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# Formation energies of $\theta$ -Al<sub>2</sub>Cu phase and precursor Al-Cu compounds: Importance of on-site Coulomb repulsion

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#### ABSTRACT

We investigated the relative stability and structural properties of Al-Cu intermetallic compounds using the density-functional theory (DFT) with different approximations. We reveal the importance of the on-site Coulomb repulsion of Cu *3d* electrons on the energetics and structural properties of Al-Cu compounds of free-electron nature. The finite-temperature effect was included by accounting for the vibrational free energy within the Debye model. The present study shows that  $\theta$ -Al<sub>2</sub>Cu is the ground state phase, agreeing with the experimental observations in the literature. The DFT + U approach could be useful to predict accurate formation energies of other Cucontaining precipitates in high-strength Al-alloys.

#### 1. Introduction

Substitutional precipitate hardening is the principal mechanism to strengthen aluminum alloys [1]. In aluminium-copper (Al-Cu) alloys, for example, Cu clustering and precipitation have been extensively studied for many years, owing to the advances of experimental and computational techniques [2]. The development of refine precipitate observations and advanced modeling approaches has significantly contributed to a better understanding of the microscopic mechanisms of early precipitation stages [3,4].

Thermally activated pre-nucleation stages and methods have a series of streaks parallel to the (1 0 0) planes of the crystal, with various lengths up to 4 nm. Then,  $\theta''\theta''$ -Al<sub>3</sub>Cu structures, GPI zones, form when three Al layers come together in between two Cu layers. It is commonly accepted that the Cu precipitation occurs in the following sequence of metastable phases: Super Saturated Solid Solution (SSS)  $\rightarrow$  Solute clusters  $\rightarrow$  GPI  $\rightarrow$  GPII  $\rightarrow \theta''\theta''$ -Al<sub>3</sub>Cu  $\rightarrow \theta'\theta'$ -Al<sub>2</sub>Cu  $\rightarrow \theta\theta$ -Al<sub>2</sub>Cu. This sequence is found in most of the textbooks [6–8]. Although the precipitation in binary Al-Cu alloys is well documented, comprehensive knowledge of the precipitation.

perlattices using the Local Density Approximation (LDA) approach. They have shown that stability increases with Cu content increase. The formation sequence of GPZs in Al-Cu alloys resemble a commutation of Cu atoms via agglomeration of Cu plates. Previous *an initio* studies showed that the formation energy of  $\theta$ -Al<sub>2</sub>Cu phase is higher than that of the  $\theta$ '-Al<sub>2</sub>Cu phase [9], indicating that the  $\theta$ '-Al<sub>2</sub>Cu is more stable than  $\theta$ -Al<sub>2</sub>Cu phase [9]. This contradicts the experimental observations, where the  $\theta$ -Al<sub>2</sub>Cu phase [10]. Here we show that the formation energies of the  $\theta$ -Al<sub>2</sub>Cu phase and is

GPZs. Wang et al. [9] have studied the energetics of series of Al-Cu su-

Here we show that the formation energies of the  $\theta$ -Al<sub>2</sub>Cu phase and Al-Cu compounds are corrected by taking into account the Cu on-site *3d* Coulomb repulsion using the DFT + U approach. A ground state formation energy was obtained for the  $\theta$ -Al<sub>2</sub>Cu phase. After adding the contribution of vibrational free energy, Gibbs free energy showed a stability gain for the  $\theta$ -Al<sub>2</sub>Cu phase over  $\prime \theta'$ -Al<sub>2</sub>Cu phase at high temperatures. Our computed results are in line with the experiment. The present method could be able to predict accurate formation energies of precipitates containing Cu.

## 2. Method

#### 2.1. DFT + U approach and adopted Hubbard model

We have performed total energy calculations using density functional theory (DFT) and DFT + U (U is Hubbard term) as implemented

Theoretical calculations can provide substantial information "on what is really going on" to describe the morphological sequence of

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in the Vienna *ab initio* Simulation Package [11,12]. We employed the projected augmented wave (PAW) potentials and the generalized gradient approximation (GGA) of Perdew-Burke-Ernzerhof (PBE) for exchange-correlation [13]. The electronic configurations are for Cu:[Ar] $3d^{10}4p^1$  and Al:[Ne] $3s^23p^1$ , respectively. At first,  $3 \times 3 \times 3$ face-centered cubic (fcc) unit cell (108 atoms), 2 imes 2 imes 2 fcc unit cell (32 atoms) and 2 imes 2 imes 3 fcc unit cell (48 atoms) with one single Cu atom were selected for computing the dilute solution, then 2  $\times$  2  $\times$  2 supercell (32 atoms) was considered for the nucleation of GPZ precipitates up to  $\frac{\eta}{\theta}$ -Al<sub>3</sub>Cu formation, and Al-Cu compounds in addition to the conventional supercells of  $\prime\theta$ -Al<sub>2</sub>Cu and  $\theta$ -Al<sub>2</sub>Cu. The Methfessel-Paxton method was used to relax both the lattice parameters and coordinates of atoms to reach equilibrium. The cutoff energies for the plane-wave basis set and the representation of the augmentation and 700 eV, respectively, for all cells. The calculacharges are to converge when total energy researched less than tions were s 10<sup>-5</sup> eV per atom and interatomic forces less than 10<sup>-4</sup> eV/A, respectively.

While standard DFT has successfully predicted the structures properties of a wide range of materials, it fails to estimate certain other properties, such as the formation energies of Al-Cu phases in the present study. As the formation energies of Al-Cu phases in the present ed orbitals [14]. Many efforts have been proposed to describe the strongly correlated electron systems correctly. One is the DFT + U method [15], which introduces a repulsion between the localized electrons, where a repulsive term referred to as the Hubbard U is introduced. The physical effect of the U term is to shift the localized orbitals, which increases the gap between the filled and the empty states, removing the unphysical self-interaction to get the proper ground state and correct the bandgap of the system.

In this study, we employed several density-functionals, including the standard GGA and GGA + U to describe the Al-Cu precipitates. We used the DFT + U approach to correct standard GGA exchange–correlation by including the on-site Coulomb repulsion in the *3d* localized bands based on the Mott-Hubbard model approach [16, 17]. An energy expression based on the on-site density matrix $\rho_{ij}$  of the Cu 3*d* electrons can be given as,

 $E_{\text{GGA-PBE+U}} = E_{\text{GGA-PBE}} + \frac{(\text{U} - \text{J})}{2} \sum_{i} \left[ \sum_{i} \rho_{ii} - \sum_{i} \rho_{ii} \rho_{ii} \right]$ 

$$2 - \left[\frac{1}{2}, \frac{1}{2}, \frac{1}{2}, \frac{1}{2}, \frac{1}{2}, \frac{1}{2}, \frac{1}{2}, \frac{1}{2}\right]$$
  
e U is the averaged Hubbard parameter, and J represents the

where U is the averaged Hubbard parameter, and J represents the screened exchange energy. The Hubbard U value used is crucial for the formation energy accuracy derived in this work. A concise formalism of the DFT + U concept is found in [14].

The formation energy per Cu atom of Al-Cu precipitates and compounds at 0 K is derived from the following expression,

$$\Delta E \left( \mathrm{Al}_{n} \mathrm{Cu}_{m} \right) / \mathrm{Cuatom} = \left[ E \left( \mathrm{Al}_{n} \mathrm{Cu}_{m} \right) - nE \left( \mathrm{Al} \right) - mE \left( \mathrm{Cu} \right) \right] / m$$
(2)

where  $E(Al_nCu_m)$  is the total energy of the Al-Cu system, E(Al) and E (Cu) are the elemental total energies of reference for Al and Cu. *n* and *m* represent the number of Al and Cu atoms, respectively.

#### 2.2. Vibrational entropy ution and Debye model

A substantial effect on the stability of  $\theta$ -Al<sub>2</sub>Cu phase could be obtained by adding the vibrational contribution to 0 K formation energy. In this section, we show that the phase stability of the Al-Cu precipitates can be further enhanced by accounting for the Gibbs free energy, whereby the lattice vibration of the compounds is included in the calculations of total free energy within the Debye model [18,19]. The free energy of an Al-Cu structure, G(T), is obtained by adding the temperature dependent vibrational free energy,  $G_{\text{Debye}}(T)$ , to the *ab initio* computed formation energy at 0 K,  $\Delta E$ ,

$$G(T) = \Delta E + G_{\text{Debve}}(T) \tag{3}$$

where T is the absolute temperature. The Debye vibrational free energy is computed with

$$G_{\text{Debye}}(T) = \frac{9}{8} k_B T_D + k_B T \\ \times \left[ 3 \ln \left( 1 - e^{-\frac{T_D}{T}} \right) - D_3 \left( \frac{T_D}{T} \right) \right]$$
(4)

where  $k_B$  is Boltzmann's constant,  $T_D$  is the Debye temperature adopted from [20], and  $D_3\left(\frac{T_D}{T}\right)$  is the Debye integral defined as,

$$D_{3}\left(\frac{T_{D}}{T}\right) = \frac{3}{T_{D}^{3}}T^{3} \int_{0}^{T_{D}/T} \frac{t^{3}}{e^{t} - 1} dt$$
(5)

where  $t = \hbar v_s |\vec{\omega}| / (k_B T)$ ,  $v_s$  is the velocity of the sound wave and  $|\vec{\omega}|$  is the wave vector.

In Eq. (4), the first term on the right-hand side denotes the zeropoint vibrational contribution and the second indicates the temperature-dependent vibrational contribution. The formation free energy will be given as,

$$\Delta G_f(T) \left[ Al_{1-x} Cu_x \right] = \overline{G}(T) \left[ Al_{1-x} Cu_x \right] - \left\{ (1-x) \overline{G}(T) \left[ Al_{1-x} \right] + x \overline{G}(T) \left[ Cu_x \right] \right\}$$
(6)

where  $\binom{n}{f} = \binom{n+m}{r}$ . The thermodynamically favored structure is determinimizing  $\Delta G_f(T)$ . In our calculations, we have neglected the effects of thermal volume expansion. Also, since the Al-Cu structures are ordered, the configurational entropy term has not been accounted for.

#### 2.3. Hubbard model validation and determination of U term

To determine the proper value of Hubbard term U, we looked first at the experimental Cu 3d photoemission prace and we generated Cu 3d local density of states using the DFT + I shows the X-ray photoemission spectrum (DPS) (circles symbols with line) together with the ultraviolet photoemission spectrum (UPS) (inclusion of the Cu 3d photoemission peaks of the valence band [21], ted against ab initio (circles by of states of Cu 3d orbital derived from standard density functional PBE-GGA without (dashed line) and with Hubbard U correction (U = 4 eV) (solid red line), of pure Cu (Fig. 1b), the dilute solution (Al<sub>107</sub>Cu) (Fig. 1c),  $\theta''\theta''$ -Al<sub>3</sub>Cu ((Fig. 1d),  $\theta'\theta'$ -Al<sub>2</sub>Cu (Fig. 1e), and  $\theta$ -Al<sub>2</sub>Cu phases (Fig. 1f). The Fermi level is at 0 eV.

In principle, XPS or UPS spectrums can be compared to the local density of states (LDOS) obtained from DFT bulk-calculations [22]. However, the comparison of the calculated LDOS to the experimental spectra is a subtle task, depending on the adjustment of experimental broadening and the consideration of different photoionization cross-sections of the other atoms and orbitals. In our case, Cu **3d** (TD) all has a dominant contribution over the Cu **1s** state on the Cu-Cu binding. Therefore, the experimental spectra and bulk LDOS calculations may match well in the *d*-band region [23]. Also, we expect the Cu-Cu binding to be mainly dependent on valence electrons, and it will not be affected much by the inclusion of Cu core electrons.

From the XPS and UPS measurements, the highest peaks are located at -3.2 eV (XPS) and -2.4 eV (UPS) (Fig. 1a). Whereas the highest 3d peaks derived from our calculations are located at -1.66 eV (PBE-GGA) and -2.3 eV (PBE + U). The density of states derived from the standard approach is located at higher energy interval than the ones obtained by

(1)



Fig. 1. (a) V and photoelectron spectrum (XPS) produced by exposure of Cu to Mg howing a peak due to the 3d bands of Cu he curve obtained from ultraviolet photoelectron spectroscopy (UPS) is l on the same graph for comparison. Peaks are located at -3.2 eV (XPL) d -2.4 eV (UPS). Ab initio density of states of Cu 3d derived from standard density functional PBE-GGA without (dashed line ith Hubbard U correction term (U = 4 eV) (solid red line) for (b) pure  $C_{u, where}$  the highest  $3d_{ver}$  s are located at -1.66 eV (PBE-GGA) and -2.3 eV (PBE + U), (c) the diffue solution (Al<sub>107</sub>Cu), (d)  $\theta''\theta''$ -Al<sub>3</sub>Cu, (e)  $\theta'\theta'$ -Al<sub>2</sub>Cu, and (f)  $\theta$ -Al<sub>2</sub>Cu phases. The Fermi level is normalized at 0 eV.

the XPS or UPS. An energy shift toward lower energies of the PBE + U, with U = 4 eV, has corrected this mismatch, and for pure Cu, we have noticed a clear matching of the PBE + U highest peak with the highest peak measured by the UPS. Moreover, U = 4 eV has been widely used for CuO system [24]. Thus, we have adopted the same U value in the calculations of formation enthalpies of other Al-Cu phases. For the Al<sub>107</sub>Cu structure, the electron density has a single main peak for both DFT and DFT + U, where the peak height dropped by ~ 11%, and the energy shift between the results of DFT and those of DFT + U was ~ -0.346 eV. On the other hand, for the  $\theta''\theta''$ -Al<sub>3</sub>Cu phase, we noticed that the phase has two prominent electron density peaks. The first has shifted by -0.450 eV and dropped by ~26% and the second peak shifted by -0.764 eV with a height loss of ~33%. The lower energy shitting calculated for the  $\theta''\theta''$ -Al<sub>3</sub>Cu phase compared to the dilute so-

lution represented by Al<sub>107</sub>Cu highlights the starting of Cu clustering through Cu-Cu nearest-neighbor interactions. For  $\theta'\theta'$ -Al<sub>2</sub>Cu phase, we observed two sharp electron density peaks. The first peak is higher than the second. A premature third peak is also captured. We expect the sharp peaks calculated for the  $\theta'\theta'$ -Al<sub>2</sub>Cu phase to be related to the metastability of the structure. Finally, we observed three main density peaks for  $\theta$ -Al<sub>2</sub>Cu. The first two have a height loss of ~9% and 3%, with ~-0.769 eV and ~ -0.678 eV energy shifts. The third peak has gained 37% in height, with ~ -0.571 eV energy shifting. This peak, in particular, which we believe was born in the  $\theta'\theta'$ -Al<sub>2</sub>Cu phase, becomes bigger in the  $\theta$ -Al<sub>2</sub>Cu phase, indicating its thermodynamic stability. Overall, one clearly can see, the larger energy broadening calculated for  $\theta$ -Al<sub>2</sub>Cu phase, as compared to other phases, where the already well-established three electron density peaks show the high stability of the phase.

## 3. Results and discussion

#### 3.1. Formation energy at 0 K

We first performed the energy dependence on U values for  $\theta$ - and  $\theta' \theta'$ -Al-Cu phases. Fig. 2 shows the variation of formation energy difference, and  $\theta'$   $E[\theta' \Delta E[\theta$ -Al<sub>2</sub>Cu] –  $\Delta E[\theta'$ -Al<sub>2</sub>Cu] (meV/atom), between  $\theta$ - and  $\theta'$  phases as a function of U used in the DFT + U approach. The calculations reveal that the formation energy difference is ~ -3.84 meV U = 4 eV and  $\theta$ -Al<sub>2</sub>Cu phase is the most stable phase, and this ement with the experiment [25].

Here we report results about the formation energy of  $Al_{1-x}Cu_x$  configurations, calculated per Cu atom as a function of Cu atomic fraction, *x*. Fig. 3 illustrates the main crystal structures and configurations computed in the present study. The lattice structures of previously studied Al-Cu compounds and phases (Fig. 3a), the non-bulk  $\theta''\theta''$ -Al<sub>3</sub>Cu phase embedded into Al-matrix (Fig. 3b) and lowest energy configurations forming monolayer GPZs, and showing eight stages of Cu clustering (case of 2 × 2 × 2 fcc unit cell with 32 atoms) (Fig. 3c).

Fig. 4 shows the formation energy as a function of Cu content, *x*, of dilute solution represented by Al<sub>107</sub>Cu, Al<sub>47</sub>Cu, and Al<sub>31</sub>Cu structures, using  $3 \times 3 \times 3$  supercell (108 atoms),  $2 \times 2 \times 3$  supercell (48 atoms) and  $2 \times 2 \times 2$  supercell (32 atoms), respectively (Fig. 4a), GP



**Fig. 2.** Formation energy difference,  $[\Delta E(\theta - Al_2Cu) - \Delta E(\theta - Al_2Cu)]$  (meV/ atom), between  $\theta$ - and  $(\theta - Al_2Cu)$  phases as a function of Hubbard U term used in DFT + U approach.



**Fig. 3.** (a) Structures of conventional cells of  $u\theta''$ -Al<sub>3</sub>Cu,  $u\theta'$ -Al<sub>2</sub>Cu and  $\theta$ -Al<sub>2</sub>Cu phases, and (b) currently selected model to compute formation of monolayer GPZs and embedded  $u\theta''$ -Al<sub>3</sub>Cu isolated by 7 Al layers, (c) regy configuration derived from 2 × 2 × 2 fcc unit cell (32 atoms), showing the preference of Cu-Cu nearest-neighbor bondings.



**Fig. 4.** Formation energy as a function of Cu content, *x*, of (a) dilute solution (Al<sub>107</sub>Cu), (b)  $2 \times 2 \times 2$  supercell (32 atoms) (c) Al-Cu compound structures, (d) *nθ*<sup>\*</sup>-Al<sub>3</sub>Cu, *nθ*<sup>\*</sup> and *θ*-Al<sub>2</sub>Cu phases. Earlier computed formation energy of LDA [9] and of GGA-PBE [20] indicated by black and orange empty diamond and upward triangle symbols plotted against the formation energy of compounds and phases obtained in this work before (empty circles) and after including Coulomb repulsion (filled circles), using GGA-PBE + U (U = 4 eV) approach.

configurations up to the formation of  $\theta''\theta''$ -Al<sub>3</sub>Cu using 2 × 2 × 2 supercell (32 atoms)(Fig. 4b), of Al-Cu compound structures (Fig. 4c), and finally of  $\theta''\theta''$ -Al<sub>3</sub>Cu,  $\theta'\theta'$ - and  $\theta$ -Al<sub>2</sub>Cu phases (Fig. 4d). Earlier computed formation energies of LDA [9] and GGA-PBE [20] indicated by black and orange empty diamond and upward triangle symbols (

plotted against the formation energy of compounds and phases obtained in this work before (empty circles) and after including Coulomb repulsion (filled circles), using GGA-PBE + U (U = 4 eV) approach.

#### 3.2. Lattice parameters of Al-Cu structures

In this section, we discuss the lattice parameter change induced by Cu solute up to the formation of  $"\theta"$ -Al<sub>3</sub>Cu and the Al-Cu phases from both DFT-GGA and GGA + U approaches. The lattice parameters of the studied GPZ structures decrease monotonically with Cu atomic fraction with much extensive slope for cpter, as shown in Fig. 5. The values for a and c parameter linearly fitted as (0.40417 -0.027089x), and (0.40417 – 0.0 (x) for  $2 \times 2 \times 2$  cell (32 atoms) and (0.40448 - 0.028095x) and (0.40448 - 0.094519x) for  $2 \times 2 \times 3$ cell (48 atoms), where the predicted c parameter for  $\frac{\eta \theta''}{2}$ -Al<sub>3</sub>Cu is in agreement with the reported experimental value [27]. A large uniaxial strain along c direction has occurred, and subsequently, an increase of the elastic strain energy took place (Fig. 6). This was in agreement with GPZs observed in the experiment, where a strong lattice deformation was taken place into the direction perpendicular to the precipitate layers [28]. Table 1 summarizes the used computational methods to compute known phases, with their corresponding space groups, fully relaxed *a* and *c* lattice parameters. Experimental data (Expt.) [27,28] are also included for comparison. We found good agreement with experimental values is derived from PBE + U (U = 4 eV) and PBE standard approaches for all the three phases. For  $\theta'' \theta''$ -Al<sub>3</sub>Cu phase, very close values of *c* parameters to the experimental were obtained with a margin of + 0.1% deviation error for PBE, and PBE + U approaches. The a parameter was underestimated by 2%. LDA + U approach underestimates the *a* parameter of  $\theta'' \theta''$ -Al<sub>3</sub>Cu phase by ~ 4% and rameter by  $\sim 2\%$ . A similar result was obtained from LDA plain ch. For  $\theta' \theta'$ -Al<sub>2</sub>Cu phase, identical c parameter values to those m d in the experiment were obtained from PBE + U and PBE. The *a* parameter is overestimated by 1%. LDA and LDA + U underestimate the c parameter similarly by about 2% and a parameter by  $\sim$ 1%, respectively. Fi-



**Fig. 5.** Lattice parameter of Al-Cu GPZs as a function of Cu atomic fraction, *x*, derived from both  $2 \times 2 \times 2$  fcc unit cell (32 atoms) and  $2 \times 2 \times 3$  fcc unit cell (48 atoms). Empty (filled) symbols are the results of standard DFT method (DFT + U method, U = 4 eV). The experimenta lattice parameter of the fcc Al [26], and of  $\theta''$ -Al<sub>3</sub>Cu [27] are plotted for comparison.



**Fig. 6.** The elastic strain energy induced by Al-Cu GPZs as a function of Cu atomic fraction. Adopted symbols are as in Fig. 5. Previously reported calculation method of the elastic contant strain energy for tetragonal crystal was adopted [29], and elastic contant strain  $C_{ij}$  of  $\eta \theta^{n}$ -Al<sub>3</sub>Cu were used [20].

nally, for  $\theta\theta$ -Al<sub>2</sub>Cu phase identical *a* and *c* parameter values to the experimental were obtained from PBE, and PBE + U approaches, and an underestimation by about 2% was obtained from LDA + U for both lattice parameters. No large deviations were captured from the LDA plain approach for both *a* and *c* lattice parameters of  $\theta\theta$ -Al<sub>2</sub>Cu phase. Overall, the best results were obtained by PBE + U (U = 4 eV) and PBE standard approaches, which give these two approaches a great advantage in this study. It is important to mention that obtaining a more accurate lattice parameter requires testing different U values for each lattice parameter, which will increase the computational cost. In the present work, the lattice parameters obtained using U = 4 eV for the known phases in the Al-Cu system are satisfactory and within optimal computational cost and time.

## 3.3. Advantages of DFT + U and comparison with early studies

A previous study [9] has focused on the formation energy Al-Cu compounds using layered Al-Cu supercells. The weak Cu-Cu layer interaction has hampered a conclusive analysis of the physical precipitate nucleation in Al-Cu system. In this work, instead of considering different Al-Cu layered supercell, we considered the 2-dimensional (2D) clustering and growth of Cu layers along (1 0 0). The models help to establish a better understanding of Cu precipitate nucleation. Indeed, the nucleation of the Cu precipitates showed a continuous process up to  $\eta \theta^{\prime}$ . Al<sub>3</sub>Cu formation favoring Cu-Cu nearest-neighbor interactions (Fig. 3c). To help the reader reconstructing the configurations, Table 2 illustrates the different lowest energy structures, the number of Cu atoms substituted for Al atoms, and their corresponding sites in fraction coordinates.

The results of  $2 \times 2 \times 2$  supercell of Fig. 4b show the beginning of the Cu clustering and the growth of Cu layers along {1 0 0} up to the formation of  $\eta \theta^{n}$ -Al<sub>3</sub>Cu phase, which has the typical structure of three Al layers in between full-formed Cu layers. In an experimental investigation of GPI zones in Al-1.54at.%Cu, high-resolution electron microscopy images revealed information of GPI monolayer growth to GPII ( $\eta \theta^{n}$ -Al<sub>3</sub>Cu) through an intermediate stage [31]. Our present model covers this process. Fig. 4c also shows the recomputed Al-Cu compound structures, compared to those reported by others [9,20], the formation energy of Cu single monolayer despite showing a plausible formation mechanism through a flat curve as a function of Cu atomic fraction, it highlights the weak Cu-Cu layer interactions rather than Cu precipitate nucleation. The high energies of Al<sub>4</sub>Cu<sub>2</sub>, Al<sub>6</sub>Cu<sub>2</sub>,

#### Table 1

Summary of the used computational methods, so the deviations of the theoretical values from the corresponding experimental data (Expt.) are also included for comparison. We also list, in parentheses, the deviations of the theoretical values from the corresponding experimental data,  $\Delta = (d_{\text{calc.}} - d_{\text{exp.}})/d_{\text{exp.}} \times 100\%$ , where  $d_{\text{calc.}}$  is the calculated data and  $d_{\text{exp.}}$  the experimental value.

Method		Phase	Space group	a (nm) / Δ(%)	c (nm) / Δ(%)	Ref.
Theory (This work)	GGA-PBE + U	ν <mark>θ"-</mark> Al <sub>3</sub> Cuν	P4/mmm	0.396 (-2.0)	0.769 (+0.1)	
		$\theta'$ -Al <sub>2</sub> Cu	I-4m2	0.408 (+1.0)	0.580 (0)	
		$\theta$ -Al <sub>2</sub> Cu	I4/mcm	0.606 (-1.6)	0.487 (-0.2)	
	GGA-PBE	ν <mark>θ"-</mark> Al₃Cuν	P4/mmm	0.396 (-2.0)	0.769 (+0.1)	
		$\theta'$ -Al <sub>2</sub> Cu	I-4m2	0.408 (+1.0)	0.580 (0)	
		$\theta$ -Al <sub>2</sub> Cu	I4/mcm	0.606 (-0.2)	0.488(0)	
	LDA + U	∕ <mark>″θ″-</mark> Al₃Cu	P4/mmm	0.389 (-3.7)	0.753 (-1.9)	
		θ'-Al <sub>2</sub> Cu	I-4m2	0.401 (-0.7)	0.568 (-2.1)	
		θ-Al₂Cu	I4/mcm	0.594 (-2.1)	0.477 (-2.3)	
	LDA	∕ <mark>′θ″</mark> -Al₃Cu∕	P4/mmm	0.389 (-3.7)	0.754 (-1.8)	
		θ'-Al <sub>2</sub> Cu	I-4m2	0.401 (-0.7)	0.569 (-1.9)	
		$\theta$ -Al <sub>2</sub> Cu	I4/mcm	0.606 (-0.2)	0.488 (0)	
(Other refs.)	LDA-PP-US	′ <mark>′θ″-</mark> Al₃Cu	P4/mmm	0.387 (-4.2)	0.773 (+0.7)	[9]
		θ'-Al <sub>2</sub> Cu	I-4m2	0.568 (+40.6)	-	
		$\theta$ -Al <sub>2</sub> Cu	I4/mcm	0.592 (-2.5)	0.486 (-0.4)	
	GGA-PBE	′ <mark>′θ″-</mark> Al₃Cu	P4/mmm	0.397 (-1.7)	0.767 (-0.1)	[20]
		θ'-Al <sub>2</sub> Cu	I-4m2	0.409 (+1.2)	0.578 (-0.3)	
		$\theta$ -Al <sub>2</sub> Cu	I4/mcm	0.605 (-0.3)	0.488 (0)	
Expt.		ν <mark>θ"-</mark> Al₃Cuν	P4/mmm	0.404	0.768	[27]
		$\theta'$ -Al <sub>2</sub> Cu	I-4m2	0.404	0.580	[30]
		$\theta$ -Al <sub>2</sub> Cu	I4/mcm	0.607	0.488	[30]

#### Table 2

Illustration	of the	different	lowest	energy	stable	structures,	number	of	Cu
atoms, and	their o	correspond	ding sit	es in fra	action o	coordinates.			

Cu atoms					
Al-Cu compounds					
Al <sub>13</sub> Cu 2 (0,0,0.857), (0.5,0.5,0.857)					
Al <sub>11</sub> Cu 2 (0,0,0.833), (0.5,0.5,0.833)					
Al <sub>9</sub> Cu 2 (0,0,0.8), (0.5,0.5,0.8)					
Al <sub>7</sub> Cu 2 (0,0,0.75), (0.5,0.5,0.75)					
Al <sub>5</sub> Cu 2 (0,0,0.666), (0.5,0.5,0.666)					
Al <sub>4</sub> Cu <sub>2</sub> 4 (0,0,0.678), (0,0.5,0.821), (0.5,0,0.821),					
(0.5,0.5,0.678)					
$Al_6Cu_2$ 4 (0,0,0.759), (0,0.5,0.865), (0.5,0,0.865),					
(0.5,0.5,0.759)					
$Al_8Cu_2$ 4 (0,0,0.808), (0,0.5,0.891), (0.5,0,0.891),					
(0.5,0.5,0.808)					
$2 \times 2 \times 2$ fcc unit cell					
$Al_{31}Cu$ 1 (0,0,0)					
$Al_{30}Cu_2$ 2 (0,0,0), (0.25,0.25,0)					
$Al_{29}Cu_3$ 3 (0,0,0), (0.25,0.25,0), (0.5,0,0)					
$Al_{28}Cu_4$ 4 (0.25,0.25,0), (0.25,0.75,0), (0,0.5,0), (0.5,0.5)	,0)				
Al <sub>27</sub> Cu <sub>5</sub> 5 (0.25,0.25,0), (0.25,0.75,0), (0,0.5,0), (0.75,0.	25,0),				
(0.5,0.5,0)					
$Al_{26}Cu_6$ 6 (0,0,0), (0.25,0.25,0), (0,0.5,0), (0.5,0,0),					
(0.25, 0.75, 0), (0.5, 0.5, 0)					
$Al_{25}Cu_7$ 7 (0,0,0), (0.25,0.25,0), (0,0.5,0), (0.5,0,0),					
(0.25, 0.75, 0), (0.75, 0.25, 0), (0.5, 0.5, 0)					
$Al_{24}Cu_8 = 8$ (0,0,0), (0.25,0.25,0), (0,0.5,0), (0.5,0,0),					
(0.25, 0.75, 0), (0.75, 0.25, 0), (0.5, 0.5, 0), (0.75, 0.25, 0), (0.75, 0.25, 0), (0.75, 0)	0.75,0)				

and  $Al_8Cu_2$  compounds show that they are unlikely to occur during precipitation. The results of Fig. 4c and 4d clearly showed slight high energies for Al-Cu GPZ precipitates and Al-Cu compounds derived from the PBE + U approach compared to those reported by the standard DFT method [9,20,32]. By applying this approach, we succeeded to get the groundstate formation energy for the equilibrium  $\theta$ -Al<sub>2</sub>Cu phase.



Fig. 7 shows  $\Delta G_{\rm f}$  (meV/atom) of the Al-Cu structures as a function of temperature (K) for the cases of  $\theta' \theta''$ -Al<sub>3</sub>Cu,  $\theta' \theta'$ -, and  $\theta \theta$ -Al<sub>2</sub>Cu phases. The metastable  $\theta' \theta''$ -Al<sub>3</sub>Cu structure has higher energy than



**Fig. 7. Free et**  $G_{\rm f}$  (meV/atom), of the Al-Cu structures as a function of temperature (K) for the cases of  $\theta' \theta''$ -Al<sub>3</sub>Cu,  $\theta' \theta'$ -Al<sub>2</sub>Cu phases. Values of free energy = 300 K from other DFT works ( $\blacklozenge$ ,  $\bullet$ ) [33,34], and from COST507 CAL database at T = 298 K ( $\boxdot$ )[35], are plotted for comparison.

both  $\theta' \theta'_{-}$ , and  $\theta \theta_{-}$ Al<sub>2</sub>Cu phases, over the whole studied temperature in-The vibrational free energy contribution causes clear shifts in th e energy of  $\theta' \theta'$ , and  $\theta \theta$ -Al<sub>2</sub>Cu phases: Using DFT + U at T = 0 K (Fig. 2), the variation of the formation energy difference between  $\theta' \theta'$ , and  $\theta \theta$ -Al<sub>2</sub>Cu phases was ~ -3.84 (meV/atom) with U = 4 eV, which is too small to observe in Fig. 7. However, we noticed an apparent incre the free energy difference between the two phases from ~ T 0 K, favoring further the stability  $\frac{\partial \theta}{\partial t}$  Al<sub>2</sub>Cu phase over  $\theta' \theta' - Al_2$  cture. At higher temperatures, the vibrational excitations cause more preference for the  $\theta$ -Al<sub>2</sub>Cu phase. Here, the vibrational effects already enhance the stability of  $\frac{\partial \theta}{\partial t}$ -Al<sub>2</sub>Cu as the most stable structure in the Al-Cu system at equilibrium. At 300 K,  $\Delta G_{\rm f}$  = -120 (meV/atom) for  $\theta' \theta'$ -Al<sub>2</sub>Cu structure and  $\Delta G_{\rm f} = -123$  (meV/ atom) for  $\theta$ -Al<sub>2</sub>Cu phase. This compares fairly well with -120 meV/ atom from previous data reported for the Gibbs free energy of Cu solution in Al at 300 K, derived from LDA and GGA [33], -140 (meV/ atom) from [34], and -140 (meV/atom) at 298 K from the COST507

CALPHAD database [35]. The agreement between the calculated  $\Delta G_{\rm f}$  and the experiment validates further our findings.

#### 4. Conclusion

To summarise, the relative stabilities of  $\eta \theta''_{-}$ -Al<sub>3</sub>Cu,  $\eta \theta'_{-}$  and  $\theta$ -Al<sub>2</sub>Cu structures have been studied using DFT, and DFT + U approaches. Two main findings have been addressed: (1) The importance of the onsite Coulomb repulsion of Cu 3d states on the energetics and structural properties of Al-Cu compounds through introducing Hubbard term U. (2) The success of the DFT + U approach to estimate the ground state energy of the  $\theta$ -Al<sub>2</sub>Cu phase for U = 4 eV, in agreement with the experimental observations, reported earlier. These results will update the formation energies of the Al-Cu precipitates, which helps get insight into the Cu clustering and formation of Al-Cu intermetallic compounds during heat treatment. Including the vibrational contributions consolidated the relative stability of  $\theta$ -Al<sub>2</sub>Cu phases at elevated temperature. The DFT + U method is expected to accurately estimate the formation energies of other intermetallic phases important in many industrial Albased alloys, which, in general, will pave the way to better understand their nucleation conditions.

## CRediT authorship contribution statement

M. Souissi: Conceptualization, Methodology, Software, Validation, Formal analysis, Investigation, , Visualization, Data curation, Writing - original draft, Writing - review & editing. C.M. Fang: Conceptualization, Methodology, Software, Validation, Formal analysis, Investigation, Data curation, Writing - review & editing, Visualization. R. Sahara: Conceptualization, Formal analysis, Visualization, Resources, Writing - review & editing. Z. Fan: Conceptualization, Supervision, Project administration, Funding acquisition, Resources, Writing - review & editing.

#### **Declaration of Competing Interest**

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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Data Availability.

Data will be made available on request.

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