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# Dynamic Evolution of Copper Nanowires during CO<sub>2</sub> Reduction Probed by *Operando* Electrochemical 4D-STEM and X-ray Spectroscopy

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## Abstract:

Nanowires have emerged as an important family of one-dimensional (1D) nanomaterials owing to their exceptional optical, electrical, and chemical properties. In particular, Cu nanowires (NWs) show promising applications in catalyzing the challenging electrochemical CO<sub>2</sub> reduction reaction (CO<sub>2</sub>RR) to valuable chemical fuels. Despite early reports showing morphological changes of Cu NWs after CO<sub>2</sub>RR processes, their structural evolution and the resulting exact nature of active Cu sites remain largely elusive, which calls for the development of multimodal *operando* time-resolved nm-scale methods. Here, we report that well-defined 1D copper nanowires, with a diameter of around 30 nm, have a metallic 5-fold twinned Cu core and around 4 nm Cu<sub>2</sub>O shell. *Operando* electrochemical liquid-cell scanning transmission electron microscopy (EC-STEM) showed that as-synthesized Cu@Cu<sub>2</sub>O NWs experienced electroreduction of surface Cu<sub>2</sub>O to disordered (spongy) metallic Cu shell (Cu@Cu<sup>S</sup> NWs) under CO<sub>2</sub>RR relevant conditions. Cu@Cu<sup>S</sup> NWs further underwent a CO-driven Cu migration leading to a complete evolution to polycrystalline metallic Cu nanograins. *Operando* electrochemical four-dimensional (4D) STEM in liquid, assisted by machine learning, interrogates the complex structures of Cu nanograin boundaries. Correlative *operando* synchrotron-based high-energy-resolution X-ray absorption spectroscopy unambiguously probes the electroreduction of Cu@Cu<sub>2</sub>O to fully metallic Cu nanograins followed by partial reoxidation of surface Cu during post-electrolysis air exposure. This study shows that Cu nanowires evolve into completely different metallic Cu nanograin structures supporting the *operando* (operating) active sites for the CO<sub>2</sub>RR.

## Introduction:

Nanowires are one-dimensional (1D) nanostructures with a diameter of 1-100 nm and a large aspect ratio. Over the past three decades, nanowires have emerged as one of three major families of nanomaterials: 0D nanocrystals (e.g. quantum dots, C<sub>60</sub>), 1D nanowires and carbon nanotubes, and 2D materials (e.g. graphene).<sup>1-3</sup> Nanowires, with their unique size- and dimensionality-dependent physical and chemical properties, have demonstrated a wide range of promising applications in nanolasers,<sup>4</sup> photonics,<sup>5</sup> electronics,<sup>6</sup> energy storage (batteries)<sup>7</sup> and (photo)electrochemical catalysis.<sup>8,9</sup> Elucidating the reaction mechanisms and structures of electrocatalysts is crucial for advancing renewable energy technologies, in particular the electrochemical CO<sub>2</sub> reduction reaction (CO<sub>2</sub>RR), which offers a direct route to reducing greenhouse gases to valuable chemical fuels.<sup>10,11</sup> The primary challenge facing the CO<sub>2</sub>RR is to develop low-overpotential and high-selectivity electrocatalysts.<sup>12</sup> Cu nanocatalysts are among the few catalyst candidates that can produce multicarbon products at appreciable rates.<sup>13</sup> Early studies on Cu nanowires with diameters from hundreds of nanometers to micrometers explored their applications in the CO<sub>2</sub>RR to CO or hydrocarbon products.<sup>14-17</sup> In 2017, our group reported the first example of Cu nanowires (diameter < 100 nm) for the CO<sub>2</sub>RR.<sup>18</sup> Pristine ultrathin Cu nanowires with a diameter of ~20 nm and well-defined twin grain boundary, showed a mild structural fracturing while Cu nanowires, wrapped with a graphene oxide protection layer, showed no morphological change after long-term CO<sub>2</sub>RR electrolysis. Recent studies on Cu nanowires have shown structural evolution after the electrochemical activation process.<sup>19</sup> Although those *ex situ* studies indicate some levels of structural changes of Cu nanowires after the CO<sub>2</sub>RR, the dynamic evolution from pristine Cu nanowires to active Cu sites warrants an *operando* study of electrocatalysts under the reaction conditions.<sup>20,21</sup> *Operando* electrochemical liquid-cell scanning transmission electron microscopy (EC-STEM) enables quantitative electrochemistry and quantitative STEM-based imaging, spectroscopy, and diffraction analysis.<sup>22,23</sup> *Operando* electrochemical 4D-STEM in liquid shows the potential to resolve complex structures of dynamic catalysts under reaction conditions.<sup>24</sup> Correlative synchrotron-based X-ray methods can track dynamic changes in valence state during the electroreduction-reoxidation cycle of electrocatalysts.<sup>25,26</sup> Here, we apply multimodal *operando* methods to investigate the structural evolution and active structure of Cu NWs.

## Results & Discussion:

**Fig. 1a** schematically summarizes the key findings in stepwise evolution pathways of Cu NWs under CO<sub>2</sub>RR-relevant conditions. As-prepared Cu NWs, when exposed to air, have a Cu<sub>2</sub>O shell (labeled as Cu@Cu<sub>2</sub>O NWs), which undergo electroreduction to disordered (spongy) metallic Cu shell (Cu@Cu<sup>S</sup>) (Stages 1-2). Cu migrates from surface Cu shell to nucleate and grow into seeds of Cu nanograins (Stages 3-4) followed by continuous growth with Cu atoms from the metallic Cu NW core materials (Stage 5). Overall, pristine Cu@Cu<sub>2</sub>O NWs experience complete structural evolution to polycrystalline metallic Cu nanograins under CO<sub>2</sub>RR-relevant conditions.

Copper nanowires (NWs) were prepared by colloidal synthesis as a model system to investigate the dynamic evolution of 1D nanocatalysts under electrochemical conditions. High-angle annular dark-field STEM (HAADF-STEM) images of as-synthesized copper NWs show a diameter of  $30 \pm 10$  nm and a length over 3  $\mu\text{m}$  with an aspect ratio of over 100 (Figs. 1b, S1). Atomic-scale HAADF-STEM images exhibit a metallic Cu core with d-spacings of Cu{200} (1.8 Å) surrounded by polycrystalline Cu<sub>2</sub>O shell with d-spacings of Cu<sub>2</sub>O{111} (2.5 Å) (Figs. 1c, S1-S2). Enlarged atomic-scale STEM images of the Cu core demonstrate the hexagonal symmetry of the face-centered cubic (fcc) Cu near the  $[1\bar{1}0]$  zone axis (Figs. 1d, S2). The corresponding Fourier transform shows typical d-spacings of metallic {111} (2.1 Å) and Cu{002} (1.8 Å) (Fig. 1e). Those atomic-scale STEM images of the metallic Cu NW core match well the typical 5-fold twinned structure of Cu NWs with {100} side facets along the  $\langle 110 \rangle$  axial growth direction (Fig. 1f). STEM based electron energy loss spectroscopy (EELS) was performed to measure the thickness and electronic structure of surface oxide shell (Figs. 1g-l). STEM-EELS elemental maps show a uniform oxide shell in green around the metallic Cu core in yellow. The corresponding EELS line profile, extracted from the dashed white box in Fig. 1g, measures an oxide shell of around 4 nm, i.e. Cu@Cu<sub>2</sub>O NWs have the Cu core with an average diameter of around 22 nm surrounded by around 4 nm oxide shell (Figs. 1g, S3-S5). EELS spectra analyze the electronic structure and unambiguously show that the Cu core is metallic with a lower L<sub>3</sub> edge and a delayed L<sub>2</sub> edge due to the fully occupied d orbitals<sup>27</sup> while the shell is Cu<sub>2</sub>O with a pronounced L<sub>2</sub> edge at  $\sim 960$  eV (labeled with asterisk, Figs. 1h, S6). Both EELS and synchrotron X-ray spectroscopy in later discussions rule out the presence of CuO in pristine copper NWs (Figs. S6, S23). Those atomic-scale STEM images and EELS analysis of as-synthesized copper NWs show a Cu@Cu<sub>2</sub>O core-shell structure with an average diameter of 30 nm and about 4 nm Cu<sub>2</sub>O shell.

The CO<sub>2</sub>RR performance of Cu@Cu<sub>2</sub>O NWs exhibits an activation period with the Faradaic efficiency (FE) of C<sub>2</sub>H<sub>4</sub> reaching a steady state after 1 h CO<sub>2</sub>RR electrolysis in an H-cell (Fig. S7a). The CO<sub>2</sub>RR product distribution and potential-dependent FE were summarized in Figs. S7b-c. *Ex situ* SEM images showed that Cu@Cu<sub>2</sub>O NWs experienced a complete evolution to Cu nanograins at adjacent locations after CO<sub>2</sub>RR electrolysis in an H-cell for 1 h (Fig. S8). Those *ex situ* measurements of copper NWs before and after CO<sub>2</sub>RR electrolysis provide a baseline understanding for in-depth *operando* studies of the dynamic evolution of Cu NWs under reaction conditions. *Operando* EC-STEM imaging was performed to investigate dynamic morphological changes of Cu@Cu<sub>2</sub>O NWs under electrochemical conditions. A cyclic voltammetric (CV) profile of Cu@Cu<sub>2</sub>O NWs shows a well-defined redox couple of Cu/Cu<sub>2</sub>O in the EC-STEM setup (Fig. S9) and matches well with the results of Cu nanocatalysts in a standard H-cell.<sup>12</sup> A linear sweep voltammetry (LSV) from 0.4 to around 0 V vs. RHE was performed to trigger the formation of H<sub>2</sub> bubbles (a natural side product during the CO<sub>2</sub>RR, Fig. S7b). The electrogenerated H<sub>2</sub> bubbles enable a thin-liquid configuration ( $\sim 100$  nm), which significantly improves spatial resolution while allowing electrolytes to remain electrochemically accessible for subsequent *operando* EC-STEM studies under CO<sub>2</sub>RR-relevant conditions.<sup>28</sup> Control experiments showed that Cu@Cu<sub>2</sub>O NWs, located on the carbon WE, experienced electroreduction of the surface Cu<sub>2</sub>O to

disordered/amorphous (spongy) Cu shell (labeled as Cu@Cu<sup>S</sup>, Fig. S10). In comparison, Cu@Cu<sub>2</sub>O, located off the carbon WE, remained largely unchanged, suggesting that the evolution from Cu@Cu<sub>2</sub>O to Cu@Cu<sup>S</sup> was driven by electrochemical potentials rather than beam-induced damage. Correlative *operando* X-ray absorption spectroscopy of Cu@Cu<sub>2</sub>O NWs provides compelling evidence that surface Cu<sub>2</sub>O of NWs was reduced to metallic Cu at 0 V (Fig. S11), which indicates the spongy Cu shell observed in EC-STEM achieved a fully metallic state at 0 V and remained metallic through the course of CO<sub>2</sub>RR.

*Operando* EC-STEM movies were acquired to track the dynamic evolution of Cu@Cu<sup>S</sup> under electrochemical conditions. Given the rapid morphological evolution of Cu NWs, *operando* EC-STEM was performed at a mild chronoamperometric (CA) experiment under a constant potential of 0 V to capture structural changes in detail (Fig. 2). A beam-dose control experiment was routinely performed to acquire EC-STEM movies without applying electrochemical potentials, corresponding to the “counting-down” time of -40 to 0 s in Movie S1. A reducing potential was applied at 0 s to initiate the dynamic evolution of Cu@Cu<sup>S</sup> NWs (Fig. 2a). During the first 4 s, Cu nanograins started nucleating at adjacent locations as shown in two Cu nanograin seeds in the dashed circle and hexagon with Cu@Cu<sup>S</sup> showing little morphological changes (Fig. 2b). From 4 to 20 s, Cu@Cu<sup>S</sup> showed a progressive and mild fragmentation with nearby Cu nanograins continuing to grow in both sizes and numbers (Figs. 2b-f). From 20 to 40 s, Cu@Cu<sup>S</sup> experienced a significant fragmentation of the spongy Cu shell and the Cu NW core with Cu migration to adjacent newly formed as well as existing Cu nanograins (Figs. 2f-k). From 40 to 120 s, Cu@Cu<sup>S</sup> achieved a complete evolution to metallic Cu nanograins with no significant further change; This steady-state structure is shown in the false-color comparison of initial Cu@Cu<sup>S</sup> NWs in red and Cu nanograins in green (Fig. 2l). *Operando* EC-STEM images were acquired in another region before and after the CA experiment without acquiring continuous EC-STEM movies thus minimizing beam exposure to two imaging frames, which also showed a complete evolution from Cu@Cu<sup>S</sup> NWs to polycrystalline Cu nanograins (Fig. S12). Additional *operando* EC-STEM images acquired at -1 V showed that Cu nanograins achieved a steady-state polycrystalline structure with a size of around 50 nm (Figs. S13). A close examination of Cu nanograins formed at -1 V in *operando* EC-STEM shows a high degree of similarity to Cu nanograins observed in *ex situ* STEM and SEM images of NW-derived Cu nanograins after the CO<sub>2</sub>RR electrolysis in H-cell (Figs. S14, S8). It indicates that the dynamic evolution of Cu NWs in *operando* EC-STEM can faithfully represent the overall structural changes of Cu NWs in a realistic CO<sub>2</sub>RR electrolysis device. It should be noted that *operando* EC-STEM experiments occurred on a significantly shorter timescale (around 1 min) in Fig. 2, when compared to hour-long operation required for Cu@Cu<sub>2</sub>O NWs to achieve a steady-state performance in a standard H-cell (Fig. S7), which is likely due to a much stronger electrical field in the confined environment of the EC-STEM.<sup>29,30</sup>

The complex polycrystalline structures of NW-derived Cu nanograins require an in-depth structural analysis in liquid under reaction conditions since Cu nanograins will not maintain the same metallic phase under post-electrolysis air exposure. Four-dimensional (4D) STEM, enabled

by a new-generation electron microscope pixel array detector (EMPAD),<sup>31,32</sup> records a 2D reciprocal-space electron diffraction pattern rapidly at each pixel of the 2D real-space image with a single-electron sensitivity and high dynamic range (Movie S2). *Operando* electrochemical 4D-STEM can reliably retrieve structural information of those NW-derived Cu nanograins at a low beam dose of  $\sim 20$  e/Å<sup>2</sup> in liquid under reaction conditions.<sup>24</sup> Large 4D-STEM datasets were segmented as different clusters through an unsupervised machine learning method, a K-means based hierarchical clustering method,<sup>33,34</sup> which shed light into the extremely complex structures of nanograin boundaries. Although HAADF-STEM image of the Cu@Cu<sup>S</sup> NWs shows a similar image contrast between the Cu core and surface spongy Cu shell (Fig. 3a), the false-color 4D-STEM clustering map of the Cu@Cu<sup>S</sup> NWs reveals a clear heterogeneous distribution of Cu nanograins along the Cu@Cu<sup>S</sup> wires (Fig. 3b). The colors of black and grey with numbers of 0 and 1, respectively, represent the SiN<sub>x</sub>/liquid background and amorphous region on the samples, respectively (Fig. 3c). Other colors from purple to yellow with numbers from 2 to 9 represent crystalline Cu nanograins with different crystal orientations. A region enlarged from the white box (Fig. 3b, inset) highlights an example of one nanograin boundary between two grains with different crystal orientations, grain 1 (G1) in red and grain 2 (G2) in blue, which are surrounded by disordered and spongy Cu shell (Cu@Cu<sup>S</sup>). A detailed analysis of nanograin boundaries and corresponding electron diffraction patterns of grain boundaries at each pixel were included in Figs. S15-S16. 4D-STEM clustering map in another region shows various nanograin boundaries surrounded by a thicker disordered and spongy Cu shell (Fig. S17). Although Cu nanograins in colors of 2 to 9 are crystalline, relative to those disordered nanograins in grey with a number of 1, the number of 9 does not necessarily represent a higher order of crystallinity than that of 2. To quantify the relative degree of crystallinity, the fluctuation electron microscopy (FEM) analysis was performed by measuring the medium-range ordering (MRO) and calculating the level of fluctuations (standard deviation) of the diffraction intensity.<sup>35</sup> The FEM map of Cu@Cu<sup>S</sup> clearly shows a more crystalline Cu NW core surrounded by a disordered and spongy Cu shell (Figs. S17-18).

*Operando* electrochemical 4D-STEM was further performed on NW-derived Cu nanograins after achieving a steady-state structure under electrochemical conditions (Figs. 3d-g, S19). Three Cu nanograins were selected to highlight the heterogeneous grain distributions among the complex structures of polycrystalline Cu nanograins. Three regions of the Cu nanograin in Fig. 3e were labeled with red, green, and orange boxes. In particular, the four individual Cu sub-domains at each pixel within the red box in Fig. 3e show distinctly different crystal orientations. The FEM analysis of the same Cu nanograin (e) suggests that Cu domains in colors from purple to orange (numbers from 2 to 6) show a higher degree of crystallinity (Fig. S20). A similar 4D-STEM clustering and FEM analysis were performed on Cu nanograins (f) and (g) (Figs. 3f-g, S21-22). In summary, *operando* EC-STEM and machine-learning-driven 4D-STEM clustering analysis offer a reliable structural analysis of individual Cu nanograins under CO<sub>2</sub>RR-relevant conditions. Cu@Cu<sup>S</sup> NWs have crystalline NW core surrounded by disordered and spongy shells and the

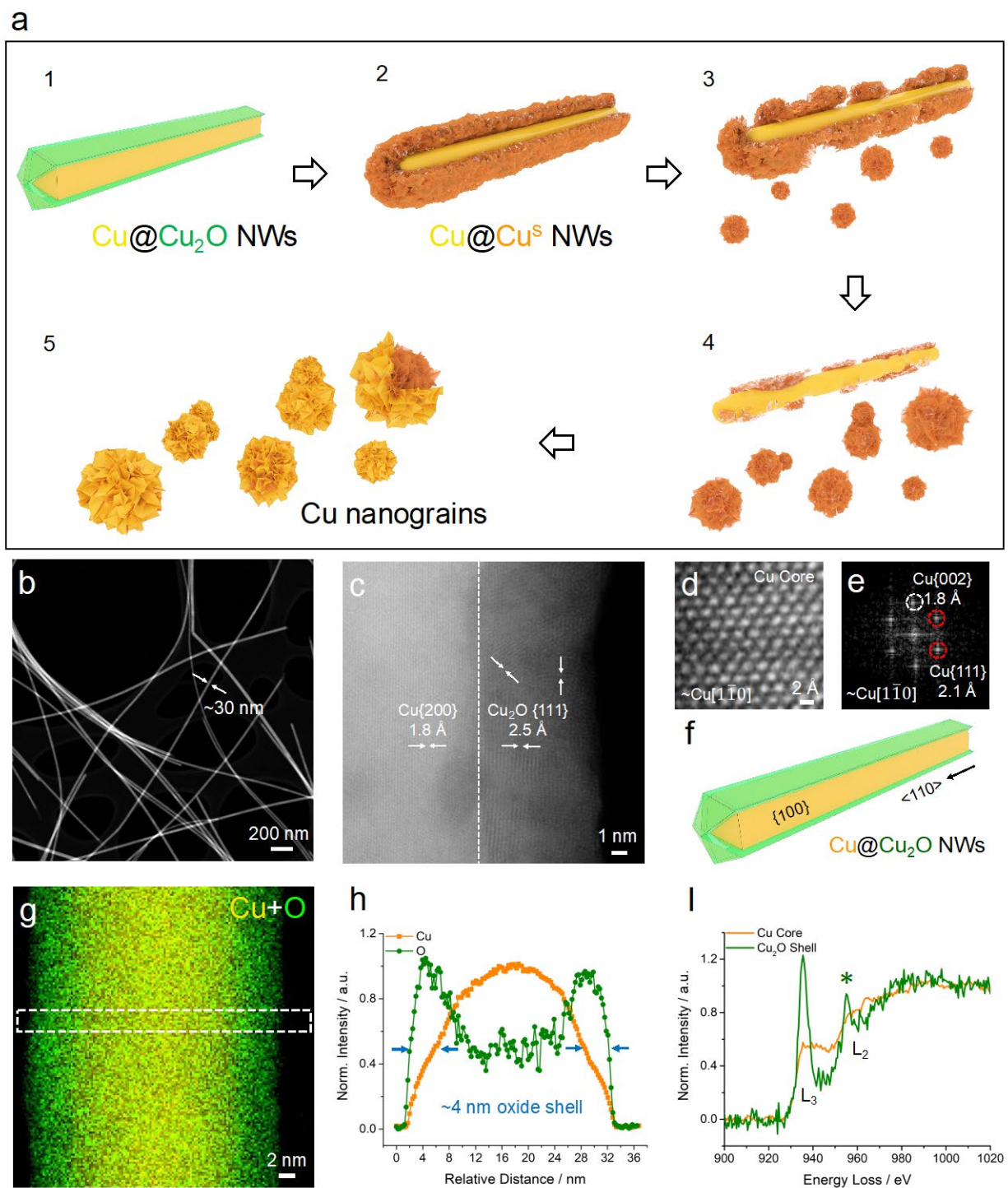
steady-state NW-derived Cu nanograins are polycrystalline metallic active sites with various nanograin boundaries.

This study further advances our understanding of the dynamic evolution of Cu nanowires by performing *operando* synchrotron-based X-ray spectroscopy (XAS) studies of a large ensemble of Cu@Cu<sub>2</sub>O NWs (Fig. 4). High-energy-resolution fluorescence-detected (HERFD) XAS is capable of resolving the pre-edge regions of X-ray absorption near-edge structure (XANES) with a significantly higher energy resolution (around 0.5 eV) of first-row transition metals, when compared to around 1.5 eV energy resolution of conventional XAS in transmission or fluorescence mode (Fig. S23).<sup>23</sup> HERFD XANES of pristine Cu@Cu<sub>2</sub>O NWs suggest a mixed phase of Cu and Cu<sub>2</sub>O without the presence of CuO (Fig. S23). The quantitative linear combination fitting (LCF) analysis of pristine Cu@Cu<sub>2</sub>O NWs calculates a relative fraction of 68% Cu and 32% Cu<sub>2</sub>O with a fitting error of 3% (Fig. S24a). To validate the XAS quantification of the oxide fraction, a simplified calculation based on the core-shell geometry of NWs predicts an oxide shell of around 3 nm, which is consistent with the experimental STEM-EELS mapping of around 4 nm Cu<sub>2</sub>O shell (Fig. S24b). *Operando* HERFD XANES of Cu@Cu<sub>2</sub>O NWs under CO<sub>2</sub>RR at -1 V shows the electroreduction of surface Cu<sub>2</sub>O to metallic Cu based on a negative shift of the pre-edge energy at around 8980 eV (dashed black box) as well as an increase of the post-edge feature at around 9024 eV (Figs. 4a, S25a). *Ex situ* HERFD XANES spectra of NW-derived Cu nanograins show the progressive reoxidation of surface metallic Cu to Cu<sub>2</sub>O under post-electrolysis air exposure (Fig. 4b, S25b). HERFD XANES spectra of the dynamic electroreduction-reoxidation cycle of Cu@Cu<sub>2</sub>O NWs are summarized together with bulk Cu and Cu<sub>2</sub>O reference spectra in Figs. 4c. The corresponding quantification of the relative fraction of metallic Cu suggests that Cu@Cu<sub>2</sub>O NWs achieves fully metallic Cu nanograins with a metallic Cu fraction of 100 ± 1% under CO<sub>2</sub>RR at -1 V after 30 min (Fig. 4d), which is consistent with the 1 h timescale of achieving a steady-state CO<sub>2</sub>RR performance (Fig. S7). Quantification of post-electrolysis HERFD XANES suggests a decrease in the relative fraction metallic Cu to 79 ± 2% after 40 min air exposure. A relative fraction of 21% Cu<sub>2</sub>O of NW-derived Cu nanograins after air exposure is lower than 32% Cu<sub>2</sub>O of pristine Cu@Cu<sub>2</sub>O NWs, which is consistent with a relatively smaller contribution of surface oxide of a larger size of NW-derived Cu nanograins (~50 nm) when compared to the diameter of pristine NWs (~30 nm). *Operando* extended X-ray absorption fine structure (EXAFS) provides additional information on the coordination environment of Cu as a response to the electroreduction-reoxidation cycle (Fig. S26). To resolve the fast dynamic electroreduction of Cu@Cu<sub>2</sub>O NWs,<sup>36</sup> X-ray photon energy was fixed at 8979.5 eV where the change of XANES pre-edge intensity achieved a maximum value and was recorded at a temporal resolution of one second per X-ray acquisition event (Fig. S27). The majority of the 4 nm Cu<sub>2</sub>O shell of 1D Cu NWs with a diameter of 30 nm was reduced to metallic Cu after 260 s. In comparison, 0D Cu nanocrystals, with a comparable size of around 30 nm but a thinner Cu<sub>2</sub>O shell of around 2 nm require significantly less time of 90 s to reduce the majority of oxide shell (Figs. S27-S28). This comparison indicates that the relative thickness of the Cu<sub>2</sub>O shell determines its electroreduction kinetics. In summary, as illustrated in the schematic in Fig. 4d, Cu@Cu<sub>2</sub>O NWs experienced a

complete electroreduction of surface  $\text{Cu}_2\text{O}$  to  $\text{Cu@Cu}^{\text{S}}$  NWs followed by a significant reconstruction to form metallic Cu nanograins under the  $\text{CO}_2\text{RR}$  followed by a partial reoxidation of surface Cu during post-electrolysis air exposure.

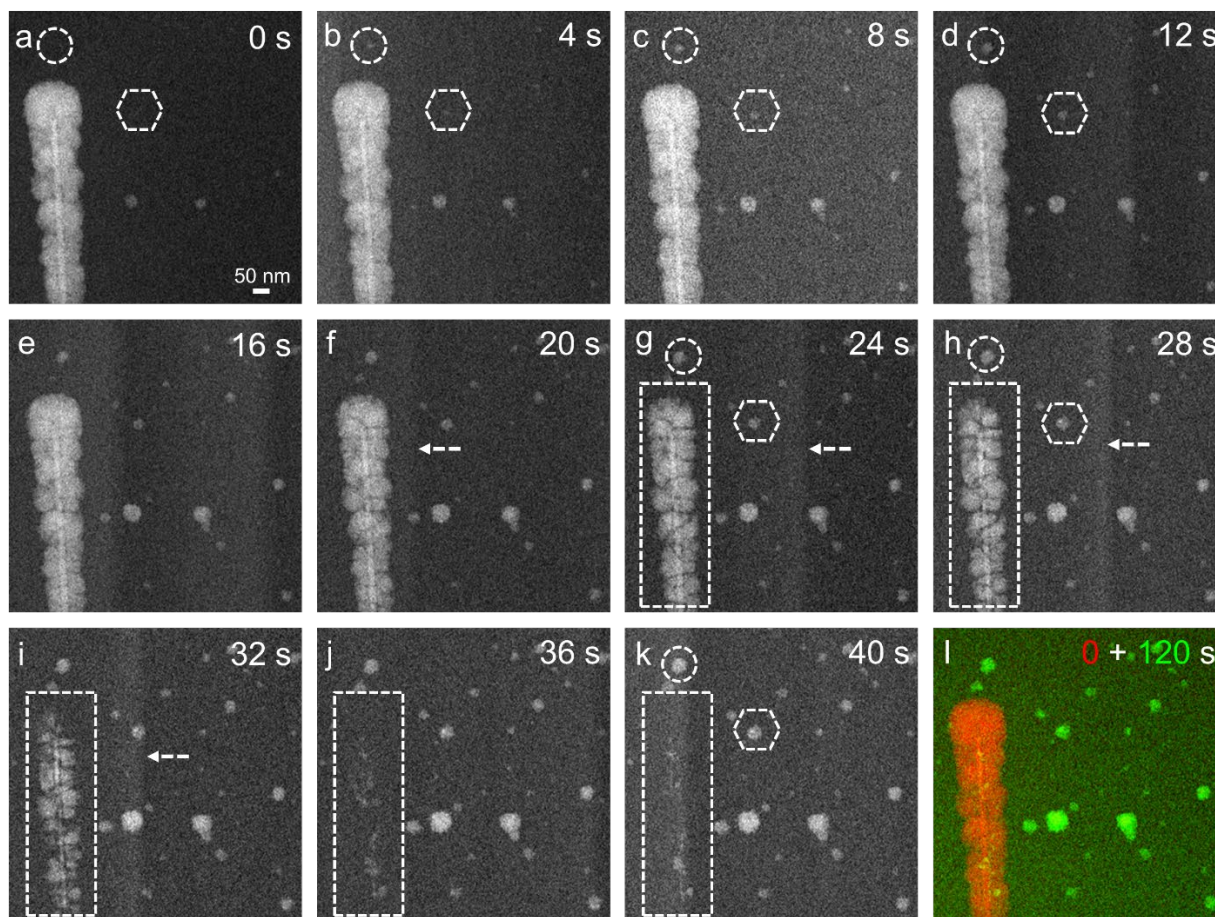
In conclusion, this work employed a suite of *operando* methods to elucidate that pristine  $\text{Cu@Cu}_2\text{O}$  NWs experienced the electroreduction of surface  $\text{Cu}_2\text{O}$  shell to a disordered and spongy shell ( $\text{Cu@Cu}^{\text{S}}$  NWs) followed by a complete evolution to polycrystalline metallic Cu nanograins. As this study reveals how 1D Cu NWs evolve into active Cu nanograins during the  $\text{CO}_2\text{RR}$ , one fundamental challenge facing the development of Cu nanocatalysts is to resolve the molecular picture regarding why Cu atoms migrate during the  $\text{CO}_2\text{RR}$ . We hypothesize that key reaction intermediates, such as adsorbed CO, can trigger CO-driven formation and migration of Cu atoms,<sup>37</sup> leading to a significant structural evolution to polycrystalline Cu nanograins. In this work, *operando* EC-STEM is emerging as a powerful analytical method to enable reliable electrochemistry and simultaneously STEM based imaging and diffraction techniques. *Operando* electrochemical 4D-STEM in liquid, coupled with a machine learning based automated data process, provides valuable insights into the structural analysis of Cu nanograin boundaries. Correlative synchrotron-based X-ray methods provide complementary information on large ensembles of nanocatalysts. We acknowledge that the 4D-STEM clustering is still performed at nanometer-scale in this work to faithfully rule out any undesirable beam damage that may occur at a higher beam dose required for a higher spatial resolution. *Operando* 4D-STEM at/near-atomic scale will provide further information on quantitative analysis of nanograin boundaries and grain size distributions. We anticipate that multimodal *operando* methods can serve as a powerful toolbox to probe complex structures of dynamic catalysts under electrochemical conditions.



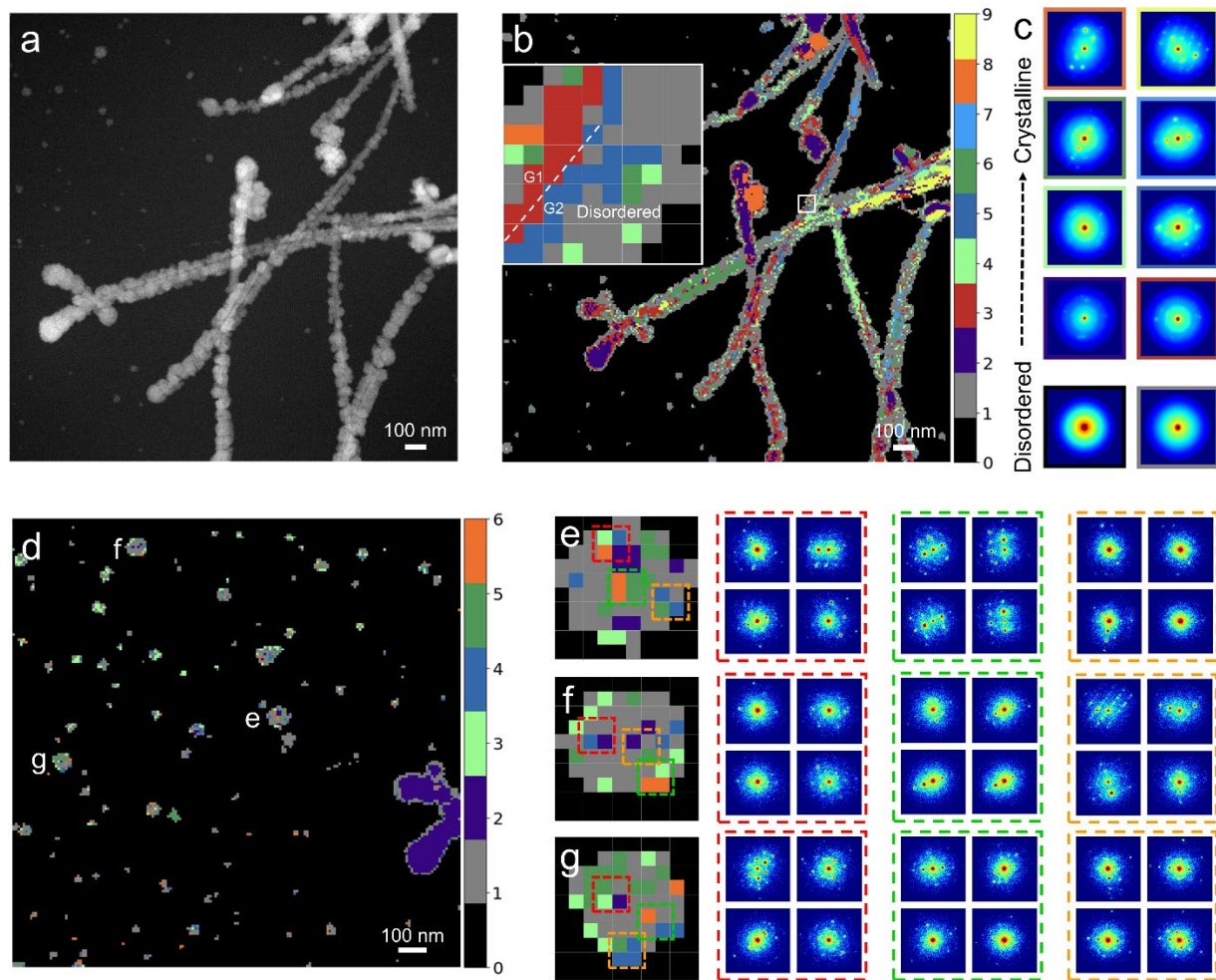


**Figure 1. Schematic of structural evolution and atomic-scale STEM-EELS characterizations of  $\text{Cu@Cu}_2\text{O}$  NWs.** (a) Schematic of dynamic evolution of Cu NWs under  $\text{CO}_2\text{RR}$  relevant conditions. (b) HAADF-STEM image of Cu NWs with a diameter of around 30 nm and a length over 3  $\mu\text{m}$  (aspect ratio > 100). (c) Atomic-scale STEM image of metallic Cu core with {200} d-spacings (1.8 Å) surrounded by polycrystalline  $\text{Cu}_2\text{O}$  shell with {111} d-spacings (2.5 Å). (d-e) High-resolution TEM image and HRTEM pattern of  $\text{Cu@Cu}_2\text{O}$  NWs. (f) Schematic of  $\text{Cu@Cu}_2\text{O}$  NWs showing {100} and  $\langle 110 \rangle$  orientations. (g) EDS elemental map of Cu and O. (h) EELS line scan showing Cu and O intensity profiles across the NW. (i) EELS spectra of Cu core and  $\text{Cu}_2\text{O}$  shell.

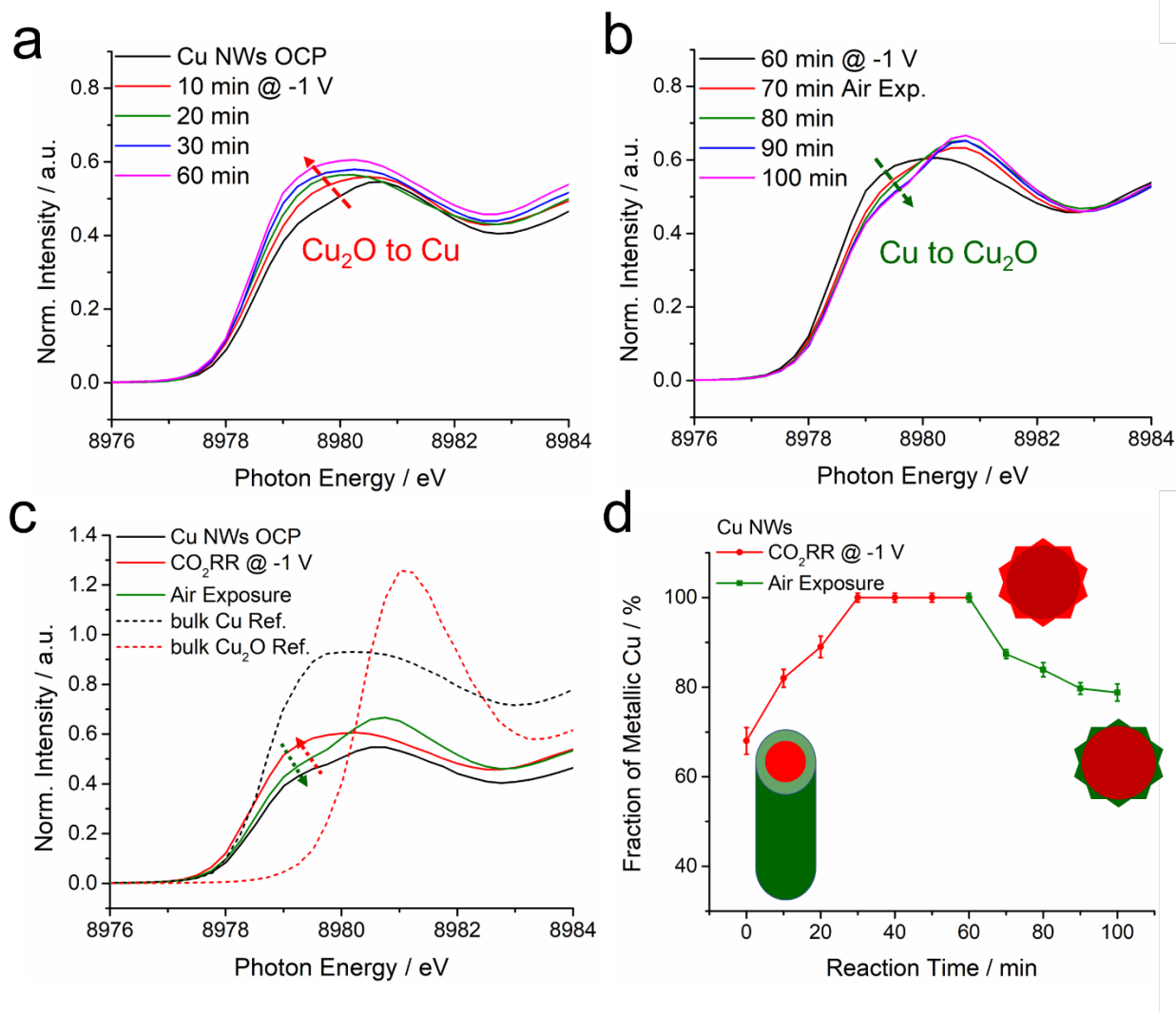
Selected atomic-scale STEM image and corresponding Fourier transform (FT) of metallic Cu core with near the  $[1\bar{1}0]$  zone axis. (f) Schematic showing the typical fivefold twinned structures with  $\{100\}$  side facets. (g-h) STEM-EELS composite mapping and corresponding EELS line profile of Cu@Cu<sub>2</sub>O NWs showing around 4 nm oxide shell. (l) EELS spectra of Cu L<sub>3,2</sub> edges showing the signatures of metallic Cu core in yellow and Cu<sub>2</sub>O shell in green.



**Figure 2. Operando EC-STEM images of dynamic evolution of Cu NWs.** (a-f) Nucleation of initial growth of Cu nanograins from metallic Cu NW core surrounded by the spongy Cu shell (Cu@Cu<sup>S</sup>) from 0 to 20 s with two Cu nanograin seeds in dashed boxes. (g-k) Significant Cu migration from Cu NWs to form Cu nanograins at adjacent locations from 24 to 40 s. (l) False-color overlay of STEM images acquired at 0 s (red) and after reaching steady-state structures at 120 s (green). The dashed arrows in Figs. f-i mark the non-uniform contrast caused by liquid flow.



**Figure 3. Operando electrochemical 4D-STEM in liquid with machine-learning assisted clustering analysis of Cu NWs derived nanograins.** (a-b) Operando HAADF-STEM image and the corresponding 4D-STEM clustering map of complex structures of Cu NWs. The false-color 4D-STEM map show of Cu@Cu<sup>S</sup> that the crystalline Cu NW core are surrounded by spongy (disordered) Cu shell. (d) Operando 4D-STEM clustering map of Cu NWs derived polycrystalline metallic Cu nanograins with selected three Cu nanograins (e-g) for analysis of nanograin boundaries. (e-g) Cu nanograins and corresponding electron diffraction patterns in red, blue and orange regions showing different crystal orientations across grain boundaries.



**Figure 4. Operando high-energy-resolution X-ray absorption spectroscopy studies of dynamic evolution of Cu NWs.** (a) Operando HERFD XANES pre-edge spectra of Cu@Cu<sub>2</sub>O NWs at the OCP and under steady-state CO<sub>2</sub>RR at -1.0 V vs. RHE. Dashed red arrows suggest the progressive increase in pre-edge intensity and negative shift in edge energy values, corresponding to the electroreduction of Cu@Cu<sub>2</sub>O NWs to metallic Cu nanograins. (b) Ex situ HERFD XANES pre-edge spectra show the partial surface reoxidation of Cu nanograins under post-electrolysis air exposure. (c) Selected XANES spectra of Cu@Cu<sub>2</sub>O NWs at the OCP, under the CO<sub>2</sub>RR and upon air exposure when compared to bulk Cu and Cu<sub>2</sub>O references. (d) Quantitative analysis of the relative fraction of metallic Cu and simplified schematic showing the electroreduction from Cu@Cu<sub>2</sub>O NWs, respectively, to fully metallic Cu nanograins followed by subsequent partial oxidation of surface Cu.

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## Notes

The authors declare no competing financial interests.

## Supplementary Information:

Experimental section (synthesis, CO<sub>2</sub>RR performance test, *operando* EC-STEM, *operando* HERFD XAS, 4D-STEM clustering and FEM analysis); Figures S1-S22 (*operando* EC- and 4D-STEM, *ex situ* S/TEM analysis and CO<sub>2</sub>RR performance); Figure S23-S28 (*operando* HERFD XAS).

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