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# CuZrO<sub>3</sub>: If it exists it should be a sandwich†

James Dean, Dahui Yang, Götz Veser Dand Giannis Mpourmpakis D\*

 $CuZrO_3$  has been hypothesized to be a catalytic material with potential applications for  $CO_2$  reduction. Unfortunately, this material has received limited attention in the literature, and to the best of our knowledge the exact crystal structure is still unknown. To address this challenge, we utilize several different structural prediction techniques in concert, including the Universal Structure Predictor: Evolutionary Xtallography (USPEX), the Materials Project Structure Predictor, and the Open Quantum Materials Database (OQMD). Leveraging these structural prediction techniques in conjunction with Density-Functional Theory (DFT) calculations, we determine a possible structure for CuZrO<sub>3</sub>, which resembles a "sandwich" morphology. Our calculations reveal that this new structure is significantly lower in energy than a previously hypothesized perovskite structure, albeit it still has a thermodynamic preference to decompose into CuO and ZrO2. In addition, we experimentally tried to synthesize CuZrO3 based on literature reports and compared computational to experimental X-ray Diffraction (XRD) patterns confirming that the final product is a mixture of CuO and ZrO2. Finally, we conducted a computational surface energetics and CO<sub>2</sub> adsorption study on our discovered sandwich morphology, demonstrating that CO<sub>2</sub> can adsorb and activate on the material. However, these CO<sub>2</sub> adsorption results deviate from previously reported results further confirming that the CuZrO<sub>3</sub> is a metastable form and may not be experimentally accessible as a well-mixed oxide, since phase segregation to CuO and ZrO<sub>2</sub> is preferred. Taken together, our combined computational and experimental study provides evidence that the synthesis of CuZrO<sub>3</sub> is extremely difficult and if this oxide exists, it should have a sandwich-like morphology.

## Introduction

Copper Zirconate was first synthesized in 1832 through the reaction of copper and zirconium salts with ammonia. 1,2 After this initial synthesis, it would take over a century for interest in the material to re-emerge. Motivated by the tunability of mixed-oxides for different applications, in 1980 Reddy et al.<sup>3</sup> conducted the first modern synthesis of CuZrO<sub>3</sub>. Notably, the first evidence of CuZrO3 as a novel CO2 adsorber emerged in this work, with adsorbed CO2 being detected via IR spectroscopy.<sup>3,4</sup> Based on XRD and the orthorhombic crystal structure of the chemically similar perovskite BaZrO3, Reddy et al. hypothesized that the crystal structure was that of a perovskite with an orthorhombic crystal cell.

Recently rekindled interest in perovskite catalysis motivated further studies<sup>5</sup> in the applications of CuZrO<sub>3</sub>. Saha and Hamid<sup>6</sup> synthesized CuZrO<sub>3</sub> nanoparticles (NPs) to catalyze the aerobic oxidation of vanillyl alcohol. They confirmed the XRD pattern of CuZrO<sub>3</sub>, and suggested the perovskite structure is distorted,

Department of Chemical Engineering, University of Pittsburgh, Pittsburgh, PA 15213, USA. E-mail: gmpourmp@pitt.edu

concluding that the high catalytic activity of the material could have resulted from an appreciable number of surface defects. Ehsan et al.7 developed a thin-film deposition technique for 1:1 CuZrO3: CuO. Borhade et al.8 studied CuZrO3 as a dye photodegradation catalyst. Lu et al.9 synthesized CuZrO3 NPs to form a composite with graphene, noting excellent low-concentration detection of Pb(II) and Cd(II) ions in soil, suggesting this results from synergistic effects between the graphene and CuZrO<sub>3</sub>.

As work with CuZrO<sub>3</sub> was being performed, other researchers focused on other, related oxides of CuZr. Fisher and Bell<sup>10</sup> investigated the CO<sub>2</sub> methanation activity of Cu/ZrO<sub>2</sub>/SiO<sub>2</sub>, uncovering a synergistic effect of the H2 dissociation capability of Cu providing a feedstock for methanation over ZrO2 regions of the catalyst. Austin et al.11 found Zr-doped Cu NPs to strongly adsorb CO<sub>2</sub>, and Dean et al. 12 found these Zr-doped Cu NPs to strongly adsorb CO2 even when oxidized. Aritani et al. 13 investigated several mixed oxides for the decomposition of NO with CH4, finding that a 2 wt% Cu/ZrO2 catalyst had the highest activity among the various catalysts investigated. Furthermore, Liu et al.14 studied various loadings of CuO/tet-ZrO2 for the catalytic reduction of N<sub>2</sub>O to N<sub>2</sub>, demonstrating that the catalytic activity correlates with the dispersion of CuO, and observing that Cu ions contribute to most of the activity. Restivo and de Mello-Castanho<sup>15</sup>

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synthesized a Cu-doped Ni/yttria-stabilized Zr cermet, identifying CuZrO<sub>3</sub> as a contaminant.

Our previous work<sup>12</sup> computationally identified that Zr-doped Cu NPs may be potential CO<sub>2</sub> hydrogenation catalysts, based on their predicted adsorption and activation of CO2. This motivated the synthesis of these particles, and we observed the production of CuZrO<sub>3</sub> NPs, which is likely the result of the highly oxophilic nature of Cu and Zr. We further modeled CO2 adsorption on Zr-oxide patches on Cu NPs using DFT, verifying the experimentally observed CO2 adsorption on CuZrO3 NPs. However, in this study there was a materials gap between theory and experiments due to the lack of crystal structure determination of this material, and a lack of a set of atomic coordinates for CuZrO<sub>3</sub>. Ultimately, the absence of a known structure for CuZrO3 creates several difficulties: most computational chemistry approaches - which use chemical structure as an input - require much more guesswork if a structure is not known, and without knowledge of the crystal structure it is hard to make definitive conclusions about the nature of any catalytically-active sites on the surface. This motivates our present work: leveraging DFT, modern structural prediction methods and experiments, we aim to shed light onto the structure, stability and adsorption properties of CuZrO<sub>3</sub>.

# Computational and experimental methods

### Sample preparation

CuZrO<sub>3</sub> was prepared by thermal decomposition of copper zirconyl oxalate which was described by Reddy et al. 3,16 In brief, equimolar (0.5 M each) aqueous solutions of copper chloride (Sigma Aldrich, ≥99.995%) and zirconyl chloride octahydrate (Sigma Aldrich, 98%) were added to preheated oxalic acid at 60 °C (1.0 M) (Sigma Aldrich,  $\geq$  99%) which was 10% in excess. The precipitate was aged for 30 min under mixing. The product was then filtered, washed with distilled water and acetone, and air dried.

The thermal decomposition reaction of the resulting sample (copper zirconyl oxalate) from above procedure was studied by thermogravimetric analysis (TGA) (SDT Q600, TA instruments). The sample (approximately 30 mg) was loaded into the instrument and heated to 950  $^{\circ}\mathrm{C}$  in air flow with a ramp rate of 7  $^{\circ}\mathrm{C}$ min<sup>-1</sup>. We observed weight loss at three temperature ranges above 200 °C (i.e. 200-330 °C, 530-600 °C and 870-900 °C; the weight loss below 200 °C is attributed to dehydration which is not included in the discussion). Based on our observation, we calcined the sample at 800 °C in air (0.2 SLM) for 4 hours with a ramp rate of 7  $^{\circ}\text{C min}^{-1}.$  The calcined samples were used to collect XRD pattern.

## X-ray diffraction

The sample crystal structure was measured by Bruker D8 X-ray Diffraction system at 40 kV and 40 mA with Cu Ka radiation  $(\lambda = 1.5406 \text{ Å})$  at a scan speed of 0.3 s per step from 10 to 90°.

### Density-functional theory

We utilize the Vienna Ab initio Simulation Package (VASP)<sup>17</sup> in conjunction with the PBE functional and PAW potentials.18 Unless otherwise specified (as in USPEX), we use the following settings for our calculations. A gamma-centered mesh of  $5 \times 5 \times 5$  k-points is used for bulk systems, and a gammacentered mesh of  $5 \times 5 \times 1$  k-points is used for periodic slabs. A planewave cutoff of 500 eV is used, with an SCF convergence criterion of 10<sup>-5</sup> eV. Geometry optimizations are performed with a convergence criterion of  $10^{-4}$  eV  $\text{Å}^{-1}$ . Gaussian smearing is used with a width of 0.01 eV.

#### **USPEX calculations**

For USPEX calculations, we optimize unit cells in a series of 5 stages ramping up from 400 eV to a 600 eV cutoff. We also ramp up from k-space resolution of 0.2 to 0.6  $2\pi/\text{Å}$ . Gaussian smearing with widths ranging from 0.1 to 0.01 is used across the five stages of optimization. Each generation's population consists of 30 unit cells, keeping the fittest 60% of the previous generation. Fitness is determined as the energy of the structure, scaled by number of formula units in the unit cell. When the same structure ranks as the fittest for 8 consecutive generations, the USPEX calculation is halted.

### Materials project structure predictor

For structures generated via the Materials Project Structural Predictor, 19,20 the application requires users to select a guess for the atomic oxidation states. The oxidation states a user is allowed to select are the +1, +2, or +3 state for Cu, -2 for O, and +2, +3, or +4 for Zr. In order to maintain a neutrally charged CuZrO<sub>3</sub> system, we can therefore either choose Cu<sup>2+</sup> with Zr<sup>4+</sup> or we can choose Cu<sup>3+</sup> and Zr<sup>4+</sup>. We chose Cu<sup>2+</sup> and Zr<sup>4+</sup> as the oxidation states because Cu is more electronegative than Zr,21 and because these states are more common than the Cu3+ and Zr<sup>3+</sup> states.<sup>22,23</sup> Additionally, in our prior work synthesizing CuZrO<sub>3</sub> NPs, <sup>12</sup> we observed the presence of Cu<sup>2+</sup>, Zr<sup>4+</sup> via X-Ray Photoelectron Spectroscopy (XPS), partially-reduced  $Zr^{(4-x)+}$ species, as well as, the lack of any Cu<sup>3+</sup> or Zr<sup>3+</sup> ions.

#### Unit cell optimization

A variety of techniques for the ab initio prediction of crystal structure have arisen in the last decade. In this work, we utilize the genetic algorithm USPEX, the probabilistic Structure Prediction tool of Materials Project, and the OQMD in order to get a set of potential structures for CuZrO<sub>3</sub>. We additionally take the crystal structure of the mineral perovskite, CaTiO<sub>3</sub> to be part of our set of possible structures.

Once we have generated a structure guess, we optimize the unit cell by first scanning volumes ranging from 0.4 to 2 times the initial unit cell. We then take the volume minimizing the energy and perform a geometry optimization of the atomic coordinates only. Then, we allow atomic coordinates and unit cell parameters to vary at a constant volume. In the final stage of optimization, we allow the atomic coordinates, unit cell parameters, and volume to all vary.

#### Slab and adsorption calculations

To calculate surface energies, we cleave along the respective Miller index, and freeze the centermost layer of the slab (to facilitate a symmetrically-relaxed surface). Only surface terminations where both sides are equivalent through mirror or glideplane symmetry are investigated. A slab thickness of 3 (i.e. a frozen center layer is flanked by 1 unfrozen layer on both sides, for a total of 3 layers) is used. A vacuum of 10 Å is used in the calculations. In addition, we use a gamma-centered  $5 \times 5 \times 1$  set of k-points. Surface energies ( $\sigma$ ) are calculated via eqn (1), with  $E_{\rm slab}$  being the DFT-calculated energy of the slab,  $E_{\rm cell}$  being the DFT-calculated energy of the unit cell, A being the area of one side of the slab,  $n_{\rm slab}$  being the number of formula units in the slab, and  $n_{\text{cell}}$  being the number of formula units in the unit cell.

$$\sigma = \frac{E_{\text{slab}} - \left(\frac{n_{\text{slab}}}{n_{\text{cell}}}\right) E_{\text{cell}}}{2A} \tag{1}$$

For adsorption calculations, we cleave the bulk along the respective Miller index, freeze the bottom layer of the slab, and relax the other atoms. We then place a CO<sub>2</sub> molecule in a potential binding site initially in an activated (bent) state. In both cases, we apply an automatic dipole correction along the axis perpendicular to the slab. In addition, for this set of calculations, we increased the vacuum size to 15 Å. We calculate the binding energy  $(E_{bind})$  of  $CO_2$  to the slab using eqn (2), where  $E_{complex}$  is the DFT energy of the slab with  $CO_2$  attached, and  $E_{CO_2}$  is the DFT energy of a single CO<sub>2</sub> molecule.

$$E_{\text{bind}} = E_{\text{complex}} - E_{\text{slab}} - E_{\text{CO}_2} \tag{2}$$

## Cells for XRD prediction

XRD predictions are generated using VESTA, 24 with the same wavelength as our experimental XRD work. For each unit cell, the peak intensities are then scaled such that they have the same maximum as our experimentally determined XRD.

## **Bader analysis**

The Bader method<sup>25</sup> was used to calculate the charges in the fully-optimized structures (see the "Unit Cell Optimization" section). VASP was set to write the all-electron charge densities to file and VASP Transition State Tools (VTST) were used to sum the core density and self-consistent valence densities reported by VASP. This result was then used as the reference charge ("-ref" option) for the Bader analysis.

Finally, the net charge of each ion was calculated by subtracting the Bader-calculated population from the number of valence electrons specified in the PAW pseudopotential (11 for Cu, 12 for Zr, and 6 for O).

# Results and discussion

We start our study by generating candidate structures for CuZrO<sub>3</sub>. A perovskite unit cell contains metal atoms at two possible sites, generally known as the "A" and "B" site

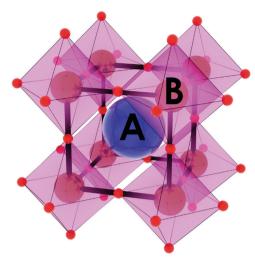


Fig. 1 An ideal perovskite unit cell. The blue atom represents the A-site, and the purple atoms/polyhedra represent the B-site. Halogen/chalcogen atoms are shown in red, at the tips of the octahedra. The unit cell for this system is illustrated by the thick black lines extended between the B-site cations.

(see Fig. 1).<sup>26</sup> The A-site is a coordination number (CN) 12 site, and the B-site is a CN 6 site surrounded by an electronegative species (typically a halogen or chalcogen).

Empirical relations exist which allow one to estimate whether a set of elements will form a perovskite. The Goldschmidt tolerance factor<sup>27</sup> is a well-known relation which can help predict whether a compound with formula XYZ<sub>3</sub> will form a perovskite. X and Y are the two cations, typically metals, and Z is the anion. Because the exact crystal structure of  $CuZrO_3$  is unknown, we consider two cases: one where Zr is in the A-site (with Cu in the B-site) and one where Cu is in the A-site (with Zr being in the B-site).

We applied the Goldschmidt tolerance factor to both scenarios (see ESI,† section Structural Tolerance Factors), and found that in either case, a perovskite is predicted. In the case where Zr is in the A-site and Cu is in the B-site, the Goldschmidt tolerance factor is 0.82, which indicates an orthorhombic perovskite. In the case where Cu is in the A-site and Zr is in the B-site, the Goldschmidt tolerance factor is 0.87, which also indicates a perovskite.

One drawback to the Goldschmidt tolerance factor is a high false-positive rate, which was addressed in a new perovskite tolerance factor recently developed by Bartel et al. 28 Compared with the Goldschmidt tolerance factor, this improved tolerance factor was demonstrated to reduce the false-positive rate from 51% to just 11%, while simultaneously increasing the truepositive rate from 74% to 92%. Thus, Bartel's tolerance factor is less likely to mis-identify a material as a perovskite when it is not, and more-likely to correctly identify a material as a perovskite when it is. The tolerance factor  $\tau$  predicts a material to be a perovskite when  $\tau < 4.18$  (see ESI,† section Structural Tolerance Factors). In the case where Zr<sup>4+</sup> is in the A-site, this results in  $\tau$  = 1.13, which indicates a perovskite. In the case where  $Cu^{2+}$  is in the A-site, however,  $\tau = 4.45$ , which is high enough to predict that a perovskite would not occur.

Table 1 Electronic energies of the five lowest-energy unit cells (E<sub>cell</sub>) for CuZrO<sub>3</sub> found in this study. Energetics for all structure guesses can be found in Table S3. The decomposition energies ( $E_{decomp}$ ) are also presented for the reaction  $CuZrO_3 \rightarrow CuO + ZrO_2$ . Our reference energy for the CuO system is -9.83 eV per formula unit. Our reference energy for the  $ZrO_2$  system is -28.78 eV per formula unit

Structure	Number of formula units	$E_{\rm cell}$ (eV per formula unit)	$E_{\rm decomp}$ (eV per formula unit)
USPEX-ea430 (Sandwich)	2	-38.19	-0.42
USPEX-ea480	4	-37.94	-0.68
Perovskite prototype (Zr Oct)-D	4	-37.91	-0.70
Materials project-1140859	4	-37.83	-0.79
Perovskite prototype (Cu Oct)-B	4	-37.77	-0.84

Overall, both the Goldschmidt and Bartel tolerance give evidence that CuZrO<sub>3</sub> may form a perovskite, however the Bartel tolerance factor yields the possibility that one may not form. The work of Reddy et al.<sup>3</sup> hypothesized that the material forms a perovskite, and Saha and Hamid<sup>6</sup> suggest that the structure is a distorted perovskite. All this prior work justifies narrowing down our search to the materials space encompassing only structures which are similar to perovskites.

A logical first guess is to generate a prototype structure from the mineral perovskite (CaTiO<sub>3</sub>). These cells use the experimental unit cell parameters of CuZrO3 for their unit cell parameters. Because there are a variety of ways the unit cell parameters could be oriented (i.e. the question of which axis in the cell is the shortest/longest), we investigate every possible combination of unit cell vectors, for a total of 6 initial unit cells. In addition, because the Goldschmidt tolerance factor indicates that either Cu or Zr could be in the A-site (with the other residing in the B-site), we investigate both cases. This yields a total of 12 perovskite-derived prototypes.

The Open Quantum Materials Database (OQMD)<sup>29,30</sup> is a large corpus of high-quality DFT calculations. The database also performs automated structure generation, with perovskite structures being investigated for many ABO3-type materials. The database has a perovskite CuZrO<sub>3</sub> structure derived from SrFeO<sub>3</sub> with either Cu or Zr in the octahedra, so this yields a total of 2 structure guesses.

The Materials Project Structure Predictor<sup>19,20</sup> is a probabilistic model which predicts the structure of hypothetical materials. At a high-level, it operates by creating a new crystal structure based on chemical similarity with other known structures. For example, because Ca and Ba are chemically similar ions, one may expect BaTiO<sub>3</sub> to have similar structure to CaTiO<sub>3</sub> (perovskite) – and BaTiO<sub>3</sub> indeed forms a perovskite unit cell. We use this model to predict several structures for CuZrO<sub>3</sub>, again using the assigned charges Cu2+, O2-, and Zr4+. Since multiple structures are returned, we take the three most probable structures based on the ranking by the Structure Predictor (which is based on a data-mined tendency for two ions to swap locations, resulting in a crystal of the desired formula). In addition to these structures, we consider the two next highest-probability perovskite-like structures. This yields a total of 5 structure guesses.

The Universal Structure Predictor: Evolutionary Xtallography (USPEX)31-33 is a highly successful genetic algorithm which attempts to optimize a population of potential crystal structures,

with the objective function of minimizing the energy of the cell. It interfaces readily with VASP with minimal setup. Also, other groups have investigated similar systems using USPEX. These include the pressure-composition phase diagram of ZrO234 (parameterized with VASP) and a study which involved the prediction of several experimentally-known crystal structures including CuO and Cu<sub>2</sub>O<sup>35</sup> (parameterized with CRYSTAL17<sup>36</sup>).

To search in parallel, three calculations are conducted simultaneously: one checking unit cells ranging between 1 and 4 formula units, one between 4 and 6 formula units, and one between 7 and 8 formula units. This yields a total of 3 structure guesses. The preceding 22 structure guesses were optimized in VASP. The 5 lowest-energy structures are reported in Table 1. The energies of all optimized structure can be found in the ESI.† In addition, using the same DFT methodology, we optimized the structure of pure CuO and ZrO2 to assess the thermodynamic stability of each CuZrO3 cell against decomposition into the two oxides. The decomposition energy of the  $CuZrO_3 \rightarrow CuO + ZrO_2$  reaction is determined via eqn (3). In each case, energy is relative to the number of formula units.

$$E_{\text{Decomp}} = (E_{\text{CuO}} + E_{\text{ZrO}_2}) - E_{\text{CuZrO}_3}$$
 (3)

Of interest is that the "Perovskite Prototype" is not the most favorable structure. We note that over the course of the optimization, this system has deviated from the perovskite structure (see ESI,† section "Deviation from the Perovskite Prototype" for more details). In the "Perovskite Prototype" system, we find that the A-site Cu cation migrates to the 4-fold planar coordinated sites present along the edges of the B-site Zr octahedra (see Fig. S3D, ESI†), yielding a decomposition energy of -0.70 eV per formula unit. For the purposes of discussion and to be consistent in our naming scheme, we will continue to refer to this system as the "Perovskite Prototype," although we should note here that it is not actually a perovskite at the end of the optimization.

Moreover, the OQMD structural prototypes retained their perovskite structure during optimization, yet had the two strongest decomposition energies (e.g. decomposition is strongly favored) over all the systems we have investigated: -3.56 eV per formula unit when Cu is the A-site cation, and -5.28 eV per formula unit when Zr is the A-site cation (see Table S3, ESI†).

The most stable structure we find, the USPEX-ea430 structure, has a decomposition energy of -0.42 eV per formula unit. The UPEX-ea430 system exhibits thin layers of Cu atoms tetra-

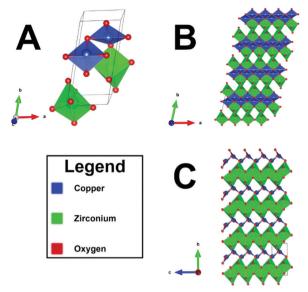


Fig. 2 Sandwich morphology. (A) bulk unit cell. (B)  $4 \times 4 \times 4$  supercell looking down the pores present in the Zr octahedra. (C) 4  $\times$  4  $\times$  4 supercell looking down the pores present at the interface between the Zr octahedra and Cu quadrilaterals. The unit cell in all cases is drawn with black lines. Key: Blue = Cu, Green = Zr, Red = O.

coordinated with O sandwiched between thick layers of slightly distorted Zr octahedra. As a result, we label this the "sandwich" morphology. Interestingly, despite being the most energetically favorable unit cell, the sandwich morphology still favorably decomposes (-0.42 eV per formula unit) to CuO and ZrO<sub>2</sub>. This helps in rationalizing the presence of CuO3,6 and ZrO26,9 reported in several syntheses of CuZrO<sub>3</sub>. The sandwich morphology (Fig. 2) has a nearly orthorhombic unit cell with side lengths a = 3.96, b = 3.96, c = 8.52, and angles  $\alpha = 90.0^{\circ}$ ,  $\beta = 102.1^{\circ}$ ,  $\gamma = 90.0^{\circ}$ . As reference, the true unit cell is orthorhombic with side lengths a = 6.45, b = 7.40, c = 8.31.

If we produce a 2  $\times$  2  $\times$  1 supercell of the sandwich morphology, the side lengths are relatively close to the true unit cell, at a = 7.92, b = 7.93, c = 8.52. To test the effect of this deviation in unit cell dimensions, we constrained the unit cell dimensions of the 2  $\times$  2  $\times$  1 supercell to the experimental dimensions of CuZrO<sub>3</sub>. With this constraint in place, we then relaxed just the atomic coordinates. This resulted in an electronic energy of -37.10 eV per formula unit and a decomposition energy of -1.51 eV per formula unit, thus showing an even-more energetically favorable decomposition to CuO and ZrO2.

We note that there is some degree of structural similarity between the sandwich morphology and the unit cells for CuO and monoclinic ZrO2 (Fig. 3). We can see a "ladder" of alternating Zr-O bonds extending through the ZrO2 cell (Fig. 3A), which also exists as a structural component of the oxidized Zr phase of the CuZrO<sub>3</sub> sandwich (Fig. 3B). In the cell for CuO (Fig. 3C), there are two sets of strips of square-planar CuO units, which are perpendicular to one-another and joined at the edge. In our CuZrO<sub>3</sub> unit cell (Fig. 3D), we retain the morphology of having two sets of CuO squares - albeit seesaw shapes connected at the vertices, instead of square planes connected at the edges.

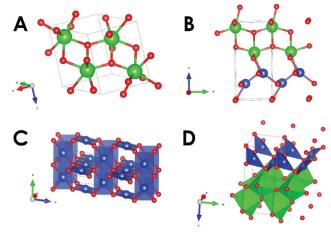


Fig. 3 Comparison of monoclinic ZrO<sub>2</sub> (A) and CuO (C) with the CuZrO<sub>3</sub> sandwich structure (B and D). Key: Blue = Cu, Green = Zr, Red = O.

Part of this may be due to the size of the unit cells we considered, where a unit cell was able to contain at most 7 formula units of CuZrO<sub>3</sub> - a limit we chose for computational tractability reasons. Ultimately, if CuZrO<sub>3</sub> is unstable with a favorable decomposition into CuO and ZrO2, a genetic-algorithmbased optimization strategy may find better solutions for larger cells by maximizing the segregation of the oxidized Cu and oxidized Zr phases.

To further characterize the structure of CuZrO<sub>3</sub>, we have also leveraged Bader analysis<sup>25</sup> on the VASP-calculated charges of our system (Fig. 4). We observe negatively-charged oxygens (slightly more negative than -1), positively charged Cu (+1 in both cases), and more-positive Zr (+2.56 in both cases). In the case of Zr, it is pertinent to refer back to our prior work on model CuZrO<sub>4</sub> NPs, 12 where we had calculated the oxidized Zr patch (Zr had been surrounded by 4 oxygens) to possess a charge of +2.3. Of interest is that, even in the case of our prior model Cu<sub>54</sub>ZrO<sub>4</sub> NP, and in the case of the sandwich morphology,

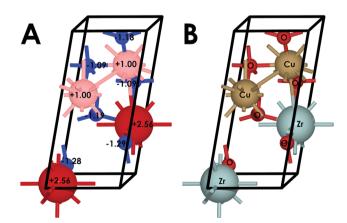


Fig. 4 Charge analysis of the CuZrO<sub>3</sub> sandwich morphology. (A) Badercalculated charges, with each atom colored and labeled by its charge. Key: Blue = negatively charged, Red = positively charged. (B) Model of the CuZrO<sub>3</sub> sandwich morphology, rotated in the same manner for comparison, with each atom colored and labeled by its atomic symbol. Key: Brown = Cu, Light blue = Zr, Red = O.".

Zr does not possess a +4 charge, but instead +2.3 (prior work<sup>12</sup>) and +2.56 (this work). This is, however, very close to the charge of +2.6 we calculate on Zr atoms in ZrO<sub>2</sub>. As a result, this charge transfer is indicative of a +4 oxidation state of Zr.

In our prior work's XPS component, we had observed the presence of a partially reduced  $(Zr^{(4-x)+})$  species in addition to Zr<sup>4+</sup>. Briefly, recall our calculations suggesting a favorable decomposition into CuO and ZrO2 for all structures found so far, including the perovskite structure that had been suggested in the initial synthesis of CuZrO<sub>3</sub>.3 In addition, we find that even in the lowest-energy structure, there is not any variation in the oxidation states between the Zr atoms. This may suggest that the true structure of CuZrO<sub>3</sub> may indeed be metastable, and that what had been experimentally observed may have been the result of a decomposition into CuO and ZrO<sub>2</sub>, with possibly some doping between them.

Additionally, we further performed PBE037 single point energy calculations and we confirmed the decomposition preference of both structures to their parent oxides, albeit with a competition of the "Perovskite Prototype" structure as a metastable structure (see ESI,† section "PBE0 Comparison"). A limited geometry optimization further revealed a flip in this trend, with the sandwich structure again becoming more favorable than the "Perovskite Prototype" (which we re-iterate, unlike the OQMD structures, had ceased being a perovskite during the PBE optimization process). Further optimization calculations with hybrid functionals may shed further light into the exact energetic stability of the metastable structures.

To support our computational work, we experimentally prepared a sample of CuZrO<sub>3</sub> per the synthetic technique of Reddy et al.3 We then conducted an XRD study at 800 °C, drawing our resulting pattern as a solid black line in Fig. 5. The peaks reported by Reddy et al. are drawn as red lines. The close agreement between the diffraction patterns confirms that we successfully reproduced the CuZrO<sub>3</sub> synthesis by Reddy et al.<sup>3,16</sup> The XRD result is also in good agreement with the XRD analysis of Ehsan et al.7

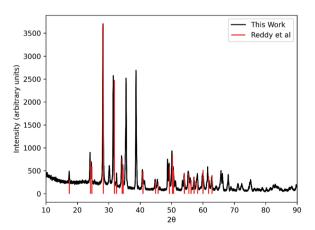
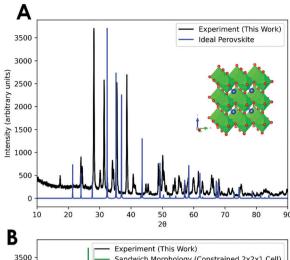


Fig. 5 Comparison between our synthesized CuZrO<sub>3</sub> sample at 800 °C (black), the peaks reported in the original synthesis by Reddy et al.<sup>3</sup> (red). To facilitate comparison, the XRD intensities reported by Reddy et al. are scaled such that their maximum intensity is the same as our sample's maximum intensity



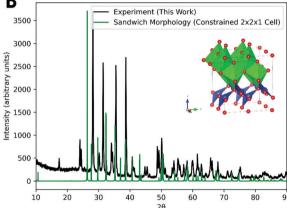


Fig. 6 Comparison of XRD for our synthesized CuZrO<sub>3</sub> sample at 800 °C (black) and two possible candidates for CuZrO<sub>3</sub>. (A) Idealized perovskite morphology. (B)  $2 \times 2 \times 1$  supercell of the sandwich morphology (green) suggested in this work. Both predicted XRD intensities are scaled such that their maximum corresponds with our synthesized sample's maximum intensity, and an image of the unit cell being used to calculate the pattern is included as an inset. In both cases, the cell parameters are set such that they are equal to the known unit cell dimensions

In addition to our experimental XRD, we show in Fig. 6A the XRD pattern for an idealized perovskite cell, with unit cell parameters equal to the known values for CuZrO<sub>3</sub>. Additionally, in Fig. 6B, we take the  $2 \times 2 \times 1$  unit cell of the sandwich morphology and calculate its XRD pattern after scaling the unit cell parameters to the experimental unit cell parameters.

Overall, the results suggest that CuZrO<sub>3</sub> has an unstable crystal structure. Even for the most energetically favorable structure we found (the sandwich morphology, see Table 1), decomposition to CuO and ZrO2 is favored. In addition, our predicted XRD patterns for either structure of CuZrO3 do not agree well with the experimental pattern (Fig. 6). A careful analysis of the XRD diffractogram in Fig. 5 shows that most of the peaks can be attributed to CuO and ZrO2 (as demonstrated in our previous CO<sub>2</sub> adsorption study<sup>12</sup> involving CuZrO<sub>3</sub> NPs), suggesting decomposition of the structure into CuO and ZrO<sub>2</sub>. We note that this also explains some of the differences between the simulated spectra and the experimental spectrum. In the case of the simulated spectra, a single pure phase of either unit cell is

assumed, in contrast with the experimental results, which have decomposition products present.

Nonetheless, in our prior study, we detected CO2 adsorption energetics that could not be explained by CuO, ZrO2, or the SiC support, suggesting that they originated from a CuZrO<sub>3</sub> mixed-oxide phase. To better understand this experimental observation, we hence turn to the most favorable candidate for CuZrO<sub>3</sub> that we identified: the sandwich morphology which, from an energetic standpoint, is much more favorable than even the perovskite structure.

To this end, we investigated the 001, 100, and 101 surface facets of a  $2 \times 2 \times 1$  supercell of the sandwich morphology, because they are both low-Miller-index surfaces and have symmetric terminations. In the case of 001, and 100, two symmetric surface terminations (which we name A and B) were identified. Symmetric terminations for the 100 surface can be found in Fig. 7. Surface energies for all terminations are reported in Table 2. We observe that the 100 surface is the energetically most favorable, followed closely by the 001 surface (Table 2). Since the 100 A-termination has the most favorable surface energy, it was adopted for our subsequent adsorption work. This slab is relatively narrow in one direction and to avoid the adsorbate from interacting with itself, we used a  $2 \times 1$  supercell of the slab.

We investigated the adsorption of CO2 to 6 surface sites on the A-termination of the 100 plane (Fig. 8). In every case, to facilitate convergence to strongly adsorbed states, we place CO2 molecules in a pre-activated position. From the 6 adsorption configurations in Fig. 8, we observe CO<sub>2</sub> to converge to only 3 types of adsorption configuration, shown in Fig. 9. Configurations A, B, and E in Fig. 8 converge to an almost linear CO<sub>2</sub> state with  $\angle_{OCO}$  = 176° (Fig. 9A). Configuration C in Fig. 8 converges to a physisorbed state (Fig. 9B). Finally, configurations D and F result in the

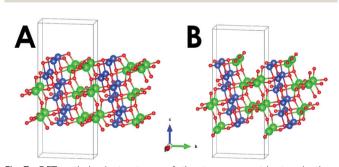


Fig. 7 DFT-optimized structures of the two symmetric terminations identified for the 100 surface. (A) Termination A. (B) Termination B. Key: Blue = Cu, Green = Zr, Red = O.

Table 2 Surface energies for sandwich morphology in J m<sup>-2</sup>

Facet	Termination	Surface energy (J m <sup>-2</sup> )
101	A	1.36
100	A	0.85
100	В	1.20
001	A	1.08
001	В	0.99

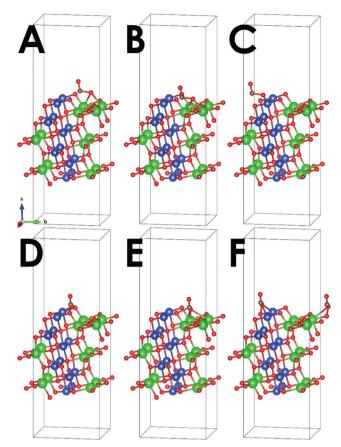


Fig. 8 Initial adsorption configurations on the 100 A-termination. An axis indicating cell vector directions is drawn in subfigure A. Key: Blue = Cu, Green = Zr. Red = Q. Black = Q

formation of a chemisorbed and activated (bent) species (Fig. 9C). In the case of Fig. 8D and F, CO<sub>2</sub> remains whichever side of Cu it is initially placed, and we report that which is lower in energy in Fig. 9C.

These three configurations show a range of adsorption energies (Table 3). An almost linear configuration of CO2 (Fig. 9A and Table 3A) adsorbs strongly at -0.45 eV. The weakly bound, linear CO<sub>2</sub> (Fig. 9B and Table 3B) physisorbs with energy -0.17 eV. Finally, CO<sub>2</sub> (Fig. 9C and Table 3C) binds in an activated state, at -0.19 eV. It should be noticed that the CO<sub>2</sub> adsorption configuration presented in Fig. 9A has the oxygen of  $CO_2$  coordinating with surface Zr (an oxophilic atom). This is an important observation since this strongly bound conformation of CO<sub>2</sub> is observed on surface Zr atoms that do not necessarily activate the molecule (i.e. the decrease in bond angle is very slight). In contrast, Cu-O sites (Fig. 9C) appear to activate CO2, while exhibiting lower adsorption energy compared to the Zr site.

These energies are weaker than the experimental results of our prior work, 12 which reported desorption energies ranging from -0.99 to -1.23 eV. A potential cause of this could be the neglect of dispersion contributions, which may play a significant role in the case of CO2. To check whether this is indeed a source of error, we calculate the binding energy by running

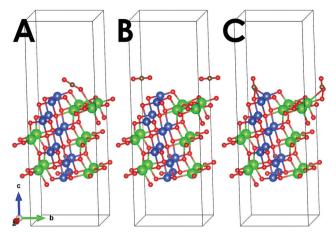


Fig. 9 Final (optimized) adsorption configurations on the 100 Atermination. (A) Almost linear CO2. (B) Physisorbed CO2. (C) Activated CO<sub>2</sub>. Labels in this figure correspond to those in Table 3. An axis indicating cell vector directions is drawn in subfigure A. Key: Blue = Cu, Green = Zr, Red = O, Black = C.

Table 3 Adsorption energies for CO<sub>2</sub> on the 100 A-termination. Adsorption configuration labelling corresponds with that of Fig. 9

Adsorption configuration (Fig. 9)	DFT adsorption energy (eV)	DFT+D3 singlepoint adsorption energy (eV)
A	-0.45	-0.55
В	-0.17	-0.18
C	-0.19	-0.24

single-point calculations of the CO2, bare surface, and CO2surface systems (Table 3). We observe an enhanced binding energy in all 3 cases, but the resulting energies are not within the previous experimental observations.

We additionally attempted to relax the surface using PBE+D3, i.e. repeat this adsorption study with dispersion, but we were unable to converge the geometry for several structures. Instead, we froze the atoms of the slab in place, and allowed just CO<sub>2</sub> to relax - this facilitated convergence of the geometry. This was performed for each of the 3 configurations depicted in Fig. 9 and Table 3, and the converged structures are reported in Fig. 10. In all three cases, we start from the same initial geometries used for Fig. 9, i.e. CO2 starts near the surface in a pre-activated state.

Structure A (Fig. 10A) converged to nearly the same final state reported in Fig. 9A, with the LOCO increasing by one degree to 177°. Structure B (Fig. 10B) converges to the same physisorbed structure reported in Fig. 9B. Interestingly, structure C (Fig. 10C) no longer converges to an activated structure (which was the case in Fig. 9C). Instead, it converges to a physisorbed state. The adsorption energies were again similar (Table 4), with the largest change being a weakening of structure A's adsorption energy by 0.1 eV. Overall, despite the dispersion correction, the results are hence still not in good agreement with our previously reported experimental results.<sup>12</sup>

This discrepancy is surprising, given that a singly-doped NP model in our original study was able to reflect the

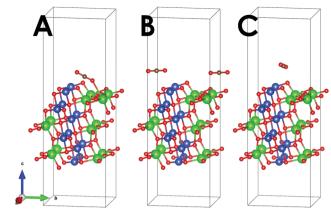


Fig. 10 Final (optimized) adsorption configurations on the 100 Atermination, when PBE+D3 is used, and only CO2 is allowed to relax (i.e. the entire slab is frozen). (A) Nearly-linear physisorbed CO2. (B) Physisorbed CO2. (C) Physisorbed CO2.

Table 4 Adsorption energies for the 100 A-termination when the D3 correction is applied. Labels in the first column correspond to the labels used in Fig. 10

Adsorption configuration (Fig. 10)	DFT+D3 adsorption energy
A	-0.47
В	-0.15
C	-0.18

experimentally observed strong CO2 adsorption much more accurately. Specifically, in that work we observed that model systems consisting of an oxidized Zr patch doped on an otherwise-monometallic Cu NP reproduced the experimental results well. We note that our previous XPS results had shown the presence of Zr<sup>4+</sup>, Cu<sup>2+</sup>, and Cu<sup>0</sup> species, and that TEM images confirmed the presence of pure (metallic) Cu NPs. Considering that a model system which has an oxidized patch of Zr on an otherwise-metallic Cu NP is able to reproduce the experimental results better than a model system with fullyoxidized Zr and Cu species, it may be reasonable to infer that the strong CO<sub>2</sub> adsorption energies may result from the interface of an oxidized Zr<sup>4+</sup> phase, formed from the decomposition of CuZrO<sub>3</sub>, and a metallic Cu<sup>0</sup> phase, rather than from a true mixed oxide phase. Indeed, it is known that interfacial effects play an important role in CO2 hydrogenation on Cu/ZrO2 catalysts. 38,39 We also note that the doping of Cu into a ZrO2 phase is a possibility, as several works<sup>40,41</sup> have investigated the doping of ZrO2 systems with Cu, including one which investigated a Cu-doped ZrO2 aerogel for the hydrogenation of CO to CH<sub>3</sub>OH. 42 Another explanation could be different surface terminations (high-energy surfaces reported in Table 2) or, most likely, surface hydroxyl groups that result in the formation of bicarbonate species that could bind CO<sub>2</sub> stronger. 12 Future studies should focus on the surface hydration of this new structure, as well as the interface with other phases (such as Cu).

# Conclusions

Taking stock of the body of work on CuZrO<sub>3</sub>, we address a current gap in literature: to the best of our knowledge, there is no set of atomic coordinates available for this material. We confirm that the Goldschmidt<sup>27</sup> and Bartel<sup>28</sup> tolerance factors predict the formation of a perovskite material, which is consistent with prior characterization work.<sup>3,6</sup> Leveraging several structural prediction strategies including USPEX, 31-33 the Materials Project Structure Predictor, 19,20 and the OQMD, 29,30 we find that the perovskite, which is the generally accepted structure of CuZrO<sub>3</sub>, does not appear to be the lowest-energy structure within the framework of PBE DFT. Moreover, even the lowest-energy structure we identified appears to have a thermodynamically favorable decomposition to CuO and ZrO2. This is in agreement with the X-ray diffraction pattern of the material which can be explained based only on the presence of CuO and ZrO<sub>2</sub>, respectively. Taking the lowest-energy structure, we investigate several potential surfaces, and identify that the 100 surface as the most-stable. CO2 adsorption energy calculations then show that CO<sub>2</sub> can adsorb and activate on the surface. However, these CO<sub>2</sub> adsorption results are different from previously reported experimental studies, providing further evidence that the CuZrO3 is likely a mixture of CuO and ZrO2 phases. Collectively, our combined computational and experimental work suggests that CuZrO<sub>3</sub> is a metastable oxide that has a strong tendency to phasesegregate into CuO and ZrO2 and if stabilized, it may not be a perovskite as previously reported, but a sandwich-like structure.

# Conflicts of interest

There are no conflicts to declare.

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