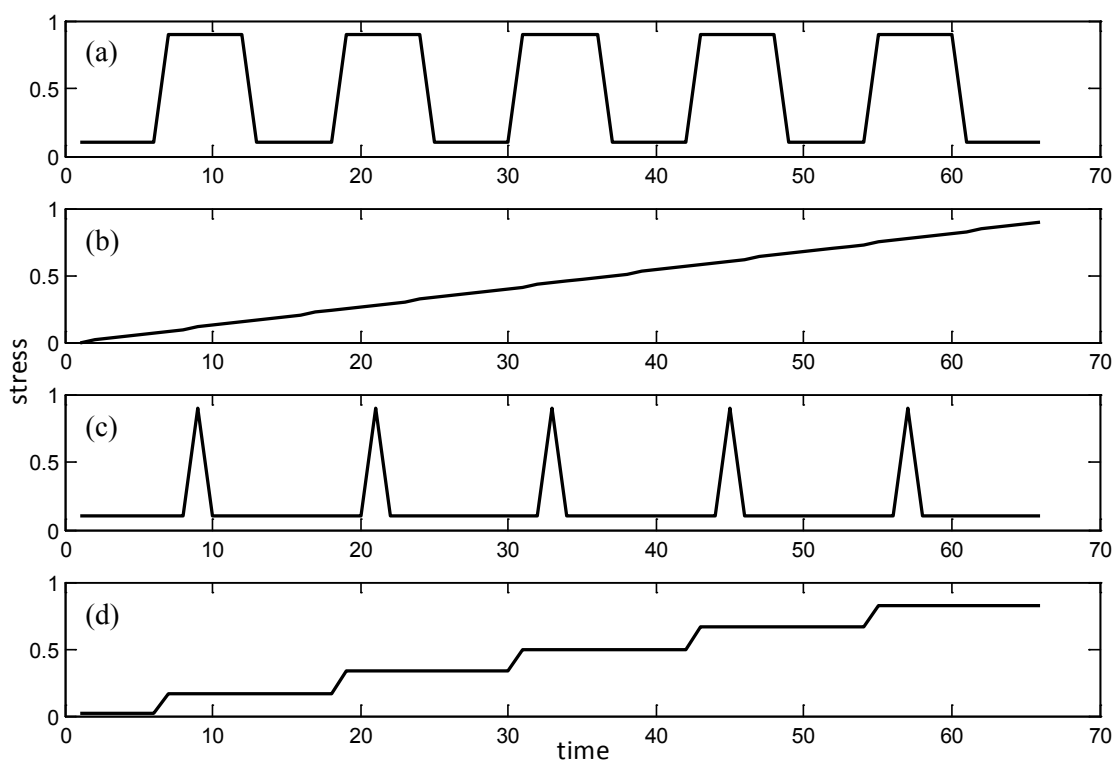


Figure 3.6 Loading schemes for PSC and BSC experimental techniques

Generally we can divide the loading schemes into cyclic loading and increasing loading. The former category is selected for fatigue tests, whereas the later for material strength tests in civil engineering. Two possible choices in each category are available for experiments and are concisely presented below.

The step-wise cyclic loading is shown in Figure 3.6a and can be mathematically described by the following equation,

$$L(t) = \begin{cases} L_k = \text{constant} & , \text{ for } t < t_k \\ L_k + b \cdot (t - t_k) & , \text{ for } t_k \leq t < t_{k+1} \\ L_{k+1} = \text{constant} & , \text{ for } t_{k+1} \leq t < t_{k+2} \\ L_{k+1} - b' \cdot (t - t_{k+2}) & , \text{ for } t_{k+2} \leq t < t_{k+3} \\ L_k = \text{constant} & , \text{ for } t \geq t_{k+3} \end{cases} \quad (3.4.1)$$

The ramp-wise cyclic loading is shown in Figure 3.6c and can be mathematically described by the following equation

$$L(t) = \begin{cases} L_k = \text{constant} & , \text{ for } t < t_k \\ L_k + b \cdot (t - t_k) & , \text{ for } t_k \leq t < t_{k+1} \\ L_{k+1} - b' \cdot (t - t_{k+1}) & , \text{ for } t_{k+1} \leq t < t_{k+2} \\ L_k = \text{constant} & , \text{ for } t \geq t_{k+2} \end{cases} \quad (3.4.2)$$

In both equations  $L_k$  denotes the low loading level,  $L_{k+1}$  is the high loading level,  $b$  and  $b'$  correspond to the loading and unloading rates accordingly.

In the ideal case presented in the Figure 3.6a and c the loading and unloading rates are the same (i.e.  $b = b'$ ), but in real experiments unloading is usually slower and is made in small steps. In experiments there is also another deviation concerning the constant loading levels, especially the high loading level. The loading is stabilised by the valve that is available, however is not totally stable and a minor decrease is observed from the maximum value that does not exceed 1-2%.

Additionally,  $L_k$  is the initial loading level which is slightly greater than zero to allow the specimen to relax without moving from its initial position. Note that particularly for cyclic loading experiments the changes in the axis of compression are crucial for memory effects erase. In some cases the  $L_k$  loading level was selected to be quite high close to the margin of inelastic region of stress-strain curve.

In the category of strength test experiments, the selected loading schemes are either linearly or step-wise increasing. The typical linearly increasing loading scheme is shown in Figure 3.6b and is described by the mathematical equation (3.4.3)

$$L(t) = L_k + b \cdot t \quad (3.4.3)$$

The initial loading level  $L_k$  is practically zero or at a point that the crack closure process has been completed. The second choice comprises an indirect way to bypass the PSC signal that is emitted during crack closure process. Generally this loading scheme involves the minimum relaxation but the result is highly dependent to the selected loading rate  $b$ . The  $b$  parameter is characteristic for this kind of loading and in this work has been kept as low as possible for reasons that will be clarified in following chapters.

The step-wise increasing loading is the depicted loading scheme in Figure 3.6d. It can be mathematically expressed by equation.

$$L(t) = \begin{cases} L_k = \text{constant} & , \text{ for } t < t_k \\ L_k + b \cdot (t - t_k) & , \text{ for } t_k \leq t < t_{k+1} \\ L_{k+1} = \text{constant} & , \text{ for } t \geq t_{k+1} \end{cases} \quad (3.4.4)$$

The loading rate  $b$  is referred to the increasing rate of each step. This is characteristic of the loading process; however comparison with the rate of linearly increasing loading is only possible by linear fitting of the plot. It is therefore dependent on the increase of loading steps but also on the time interval of relaxation at each level before a new loading step. Through this experimental loading scheme can be analysed the relaxation processes at each loading step since there are time intervals with zero loading rate ( $dL/dt = 0$ ) that allow the electrical relaxation of the specimen.

Additionally to the above mentioned loading schemes, other random either increasing or cyclic loadings have been applied to specimens in order to evaluate our techniques for non-uniform and more complex mechanical stimuli.

#### 3.4.4 Electrically stimulated by external voltage source PSC technique

The PSC technique has been extensively used in this work, for mechanically stimulated electric signal detection and analysis. Additionally to the common PSC technique that has been earlier described, an amended PSC technique is proposed. More specifically, we have come up with an innovative modification of the conventional PSC technique, concerning the electrical setup (Kyriazis, Anastasiadis, Triantis, Stavarakas, Vallianatos, & Stonham, 2009).

It has been proved and will be later discussed that the mechanical stimuli may trigger electric signal electrification mechanisms (i.e. electrokinetic and piezoelectric). It is also known from electrical engineering that the generating source of electric current is voltage.

Therefore, we have added an electrical stimulus, namely a very high DC voltage, to the samples additionally to the mechanical stimuli and we have recorded the resulting electric signal.

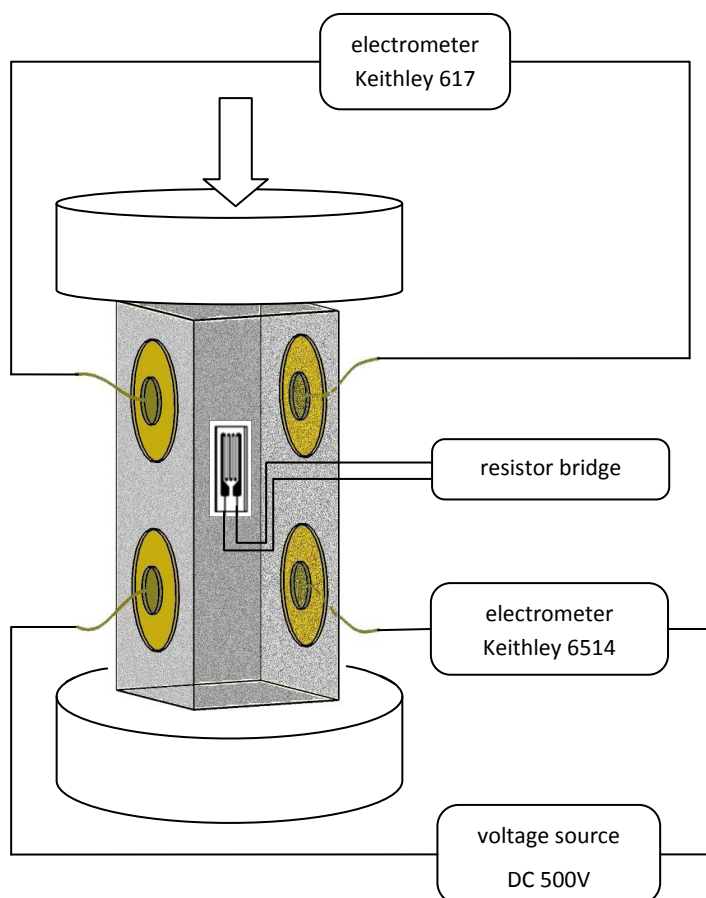


Figure 3.7 Experimental setup for the evaluation of the amended PSC technique

The setup shown in Figure 3.7 has been used for the evaluation of the method. In a typical PSC experiment we have connect two pairs of electrodes in two different electrometers. In one of the electrometers a 500V DC voltage has been connected in series with the specimen and electrometer. A so high voltage was selected to create a considerable stimulation to the electric signal since the material is not conducting and therefore it has a very high resistance. The electric signal that was detected from the two electrometers during a stress step is depicted in Figure 3.8b. The red coloured plot corresponds to the electrometer that has been connected to external voltage while the black plot to a typical PSC signal stimulated only by mechanical stress. The former electric signal is more than three orders of magnitude higher than the latter as depicted in Figure 3.8b, but there was no mutual coupling between the electrodes and the perturbation of the ‘no-voltage’ channel was not more than 5%, because of the existence of the ‘voltage’ channel.

The electrodes were placed closed together at a distance that can detect the same cracking mechanisms owed to inelastic deformation. Therefore in a typical PSC technique experiment, the PSC signal recordings would be similar.

The remarkable experimental finding is that even when the level of the signal is boosted through externally applied voltage, the approximation and details of the signal are boosted equivalently and the information yielding from mechanical stimulation is not buried. The evidence of this result is depicted in Figure 3.8c, in which both signals are normalised and presented in common axis showing notable similarity.

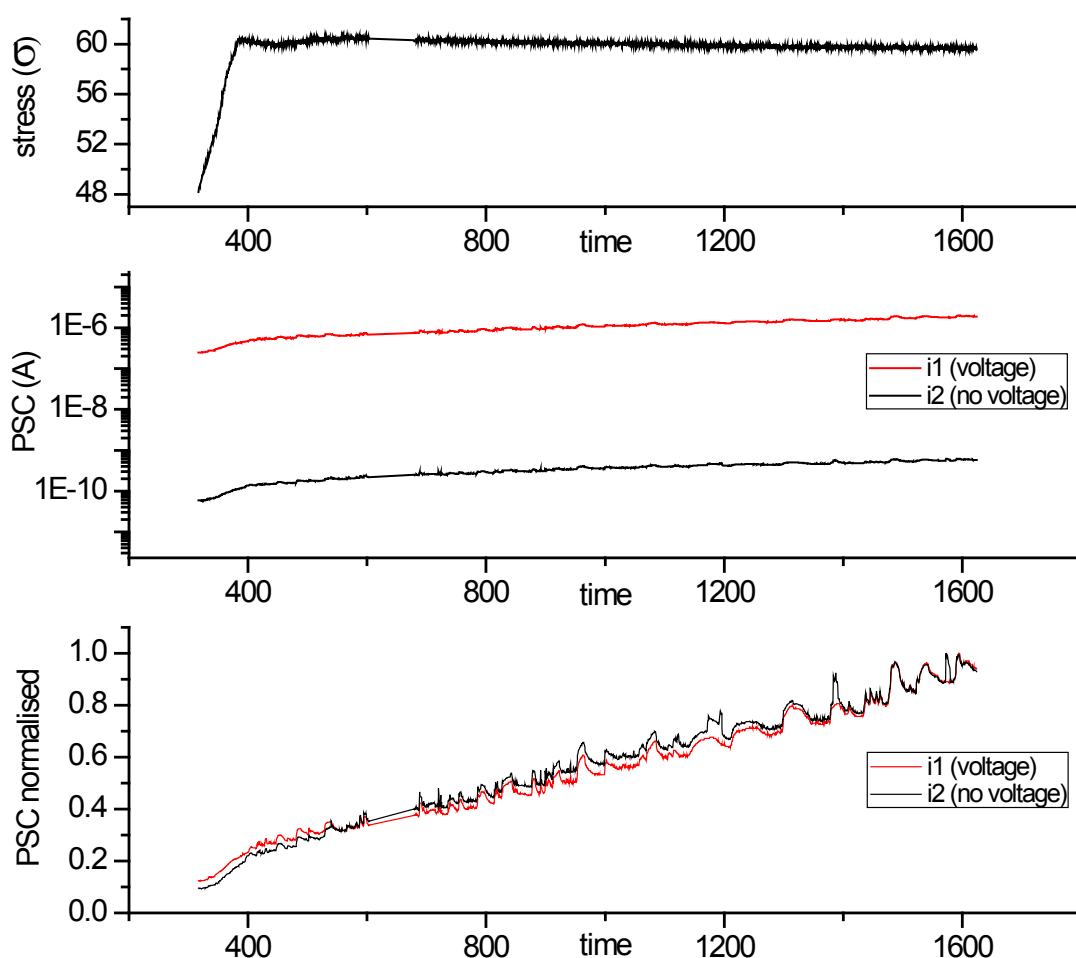


Figure 3.8 (a) Stress step evolution over time, (b) PSC recording of the two electrometers in common y-axis. And (c) normalised PSC recordings with and without externally applied DC voltage

Another experiment was conducted in two identical marble specimens of the same material, extraction point, foliation and dimensions, for further investigation of this PSC amended technique. The typical strength test ( linearly increasing loading up to failure), was conducted for the two specimens, but one of the specimens was also electrically stimulated with external electric voltage. The findings of the first experimental process as far as the macroscopic trends in the two cases were verified as depicted in Figure 3.9 but in

microscopic analysis another important feature of the amended PSC technique was revealed. The frequency content of the signal, which is directly related to the cracking identification, was boosted in the case of externally applied voltage. This can be seen from the wavelets analysis of the two signals, which is shown in Figure 3.9 and is studied in detail in following chapters.

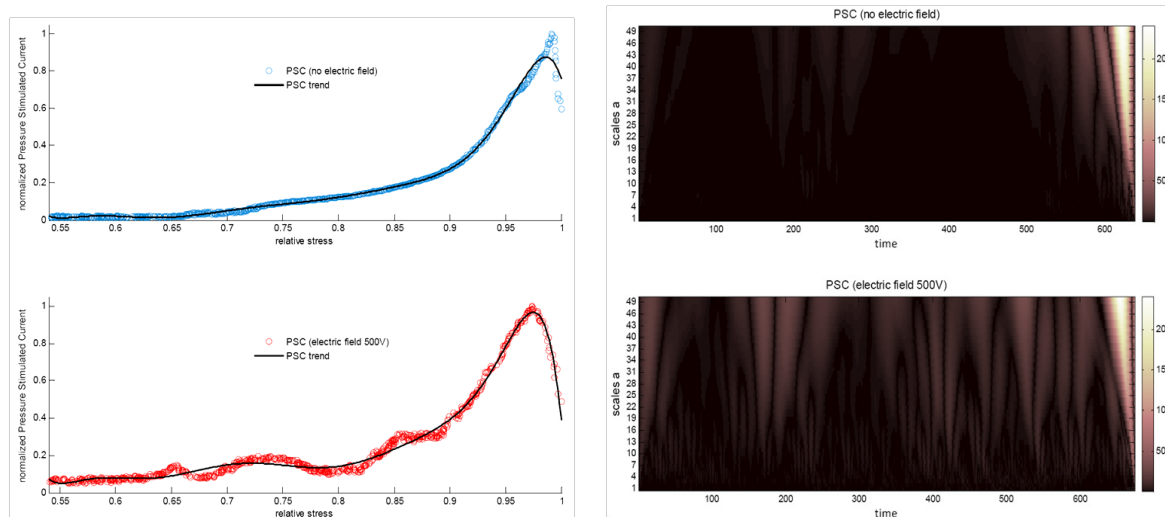


Figure 3.9 PSC signal recordings, macroscopic trends and wavelet scalograms of (a) specimen tested according to conventional PSC technique (b) specimen tested with the amended PSC technique – taken from (Kyriazis, Anastasiadis, Triantis, Stavrakas, Vallianatos, & Stonham, 2009)

To sum up, the amended PSC technique involves an externally applied electric voltage stimulation that boosts the signal at higher levels making it easier to detect without affecting the information related to cracking. Furthermore, microscopic analysis is influenced by this innovative technique, because frequency content of the signal related to cracking is boosted and depicted more clearly even in the linearly increasing loading case (Kyriazis, Anastasiadis, Triantis, Stavrakas, Vallianatos, & Stonham, 2009).

### 3.4.5 The ac conductivity time series technique

The experimental techniques that have been already described belong in the real time category. The technique presented in this section is a non-real time technique that is based on the post-processing of the material sample to decide about its present condition, as well as its former mechanical handling. Based on the idea and results of impedance spectroscopy of solid dielectric materials for identification of their mechanical strength we have focused on the evaluation of the signal at a specific frequency. Therefore, instead of sweeping a frequency range, we have measured and record time series of a specific parameter, namely the ac conductivity.

The setup that was used for our measurements is shown in Figure 3.10. The core of the system is the LCR meter Agilent 4284A that was analysed in previous section. The dielectric test fixture Agilent 16451B is connected to the LCR meter and is used as a sample holder and interface for measurement. For eliminating the effects of temperature changes and electromagnetic noise the measurements were conducted in a shielded box whose internal temperature was monitored and controlled. The LCR meter setup, control and measurements storage was implemented in a PC running a customised VEE interface program. The ac field with 30kHz frequency was selected as more suitable for the recording of time series.

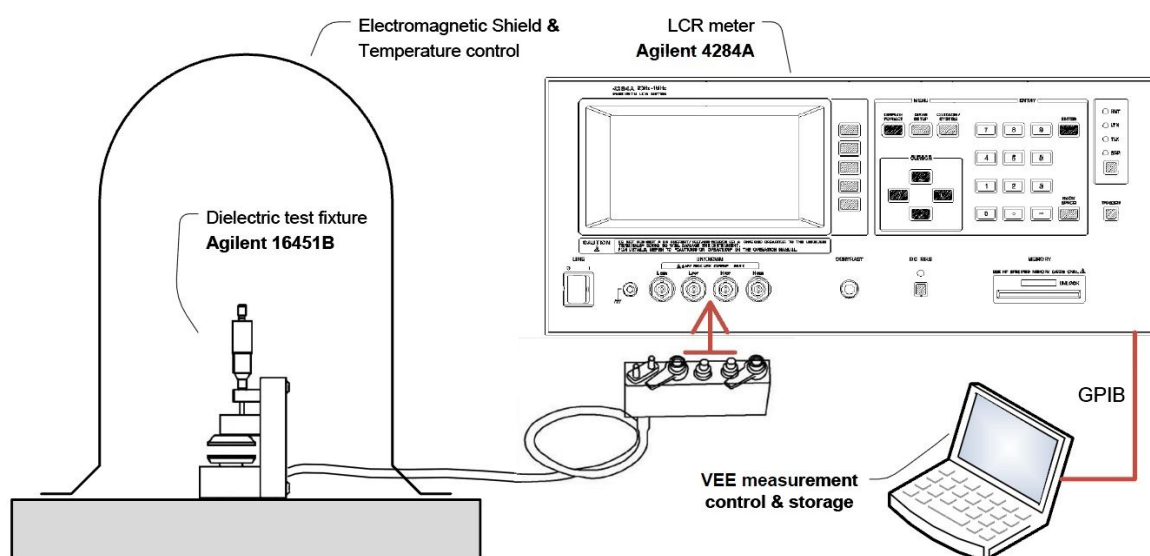


Figure 3.10 Experimental setup for ac conductivity time series measurements

A reference for the evaluation of the results was created by a pristine rock specimen that was initially measured. The material specimens in both cases were sandwiched between the metallic plates of the test fixture, in order to create a capacitor that would have as dielectric the material under test. Specimens that are cracked have definitely different properties with the pristine, so the variation of the capacitor would reveal which sample is cracked and which one is not.

The measuring system is very accurate, thus even slight variations owing to new cracks can be identified through spectral analysis of the recorded ac time series as explained in following chapter. The technique is quite promising, because it simplifies the conventional spectroscopy and may enable cheaper stand-alone applications for material strength monitoring, without using complex LCR analysers.

## Chapter 4

# Macroscopic analysis and modelling



## 4 Macroscopic analysis and modelling

### 4.1 Introduction

The idea to macroscopically analyse the weak electric currents emitted by stressed columns or by bended beams – Pressure and Bending Stimulated Currents accordingly, was originally based on the need for distinguishing between the ambient electric noise spikes and the causal nexus between the applied force and the emitted electric signal by a rock specimen. Macroscopic analysis can serve not only as an initial filtering of the signals, but can also provide important information about the existing situation in a material sample and can be correlated with its former mechanical treatment.

Macroscopic analysis of the electric signals has been examined from different points of view in this work, by focusing each time on a specific characteristic, which is important to evaluate. The relaxation time of the relaxation processes, the current peak value, the electric charge that corresponds to the electric current and the trends of the peaks, as well as the relaxation times of cyclic loading are analysed and commented in the following sections.

### 4.2 Dynamic and cracking generation of electric signal

The application of stress on brittle materials is associated with electric signal that depends on a variety of parameters as,

- the stress level (i.e. corresponding to elastic or inelastic zone of the material)
- the applied stress type (i.e. compressive or tensile)
- the applied loading scheme (i.e. constant, linearly or step increasing, repetitive loading unloading)
- the recent low level (elastic zone) loading history of the material and
- the entire high level (inelastic zone) loading history of the material.

The recorded electric signal during experiments is the result of the combination of the aforementioned parameters, as well as of the properties of the material under examination. In this section we discuss the decomposition of the problem into secondary problems of less complexity. The initial step towards this aim is the ‘isolation’ of two main electrification mechanisms, which involves ambiguity especially for the marginal region between the elastic and inelastic zone of the material behaviour.

#### 4.2.1 The electrification mechanism of dynamic processes

Following the Bieniawski approach about the phases of brittle materials deformation (Bieniawski, 1989), the first two regions of deformation, i.e. the inherent crack closure phase and the linear deformation before the initiation of cracking phase, can be considered as no cracking regions for the material. Therefore electrification mechanisms at these low loading levels can be basically attributed to piezoelectric effects and generally dynamic effects that are not relevant to crack propagation, or new crack formation, because these processes are not dominant at the early stages of deformation. Electric signal generation mechanisms of this type are claimed by (Stavrakas, Anastasiadis, Triantis, & Vallianatos, 2003) for marble, as well as by (Sun M. , Liu, Li, & Hu, 2000) and (Sun M. , Liu, Li, & Wang, 2002) for cement paste and fibre reinforced concrete.

These studies agree on the dynamic features of the observed signal at low levels of loading, although it is interpreted by different models, i.e. the MCD model and the solid – liquid interface double – layer model accordingly. Both models are accurate for specific loading conditions, but cannot model in a unified way the overall attitude of the material in every deformation stage. In this work, we will not seek for an answer to the complex physical mechanisms that generate the electric signal, but for a reasonable interpretation of the main macroscopic processes that can be identified through the experimental data of electric signal in each deformation stage.

First of all, the dynamic nature of electric signal yielding from stressed brittle materials at low loading level is verified through the experimental recordings from marble and cement samples that are subjected to successive low level loading pulses of finite duration. From very low levels of loading, even less than 30% of the compressive strength of the sample, electric signal emission can be detected. At this level of loading it is known from the theory of rock mechanics (Paterson & Wong, 2005) that no new cracks are forming. However, either because of existing cracks closing process, or because of piezoelectric effect, or because of a complex combination of the above-mentioned and other processes, electric signal is recorded. Typical data recordings from cyclic low level loading experiment in marble specimen are presented in Figure 4.1. The evolution of stress and strain over time is depicted in Figure 4.1a and the corresponding PSC signal temporal variation in Figure 4.1b. During each loading cycle the specimen reacts by emitting an electric signal which has a peak value close to the previous and the next cycle peak. This is

an indication of a dynamic process that is new cracking free, taking into account also that stress and strain are linearly related, as demonstrated in Figure 4.1a.

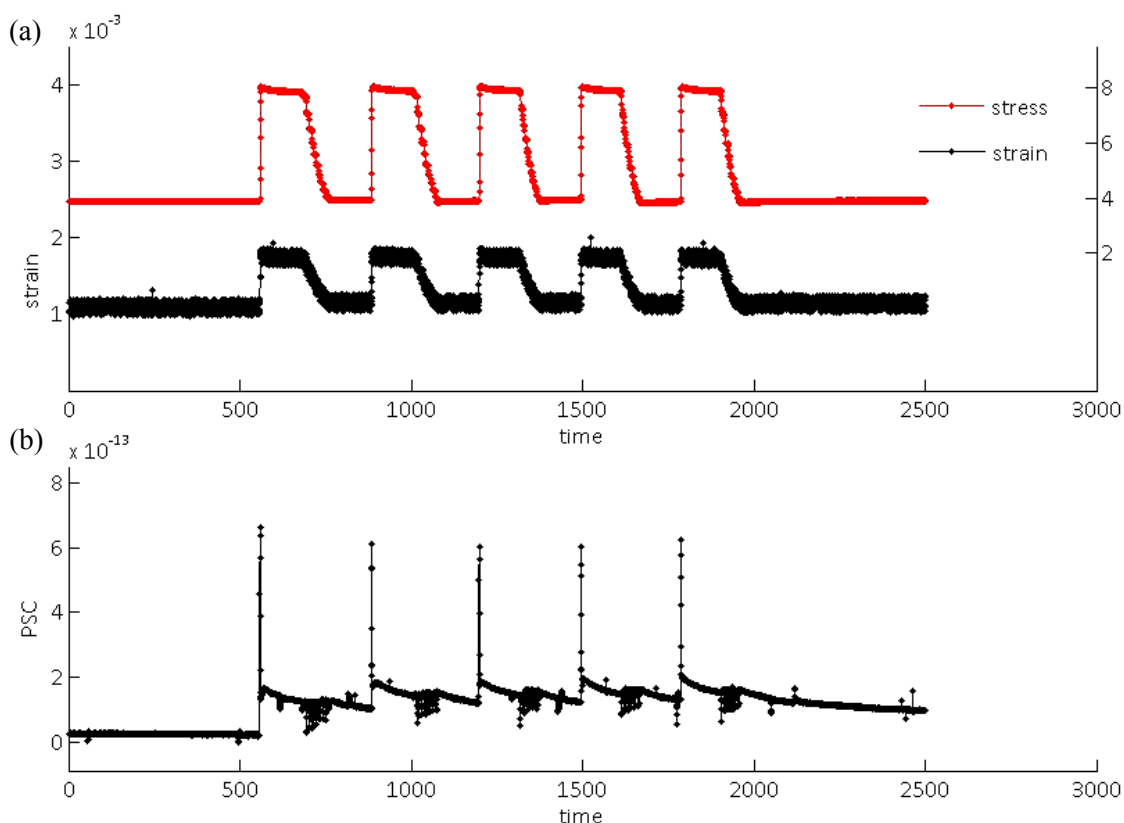


Figure 4.1 (a) Stress and Strain evolution over time in a typical low level loading cyclic compression test and (b) The equivalent emitted PSC signal by the tested marble specimen

Furthermore, if PSC signal emissions were attributed to new cracks, and the signal was proportional to the generation of cracks, then observing PSC signal of the same amplitude in each loading cycle would correspond to new microcracks formation in each cycle. However, this is not possible, because each specimen has an upper limit of micro and macro crack capacity before its final rupture. The PSC signal and thus the charge flowing out of the specimen seem to be infinite and linearly relevant to the evolution of the cause, i.e. the applied stress although cannot be correlated to a finite cracking mechanism that is characterized by non-linear and avalanche evolution. These comments refer only to low level loading with adequate time intervals between successive loading steps and do not interpret phenomena of ageing and damage accumulation due to higher level cyclic loading as well as memory effects, which are discussed in the following sections.

Another key point towards the identification of the dynamic part of the PSC electric signal and its properties can be spotted by focusing on the unloading process of the specimens. It has been observed that electric signal perturbation is not only a loading-driven

phenomenon but can also be related to the unloading process of a specimen. This observation is verified by other researchers (Sun M. , Liu, Li, & Wang, 2002) and (Freund F. , 2002) too. In Figure 4.2 we present a focus on the unloading process of the second

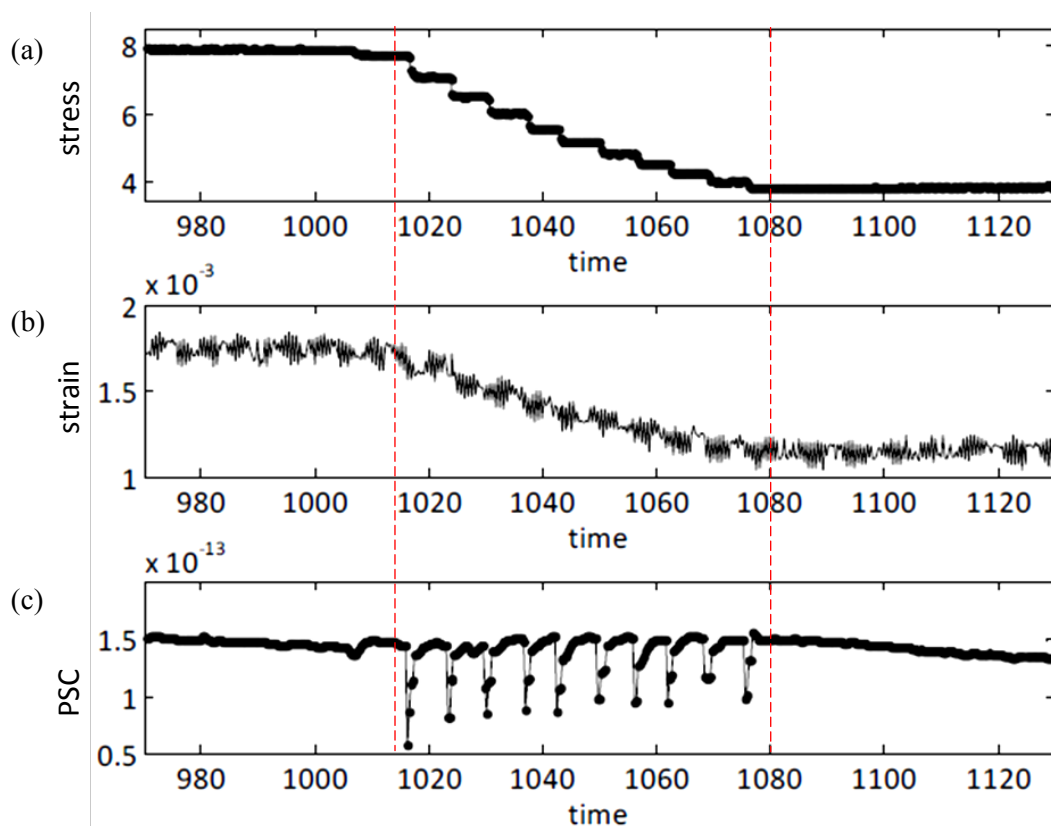


Figure 4.2 The unloading process evolution, focusing on (a) the stress and the corresponding results on (b) strain and (c) PSC signal emission from marble specimen

loading cycle of the experiment presented in Figure 4.1. Unloading of the specimen was conducted in small steps after the relaxation process of the PSC signal was practically ending and the strain was unchanged. The time interval under examination is denoted in Figure 4.2 by two red dotted lines and it consists of 10 small unloading steps that correspond to 10 PSC peaks. It can be seen that each of the unloading steps, with amplitude 1/10 of the loading step amplitude, results in a PSC signal peak, whose amplitude is 1/10 of the corresponding PSC peak of the loading step. This observation of the proportionality between the strain variation and the PSC signal emission is in accordance with the MCD model (Vallianatos & Tzani, 1998), even if the physical mechanism of electric current generation because of deformation is different from the one proposed by the model. The bottom line of the dynamic nature of PSC signal at this stage of deformation is the unloading-driven perturbation of PSC, which cannot be correlated in any circumstances with new microcrack creation.

The effort to identify the dynamic properties of the PSC signal at this stage, while still evolves linearly to the applied stress either increasing or decreasing can serve as a basis to quantify the dynamic part of the total PSC signal yielding from a multi-range and multi-mode stress application.

#### 4.2.2 The electrification mechanism of cracking processes

The electrification mechanism of the evolving cracking process seems to have similar macroscopic features with the electrification mechanism of the dynamic loading process that was described in previous section. This similarity makes the processing of the signal more demanding. Thus, the filtering-out of the signal corresponding to dynamic processes from the total PSC signal, which yields from a complex loading process, allows the cracking related signal to emerge. The advanced mathematical tools, which are needed for the signal processing, are discussed in a following chapter.

However, in this section we try to focus on the cracking related PSC signal by leading the material samples into the inelastic region and by experimentally reducing the dynamic processes that are activated when pristine specimens are subjected to compressive stress up to rupture. The elimination of the dynamic process would lead to the emergence of the cracking related signal. This is partially possible by imposing the samples into compressive loading using a loading scheme similar to typical strength tests.

In a linearly increasing stress controlled test, there is neither PSC signal related to unloading nor PSC signal relaxation processes that are observed when the stress remains unchanged after a loading or an unloading abrupt step. Therefore, by avoiding complex mechanical stimulations and by using a linearly increasing stress at a constant rate, we can get from a pristine sample the ‘minimum’ possible PSC signal. This signal is only related to fracture mechanisms.

In Figure 4.3a we present the evolution of the strain over time for a cement specimen that is subjected to linearly increasing stress of constant rate, which equals to 0.1 MPa/sec. The corresponding PSC signal is shown in Figure 4.3b. The strain increases linearly to stress and the PSC signal is at a background level, during the first two phases of deformation, i.e. before the initiation of cracks denoted by a red dotted line in Figure 4.3. We have plotted the recorded signal in a semi-log y-axis, to show the slightly increasing trend of the signal even at the first stages of deformation. The signal on the left side of the red dotted line may be considered as the part of the total recorded PSC signal, which is generated by dynamic process electrification mechanism. On the right part of the red dotted line, despite the

linear relation between the strain and the time and therefore between the strain and the stress, the PSC signal starts increasing at a higher rate, showing that the material deformation phase has changed. This change of deformation stage is presumable from the classic rock mechanics theory (Bieniawski, 1989), when the 65% to 70% of the maximum strength of the material is exceeded.

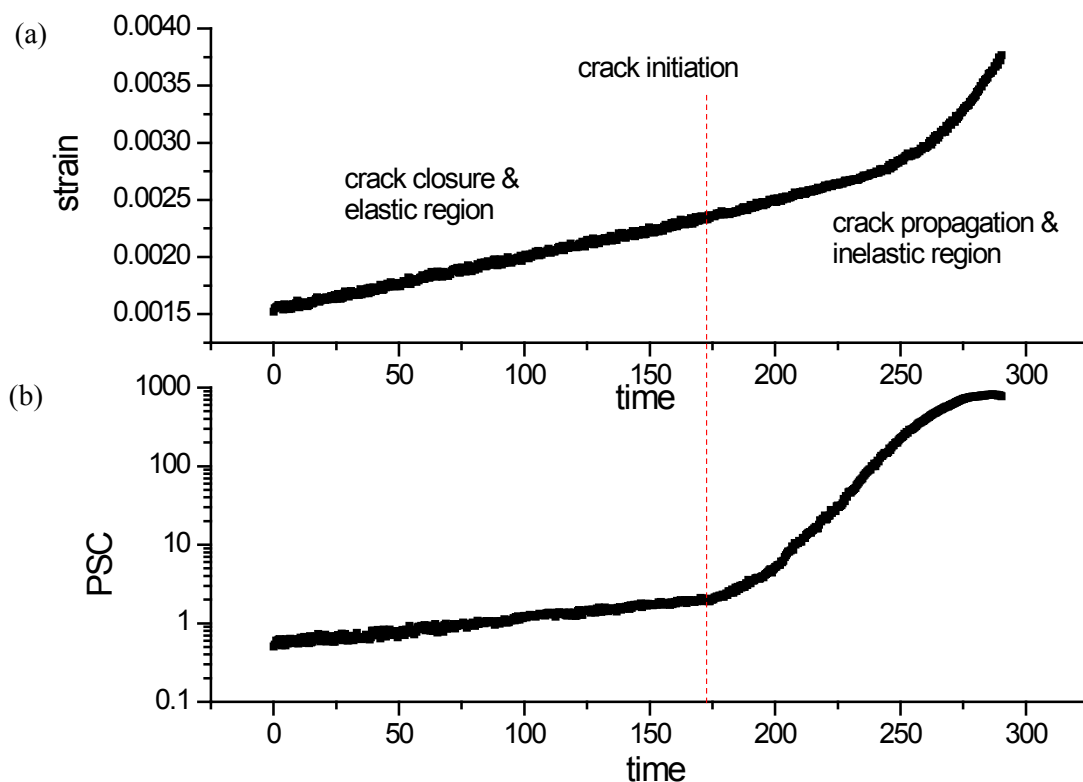


Figure 4.3 (a) The evolution of strain over time and (b) the corresponding PSC signal in a typical stress controlled strength test of cement material sample.

This early precursor of cracking is very useful, as it allows the identification of a certain moment that although the material seems to be in elastic region, because of the linearity of stress-strain curve, it has entered in the inelastic region and initiation and propagation cracking processes have started. This is the most evident manifestation of the existence of a cracking based mechanism of electrification, which seems to be activated simultaneously with the initiation of cracking.

It has been observed that cracking electrification mechanism results in much higher values of PSC signal compared to the dynamic process electrification mechanism. In the presented example the PSC signal becomes 100 times higher than the initial plateau, even before the material is lead to non-linear region of the stress-strain curve. However due to the size effect which results in higher values of PSC signal according to the size of the specimen the values of PSC itself cannot lead to conclusions and has to be examined relatively to previous PSC signal values.

The same experiment was also conducted in marble specimens and a typical stress – strain curves of each material, i.e. cement and marble, is given in Figure 4.4a and b accordingly. It can be seen that despite the different absolute values of both stress and strain, the stress-strain curves of the materials follow the same trends. Generally, marble samples exhibit higher strength and slightly extended linear stress-strain behaviour compared to cement, however both materials are characterised by their brittle fracture behaviour and properties.

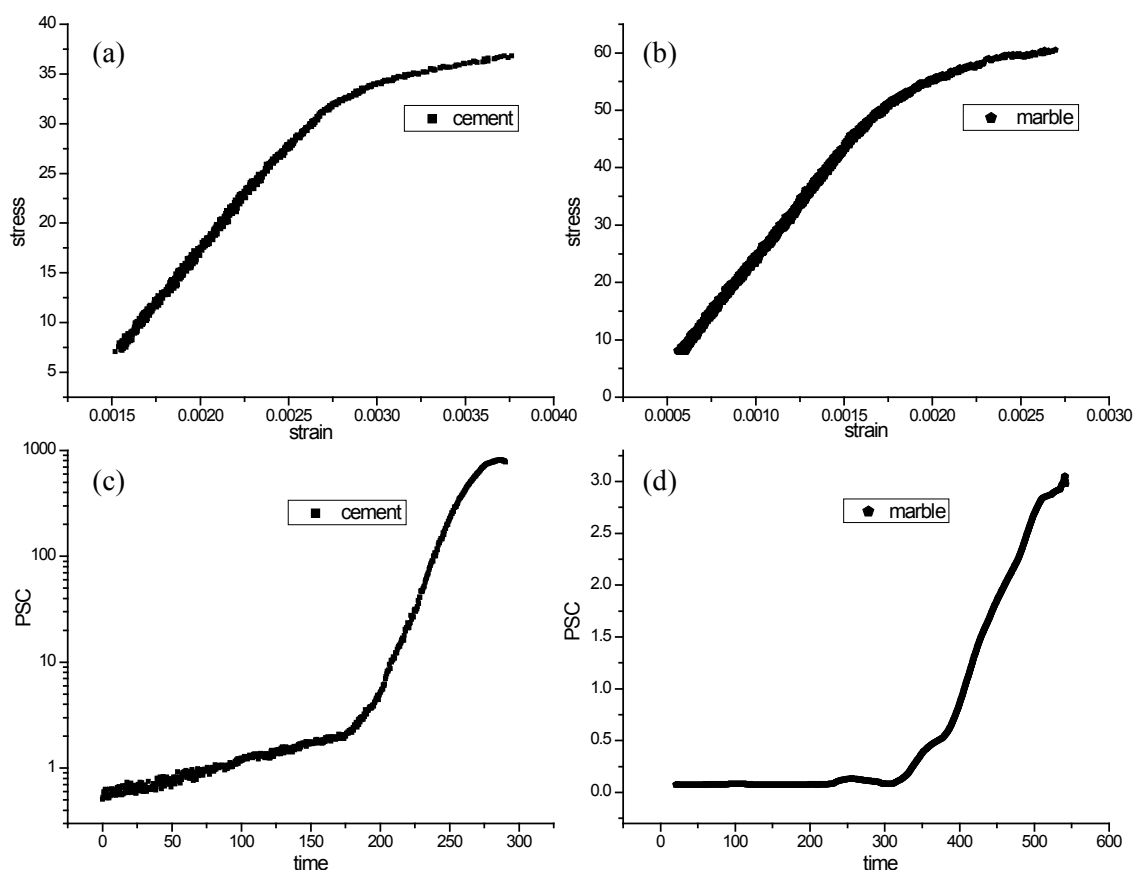


Figure 4.4 (a) Typical stress – strain curve of cement and (b) of marble specimens, (c) PSC signal evolution over time for cement and (d) for marble specimen

The PSC signal yielding as a result of the compressive loading of cement and marble specimens is shown in Figure 4.4c and d accordingly. The electrification mechanisms in cement yield higher PSC signal values compared to the PSC signal values of marble. Especially, the cracking electrification mechanism produces 1000 times higher signal compared to the background level right before the rupture of the specimen, while the same mechanism in marble produces only 3 times higher PSC signal. Despite the evident quantitative difference, which is basically attributed to the boosted electrification mechanisms because of the presence of water in the cement specimens, qualitative evaluation shows macroscopic similarities. As far as the trends of electrification

mechanisms are concerned, the two materials have shown comparable attitude in the change of the slope of the PSC signal graphs, which occurs when the stress exhibits 70% of the maximum strength in both cases. Furthermore, a change in the slope of the PSC signal seems to be common for the last phase of the experiment that the specimens are very close to rupture and the system is unstable i.e. avalanche propagation of cracks. At this point the PSC increases at a lower rate, although strain increases at a higher rate, which is an observation in contrast to the predicted behaviour by the MCD model. We have also to note that experiments have been conducted at the same stress rate, as it seems to be a parameter that influences the PSC resulting signal.

Based on the macroscopic resemblance of the PSC signals from the two materials, we can conclude that the mechanism of electrification due to cracking is common for brittle materials and follows trends irrelevant to the type of the specimen. This is a key point for the creation of a general filter to distinguish between dynamic and cracking electrification mechanism yielding PSC signal.

### **4.3 Analysis of Pressure Stimulated Current**

This section is dedicated to the analysis of Pressure Stimulated Current (PSC) signal which is recorded from marble, amphibolite and cement specimens using the PSC technique (Anastasiadis, Triantis, Stavrakas, & Vallianatos, 2004) which is thoroughly described in chapter 3. The PSC signals will be macroscopically analysed by fitting and by evaluation of their peak values and their relaxation times evolution.

#### **4.3.1 The relaxation time of PSC signal**

The relaxation process of the PSC signal seems to contain important information about the remaining strength of the specimen, as well as about its previous mechanical handling. In order to reveal such information, we have conducted experiments in marble and amphibolite rock specimens, so as to study the impact of repeated axial stress steps of the same level on the emitted PSC signal relaxation (Kyriazis, Anastasiadis, Triantis, & Vallianatos, 2006) and (Triantis, Anastasiadis, Vallianatos, Kyriazis, & Nover, 2007). Alongside with each abrupt stress step, a PSC signal peak was observed followed by relaxation to the background signal level. A stress step evolution over time in normalised y-axis is depicted in Figure 4.5a and the corresponding PSC signal, also normalized, which is the result of the mechanical stimulation, is presented in Figure 4.5b.



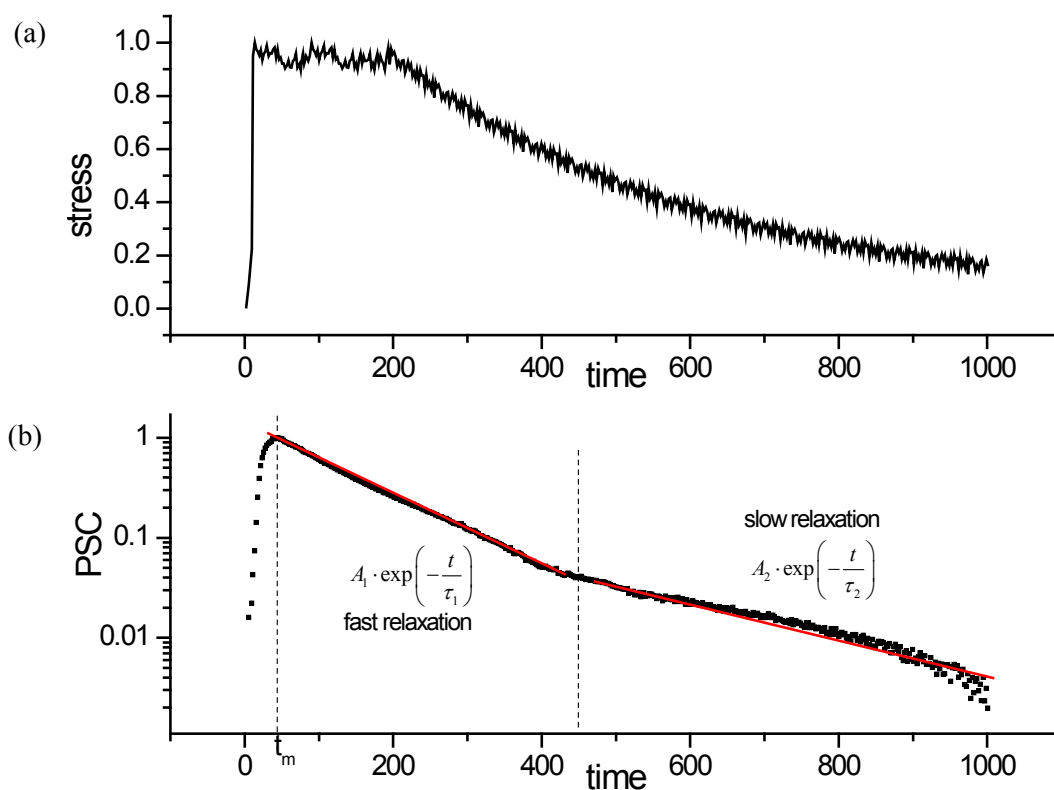


Figure 4.5 (a) The step-wise applied axial stress (normalised), (b) the corresponding PSC signal (normalised) and the identification of the two relaxation processes (fast and slow)

The main macroscopic characteristic of the relaxation process of the PSC signal, after the observed PSC peak, is the relaxation evolution over time. In a series of experiments on rock samples, i.e. marble and amphibolite, the relaxation process seems to be characterised by the same trends, regardless of the PSC peak value and the previous handling of the material. The PSC relaxation process follows the typical evolution shown in Figure 4.5b, where we have denoted the time of the observation of the maximum PSC signal, which can be considered as the process initiation. The other vertical dotted line in Figure 4.5b defines the marginal moment between two different relaxation processes. The separation of the relaxation into two stages, i.e. fast relaxation process and slow relaxation process, can be mathematically described by equation (4.3.1)

$$I(t) = \begin{cases} A_1 \cdot \exp\left(-\frac{t}{\tau_1}\right) & \text{for } t > t_m \\ A_2 \cdot \exp\left(-\frac{t}{\tau_2}\right) & \text{for } t \gg t_m \end{cases} \quad (4.3.1)$$

where  $\tau_1$  and  $\tau_2$  are the relaxation time factors,  $A_1$  and  $A_2$  are numerical factors for the two processes and  $t_m$  the moment that the PSC signal becomes maximum. This equation seems to be able to model the temporal properties of the relaxation process and the corresponding relaxation mechanisms – fast and slow.

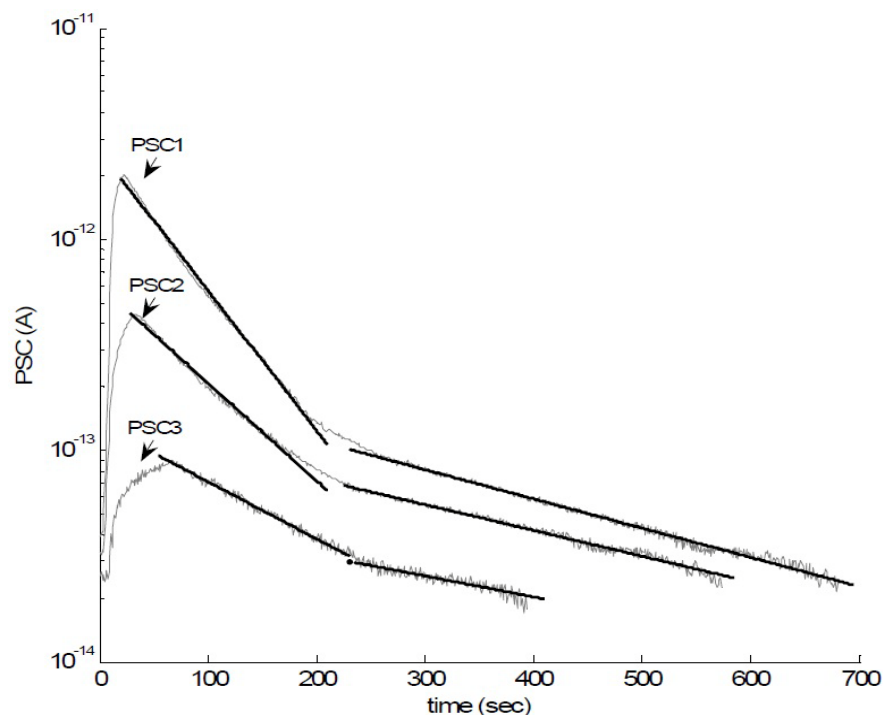


Figure 4.6 Pressure Stimulated Currents that are emitted by marble sample in three successive loading cycles, fitted according to equation (4.3.1) [from Kyriazis et al., 2006]

The information of the evolution of relaxation processes over cyclic loading has been examined for marble samples that were subjected to abrupt stress steps. The emitted PSC signals in a typical experiment are presented in Figure 4.6. The PSC signals are aligned in a common time axis, getting as starting point of time for each signal the moment of stress application in each loading cycle. The fitting results of the two relaxation mechanisms using equation (4.3.1) are presented by black solid lines (exponential law in log y-axis) in Figure 4.6. The resulting parameters are given concisely in Table 4.1.

Table 4.1 The parameters that arise from fitting of the PSC signals in every loading cycle according to equation (4.3.1) and the correlation coefficient showing the fitting accuracy [from Kyriazis et al., 2006]

	$A_1 (\times 10^{-13})$	$\tau_1$	$A_2 (\times 10^{-14})$	$\tau_2$	adj. R-square
<b>1<sup>st</sup> loading cycle</b>	26.34	65.57	21.11	313.77	0.99
<b>2<sup>nd</sup> loading cycle</b>	6.08	93.81	12.88	355.75	0.98
<b>3<sup>rd</sup> loading cycle</b>	1.33	160.41	5.05	438.02	0.92

A similar set of experimental tests of repetitive loading steps was conducted in amphibolite specimens, in order to examine the PSC signal relaxation behaviour of the material and its

relation to the observations for marble. Despite the fact that the relaxation parameters and factors differ between the two materials, the trend of the evolution of the relaxation factors over loading steps is common.

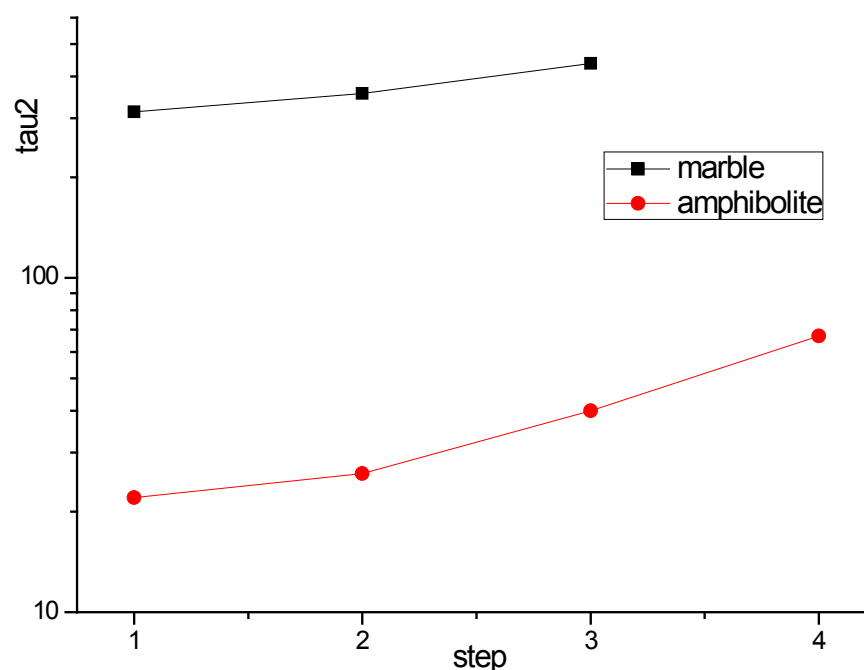


Figure 4.7 The relaxation time factor  $\tau_2$  for marble and amphibolite over three and four successive loading cycles respectively.

The relaxation times of the slow relaxation processes have been plotted in Figure 4.7 for marble and amphibolite. We note that stress steps are abrupt in both cases and the levels of loading are comparable. Marble relaxation factors are higher than the factors for amphibolite, but they both follow an increasing trend. This increase in relaxation time factors, quantifies the general tendency of rock materials to react slower to stimuli in each loading cycle of typical fatigue tests. This inertial attitude shown by the increase of latency of PSC signal relaxation to background signal level, after the stress has been decreased, may be attributed to the accumulation of damage in the specimen (Anastasiadis, Triantis, & Hogarth, 2007) as well as to the memory effects observed in cyclic loading (Lavrov, 2005). Another explanation of the perturbation characterised slow relaxation process is the continuing material strain, even at a very low rate, although stress is unchanged (Triantis, Anastasiadis, Vallianatos, Kyriazis, & Nover, 2007). The low level stress of the cyclic loading is not zero, thus new microcracks go on appearing and produce micro-currents. Thus, a direct relaxation to noise level is not possible, because of the microcurrents that conserve the PSC signal at relatively high values.

### 4.3.2 The PSC signal peaks evolution and modelling

The typical PSC signal evolution over time, because of stress stimuli, excepting the case of linear stress increase up to failure, is depicted in Figure 4.5b. The PSC signal follows the pattern of a peak value followed by relaxation to the initial PSC signal level. In this section, following the analysis of the time relaxation factors, we will examine the PSC peak values evolution over successive loading, and the main parameters that affect the material response to stress. We have conducted four experiments in marble, amphibolite and cement specimens, which are characterised by common brittle fracture properties. Although different materials exhibit different values of PSC signal, the observed trends were the same regardless of the material. We have distinguished four different experimental scenarios to demonstrate the influence of the parameter of stress level, stress and strain rates and time interval between successive mechanical stimuli.

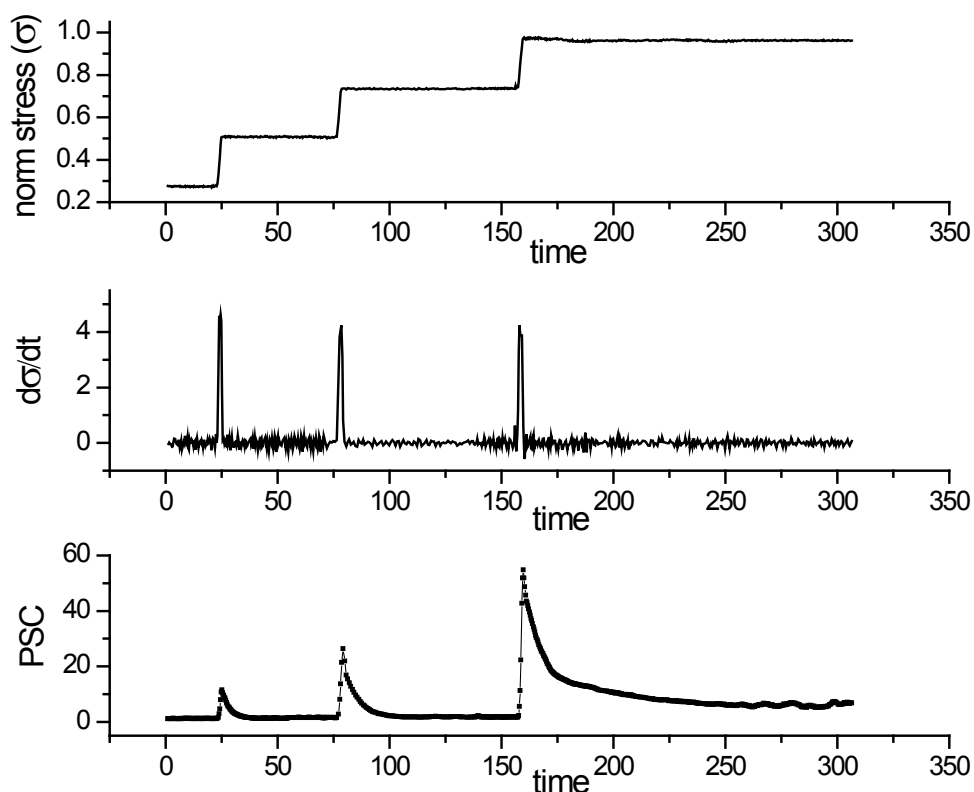


Figure 4.8 (a) The applied stress steps (normalised) to cement paste specimen, (b) the calculated first derivative of the applied stress – stress rate and (c) the corresponding PSC signal recordings for the three steps.

Initially we present data recordings from cement specimen subjected to increasing step-wise stress, which is shown in Figure 4.8a. The stress increases at equal level steps, immediately after the relaxation of PSC signal to background level. The calculated stress rate, which is depicted in Figure 4.8b, is approximately zero in the time intervals between steps and it is of comparable value for the three steps. The PSC signal, which is presented

in Figure 4.8c, consists of three parts. Each of the parts is characterised by a PSC peak value at the moments that the stress rate increases, but these peaks are not proportional to the stress rate. For the experimental process, we note that the first step is within the linear region but the second step reaching stress level is marginally beyond the linear region of the material (i.e. 70%) and thus stress and strain are approximately linearly related. The parameter that affects the PSC peak values seems to be the strain rate. The increase of stress level, results in the increase of PSC peaks, although the stress rates are similar during steps. The PSC signal seems to be very prone to the strain rate changes. PSC signal emission, in other words, appears to be relevant to the reached stress level, having assumed that PSC signal has already relaxed to background.

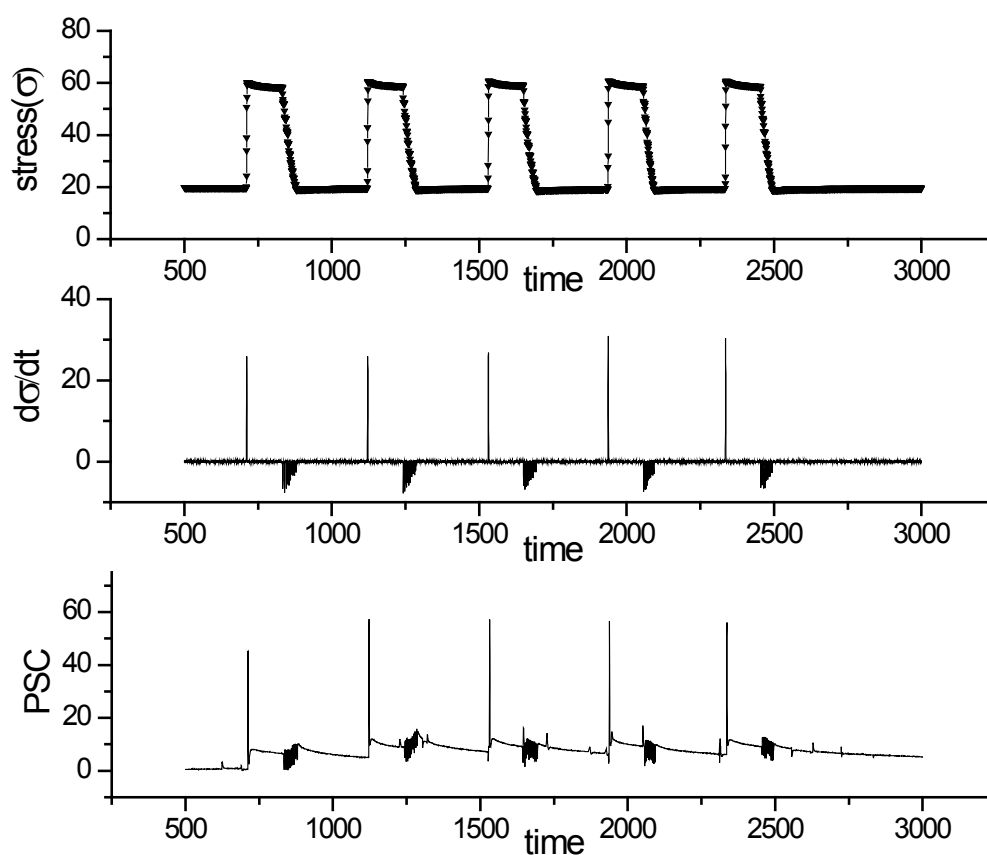


Figure 4.9 (a) Stress steps applied on marble specimen, (b) the calculated stress rate of each loading cycle and (c) the corresponding PSC signal peaks and relaxation.

The second set of data recordings refers to successive loading pulses applied on marble specimen. The loading scheme is presented in Figure 4.9a. The time between successive loadings has been selected so as for the PSC signal to have relaxed to the background level and for the memory effects to have been practically minimised before the beginning of a new loading cycle. The stress steps are of equal level and time duration. Stress rates for loading and unloading are similar for all steps. Especially for unloading, a slow step-wise

scheme was adopted, in order to minimise the dynamic mechanisms that are activated during the unloading process. Such mechanisms have been reported by other researchers (Freund F. , 2002) and (Sun M. , Liu, Li, & Wang, 2002) and have been analysed in the previous section. This scheme was selected in order to keep the stress rate close to that of the experiment presented in Figure 4.8b and to make comparable the resulting PSC signals from the two experiments. By differentiating the stress data we get the stress rate which is graphically presented in Figure 4.9b. Stress rate is practically zero for the whole experiment except from the time of the increasing of loading in each step. Note that the high level stress is not totally steady and there is a minor decrease which is attributed to loading machine inability to lock at high stress values. The PSC signal peaks are almost identical in each loading cycle. Slight changes in their values do not follow a trend and can be explained by the insignificant changes in stress level and stress rate from step to step. The material is stressed in the linear region before the cracking initiation in this experiment, so the mechanism of the PSC signal is the same in every loading step and thus keeps the PSC unaffected. In terms of signal processing the ‘system’ can be considered as time invariant so the input and output are linearly related.

The first two cases under examination can be explained according to the MCD model (Vallianatos, Triantis, Tzani, Anastasiadis, & Stavrakas, 2004), as the observed PSC peaks seem to be proportional to the strain rate. This can be partially verified by experimental data presented in Figure 4.8 and is fully verified by experimental data in Figure 4.9. In the first case the PSC signal is relevant to the strain rate which slightly differs from stress rate, while in the second case the PSC signal peak evolution is relevant to the stress rate which is proportional to the strain rate. The difference between the two cases is reasonable, if we take into account that the generation mechanism of the electrification changes in the first case as the material is stressed to a higher stress level, while it remains unchanged in the second case. However, not every cyclic loading scheme application on brittle materials results in the same PSC peak evolution. In order to demonstrate a different reaction to repetitive mechanical stimulation we have conducted experiments on marble and amphibolite rock specimens.

The third and fourth data sets are recordings from marble and amphibolite specimens accordingly. The specimens were subjected to cyclic loading i.e. consecutive loading steps of the same level and duration. These two experiments are characterised by a common trend of the PSC signal peaks evolution over loading cycles. More specifically the PSC

peaks decrease from step to step in both cases, which is in contrast to the trends of PSC peaks that were observed in the two previous cases.

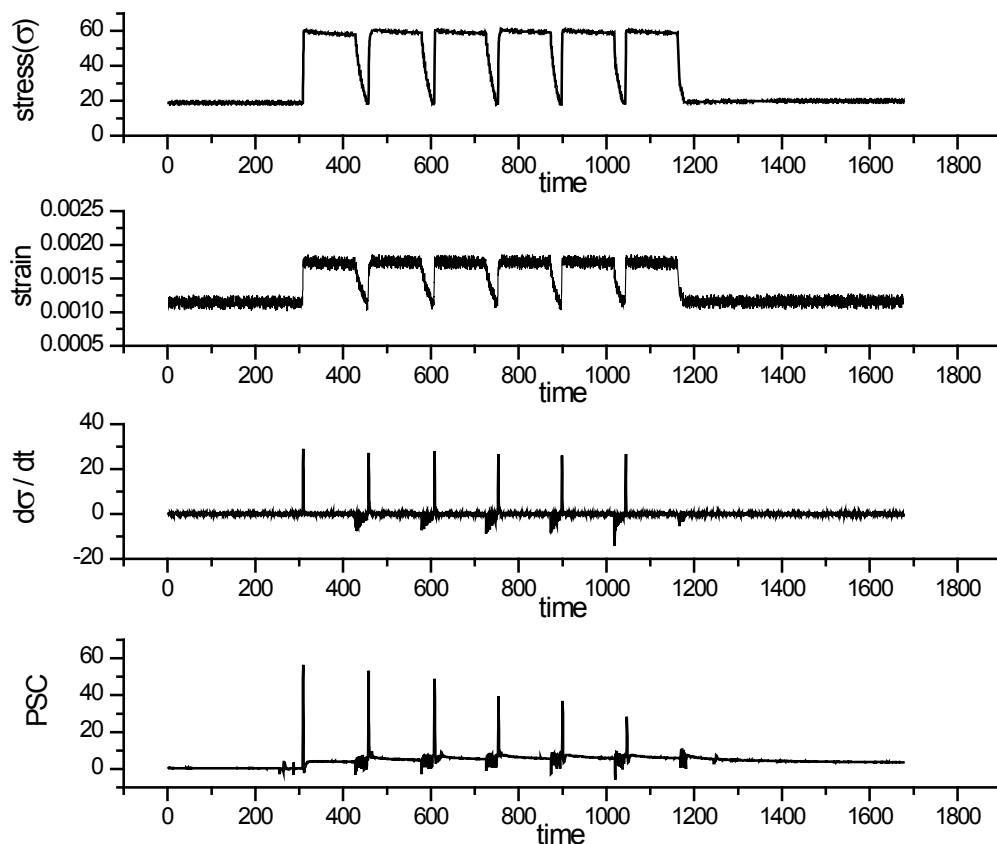


Figure 4.10 (a) Stress steps applied on marble specimen, (b) the strain recorded by strain gages, (c) the stress rate evolution over time and (d) the corresponding PSC signal peaks and relaxation.

The third data set was recorded from a marble specimen subjected to the stress scheme shown in Figure 4.10a which results in the strain shown in Figure 4.10b, which was recorded by the strain gage attached on the electrode-free surface of the specimen. It is obvious that stress and strain evolve similarly and that's an indication that the material is stressed in the linear region. Stress rate is presented in Figure 4.10c and it is similar to the stress rate in the previous experiments. However, the corresponding PSC signal, which is shown in Figure 4.10d, exhibits decreasing peak magnitude as the experiment evolves. Note that compared to the previous case the stress level and the high stress time interval per cycle, as well as the corresponding strain are similar, but the interval of relaxation between successive loading cycles has been reduced. Therefore, the time interval between successive mechanical stimuli of the same level and form seems to play the key role in the evolution of peaks over loading cycles in this experiment and will be discussed in a following section based on memory effect phenomena. To clarify the parameter that affects signal, we underline that the material is in the linear region and no cracking phenomena are

involved. Furthermore, the minimum stress level that was applied during the mechanical relaxation of the specimen is greater than the level of crack closing stress and thus such transient phenomena have been intentionally diminished. The MCD model can accurately predict the occurrence of PSC peak in this experiment but there is an amplitude variation between the recorded PSC peaks and the predicted by model peaks.

The fourth data set is recorded from a rock amphibolite specimen that is subjected to four consecutive identical stress steps shown in Figure 4.11a. Both the low and the high level of loading are quite high and the material has been stressed beyond the crack initiation point at relatively high values of stress. By differentiation of the applied stress we get the stress rate which is presented in Figure 4.11b and which is of a similar form to those of previous experiments shown in Figure 4.10c, Figure 4.9b and Figure 4.8b. However in this case the corresponding PSC signal peak evolution is neither increasing nor steady, not even slightly decreasing. The PSC peaks severely decrease from step to step. This observation supports the claim that either yielding from dynamic or from cracking or from a combination of the two mechanisms, the pattern of the PSC signal related to a mechanical stimulation is the same i.e. a PSC peak followed by relaxation process signal.

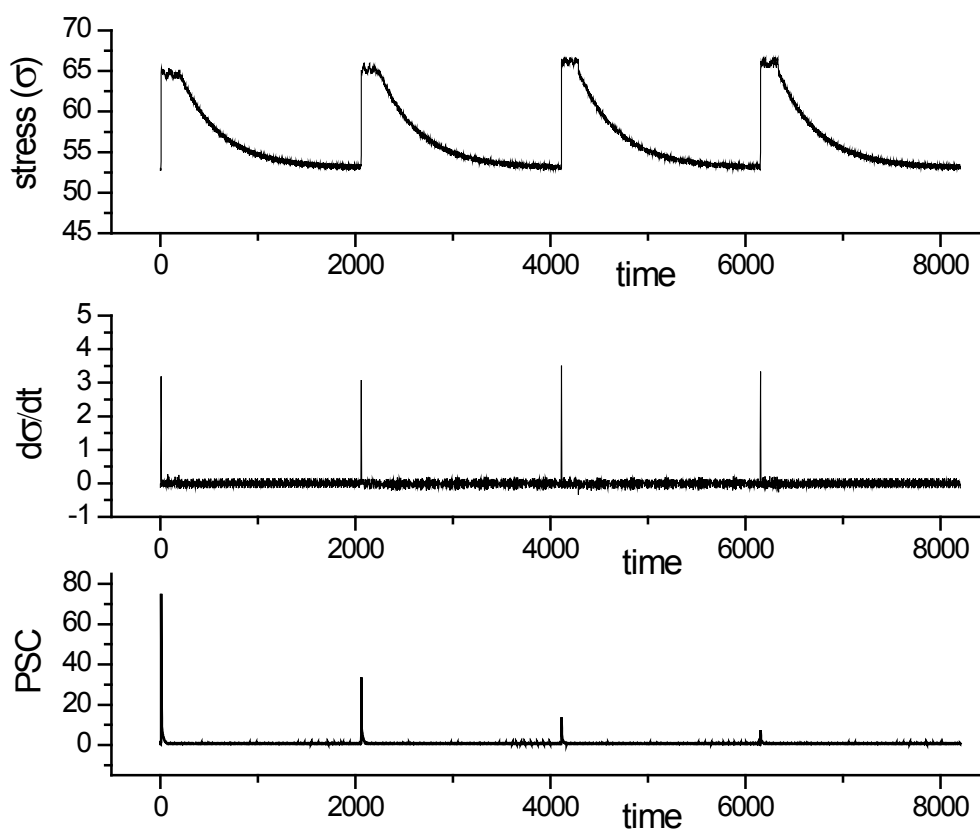


Figure 4.11 (a) Stress steps applied on amphibolite rock specimen, (b) the stress rate evolution over time and (c) the corresponding PSC signal peaks and relaxation.



As the specimen is stressed beyond the crack initiation point, there is a part of the signal in each loading that corresponds to cracking mechanisms. This signal is emitted once by a specimen, as it is related to its cracking ‘capacity’ which is finite. Therefore considering the signal as a combination of dynamic and cracking phenomena and assuming the decrease of cracking capacity at each stage of the experiment, the decreasing evolution of peaks over loading cycles seems reasonable. Note that for the decrease of stress level a slow exponential scheme was selected to minimise transient phenomena and an adequate time interval between successive loadings was selected to minimise the memory phenomena related to dynamic electrification mechanisms.

In this section the PSC peaks evolution over loading cycles, by applying various loading schemes but similar stress rate schemes was studied. The peaks followed all possible evolution trends (i.e increasing, steady and decreasing). Proportionality between the PSC and strain rate, which is described by the MCD model seems to be maintained in broad terms for loading levels from 0.2 to 0.9 of the total specimen strength, although the stress level range is not characterised only by cracking based electrification mechanisms, which are proposed by the model as the physical mechanisms of electrification. The broad observation and common point of the experiments is that the PSC peaks occurrence coincides with the strain variation, regardless of the brittle material under examination, the stress level, the stress rate and the time interval between similar or not mechanical stimuli.

#### **4.3.3 The PSC signal mathematically modelled as a microcurrent distribution**

The PSC signal was macroscopically analysed in the previous section, by focusing on specific signal properties, as the relaxation time and delay of PSC peak occurrence, the PSC peak signal level and the evolution of the peaks in cyclic loading. Each of these parameters was extracted from the signal by analysing a specific part of it. In this section we propose a different approach in the problem by considering the recorded signal as a microcurrent superposition over the cross sectional plane of measuring electrodes. The micro PSC signals superposition forms the total observed PSC signal distribution over time, which is quite asymmetric. We address the problem of fitting such PSC graphs by using Extreme Value distributions, which can produce a pronounced asymmetry by nested exponentials (Brown, 1991) and a single peak oriented fitting result based on the peak value of the PSC signal.

Extreme value theory was introduced theoretically in 1920s and mid 30s, while in late 30s and mid 40s a great number of practical applications were proposed by Gumbel, the most

outstanding of which are presented in (Gumbel, 1958). A complete literature review on this topic is given by (Kotz & Nadarajah, 2000) and the latest applications are presented in the book by (Castillo, Hadi, Balakrishnan, & Sarabia, 2005). In this section we just refer to the basic equations that were used for this application.

Extreme Value Theory comprises three types of Extreme Value distributions known as

- The Gumbel type or Type 1 distribution
- The Frechet type or Type 2 distribution and
- The Weibull type or Type 3 distribution,

which are characterised by the tails of the distributions which are exponential, polynomial and finite accordingly for the three types. The three types can be expressed by a single equation of the distribution known as the Generalised Extreme Value Distribution (GEV), which is given below,

$$P_r[X \leq x] = \left[ 1 + \xi \left( \frac{x - \mu}{\sigma} \right) \right]^{-1/\xi}, \quad 1 + \xi \left( \frac{x - \mu}{\sigma} \right) > 0, \quad -\infty < \xi < +\infty, \quad \sigma > 0 \quad (4.3.2)$$

where  $\mu$  is the location parameter,  $\sigma$  the scale parameter and  $\xi$  is the shape parameter.

In this work the Gumbel type distribution, which is given from equation (4.3.2) for  $\xi \rightarrow +\infty$  or  $\xi \rightarrow -\infty$ , will be used. The Gumbel (Type 1) distribution mathematical description is shown in equation (4.3.3)

$$P_r[X \leq x] = \exp\left(-e^{(x-\mu)/\sigma}\right) \quad (4.3.3)$$

The Probability Density Function of the Gumbel Extreme Value distribution (Kotz & Nadarajah, 2000) is given by equation (4.3.4)

$$p_X(x) = \sigma^{-1} e^{-(x-\mu)/\sigma} \exp\left(-e^{-(x-\mu)/\sigma}\right) \quad (4.3.4)$$

Equation (4.3.4) can be written with a simple modification, as presented in equation below

$$p_X(x) = (\sigma \cdot e)^{-1} \cdot \exp\left(-e^{-(x-\mu)/\sigma} - (x - \mu)/\sigma + 1\right) \quad (4.3.5)$$

Based on the PDF of GEV type I given in equation (4.3.5) we can form the equation for the fitting of a single peak of the PSC signal. We assume that the location parameter  $\mu$  is the time of the PSC maximum peak occurrence and we substitute the scale parameter  $\sigma$  by a scale parameter of time, which represents the width of the signal, i.e. the duration of relaxation process. By substitution on equation (4.3.5) according to the aforementioned assumptions, we get the equation (4.3.6) for fitting PSC single peak signals

$$i_{PSC}(x) = i_0 + i_{PSCmax} \cdot \exp(-e^{-x} - x + 1) \quad (4.3.6)$$

where

$$x = \frac{t - t_{PSCmax}}{t_{scale}} \quad (4.3.7)$$

$i_0$  is the PSC signal background level at the moment of mechanical stimulation

$i_{PSCmax}$  is the peak value of PSC signal

$t_{PSCmax}$  is time of PSC peak value occurrence

and  $t_{scale}$  is a parameter corresponding to the duration of PSC signal perturbation

Table 4.2 The parameters that arise from fitting of the PSC signals in every loading cycle according to equation (4.3.6) and the correlation coefficient showing the fitting accuracy

	$i_0$	$t_{PSCmax}$	$i_{PSCmax}$	$t_{scale}$	adj. R-square
<b>1<sup>st</sup> loading cycle</b>	-0.33	557.3	22.16	77.3	0.983
<b>2<sup>nd</sup> loading cycle</b>	0.27	1227.6	6.90	56.3	0.977
<b>3<sup>rd</sup> loading cycle</b>	0.16	1848.6	2.17	56.2	0.980
<b>4<sup>th</sup> loading cycle</b>	0.11	2348.2	0.66	49.5	0.971

For demonstration of the fitting performance of Extreme Value distribution, we have fitted a typical set of four consecutive PSC signal peaks, which were produced by four successive mechanical loadings of the same level. The compressive fatigue test was conducted on a marble specimen by using the typical PSC experimental technique and the typical PSC peak followed by relaxation to background signal level was observed. The PSC signal recordings are shown by grey data points in separate graphs in Figure 4.12. The fitting results for the PSC signal peaks are shown by black solid line also in the same figure for the visual evaluation of the fitting to be possible. The values of the parameters which were calculated by the fitting process are given in Table 4.2. The fitting performance can be evaluated by the correlation coefficient which is over 0.97 for all fitted signals and verifies the goodness of fitting results.

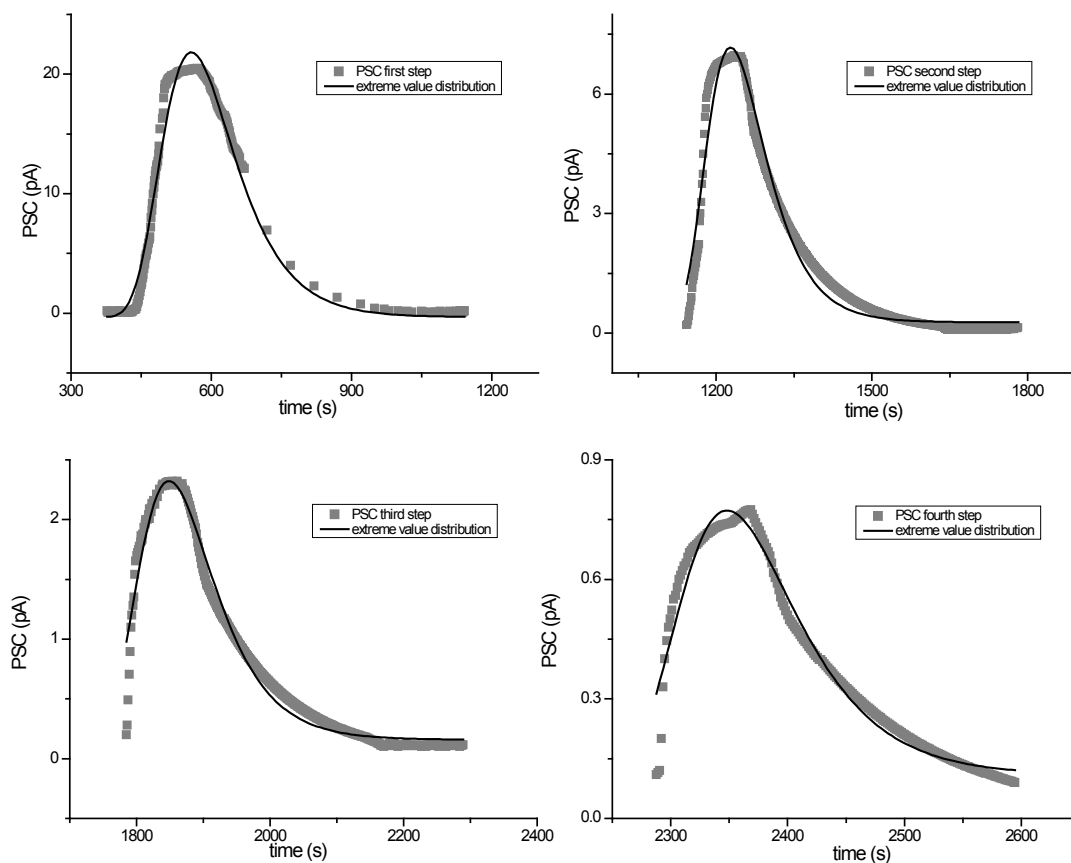


Figure 4.12 Pressure Stimulated Current recordings from four repetitive loading steps of the same level and their fitting with Probability Density Function of the Extreme Value distribution

Concluding we have to point out the following as far as the Extreme Value distribution fitting of PSC signal is concerned.

- The Generalised Extreme Value distribution was selected for the modelling of the PSC peak signal, as the most suitable to model the largest value of a set of measurements (Castillo, Hadi, Balakrishnan, & Sarabia, 2005).
- The GEV distribution of type 1, known as Gumbel type, was used because it is a distribution characterised by an exponentially decreasing tail, similarly to the observed PSC signal.
- Extreme Value distribution had been used in the past for failure related phenomena by (Griffith, 1920) and it is commonly used for modelling of chaotic phenomena, like meteorological phenomena (Castillo, Hadi, Balakrishnan, & Sarabia, 2005).
- The fitting results were satisfactory for all instances of the signal and the fitting converged regardless of the amplitude of the PSC signal.

Therefore the Generalised Extreme Value distribution could be suitable for macroscopic modelling of peaks of the PSC signal as it can model both the PSC peak and the corresponding relaxation in a unified way.

#### 4.4 Analysis of Bending Stimulated Current

The Bending Stimulated Currents (BSC), yield from brittle material specimens that are subjected to bending type loading. The signals are named after the BSC experimental technique by analogy to the PSC signals. The physical mechanisms of signal generation of BSC are similar to PSC signals, however we study them separately, adapting a structural application oriented analysis scheme, in which columns and beams are stressed and bended accordingly and thus particular handling is needed.

##### 4.4.1 BSC signal experimental recordings

Bending Stimulated Currents that are analysed in this section were recorded from marble beams that were subjected to typical three-point bending tests as described in earlier chapter. Electrodes were placed only in the bottom side of the beam, on either side of the region where the initial crack is expected to form.

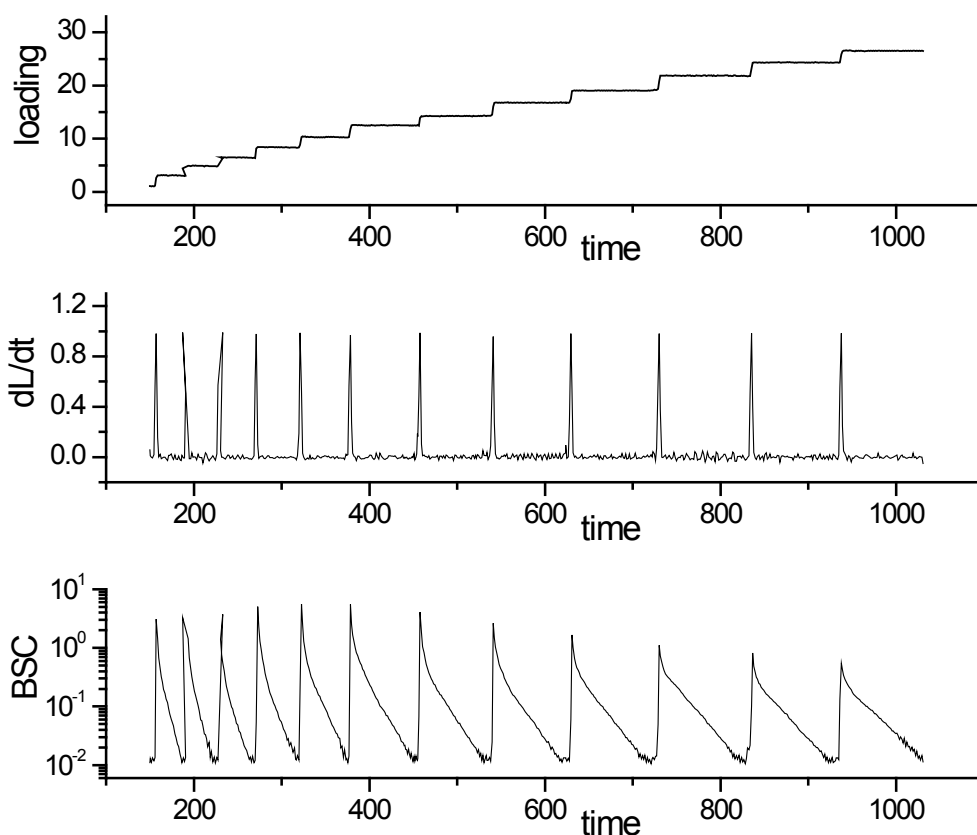


Figure 4.13 (a) Loading scheme used for three-point bending test on marble beam, (b) the loading rate evolution over time and (c) the corresponding BSC signal peaks and relaxation.

The applied loading is depicted in Figure 4.13a. The selected loading follows an increasing quantised scheme, which consists of twelve consecutive loading steps of the same amplitude, but unevenly spaced in time. The reason of uneven duration of steps is that the time interval of each loading step is based on the relaxation time of the relaxation process of the BSC (i.e. the time that is needed for the BSC to relax to the background level). Therefore, the higher the loading level of the step the longer the relaxation process and thus the longer the time interval to the next step. Note that for initial step the time interval to the next step is  $t_{step1} = 32\text{sec}$  while the equivalent time interval for 11<sup>th</sup> step is three times longer  $t_{step11} = 100\text{sec}$ . The occurrence of electric signal can be correlated with the loading rate which is shown in Figure 4.13b. We have plotted the calculated first derivative of the loading versus time to locate the instances of loading variation. The deviation in loading coincides temporally with the BSC peak. The peak loading rate is the same in all steps (about 1kN/s) however the peaks follow a different trend, which is going to be further discussed in following section. The BSC signal evolution is plotted in Figure 4.13c in a semi-log graph for better visualisation of both the high and low signal peaks, as well as of the micro-fluctuations on the relaxation process of the final steps (Kyriazis, Anastasiadis, Stavrakas, Triantis, & Stonham, 2009).

#### 4.4.2 BSC signal peaks and relaxation evolution

In this section we analyse the BSC signal by means of two properties the BSC peaks and the relaxation time parameters evolution. The three-point bending tests lead to failure of the marble beam at a certain plain parallel to the direction of loading. Other researchers (Kourkoulis, Exadaktylos, & Vardoulakis, 1999) have selected U or V notched beams to predict in a more robust way the crack position and direction, because externally made imperfections in the material act as stress concentrators that lead to failure according to Griffith's theory. In our experiments the marble beams were pristine (non-notched) so as to emulate real application conditions. However, all specimens failed in the middle towards the plane that initiates at the position of the upper wedge.

The BSC peak that corresponds to each step, it also corresponds to the equivalent loading level and thus can be correlated with the fatigue and the severity of damage of each level as known by the conventional material strength analysis. The last loading step leads the material to failure and thus this level can be considered as the maximum material strength. In Figure 4.14 the BSC peaks versus the loading level are plotted. The x-axis represents the normalised loading level that corresponds to the loading steps assuming the strength of the

material is reached at the last step. The y-axis is normalised in order to have the BSC peak values and the totally recorded charge flowing past the electrodes at each loading step, in a unified plot. Both parameters were normalised by dividing by the maximum value.

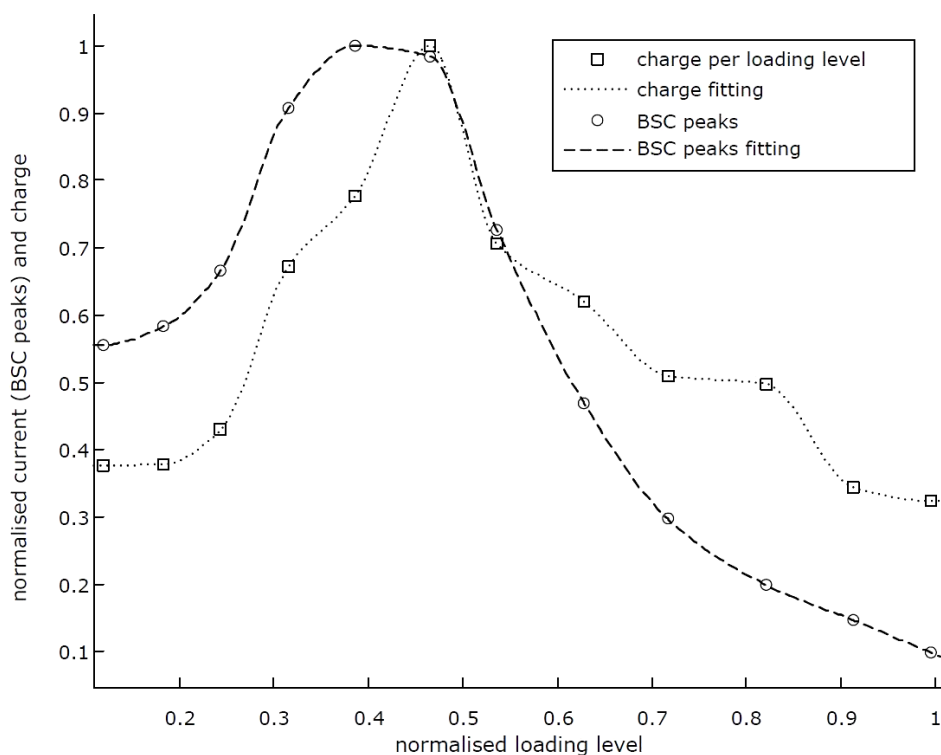


Figure 4.14 Normalised BSC peaks and total charge that flows past the electrodes at each loading level – taken from (Kyriazis, Anastasiadis, Stavrakas, Triantis, & Stonham, 2009)

The BSC peaks have been fitted using a shape-preserving spline, known as Piecewise Cubic Hermite Interpolation Polynomial (PCHIP). This type was selected instead of typical spline fitting because of its property to preserve the shape of data, as well as monotonicity. Using PCHIP fitting, a  $P(x)$  cubic Hermite interpolant is calculated for each subinterval, keeping certain slopes at the two endpoints (Fitsch & Carlson, 1980). The fundamental property which is common between PCHIP and the typical spline fitting is zero scattering, because in both cases the fitting is based on the exact recorded data. The complete BSC recording was also fitted using PCHIP for calculation purposes. The key feature of PCHIP is that it has no overshoots and exhibits less oscillation when applied to smooth data, such as the BSC signal recordings.

By focusing on the stimulated current signals, yielding either by pressure or bending mechanical stimulus, we observe similarities. In both cases a peak value of the signal is followed by a relaxation process. In previous section we have analysed this relaxation process as a combination of two distinct concatenated processes, a fast and a slow

relaxation process that are mathematically described by equation (4.3.1) and are characterised by time relaxation factors  $\tau_1$  and  $\tau_2$ . In this analysis of the BSC signal we will follow the same scheme and we will focus on the slow relaxation process that seems to contain more information as far as the damage of the material specimen is concerned.

The results of the relaxation factor  $\tau_2$  for each step are plotted against normalised loading level in Figure 4.15. In the same figure we have plotted the typical relaxation evolution of the BSC signal (5<sup>th</sup> step), which initially relaxes down to the background level at a fast rate, but the rate become slower once the slow relaxation process becomes dominant. The slow relaxation process is approximated by the straight line which graphically expresses the exponential trend of the process, taking into account the logarithmic y-axis.

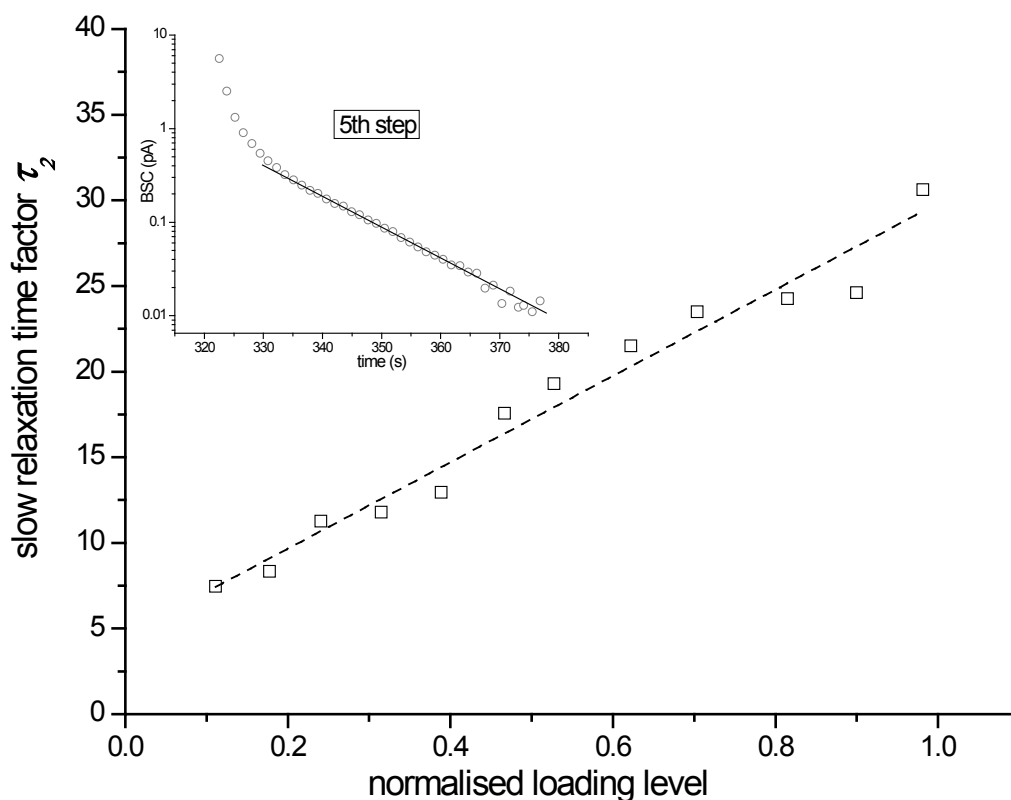


Figure 4.15 Linearly fitted slow relaxation time factors  $\tau_2$  of the BSC signals with respect to the normalized loading level and a typical relaxation process and the exponential trend that follows

A probable cause of the appearance of the second (slow) relaxation mechanism process is the continuing material strain, even at a very low rate, although stress is unchanged. The new microcracks that go on appearing produce new microcurrents and result in conserving BSC at relatively high values that do not permit a direct relaxation to noise level. Therefore the increase of relaxation time depicts the ageing of the sample beams and constitutes an



indicator of the damage they have suffered (Kyriazis, Anastasiadis, Stavrakas, Triantis, & Stonham, 2009).

#### 4.4.3 BSC cumulative charge as a failure criterion

The total charge that flows past the electrodes that are placed on the beam, during each loading step can be calculated by the finite integral of the fitted BSC recordings, having the time of stress step application as lower limit and as upper limit the moment of the application of the next stress step. The recorded BSC can be therefore defined as the rate of the charge flowing past a certain plane, which is equivalent to the electrodes surface in our experiments. Equation (4.4.1) has been used to calculate the charge according to the aforementioned definition of the BSC.

$$Q_{n \text{ step}} = \int_{t_n}^{t_{n+1}} BSC(t) dt \quad (4.4.1)$$

The normalised flowing charge, which is depicted in Figure 4.14, is an important parameter to evaluate, as it can serve as a metric of the amount of energy that corresponds to each stage of material damage. Its main feature is that combines both the current signal and the time interval of the relaxation process. In other words the current peak and the duration of the current relaxation process are expressed through the charge in a unified way. A typical manifestation of the aforementioned facts is that the BSC peak graph exhibits a maximum earlier compared to the charge maximum. Furthermore, it is observed that during the last loading steps, when the current peaks are significantly lower, the total charge remains relatively high because of the slower relaxation processes.

By using the data of charge per step that are presented in Figure 4.14, we can calculate the cumulative distribution of the charge with respect to the loading level, which is plotted in normalised axes in Figure 4.16. Normalised loading level is defined as the loading level at each loading step divided by the maximum loading level that corresponds to the loading level at the end of the experiment (i.e., the loading level at the last step prior to the specimen's failure, which is maximum). The loading increases following an almost linear law, while the charge does not increase linearly. It increases quickly up to loading level 0.5 and then the increasing rate drops, thus a saddle point for the charge graph appears. The saddle point in the cumulative distribution of charge may serve as a criterion of the fatigue of the sample and as a precursor of the fracture of the sample, which appears early enough (at half the strength of the sample) and may help to predict ahead of time the failure of a bent beam, even before it exceeds its linear deformation behaviour. Talking in terms of

system analysis, we may consider the loading as the input of a system and the total charge as its output. The two parameters cannot be correlated linearly which is an indication of a non-linear and dynamic system.

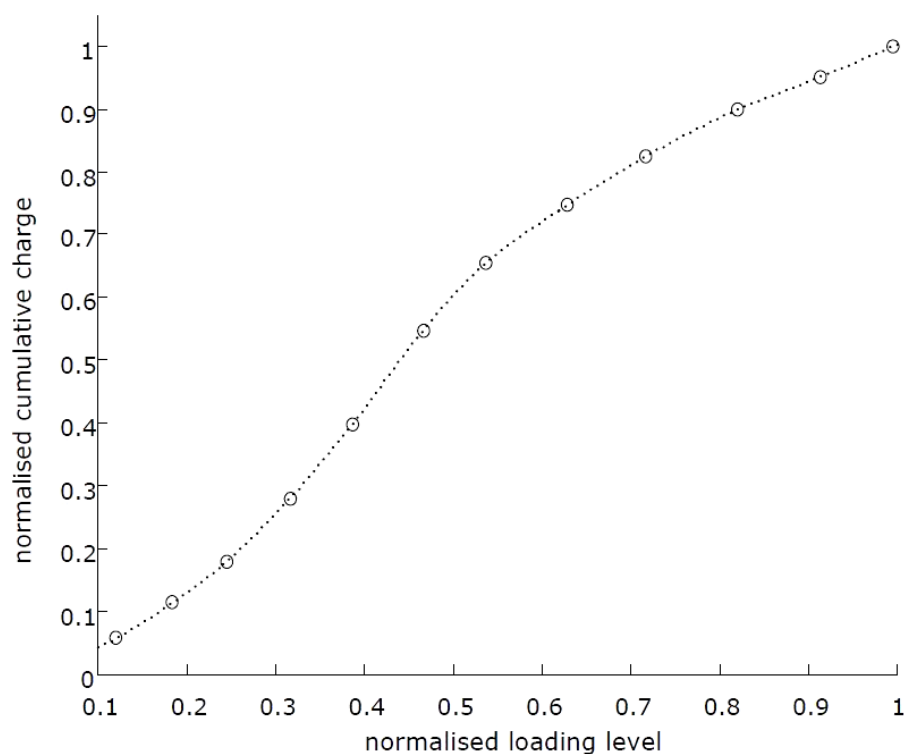


Figure 4.16 Normalised Cumulative distribution of charge recorded by the attached to the specimen electrodes versus the normalised loading level – taken from **(Kyriazis, Anastasiadis, Stavrakas, Triantis, & Stonham, 2009)**

The significance of the criterion of cumulative charge saddle point is that it is an early precursor of fracture, especially when compared to conventional strain measurements. Linearity between stress and strain is maintained up to 0.7 of the maximum material strength whereas this criterion indicates the initiation of cracks at loading level close to 0.4 or 0.5 of the material strength. The earlier the fracturing of material sample is identified the less the probability of avalanche propagation of cracks and the higher the probability for repairable defects. Thus, the difference in the loading level of warning is crucial for retrofitting and reinforcement actions to be more efficient.

#### 4.4.4 Superposition of electrification mechanisms in BSC signal

In this section we discuss about the modelling of current peaks with respect to the cracking mechanisms that are involved in our experiments. The bending of the beam has been experimentally implemented, as presented in previous chapter, by a three-point bending test. The beam is led to fracture and failure, which has been observed towards a certain

plane parallel to the direction of the applied force that initiates at the point of the upper wedge of the three – point bend setup. The failure plane observed in this experiment is not created by one main crack, as it happens in the case of axial stress tests where one main crack propagates creating a shearing plane (Sanford, 2003). In the bending tests there are two regions of the beam that behave in a different way as shown in Figure 4.17. The upper part of the beam is subjected to compression, while the lower part of the beam to tension. As shown in the figure the tension is higher in the bottom of the beam, the compression is higher in the top of the beam and they both get lower towards the middle of the beam where they get to zero in the axis which resides in the middle and is called neutral axis. Therefore, two distinct cracks one from the top and one from the bottom propagate and both tips of the cracks move towards the intersection of the longest axis of rotation and the neutral axis, in the centre of the beam.

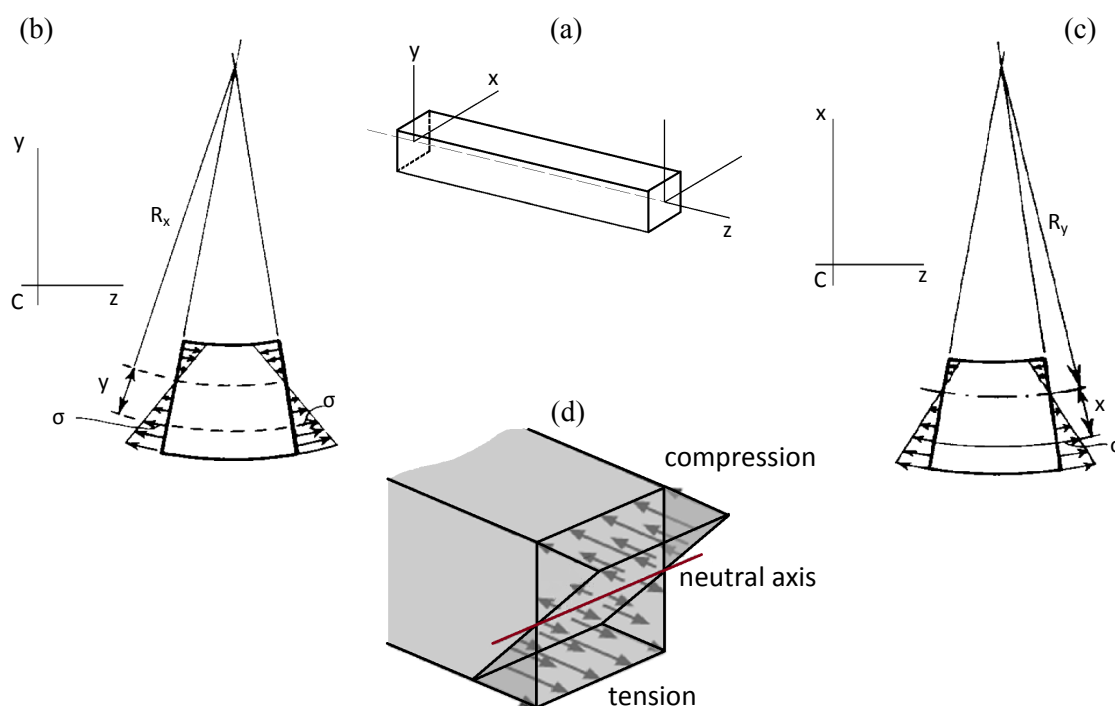


Figure 4.17 (a) Coordinate system of a beam subjected to bending, (b) Bending in z-y plane, (c) Bending in x-z plane – taken from (Case, Chilver, & Ross, 1999) and (d) Three dimensional presentation of the stress distribution in cross-section plane of a bended beam

The recorded current is a transient one and its nature and properties have been studied in the frame of MCD model (Vallianatos & Tzani, 1998). In axial compression tests the electrodes were perpendicular to the axis of the loading and therefore the component of the current that flowed through electrodes surface was recorded. In the case of bend, because of the existence of two fracturing mechanisms, thus of two cracks propagating in opposite directions, the measured current is the superposition of the electric signals that are

generated in the tip of each crack because of the bonds' breaking. In this way it can be explained why in bend test the current peaks do not follow an exponential decrease, but two different exponential processes expressed by equation (4.4.2).

$$BSC_{peak}(t) = A_{comp} e^{-\frac{t}{\tau_{comp}}} - A_{tens} e^{-\frac{t}{\tau_{tens}}} \quad (4.4.2)$$

Bearing in mind that in the compressed region of the beam suffers less damage compared to the tensed region of the beam, because material is less vulnerable to compression, the relation between the two characteristic parameters of the exponential processes (i.e.,  $\tau_{comp} > \tau_{tens}$ ) is a presumed result. Another reason explaining this result is that electrodes are attached on the lower side of the beam and therefore the measurement is influenced more by the tension electrification mechanism, whereas the compression electrification mechanism is more attenuated.

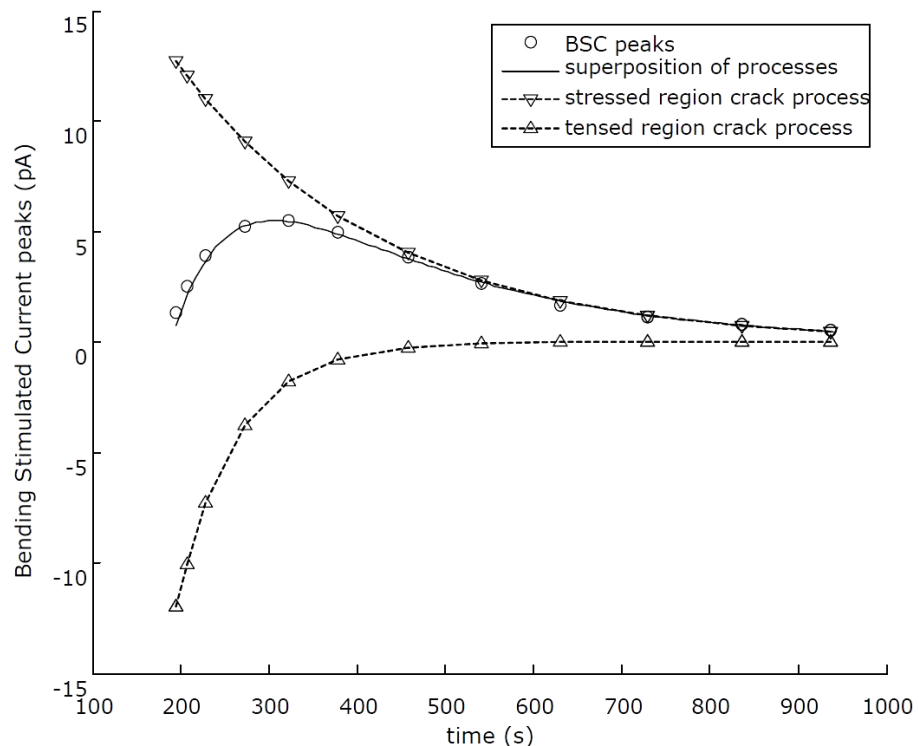


Figure 4.18 BSC peaks evolution by means of two discrete processes i.e the tension process and the compression process – taken from (Kyriazis, Anastasiadis, Stavrakas, Triantis, & Stonham, 2009)

In Figure 4.18 the two mechanisms compression for the upper part of the beam and tension for the lower part obviously follow the exponential decrease explained in previous sections for single mechanism case of axial compression tests. However their superposition yields the BSC peaks graph shown also in Figure 4.18. The two processes exhibit different characteristics as far as the rate of decrease of the BSC peaks is concerned owing to the

different rates of damage of the two regions (i.e., tensed region crack propagates more quickly compared to the compressed region crack) and that is why the superposition of the current peaks is not constant during the whole experiment. Finally we should note that the two processes graphs yield as the best fits of the recorded BSC peaks data and are not actually measured parameters as in our method the source of the measured current is not specified. In other words it is impossible to specify the exact charge flowing out of each crack but only the total charge flowing out of the beam in a specified plane. In the future acoustic emission measurements would be useful to verify our model for bending.

#### 4.4.5 Comparison of BSC emissions in FRP and cement beams

Fibre Reinforced Polymer sheets and cement based beams were tested under the same experimental setup and were studied under similar loading conditions in typical three-point bending tests. These two materials are used together in modern constructions, because once FRP is attached through adhesive resins on cement or concrete, the mechanical properties of the latter improve radically. We study each of the materials separately as far as their BSC signal emissions are concerned, by a set of electrodes attached on the lower surfaces.

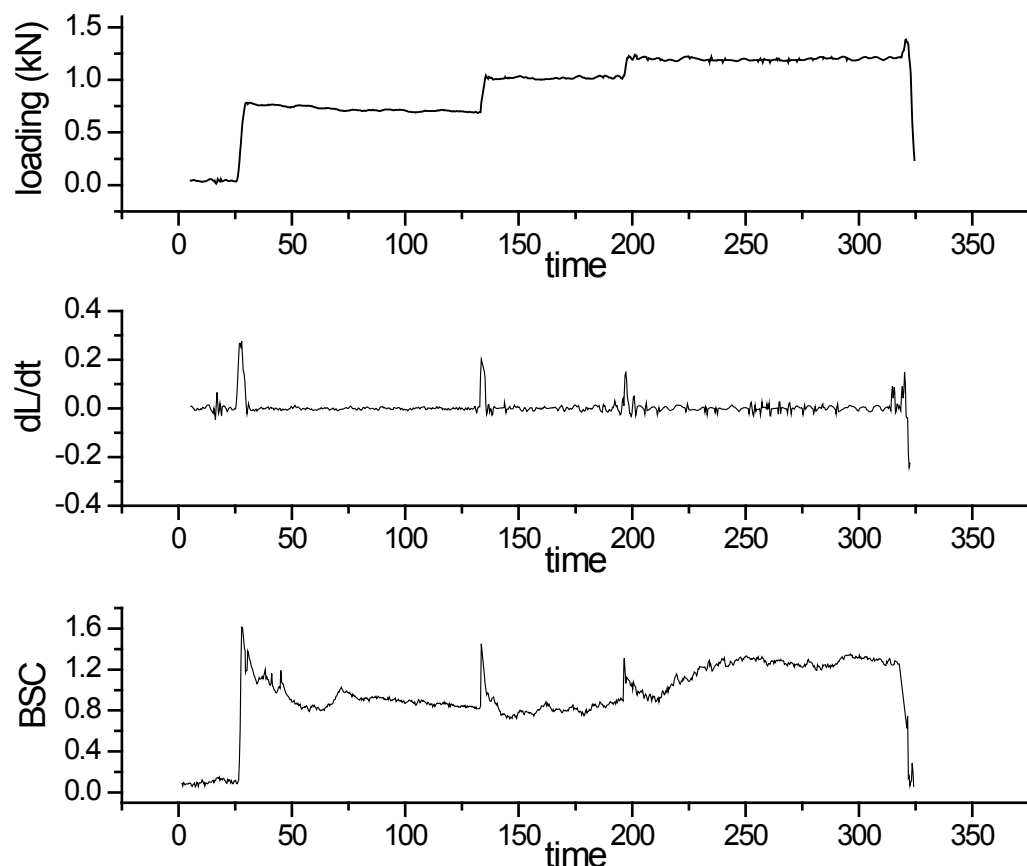


Figure 4.19 (a) Applied loading to the FRP sheet, (b) the loading rate of the experimental process and (c) the corresponding BSC signal

The piezoelectric properties of carbon fibre reinforced concrete and cement paste were also studied by (Sun M. , Liu, Li, & Hu, 2000), but in this work we examined the materials individually to create reference for future work on more complex civil engineering applications. The applied loading scheme, which is of increasing step-wise type, is depicted in Figure 4.19a. The steps are not equal in amplitude and the loading rate decreases in each loading step, as shown in Figure 4.19b. The average loading increase rate was at about 0.15kN/s. We note that the attempt for a fourth minor loading step led the material specimen to failure, which indicates that the loading was already high enough and maybe unstable cracking propagation had already been driven. Considering the BSC signal level of the previous step, as the BSC signal background level for each loading step, we observe the decrease of the BSC peak values. However, the main difference between BSC signals from FRP is detected between the BSC signal relaxations of the second and third step. More specifically, the two relaxation processes seem to evolve in a similar way for the first 20 seconds after the application of the loading steps, i.e. 2<sup>nd</sup> and 3<sup>rd</sup> accordingly. During the third loading step, after the time interval of trivial relaxation evolution to background signal level, the BSC signal tends to increase and remains at high values, close to previously observed BSC peak levels. The aforementioned difference is depicted in Figure 4.20a. The two recordings are presented in common x-axis, getting as starting point for the signals the instant at which the abrupt loading step is applied. Such relaxation processes that deviate from those commonly observed relaxations, have been recorded from brittle materials prior to failure and may serve as a precursory signal of rupture.

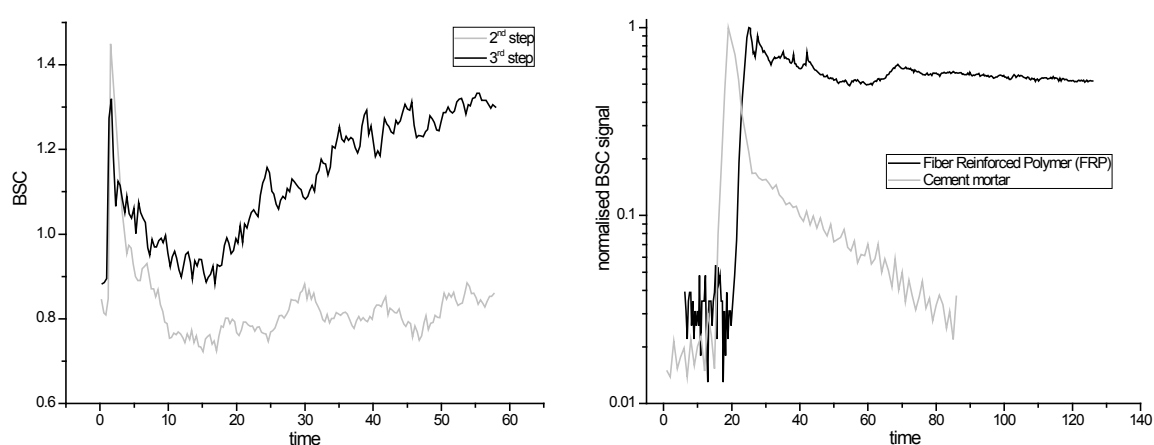


Figure 4.20 (a) BSC signal recordings of 2<sup>nd</sup> and 3<sup>rd</sup> loading steps on FRP sheet and (b) normalised BSC signal recordings from cement mortar beams and FRP sheets

Fibre Reinforced Polymer sheets have been proved to emit BSC signal when subjected to mechanical stimuli of bending type and follow similar trends with brittle rock and cement

based materials that we have examined. Yet, FRP is a composite material and the differences shown as far as its BSC signal emissions are concerned, should be examined with respect to its individual properties. The essential difference between BSC signal from FRP sheet and BSC signal from cement mortar beam, both subjected to three point bending tests, is depicted in Figure 4.20b in normalised y-axis. In both cases the BSC signal is transient and the mechanisms of electrification are those discussed in previous sections and explained by the MCD model. The recorded BSC signal is therefore the superposition of microcurrents yielding from microcracks created in the bulk of the material. The higher the concentration of microcracks is, the higher the magnitude of the produced BSC signal will be. After the BSC maximum and taking into account that the load remains constant, the microcrack formation rate drops radically and thus a fast relaxation mechanism is dominant. The slow mechanism that should keep the BSC signal perturbation longer, but yields weak signals, seems to be boosted for FRP sheets. The new microcracks that go on appearing produce microcurrents and result in conserving BSC at relatively high values that do not permit a direct relaxation to noise level (Triantis, Anastasiadis, Kyriazopoulos, Kyriazis, & Alexis, 2006).

Therefore the tendency of the current in the case of FRP sheet bending to remain high may reveal the creation of new microcracks although the load remains constant. The boosted BSC signal of slow relaxation process for FRP seems to be influenced by a variety of parameters. The loading level which is close to the maximum material strength to bending is an important parameter. Other parameter are the lack of homogeneity in FRP sheets and the existence of fibres, whose mechanical and geometrical characteristics slightly differ and may contribute to a less severe and slower failure compared to the cement mortar beam failure (Triantis, Anastasiadis, Kyriazopoulos, Kyriazis, & Alexis, 2006). This may be explained by the inability of quick clustering of microcracks as these happen in different parts (fibres) of a composite material (Turcotte, Newman, & Shcherbakov, 2003). The most important parameter that leads to the boosted relaxation process of BSC signals from FRP sheets compared to those from cement mortar is the layout of cracks. More specifically, the fibres lay in a given unique direction within the FRP sheets and break in one direction only, whereas the distribution of cracks origins and lattice defects in the cement mortar specimen is chaotic. Therefore the superposition of microcurrents in the former case is determined by the structural characteristics of the fibres and thus BSC remains high in contrast to the BSC from cement mortar.

The analysis of the BSC signals from these two materials would be the reference for a real application experiment, where the two materials would be bonded together through adhesive resin.

## 4.5 Cyclic loading and memory effects on PSC and BSC

### 4.5.1 Permanent and temporary memory of materials

Memory effects, the most important of which are presented in chapter 2, have been observed in the evolution of a variety of physical properties of brittle materials during their mechanical deformation. Memory is defined as the ability of marble and generally rocks and brittle materials to retain “imprints” from previous treatments and to reproduce information about these treatments under certain conditions, by analogy to the memory of human beings.

The existence of memory effects for the PSC and BSC signals is discussed in this section, alongside with an attempt to distinguish between the two different manifestations of ‘memory’ based on the two electrification mechanisms, i.e. dynamic and cracking, that were proposed and analysed in previous sections. In accordance with these two mechanisms and following the human memory model, we suggest the separation of memory of a material specimen into two levels i.e. the short or temporary and long or permanent memory.

For the observation and analysis of the short memory of brittle materials we have conducted experiments using the PSC technique in marble specimens. The materials are imposed to cyclic step wise loading of the same level, scheme and direction (axial stress – unchanged position of material) in order to comply with the conditions that are proposed as suitable for memory effects study by other researchers (Lavrov, 2005).

In Figure 4.21 we present a typical set of data recordings from a marble specimen. The sample is stressed within the elastic deformation region marginally below the initiation of crack formation level and above the crack closure level. The duration of high stress loading was the same in each cycle ( $t_{high\_stress} = 2 \text{ min}$ ), but the relaxation time interval was doubled in each experimental part. The experiment consists of three parts for which relaxation times are  $t_{relaxation\_part1} = 4 \text{ min}$ ,  $t_{relaxation\_part2} = 2 \text{ min}$ ,  $t_{relaxation\_part3} = 1 \text{ min}$ . Loading and unloading stress rates are similar for achieving comparable results. Between the different parts of the experiment, the material is under constant stress so as not only to relax but also to stay in the same position and be stressed in the same direction. The actual sequence of



experimental procedure is part 2, part 1 and part 3 and is shown in Figure 4.21 b1, a1 and c1 accordingly. The resulting PSC signals are given in the right column of this figure.

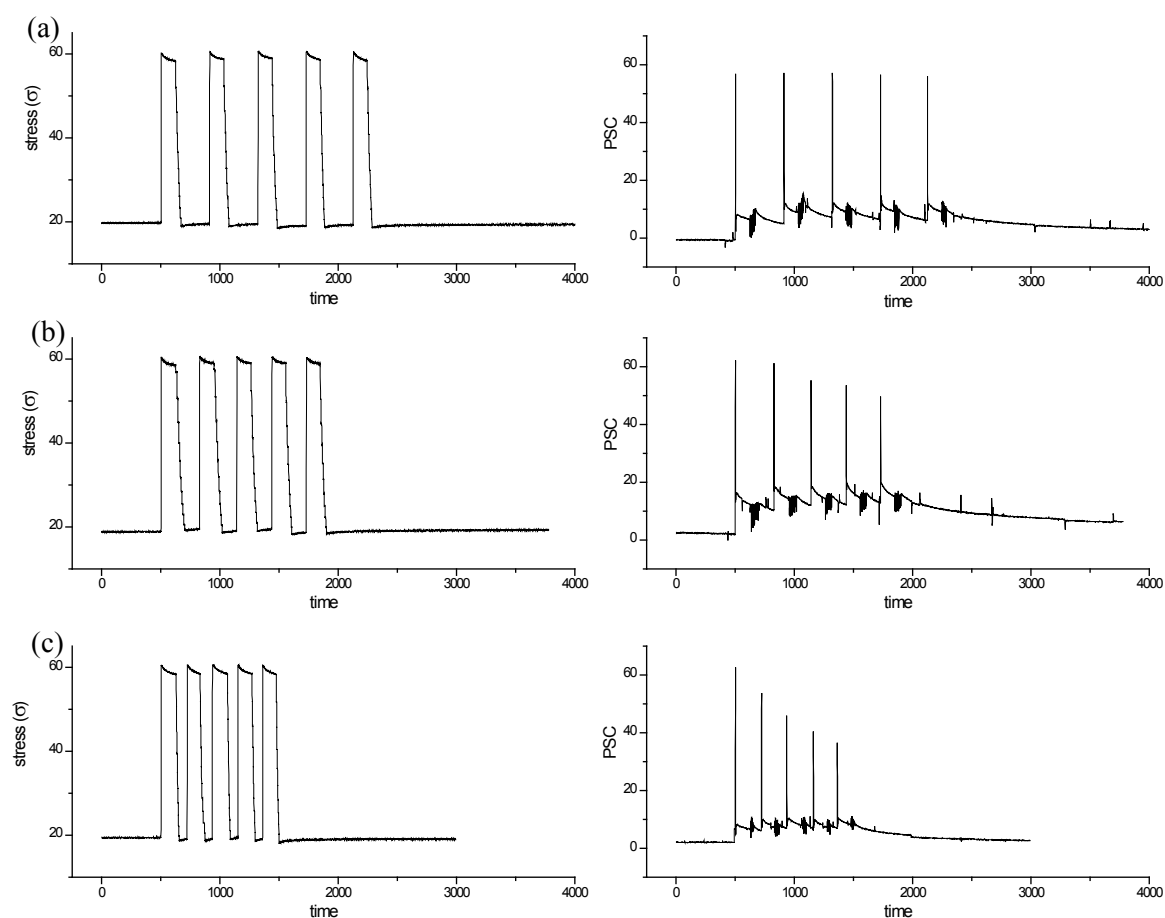


Figure 4.21 Five step-wise loadings of 2mins per step duration and varying relaxation times (a) 4mins (b) 2mins and (c) 1 min, alongside with the corresponding PSC signal

Visual evaluation of the results indicates that the material reaction to the same stimuli varies according to time interval between them. For the data analysis we consider as basis the initial background level of the PSC signal of each experimental part and not the interim levels between steps. Note that the background level of PSC signal before any mechanical stimulation is the same in all experimental parts and thus comparative analysis is possible. In the first part of the experiment we observe similar peak values for the PSC signal, while the sample is subjected to successive loading. This is an indication of a time invariant system corresponding to this type of cyclic loading, since the same input results in the same output, regardless of the previous conditions and handling. We reduce the relaxation time between loading steps into half and we observe a slight decrease of the PSC peaks, although the system mechanical input remains the same in amplitude, duration, scheme and direction of stress. The material seems to have the ability to memorise the previous

handling, provided that it has been recently occurred. The decrease trend of the PSC peaks is even more evident in the third part, in which we have further divided the relaxation time of the second experimental part by a factor of two. Therefore, PSC signal memory effects are observed, which seem to be stronger when the stimulations are closer in time and may influence the resulting PSC peaks in cyclic loading. The PSC peaks were normalised (division by max) separately for each set of measurements yielding from each of the three parts of the experimental process and are presented in Figure 4.22. The qualitative result of this experiment is that for mechanical loadings within stress levels of linear deformation, which excite the dynamic electrification mechanism of the PSC and BSC emission, the material sample memorises the stimulations and gradually reacts more mildly.

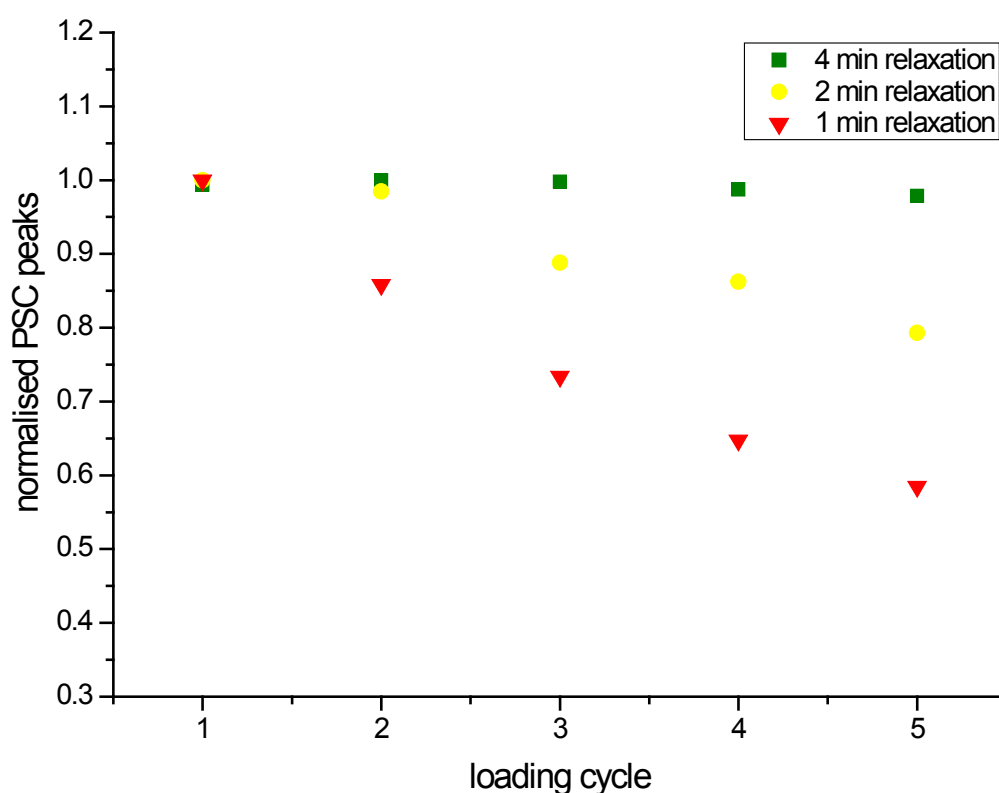


Figure 4.22 The evolution of PSC signal peaks (normalised) over loading cycles for the three experimental parts which are characterised by varying relaxation times

The shorter the time between identical mechanical stimuli, the higher the inertia to the stimuli, which is expressed by the decrease of the PSC peak levels. However, this type of memory is short and ‘erases’ after certain time, as it is related to dynamic mechanisms and not to cracking ones.

The permanent memory of a material, contrary to the short memory described before, is related to mechanical handling that the material cannot ‘forget’ regardless of the relaxation time interval. It resembles the human permanent memory, in the sense that it keeps

information about all ‘serious events’, i.e. mechanical stimuli exceeding the crack initiation level. Specimens that are stressed beyond the elastic mechanical deformation level form permanent defects (micro and macro - cracks) further to those inherently present in the bulk of the material samples from the stage of creation and extraction, or construction. Such defects are kept in the permanent memory of the material and thus the material reaction to a stimulus similar to the initial stimulus that has created the defects is expected to be weaker regardless of the time of occurrence.

We have conducted experimental tests of cyclic high level step-wise loading on amphibolite rock specimens in order to verify and study the existence of permanent memory effects. The sample is stressed beyond the elastic region and the crack initiation stress level, so as for microcracks to be created, but also deterministic relation between loading and crack propagation to be maintained and avoid chaotic cracking evolution. The loading scheme applied on sample and the resulting PSC signal are shown in Figure 4.11.

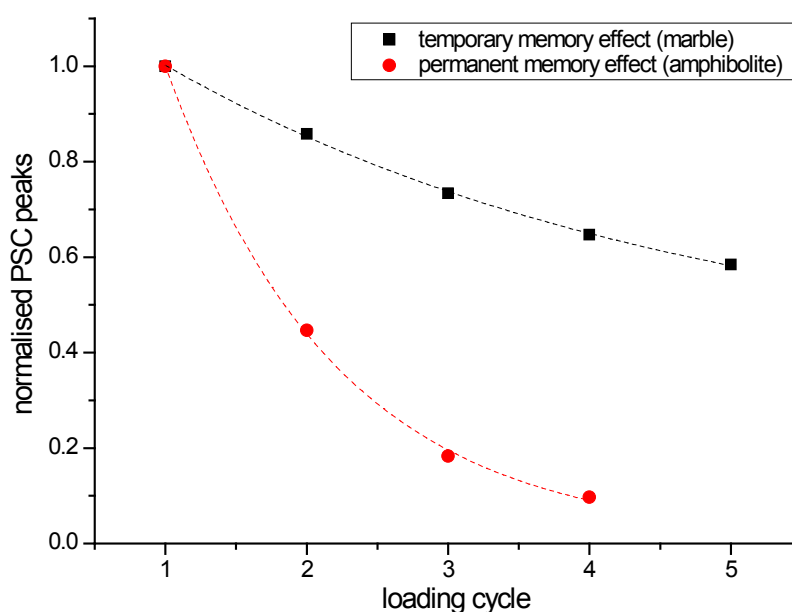


Figure 4.23 The evolution of PSC signal peaks (normalised) over loading cycles for temporary and permanent memory effects on marble and amphibolite respectively

The time interval between consecutive steps is selected to be almost 10 times longer compared to the time interval that is practically needed for the extinction of short memory effects in the specimen. We can therefore assume that the decrease, which is observed in the PSC signal peaks, is the manifestation of a memory effect attributed to the existence of permanent memory in the material sample. The normalised PSC signal peaks yielding from the permanent memory test of amphibolite specimen, alongside with the normalised PSC signal peaks yielding from the short memory test of marble specimen (3<sup>rd</sup>

experimental part) are plotted versus the loading step in Figure 4.23. For comparison between short memory and permanent memory effects in PSC signal, we have selected the 3<sup>rd</sup> part of experimental test for short memory, as it is the most evident manifestation of short memory effects. However, as clearly depicted in Figure 4.23, the permanent memory effects influence on the PSC signal peaks evolution over loading cycles is prevalent compared to the influence of short memory effects. Permanent memory and the consequent memory effects, which are observed in the PSC signal, do not erase or even fade out in the course of time, because the resultant information is related to the aforementioned cracking processes and the corresponding cracking electrification mechanism. As it has been discussed in previous section the energy related to the cracking electrification mechanism is finite for each specimen and equivalent to its cracking capacity. Note that in both cases the PSC peak decay seems to follow exponential trend, but it is more abrupt for the permanent memory effect, as indicated by the exponent factors of the exponential trend line ( $Ae^{-ax}$ , where  $a_{\text{temporary mem}} = 0.2656$  and  $a_{\text{permanent mem}} = 1.1965$ ).

Summarising the memory effect observations we conclude to the following points

- Analysis of the memory effects on PSC signals has revealed two types of memory, the temporary memory and the permanent memory.
- Amphibolite and marble specimens exhibit similar properties of both temporary and permanent memory, as shown by experimental tests.
- Both types of memory influence the PSC peaks evolution (exponential decrease) in cyclic loading of the same level
- Permanent memory cannot be erased and affects PSC signal permanently and severely
- The short memory has temporary influence on the PSC signal and the impacts of its effects on the signal are milder.

Concluding, the Pressure Stimulated Current emitted by the sample in each loading cycle follows a non-linear relationship with respect to the applied stress, on the contrary a transient phenomenon is observed. Speaking in terms of signal processing, the system, which is either the marble or the amphibolite sample in this work, responds not only according to the input, i.e. the applied stress, but also according to its previous state, i.e. the number of previous equi-loading cycles.

#### 4.5.2 Memory effect features of the mechanically stimulated electric signal

Study of rocks and brittle materials in general has revealed similarities in the memory effects in the changes of physical properties of fracture induced phenomena. Following the comprehensive works by (Lavrov, 2005) and (Shkuratnik & Lavrov, 1999) as references for the common features of the observed memory effects that accompany brittle fracture phenomena, we have verified the existence of similar features in the memory effects of the PSC signal. In this section we discuss the most important features of the PSC signal memory effects and the common characteristics with memory effects that are related to the variations of other physical properties, which are thoroughly presented in (Lavrov, 2005).

The decay of memory effects in time is their most common feature. PSC signal memory effects also decay in time as it was proved by the short memory tests in the previous section (Figure 4.21). The material sample tends to forget handling in the range of linear deformation after a certain relaxation time. The memory effects decay in time may also exist in the case of permanent memory effects but it is not so evident and thus quite difficult to measure even in the laboratory, because of a variety of changes of external parameters like temperature, humidity and electromagnetic noise.

Another common memory effect feature that was also observed in the PSC signal related memory effects is that in cyclic loading of the same stress level the greatest change in physical properties under examination is detected between 1<sup>st</sup> and 2<sup>nd</sup> cycle.

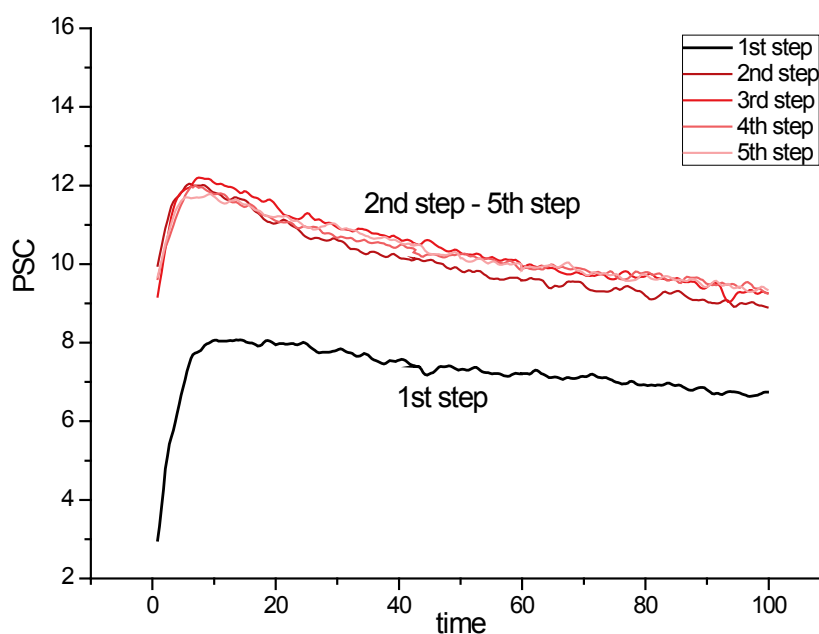


Figure 4.24 Relaxation evolution of the first and the following (2<sup>nd</sup> to 5<sup>th</sup>) steps in common time axis, from the experimental data of short memory test on marble (part 2 experiment i.e. 4min relaxation time)

We have isolated the PSC data recordings for a time window of 100 seconds in each loading cycle, from the second part of the short memory effects experiment (Figure 4.21a). The time window in each loading cycle corresponds to the time interval after the PSC peak occurrence and while the PSC signal relaxes at the high stress level, before unloading. The short memory effects concerning the peaks have been vanished in this experiment because of adequate relaxation time between the steps that allows the short memory to erase. However, we observe that the first loading step results in a different PSC signal evolution which is presented in Figure 4.24 and denoted by the black coloured curve whereas the following loading cycles yield similar PSC signals that are denoted by curves of gradually lighter red colour. The same trend was also observed in part one and three of the experiment. It thus constitutes an observation independent of short memory effects on PSC peaks evolution (steady or decreasing) and seems to be common relation between the initial and the consecutive cycles provided the stress level is unchanged.

Generally the inertial reaction of brittle rocks to the same mechanical stimuli as far as the PSC signal emission is concerned, can be verified through the following four features evolution over loading cycles.

- The PSC peak evolution over loading cycles is the most apparent signal property that changes either in case of permanent or of short memory, provided the events are close in time especially in the latter case. This feature has been thoroughly discussed and analysed in the previous sections.
- The PSC signal response delay in each loading cycle generally increases. We present the recorded data from an amphibolite specimen compressive test, in a short time window, in Figure 4.25, so as to show the delay in the occurrence of PSC peak signal. We have considered the moment of stress application as the starting point for the analysis ( $t_0 = 0$ ) and we have denoted the time of PSC peak signal occurrence by time marks  $t_1$  to  $t_4$  for the peaks of loading step one to loading step four accordingly. The trend of the presented data is the increase of time which is described by the following inequality  $t_1 < t_2 < t_3 < t_4$  and generally for any PSC signal recorded in cyclic stress tests the inequality  $t_{n-1} < t_n < t_{n+1}$  seems to hold.

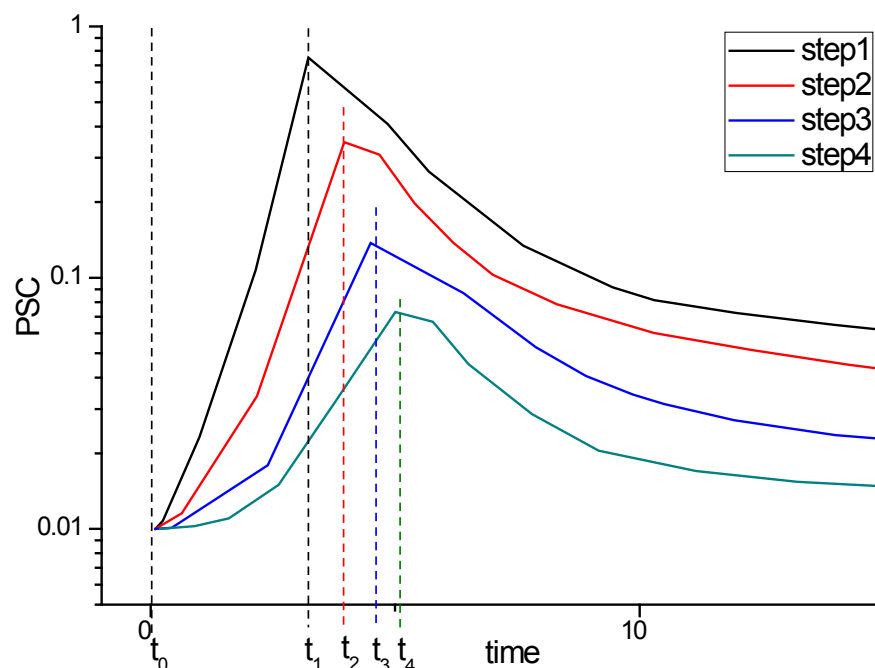


Figure 4.25 The delay in PSC peak occurrence during repetitive loading. PSC signal snapshots shifted in time for common time reference  $t_0$  presentation, yielding from amphibolite specimen subjected to 4 stress steps.

The inertial attitude of material sample to cyclic loading is even better pronounced by considering additionally to the aforementioned delay in PSC occurrence, the simultaneous decrease in the PSC peak, the combination of which yield significantly lower PSC increase rate in each step.

- The PSC and BSC signal milder response in each loading cycle is also verified by the incremental evolution of relaxation parameter  $\tau_2$  corresponding to slow relaxation process. Either from the analysis of PSC signals of marble specimen presented in Figure 4.6 and Table 4.1, or from the recorded PSC signal of stress tests on amphibolite in Figure 4.11 or even from the BSC signals measured from marble specimen which is subjected to bending and presented in Figure 4.13, the increase of relaxation parameter  $\tau_2$  over loading cycles is apparent. This parameter is indicative of the slow relaxation process, which is related with the last part of the typical PSC signal relaxation to the background signal levels, after a PSC peak occurrence. Therefore, the increase of the parameter mathematically depicts the longer relaxation time interval of the signal. The tendency of the material specimens to maintain PSC and BSC signal perturbation longer in each loading cycle constitutes another feature of the enhancement of their inertial attitude.

- The decrease of the detected electric energy during cyclic loading tests is the fourth characteristic showing the inertia of the material samples to the same stimuli. The decrease of electric energy can be quantified by means of the measured electric charge detected by the electrodes. The electric charge can be calculated by integrating the electric PSC or BSC signal over time. This memory effect feature can be attributed to the initial cracking electrification mechanisms, which can be verified by the experimental data of short memory effects shown in Figure 4.26.

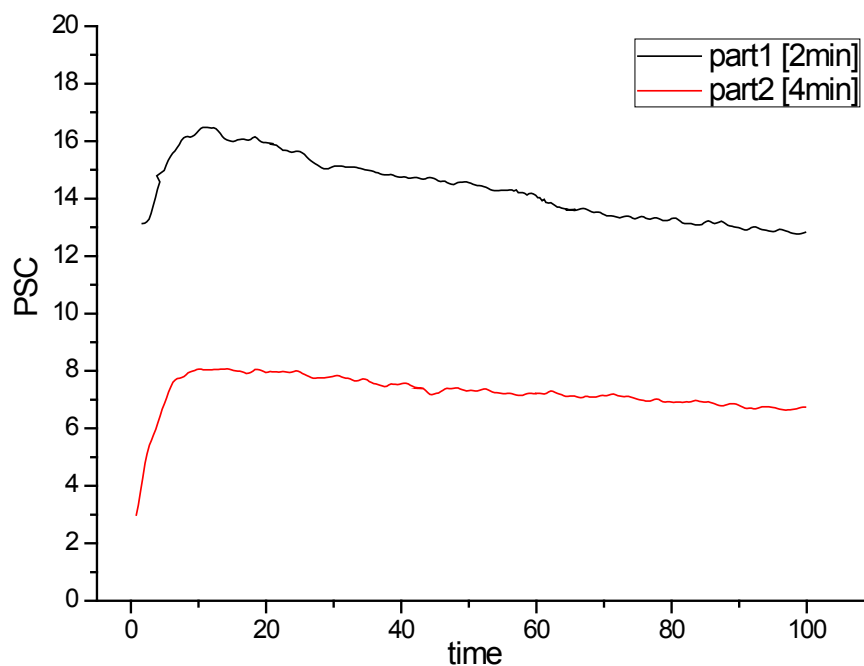


Figure 4.26 Simultaneous plotting of the response to the initial stress steps for each of the first two parts of short memory effects experiments shown in Figure 4.21

In the first part of the experiment, PSC peaks decrease is observed because of the short memory effects, while in the second part, where the relaxation time for the PSC is adequate to erase short memory effects, the PSC peaks' amplitude is unchanged as presented in Figure 4.21. However, by focusing on the time window shown in Figure 4.26, we observe that the PSC relaxation signal is higher in the first part compared to the second, as is the corresponding electric charge that expresses the emitted electric energy. Regardless of any short memory effect the PSC signal perturbation seems to decrease, because of the inertia increase over cycles. In general, memory seems to affect both energy equilibrium and emissions during cyclic loading.

The memory effects in acoustic emissions were studied against the parameter of principal stress axis by (Lavrov, 2005). The deviation of stress axis (10 deg to 15 deg) has been proved to play a key role in the elimination of memory effects. This phenomenon makes



triaxial stress tests very difficult to be analysed with respect to memory effects. The influence of the change in the direction of the principal stress axis in the PSC signals has not been systematically studied. Therefore no quantification of the stress axis deviation, which leads to memory effects extinction, is possible. However, a partial verification of the existence of the property for the PSC signal is made through some experimental cyclic test results for which the stress was totally removed during relaxation of stress steps. PSC signal memory effects seem quite prone to minor changes in the position of specimens that occur in case of stress removal.

Memory effects were studied for amphibolite and marble rock samples. As the corresponding PSC and BSC signals exhibit features relevant to materials' brittle fracture properties, we can deduce that similar memory effects exist for cement based specimens, because cement is also a brittle material. However, an independent study of this material would be useful not only for a deeper learning of the material properties, but also for the investigation of the influence of the water presence and the material porosity, which have been proved (Shkuratnik & Lavrov, 1999) as key parameters for memory effects vanishing.

## **4.6 RLC circuit modelling of the brittle fracture evolution**

### **4.6.1 Modelling basic ideas and assumptions**

Macroscopic analysis by fitting the experimental data is useful for the evaluation of the mechanical properties of the material samples under examination, as presented in the previous sections. In this section an innovative modelling approach of the macroscopic analysis of the PSC is presented.

Examination of the material sample that emits PSC according to system analysis principles has inherent difficulties to face. First problem is that the input of the system is a mechanical stimulation and the output is a weak electric current emission, which are quite heterogeneous and non-linearly related. The basic problem however, is that the material sample considered as a system is not time invariant. The system varies in time according to its mechanical state and therefore the emitted current is related not only to the input to the system, but also to the state of the system and the memory of its recent mechanical treatment (Anastasiadis, Triantis, & Hogarth, 2007).

The modelling of the system by an electrical equivalent circuit, which would consist of passive electrical components, would have an electrical input and an electric current output equivalent to the initial system, is the solution to the heterogeneity of the original system. The problem of variation in time can be faced by assuming that in each loading cycle of a

sample its mechanical state remains practically the same and therefore the equivalent circuit can be considered as time invariant for the periods between consecutive mechanical stimulations.

#### 4.6.2 The RLC model

The electric model selected, as macroscopically equivalent to the system that emits PSC, is the second order electric RLC circuit presented in Figure 4.27. As mentioned in the previous section, the system cannot be time-invariant, so the overall PSC signal emitted during a cyclic loading process is separated into parts. Each part of the PSC is determined by two consecutive mechanical stimulations.

The PSC signal in most of the experiments is recorded during cyclic loadings either of the same level or different and thus the overall signal has to be divided into parts. Each part of the total PSC can be modelled by a linear time-invariant RLC circuit that would create an equivalent current output, in order to overcome the problem of the variation of the system over time. It is therefore important to derive the equation of the current of the circuit with respect to time.

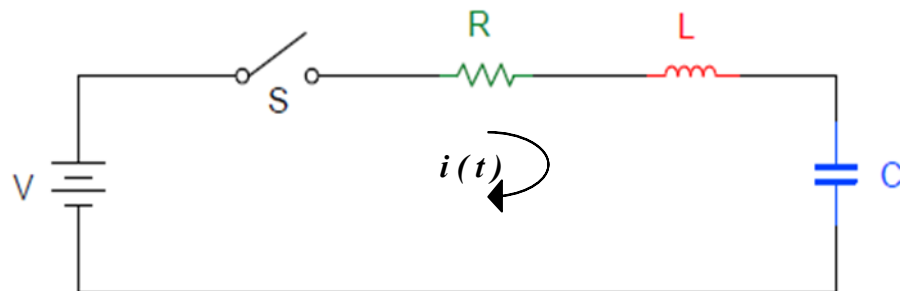


Figure 4.27 The equivalent RLC circuit that models macroscopically the PSC emission system

The circuit of Figure 4.27 is analysed according to basic circuit theory (Desoer & Ernest, 1969), in order to derive the equation that is used for our model.

According to Kirchhoff voltage and current laws

$$v_R(t) + v_L(t) + v_C(t) = V \quad (4.6.1)$$

$$i(t) = i_R(t) = i_C(t) = i_L(t) \quad (4.6.2)$$

Equation (4.6.1) can be analysed according to Ohm law and characteristic equations of capacitor and inductance

$$R \cdot i(t) + L \frac{di}{dt} + \frac{1}{C} \int i(t) dt = V \quad (4.6.3)$$

the integrodifferential equation (4.6.3) in terms of current  $i$ , can be written as a 2<sup>nd</sup> order differential equation by differentiating

$$\frac{d^2 i}{dt^2} + \frac{R}{L} \frac{di}{dt} + \frac{1}{LC} i(t) = \frac{1}{L} \frac{dV}{dt} \quad (4.6.4)$$

The Laplace transform of equation (4.6.4) is

$$s^2 I(s) - si(0) - i'(0) + \frac{R}{L} [sI(s) - i(0)] + \frac{1}{LC} I(s) = \frac{1}{L} [sV(s) - v(0^+)] \quad (4.6.5)$$

and the necessary initial conditions of the circuit at the moment that the switch S closes, i.e. the current  $i$  through the circuit and the voltage  $v$  across the capacitor, are zero, so

$$i(0) = 0 \text{ and } v(0^+) = 0 \quad (4.6.6)$$

and therefore

$$I(s) = \frac{1}{L} \cdot \frac{sV(s)}{s^2 + \frac{R}{L}s + \frac{1}{LC}} \quad (4.6.7)$$

By substituting  $V(s)$  with equation  $V(s) = \frac{V}{s}$  and by using the damping constant  $\alpha$  and the angular resonant frequency  $\omega_0$ , given by equations (4.6.8)

$$\alpha = \frac{R}{2L} \text{ and } \omega_0 = \frac{1}{\sqrt{LC}} \quad (4.6.8)$$

equation (4.6.9) is obtained

$$I(s) = \frac{V}{L} \cdot \frac{1}{s^2 + 2as + \omega_0^2} \quad (4.6.9)$$

and

$$I(s) = \frac{V}{L} \cdot \frac{1}{(s + \alpha)^2 + \omega_0^2 - \alpha^2} \quad (4.6.10)$$

The form of the transient current of circuit depends upon the relative values of  $\alpha$  and  $\omega_0$ .

The underdamped case will be examined in our model as it is the one that corresponds better to the PSC.

In the underdamped case  $\omega_0^2 - \alpha^2 > 0$  and by applying the inverse Laplace transform to equation (4.6.10), the following equation is obtained

$$i(t) = \frac{V}{L} \cdot \frac{1}{\sqrt{\omega_0^2 - \alpha^2}} \cdot e^{-\alpha t} \sin(\sqrt{\omega_0^2 - \alpha^2} t) \quad (4.6.11)$$

This function (4.6.11) of the transient current that flows through an RLC circuit in series when the switch  $S$  closes can model the transient current that flows past the electrodes attached to a marble sample that is subjected to mechanical stress.

### 4.6.3 Model evaluation against experimental data

The transient current of the circuit analysed in the previous section is given by equation (4.6.11) and models the emitted PSC that corresponds to a mechanical stress stimulation of a rock sample. The performance of the model is evaluated in this section against the experimental data recorded by marble samples, which are subjected to repetitive equilasting axial compressional stress ramps of the same level. The experimental setup and thorough details concerning this experiment are discussed in (Anastasiadis, Triantis, & Hogarth, 2007) and are depicted in Figure 4.28.

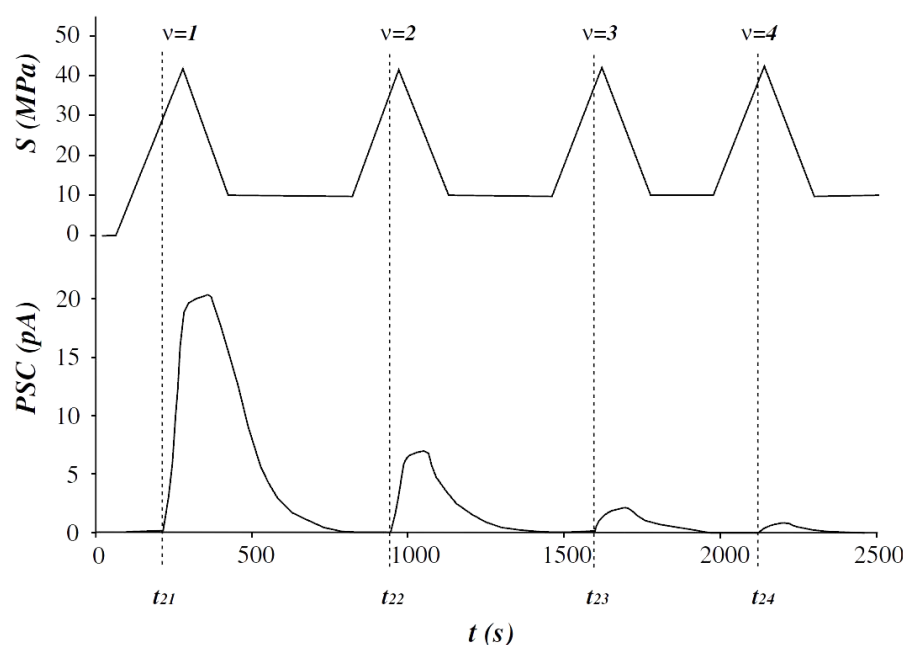


Figure 4.28 The applied stress scheme and the resulting PSC electric signal – taken from (Anastasiadis, Triantis, & Hogarth, 2007)

The total recorded PSC signal during four cyclic loadings in the aforementioned experiment is shown in Figure 4.29a. Each part of the total PSC can be modelled by a linear time-invariant RLC circuit that would create an equivalent current output, in order to emulate the change of the modelled system in each loading step. The current that corresponds to the model output is presented in Figure 4.29b. A set of the parameters  $\alpha$ ,  $\omega_0$ ,  $V$  and  $L$  of the equation (4.6.11) is derived for each loading cycle, which corresponds to a set of R, L and C parameters.

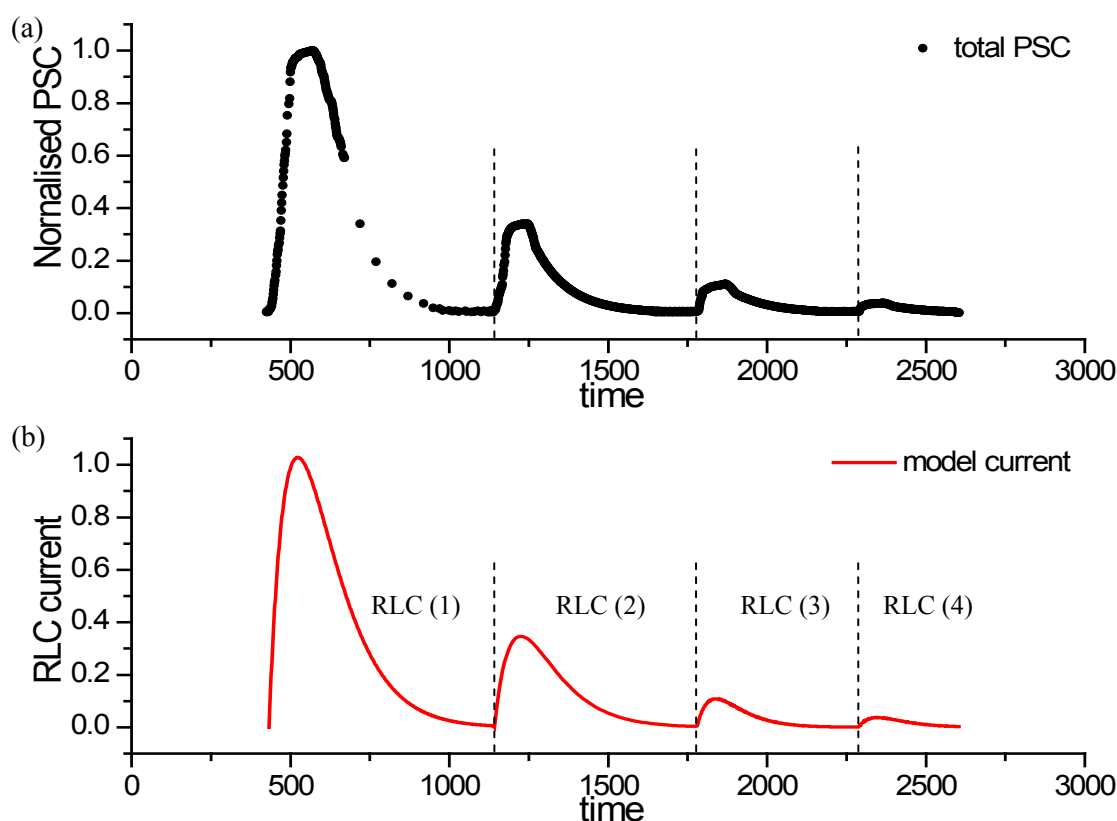


Figure 4.29 (a) The PSC recorded during four consecutive loadings of a marble sample and (b) the equivalent current emitted by an RLC circuit macroscopic model

In Figure 4.29 one may observe the evolution of the experiment and the recorded normalised PSC, as well as the emulated RLC model current. Assuming that the modelled system of the marble sample is invariant during each loading cycle, the total experiment is separated into four parts and each part is analysed separately. The separation is denoted in the graph by perpendicular to x-axis dashed lines and in the case of RLC current an index number indicates the corresponding loading cycle and therefore the circuit instance. It has to be noted that the loading cycles are not equispaced, because criterion of a new loading cycle during the experiment, was the relaxation of the current to practically zero values. The current peaks are significantly lower and despite the relatively slower relaxation mechanisms from step to step, the absolute time for the current to relax is shorter.

The recorded and fitting results of this analysis, in a separate graph for each step are presented in Figure 4.30. The solid black square points represent the recorded PSC values and the red solid line the equivalent model current. The PSC current has been normalized, by division with the maximum PSC peak of the whole signal, thus the graphs in Figure 4.30 present relative values, so there are no units of measurement. The normalisation of the current is a way to overcome the size effects phenomena in current measurements, as the

current is proportional to the size of the crack and therefore to the size of the material sample. The actual information is the trend of the current and not the absolute values in this type of analysis, because each resulting current is examined with respect to the previous one. The model has not any weights for the recorded data which means that peaks are dominant in this approach compared to the relaxation part of the current. The similarity of the model signal and actual data is clearly shown in all graphs of Figure 4.30.

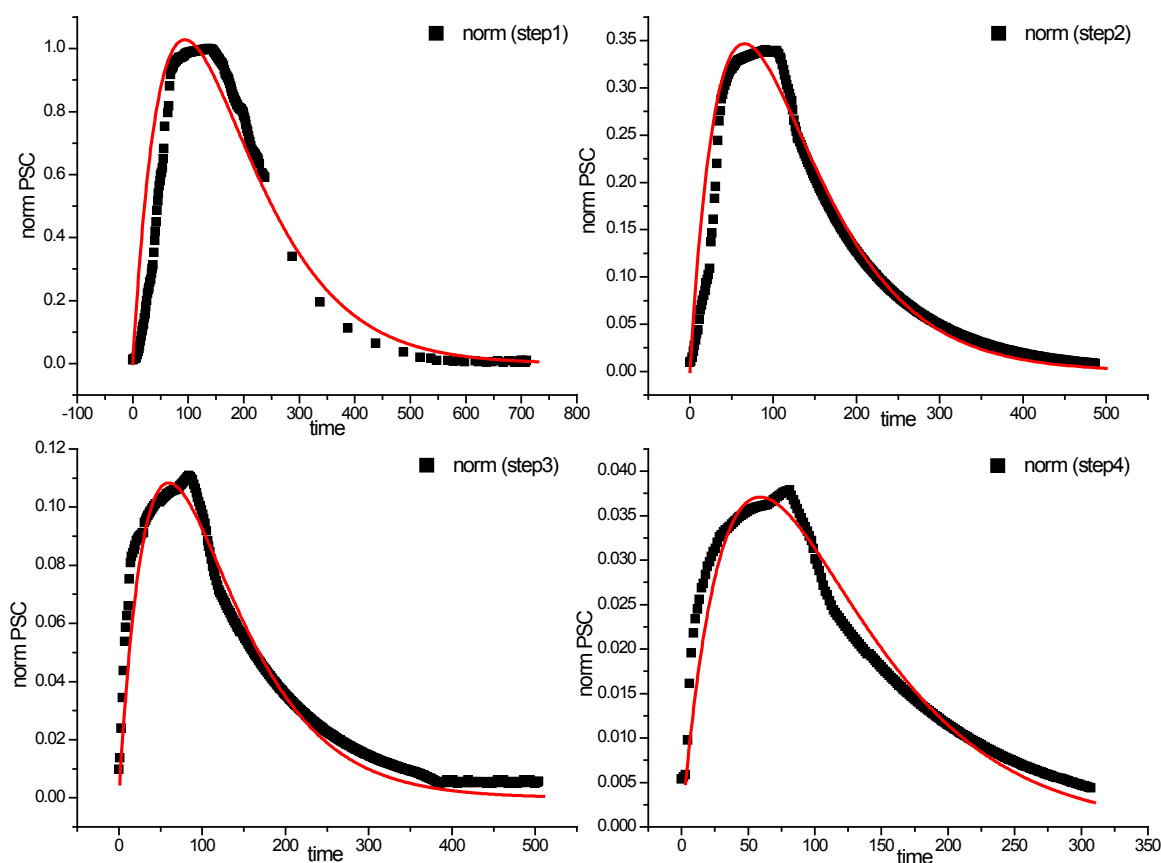


Figure 4.30 PSC recorded data against RLC model current in each loading step

The values of the components of the equivalent RLC circuit for each step are presented in Table 4.3. Note that these values have been calculated for the normalised PSC current and thus information concerning their measuring units and absolute values are of no interest and practical use except of circuit emulation.

Table 4.3 RLC circuit model component values for four loading steps

	Step 1	Step 2	Step 3	Step 4	Exponential trend parameters		
					A	b	Adj. R-square
<b>Resistance (R)</b>	7.11	21.19	67.92	198.38	2.55	1.09	0.99979
<b>Inductance (L)</b>	337.91	692.39	2034.71	5838.22	88.56	1.05	0.99935
<b>Capacitance (C)</b>	25.50	6.15	1.76	0.59	103.21	-1.40	0.99959

A graphical representation of the evolution of the parameters with respect to loading step is shown in Figure 4.31. The evolution of the model parameters follow exponential trend of the form given in equation (4.6.12)

$$y = A \cdot e^{bx} \quad (4.6.12)$$

The correlation coefficients of the exponential trend lines and the actual simulated circuits R, L and C components are over 0.999 and are given alongside with parameters a and b of the exponential equation in Table 4.3.

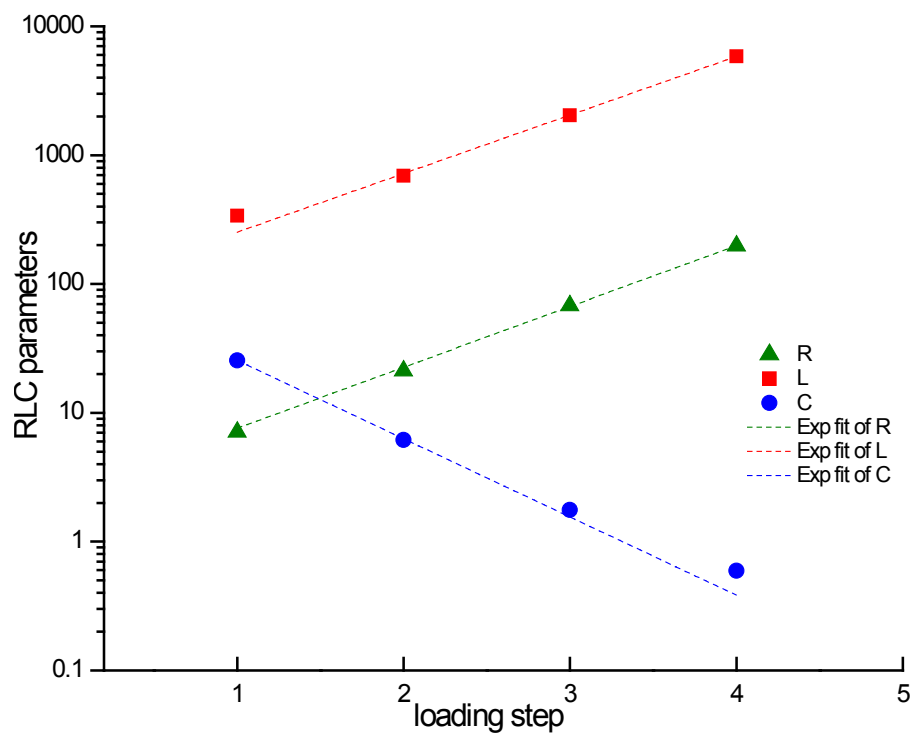


Figure 4.31 The equivalent RLC circuit that models macroscopically the PSC emission system

The  $b$  parameter of equation (4.6.12) depends on the material that is examined and the loading process that has been applied. It can also be used to emulate the experiment as after the initial two loading cycles by evaluating the slope of the graph plotted in log periodic y-axis we can make out the evolution of the system in the following loading cycles. The  $A$  parameter is useful for comparative analysis between experiments as it depends on the performed normalisation of the initially recorded PSC signal.

An equivalence between the components of this circuit model and the properties of the PSC emitting system could be as follows

- R could emulate the relative impedance of the system, which increases over loading step

- L represents the temporary inertia of the system to similar stimuli, emulating the memory effect to dynamic mechanisms. The L increases exponentially in each loading step, as the system memory increases and therefore its reaction to the same stimulus is milder.
- C is the capacitance of the circuit and represents the capacity limit of the mechanical system and specifically the capacity of the system to permanent mechanical defects, i.e. its damage accumulation ability. In each loading step damages occur, thus it is expected that the damage capacity drops.

The above mentioned interpretation of the parameters of the RLC model and their analogy to mechanical properties of the real system of the marble sample is a rational and intuitive correlation and it is just one of the possible approaches.

#### 4.6.4 Benefits and weaknesses of the RLC model

The RLC electric circuit proposed for the macroscopic analysis and modelling of electric signals emitted by mechanically stimulated rock and cement based samples is not a model of the mechanisms of fracture or of deformation and of the underlying physics of failure. It is an engineering model that emulates a complex electromechanical phenomenon with the operation of a 2<sup>nd</sup> order electric RLC circuit. Key advantages of the model are the following:

- The RLC model seems to be able to emulate with accuracy the electric signal emitted, due to a rock sample deformation, in all stages of an experiment.
- The RLC circuit in series is a trivial electric circuit that can be analysed by common differential equations, Laplace Transform or state space analysis, thus it is an easily emulated model requiring minimum computational power and complexity. Circuit simulation can run alongside with the evolution of the experiment and macroscopic comparison of the simulation results and the real time data can provide an early warning signal of failure when considerable difference is observed.
- The fitting results concerning the circuit components' trend of evolution over loading steps are so accurate (adj R-square is over 0.999) that even after two initial steps it is possible to predict the following steps behaviour.
- The time variation of the modelled system is partially solved by this model approach, because by assuming that between successive loadings the system is time



invariant, we can emulate it by a time invariant circuit. The lower the stress of the material sample the more accurate this approach it becomes.

The time variation of the modelled system is considered to be minor between consecutive steps of loading, because the cause of deformation is the additional applied force. However by studying high stress levels it has been experimentally observed that by keeping the material sample under a steady high level stress over time can create new defects that are responsible for detectable deformation changes and high PSC peaks. These cases cannot be modelled by RLC circuit model as considerable variation of the system occurs between consecutive loadings and thus a fundamental model assumption is not valid. Therefore, the basic drawback of RLC model is that it cannot be generalised for every loading level but it works well only for stress levels for which dynamic deformation mechanisms are predominant over permanent deformation mechanisms.

## Chapter 5

### Wavelet based microscopic analysis

## 5 Wavelet based microscopic analysis

### 5.1 Introduction

The initial step for the study of electric signal emitted by brittle materials specimens that are mechanically deformed was the detection and recording of signal using the PSC and BSC techniques in a variety of materials. The next step was the macroscopic analysis of the recorded signal to correlate the mechanical input with the electric signal output of the system (i.e. the brittle material specimen), incorporating the previous mechanical handling according to memory effects analysis. An additional step in the macroscopic analysis led to the correlation of mechanical output (i.e. deformation expressed by material strain) and electric signal output (i.e. PSC or BSC electric signal) according to principles of MCD model.

The deficiencies in some aspects of the electric signal macroscopic analysis showed that a further step in the analysis is needed for more generic and reliable identification of deformation of specimens by means of electric signal emissions, which is the ultimate goal of this work. The relatively novel and powerful mathematical tool of signal processing, known as Wavelet Transform, seems to be the most suitable and universal method to analyse the signal and achieve the final aim, as it will be discussed in the following sections.

### 5.2 System and signal properties

Macroscopic analysis of the weak electric signals stimulated by compression or bending of brittle specimens of rock and cement based materials is thoroughly presented in previous chapter. The attempts to emulate the material samples as systems, which have a mechanical stimulation as input and an electric signal as output, are fruitful under certain circumstances and assumptions. The hypotheses and claims aim to the transformation of the complex problem into a simplified problem, by the decomposition of the system into component systems of manageable complexity.

#### 5.2.1 The properties of the brittle specimen system

The complexity of a total analysis is attributed to the lack of some key properties that characterise simple systems. The basic system properties, following the definitions of systemic approach by (Oppenheim, Willsky, & Nawab, 1997), against which the system is examined in this work, are the following

- *Invertibility* which in simple terms is the existence of an inverse system that when is cascaded with the original system has as output the initial input of the system, seems not to be not a property in this case. Mainly because the input of the original system is mechanical and the output is electrical. Only piezoelectric crystals are known for their property to deform when electric field is applied, which is the inverse process with respect to the piezoelectric process under examination. Rock and cement contain minor quantities of such crystals and such a property is not experimentally verified.
- *Memory* is a property of the system and can be divided into permanent and temporary as thoroughly discussed in previous chapter. The system may turn to memoryless however, if stressed at low compression levels and adequate time intervals are left between successive mechanical stimuli. Therefore, memory of the system is quite complex and adapts to the concept of weights as human memory does rather than the typical dependence of present outputs on previous inputs.
- *Time invariance* is not a property of the system. Considering the ambient experiment conditions (i.e. temperature, humidity, electromagnetic noise etc) as part of the system and thus keep them stable over time, we have eliminated one parameter of system time variation. However the short or temporary memory of the system has been proved in previous chapter to influence the output with respect to the time interval from previous identical input. Therefore the parameter of temporary memory does not permit the system to meet the time invariance property which is by definition  $x[n] \xrightarrow{\Sigma} y[n]$ , then  $x[n-n_0] \xrightarrow{\Sigma} y[n-n_0]$ , because the same input shifted in time results in different output, as proved by experimental data.
- *Linearity* is definitely not a property of the system. First of all, the summation of two inputs of material linear stage, may lead the system in a non-linear stage, where the output is not the superposition of outputs, because the cracking electrification mechanism has been stimulated additionally to the dynamic electrification mechanism. Even if the material is stressed in the linear region, two consecutive identical mechanical inputs in the system generate two different outputs, because of memory effects and therefore a key criterion of linearity, i.e. the output of a sum of inputs is the superposition of the outputs that correspond to each input  $x_1(t) \xrightarrow{\Sigma} y_1(t)$  and  $x_2(t) \xrightarrow{\Sigma} y_2(t)$ , then  $x_1(t) + x_2(t) \xrightarrow{\Sigma} y_1(t) + y_2(t)$ , is not met.

- *Stability* is a property that partially characterises the system. Generally small amplitude loading stimulations within the linear region of materials deformation lead to responses that do not diverge. However, in the case of a system that has been already led to loading levels marginally over the cracking initiation level, an additional small loading may lead to avalanche crack growth and propagation and therefore to unstable behaviour of the system.
- *Causality* or the property of output dependence only on present and previous inputs is a system property. The system is non-anticipative as far as the future value of the mechanical input is concerned and thus future inputs are not of importance for the output. Although this property is not so important in the case of post-processing of the total output signal, for real-time monitoring and simultaneous real time processing is a prerequisite. to depend on which is the dependence

The system complexity as described above makes macroscopic analysis possible only after decomposing of the whole system into Linear Time Invariant (LTI) systems, which can be described by conventional signal and systems analysis.

### 5.2.2 Random process properties of mechanically stimulated electric signal

The mechanically stimulated electric signal in real civil engineering applications as well as in deformation of earth crust during earthquakes is a random waveform. Assuming the random variable  $I_{PSC}$ , then we can define the random process  $I_{PSC}(t, s)$ , according to (Peebles, 2001), where  $s$  denotes the possible outcomes of an experiment. The properties of this random process are key points for the selection of the suitable time – frequency representation and analysis of the signals. Random processes which statistical properties do not change over time are defined as *stationary*, contrary to the *non-stationary* processes. The aforementioned criterion of *stationarity* is not met by the random process that we examine and thus the PSC signals are non-stationary, since their statistical properties (mean, variance, standard deviation etc) are not stable over time.

Additionally, the lack of time invariance of the system that was previously explained, results in *time-varying* phenomena and therefore statistically time varying signals. Such signals studied from the physical point of view have already been classified as *transient signals*, by analogy to the transient phenomena (capacitor discharging etc) and the corresponding waveforms of current and voltage for typical electric circuits. However, the most significant characteristic of the signal is that it exhibits short lived transient components at different scales.

The complexity of the system and the irregularity of the electric signal require a generic and robust analysis in order to filter the signal and focus on the components that reveal fracture phenomena. The microscopic analysis can serve not only as supplementary processing of the recorded signal, but sometime as an autonomous processing procedure to study the mechanical properties of a material sample at various deformation stages. Microscopic analysis, which corresponds to focusing on the short lived transient components of the signal in a variety of scales, can be ideally implemented by the Wavelet Transform.

### **5.3 Continuous Wavelet Transform on PSC signal**

The material specimen system and the yielding mechanically stimulated electric signal properties were examined in the previous section. The irregularity and non-stationarity of the PSC signal does not allow a good performance for Fourier Transform; even at its most advanced form, i.e. the STFT. The ability of Wavelet Transform tool to analyse signals with non non-sinusoidal bases, according to non-uniform tiling schemes is a powerful combination for the success of PSC microscopic analysis. The CWT properties were given in previous chapter, so in the following sections we present the method adaptation to our signal and the criteria of decisions made.

#### **5.3.1 The selection of mother wavelet**

The key advantage of the Wavelet Transform compared to the Short Time Fourier Transform, further to the non-fixed time-frequency resolution, is the capability of selection of a basis other than the typical sinusoidal basis, which is used in FT. The variety of the wavelets to be used as basis for the signal analysis makes the WT a powerful mathematical tool, which is able to be adapted to the particular properties of the signal. Therefore, the decision for the mother wavelet to be applied in the analysis is crucial, because of the dependency of the WT result on the properties of the selected basis (Burrus, Gopinath, & Guo, 1997).

The mother wavelet selection comprises two important stages. Primary stage involves the selection of the wavelet family that best adapts to the signal. The variety of available families and their different characteristics add remarkable flexibility to the wavelets tool, but also increase the influence of the wavelet family selection on the results of the analysis. The secondary stage is only applicable for wavelet families that contain more than one members like Daubechies, Coiflets, Symlets etc., whereas for single member families like

Haar, Morlet and Mexican Hat is not. This stage is easier as it basically lies to the criterion of tile selection or in other words on the time – localisation ability criterion.

The Wavelet Family selected for the analysis of the PSC signals in this section is the Daubechies wavelets (Daubechies, 1992) and specifically the 3<sup>rd</sup> order wavelet of the family. Details concerning the wavelet properties are given in previous chapter. Following we present the basic criteria that led to the choice (Kyriazis, Anastasiadis, Triantis, & Vallianatos, 2006).

- The Daubechies wavelets are orthogonal and can be used as mother wavelets for both Continuous (CWT) and Discrete Wavelet Transform (DWT) analysis. The results presented here yield from CWT which is possible for both orthogonal and non-orthogonal wavelets. However, the property of orthogonality was considered essential for adaptability of the processing with future work on real time applications, for which the DWT is more robust and faster.
- The Daubechies wavelets are complex functions, which means that provide both amplitude and phase information.
- The Daubechies wavelets shapes are not symmetrical and not smooth. Especially the first family members exhibit roughness and lack of any type of periodicity. The sharpness of the wavelets is suitable for analysis of the signals with irregularities as those examined here.
- The fractal structure of the Daubechies wavelets family, which is depicted in Figure 5.1 and discussed in (Daubechies, 1992) and is an important asset for the analysis of the PSC signals that seem to exhibit such properties (Vallianatos & Triantis, 2008), by analogy to other physical phenomena accompanying fracture.

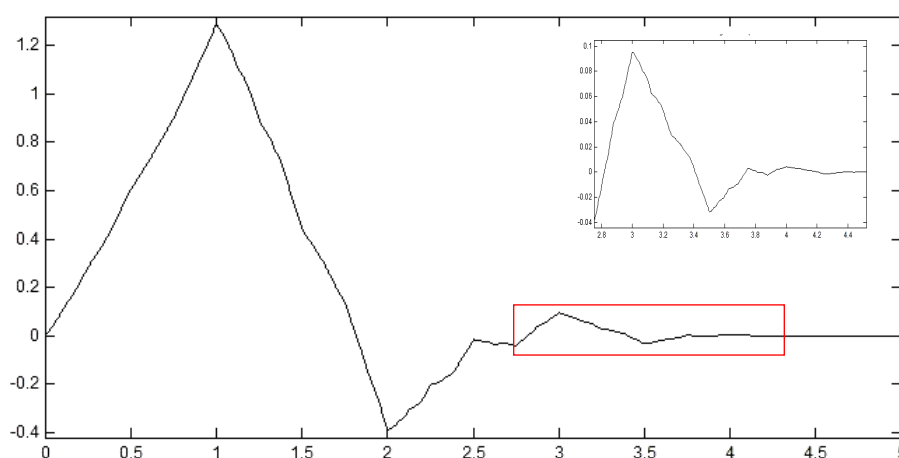


Figure 5.1 The self-similarity (fractal) of the scaling function of Daubechies 3<sup>rd</sup> order wavelet

- The mother wavelet, that seems to be suitable for the signal analysis, is the 3<sup>rd</sup> order Daubechies. As a mother wavelet is quite narrow (the 1<sup>st</sup> of the family known also as Haar Wavelet is the most narrow) and thus is able to provide good time resolution (Torrence & Compo, 1998).

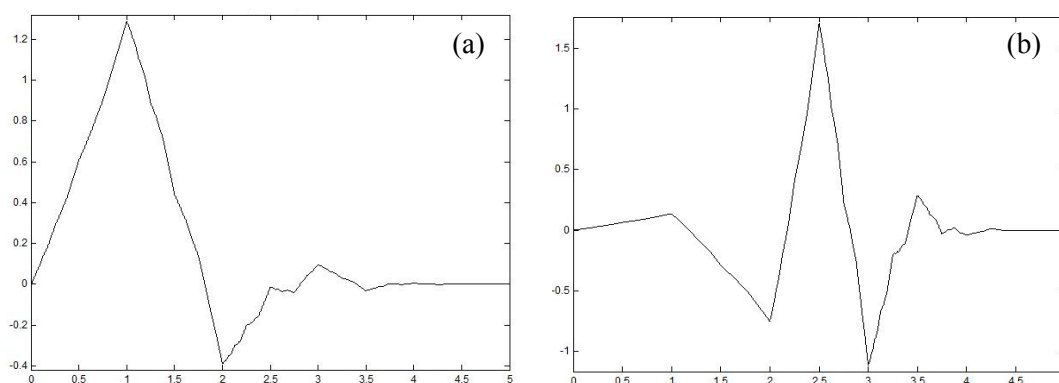


Figure 5.2 (a) The Daubechies 3<sup>rd</sup> order scaling function and (b) the 3<sup>rd</sup> order mother wavelet

Therefore, the selected mother wavelet for analysis of the PSC signal is the 3<sup>rd</sup> order Daubechies wavelet, which is depicted in Figure 5.2.

### 5.3.2 The results of CWT analysis on PSC signal

A set of earlier presented PSC signal measurements recorded from marble samples under compression, which were discussed from the macroscopic point of view in previous chapter, are analysed in this section by means of CWT. The PSC signal evolution in time domain is given in Figure 4.1a. We have applied the CWT on the signal and the results are plotted in the scalogram shown in Figure 4.1b. The algorithm of CWT is implemented in the Matlab Wavelet Toolbox (Misiti, Misiti, Oppenheim, & Poggi, 2005). The idea of ‘scalogram’ is initially presented by (Flandrin, 1988) and it is widely used for spectrum visualisation. The inherent advantage of WT to provide analysis localised in both time and frequency (Farge, 1992) is clearly shown in Figure 4.1b. The localisation of the energy of PSC signal is depicted by the white region of the scalogram. It is possible therefore to identify any peak type turbulence of the PSC signal and isolate parts that contain interesting information (Kyriazis, Anastasiadis, Triantis, & Vallianatos, 2006). The ability of WT to capture simultaneously the details of the signal (high frequency) and the approximation or trend (low frequency), lies on the variable – sized tiles that characterise the windowing technique it uses. Furthermore, CWT is best adapted to the signal because



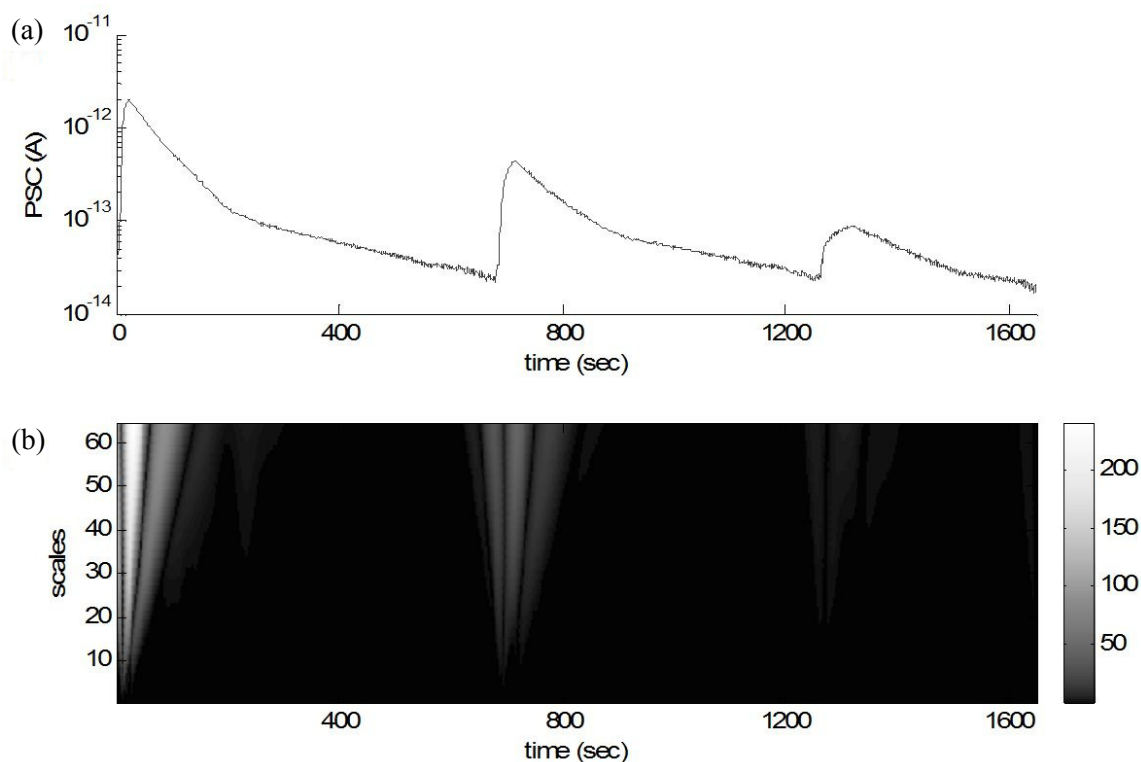


Figure 5.3 (a) Pressure Stimulated Current signal recordings from three successive loading cycles merged in the same graph, (b) Time scale analysis (scalogram) of the electric signal, resulting from CWT – taken from (Kyriazis, Anastasiadis, Triantis, & Vallianatos, 2006)

both the PSC signal emission and the mother wavelets have finite energy, contrary to the infinite energy of sinusoidal function used by FT.

Division of the total experimental recordings according to the energy concentration points so as each part of the signal to contain one dominant peak and analysis of the signal yielding from each loading cycle separately results in the three scalograms presented in Figure 5.4a, b and c.

The analysis of the PSC of the first loading cycle (see Figure 5.4a) shows significantly high coefficient values at large scales (i.e. low frequency), while high frequency coefficients are negligible. The scalogram that yields from the CWT of the PSC signal recorded in the second loading cycle is presented in Figure 5.4b. We can also observe appreciable large scale components, but exhibit slightly different distribution in time compared to the initial PSC signal scalogram. In the second loading cycle, the signal analysis reveals an increase of small components, but at levels that keep them discernible in the scalogram (Kyriazis, Anastasiadis, Triantis, & Vallianatos, 2006). The results of CWT of the third part of the PSC signal are the most impressive because a totally different scalogram yields from the signal processing. The scalogram is shown in Figure 5.4c and

contains prevalent small scale components. Low frequency components still exist (PSC peaks are also observed at this stage) but they are significantly decreased compared to the previous stages and they are surpassed by dominant high frequency components.

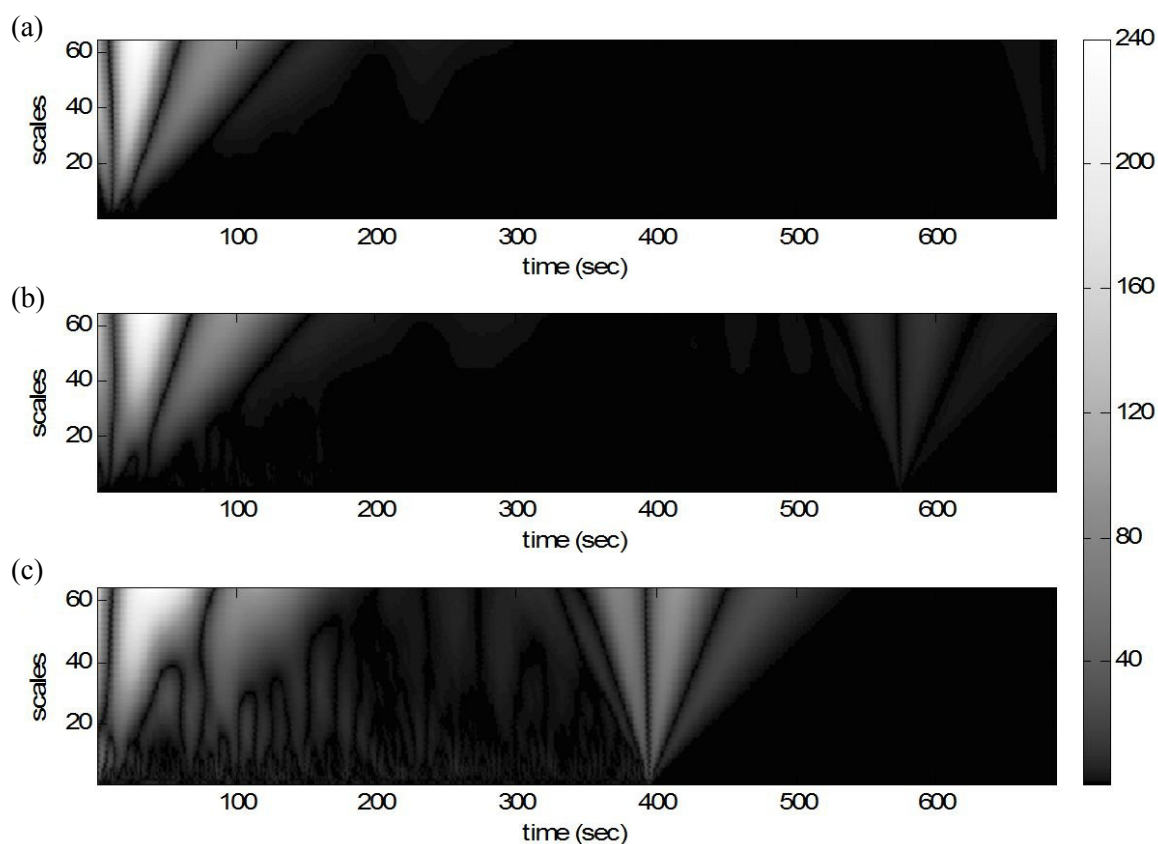


Figure 5.4 Scalograms yielding from CWT analysis of each part of the signal (a) First step (b) second step and (c) third step – taken from (Kyriazis, Anastasiadis, Triantis, & Vallianatos, 2006)

The scalogram that corresponds to the latter part of the PSC signal has fractal form. The manifestation of self-similarity between scales in this scalogram is not coincidence, since fracture of a rock and brittle material in general has been proved to be accompanied by fractal acoustic emissions (Mogi, 1962). Furthermore, the acoustic emissions prior to the failure of rock follow power law (fractal) spatial distribution according to (Hirata, Satoh, & Ito, 1987) and (Turcotte, Newman, & Shcherbakov, 2003). Even, the PSC signal itself has fractal properties as thoroughly analysed by (Vallianatos & Triantis, 2008) and the scalogram serves as visualisation of this property. The fractal form of the scalogram that is produced by CWT analysis of the PSC signal from stressed marble samples was analysed for the first time by (Kyriazis, Anastasiadis, Triantis, & Vallianatos, 2006). The scalograms of various instances of the PSC signal may also serve as criteria for the identification of various deformation stages of a brittle material under mechanical stress, as discussed in the following sections.

## 5.4 The high frequency component of PSC as a failure precursor

### 5.4.1 The key role of frequency on fracture related phenomena

The ultimate aim of the macroscopic and microscopic analysis of the PSC signal is the identification of the time that the mechanically stressed material starts forming microcracks and enters a dangerous zone that may lead it to unstable crack growth and failure. Several criteria based on the macroscopic analysis have been discussed and proposed in the previous chapter, but although such methods are prone to memory and size effects accompanying brittle fracture (Lavrov, 2005). The trends are similar but the vulnerability of the absolute values to the above mentioned effects is a drawback. Furthermore, additional information, as the stain, the stress, the history of applied loading, the size of the material etc, are needed, in many cases, to evaluate PSC signal.

The consistency of the PSC signal relation with the deformation as expressed by strain (i.e. MCD model) verifies that the information is present within the PSC signal and it is maybe possible to form an independent method of material evaluation based only on the PSC signal processing.

The phenomenon that was earlier discussed showing a remarkable high frequency activity once the material is stressed at high levels, beyond the crack initiation point, seems to be the key point. The good matching between typical acoustic emission and PSC signal during a strength test, as well as the common attitude of AE and PSC as far as the memory and size effects is concerned lead us to search for more common points.

A reasonable implication that frequency of the recorded PSC is relevant to the microcrack formation, dimension and propagation by analogy to the relevance of AE with the microcracks formation, seems to be verified by the majority of PSC signal recordings.

### 5.4.2 High frequency component of PSC as a brittle material failure precursor

In this section we try to answer by experimental data analysis, whether the increase of high frequency of the signal is independent of the loading scheme or not. Another point of attention is the role of the material under examination in the results of microscopic analysis. The importance is evident since in macroscopic analysis we observed common trends, but also considerably different absolute values and therefore general conclusions were possible only after the normalisation of measurements and graphs.

The first evidence of the increase of high frequency once the cracking formation starts is given by the recordings from marble specimen that were presented in Figure 5.4. In this experiment the loading was cyclic of the same level and similar rate for each cycle. The

macroscopic analysis of data is given in the previous chapter. Microscopic analysis has shown an increasing high frequency perturbation of the signal in each step, as discussed in previous section.

Another loading scheme that has been previously examined from the macroscopic point of view is that of increasing step-wise form, shown in Figure 5.5a, which also exhibits equal loading rates between cycles. The experiment was conducted in cement based specimen and the observed PSC signal peaks of increasing level are depicted in Figure 5.5b. We have analysed the signal with CWT Daubechies 3<sup>rd</sup> order mother wavelet whose suitability has been already discussed in previous section.

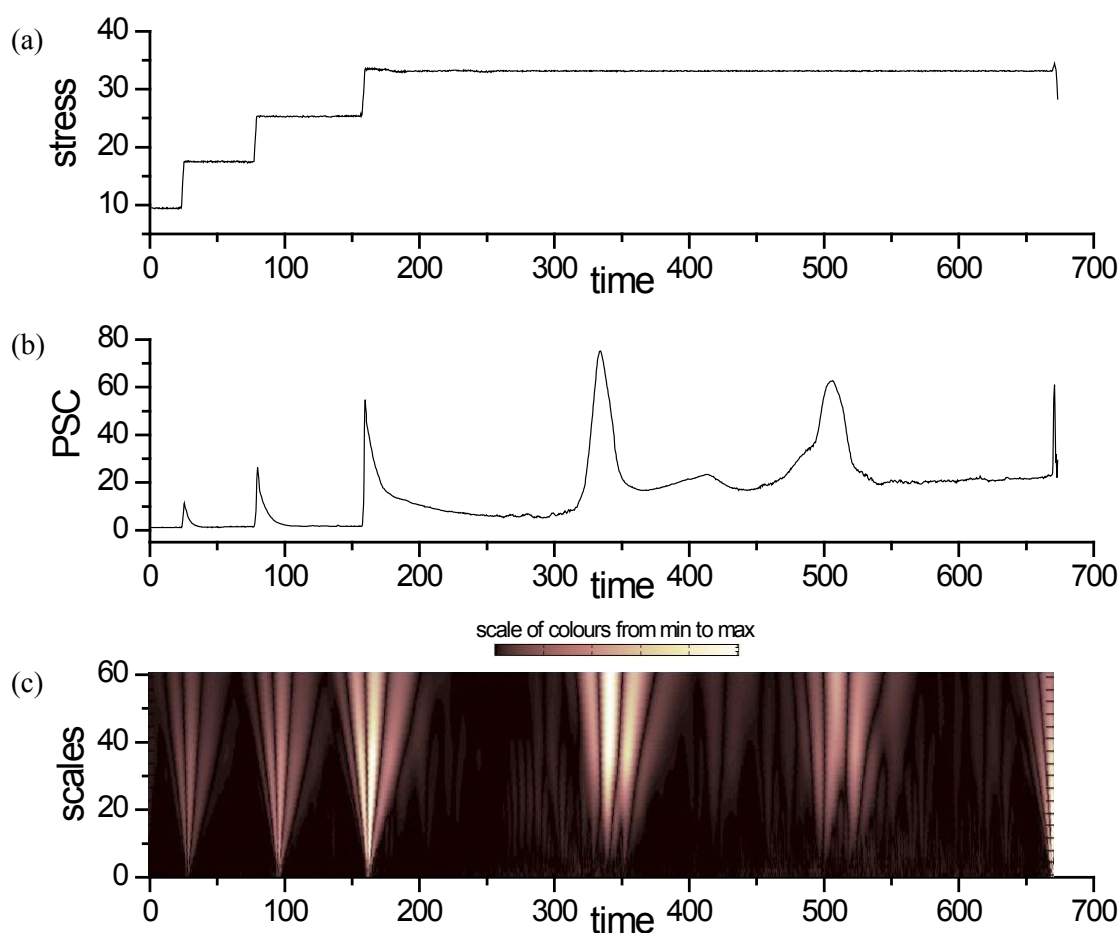


Figure 5.5 (a) Increasing step-wise loading scheme applied on cement specimen, (b) the PSC signal emitted as a result of mechanical stimulation of specimen and (c) the CWT resulting scalogram

Microscopic analysis based on the CWT was performed with the same parameterisation for making the results of the two experiments directly comparable and eliminate any possible influence of scale or mother wavelet. The result of CWT on the signal is given in the scalogram of Figure 5.5c. We note that light and dark coloured areas correspond to high and low valued coefficients accordingly. Generally the scalogram may be considered as a

horizontally mirrored time localised spectrogram, because large scale correspond to low frequency and low scales to high frequency. In the scalogram of Figure 5.5c the increasing of PSC peaks from step to step can be identified by the enlightening of large scales.

A failure critical phenomenon occurs while the material sample is under constant stress i.e. after the third increasing loading step. In time domain the phenomenon is expressed by two consecutive PSC signal peaks that occur despite the trend of PSC signal to relax near to background level. Verification that these signals are not related to noise but to cracking is given by the lack of sharpness in the signals form, but mainly by the slight change of strain that was recorded at the same time. In the time-scale domain, the amplitude of the signal perturbation is expressed by the high valued coefficients in the large scales and the blunt nature of signal by the lack of high valued coefficients at low scales or more precisely the lack of concentration of the signal energy. The PSC signal peaks are themselves failure precursors, but “is there any precursor of the precursor?” is a really challenging question.

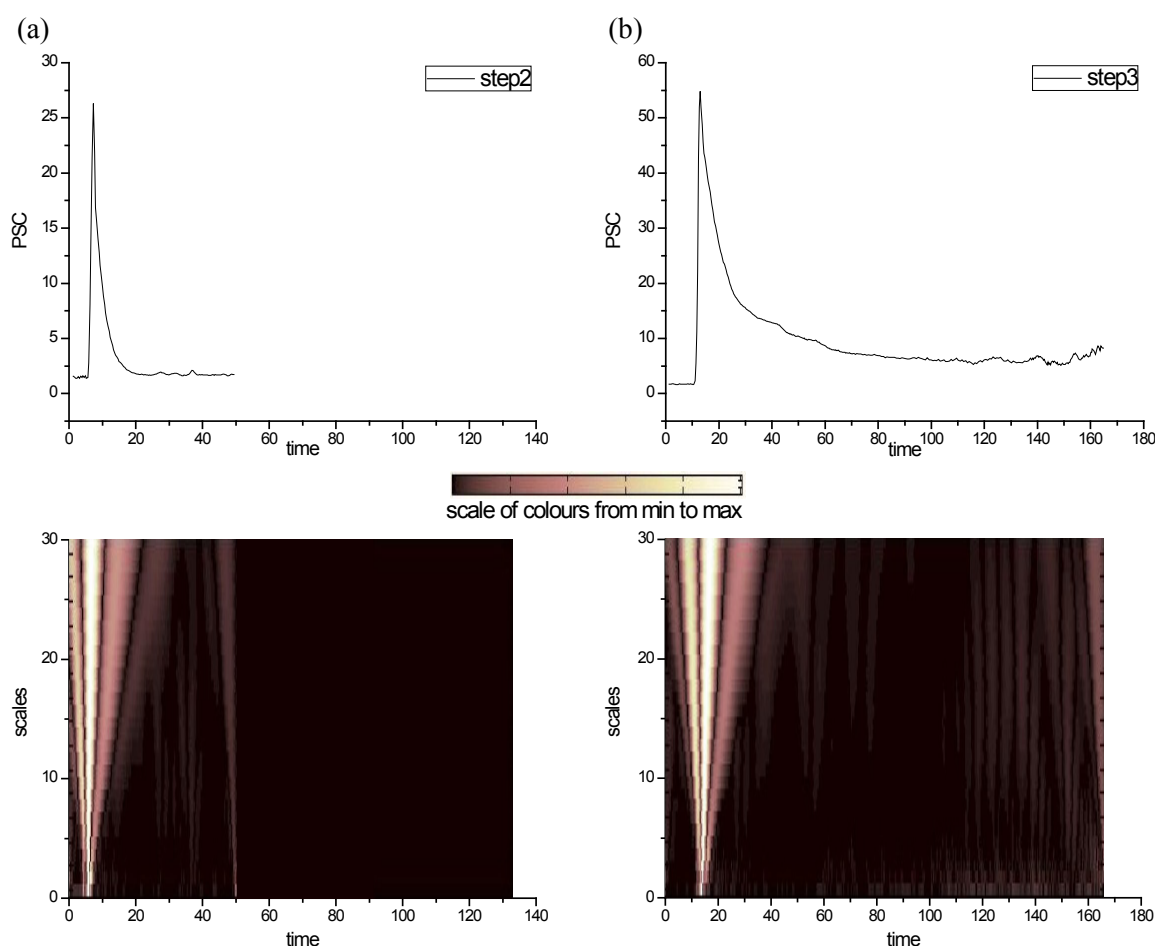


Figure 5.6 The evolution of PSC signal after the 2<sup>nd</sup> and 3<sup>rd</sup> loading steps in time domain and the corresponding scalograms yielding from CWT analysis of the signals using the same parameterisation

Brittle fracture related theories (Bieniawski, 1967) (Paterson & Wong, 2005) that were examined in previous chapter converge to a model that the stage of microcrack creation is followed by the clustering of microcracks to macrocracks and finally macrocracks clustering leads the material sample to failure. In cases of not severe and quick events, like the case we examine, these stages are possible to distinguish. Assuming that the PSC peaks after the 3<sup>rd</sup> step correspond to macro crack clustering we have to search for the microcrack clustering stage and the microcrack creation stage. Considering the length of the created cracks as the parameter that connects to the frequency of the emitted PSC signal, and by broadly dividing the scales to three regions (i.e. micro, meso and macro scales), we should look at meso and micro scales for precursors of the PSC peak precursor of failure.

Therefore, we focus on the recordings of PSC signal before the peak occurrence under constant stress. Even from the scalogram of Figure 5.5c high frequency components are observed after the 250sec in the experiment evolution, followed by medium frequency components, while at about 300sec low frequency components can be distinguished. The PSC signal of the 2<sup>nd</sup> and 3<sup>rd</sup> steps are plotted in Figure 5.6 and their CWT scalograms are given for comparison. The difference between them is obvious. During the relaxation process of the 2<sup>nd</sup> step no medium or high frequency are present, while the 3<sup>rd</sup> step relaxation not only lasts longer but also contains significant medium and high frequency components, which are localised in time closely to the forthcoming peak occurrence.

Summing up, the macroscopic trends of PSC signal peaks between the experimental results presented in Figure 4.1 and those in Figure 5.5 are completely different, although we know that in both cases the material is stressed at non-linear regions and cracking has occurred. However, the common characteristic of both PSC signals is the increase of medium and high frequency components of the signal. The scalograms yielding from CWT of the signals are shown in Figure 5.4 - Figure 5.5c and reveal the microcracks creation and clustering, as well as the forthcoming failure by localising the failure related components of the signal in time-scale domain.

### **5.4.3 The identification of stages of deformation by means of CWT**

In the previous section we discussed the possibilities of wavelet analysis to identify the high and medium frequency components of the signal that become significant during fracture of the material. Using this idea, we have linked the output of the system (i.e. the deformation of the material) with another output the electric signal emission by sample during deformation, without regard to the input trends and level.

Towards the creation of a universal tool of analysis we expand our conclusions from the non-linear deformation stage to the complete process of the deformation of a specimen from pristine stage to failure stage. Such experimental PSC signal recordings are presented in Figure 5.7a. The PSC signal is the result of a variable mechanical input that finally leads the materials to rupture. We have selected the 10<sup>th</sup> Daubechies wavelet for a better frequency resolution in the CWT analysis. The scalogram yielding from the CWT is given in two forms 2D and 3D in Figure 5.7b and Figure 5.7c accordingly.

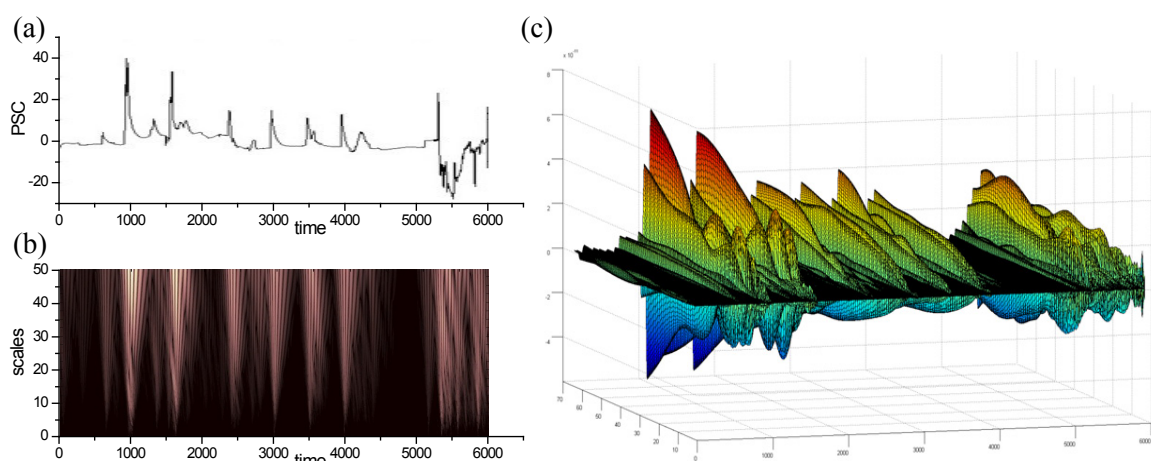


Figure 5.7 (a) Time domain PSC signal recordings from specimen subject to mechanical loading of variable scheme, level and duration (b) CWT scalogram (2D) analysis of the total PSC signal and (c) the CWT scalogram (3D) expressing the coefficient values by colour and surface perturbation

The scalogram generated by CWT analysis of the PSC signal seems to be an enabler for real time identification of the deformation stage of the material sample by evaluating the frequency components of the signal and their relationship with respect to present time and recent history. The PSC signal response of the marble sample shown in Figure 5.7 is representative of a series of experiments in brittle materials. The conclusions made by the CWT analysis on such signals can be summarised in the following points.

- The initial mechanical stimuli lead to pre-existing crack closure (Bieniawski, 1967) and this is depicted by the high frequency components of the signal during the first stimulations regardless of their level.
- For initial stages of deformation (within the linear region) the low frequency components are comparable to the strain of the material.
- PSC signal peaks that occur because of mechanical stimulation (i.e. stress rate  $\frac{d\sigma}{dt} \neq 0$ ) can be identified by the concentration of high frequency components and the lack of high and medium frequency signal before their occurrence.

- PSC signal peaks that occur because of macrocrack clustering and propagation occur after high frequency signal ‘activity’ and their high frequency component is dispersed in time compared to the stimulation oriented peaks. The low frequency components are comparable in these cases.
- Small scale coefficients vanish in the intermediate stages of deformation, because microcracks have already been created and the additional energy which is offered to the sample by means of stress stimulates first the clustering and propagation mechanism and second the new microcrack creation. Short time interval small scale components appear also before its major clustering process.
- In the final stages of deformation which may last longer once the energy offer to the system is not abrupt a signal that exhibits significant components in all scales is observed and this is an indication of instability that is known to occur at this stage.

The Continuous Wavelet Transform was used as a tool for time scale analysis of the PSC signal and has been proved useful to extract in real time all the information that the PSC signal contains which is related to the deformation stages it goes through from its pristine stage to its failure. In the future, a real-time monitoring system and early precursor of failure based warning system may rely on the CWT analysis and evaluation of the PSC signal in civil engineering and earthquake prediction applications.

## **5.5 The WT as a tool for non-destructive fracture identification**

The Continuous Wavelet Transform was proved a suitable mathematical tool for the real-time analysis of electric signal stimulated by mechanical loading. In this section we will present a signal processing method based on CWT for the identification of imperfections of rock specimens, caused by fracture. This can be considered as a non-real time post processing method and may serve as basis for the creation of a non-destructive testing technique.

### **5.5.1 Dielectric spectroscopy and ac conductivity time series**

Dielectric spectroscopy may be considered as one of the most widespread methods for material characterisation according to their physical properties. Comprehensive explanations and references on various applications are given in standard books by (Barsoukov & Ross, 2005) and (Jonscher, 1983). The electric impedance spectroscopy has been used for the detection of fracture and microcracks in rock samples (Nover, Heikamp, & Freund, 2000) and (Mitritsakis, Stavrakas, Maurigiannakis, Anastasiadis, Triantis, &



Agioutantis, 2006) as well as for the of the stress-strain behaviour of rocks subjected to triaxial deformation (Glover P. W., Gomez, Meredith, Boon, Sammonds, & Murrell, 1996). Focusing on a specific parameter and its evolution in time, i.e. the time series behaviour, has been also proved valuable for understanding metastable phenomena in Europium, Neodymium and Holmium nitrate crystals, as analysed in the works by (Kawashima, Kawasaki, & Isoda, 1996) (Kawashima, Fukase, & Isoda, 1996) (Kawashima, Haruki, Takigashira, & Isoda, 2004). Time series of ac conductivity have been also used by (Hloupis, Stavrakas, Saltas, Triantis, Vallianatos, & Stonham, 2005) to identify by means of wavelet analysis the contamination in low porosity marble samples. The next reasonable step that would combine all the aforementioned research effort would be the ac conductivity time series recording and evaluation through wavelet analysis for the detection of stress induced imperfections in rocks (Kyriazis, Anastasiadis, Triantis, & Vallianatos, 2006) and (Kyriazis, Anastasiadis, Triantis, & Stonham, 2006). Key points of this work are presented in the following sections.

### 5.5.2 Experimental recordings and pre-processing of the signal

The initial goal of this work was to introduce a computational non-destructive method to identify the deformation stages of brittle materials. Simplifying the problem we will derive a method to distinguish between damaged and pristine rock samples by analysing with CWT the time series of ac conductivity.

Therefore two groups of Dionysos marble samples were created, with the same dimensions and similar mechanical handling history. The samples of the first group remained pristine while the members of the second group were mechanically stressed so as to intentionally create microcracks. External ac field of 30kHz was applied and the ac conductivity time series were recorded for both groups by using an LCR meter (Agilent 4284A) and the measurement interface fixture for dielectric tests (Agilent 16451B). The case for measurements was shielded for not being interfered by ambient noise.

The macroscopic changes of ac conductivity are influenced by a number of parameters, but the analysis of their values and trends is out of the scope of this work. Therefore to eliminate these trends the initially recorded time series were detrended according to equation (5.5.1)

$$\Delta\sigma_{ac}(t) = \sigma_{ac}(t) - \langle \sigma_{ac}(t) \rangle \quad (5.5.1)$$

where

$\Delta\sigma_{ac}(t)$ , is the detrended ac conductivity

$\sigma_{ac}(t)$ , is the original recorded signal and

$\langle \sigma_{ac}(t) \rangle$  is a smoothed (sliding window moving average algorithm) version of the original signal.

The resulting detrended ac conductivity time series for both compressed and uncompressed samples are presented in Figure 5.8. No apparent macroscopic differences can be observed in the time domain therefore frequency domain analysis is applied. Fourier Transform would have been used, unless the signals under examination had not failed the Gaussian distribution of the detrended ac conductivity criterion of stationarity suggested by (Theiler, Eubank, Longtin, Galdrikian, & Farmer, 1992) and (Popivanov & Mineva, 1999).

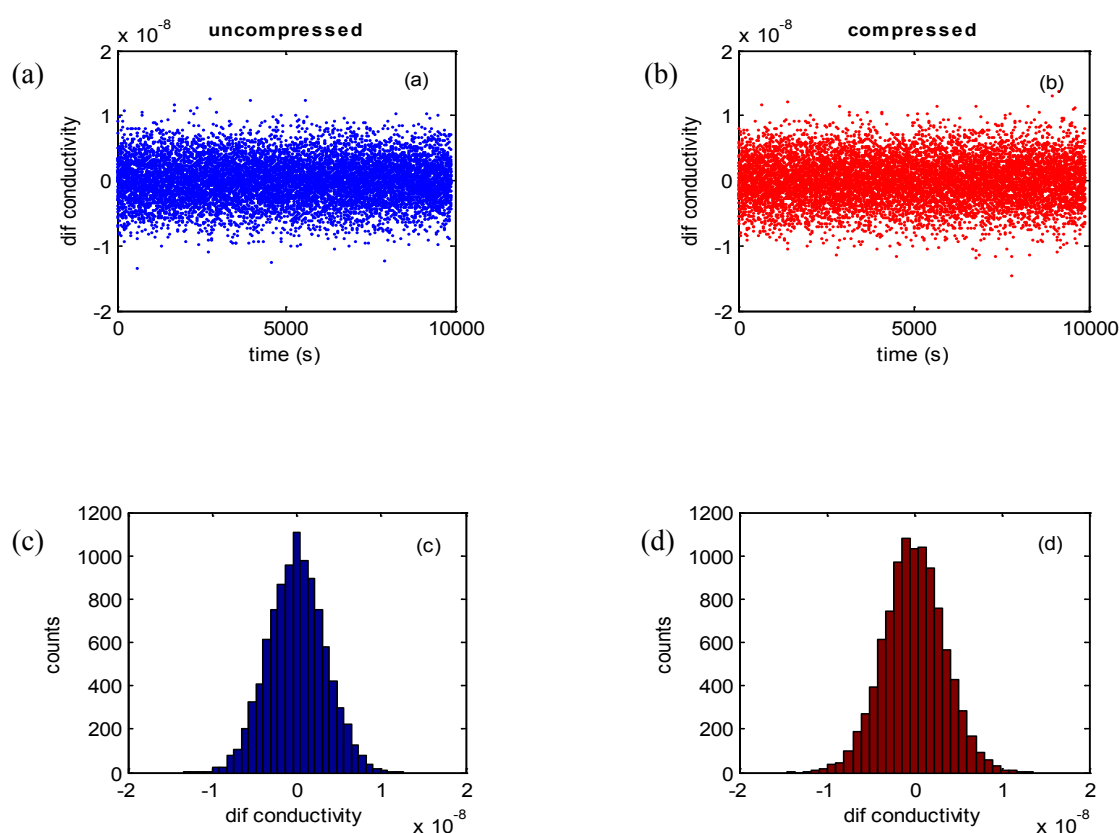


Figure 5.8 The detrended ac conductivity time series for (a) uncompressed and (b) compressed samples, distribution of detrended conductivity time series for (c) uncompressed and (d) compressed samples – taken from (Kyriazis, Anastasiadis, Triantis, & Stonham, 2006)

The distributions of the detrended conductivity for the uncompressed and compressed samples are presented in Figure 5.8c and d accordingly. Generally the wavelet analysis by CWT is more safe in the case ambiguity about the stationarity of a signal exists as it is both applicable for stationary and non-stationary signals (Daubechies, 1992). Thus wavelet transform was chosen as the appropriate tool for our analysis (Kyriazis, Anastasiadis, Triantis, & Stonham, 2006).

### 5.5.3 Mother wavelet selection for spectral analysis

In this section we discuss the technique used for analysis of the signal, towards the differentiation between the two groups of samples i.e. compressed and uncompressed. The signals were analysed in time-scale domain using the Continuous Wavelet Transform. It was selected over the Discrete Wavelet Transform because it is applicable regardless of the properties of the mother wavelet i.e. compactly supported orthogonal or not. The 2nd derivative of the Gaussian probability density function, known as “Mexican Hat”, has been selected for analysis in the relevant work by (Hloupis, Stavrakas, Saltas, Triantis, Vallianatos, & Stonham, 2005). As far as its basic properties, the Mexican Hat is infinitely regular, not orthogonal and symmetrical. The arbitrary regular, orthogonal, with prominent asymmetry family of Daubechies wavelets (Daubechies, 1988) is the alternatively used for our analysis.

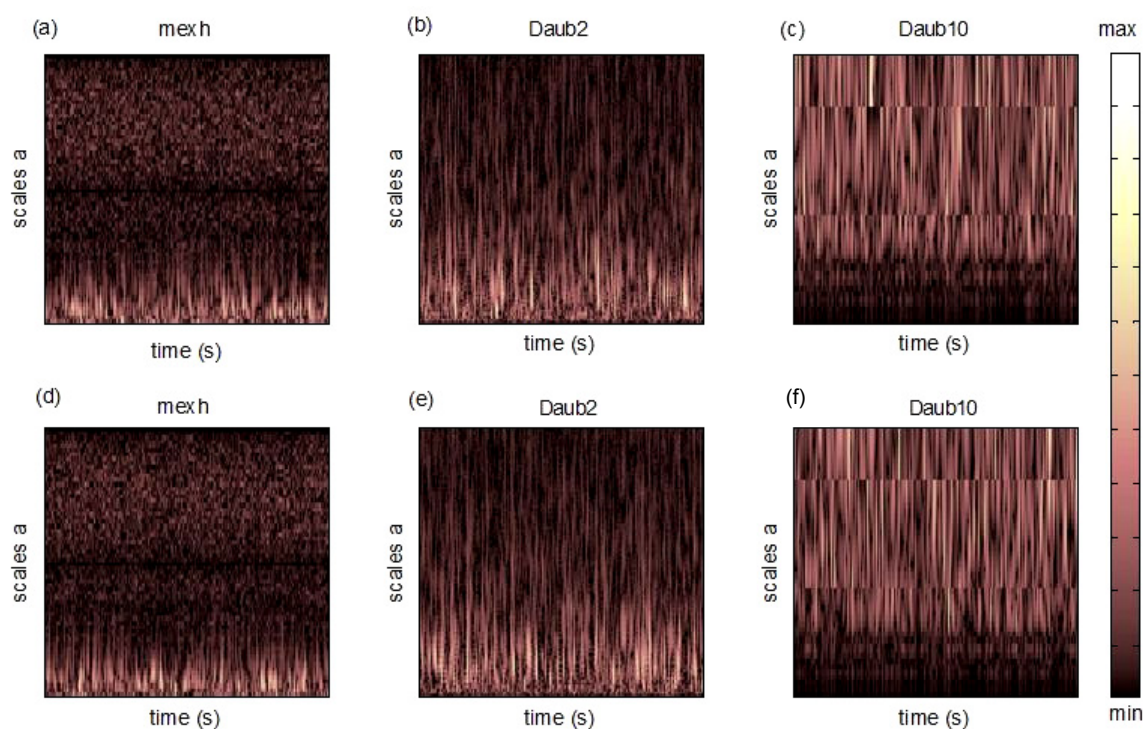


Figure 5.9 Scalograms yielding from CWT of ac conductivity time series of uncompressed (a), (b), (c) and compressed samples (d), (e), (f), by using Mexican Hat, Daubechies 2nd and Daubechies 10th order, as mother wavelets accordingly – taken from (Kyriazis, Anastasiadis, Triantis, & Stonham, 2006)

The Mexican Hat and two members of the Daubechies wavelets family (the 2nd and the 10th order) were used as mother wavelets for the CWT analysis and the resulting scalograms are presented in Figure 5.9a, b and c for the uncompressed and in Figure 5.9d, e and f for the compressed specimens. Differences due to the selected mother wavelet are

obvious in the scalograms, while existing differences between scalograms of compressed and uncompressed samples need expertise in wavelets and focused observation to discern. In order to get a clearer picture of these differences, the wavelet power spectrum is calculated as proposed by (Torrence & Compo, 1998). The CWT analysis refers to time-scale domain; therefore calculation of spectral information of the signal has as prerequisite the transformation of scale to frequency. The centre frequency  $F_c$  of the wavelet is calculated according to suggestions by (Abry, 1997) and the frequencies that correspond to scales are given by equation (5.5.2)

$$F_a = \frac{F_c}{a \cdot \Delta} \quad (5.5.2)$$

where  $a$  is the scale,  $\Delta$  is the sampling period,  $F_c$  is the centre frequency of the wavelet in Hz and  $F_a$  is the pseudo-frequency that corresponds to scale  $a$  as defined in (Misiti, Misiti, Oppenheim, & Poggi, 2005).

The last step of the analysis involves the calculation of the wavelet power spectrum for each case and the graphical representation of the spectra in frequency-amplitude domain by typical spectrograms shown in Figure 5.10 .

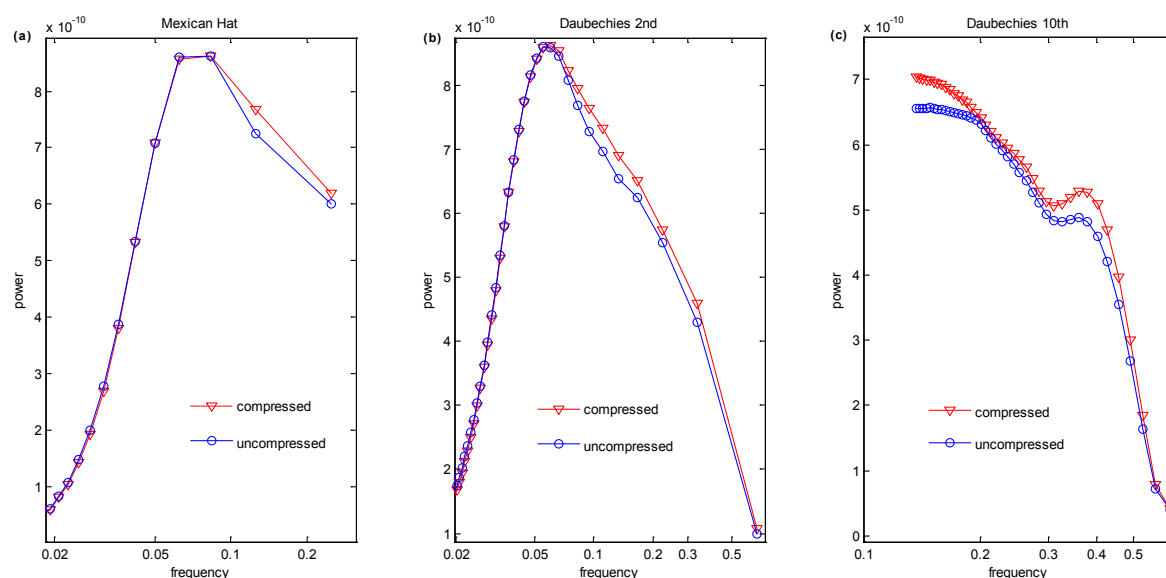


Figure 5.10 Calculated wavelet power spectra of uncompressed and compressed samples using (a) Mexican Hat, (b) Daubechies 2nd and (c) Daubechies 10<sup>th</sup> order as mother wavelets accordingly – taken from (Kyriazis, Anastasiadis, Triantis, & Stonham, 2006)

The power spectra values regardless of the mother wavelet selection are higher for compressed samples, which is probably related to the microcracks created in the material

during stress. It must be noted that the Daubechies 10th mother wavelet depicts better the difference between compressed and uncompressed samples and thus it is suggested as more suitable for relevant computational methods. The reason lying behind is that the Daubechies 10th is wider in time and thus it provides better frequency resolution as shown in Figure 5.10 and poor time resolution compared to both Mexican Hat and Daubechies 2<sup>nd</sup> order. Note that frequency axes are logarithmic in all graphs of Figure 5.10, but they cover different frequency areas as they arise from the wavelet analysis with different mother wavelets. Note also that between the samples of the same group, i.e. uncompressed or compressed, the power spectra are identical and thus are not presented in Figure 5.10, in order to have as concise representation as possible.

The results are presumable according to other researchers results (Hloupis, Stavrakas, Saltas, Triantis, Vallianatos, & Stonham, 2005), which are related to contamination. The spectral content of time series of contaminated rocks has been proved to be different compared to the pure rocks corresponding spectrum. The mechanical deformation beyond the crack initiation stress level causes the formation of microcracks in marble samples. Under typical ambient humidity conditions, such microcracks can entrap water and thus the material is “contaminated”. The effect of contamination in ac conductivity time series as studied by (Hloupis, Stavrakas, Saltas, Triantis, Vallianatos, & Stonham, 2005) alongside with the dependence of dielectric behaviour of rocks on the water content (Vassilikou-Dova, Siakantari, Kyritsis, Varotsos, & Pissis, 1999), can justify the observed difference in the wavelet spectra. The difference is not outstanding, however we should take into account the small dimensions of the specimens that delimits the microcracks concentration and therefore the amount of water that can be absorbed. The size effects may influence the aforementioned spectral difference, which is expected to be pronounced for bigger specimens. Thus, we can conclude that the wavelet power spectra calculated from measurements of ac conductivity time series can reveal distinguishable spectral differences between compressed and uncompressed marble samples and allow the characterization of the material according to the fatigue it has suffered. Daubechies 10<sup>th</sup> order was proved to better depict the aforementioned differences compared to Mexican Hat and Daubechies 2<sup>nd</sup> order mother wavelets. Despite the fact that the selection of the mother wavelet is important, the differences between compressed and uncompressed samples are systematic and consistency verifies that conclusions are not biased because of the selected mathematical tool.

## Chapter 6

### Conclusions and Future work

## 6 Conclusions and Future work

In the last chapter of the thesis we recapitulate by focusing on the main conclusions of this work. We also propose some guiding lines for the next research steps, as well as ideas on possible future research projects on the topic.

### 6.1 Conclusions of this work

The generic conclusions that have been made after having evaluated the total work are presented in this section, by means of the specific conclusions that substantiate them.

- Electric signal flows out of brittle material samples whenever their mechanical state changes, as expressed by means of their strain variation.
  - ❖ Electric signal is emitted by brittle material samples that are subjected to either compressive or tensile mechanical stress, of any level.
  - ❖ Electric signal emission is the result of the application of mechanical stimuli on brittle material samples. Electric signal occurrence in both loading and unloading is justified by the definition of mechanical stimulus as the mechanical input variation, either increasing or decreasing, of a material sample system.
  - ❖ Electric signal is also emitted by brittle material samples that are under high constant stress, when the equilibrium of strain energy changes (expressed by a slight increase in strain despite the constant stress).
  - ❖ The MCD model prediction about the proportionality between electric signal and strain rate (i.e.  $i_{PSC} \propto \frac{d\varepsilon}{dt}$ ) seems to be verified by experimental data for stress levels from 0.2 to 0.9 of the total material strength. A direct relation seems to exist between strain and electric signal, either the supported mechanism of moving charged dislocations (MCD model) is the cause of electrification or not.
  
- The BSC and PSC experimental techniques are used for the detection of the above mentioned electric signal in bending and compression accordingly. They can also provide information about the electrical perturbation, which is correlated to the cracking processes and generally to the strain of a brittle material.

- ❖ The experimental techniques require the physical contact of sensing elements (electrodes) to the material and therefore are less prone to noise compared to electromagnetic techniques.
  - ❖ Noise cancelation techniques have been used to confront with the known sources of noise in the very low electric current measurements.
  - ❖ The electric signal exhibits low values but it is also characterised by consistency. Therefore, it can be considered reliable, especially when taking into account that other researchers have also detected similar signals.
  - ❖ The good space localisation of measurements is assured by the extremely low conductivity of specimens and thus a good resolution in the analysis of the mechanical state of a specimen is possible by multiple measuring channels through PSC and BSC techniques.
- 
- The PSC experimental technique, which involves electrical stimulation by means of externally applied DC voltage additionally to the mechanical stimulation, has improved experimental results.
    - ❖ The electric signal that is recorded due to the same cracking events retains the same macroscopic pattern and evolution when it is boosted by means of a DC voltage.
    - ❖ The measurements with electrodes that are used for conventional PSC technique are not affected by the existence of measuring electrodes that are used for the amended PSC technique in the same specimen.
    - ❖ No mutual coupling between electrodes is observed, even after the application of 500V DC voltage, which corresponds to more than 3 orders of magnitude difference between neighbouring measuring channels.
    - ❖ The high frequency component of the electric signal that seems to be correlated to microcracking is boosted because of the existence of external voltage and therefore cracking events are better depicted by this innovative technique.
- 
- The recorded electric signals due to any external mechanical stimuli exhibit common macroscopic patterns.
    - ❖ The reaction of a brittle material to a mechanical stimulus is the emission of a single peak electric signal.



- ❖ The peak value of electric signal is followed by a complex relaxation process that enables the smooth decrease of the electric signal to the background level.
  - ❖ The relaxation process can be analysed into two exponentially decaying relaxation sub-processes. The former, which starts after the peak occurrence, is faster compared to the latter, as expressed by their relaxation times.
- 
- The macroscopic analysis has revealed the trends of the basic parameters of the electric signal evolution and allows the analysis through a modelling framework and the creation of criteria for failure prediction.
    - ❖ The pattern of the electric signal due to a single mechanical stimulus can be mathematically expressed by the Generalised Extreme Value Distribution.
    - ❖ The recorded BSC signal from an experimental process of step-wise increasing loading exhibits electric signal peaks, which correspond to the steps. Such peaks can be modeled by considering their evolution as a result of two different processes. The superposition of a process that corresponds to the tensed region of the beam and of a process for the compressed region seems to accurately model the experimental data.
    - ❖ The occurrence of a saddle point in the cumulative distribution function of the corresponding electric charge energy of the BSC signal can serve as a failure criterion.
    - ❖ The severe decrease of PSC peaks during cyclic loading may serve as criterion of fracture. The comparison margin is the decrease rate of PSC peaks of an equivalent experimental process at a loading level that does not allow cracking (marginally). The PSC decrease rate of any experimental process that involves cracking would be higher than the above-mentioned one.
- 
- The RLC model can be used as an electrical equivalent for emulation of the aforementioned generic signal pattern.
    - ❖ Each instance of the signal corresponds to an equivalent RLC circuit assuming that during a loading cycle the system is time invariant.
    - ❖ The R, L and C parameters of the system follow an exponential evolution over steps, for the data that we have experimentally record. Specifically R and L parameters increase and C parameter decreases.

- ❖ The RLC circuit is a common electrical circuit and it has been analysed in the past with a variety of analytical and numerical methods. Thus, through electrical circuit simulator software, the real time macroscopic comparison of experimental and emulation data during an experiment would be possible.
  - ❖ The presented RLC analysis in this work refers to a specific set of experimental data, but it can be applied to any set of mechanically stimulated electric signal data.
- The evolution of mechanically stimulated electric signal is influenced by memory effects in cyclic loading.
- ❖ Two types of memory, namely the temporary and the permanent have been revealed by analysis of experimental data. Permanent memory cannot be erased and affects the electric signal severely, while temporary memory is time-dependent and has generally milder effects on signal.
  - ❖ The trends of memory effects are similar for different brittle materials (marble and amphibolite).
  - ❖ The effects of damage and memory on the macroscopic parameters of the electric signal are similar and may lead to misleading conclusions about the material strength.
- The electric signal memory effects exhibit similar features and trends with acoustic emission memory effects, as well as with other physical properties that vary during fracture.
- ❖ The decay of memory effects with respect to time, which is more evident for temporary memory.
  - ❖ In cyclic loading of the same level the greatest difference in the electric signal is observed between the first and the second cycle.
  - ❖ The decrease of the electric signal peaks.
  - ❖ The increase of response delay to the stimulus, expressed by the time interval between the stimulus and the electric signal peak occurrence.
  - ❖ The increase of the relaxation time of slow relaxation process in every cycle.
  - ❖ The decrease of the detected electric energy (charge  $Q$ ).
  - ❖ The elimination of memory effects in case of minor changes in the principal axis of the stress, i.e. change of position between successive loadings).

- The materials which are experimentally tested have impacts on the mechanically stimulated electric signal properties.
  - ❖ Electric signal emission macroscopic characteristics seem to be universal for every brittle material. Therefore regardless of the brittle material under examination qualitative results of the electric signal show similarities.
  - ❖ Quantitative electric signal results show differences, even for the same type of materials depending on the extraction point for rocks and on the details of the preparation of mixture for composite materials based on cement.
  - ❖ PSC emissions of marble exhibit lower amplitude than the corresponding PSC emissions of cement paste.
  - ❖ BSC emissions of cement exhibit faster relaxation times compared to the FRP electric emissions in bending.
  - ❖ Amphibolite has a better ability to memorise mechanical handling, probably because of its higher capacity in microcracks.
  - ❖ The normalisation of the electric signals enables the results to be comparable. Therefore, in this work the materials are regarded as equivalent from the electric perturbation point of view. Attention is not given on the exact values of the signal, since they are size dependent and are influenced by many parameters.
  
- The microscopic analysis refers to the evaluation of the signal for narrower time intervals, which is possible through Wavelet Transform.
  - ❖ Continuous Wavelet Transform can provide the time resolution that is needed in real time applications.
  - ❖ The analysis of the signal in time–scale domain, as depicted by the scalogram, reveals the high, medium and low frequency components of the signal, precisely localised in time.
  - ❖ The wavelet basis that seems to be suitable for the PSC signal analysis is the Daubechies 3<sup>rd</sup> mother wavelet.
  - ❖ High frequency components correspond to microcrack creation, medium frequency components to the clustering and propagation of microcracks and low frequency components to macrocrack creation.
  - ❖ The increase of high frequency component of the signal may serve as a precursor of the increase of medium frequency components, which in turn are

concatenated by low frequency increase. Such a relation between components of the signal may be mapped to the known sequence of macrocrack creation.

- ❖ Macrocracks creation towards a certain direction may lead to the creation of a failure plane and rupture of the specimen. Thus high frequency component increase is a precursor of the precursor of failure which is the low frequency increase cause by macrocracks creation.
- The ac conductivity time series recordings may serve as non-destructive test for cracking identification.
  - ❖ Wavelet based spectral analysis of ac conductivity time series allow the differentiation between damaged and pristine marble specimens.
  - ❖ The evaluation of the time series is a non real time strength evaluation technique that requires calibration by pristine material measurements.
  - ❖ The Daubechies 10<sup>th</sup> mother wavelet was selected for analysis over the Mexican Hat and Daubechies 3<sup>rd</sup> mother wavelet, because it offers good frequency resolution.

To sum up, electric equilibrium of a brittle material specimen is highly affected by fracture phenomena and the innovative techniques for detection and analysis of the corresponding signals may serve for the creation of real and non-real time identification of expected or already occurred fracture accordingly.

## 6.2 Guidelines for next research steps

In this section we present some of the immediate next steps that would further improve and clarify the results of this work.

- The study and analysis of size effect in the mechanically stimulated electric signal. Quantification of the effect is achievable through the evaluation of experimental results from specimens of different scales.
- Application of RLC model against a specially designed set of specimens of a specific material so as to create nomograms for RLC parameters.
- The quantitative analysis of memory effects in permanent memory. The quantification of influence of the time to the signal.
- The embedding of electrodes inside composite materials for a better space resolution of analysis.
-

- ✦ The amendment of techniques for shielding of measurements and cancelation of the noise outside the shield.
- ✦ The experimental testing of other brittle materials. Concrete is also a big challenge for the measurements as it is the most common composite material for modern constructions.
- ✦ The standardisation of the properties of electrodes, the recording sampling rate and the range of electric signal to design low cost electrometer sensors for increasing the available channels for measurement.

The aforementioned points are some of the next steps that are already under development and have been part of research proposals.

### 6.3 Future work on the basis of this research

The real challenge of this work is that addresses a common civil engineering problem from a completely different point of view. The ultimate goal of such a research path would be the creation of an electric signal sensor that would measure deformation level by analogy to the strain measurements by a stain gage. A block diagram of the basic units of such a sensor are presented in Figure 6.1a.

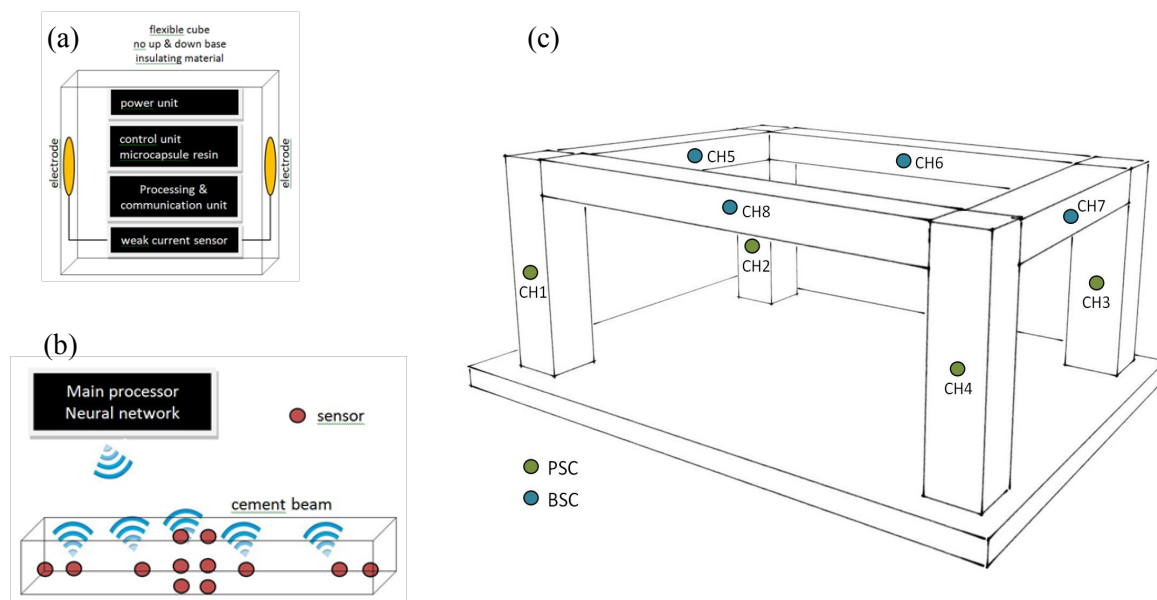


Figure 6.1 (a) Sensor for mechanically stimulated electric signal detection and analysis (b) Sensor subnetwork that ‘resides’ inside a beam subjected to bending and (c) sensor network inside a cement based ‘skeleton’ of a building, which is composed by the subnetworks shown by in columns and beams

The sensor may have the ability to control a micro-capsule containing resin for the healing of cracks. Such sensors could be build-in a cement beam following a specific constellation pattern as depicted in Figure 6.1b. Through this small network of sensors information about the monitored signals would be transferred to a central processing point via passive wireless communication technology (RFID-like). This processing unit would collect the data from multiple points and would take a decision for the possible actions.

In a real world application such distributed networks would create a total network of sensors and healing units for the real time monitoring and healing of a construction. This self-healing ability of a cement based building would save money and lives.

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## Appendix A – Publications derived from this research work

### Journals

1. **P. Kyriazis**, C. Anastasiadis, I. Stavrakas, D. Triantis and J. Stonham “*Modelling of electric signals stimulated by bending of rock beams*” Int. J. Microstructure and Materials Properties, Vol.4, pp.5-18, 2009.
2. D. Triantis, C. Anastasiadis, F. Vallianatos, **P. Kyriazis** and G. Nover: “*Electric signal emissions during repeated abrupt uniaxial compressional stress steps in amphibolite from KTB drilling*”, Nat. Hazards Earth Syst. Sci., Vol.7, pp.149-154, 2007.
3. **P. Kyriazis**, C. Anastasiadis, D. Triantis and F. Vallianatos: “*Wavelet analysis on Pressure Stimulated Currents emitted by marble samples*”, Nat. Hazards Earth Syst. Sci., Vol.6, pp.889-894, 2006.

### Conferences

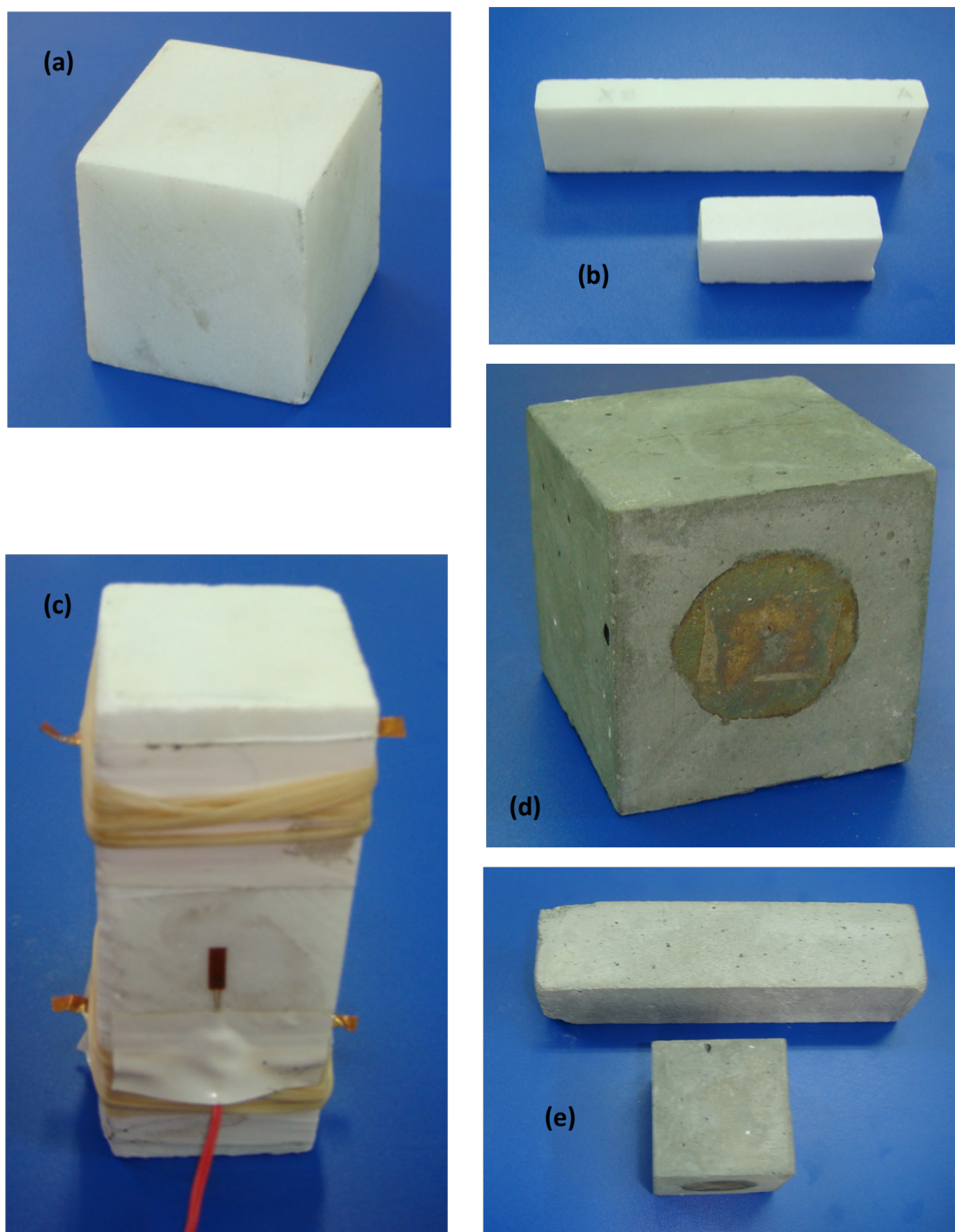
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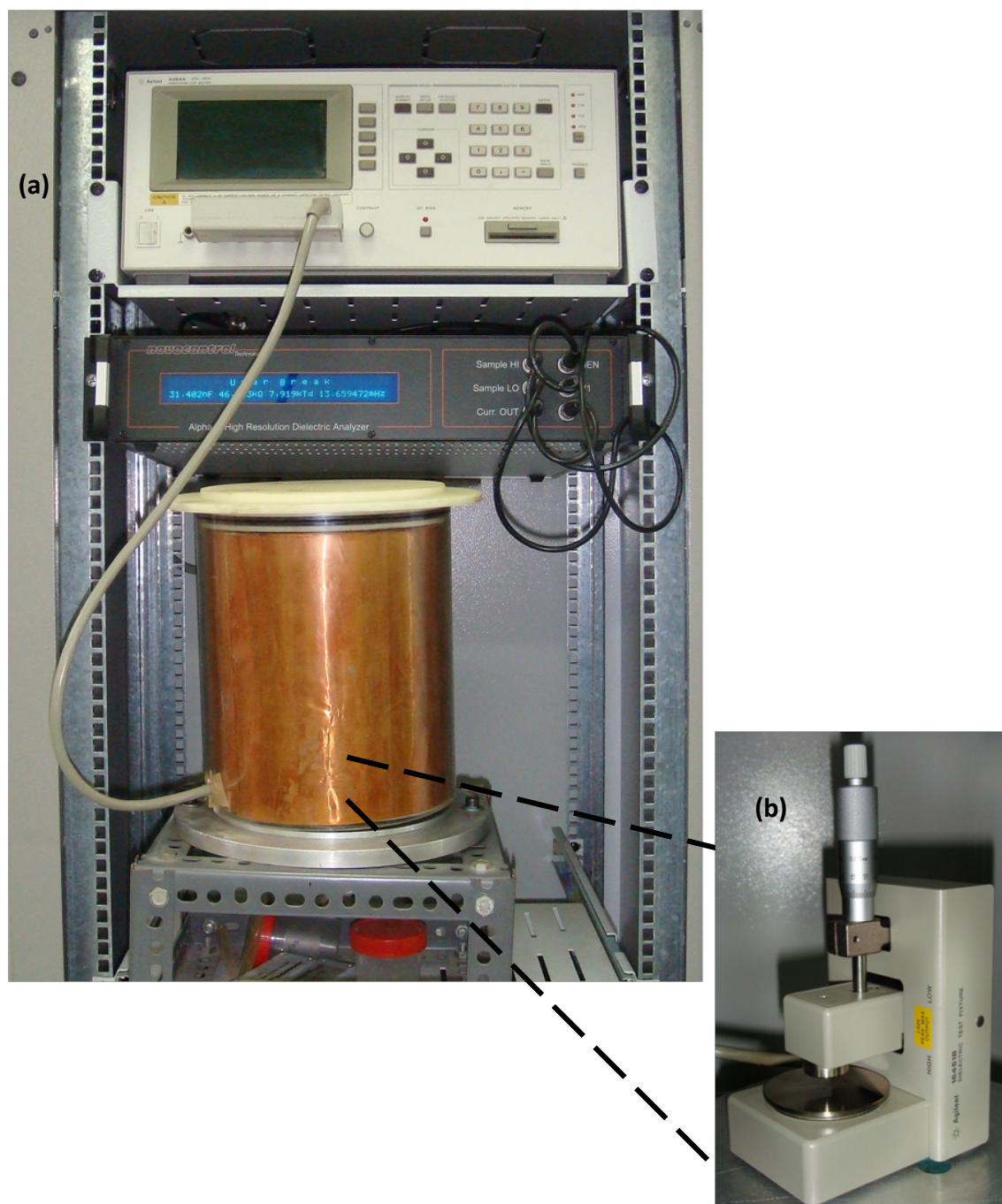
## Appendix B – Experimental setups, materials and devices



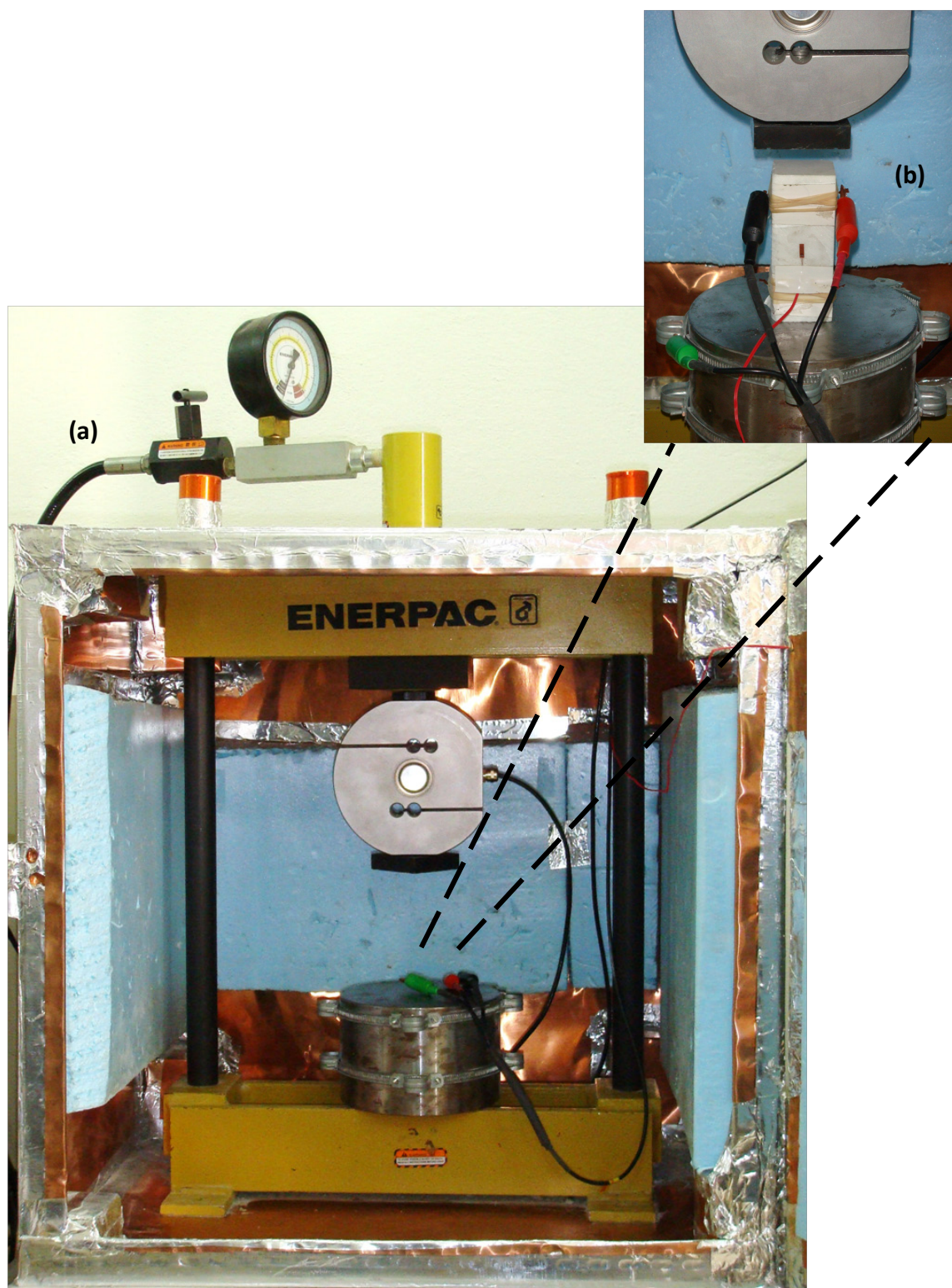
**Figure B-1.** (a) Electric hydraulic pump Enerpac PUJ-1200, (b) manual hydraulic pump (Enerpac P-142) (c) weighing indicator/controller ADW15 (d) strain gage sensor from Kyowa KFG series attached by adhesive on the electrode free surface of marble sample (e) golden plated electrodes with teflon interface for attachment to the samples with springs (f) mechanically stimulated electric signal sensing elements of various size - golden plated or copper made for attachment on specimens by rubber or adhesives (e) Programmable electrometers for mechanically stimulated electric signal measurements Keithley 617 and Keithley 6514



**Figure B-2.** Brittle material specimens that have been used for testing with PSC and BSC technique (a) Cubic specimen from Dionysos-Pentelikon marble (dim. 60×60×60mm) (b) D-P marble specimens (dim. 9×25×100mm and 12×20×40mm) for ac conductivity measurements after bending and compression stressing accordingly (c) D-P marble specimen for the evaluation of the amended PSC technique (dim. 40×40×100mm) – dual channel measurements with and without external dc voltage stimulation (d) cubic specimen (dim. 50×50×50mm) of cement paste with embedded painted electrode formed by conductive adhesive paint (e) cement mortar beam and cubic specimens (dim. 40×40×160mm and 50×50×50mm) for BSC and PSC measurements respectively



**Figure B-3.** (a) Setup for measurements of ac conductivity time series with LCR meter Agilent 4284A in an electromagnetically shielded cage with temperature control and (b) the dielectric test fixture 16451B, which is placed in the shield and is used as a holder for the specimens and the measuring. Note that the specimen has to be formed in a shape with at least two opposite surfaces parallel with each other in order to be placed between the parallel measuring surfaces of the holder.



**Figure B-4.** Mechanical setup for experiments of mechanically stimulated electric signal analysis with PSC and BSC technique that consists of (a) An Enerpac loading frame, a single acting hydraulic cylinder (10ton) Enerpac RC-106, a manometer for stress monitoring, a manually operated valve Enerpac V66 and a steel base. Note that the whole system is enclosed within a Faraday shield (dim. 500×500×600mm) and (b) Typical placement of a specimen for PSC experimental testing on the steel base alongside with crocodile clips attached on electrodes and a strain gage attached on its electrode free surface