



# First-principles Calculations of Bulk and Interfacial Thermodynamic Properties of the $T_1$ phase in Al-Cu-Li alloys

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## ABSTRACT

We recently proposed a new, low-energy atomic structure of the  $Al_2CuLi$  ( $T_1$ ) phase using first-principles calculations based on density functional theory [*Acta Mater.* 145 (2018) 337-346]. Here, we refine the Li positions in the proposed  $T_1$  structure and find that the  $T_1$  phase has a tie-line with Al at finite-temperature by vibrational entropic stabilization on the Gibbs triangle of the ternary Al-Cu-Li system. We also derive a low-energy  $T_1$ /Al coherent interfacial structure and find that Ag and Mg solutes are predicted to segregate to the coherent interface, which is in agreement with recent experimental observations by atom probe tomography.

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Precipitation-strengthened alloys such as those based on aluminum are widely used in transportation. Aluminum-lithium (Al-Li) alloys are of great interest in aerospace applications where superior specific strength (high strength/low density) is required [1,2]. This is because lithium additions reduce density (~3% decrease per every weight percent) and increase elastic modulus (~6% increase per every weight percent) [3]. Cu additions further increase the strength of aluminum alloys in the Al-Cu-Li system in the limit of Li content (lower than 2 wt.%) due to the long-term embrittlement [3]. In the ternary Al-Cu-Li system, the main strengthening precipitate is a hexagonal  $Al_2CuLi$  ( $T_1$ ), which forms nanometer-sized thin plates on the  $\{111\}_{Al}$  planes when embedded in Al matrix [4].

The crystal structure of the  $T_1$  phase has been studied extensively by various experimental groups [5–9]. However, these studies contain several distinct proposals for the crystal structure of  $T_1$ . In order to reconcile the discrepancies in these reports, and to determine the thermodynamically stable crystal structure of the  $T_1$  phase, we previously performed first-principles calculations based on Density Functional Theory (DFT) using crystal structure information in experiments [10]. According to the experimental information, there are two compositional degrees of freedom in the  $T_1$  structure: 1) Li partial occupancy in its position; 2) Al-Cu mixing in two-dimensional configurations. In the previous study, we

first investigated various configurations of the half-occupied Li layers under an assumption of fully occupied Al or Cu in the Al-Cu mixed layer. We then derived a lowest-energy ordered configuration of Al-Cu using cluster expansion methods. Based on our computations, we proposed a new structure of the  $T_1$  phase, which has DFT energy lower than all of the experimentally proposed crystal structures. And, we found the DFT energy of the new proposed structural model places it on the convex hull, and hence this compound is stable (at  $T=0K$ ) in the Al-Cu-Li ternary system. However, there are still some unanswered questions about the structure and phase stability of the  $T_1$  phase: There is a discrepancy of the Li position between experiment [7] and computation [10]. In addition, the DFT-energy of the predicted  $T_1$  phase structure does not have a tie-line with the Al matrix at 0K in ternary Al-Cu-Li system, which is seemingly inconsistent with the experimental observation of two-phase Al+ $T_1$  microstructure.

The precipitate/matrix interfacial structure and energy are important thermodynamic parameters in designing high strengthened alloys. For example, the interfacial energy determines the height of energy barrier for nucleation, number density, morphology, and the size distribution of the precipitates [11]. The solute-interface interaction is also very important in optimizing the microstructure of  $T_1$  precipitates. This is because coarsening of the precipitates can be controlled by solute segregations at interface. Gault et al. [12] found that Ag and Mg solutes do not segregate at the interface, but instead are partitioned inside the  $T_1$  phase, as identified through Atom Probe Tomography (APT). Using the same APT

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method, however, Ag and Mg have been observed to segregate to the  $T_1$ /Al interface by Araullo-Peters et al. [13] and Kang et al. [14]. Araullo-Peters et al. argued that the interfacial segregation cannot be observed when the atom probe probing direction is not perpendicular to the  $T_1$  precipitates [13].

Here, we use first-principles calculations to determine the answers to some of the outstanding questions described above. We explore the detailed Li position in the stable  $T_1$  structure. And we investigated finite-temperature effects (i.e., vibrational entropic contributions) to the thermodynamic stability of the  $T_1$  phase to resolve the discrepancy between experiment and computation regarding the stability of two-phase Al+ $T_1$ . We also derived the low-energy interfacial structure of the coherent  $T_1$ /Al interface and predicted solute segregation behavior to resolve the contradictory of interface-related observations in the literature. The interfacial structure and energy determined here will be useful thermodynamic parameters to future phase-field modeling of microstructure evolution.

We performed first-principles calculations using the Vienna Ab initio Simulation Package (VASP) [15] and projector-augmented wave potentials [16]. We utilized the PBE parameterization of the generalized gradient approximation (GGA-PBE) [17] for all calculations. We relaxed all the cell-internal and cell-external degrees of freedom at an energy cutoff of 520 eV. Gamma-centered k-point meshes were constructed to achieve at least 9,000 k-points per reciprocal atom, giving the convergence of formation energy within 1meV/atom. The interfacial energy and solute segregation energy were converged within 10% and 10meV/solute atom with respect to the supercell sizes used.

Calculations of bulk energetics, interfacial stability, and solute segregation energy at the coherent  $T_1$ /Al interface were performed. First of all, we computed formation energy of compounds in Al-Cu-Li ternary system when in equilibrium with the Al matrix to compare the relative thermodynamic bulk stability at 0K. The key quantity for this calculation is the formation energy *per solute atom* [10]

$$\Delta H^{eq}(\text{Al}_a\text{Cu}_b\text{Li}_c) = \frac{E(\text{Al}_a\text{Cu}_b\text{Li}_c) - [x_A E^{eq}(\text{Al}) + x_B E^{eq}(\text{Cu}) + x_C E^{eq}(\text{Li})]}{x_B + x_C} \quad (1)$$

where  $\Delta H^{eq}(\text{Al}_a\text{Cu}_b\text{Li}_c)$  is the equilibrium formation energy (eV/solute) of a compound relative to the pure components, Al, Cu, and Li.  $E(\text{Al}_a\text{Cu}_b\text{Li}_c)$  is the energy of the compound.  $E^{eq}(\text{Al})$ ,  $E^{eq}(\text{Cu})$  and  $E^{eq}(\text{Li})$  are the energies of the pure components from first-principles calculations. We also computed the vibrational entropies of two previously proposed  $T_1$  structures ( $\text{Al}_6\text{Cu}_4\text{Li}_3$ ,  $\text{Al}_{13}\text{Cu}_7\text{Li}_6$ ) and other phases in the Al-Cu-Li system in order to include the vibrational contribution to the free energy. We use the Phonopy [18] for phonon calculations, which is based on the harmonic approximation. The thermodynamic stability of the  $T_1$ /Al interfaces was investigated based on interfacial energy calculations at 0K. We recently described how to compute interfacial energy based on the chemical potentials of pure elements in multi-component systems where the periodic boundary condition varies with the supercell size in DFT calculations [19]. The interfacial energy determined from a supercell containing the interface and a decomposition of the supercell formation energy into strain and interfacial contributions [20,21]

$$\Delta E_f = \delta E_{cs}(\text{Al}, T_1) + \frac{2\sigma A}{N} \quad (2)$$

where  $\Delta E_f = [(x_A \mu_{\text{Al}} + x_B \mu_{\text{Cu}} + x_C \mu_{\text{Li}})/N]$  is the formation energy per atom relative to the chemical potentials ( $\mu_{\text{Al}}$ ,  $\mu_{\text{Cu}}$ ,  $\mu_{\text{Li}}$ ) of Al, Cu, Li.  $\delta E_{cs}(\alpha, \theta')$  is the coherency strain per atom caused by the lattice mismatch between  $T_1$  and Al.  $N$  is the total number of atoms in the super cell, and  $\sigma$  and  $A$  are the interfacial energy and

area, respectively. We can obtain the interfacial energy by computing the energies of supercells of various sizes and extracting the slope of  $\Delta E_f$  vs.  $1/N$  in Eq. (2). For the chemical potentials of Al, Cu, and Li, we solved the following equations based on three reference (i.e., stable) phases, Al,  $\text{Al}_2\text{Cu}$  ( $\theta'$ ), and  $T_1$  on the calculated convex hull [10] and in experiment [13]

$$\begin{aligned} \mu_{\text{Al}} &= E_{\text{FCC Al}} \\ 2\mu_{\text{Al}} + \mu_{\text{Cu}} &= E_{\theta'(\text{Al}_2\text{Cu})} \\ 6\mu_{\text{Al}} + 4\mu_{\text{Cu}} + 3\mu_{\text{Li}} &= E_{T_1} \end{aligned} \quad (3)$$

The interfacial energy difference is within 20mJ/m<sup>2</sup> depending on reference phases (e.g., Al+ $\text{Al}_3\text{Li}(\delta')$ + $T_1$  vs. Al+AlLi( $\delta$ )+ $T_1$ ). Solute-interface interactions were analyzed by solute segregation energy (eV/solute atom). The segregation energy is defined as the total energy difference as a function of solute atom positions with respect to the interface in a cell. The following formula, for example, is how to compute Ag solute segregation energy at interface.

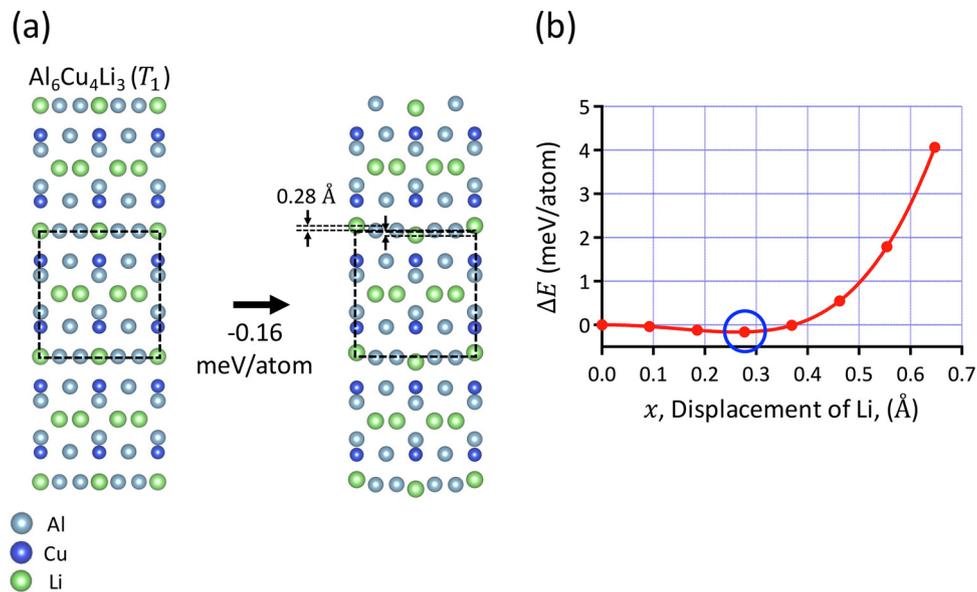
$$\Delta E_{seg} = E(\text{Ag} \rightarrow X) - E(\text{Ag} \rightarrow \text{Al}_b) + \mu_X - \mu_{\text{Al}} \quad (4)$$

Here,  $E(\text{Ag} \rightarrow X) - E(\text{Ag} \rightarrow \text{Al}_b)$  represents the total energy difference as a function of Ag solute position across an interface. The X indicates the sublattice sites near interface. For example,  $\text{Al}_i$  refers the Al plane adjacent to the interface;  $T_{1i}^{\text{Al}}$ ,  $T_{1i}^{\text{Li}}$ , and  $T_{1i-1}^{\text{Cu}}$  represent the lattice planes within the precipitate near interface; and  $\text{Al}_b$  refers to a bulk-like plane in the Al matrix. When a solute is located in Cu or Li sublattice sites of  $T_1$  precipitate, the chemical potentials,  $\mu_X - \mu_{\text{Al}}$  in Eq. (4), can compensate for a different number of atoms between the two supercells (first and second terms on the right side in Eq. (4)). We adopt a sign convention such that sites having  $\Delta E_{seg} < 0$  in Eq. (4) are energetically favorable for solute segregation at interface relative to solid solutions in Al matrix.

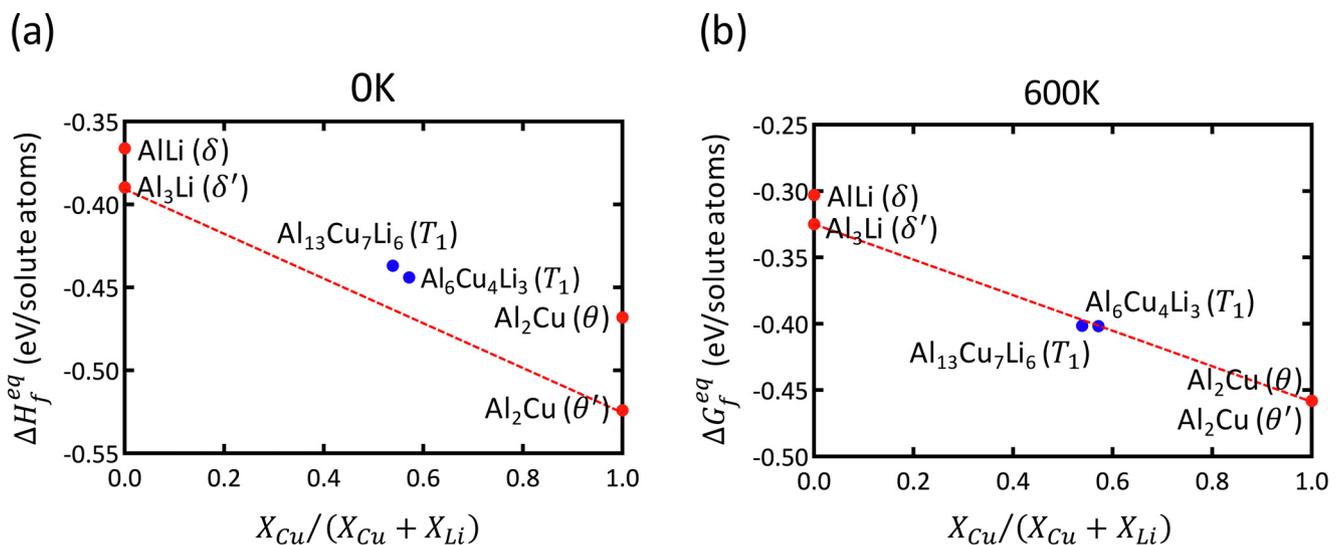
Recently, we proposed [10] the new low-energy structures ( $\text{Al}_6\text{Cu}_4\text{Li}_3$ ,  $\text{Al}_{13}\text{Cu}_7\text{Li}_6$ ) of the  $T_1$  phase using first-principles density functional theory calculations combined with cluster expansion methods. The proposed  $T_1(\text{Al}_6\text{Cu}_4\text{Li}_3)$  phase is energetically stable on the calculated convex hull of the Al-Cu-Li system at 0K. Previously, we investigated various configurations of the Li layers in a  $T_1$  bulk structure under an assumption of fully occupied Al or Cu in the mixed layer. We first defined these Li orderings, and subsequently explored Al-Cu configurations using first-principles calculations with cluster expansion methods. We found that the Li atoms are energetically favorable when located on the flat plane along the z-fractional coordinate,  $(111)_{\text{Al}}$ , in the  $T_1$  bulk structure [10]. Since the Li position in the bulk  $T_1$  structure deviates the flat plane experimentally [7], we further investigated ordering of Al-Li positions in a DFT-predicted  $T_1(\text{Al}_6\text{Cu}_4\text{Li}_3)$  structure to ascertain how the ordered Al/Cu layers impact on the Al-Li configurations.

Fig. 1(a) represents the crystal structure of the  $T_1$  phase ( $\text{Al}_6\text{Cu}_4\text{Li}_3$ ) including the lowest-energy ordering found for the Al-Cu layers. A search was done for the lowest configurations of Al-Li layers in the structure depicted in in Fig. 1(b). We confirmed that the new Li position induces a lowering of energy by 0.16 meV/atom, and the corrected Li positions along the z-fractional coordinate,  $(111)_{\text{Al}}$ , are 0.956 and 0.044 of Li (2) instead of 0 in Table 5 of our previous study [10].

The DFT-predicted  $T_1$  phase is stable on the calculated convex hull of the Al-Cu-Li system [10], however, it does not have a tie-line with Al, inconsistent with the experimental phase diagram [10] as shown in Fig. 2(a). To resolve this problem, we performed finite-temperature stability analysis of  $T_1$  in this work. The configurational entropic stabilization due to the mixing of Al-Cu layers is not large enough to make a tie-line between  $T_1$  and Al [10]. Thus, we investigated vibrational entropic contribu-



**Fig. 1.** (a) (Left) The DFT-predicted structure of the  $T_1$  phase,  $\text{Al}_6\text{Cu}_4\text{Li}_3$ , stable on the calculated convex hull in ternary Al-Cu-Li [10] (Right) The Li position is corrected with a displacement of 0.28 Å along the interfacial normal direction,  $(111)_{\text{Al}}$ , in this work (b) Total energy variation as a function of displacement of Li along the  $(111)_{\text{Al}}$ . The calculation represents that the displacement of 0.28 Å is a lowest-energy state.



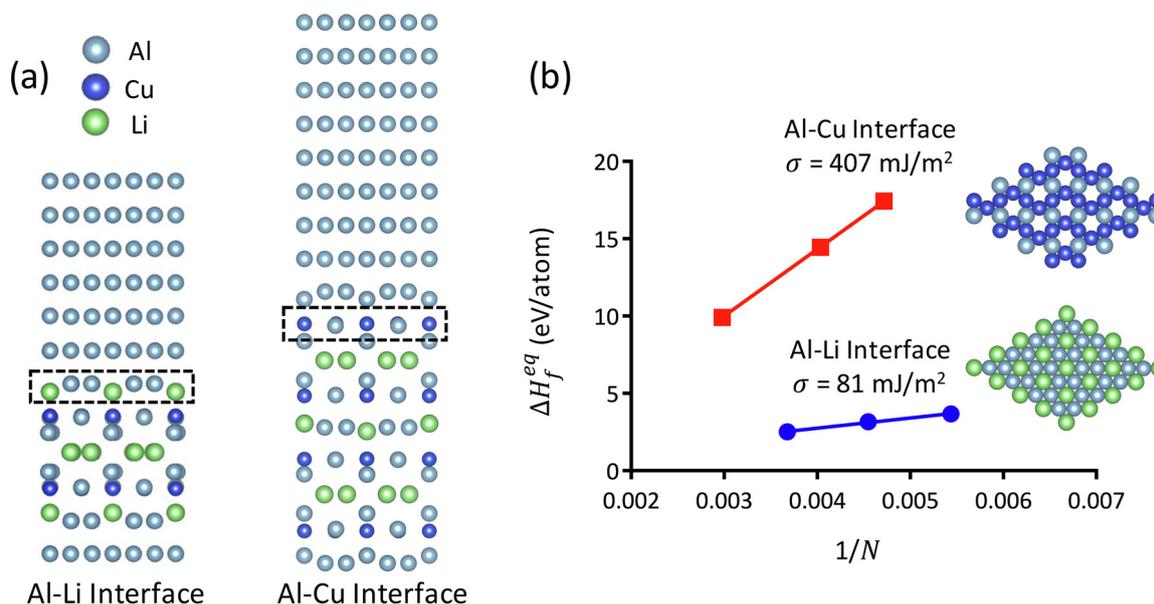
**Fig. 2.** Calculated formation free energies (eV/solute atom) from Eq. (1) as a function of fraction of Cu and Li at (a) 0K and (b) 600K. These energies represent the thermodynamic stability of various compounds when in equilibrium with Al matrix in the ternary Al-Cu-Li system. Blue circles indicated the previously-proposed DFT  $T_1$  phases ( $\text{Al}_6\text{Cu}_4\text{Li}_3$ ,  $\text{Al}_{13}\text{Cu}_7\text{Li}_6$ ) [10]. At  $T=600\text{K}$ , the vibrational entropy stabilizes the two  $T_1$  phases, resulting a break of the convex hull between  $\text{Al}_3\text{Li}$  ( $\delta'$ ) and  $\text{Al}_2\text{Cu}$  ( $\theta$ ) at 600K. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.).

tions to phase stability of  $T_1$  phase in the ternary Al-Cu-Li system. The detailed information (e.g., the formation enthalpies and entropies) is in Supplementary material. The formation free energies of Al-based compounds were computed using Eq. (1), which allows us to determine the stable phases in equilibrium with the Al matrix at 0 and 600K. In Fig. 2(b), we found that the vibrational entropy contributes stabilization of the two DFT-predicted  $T_1$  phases at finite-temperature of 600K. The entropically stabilized  $T_1$  phase breaks the convex hull (dotted in red), which is consistent with the experimental phase diagram. The equilibrium phase of the tetragonal (C16) structure of  $\text{Al}_2\text{Cu}$  ( $\theta$ ) is not the stable phase in  $T=0\text{K}$  DFT calculations as shown in Fig. 2(a). This was explained by the role of the vibrational entropies of  $\theta$  and  $\theta'$ , which were found to be unexpectedly important for the  $\text{Al}_2\text{Cu}$  phase as proposed by Wolverton and Ozoliņš [22]. In the ternary Al-Cu-Li system at 0K,  $\text{Al}_6\text{Cu}_4\text{Li}_3$  is more stable than  $\text{Al}_{13}\text{Cu}_7\text{Li}_6$ , however,

at a temperature of 600K,  $\text{Al}_{13}\text{Cu}_7\text{Li}_6$  has slightly more favorable energetics.

The multi-scale modeling from atomistic to mesoscale is a well-known design strategy in the ICME paradigms [23]. And the precipitate-matrix interfacial structure and energy are key pieces of atomistic information that can be used for mesoscale phase-field modeling of microstructural evolution. For example, the interfacial energy is an important input parameter for determining the gradient energy coefficient of the diffuse-interface approach in the phase-field method [24]. Hence, we next turn to the interfacial energy, and the concomitant requirement of determining the interfacial structure between  $T_1$  and Al.

In order to construct an atomistic model of the  $T_1/\text{Al}$  interface, one must know the orientation relations between the precipitate and matrix crystal structures, as well as the energetically preferred termination of the precipitate phase at the interface. The



**Fig. 3.** (a) Relaxed atomic models for the (0001)<sub>T1</sub>/(111)<sub>Al</sub> interfaces with different interfacial terminations (Left: Al-Li, Right: Al-Cu). (b) First-principles formation energies of N-atom super cells as a function of  $1/N$  for the interface. The interfacial energies ( $\sigma$ ) were extracted from the slopes by Eq. (2). The interface with Al-Cu termination has a higher slope, as such, extracted interfacial energy is higher than the interface with Al-Li termination.

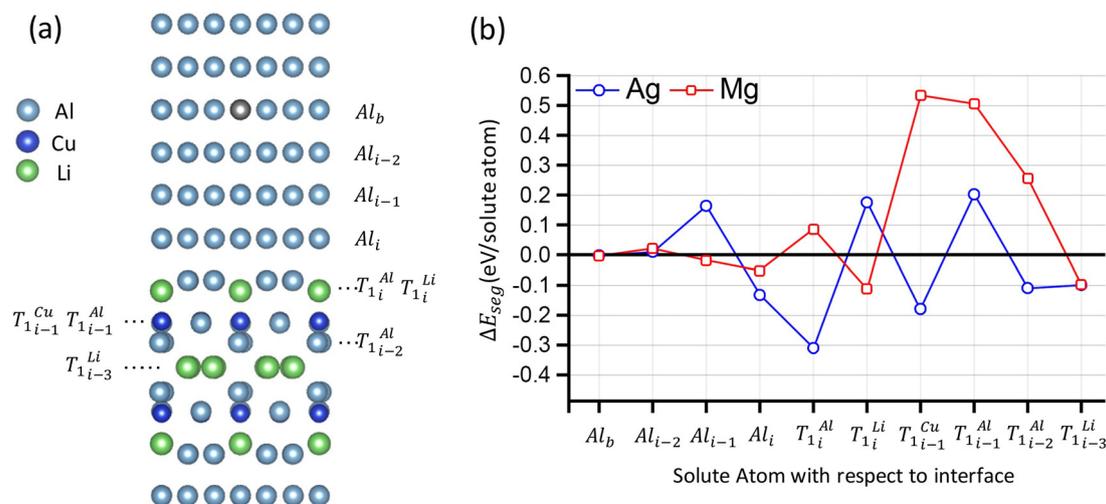
$T_1$  precipitate forms on the {111} planes of the fcc Al matrix and have hexagonal platelet shapes [4]. According to the previous literatures, Donnadiou et al. [8] observed that the Al-Cu layers of the  $T_1$  structure are the terminating planes of the precipitates by aberration-corrected High-Angle Annular Dark-Field Scanning Transmission Electron Microscopy (HAADF-STEM). However, Dwyer et al. [9] identified at around the same time using the same technique that the terminating precipitate layer of the interfacial structure with an Al matrix is the Al-Li corrugated layer. Based on the two experimental observations, we performed interfacial energy calculations for the two different interfacial structures to derive a low-energy structure and compute the corresponding energies by Eqs. (2) and (3).

Fig. 3(a) represents the  $T_1$ /Al interface supercells with two different terminations, Al-Cu and Al-Li layers, respectively. Our calculations found a compound interfacial energy of 81 mJ/m<sup>2</sup> when the nearest atoms to the interface are Al and Li. And we found that the corrugated Li layers shifted toward the Al matrix in the  $T_1$ /Al interfacial structure due to interactions with Al matrix after DFT relaxation in Fig. 3(a) (Left), consistent with two experimental observations during precipitation [9,14]. The Al-Cu terminated interface has a much higher interfacial energy of 407 mJ/m<sup>2</sup>. The preference of Al-Li termination can be understood because the Al-Li layers are more closed-packed in two dimensions compared to the Al-Cu layers as shown in Fig. 3(b). Our finding here of Al-Li termination of the precipitate at the interface is consistent with the experimental work by Dwyer et al. [9].

Aluminum alloys are complex multi-component systems, and for example, minor solutes such as Ag and Mg are common elements in designing Al-Cu-Li alloys. The Ag and Mg solutes play an important role in stabilizing the {111} habit plane and promoting nucleation for the hexagonal structure of  $\Omega$  and  $T_1$  precipitates [25,26]. Recent experiments [13,14] show that the Ag and Mg solutes segregate to the  $T_1$ /Al interfaces, which is in contrast with Gault's finding [12] by the same experimental atom-probe tomography technique. To address this controversy and determine the solute segregation behavior at the interface, we calculated segregation energies of Ag and Mg solutes across the  $T_1$  coherent inter-

Fig. 4(a) depicts the relaxed atomic models for solute segregation energy calculations for the  $T_1$ /Al interface determined in Fig. 3(a). The solute position with respect to the lattice plane is indicated based on the  $T_1$ /Al interface. For example, we indicate lattice planes near the interface as  $Al_i$  toward the Al matrix and  $T_{1i}$  toward the precipitate, respectively. Fig. 4(b) shows computed segregation energies of Ag and Mg solutes. A layer with a negative energy means that the solute is energetically favorable in the site compared to the Al bulk-like layer indicated as  $Al_b$ . It is shown that minor additions of Ag and Mg are thermodynamically favorable for interfacial segregations in agreement with Araullo-Peters et al. [13] and Kang et al. [14]. For example, Ag solute is favorably located on Al or Cu sites at the interface (-0.31 eV/atom on  $T_{1i}^{Al}$ , and -0.18 eV/atom on  $T_{1i-1}^{Cu}$ , respectively). Mg solutes prefer to locate on Li sites at interface (-0.11 eV/atom on  $T_{1i}^{Li}$ ). Thus, we conclude that Ag and Mg solutes segregate at the interface due to thermodynamic driving forces.

We have studied the thermodynamic stability of the bulk and interfacial structure of the  $T_1$  precipitate in Al alloys. We refined the Li positions in the recently proposed  $T_1$  structure. We found that the Li layers in the  $T_1$  precipitates show a small instability and can relax away from high-symmetry positions, slightly lowering the bulk energetics. To clarify the two-phase tie line between  $T_1$  and the Al matrix on the convex hull of Al-Cu-Li systems, we performed harmonic phonon calculations to determine the vibrational entropic stabilization. At 600K, our DFT-predicted  $T_1$  structures are equilibrium with the Al matrix, consistent with the experimental phase diagram. We also derived a low-energy interfacial structure and energy. The low-energy interfacial structure has Al-Li atoms terminating the precipitate phase nearest to the interface. The computed lowest interfacial energy is 81 mJ/m<sup>2</sup>, which is significantly lower than that with Al-Cu termination. The minor solute segregation behaviors were investigated to resolve a discrepancy between previous observations. We found that Ag and Mg solutes were predicted to segregate at the coherent  $T_1$ /Al interface based on the segregation energy calculations across the interface. We believe that our findings will form a basis for the integrated Computational Materials Engineering (ICME) approach for designing high-strengthened Al-Cu-Li based alloys.



**Fig. 4.** (a) The relaxed atomic models for the coherent (0001)<sub>Ti1</sub>/(111)<sub>Al</sub> interface used in our first-principles calculations. The black atom in the supercell illustrates a position of Ag and Mg atoms at a bulk-like site in the Al matrix. We labeled the lattice planes according to a distance from the interface plane. For example,  $Al_b$  refers to a bulk-like plane in the Al matrix;  $Al_i$  and  $T_{1i}$  represent the Al and  $T_1$  planes adjacent to the interface. (b) Calculated Ag and Mg solute segregation energies as a function of distance from the coherent interface. The blue points represent Ag solute and red points represent Mg solute at the interface, respectively. The sites that have a sign convention of are energetically favorable compared to Al bulk-like sites in the matrix.

## 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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## Supplementary materials

Supplementary material associated with this article can be found, in the online version, at doi:10.1016/j.scriptamat.2021.114009.

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