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Cu₂SiSe₃ as a promising solar absorber: harnessing cation dissimilarity to avoid killer antisites†‡

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Copper-chalcogenides are promising candidates for thin film photovoltaics due to their ideal electronic structure and potential for defect tolerance. To this end, we have theoretically investigated the optoelectronic properties of Cu_2SiSe_3 , due to its simple ternary composition, and the favourable difference in charge and size between the cation species, limiting antisite defects and cation disorder. We find it to have an ideal, direct bandgap of 1.52 eV and a maximum efficiency of 30% for a 1.5 μ m-thick film at the radiative limit. Using hybrid density functional theory, the formation energies of all intrinsic defects are calculated, revealing the p-type copper vacancy as the dominant defect species, which forms a perturbed host state. Overall, defect concentrations are predicted to be low and have limited impact on non-radiative recombination, as a consequence of the p-d coupling and antibonding character at the valence band maxima. Therefore, we propose that Cu_2SiSe_3 should be investigated further as a potential defect-tolerant photovoltaic absorber.

1 Introduction

Net greenhouse gas emissions have continued to rise in the last decade, with the largest growth coming from increased CO2 emissions from the burning of fossil fuels for energy.3 Solar photovoltaic absorbers are one of the most promising renewable energy technologies for combatting this crisis. In particular, thin-film chalcogenide absorbers have been fervently investigated, offering the possibility of reduced material and processing costs, improved low-light performance and greater manufacturing flexibility as compared to conventional silicon solar cells.4-6 CdTe and Cu(In,Ga)Se2 are the current marketleaders in this area; however, these materials suffer from the use of rare/toxic elements. Lead-halide perovskites, which have been at the forefront of photovoltaic research for the last decade, show remarkable defect tolerance, but also have stability and toxicity concerns. 4,7,8 Emerging chalcogenide absorbers, such as Cu2ZnSnS4 (CZTS), have shown reduced

efficiencies due to killer defects and performance-limiting

disorder. 9,10 The complex quaternary structure containing

A variety of copper chalcogenides with suitable bandgaps for visible light absorption have emerged from these coarse screening studies, including CuSb(S,Se)₂, Cu₂(Si,Sn)Se₃ and LiCuS.^{14,15} To further reduce the number of candidate materials, we can learn from the failures of CZTS to employ several design principles to guide the search for a defect tolerant, diamond-like photovoltaic absorber, which could be integrated into current device architectures. By selecting cations with larger differences in charge and ionic radii, the prevalence of cation disorder and detrimental antisite defects could be reduced. To this end, we computationally investigated Cu₂SiSe₃ (Si^{IV} (r = 0.26 Å) and Cu^I (r = 0.6 Å)), which had also been identified to have an ideal bandgap from screening studies using the semi-local mBJ + U DFT functional.¹⁴

We calculated the electronic and optical properties of Cu₂-SiSe₃ using both hybrid DFT and Green's function (GW) methods, including the radiative efficiency limits and electronic band alignment. Given that defect-induced carrier recombination is the dominant limiting factor for power-conversion efficiencies in emerging PV absorbers,⁴ an understanding of the

similarly-sized cations increases the number of possible defects, with the dominant killer defect Sn_{Zn} stabilized by widespread Cu–Zn disorder. A variety of copper chalcogenides with suitable bandgaps for

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[‡] Calculation data is provided in an online repository at https://doi.org/10.5281/zenodo.7611652

intrinsic defect thermodynamics is crucial for establishing an accurate outlook on the potential PV performance. Defect calculations were therefore performed using hybrid DFT to gain a complete picture of the intrinsic defect chemistry. In doing so, we predict Cu₂SiSe₃ to contain low concentrations of deleterious defects. We expect our results will inspire further investigations into Cu₂SiSe₃ for photovoltaic applications.

2 Results

Cu₂SiSe₃ belongs to the adamantine family of materials, ¹⁶ crystallizing into the monoclinic *Cc* space group. There are two inequivalent Cu^I sites and one Si^{IV} site, each connected to four Se^{II} anions to form corner-sharing tetrahedra, Fig. 1a. The lattice parameters of the conventional unit cell, determined using the HSE06 functional, ^{17,18} are a = 6.70 Å (0.4%), b = 11.84 Å (0.3%), c = 6.67 Å (0.6%), with percentage errors given with respect to experimental values. ¹⁹ Lattice parameters calculated using other DFT functionals are provided in the ESI Section 1.†

Due to the presence of Cu(d) states in this system, which are poorly modelled by semi-local DFT,20 hybrid DFT or the GW approximation must be used to accurately calculate the optoelectronic properties. Moreover, the mBJ + U functional has been shown to underestimate the bandgap of Cu-multinary chalcogenides, with a root-mean-square error of 0.24 eV.21 Using hybrid DFT (HSE06), Cu₂SiSe₃ is calculated to have a direct bandgap of 1.52 eV at the Γ point, with spin orbit coupling reducing the bandgap to 1.49 eV ($\Delta E_{\rm g} = 0.03$ eV). The HSE06 band gap is validated by calculation of the electronic structure using the QSGW method, which includes additional screening effects from electron-hole interactions. The QSGW band gap is 1.580 eV, in excellent agreement with HSE06. Solving the dielectric spectrum of Cu₂SiSe₃ within the Random Phase approximation (RPA) and Bethe-Salpeter equation (BSE) using the QSGW self-energy directly separates the renormalization of the band structure due to electron-hole screening from direct excitonic effects, Fig. S2.† Only one sub-gap exciton is found, at 1.42 eV, giving an exciton binding energy of 0.16 eV. Plotting the contributions of individual bands to the 1.42 eV exciton onto the band structure of Cu2SiSe3, Fig. S3,† it is evident that the exciton has predominantly Wannier-Mott

character,²² with dominant contributions arising from the valence and conduction bands around Γ .

As part of the process in manufacturing $\text{Cu}_2\text{ZnSiSe}_4$, films of Cu_2SiSe_3 were synthesized and a bandgap of 1.4 eV determined using transmission measurements in 2015.²³ These measurements give an indication of the Cu_2SiSe_3 bandgap, however the sample contained significant amounts of secondary phases and the synthesis process was not refined for high-quality films.

The orbital-decomposed electronic density of states in Fig. 1b shows that the valence band is made up of Cu d and Se p states, with the conduction band predominantly Se p and Si s. Cu₂SiSe₃ has an antibonding valence band maximum (VBM), illustrated by the Crystal Orbital Hamiltonian Population analysis shown in Fig. S4.† This is typical of materials with occupied (semi-)valence cation orbitals (e.g. d¹⁰ Cu¹⁺), and is associated with the formation of shallow acceptor defects.²⁴⁻²⁷

The highly dispersive conduction band results in low electron effective masses (<0.20 m_0) indicating highly mobile carriers, beneficial for the extraction of minority charge carriers in a p-type absorber. The hole masses have much greater anisotropy, with an effective mass of 1.87 m_0 from Γ to V, but 0.18 m_0 Γ to A – revealing fast transport for both carriers in Cu₂SiSe₃. A full breakdown of the calculated effective masses is given in Table 1.

Two metrics for predicting the maximum photovoltaic efficiency were calculated; the spectroscopic limited maximum efficiency and the method of Blank *et al.*, which take into account the bandgap and the absorption coefficient of a material. Using these metrics, Cu_2SiSe_3 reaches a maximum efficiency of 30% at a thickness of 1.5 μ m, with a Lambertian structured surface (to reduce scattering) increasing efficiency at thinner film thicknesses (Fig. 2a).

 $\begin{tabular}{ll} \textbf{Table 1} & \textbf{Calculated carrier effective masses for Cu_2SiSe_3 using HSE06} \\ \textbf{hybrid DFT} \end{tabular}$

Hole (m ₀)			Electron (m ₀)		
$\Gamma \to Y$	$\Gamma \to V$	$\Gamma \to A$	$\Gamma \to Y$	$\Gamma \to V$	$\Gamma \to A$
0.92	1.87	0.18	0.20	0.19	0.14

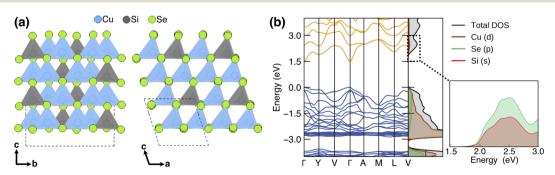
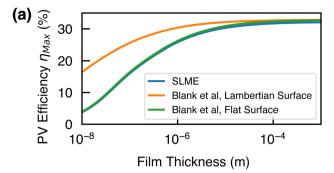


Fig. 1 (a) Crystal structure of Cu_2SiSe_3 , with a single conventional unit cell marked by the dashed line; the atoms are colored as follows: Cu = blue, Si = gray, Se = green. Structure visualized in VESTA.¹ (b) Electronic band structure alongside the total and orbital-decomposed density of states calculated using HSE06 ($E_g = 1.52$ eV). Valence band marked in blue, conduction band in orange, valence band maximum (VBM) set to 0 eV. The total density of states is not shown in the inset, to aid distinguishing between orbital contributions. Plots generated using SUMO.²



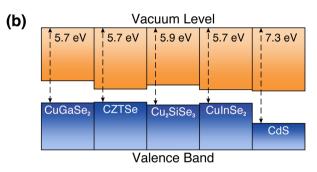


Fig. 2 (a) Maximum PV efficiency (η_{max}) at the radiative limit as a function of film thickness, calculated using the SLME and Blank et al. metrics.^{28,29} (b) Electronic band alignment of Cu₂SiSe₃ with various Cubased photovoltaic absorbers and CdS, a commonly used buffer layer. Values (excluding Cu₂SiSe₃) taken from various experimental and computational ref. 30 and 31

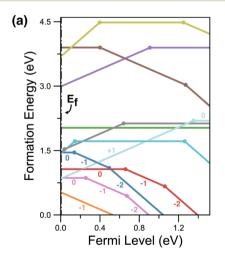
The calculated band alignment for Cu2SiSe3 is shown in Fig. 2b. The ionization potential is calculated to be 5.9 eV, similar to other Cu-based absorbers. Thus we can expect Cu₂-SiSe₃ to be a p-type material and that initial devices could leverage previously-developed device architectures (e.g. for CZTSe and CIGSe) for easy fabrication. Due to the high predicted efficiency and composition of non-toxic/earth-abundant elements, Cu₂SiSe₃ is a promising candidate as a photovoltaic absorber, warranting further investigation.

2.1 Defect chemistry

To further assess the potential of Cu₂SiSe₃ for solar cell operation, an understanding of its defect chemistry is required. High concentrations of deep defects limit the performance of most emerging photovoltaic absorbers. These deep states enable the non-radiative recombination of charge carriers, reducing device efficiencies. 10,32-35 Formation energies for all intrinsic defects of Cu₂SiSe₃ were calculated and the transition level diagrams under the most Cu-poor and Cu-rich conditions are shown in Fig. 3. The chemical potential space for Cu₂SiSe₃ is bound by seven intersections, with the most Cu-poor regions also being Si-poor, and the most Cu-rich being relatively Si-rich. Formation energy diagrams for the remaining chemical potential limits and a plot of the chemical potential space are provided in the ESI Section 3 and 4.†

Most Cu-based absorbers are synthesized under Cu-poor conditions, with V_{Cu} being the dominant defect species although in the case of kesterites (e.g. CZTS), Cuzn antisite defects dominate. 9,36,37 Indeed for Cu₂SiSe₃, we find V_{Cu} to have the lowest formation energy and find it to be a shallow acceptor state resulting in Cu₂SiSe₃ being intrinsically p-type, with the hole carrier concentrations being of the same order of magnitude as the V_{Cu} concentration (Table 2). Annealing to the experimental temperature of 775 K and then quenching to 300 K, the high concentration of V_{Cu} places the Fermi level at −0.03 eV (Cu-poor) and 0.07 eV (Cu-rich) relative to the VBM (Fig. 4). Through careful control of the annealing temperature and cooling rate the position of the Fermi level and hence the carrier concentrations could be tuned.

The DFT supercell approach for calculating defects fails to properly model the bound states of resonant/shallow defects, as their large, delocalized wave functions extend far beyond the



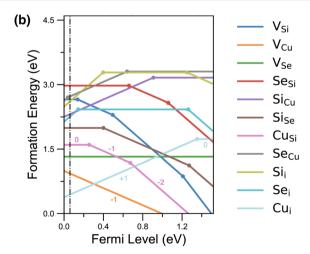


Fig. 3 Formation energies as a function of Fermi level for the intrinsic defects in Cu₂SiSe₃ under the most (a) Cu-poor (G) and (b) Cu-rich (D) conditions. G and D correspond to the position on the chemical phase diagram, see ESI Section 3.† For each defect species, only the lowest energy defect site has been plotted. Charge state labels only included for defects with low formation energies for clarity. The self-consistent Fermi level is plotted by the dashed black line

Table 2 Defect and hole concentrations under Cu-poor and Cu-rich conditions with an annealing temperature of 775 K

	Concentration (cm	n ⁻³)
Defect species	Cu-poor	Cu-rich
p_0	3×10^{19}	8×10^{17}
V_{Cu}	3×10^{19}	$1 imes 10^{18}$
V_{Si}	7×10^{12}	3×10^6
V _{Se}	$5 imes 10^8$	2×10^{13}
Cu_i	$9 imes 10^{15}$	3×10^{17}
Si_i	9×10^{-4}	3×10^{1}
Se_i	3×10^{11}	3×10^6
Cu _{Si}	4×10^{16}	2×10^{12}
Se_{Cu}	4×10^{11}	$2 imes 10^2$
Se _{Si}	9×10^{14}	3×10^2
Si _{Se}	$7 imes 10^{-4}$	2×10^9
Si _{Cu}	5×10^1	$8 imes 10^4$

supercell length.38-41 Thus constraining these states to the supercell results in strong finite-size effects and spurious exciton-like interactions. However, several indicators can be used to determine that the defect is a true shallow state. For instance, we find the charge density of the V⁰_{Cu} hole state to be delocalized across the supercell (ESI Section 5†), that the calculated (0/-1) transition level shifts toward the VBM with increasing supercell size, and lastly, that the atomic sites surrounding the vacancy differ in position by less than 0.01 Å between V_{Cu}^{-1} and V_{Cu}^{0} . Indeed, using the screening methods developed by Kumagai et al.,42 we find the V_{Cu} hole state to have similar orbital character to the bulk VBM, demonstrating its hydrogenic perturbed host state (PHS) nature. Therefore, despite the large predicted concentrations for copper vacancies (Table 2), their shallow nature means they will not play a role in non-radiative capture processes.32

The lowest formation energy n-type defect is Cu_i . There are four distinct interstitial sites, with the lowest energy site having the deepest (+/0) donor level, 0.17 eV below the CBM. As a result, Cu_i may trap charge carriers, however the impact on device

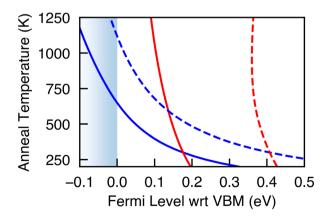


Fig. 4 Position of the Fermi level during annealing (red) and quenching (blue) under Cu-poor (solid line) and Cu-rich (dashed line) synthesis conditions.

performance is expected to be limited due to slow hole capture. 43,44

V_{se} is an ultra-deep donor, with transitions levels lying below the VBM - aided by the high energy of the VBM due to Cu d-Se p repulsion, as observed in Cu₂ZnSnSe₄ (CZTSe).⁴⁵ While this defect forms in relatively high concentrations under Cu-rich conditions, due to being electronically inactive it should not contribute to non-radiative recombination. The Sesi antisite defect also has ultra-deep donor states in the valence band, however the defect is additionally found to be stable in the -1and -2 charge states deep in the band gap. Notably, symmetrybreaking was required to identify the ground-state structures of both V_{Se} and Se_{Si} (Fig. S11 and S13†). To stabilize the negative charge states of Sesi the defect undergoes a significant structural relaxation. The Sesi defect moves away from the tetrahedrally bonded cation site and forms a trimer with two of the neighboring Se, similar to the reconstructions observed in Sb₂Se₃.46 As a result, this defect site could act as a non-radiative recombination center, however to quantitatively determine its impact, this would require the calculation of its carrier capture cross-section.32

The remaining defect states with a formation energy below 1.5 eV, which will form in significant concentrations depending on the growth conditions, are the Cusi antisite and Vsi. These defects behave similarly due to the ShakeNBreak47,48 method finding that the lowest energy configuration of a Vsi defect is actually a Cusi + Vcu complex. This rearrangement occurs due to the high Si^{IV} oxidation state, resulting in it being unfavorable to leave the site unoccupied and the low energy of formation of a V_{Cu} leading to a mobile cation. Thus, both Cu_{Si} and V_{Si} defects have similar deep-lying levels. However, the carrier capture cross-sections are expected to be very small due to weak structural relaxation between defect charge states, with the bonds surrounding the defect site distorting by less than 0.02 Å upon charge capture/emission. The lack of distortion between charge states can be explained by considering the orbital make-up of the valence band and Cusi. As Cu and Si are tetrahedrallycoordinated by Se, this gives rise to the same Cu d-Se p antibonding interaction as found at the VBM. Thus in the fullyionised charge state (Cu_{Si}^{-3}), the occupied anti-bonding defect levels lie above the VBM due to Coulomb repulsion, resulting in deep transition levels. Consequently, it is favorable to remove electrons and depopulate the anti-bonding levels, placing holes in the Cu d-Se p states (ESI Fig. S10†). The reduction in charge lowers the energy of the defect states, resulting in them being more VBM-like and making q = 0, -1 and -2 the stable charge states for Cusi.

Overall, our results find the formation energy of antisite defects to be significantly larger than in CIGS and kesterite materials (e.g. Cu_{Zn} defects has a formation energy of 0.4 eV in CZTS), due to larger valence and size differences between the cation species (i.e. Si^{IV} (r=0.26 Å) and Cu^I (r=0.6 Å) v.s. Sn^{IV} (r=0.55 Å) and Zn^{II} (r=0.6 Å) in CZTS, where Sn_{Zn} are the killer defects). This would have the added benefit of reducing cation disorder in Cu₂SiSe₃ which has been shown to lower the formation energy of defects in CZTS. All remaining defect species not discussed in detail have too high formation energies

to form in sufficient concentrations to significantly affect device performance. Our study of the intrinsic defect in Cu₂SiSe₃ shows that the antibonding VBM, often associated with defecttolerance, indeed contributes to the formation of electrically benign defects,⁵¹ borne out by the V_{Cu} and V_{Se} discussed earlier. This paints a promising picture for potential defect tolerance in this compound.

3 Conclusion

In this work, we have investigated Cu₂SiSe₃ as a candidate photovoltaic absorber, determining its bandgap to be 1.52 eV using HSE06. A maximum efficiency of 30% at the radiative limit is predicted for thin film devices, and we expect current copper-chalcogenide device architectures to be readily transferable. Using hybrid density functional theory, all intrinsic defect sites were investigated, with the lowest energy defects (V_{Cu} and Cu_i) expected to be benign with respect to carrier recombination. As a result, Cu₂SiSe₃ shows great promise as a potential defect-tolerant photovoltaic absorber, however further calculations of capture cross-sections are required. We believe this work serves as a promising outlook on the potential solar cell application of this material, and hope that it encourages experimentalists working in the field of emerging photovoltaics to synthesize and investigate Cu₂SiSe₃ devices.

Methods

All calculations were performed using periodic DFT within the Vienna Ab Initio Simulation Package (VASP).52-54 This work uses the HSE06 hybrid DFT functional which combines 75% exchange and 100% of the correlation energy from the Perdew, Burke, and Ernzerhof (PBE) semi-local functional with 25% exact Hartree-Fock (HF) exchange at short ranges. 17,18,55 HSE06 has been shown to accurately reproduce the electronic structure and properties of many small bandgap semiconductors, including Cu-multinary chalcogenide semiconductors.21 A plane wave energy cutoff of 350 eV was used and k-points were sampled with a Γ centered 4 \times 4 \times 4 mesh for the 12-atom primitive cell. The total energy was converged to less than 1 meV per atom with these parameters, and a force tolerance of 0.01 eV \mathring{A}^{-1} was used during geometry relaxation. The plane wave cutoff was increased to 500 eV during structural relaxation to avoid errors arising from Pulay stress. A denser $6 \times 6 \times 6$ k-point mesh was used for the calculation of the optical properties, and a larger number of unoccupied bands were included in the calculation (NBANDS increased to 100). Upper limits to the photovoltaic efficiency were determined from the HSE06 electronic and optical calculations, using both the 'Spectroscopic Limited Maximum Efficiency' (SLME) metric and the method of Blank et al. 28,29 To calculate the electronic band alignment, the core level alignment method was used with surfaces generated by surface.56,57

Defect calculations were performed in a 96-atom supercell created by the expansion of the primitive unit cell with the matrix:

$$\begin{pmatrix}
2 & -2 & 0 \\
1 & 1 & 0 \\
1 & -1 & 2
\end{pmatrix}$$

and was sampled with a Γ -centered 2 \times 2 \times 2 k-point mesh. The lattice parameters of this supercell were a = 13.41 Å, b = 11.84Å, c=12.97 Å and angles $\alpha=90.0^\circ,\,\beta=78.4^\circ,\,\gamma=90.0^\circ.$ All inequivalent vacancy and antisite defect sites were considered, and Voronoi tessellation was used to determine potential interstitial sites.⁵⁸ Overall, this came to six vacancies, nine antisites and 51 interstitials (Table S3†). To aid the search for the ground state structures, the ShakeNBreak package was used to implement the bond distortion methodology to find any energy-lowering reconstructions at defect sites. 47,48 This structure-searching method uses nearest-neighbour bond distortions, along with random atomic perturbations, in order to find the lowest energy structure. Each defect was distorted up to a bond distortion factor of \pm 0.4, in increments of 0.1. In order to account for spurious interactions between charged defects and their periodic image in the DFT supercell approach, the eFNV charge correction scheme was employed. 59,60 Formation energies are then calculated for each defect X in charge state q using,61

$$E^{f}(X^{q}) = E_{tot}(X^{q}) - E_{tot}(host) - \sum_{i} n_{i}\mu_{i} + qE_{F} = E_{corr}.$$
 (1)

where $E_{\text{tot}}(X^q)$ and $E_{\text{tot}}(\text{host})$ are the total energies of the defect supercell and pristine supercell. μ_i is the chemical potential of species i and n is the number of atoms of species i removed or added to form the defect. $E_{\rm F}$ is the Fermi level and finally $E_{\rm corr}$ is the charge correction term.

Defect concentrations were determined through the calculation of the self-consistent Fermi level as implemented in pysc-fermi. 62,63 Typically materials are grown/annealed at elevated temperatures (as is the case for Cu₂SiSe₃ (ref. 19, 23 and 64)), where defects form, before cooling to room temperature. Thus, to simulate. Thus, to simulate annealing and quenching, the equilibrium defect concentrations are calculated selfconsistently at various annealing temperatures. Next, to simulate quenching the sample to room temperature, the calculated defect concentrations are held constant, while the charge states and Fermi level are allowed to re-equilibrate at 300 K. A schematic outlining the workflow is included in the ESI (Fig. S7†).

Many-body perturbation theory calculations were performed within the Questaal package,65 using the QSGW method of Kotani et al.66 together with the modification to include ladder diagrams within the screened Coulomb interaction W, herein referred to as QSGŴ.67,68 The HSE06 ground state structure was used throughout. Muffin tin radii of 2.37 a.u., 2.07 a.u., and 2.17 a.u. were used for Cu, Si and Se respectively, with an l-cutoff of 4 used for all atoms. A *k*-mesh of $4 \times 4 \times 4$ and a *G*-cutoff for the interstitial plane waves of 8.0 Ry^½ was used for the convergence of the QSGW and QSGW self-energies, with a finer $8 \times 8 \times 7$ mesh used for intermediate DFT calculations. The QSGW band gap was found to converge to within 0.01 eV using 12 occupied and 12 empty bands, while a finer $6 \times 6 \times 6$ was used for the solution of the Bethe-Salpeter Equation and the resultant dielectric spectrum.

Conflicts of interest

There are no conflicts to declare.

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