

**Atomic-scale Secondary Electron Imaging for  
Heterogeneous Catalysis Research**

Journal:	<i>Catalysis Science &amp; Technology</i>
Manuscript ID	CY-REV-12-2024-001551.R1
Article Type:	Review Article
Date Submitted by the Author:	28-Feb-2025
Complete List of Authors:	Hwang, Sooyeon; Brookhaven National Laboratory, Center for Functional Nanomaterials Yang, Judith; University of Pittsburgh, Department of Chemical and Petroleum Engineering; Brookhaven National Laboratory; University of Pittsburgh, Department of Physics

## 1 **Atomic-scale Secondary Electron Imaging for Heterogeneous Catalysis Research**

2 Sooyeon Hwang\*, Judith C. Yang

3 Center for Functional Nanomaterials, Brookhaven National Laboratory, Upton, New York 11973

4

5 Characterizing the surface at the atomic scale is essential for understanding the catalytic properties  
6 of supported metal nanoparticles. Secondary electron (SE) imaging in scanning transmission  
7 electron microscopy (STEM) provides three-dimensional surface topographic information,  
8 enabling the characterization of the size, morphology, and distribution of supported nanoparticles.  
9 Furthermore, real-time observation of catalyst materials in a gaseous environment enhances our  
10 understanding of catalyst dynamics under operational conditions. Ongoing technical developments  
11 in SE-STEM, along with advancements in computational methods, are expected to facilitate  
12 atomic-scale surface observations and enable more quantitative and statistical analyses. This  
13 progress will not only elucidate fundamental mechanisms at the atomic level but also provide  
14 comprehensive and universal insights into catalyst performance. This minireview showcases the  
15 recent advancements and research findings in surface-sensitive SE imaging in STEM for the  
16 characterization of active catalyst materials.

17

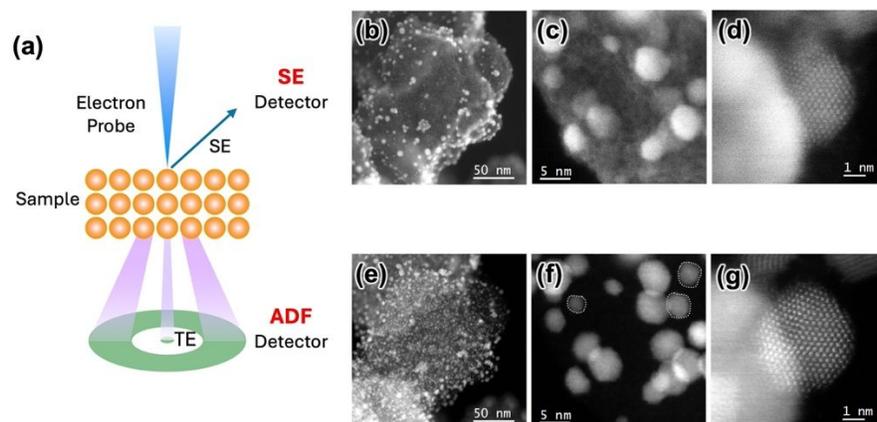
18 \*Corresponding author: soohwang@bnl.gov

## 1 **Introduction**

2 Catalysis plays a key role in academic research and industry, with widespread applications in  
3 everyday life. Nearly all chemical products are synthesized through at least one catalytic step,  
4 highlighting its significant impact on modern society.<sup>1, 2</sup> Moreover, catalysis holds great promise  
5 for advancing sustainable energy solutions by contributing to energy production, storage,  
6 transportation, and enhancing energy efficiency.<sup>3-5</sup> Heterogeneous catalysts, which are in different  
7 phases from the reaction mixture, dominate the various applications including polymer industry;  
8 coal, oil and gas refining; manufacturing chemicals; environmental applications; and  
9 electrochemical energy conversion and storage devices.<sup>6-8</sup> Most heterogeneous catalysts are  
10 supported metal nanomaterials, where active metals are finely distributed on a support with a high  
11 surface area. The active metal component generally has specific active sites on its surface where  
12 catalytic reaction occurs. Therefore, reducing the size of active metal to nanoscale or even to  
13 atomic clusters have proven to be an effective strategy to maximize the number of active sites and  
14 boost performance of catalyst.<sup>9-12</sup>

15 To enhance catalyst performance through particle downsizing and surface engineering, the  
16 utilization of advanced characterization tools is essential for verifying structural features. Electron  
17 microscopy has successfully served to image catalysts at small scales. Scanning electron  
18 microscopy (SEM) has been extensively used for decades as a primary technique for examining  
19 morphology of catalysts.<sup>13-17</sup> Transmission electron microscopy (TEM) and scanning transmission  
20 electron microscopy (STEM), have provided valuable insights into not only about particle size and  
21 shape but also the lattice structures.<sup>18-22</sup> The development of aberration correctors has further  
22 enhanced the spatial resolution of S/TEM, making atomic-resolution imaging routine.<sup>23-26</sup> Despite  
23 their widespread use, neither SEM nor S/TEM offers a complete solution for characterizing  
24 catalyst structures. While SEM provides three-dimensional (3D) structure information via surface  
25 topography, the primary limitation lies in its spatial resolution, typically constrained to the  
26 nanometer scale. In contrast, S/TEM offers sub-angstrom spatial resolution with aberration-  
27 correction. However, the resulting images are two-dimensional projections, indicating that S/TEM  
28 captures only a partial view of the 3D structure of the catalyst/support system. In addition, the  
29 minimal surface sensitivity of S/TEM suggests that critical surface features relevant to catalysis  
30 may not be captured, potentially limiting its applicability in accessing the catalyst's performance.

1 Electron tomography using S/TEM has enabled the reconstruction of 3D structures in materials at  
 2 high resolution, but the acquisition of tilt series and following image reconstruction typically  
 3 requires more than hours, which poses a challenge for capturing time-resolved information.<sup>27, 28</sup>  
 4 Considering the similar electron probe scanning mechanism in both SEM and STEM, introducing  
 5 surface sensitivity into STEM could be ideal for investigating surface topography as well as the  
 6 overall material at atomic resolution without sacrificing time resolution. This minireview will  
 7 briefly introduce the concept of integrating SEM imaging with advanced STEM, highlighting  
 8 examples of this technique applied to catalyst studies. The goal is to offer researchers in the  
 9 catalysis field valuable insights into the cutting-edge electron microscopy methods, inspiring their  
 10 application to future catalysis studies.



11  
 12 *Figure 1. (a) Schematic representation of secondary electron (SE) and annular dark field (ADF) imaging techniques. Platinum*  
 13 *nanoparticles on a carbon support are shown in (b-d) as SE images, and in (e-g) as high-angle annular dark field scanning*  
 14 *transmission electron microscopy (HAADF-STEM) images of the same region at different magnifications. The particles marked in*  
 15 *(f) are absent in (c), indicating that they are likely subsurface and not exposed on the surface.*

16

## 17 SE imaging in STEM

18 When an electron beam interacts with a specimen, a variety of signals are emitted from the  
 19 specimen, including secondary electrons (SE).<sup>29</sup> SEs are generated through the inelastic scattering,  
 20 typically with energies less than 50 eV. Only SEs near the surface can escape, make them  
 21 detectable. The escape depth of the SEs from metals is about 0.5-1.5 nm, while for insulators, it  
 22 ranges from 10 to 20 nm.<sup>30</sup> Due to the limited escape depth of SEs, they are highly surface-sensitive  
 23 and they serve as the primary source for SEM imaging to display surface topography.<sup>31</sup>

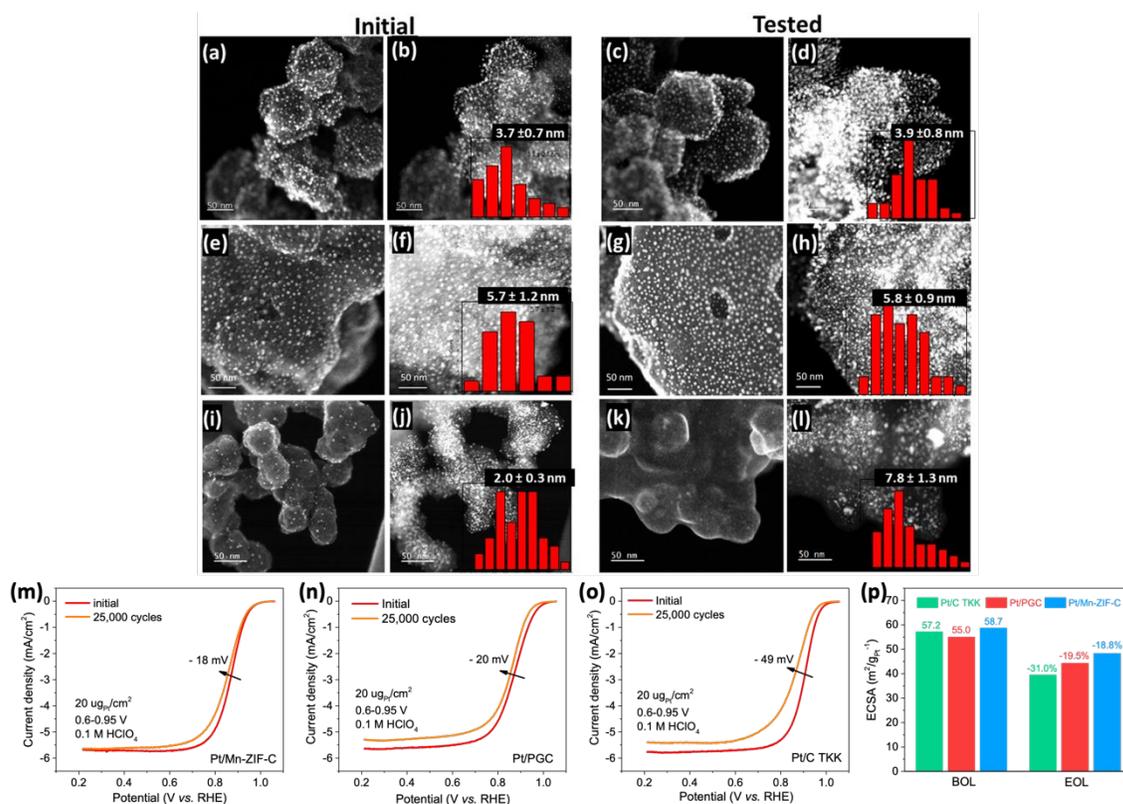
1 SE imaging has been successfully demonstrated by incorporating a SE detector within the STEM,<sup>32</sup>  
2 providing topographic information of supported particles and particle data for catalysis with sub-  
3 nanometer spatial resolution.<sup>33-35</sup> A pioneering achievement was reported by Zhu *et al.*, showcased  
4 atomic resolution SE imaging enabled by aberration-corrected electron probe.<sup>36</sup> They positioned  
5 the SE detector above the sample, while an annular dark field detector (ADF) for general STEM  
6 imaging was placed below the sample to capture electrons transmitted through it (Figure 1a),  
7 enabling simultaneous SE and ADF-STEM imaging. Theoretical and experimental demonstration  
8 of atomic resolution SE imaging have been conducted,<sup>37-42</sup> and the field of catalysis has benefitted  
9 from this imaging technique in the following ways.

10

### 11 **SE imaging in STEM for Catalysts**

12 Figure 1(b-d) and (e-g) present SE images and high-angle annular dark-field STEM (HAADF-  
13 STEM) images, respectively, acquired from the same areas of Pt/C catalysts at various  
14 magnifications using aberration-corrected STEM with a SE detector (Hitachi HD2700C) at an  
15 accelerating voltage of 200 kV. SE images exhibit 3D structure of carbon support (Figure 1b),  
16 particularly surface pores (Figure 1c). Certain Pt particles in the HAADF-STEM image (outlined  
17 with dotted lines in Figure 1f) are absent in the corresponding SE image (Figure 1c), suggesting  
18 these marked Pt particles are not exposed on the surface facing the SE detector. Notably, atomic  
19 resolution is also achieved in SE (Figure 1d). A set of SE and HAADF-STEM images was utilized  
20 to determine the location of Pt diesel oxidation catalysts supported by mesoporous silica SBA-15,  
21 revealing that highly dispersed Pt particles remained confined within the pores after aging in air at  
22 800 °C for 5 hours.<sup>43</sup> The image pair also elucidated the distribution of PtCo nanoparticles across  
23 both the internal and external surfaces of Ketjenblack carbon or NH<sub>2</sub>-modified Ketjenblack for  
24 oxygen reduction reaction (ORR).<sup>44</sup> Chen *et. al.* took advantage of the SE and STEM imaging to  
25 investigate the degradation mechanisms of high-content (40 wt. %) Pt/C catalysts in ORR cathode  
26 for heavy duty fuel cells.<sup>45</sup> Pt catalysts were supported on three different carbon-based supports,  
27 such as carbon derived from Mn-doped zeolitic imidazolate frameworks (Mn-N-C), highly  
28 graphitized porous graphitic carbon (PGC), and commercial TKK high-surface-area carbon.  
29 Figure 2 shows a set of SE and medium-angle annular dark field (MAADF)-STEM images  
30 acquired at the beginning of life and after accelerated stress test (AST, cycling potentials from 0.6

1 to 0.95 V vs RHE for 25,000 cycles). The Pt nanoparticles remain well-dispersed and stable in size  
 2 on Mn-N-C and PGC supports, whereas significant agglomeration and detachment from the  
 3 surface are observed on the commercial TKK support after the AST, highlighting the critical role  
 4 of support materials in mitigating catalyst degradation during operation. Figures 2(m)-(o) show  
 5 the polarization curves before and after the durability test, which involved 25,000 cycles between  
 6 0.6 to 0.95 V vs. RHE. Both the Pt/Mn-N-C and Pt/PGC catalysts exhibited minimal kinetic  
 7 activity loss, with  $\Delta E_{1/2}$  less than 20 mV, while the commercial Pt/TKK catalysts showed a 49 mV  
 8 loss. The electrochemical surface area (ECSA) of all three catalysts was also compared before and  
 9 after the durability test, revealing a significantly higher loss in ECSAs for the TKK catalyst. This  
 10 demonstrates the inferior durability of the commercial catalyst, consistent with the electron  
 11 microscopy observations. Identical location SE and HAADF-STEM measurements, where the  
 12 same specific region of a specimen is imaged before and after the reaction, was utilized to assess  
 13 changes in Pt and PtCo catalysts for ORR, in which liquid electrolyte was used during different  
 14 stages of electrochemical cycling.<sup>46</sup>

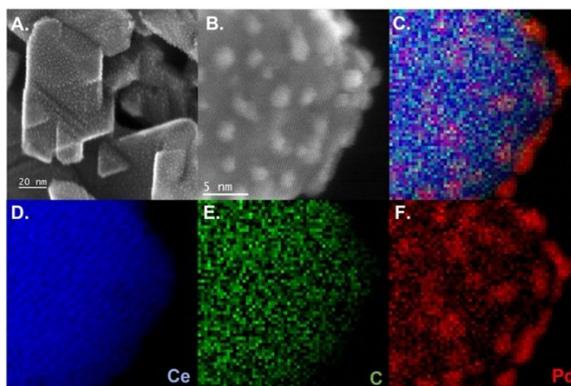


15

16 *Figure 2. Two electron microscopy techniques, SE (a), (c), (e), (g), (i), and (k) and ADF-STEM (b), (d), (f), (h), (j), and (l) images,*  
 17 *were used to analyze the morphology and nanostructure changes of three studied Pt (40. Wt%) catalysts before and after stability*

1 *AST. (a)–(d) the Pt (40. Wt%)/Mn–N–C catalyst before (a), (b) and after (c), (d) the AST. (e)–(h) the Pt (40 wt%)/PGC catalyst*  
 2 *before (e), (f) and after (g), (h) the AST. (i)–(l) the TKK (40 wt% Pt/C) before (i), (j) and after (k), (l) the AST. The inserts are the*  
 3 *size distribution of Pt NPs for each Pt/C catalyst before and after the stability AST. (m)–(o) Polarization curves before and after*  
 4 *potential cycling tests for the corresponding Pt/Mn–N–C, Pt/PGC, and Pt/C TKK. (p) Electrochemical surface area of three*  
 5 *catalysts before and after durability test.<sup>45</sup> Reproduced with permission. Copyright 2022, IOP Publishing, Ltd.*

6 STEM images are generally acquired using a HAADF detector, which generates images with  
 7 strong Z-contrast.<sup>47</sup> (intensity  $\sim Z^2$ , Z: atomic number) If the catalyst consists of metals with  
 8 relatively low atomic numbers and the support contains elements with higher Z, or if both the metal  
 9 and support have similar atomic numbers, distinguishing the metal phase using HAADF-STEM  
 10 becomes less straightforward. For example, in the case of palladium ( $Z_{\text{Pd}}$ : 46) catalysts supported  
 11 on ceria ( $Z_{\text{Ce}}$ : 58), complementary spectroscopy techniques are necessary to confirm the presence  
 12 of Pd-based species along with HAADF-STEM or TEM images.<sup>48–50</sup> In contrast, SE imaging offers  
 13 a clear presentation of the catalyst's surface topography, providing structural information that  
 14 complements the Z-contrast of HAADF-STEM. Figure 3a and b show SE images of Pd-based  
 15 catalysts used in the methane-to-methanol conversion reaction, supported on CeO<sub>2</sub> with interfacial  
 16 carbon layer.<sup>51</sup> The presence of metallic nanoparticles on the surface of support is distinctly  
 17 observed, and elemental maps (Figure 3c-f) acquired from electron energy loss spectroscopy  
 18 (EELS) confirms that the nanoparticles consist of Pd, while the support material is composed of  
 19 Ce. It is noteworthy that SE imaging is also compatible with spectroscopy techniques, such as  
 20 EELS and energy dispersive X-ray spectroscopy (EDS).



21  
 22 *Figure 3. (A, B) SE-STEM imaging of the Pd-interfacial carbon layer on CeO<sub>2</sub> catalyst for the methane-to-methanol conversion*  
 23 *reaction. (C) A combined elemental map generated using STEM-EELS, alongside individual elemental maps for Ce, C, and Pd in*  
 24 *(D-F), respectively, obtained from the region highlighted in (B),<sup>51</sup> licensed under CC-BY 4.0.*

25

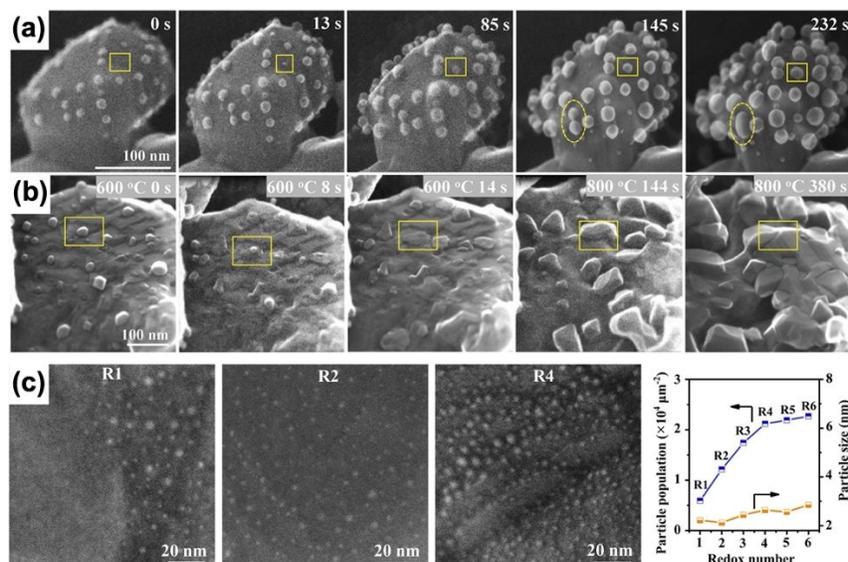
26

## 1 **In situ SE imaging**

2 Postmortem analysis, conducted after catalyst synthesis or catalytic reactions, may present  
3 challenges in elucidating the material changes that occur during the reactions of interest. S/TEM  
4 fortunately provides insights not only into the static structural and compositional states but also  
5 into the dynamic evolution of materials under external stimuli, such as temperature variations  
6 (heating/cooling), electrical biasing, or *in situ* conditions within controlled environments (e.g., gas  
7 phases).<sup>52, 53</sup> In the case of catalysts under gaseous conditions, SE imaging can be a powerful  
8 technique for tracking the three dimensional evolution of catalysts *in situ* on environmental S/TEM  
9 (E-S/TEM). E-S/TEM enables the introduction of a gas environment around the specimen while  
10 maintaining vacuum integrity in the gun area through an additional differential pumping system.  
11 Using specimen holders equipped with heating capabilities allows for increasing temperature of  
12 the specimen, thereby facilitating the simulation of specific reaction conditions. The following are  
13 exemplary studies of *in situ* environmental SE imaging, which elucidates the structural changes of  
14 the catalysts under gaseous conditions to correlate these changes with their performance.

15 Environmental SE/STEM imaging has provided insights into the activation process of Ni-based  
16 catalyst on  $\gamma$ -Mo<sub>2</sub>N for CO<sub>2</sub> hydrogenation.<sup>54</sup> A series of SE images, acquired in the flow of H<sub>2</sub>/N<sub>2</sub>  
17 at a ratio of 3:1 and elevated temperatures (400 °C and 520 °C), revealed that the pre-synthesized  
18 4 nm Ni particles undergoes reverse sintering, forming under-coordinated Ni clusters due to a  
19 strong interaction with  $\gamma$ -Mo<sub>2</sub>N. This reverse sintering phenomena enhances chemoselective  
20 hydrogenation of CO<sub>2</sub> to CO, improving catalytic performance.

21 The structural evolution of Pt nanoparticles supported on carbon was systematically investigated  
22 under controlled gaseous environments (O<sub>2</sub>, H<sub>2</sub>O, and H<sub>2</sub> at  $\sim 10^{-2}$  Pa) and varying temperatures to  
23 elucidate catalyst deactivation mechanisms.<sup>55</sup> *In situ* environmental SE imaging revealed that Pt  
24 nanoparticles exhibited both lateral mobility across the carbon support and penetration through it,  
25 with these dynamics being most pronounced under oxygen exposure. *In situ* SE imaging further  
26 demonstrated degradation of the carbon support, characterized by trench formation in O<sub>2</sub> and H<sub>2</sub>,  
27 likely due to erosion processes. This study revealed that multiple interrelated processes contribute  
28 to the observed transformations in supported catalysts when exposed to stimuli, including  
29 temperature fluctuations and variations in the gas-phase environment.



1  
2 *Figure 4.*(a) SE images of a typical area of Co-doped  $\text{Sr}_2\text{Fe}_{1.5}\text{Mo}_{0.5}\text{O}_{6-\delta}$  (SFMC) in 10 Pa of  $\text{H}_2$  supplied at 800 °C and (b) SE  
3 images of a SFMC area with 10 Pa of  $\text{O}_2$  supplied at 600 °C for 22 s, then increasing from 600 to 800 °C with a heating rate of  
4  $5\text{ }^\circ\text{C s}^{-1}$  and then stay at 800 °C. Time begins after supplying  $\text{O}_2$  toward the sample.<sup>56</sup> Reproduced with permission. Copyright  
5 2020, John Wiley and Sons. (c) Ex situ SE images of  $\text{Sr}_2\text{Fe}_{1.4}\text{Ru}_{0.1}\text{Mo}_{0.5}\text{O}_{6-\delta}$  (SFRuM) after 1<sup>st</sup>, 2<sup>nd</sup> and 4<sup>th</sup> reduction. Population  
6 and size distribution of metal nanoparticles exsolved after different redox manipulations,<sup>57</sup> licensed under CC-BY 4.0.

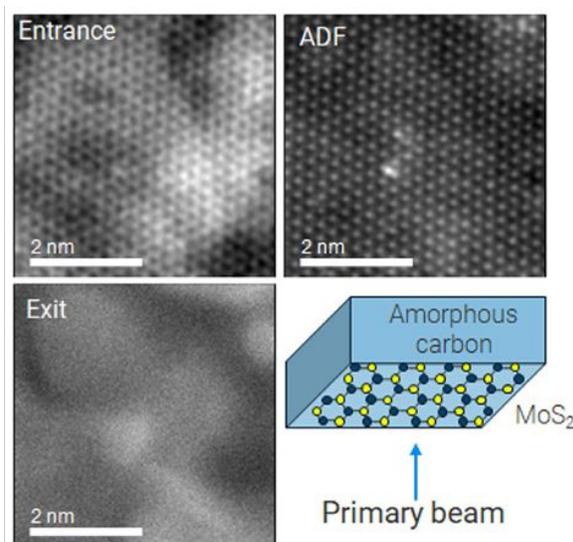
7 Solid oxide electrolysis cells (SOECs) for  $\text{CO}_2$  electrolysis offer an effective means of converting  
8 renewable electrical energy into chemical energy, stored in the form of  $\text{CO}$ .<sup>58</sup> To improve the  
9 efficacy of  $\text{CO}_2$  electrolysis, a novel catalyst design has been proposed, involving the dispersion  
10 of abundant metallic nanoparticles on the surface of perovskite materials.<sup>59, 60</sup> Understanding the  
11 formation mechanisms of these metal nanoparticles during redox reactions on the perovskite  
12 surface is essential for optimizing catalytic activity and enhancing reversibility, thereby enabling  
13 the design of highly efficient and regenerative metal-oxide interfaces for  $\text{CO}_2$  electrolysis. SE  
14 imaging conducted under reducing and oxidizing conditions has revealed structural evolutions  
15 associated with the reversible exsolution and dissolution of metal particles within the perovskite  
16 matrix. Lv *et al.*<sup>56</sup> observed the emergence of CoFe alloy nanoparticles in a Co-doped  
17  $\text{Sr}_2\text{Fe}_{1.5}\text{Mo}_{0.5}\text{O}_{6-\delta}$  (SFMC) under a reducing environment of 10 Pa of  $\text{H}_2$  at 800 °C, accompanied  
18 by a phase transformation from a double perovskite to layered perovskite (Figure 4a). Under an  
19 oxidizing condition with 10 Pa of  $\text{O}_2$  (Figure 4b), these CoFe alloy nanoparticles were initially  
20 converted into flaky, irregular shaped  $\text{CoFeO}_x$  particles that adhered to the SFMC surface at 600  
21 °C. Upon further heating to 800 °C, the  $\text{CoFeO}_x$  particles fully reverted to the perovskite phase,  
22 completing a phase transition that ultimately restores the original double perovskite structure.  
23 SFMC decorated with CoFe alloy nanoparticles exhibited enhanced  $\text{CO}_2$  electrolysis performance

1 and stability than SFMC itself. Notably, their electrochemical performance was recoverable over  
2 12 redox cycles, demonstrating the regenerative capability of the CoFe alloy nanoparticles. The  
3 same group also developed a strategy to promote exsolution of RuFe alloy nanoparticles on  
4  $\text{Sr}_2\text{Fe}_{1.4}\text{Ru}_{0.1}\text{Mo}_{0.5}\text{O}_{6-\delta}$  (SFRuM) perovskite, providing abundant metal/oxide active interfaces for  
5  $\text{CO}_2$  electrolysis.<sup>57</sup> *In situ* environmental SE imaging combined with chemical analyses using EDS  
6 and EELS revealed atomic-scale dynamics of RuFe alloy nanoparticle exsolution and dissolution  
7 on SFRuM surface. Repeated redox cycles at 600–850 °C under 10 Pa  $\text{H}_2$  or  $\text{O}_2$  induced Ru  
8 enrichment on the SFRuM surface, promoting the exsolution of RuFe alloy nanoparticles.  
9 Following four redox cycles, the nanoparticle density increased by approximately 3.6-fold  
10 compared to the initial reduction treatment (Figure 4c), while the nanoparticle size remained  
11 unchanged. Subsequent  $\text{CO}_2$  electrolysis performance tests revealed that the current density  
12 progressively improved with each reduction cycle, culminating after four redox manipulations,  
13 thereby highlighting a clear structure-activity relationship.

14

## 15 **Current Challenges and Future Outlook**

16 Although most modern TEM provides the STEM mode and there are dedicated STEM instruments  
17 available, not all of them are equipped with the SE detector. Consequently, SE imaging in STEM  
18 may not be widely accessible. However, it is commercially available and undergoing development.  
19 Japanese microscope manufacturers, such as JEOL and Hitachi, provide SE detectors as an  
20 optional feature for their S/TEM systems.<sup>36, 41</sup> Hitachi has developed instrumentation for *in situ*  
21 SE and ADF-STEM imaging in gaseous environments.<sup>61-63</sup> Bruker, formerly known as Nion,  
22 reported development of SE detector and atomic resolution SE imaging within a 30-200 keV  
23 aberration-corrected, monochromated, ultra-high-vacuum (UHV) STEM.<sup>64</sup> The advantages of this  
24 system for SE imaging include higher scattering cross-sections of SE at a typical SEM operating  
25 voltage of 30 keV, reduced knock-on radiation damage, and the clean UHV environment ( $10^{-9}$   
26 torr), all contributing to optimized conditions for high-resolution, surface-sensitive imaging.  
27 Bruker also introduced advanced instrumentation developments, including dual SE detectors  
28 positioned both below and above the specimen to enable simultaneous imaging of both surface  
29 layers (Figure 5), as well as the integration of laser optics, which allows for surface cleaning  
30 through localized heating.<sup>65, 66</sup>



1  
2 *Figure 5. SE images from dual SE detectors above and below the specimen. MoS<sub>2</sub> monolayer on a carbon film visible in the entrance*  
3 *but not exist SE signal, demonstrating the ability to image Å-scale features on the surface of a bulk sample. (Results from Bruker,*  
4 *formerly Nion).<sup>67</sup>*

5 Real time observation of catalysis requires specific reaction conditions, such as high temperatures  
6 or certain environment. For instance, SE images shown in Figure 4 were acquired at 600 and 800  
7 °C under 10 Pa of oxygen gas. While the temperature dependency of SE emission has been  
8 reported, those studies were conducted within a limited temperature range (up to 500 K in  
9 simulation).<sup>68, 69</sup> The effect of temperature on SE emission and consequently, SE imaging has not  
10 been fully explored across broader temperature range relevant to catalysis. To accurately analyze  
11 images under different conditions, quantification of SE signals at varying temperatures will be  
12 necessary. To achieve a higher gas pressure around the specimen than that used in ETEM or a  
13 liquid environment, a closed cell system with hermetically sealed silicon nitride viewing windows  
14 at both the top and bottom has been employed for *in situ* S/TEM studies.<sup>52</sup> The presence of the top  
15 window unfortunately obstructs the detection of SE signals emitted from the specimen, imposing  
16 a fundamental limitation for SE imaging. A specialized specimen holder design, allowing SEs to  
17 escape from the specimen while maintaining the integrity of the surrounding environment, would  
18 be essential for *in situ* SE studies within closed cell systems. One possibility is to modify the top  
19 window by creating micron-sized holes to enable the escape of SEs and conduct experiments using  
20 environmental STEM. This approach would provide additional differential pumping to maintain  
21 vacuum integrity despite the gas flow from the holes in the window.

1 SE imaging in STEM is still an emerging field with substantial potential for further development.  
2 While atomic-resolution SE imaging has been demonstrated (Figure 1d), its application has so far  
3 been primarily limited to visualizing the morphology of catalysts. There remains significant  
4 untapped potential to leverage the unprecedented spatial resolution of SE imaging for broader  
5 applications. One key aspect involves bridging the gap between surface science and electron  
6 microscopy, facilitating the acquisition of more comprehensive, multimodal information on the  
7 specimen in its operational state. While scanning tunneling microscopy (STM), which is surface  
8 sensitive imaging technique, has offered valuable insights into catalytic reaction mechanisms at  
9 the atomic scale,<sup>70, 71</sup> its reliance on atomically flat surfaces can limit its applicability to the more  
10 complex, heterogeneous surfaces typical of real-world catalysts. In contrast, SE imaging in  
11 aberration-corrected STEM provides detailed surface structural information at the atomic level,<sup>40</sup>  
12 while conventional STEM imaging offers an overall view of the specimen. Additionally, STEM  
13 enables elemental and chemical analysis through spectroscopic techniques such as EELS and EDS,  
14 offering atomic-level insights into structure, composition, and chemical bonding.<sup>26, 72, 73</sup>

15 The rapid advancements in computational science, particularly in artificial intelligence, deep  
16 learning, and machine learning, have the potential to significantly enhance image-based  
17 information retrieval and improve the efficiency of data acquisition. Although SE images provide  
18 topographic information, 3D surface reconstruction algorithms for SEM images have proposed to  
19 generate more informative and qualitative 3D visualizations,<sup>71, 74</sup> which SE images acquired from  
20 STEM could also benefit from. In addition, a deep learning-assisted method has been developed  
21 for the automated analysis of large STEM image datasets.<sup>75, 76</sup> Pt/Co alloy nanoparticles supported  
22 on a porous substrate were efficiently quantified both in their pristine state and following fuel cell  
23 cycling.<sup>77</sup> SE images, whether acquired independently or simultaneously with STEM images, can  
24 leverage advanced quantitative analysis techniques for both ex situ and in situ data collection. This  
25 approach facilitates the comprehensive examination of various aspects of the specimen under  
26 diverse conditions, allowing for statistical quantification that enhances the correlation with real  
27 catalytic processes.

## 28 **Acknowledgement**

29 This research used Electron Microscopy Facilities the Center for Functional Nanomaterials (CFN), which  
30 is a U.S. Department of Energy Office of Science User Facility, at Brookhaven National Laboratory under

1 Contract No. DE-SC0012704. We appreciate Dr. Yimei Zhu for valuable discussions and prof. Gang Wu  
2 at Washington University in St. Louis for a Pt/C sample for figure 1.

3

#### 4 References

- 5 1. American Chemical Society., American Institute of Chemical Engineers., Chemical Manufacturers  
6 Association (U.S.), Council for Chemical Research (U.S.) and Synthetic Organic Chemical  
7 Manufacturers Association., *Technology vision 2020 : The U.S. chemical industry*, Dept. of  
8 Government Relations and Science Policy : American Chemical Society, Washington, DC, 1996.
- 9 2. X. J. Cui, W. Li, P. Ryabchuk, K. Junge and M. Beller, *Nature Catalysis*, 2018, **1**, 385-397.
- 10 3. A. Kumar, P. Daw and D. Milstein, *Chem Rev*, 2022, **122**, 385-441.
- 11 4. C. Descorme, P. Gallezot, C. Geantet and C. George, *Chemcatchem*, 2012, **4**, 1897-1906.
- 12 5. J. M. Thomas, *Chemsuschem*, 2014, **7**, 1801-1832.
- 13 6. J. Heveling, *J Chem Educ*, 2012, **89**, 1530-1536.
- 14 7. X. Jiang, X. W. Nie, X. W. Guo, C. S. Song and J. G. G. Chen, *Chem Rev*, 2020, **120**, 7984-8034.
- 15 8. A. Dokania, A. Ramirez, A. Bavykina and J. Gascon, *ACS Energy Letters*, 2019, **4**, 167-176.
- 16 9. Z. Xu, F. S. Xiao, S. K. Purnell, O. Alexeev, S. Kawi, S. E. Deutsch and B. C. Gates, *Nature*, 1994,  
17 **372**, 346-348.
- 18 10. A. A. Herzing, C. J. Kiely, A. F. Carley, P. Landon and G. J. Hutchings, *Science*, 2008, **321**, 1331-  
19 1335.
- 20 11. M. Turner, V. B. Golovko, O. P. H. Vaughan, P. Abdulkin, A. Berenguer-Murcia, M. S. Tikhov,  
21 B. F. G. Johnson and R. M. Lambert, *Nature*, 2008, **454**, 981-U931.
- 22 12. Y. Lei, F. Mehmood, S. Lee, J. Greeley, B. Lee, S. Seifert, R. E. Winans, J. W. Elam, R. J. Meyer,  
23 P. C. Redfern, D. Teschner, R. Schlögl, M. J. Pellin, L. A. Curtiss and S. Vajda, *Science*, 2010,  
24 **328**, 224-228.
- 25 13. A. K. Galwey, P. Gray, J. F. Griffiths and S. M. Hasko, *Nature*, 1985, **313**, 668-671.
- 26 14. M. Flytzani-Stephanopoulos, S. Wong and L. D. Schmidt, *Journal of Catalysis*, 1977, **49**, 51-82.
- 27 15. R. Aiello, J. E. Fiscus, H. C. zur Loye and M. D. Amiridis, *Appl Catal a-Gen*, 2000, **192**, 227-234.
- 28 16. G. C. Grunewald and R. S. Drago, *Journal of the American Chemical Society*, 1991, **113**, 1636-  
29 1639.
- 30 17. H. J. Kwon, D. S. Yang, M. S. Koo, S. M. Ji, J. Jeong, S. Oh, S. K. Kuk, H. S. Heo, D. J. Ham, M.  
31 Kim, H. Choi, J. M. Lee, J. W. Shur, W. J. Lee, C. O. Bin, N. Timofeev, H. Q. Wu, L. M. Wang,  
32 T. W. Lee, D. J. Jacob and H. C. Lee, *Nat Commun*, 2023, **14**, 520.
- 33 18. D. A. Jefferson, J. M. Thomas, G. R. Millward, K. Tsuno, A. Harriman and R. D. Brydson, *Nature*,  
34 1986, **323**, 428-431.
- 35 19. M. M. J. Treacy, A. Howie and C. J. Wilson, *Philos Mag A*, 1978, **38**, 569-585.
- 36 20. S. J. Pennycook, *J Microsc.*, 1981, **124**, 15-22.
- 37 21. M. H. Yao, D. J. Smith and A. K. Datye, *Ultramicroscopy*, 1993, **52**, 282-288.
- 38 22. P. D. Nellist and S. J. Pennycook, *Science*, 1996, **274**, 413-415.
- 39 23. Z. Y. Li, N. P. Young, M. Di Vece, S. Palomba, R. E. Palmer, A. L. Bleloch, B. C. Curley, R. L.  
40 Johnston, J. Jiang and J. Yuan, *Nature*, 2008, **451**, 46-48.
- 41 24. P. E. Batson, N. Dellby and O. L. Krivanek, *Nature*, 2002, **418**, 617-620.
- 42 25. J. Z. Li, M. J. Chen, D. A. Cullen, S. Hwang, M. Y. Wang, B. Y. Li, K. X. Liu, S. Karakalos, M.  
43 Lucero, H. G. Zhang, C. Lei, H. Xu, G. E. Sterbinsky, Z. X. Feng, D. Su, K. L. More, G. F. Wang,  
44 Z. B. Wang and G. Wu, *Nature Catalysis*, 2018, **1**, 935-945.
- 45 26. H. T. Chung, D. A. Cullen, D. Higgins, B. T. Sneed, E. F. Holby, K. L. More and P. Zelenay,  
46 *Science*, 2017, **357**, 479-483.

- 1 27. M. Weyland and P. A. Midgley, *Materials Today*, 2004, **7**, 32-40.  
2 28. W. Albrecht and S. Bals, *J Phys Chem C*, 2020, **124**, 27276-27286.  
3 29. D. B. Williams and C. B. Carter, *Transmission Electron Microscopy : A Textbook for Materials*  
4 *Science*, Springer US : Imprint: Springer,, New York, NY, 1st edn., 1996.  
5 30. H. Seiler, *J Appl Phys*, 1983, **54**, R1-R18.  
6 31. L. Reimer, *Scanning electron microscopy : physics of image formation and microanalysis*, Springer,  
7 Berlin ; New York, 2nd edn., 1998.  
8 32. D. Imeson, R. H. Milne, S. D. Berger and D. McMullan, *Ultramicroscopy*, 1985, **17**, 243-249.  
9 33. D. Imeson, *J Microsc.*, 1987, **147**, 65-74.  
10 34. A. L. Bleloch, A. Howie and R. H. Milne, *Ultramicroscopy*, 1989, **31**, 99-110.  
11 35. J. Liu and J. M. Cowley, *Ultramicroscopy*, 1991, **37**, 50-71.  
12 36. Y. Zhu, H. Inada, K. Nakamura and J. Wall, *Nat Mater*, 2009, **8**, 808-812.  
13 37. H. Inada, D. Su, R. F. Egerton, M. Konno, L. Wu, J. Ciston, J. Wall and Y. Zhu, *Ultramicroscopy*,  
14 2011, **111**, 865-876.  
15 38. L. J. Wu, R. F. Egerton and Y. M. Zhu, *Ultramicroscopy*, 2012, **123**, 66-73.  
16 39. H. G. Brown, A. J. D'Alfonso and L. J. Allen, *Phys Rev B*, 2013, **87**, 054102.  
17 40. J. Ciston, H. G. Brown, A. J. D'Alfonso, P. Koirala, C. Ophus, Y. Lin, Y. Suzuki, H. Inada, Y. Zhu,  
18 L. J. Allen and L. D. Marks, *Nat Commun*, 2015, **6**, 7358.  
19 41. D. R. G. Mitchell and G. Casillas, *Microscopy Today*, 2016, **24**, 22-27.  
20 42. S. Hwang, L. J. Wu, K. Kisslinger, J. Yang, R. Egerton and Y. Zhu, *Ultramicroscopy*, 2024, **261**,  
21 113967.  
22 43. H. N. Pham, J. Y. Howe, A. Ghosh, M. Melton, D. Kunwar, E. J. Peterson and A. K. Datye, *Microsc*  
23 *Microanal*, 2018, **24 (S1)**, 1700-1701.  
24 44. Q. Gong, H. Zhang, H. R. Yu, S. Jeon, Y. Ren, Z. Z. Yang, C. J. Sun, E. A. Stach, A. C. Foucher,  
25 Y. K. Yu, M. Smart, G. M. Filippelli, D. A. Cullen, P. Liu and J. Xie, *Matter*, 2023, **6**, 963-982.  
26 45. M. J. Chen, C. Z. Li, B. Z. Zhang, Y. C. Zeng, S. Karakalos, S. Hwang, J. Xie and G. Wu, *Journal*  
27 *of the Electrochemical Society*, 2022, **169**, 034510.  
28 46. H. Yu, M. J. Zachman, C. Li, L. Hu, N. N. Kariuki, R. Mukundan, J. Xie, K. C. Neyerlin, D. J.  
29 Myers and D. A. Cullen, *ACS Applied Materials & Interfaces*, 2022, **14**, 20418-20429.  
30 47. O. L. Krivanek, M. F. Chisholm, V. Nicolosi, T. J. Pennycook, G. J. Corbin, N. Dellby, M. F.  
31 Murfitt, C. S. Own, Z. S. Szilagy, M. P. Oxley, S. T. Pantelides and S. J. Pennycook, *Nature*, 2010,  
32 **464**, 571-574.  
33 48. E. M. Slavinskaya, R. V. Gulyaev, A. V. Zadesenets, O. A. Stonkus, V. I. Zaikovskii, Y. V. Shubin,  
34 S. V. Korenev and A. I. Boronin, *Applied Catalysis B-Environmental*, 2015, **166**, 91-103.  
35 49. V. Muravev, A. Parastayev, Y. van den Bosch, B. Ligt, N. Claes, S. Bals, N. Kosinov and E. J. M.  
36 Hensen, *Science*, 2023, **380**, 1174-1178.  
37 50. D. Gashnikova, F. Maurer, E. Sauter, S. Bernart, J. Jelic, P. Dolcet, C. B. Maliakkal, Y. M. Wang,  
38 C. Wöll, F. Studt, C. Kübel, M. Casapu and J. D. Grunwaldt, *Angewandte Chemie-International*  
39 *Edition*, 2024, **63**, e202408511.  
40 51. J. D. Jiménez, P. G. Lustemberg, M. Danielis, E. Fernández-Villanueva, S. Hwang, I. Waluyo, A.  
41 Hunt, D. Wierzbicki, J. Zhang, L. Qi, A. Trovarelli, J. A. Rodriguez, S. Colussi, M. V. Ganduglia-  
42 Pirovano and S. D. Senanayake, *Journal of the American Chemical Society*, 2024, **146**, 25986-  
43 25999.  
44 52. S. Hwang, X. B. Chen, G. W. Zhou and D. Su, *Advanced Energy Materials*, 2020, **10**, 1902105.  
45 53. H. Y. Chao, K. Venkatraman, S. Moniri, Y. J. Jiang, X. Tang, S. Dai, W. P. Gao, J. W. Miao and  
46 M. F. Chi, *Chem Rev*, 2023, **123**, 8347-8394.  
47 54. L. L. Lin, J. J. Liu, X. Liu, Z. R. Gao, N. Rui, S. Y. Yao, F. Zhang, M. L. Wang, C. Liu, L. L. Han,  
48 F. Yang, S. Zhang, X. D. Wen, S. D. Senanayake, Y. C. Wu, X. N. Li, J. A. Rodriguez and D. Ma,  
49 *Nat Commun*, 2021, **12**, 6978.  
50 55. S. Lee, K. Gadelrab, L. Cheng, J. P. Braaten, H. L. Wu and F. M. Ross, *ACS Nano*, 2024, **18**,  
51 21258-21267.

- 1 56. H. Lv, L. Lin, X. Zhang, Y. Song, H. Matsumoto, C. Zeng, N. Ta, W. Liu, D. Gao, G. Wang and  
2 X. Bao, *Advanced Materials*, 2020, **32**, 1906193.
- 3 57. H. Lv, L. Lin, X. Zhang, R. Li, Y. Song, H. Matsumoto, N. Ta, C. Zeng, Q. Fu, G. Wang and X.  
4 Bao, *Nat Commun*, 2021, **12**, 5665.
- 5 58. Y. F. Song, X. M. Zhang, K. Xie, G. X. Wang and X. H. Bao, *Advanced Materials*, 2019, **31**,  
6 1902033.
- 7 59. J. H. Myung, D. Neagu, D. N. Miller and J. T. S. Irvine, *Nature*, 2016, **537**, 528-531.
- 8 60. J. H. Kim, J. K. Kim, J. Liu, A. Curcio, J. S. Jang, I. D. Kim, F. Ciucci and W. Jung, *ACS Nano*,  
9 2021, **15**, 81-110.
- 10 61. H. Matsumoto, T. Sato, K. Nakano, T. Yaguchi, I. Nagaoki and Y. Nagakubo, *Microsc Microanal*,  
11 2013, **19**, 464.
- 12 62. H. Matsumoto, T. Sato, K. Igarashi, T. Hashimoto and H. Inada, *Microsc Microanal*, 2023, **29**,  
13 122-123.
- 14 63. H. Inada, H. Kikuchi, A. Hanawa, Y. Suzuki, M. Shirai and K. Nakamura, *Microsc Microanal*,  
15 2018, **24**, 318-319.
- 16 64. M. T. Hotz, J. Martis, T. Radlicka, N. J. Bacon, N. Dellby, T. C. Lovejoy, S. C. Quillin, H. Y.  
17 Hwang, P. Singh and O. L. Krivanek, *Microsc Microanal*, 2023, **29**, 2064-2065.
- 18 65. B. Plotkin-Swing, J. Martis, C. Su, M. T. Hotz, N. Dellby, T. Radlicka, O. L. Krivanek and T. C.  
19 Lovejoy, *Microsc Microanal*, 2024, **30**, 1480-1482.
- 20 66. J. Martis, B. Plotkin-Swing, B. Haas, T. Susi, M. T. Hotz, O. L. Krivanek, N. Dellby, A.  
21 Mittelberger, S. C. Quillin and T. C. Lovejoy, *Microsc Microanal*, 2024, **30**, 2182-2184.
- 22 67. Bruker, Atomic Resolution Imaging with Secondary Electrons Flyer,  
23 <https://www.bruker.com/en/products-and-solutions/microscopes/electron-microscopes.html>,  
24 (accessed Feb. 27, 2025).
- 25 68. P. Zhang, *Appl Phys a-Mater*, 2024, **130**, 37.
- 26 69. M. I. Khan, S. D. Lubner, D. F. Ogletree and C. Dames, *J Appl Phys*, 2018, **124**, 195104.
- 27 70. G. Kyriakou, M. B. Boucher, A. D. Jewell, E. A. Lewis, T. J. Lawton, A. E. Baber, H. L. Tierney,  
28 M. Flytzani-Stephanopoulos and E. C. H. Sykes, *Science*, 2012, **335**, 1209-1212.
- 29 71. L. Xu, K. G. Papanikolaou, B. A. J. Lechner, L. Je, G. A. Somorjai, M. Salmeron and M.  
30 Mavrikakis, *Science*, 2023, **380**, 70-76.
- 31 72. Y. Li, N. M. Adli, W. T. Shan, M. Y. Wang, M. J. Zachman, S. Hwang, H. Tabassum, S. Karakalos,  
32 Z. X. Feng, G. F. Wang, Y. C. Li and G. Wu, *Energy & Environmental Science*, 2022, **15**, 2108-  
33 2119.
- 34 73. Y. C. Zeng, J. S. Liang, C. Z. Li, Z. Qiao, B. Y. Li, S. Hwang, N. N. Kariuki, C. W. Chang, M. Y.  
35 Wang, M. Lyons, S. Lee, Z. X. Feng, G. F. Wang, J. Xie, D. A. Cullen, D. J. Myers and G. Wu,  
36 *Journal of the American Chemical Society*, 2023, **145**, 17643-17655.
- 37 74. A. P. Tafti, J. D. Holz, A. Baghaie, H. A. Owen, M. M. He and Z. Y. Yu, *Micron*, 2016, **87**, 33-45.
- 38 75. G. Roberts, S. Y. Haile, R. Sainju, D. J. Edwards, B. Hutchinson and Y. Y. Zhu, *Sci Rep-Uk*, 2019,  
39 **9**.
- 40 76. K. Lee, J. Park, S. Choi, Y. Lee, S. Lee, J. Jung, J. Y. Lee, F. Ullah, Z. Tahir, Y. S. Kim, G. H. Lee  
41 and K. Kim, *Nano Letters*, 2022, **22**, 4677-4685.
- 42 77. S. H. Yang, E. B. Park, S. Y. Cho, Y. S. Kang, H. A. Ju, Y. Jeon, D. Yang, S. D. Yim, S. Lee and  
43 Y. M. Kim, *Mater Today Energy*, 2023, **36**, 101348.

44

## **Data Availability Statement**

All data presented in this study are included in the main text (Figure 1). Additional data used to generate figures have been reproduced with permission from previously published sources.