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# Mechanical Properties of Copper with Dendritic Silver Inclusions: Insights from Molecular Dynamics Simulations

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## ABSTRACT

This study explores the mechanical behavior of single-crystal copper with silver inclusions, focusing on the effects of dendritic and spherical geometries using molecular dynamics simulations. Uniaxial tensile tests reveal that dendritic inclusions lead to an earlier onset of plasticity due to the presence of high-strain regions at the complex inclusion/matrix interfaces, whereas spherical inclusions exhibit delayed plasticity associated with their symmetric geometry and homogeneous strain distribution. During the plastic regime, the dislocation density is primarily influenced by the volume fraction of silver inclusions rather than their shape, with spherical inclusions showing the highest densities due to their larger volume and higher silver content. Stacking faults, quantified via hexagonal closed-packed atom populations, are strongly correlated with dislocation activity but exhibit transient behavior, indicating that many faults are swept out or transformed during deformation. This transient effect is observed in all cases, independently of the inclusion size. These findings highlight the complex interplay between inclusion geometry, dislocation activity, and stacking fault evolution in shaping the mechanical properties of copper. The study underscores the need to account for inclusion morphology and defect dynamics when designing advanced copper-based materials and suggests further investigations into the role of dendrite orientation and distribution to enhance material performance in engineering applications.

## KEYWORDS

Dendrites; inclusions; mechanical properties; molecular dynamics

## 1 Introduction

Secondary metallic phases in metal matrices significantly influence mechanical properties such as strength, hardness, and ductility. These phases, formed through alloying or thermal treatments, can enhance performance depending on their composition, size, and distribution [1–4]. Dendritic structures, which commonly form during solidification, also play a crucial role in determining mechanical behavior, impacting strength, hardness, and ductility based on factors such as arm spacing, distribution, and volume fraction [5–9]. Understanding these interactions is essential for optimizing the mechanical properties of metals in advanced engineering applications, including nuclear reactors, turbines, electrocatalysis, and the development of lighter materials [10–13].



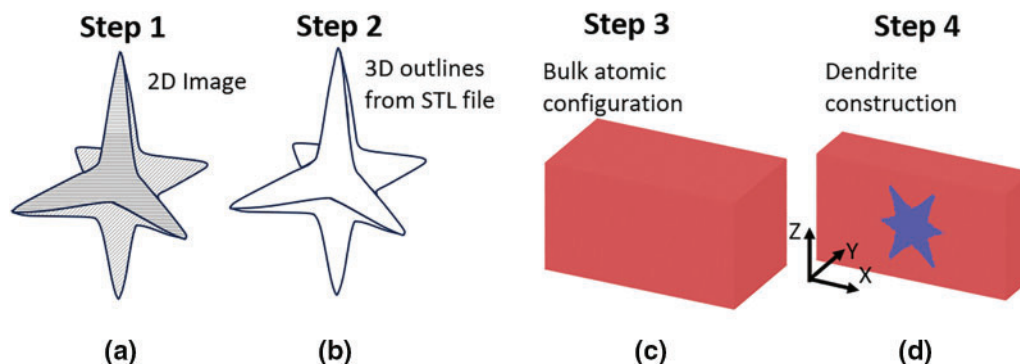
Molecular dynamics (MD) simulations are a valuable tool for exploring the effects of inclusions on the mechanical behavior of materials. Various studies can be found in the literature. Some examples include investigations into plastic deformation mechanisms in Cu-Ag core-shell nanowires [14], the enhancement of tensile strength by Zn species in Al samples [15], interaction mechanisms in Fe samples with P impurities and nano oxides [16], and P-induced embrittlement in W grain boundaries [17], among many others [18–22]. Most current research has focused on dispersed impurities, laminates, or spherical precipitates. However, more complex structures, such as dendrites, have rarely been addressed. A recent study systematically explored the effect of crystalline dendrites on the plastic response of CuZr metallic glasses [23]. Despite this novel approach, each sample considered only a single planar dendrite, leaving the effects of three-dimensional structures and their interactions unaddressed. Several efforts have been made to simulate dendritic structures using phase-field models informed by data from MD simulations. Examples include the study of titanium solidification and crystal-melt interfacial properties [24], crystallization kinetics and crystal growth mechanisms in titanium [25], and interfacial energy anisotropy in Al-Cu systems [26], among others. These works have provided valuable insights into the thermodynamics and kinetics of dendritic growth, but no studies have yet explored the effects of dendrites on mechanical behavior.

In this work, three-dimensional dendritic structures are constructed and simulated using molecular dynamics (MD) simulations to evaluate their effect on the mechanical properties of Cu. Artificial intelligence tools are used to generate the dendrites, with Ag chosen as the atomic species for the dendritic structures. Uniaxial tensile tests are performed to assess the mechanical performance of Cu samples containing a single dendrite. For comparison, Cu samples containing a single spherical inclusion are also considered. Mechanical properties, plasticity, and atomic-level descriptions are provided to elucidate the influence of these dendritic structures.

## 2 Methodology

### 2.1 Construction of Dendritic Structures

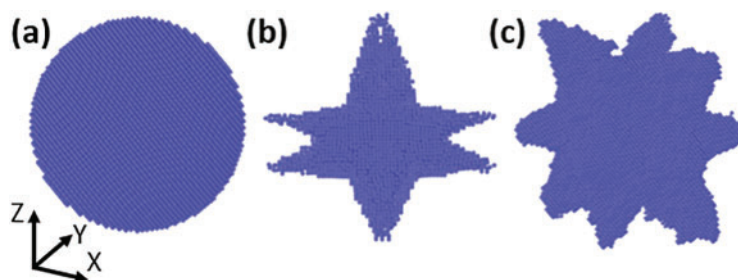
Constructing three-dimensional dendritic structures is a complex task, as experimental data typically consists of two-dimensional images. Therefore, it is necessary to develop methodologies that can generate three-dimensional structures from two-dimensional data. In recent years, various artificial intelligence (AI) tools have been developed to accomplish this, many of which are freely available online. In this work, the AI-based 3D model generator MESHY [27] was employed. The software utilizes computer vision to generate three-dimensional representations from two-dimensional objects. Two different images of dendritic structures were used as input data, selected from the work of Kim et al. [28], where the authors used phase-field simulations to produce growth morphologies. The process for transforming the images into three-dimensional representations is outlined in Fig. 1. In the first step, the two-dimensional image was uploaded to Meshy. In the second step, Meshy generated a three-dimensional representation, producing an stereolithography (STL) file. In the third step, a bulk atomic configuration with dimensions of  $32.5 \times 18.1 \times 18.1 \text{ nm}^3$  was constructed, with orientations [100], [010], and [001]. In the fourth step, the dendrite was introduced into the atomic configuration. To achieve this, the coordinates of the three-dimensional shape were extracted from the STL file and mapped to the length scales of the atomic configuration. The supervised learning KNN algorithm [29] was then used to classify atoms as either part of the dendritic structure or the matrix, based on their atomic coordinates. Atoms with coordinates similar to those in the STL file were classified as part of the dendritic structure, while the remainder were classified as part of the matrix.



**Figure 1:** Pipeline for the construction of dendritic structures. (a) Selection of two-dimensional image, (b) three-dimensional representation produced by Meshy, (c) construction of the atomic configuration, and (d) introduction of the dendritic structure in the atomic configuration

## 2.2 Preparation of the Samples

The obtained configurations, consisting of a dendritic structure embedded in a matrix, were used to study the mechanical behavior of single-crystal Cu with Ag inclusions. The dendritic structures were assigned to Ag atoms, while the matrix was assigned to Cu atoms. In addition to the two dendrites, a spherical inclusion with a radius of  $R$  was also considered. The two dendrites were scaled to have similar equivalent radii, resulting in six different Cu/Ag inclusion configurations: two dendrites and one spherical inclusion with a radius of 4.5 nm, and two dendrites and one spherical inclusion with a radius of 6.0 nm. The configuration with the spherical inclusion is referred to as the S sample hereafter, while the configurations with dendritic structures are referred to as D1 and D2 samples. The three inclusions for  $R = 6.0$  nm are shown in Fig. 2. To relax the inclusion, the metal matrix, and the inclusion/matrix interface, energy minimization was conducted with the conjugate gradient method using a stopping energy tolerance of  $10^{-6}$  and a maximum of  $10^5$  iterations. Then, each configuration was annealed at 600 K and zero pressure for 0.4 ns to obtain a well-relaxed inclusion/matrix interface, with periodic boundary conditions (PBCs) applied in all directions using the NPT ensemble. The samples were then relaxed at 50 K and zero pressure for 0.1 ns. Table 1 summarizes the different inclusions considered and the total number of Ag atoms in each configuration. An integration timestep of 1 fs was employed in all the simulations.



**Figure 2:** Three-dimensional representation of the three defects with radius  $R = 6.0$  nm: (a) S, (b) D1, and (c) D2 inclusions. The  $x, y, z$  directions are oriented as  $[100]$ ,  $[010]$ ,  $[001]$

**Table 1:** Inclusions under consideration in this study, their equivalent radius (for D1 and D2), and the total fraction of Ag in each of them

Sample	Radius (nm)	Ag at %
S	4.5	2.5
D1	4.5	0.5
D2	4.5	1.1
S	6.0	6.1
D1	6.0	1.3
D2	6.0	2.8

### 2.3 Tensile Tests

Uniaxial tensile tests were conducted by scaling the atomic positions in the  $x$  direction at a strain rate of  $10^8 \text{ s}^{-1}$ , while applying periodic boundary conditions (PBCs) in the  $y$  and  $z$  directions at zero pressure. The temperature was maintained at 50 K to reduce atomic fluctuations for analysis purposes. The simulations were conducted with the NPT ensemble using an integration timestep of 1 fs. The Dislocation eXtraction Algorithm (DXA) [30] was employed to inspect dislocation nucleation. This algorithm uses Burgers circuit integrals over the elastic field and the Common Neighbor Analysis (CNA) [31,32] method to identify atomic structures. The dislocation density was calculated as  $\rho_D = L/V$ , where  $L$  is the total dislocation length provided by DXA, and  $V$  is the total volume of the configuration. Visualization of the results was performed using the Open Visualization Tool (OVITO) [33].

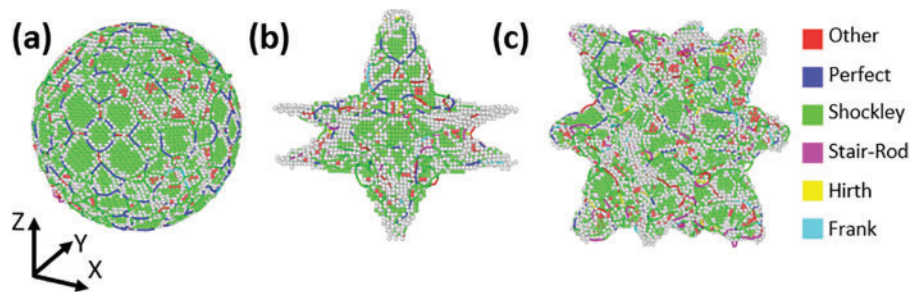
All simulations were conducted using the Large-scale Atomic/Molecular Massively Parallel Simulator (LAMMPS) [34,35]. Atomic interactions were modeled with the potential developed by Williams et al., based on the embedded atom method (EAM) framework [36]. The equations were integrated with a timestep of 1 fs.

## 3 Results and Discussions

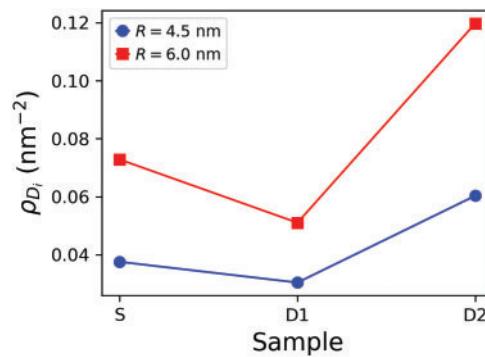
### 3.1 Annealing

When studying metals at the atomic scale, whether they contain grain boundaries, voids, vacancies, or inclusions, it is essential to conduct annealing to relax the interfaces. During this procedure, it is expected that dislocation nucleation, twinning, grain size reduction, or small atomic rearrangements occur [37–40]. To address this matter, the dislocations nucleated after the annealing process were examined. Fig. 3 shows the dislocations identified by DXA in the 6.0 nm spherical and dendritic inclusions. Blue lines correspond to perfect dislocations, while atoms in green, white, and red correspond to face-centered cubic (FCC), hexagonal closed-packed (HCP), and other (unidentified) structures, respectively, as indicated by CNA. In the case of the spherical inclusion, perfect dislocations are homogeneously distributed due to the high symmetry of the spherical geometry. Most of the atoms remain in the FCC structure, with some exhibiting unidentified structures, typically found at the interfaces of two different phases due to atomic mismatch [41–44]. In contrast, for the dendritic inclusions, dislocations are heterogeneously distributed, with a high fraction of Ag atoms showing unidentified structures. Moreover, the presence of Ag atoms exhibiting HCP structure is more prominent in both D1 and D2 compared to the spherical inclusion. The dislocation density

after annealing in each configuration was calculated, resulting in the values shown in Fig. 4, where  $\rho_{D_i}$  denotes the initial dislocation density, which will be referenced in the following sections. As observed, the  $R = 4.5$  nm samples exhibit a lower density due to their smaller volume compared to their 6.0 nm counterparts. A similar phenomenon is noted when comparing the three structures. D1, which has the smallest volume of Ag atoms (see Table 1), has the lowest dislocation density, while D2, with the largest volume, exhibits the highest density. From these results, it can be concluded that, after annealing, dislocation density is directly related to the size of the inclusions. Dislocations are essential to metal stability, enabling controlled deformation under stress by allowing atomic layers to slip, which prevents brittle fracture. Their movement strengthens metals through work hardening, while interactions with grain boundaries enhance toughness and resistance to further deformation. However, it is important to note that the present study focuses only on single-crystal samples rather than polycrystalline ones.



**Figure 3:** Dislocations identified by DXA in the 6.0 nm (a) inclusion, (b) D1, and (c) D2 structures. Dislocation lines are colored according to the type indicated in the legend, while atoms in green, white, and red correspond to FCC, HCP, and Other structure, respectively

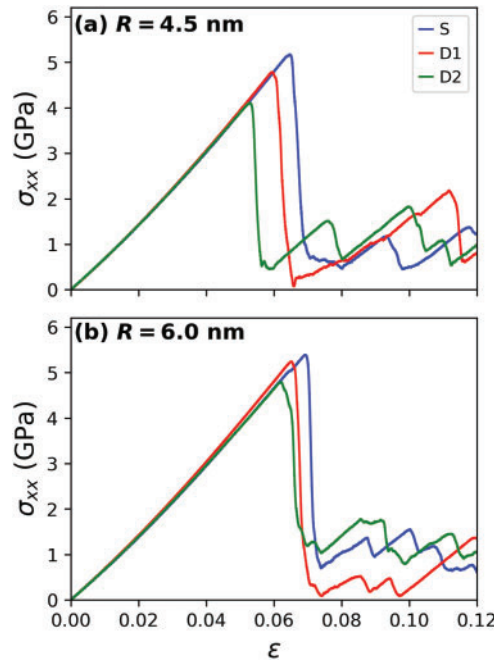


**Figure 4:** Dislocation density in each configuration after annealing

### 3.2 Stress-Strain Curves

Mechanical characterization was performed using uniaxial tensile tests, resulting in the stress-strain curves shown in Fig. 5. In the 4.5 nm samples, the elastic regime is very similar across the three samples. However, yielding occurs earlier in the D2 sample, followed by D1, and then by the S sample. A sawtooth-like behavior is observed, typical of single-crystal metals, due to dislocation nucleation [45,46]. In the case of the 6.0 nm samples, the elastic regime remains similar up to 0.02 strain. However, slight differences arise as the samples approach the onset of yielding, suggesting that the increased Ag content (ranging from 1.3% to 6.1%) affects the onset of plasticity. Additionally, the S samples

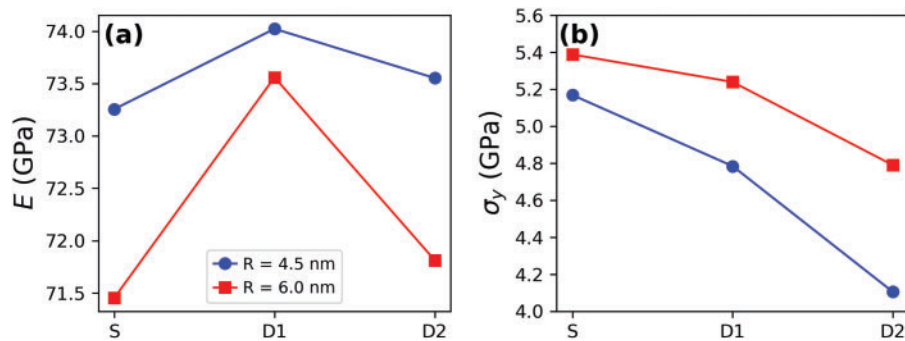
exhibit the highest yield stress. Nevertheless, the plastic regime indicated by the stress-strain curves does not show significant differences. Stress-strain curves for single-crystal Cu with Ag inclusions, in both spherical and dendritic forms, can inform targeted applications. If dendritic inclusions show earlier onset of plasticity, they could be beneficial in load-bearing applications requiring adaptability under fluctuating loads, such as connectors or structural components exposed to impacts. In the case of spherical inclusions, they contribute to higher yield strength, which may enhance wear resistance in precision parts like electrical contacts or microscale mechanical systems.



**Figure 5:** Stress-strain curves from the uniaxial tensile tests for the (a) 4.5 nm and (b) 6.0 nm radius inclusions

Quantification of the Young's modulus ( $E$ ) and yield stress ( $\sigma_y$ ) were performed by calculating the slope of the curves in the elastic regime and the maximum stress for each curve, respectively. The values are shown in Fig. 6. As observed, the S samples display the lowest  $E$ , whereas the D1 samples the highest. Previous studies have reported that Cu has a Young's modulus close to  $\sim 80$  GPa in the [100] direction [45,47] while Ag has a value close to  $\sim 44$  GPa [36,48], depending on the temperature and applied strain rate. This way, the trends observed here can be interpreted in the following manner according to Table 1: the larger content of Ag in the S samples reduce the value of  $E$ , while the lower content of Ag in the D1 samples increase the value of  $E$ . Regarding the yield stress, the S samples exhibit the highest  $\sigma_y$ , while the D2 samples show the lowest. Although the S samples possess the highest volume fraction of Ag species, yielding occurs earlier in the configurations with decreasing Ag content. Previous studies have reported that Ag promotes deformation mechanisms in single-crystal Cu, such as dislocation nucleation and twin boundary migration [46,49]. This indicates that a more complex phenomenon is responsible for the observed contradiction. Insights into this matter will be provided in the following sections.

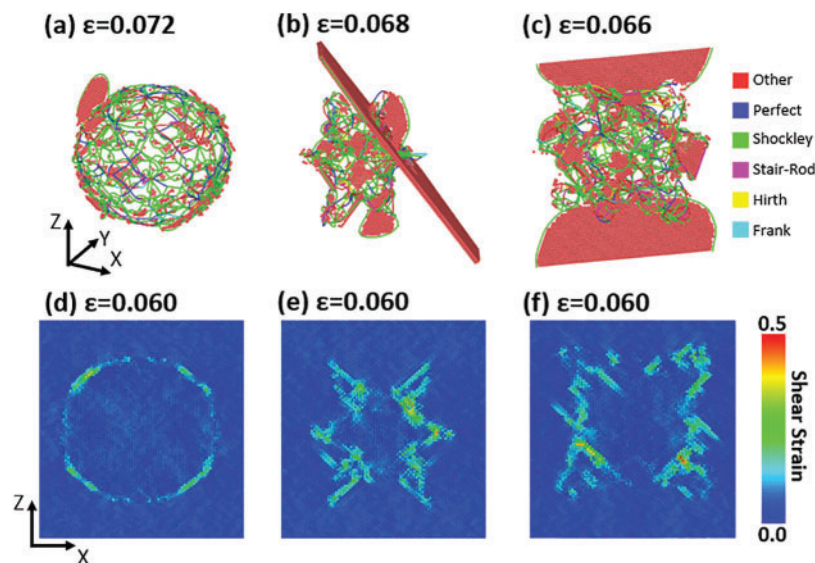




**Figure 6:** (a) Young's modulus and (b) yield stress ( $\sigma_y$ ) for each sample

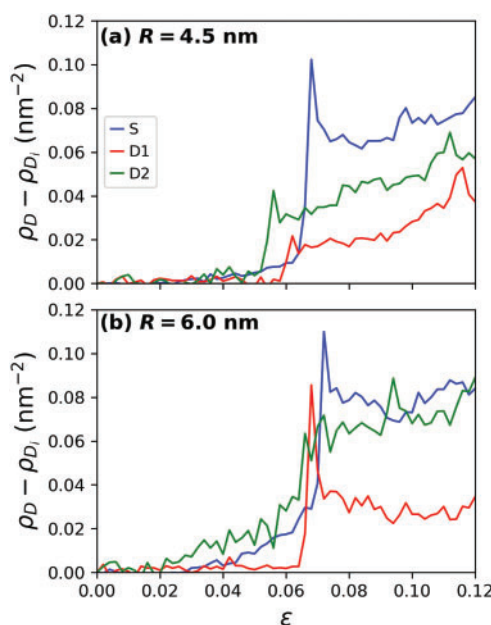
### 3.3 Plastic Behavior

Qualitative descriptions of the deformation behavior were conducted using DXA and CNA. Fig. 7a–c shows the onset of plasticity for the 6.0 nm configurations, where lines correspond to dislocations identified by DXA, and atoms are colored according to CNA. FCC atoms were removed for visualization purposes. In the case of the S sample, plasticity initiates from the surface of the spherical inclusion, characterized by a leading partial dislocation (green lines) and a stacking fault (red atoms). For the dendritic inclusions, plasticity begins earlier and more abruptly, with large partial dislocations and stacking faults. As observed from the strain fields in Fig. 7d–f, the higher symmetry of the spherical inclusion induces a homogeneous strain distribution prior to the onset of plasticity. In contrast, the complex shapes of the dendrites involve regions with both high and negligible strains, ultimately leading to the abrupt onset of plasticity. Characterizing the geometric effects of the dendrites on the plastic response is a challenging task due to their three-dimensional nature and is beyond the scope of the current study.



**Figure 7:** Onset of plasticity of the (a) S, (b) D1, (c) D2 samples, where lines correspond to dislocations (see the legend) and red atoms to stacking faults. Strain fields of the (d) S, (e) D1, (f) D2 samples just before the onset of plasticity

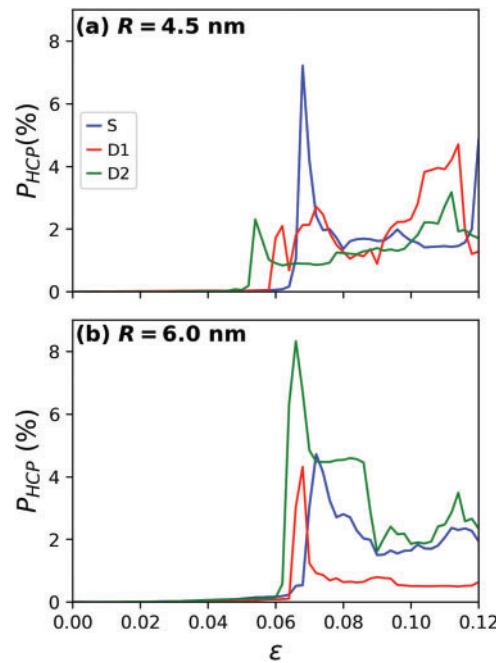
Plasticity was quantified by means of dislocation density ( $\rho_D$ ), resulting in the curves shown in Fig. 8. The initial dislocation density ( $\rho_{D_i}$ ), which is the density after annealing, was extracted from the calculations. The dislocation density of the D1 and D2 samples increases earlier, as expected from the earlier onset of plasticity observed in the stress-strain curves. However, during the plastic regime, the S sample exhibits the highest density, followed by D2 and then D1. As shown in Table 1, the highest fraction of Ag species corresponds to the S sample, followed by D2 and then D1. These results indicate that the complex shape of the dendritic structure is most relevant for the onset of plasticity, due to the presence of highly strained regions at the inclusion/matrix interface. However, during the plastic regime, the volume fraction of the inclusion becomes more relevant, where a larger fraction of the inclusion correlates with increased dislocation activity.



**Figure 8:** Dislocation density ( $\rho_D$ ) for the (a) 4.5 nm and (b) 6.0 nm radius inclusions during the tensile tests. The initial dislocation density ( $\rho_{D_i}$ ) was extracted from  $\rho_D$ . The dislocation densities shown here consider all dislocation types

In addition to partial dislocation nucleation, stacking faults are also formed during the plastic regime, as previously observed in Fig. 7. Although quantifying the number of stacking faults is challenging, insights can be gained by calculating the number of HCP atoms associated with these planar defects, albeit with certain limitations. For instance, depending on the atomic arrangement, HCP atoms in a monolayer can represent twin boundaries [50–52]. The variations in the population of HCP atoms are shown in Fig. 9. The pattern is very similar to that of the dislocation densities; specifically, the D1 and D2 samples exhibit an earlier increase in the populations of HCP atoms. However, for the 4.5 nm cases, the S samples show a strong peak followed by a drastic decrease, while the opposite behavior is observed in the D1 and D2 samples. In contrast, for the 6.0 nm cases, all samples exhibit sharp peaks during the onset of plasticity, which then decrease to semi-stable populations. It is important to note that not all HCP atoms correspond to stacking faults; some may represent isolated atoms or noisy atoms identified by CNA. Moreover, stacking faults are formed by leading partial dislocations and can be eliminated by trailing partial dislocations. Therefore, not all stacking faults persist during deformation; many can disappear throughout the process [53,54].

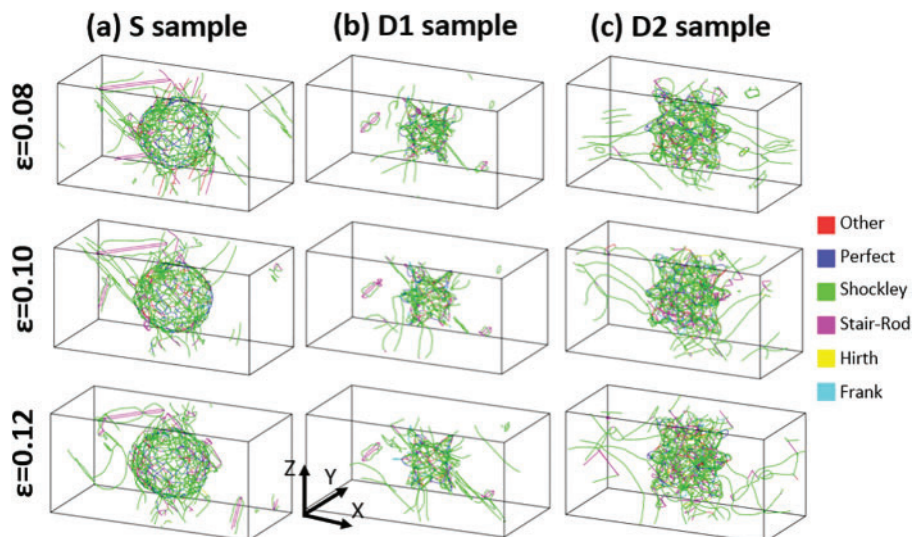




**Figure 9:** Populations of HCP atoms for the (a) 4.5 nm and (b) 6.0 nm radius inclusions during the tensile tests

To further examine plastic activity, dislocations in the 6.0 nm samples at various strain levels were analyzed, as illustrated in [Fig. 10](#). In all three cases, dislocations propagate from the inclusion/matrix interface to the surrounding material. As noted earlier, most dislocations are Shockley partials, with some traces of Stair-Rod dislocations. Comparing the three configurations, the S and D2 samples exhibit a substantial number of line defects, reflecting the higher dislocation densities shown in [Fig. 8](#). This high density results in entangled dislocations, which can eventually lead to work hardening, consistent with the higher stress observed in the stress-strain curves for the S and D2 samples relative to the D1 case in [Fig. 5b](#).

Dislocation densities and stacking faults play a critical role in the mechanical performance of metals in real-world applications. High dislocation densities generally increase strength through mechanisms like work hardening, where dislocations obstruct their movement, enhancing the resistance to further deformation. This is valuable in applications requiring durability under repeated loading, such as in structural beams or aerospace components. Stacking faults also impact mechanical properties by modifying the slip behavior, thereby affecting ductility and toughness. In materials with controlled stacking fault densities, these faults might enhance energy absorption and resistance to fracture, making them ideal for demanding applications in construction and automotive industries where resilience under impact or high loads is essential. Overall, managing dislocation densities and stacking faults provides a powerful approach to optimizing strength and toughness for specific engineering applications.



**Figure 10:** Dislocations in the 6.0 nm radius (a) S, (b) D1, and (c) D2 samples at different strains. Dislocations are colored according to the type indicated in the legend. Atoms were removed for visualization purposes

#### 4 Conclusions

In this study, we investigated the mechanical properties of copper with silver inclusions, specifically focusing on the influence of dendritic structures using molecular dynamics simulations. Our findings demonstrate that the complex morphology of dendrites affects the onset of plasticity and the subsequent dislocation behavior. The dislocation density results indicate a direct relationship between the shape of the inclusions and the nucleation of dislocations, with dendritic structures facilitating earlier plastic deformation compared to spherical inclusions. Notably, the largest dislocation activity was observed in samples with higher volume fractions of inclusions, highlighting the importance of not only the inclusion geometry, but also its volume fraction in determining the mechanical response of copper.

Furthermore, the quantification of stacking faults through HCP atom analysis provided additional insights into the deformation mechanisms at play. While HCP populations were shown to correlate with dislocation densities, the behavior of stacking faults revealed that not all defects persist during deformation. However, it is important to note that HCP atoms are not necessarily a reliable representation of stacking faults. This study underscores the necessity of considering both inclusion shape and defect dynamics when designing copper-based materials for advanced engineering applications.

Future work could explore the effects of varying dendrite orientations, branching patterns, and spatial distributions on mechanical performance, as these factors may impact dislocation mobility and deformation pathways. Experimental studies using SEM imaging could validate simulation findings by visualizing dendrite morphology and dislocation structures, providing direct insights into the microstructural behavior under stress. Additionally, multi-scale simulations or experimental analyses could further examine the thermal stability of these inclusions and their influence on fatigue

resistance, broadening our understanding of how dendritic structures can enhance the durability and performance of copper-based alloys in engineering applications.

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**Availability of Data and Materials:** The data that support the findings of this study are available from the corresponding author, upon reasonable request.

**Ethics Approval:** This study did not involve any human or animal subjects, and therefore, ethical approval was not required.

**Conflicts of Interest:** The author declares no conflicts of interest to report regarding the present study.

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