Supporting information for

## A High Throughput Optical Method for Studying Compositional Effects in Electrocatalysts for CO<sub>2</sub> Reduction

Jeremy L. Hitt<sup>A+</sup>, Yuguang C. Li<sup>B+</sup>, Songsheng Tao<sup>C</sup>, Zhifei Yan<sup>A</sup>, Yue Gao<sup>D</sup>, Simon J. L. Billinge<sup>C,E</sup>, and Thomas E. Mallouk<sup>A</sup>\*

<sup>A</sup> Department of Chemistry, The University of Pennsylvania, Philadelphia, PA 19104

<sup>B</sup> Department of Chemistry, University at Buffalo, The State University of New York, Buffalo, New York 14260.

<sup>C</sup> Department of Applied Physics and Applied Mathematics, Columbia University, New York, NY 10027.

<sup>D</sup> Department of Mechanical Engineering, The Pennsylvania State University, University Park, PA 16802.

<sup>E</sup> Condensed Matter Physics and Materials Science Department, Brookhaven National Laboratory, Upton, NY 11973.

<sup>†</sup> These authors contributed equally.

**Video S1.** Screening results with an 8X9 array of Pt catalysts. The fluorescence color was observed simultaneous for all catalysts spot indifferent to the location and distant away from the reference electrode. It demonstrates that the iR drop for the experiment is negligible due to the small current. The video is played at 5X speed.

**Video S2.** Sample video for the screening of Au-Ag-Cu ternary alloy under  $CO_2$  and  $N_2$  condition. One can observe the clear hot zone under the screening; and the different on the fluorescence onset map between  $CO_2$  and  $N_2$  gas. The video is played at 5X speed.

Catalyst	Electrolyte	i	FE	Ref.
Au <sub>6</sub> Ag <sub>2</sub> Cu <sub>2</sub>	0.5 M KHCO3	-23 mA/cm <sup>2</sup> @ -0.7 V vs. RHE	80% CO	This work
Au <sub>4</sub> Zn <sub>3</sub> Cu <sub>3</sub>	0.5 M KHCO3	-25 mA/cm <sup>2</sup> @ -0.7 V vs. RHE	50% CO	This work
AgPd nanodendrite	0.05 M TMABF <sub>4</sub>	-10 mA/cm <sup>2</sup> @ -1.8 vs. SHE	85% CO	1
Ag <sub>57</sub> Cu <sub>43</sub> dendrite	0.5 M KHCO3	-25 mA/cm <sup>2</sup> @ -1.5 V vs. SCE	40% CO	2
	0.2 M KCI	-4 mA/cm <sup>2</sup> @ -1.2 V vs. RHE	2.5% CO	3
AgCu			35% C₂H₅OH	
			10% HCOO.	
			7% C <sub>2</sub> H <sub>4</sub>	
		-11 mA/cm <sup>2</sup> @ -1.05 vs. RHE	20% CO	4
Strain CuAg surface	0.05 M CsCO <sub>3</sub>		$10\% C_2H_5OH$	
			20% C <sub>2</sub> H <sub>4</sub>	
AgSn core-shell		-16 mA/cm <sup>2</sup> @ -0.8 V vs. RHE -4 mA/cm <sup>2</sup> @ -1 V vs. RHE -1.6 mA/cm <sup>2</sup> @ -0.77 V vs. RHE	80% HCOO	5
Agon core-siten			10% CO	5
Au. Pd.		$-4 \text{ mA/cm}^2 @ -1 \text{ V/vs} BHF$	5% HCOO	6
Au <sub>0.55</sub> 1 u <sub>0.45</sub>	0.1 W KHEO3	-4 MA/CM @ -1 V VS. RHE	40% CO	0
AuCu ordered	0.1 M KHCO <sub>3</sub>	-1.6 mA/cm <sup>2</sup> @ -0.77 V vs. RHE	80% CO	7
Au₃Cu	0.1 M KHCO₃	-3 mA/cm <sup>2</sup> @-0.7 V vs. RHE	65% CO	8
			3% HCOO	
Cuin nanoallov	0.1 M KHCO <sub>3</sub>	-1.5 mA/cm <sup>2</sup> @ -0.6 V vs. RHE	60% CO	9
cummunoundy			10% HCOO	
CuSn	0.1 M KHCO <sub>3</sub>	-1 mA/cm <sup>2</sup> @ -0.6 V vs. RHE	90% CO	10
Cu/SnO <sub>2</sub> Core/shell	0.5 M KHCO <sub>3</sub>	-10 mA/cm <sup>2</sup> @ -0.7 V vs. RHE	93% CO	11
Culn	0.1M KHCO3	-1 mA/cm <sup>2</sup> @ -0.6 V vs. RHE	90% CO	12
		$-4 \text{ mA/cm}^2 @ -1.1 \text{ V/vs} SCF$	16% CH₃OH	13
Cu <sub>63.9</sub> , tu <sub>36.1</sub>			12% C <sub>2</sub> H <sub>5</sub> OH	
Cu <sub>0.2</sub> Zn <sub>0.4</sub> Sn <sub>0.4</sub>	0.5 M NaHCO <sub>3</sub>	-5 mA/cm <sup>2</sup> @ -0.6 V vs. RHE	80% CO	14
Cu <sub>85</sub> Pt <sub>15</sub>	0.5 M KHCO <sub>3</sub>	-60 mA/mg @ -1.4 V vs. Ag/AgCl	30% CO	15
	0.1 M K₂SO₄ @ pH 4.5		35% CO	16
Ni₂Al		-12 mA/cm <sup>2</sup> @ -1.6 V vs.	1% CH₃OH	
1113/11		Ag/AgCl 1% HCOO 2% propan	1% HCOO	
			2% propanol	
Ni₅Ga₃	0.1 M Na2CO3	-15 mA/cm <sup>2</sup> @ -0.6 V vs. RHE	2.5 % CH <sub>4</sub>	
			1.5 % C <sub>2</sub> H <sub>6</sub>	17
			<1% C <sub>2</sub> H <sub>4</sub>	
Pd <sub>7</sub> Pt <sub>3</sub>	0.1 M KH <sub>2</sub> PO <sub>4</sub> / KHPO <sub>4</sub> , pH 6.7	-5 mA/cm <sup>2</sup> @ -0.4 V vs. RHE	88% HCOO	18
Pd <sub>7</sub> Cu <sub>3</sub>	0.1 M KHCO <sub>3</sub>	-1 mA/cm <sup>2</sup> @ -0.8 V vs. RHE	80% CO	19
Sn <sub>56.3</sub> Pb <sub>43.7</sub>	0.5 M KHCO <sub>3</sub>	-45 mA/cm <sup>2</sup> @ -2 V vs. Ag/AgCl	80% HCOO	20
MoS <sub>2</sub> edges	$EMIM^{+}:H_{2}O 96:4 mol\%$	-65 mA/cm <sup>2</sup> @ -0.764 V vs. RHE	98% CO	21

**Table S2.** Selected publications on multi-metallic catalysts for  $CO_2RR$ .



**Fig. S1**. Sample catalyst array with a) spots of different chemical composition, b) the ternary mapping geometry and c) the quaternary mapping geometry. Both the chemical compositions and the geometry of the array pattern can be re-programmed using the robotic plotter.



**Fig. S2**. Top view of an electrochemical cell for a ternary screening experiment. Counter and reference electrodes were Pt and Ag wires respectively. Copper foil was the current collector and wasinserted underneath the working electrode. The copper foil does not come into contact with the electrolyte during the screening experiment. Gas ( $CO_2$  or  $N_2$ ) flows in and out of the electrochemical cell through two fittings beneath the working electrode. The gas pressure was adjusted with a needle valve downstream to create a small positive pressure and form the three-phase-boundary layer. The housing material that comes into contact with the electrolyte is made from Teflon. The different layers are sealed with silicone gaskets and the cell is covered with a polyester film on top to isolate the working compartment from air. The hole in the polyester film is for electrolyte filling and it is sealed with transparent tape during screening experiments.



**Fig. S3.** X-ray diffraction patterns of a)  $Au_6Ag_2Cu_2$  and b)  $Au_4Zn_3Cu_3$  made with the large scale synthesis.



Fig. S4. Optical images of a)  $Au_6Ag_2Cu_2$  and b)  $Au_4Zn_3Cu_3$  on the carbon paper.



Fig. S5. Additional SEM images and EDS spectral maps of Au<sub>6</sub>Ag<sub>2</sub>Cu<sub>2</sub> with O and Cl signals.



Fig. S6. Additional SEM images and EDS spectral maps of  $Au_4Zn_3Cu_3$  with O and Cl signals.



**Fig S7.** EDS spectrum of  $Au_4Cu_3Zn_3$  alloy synthesized on Toray carbon paper by the procedure used in high-throughput screening. This spectrum gave an apparent composition of  $Au_{0.43}Cu_{0.41}Zn_{0.16}$ . Al, F, and some of the C signal come from the sample holder and carbon paper.



**Fig S8.** EDS spectrum of the  $Au_4Cu_3Zn_3$  target composition, synthesized by the bulk preparation method without carbon or Nafion and with a large amount of solvent. This spectrum gave an apparent composition of  $Au_{0.73}Cu_{0.20}Zn_{0.07}$ . Al and some of the C signal come from the sample holder.



**Fig S9.** Distributions of the composition percentage from EDS of each element in the Au<sub>4</sub>Cu<sub>3</sub>Zn<sub>3</sub> alloy with fitted Gaussian kernel density estimates. a) Large scale synthesis without carbon or Nafion was synthesized in a much more dilute concentration than b) which was made by the method used in high-throughput, catalyst screening. The average composition in a) is Au<sub>0.81</sub>Cu<sub>0.15</sub>Zn<sub>0.04</sub> and the average composition in b) is Au<sub>0.26</sub>Cu<sub>0.52</sub>Zn<sub>0.22</sub>.



**Fig S10.** Distributions of the composition percentage from EDS of each element with fitted Gaussian kernel density estimates for the  $Au_6Ag_2Cu_2$  alloy. The average composition in a) is  $Au_{0.44}Ag_{0.16}Cu_{0.4}$  and the average composition in b) is  $Au_{0.32}Ag_{0.19}Cu_{0.49}$ .



**Fig. S11**. XPS spectra in the Cu regions of a Au<sub>6</sub>Ag<sub>2</sub>Cu<sub>2</sub> catalyst. a) Expanded view of the Cu 2p region. b) Cu LMM region. The pure Cu LMM binding energy should be 568 eV, with narrower full width at half-maximum (FWHM). The Cu LMM maximum is shifted by ~2 eV and the FWHM is broad, and thus, a surface oxide is present. Cu<sup>2+</sup> photoemission spectra should have a strong satellite feature at around 943 eV, which is absent in (a). Thus, surface Cu is mostly present as the metal with a small amount of Cu<sup>+</sup>. Similar spectra were observed for the Au<sub>4</sub>Zn<sub>3</sub>Cu<sub>3</sub> catalyst.



**Fig. S12.** Histograms with fitted Gaussian kernel density estimates of elemental composition for a)  $Au_6Ag_2Cu_2$  and b)  $Au_4Zn_3Cu_3$  alloys measured by XPS. The composition of each measured spot is shown in c and d. The average composition of the *surface* measured by XPS is  $Au_{0.18}Ag_{0.34}Cu_{0.48}$  and  $Au_{0.03}Zn_{0.34}Cu_{0.63}$ .



**Fig. S13.** Screening results for Cu-Zn-In ternary catalysts under  $CO_2$ . The Cu vertex of the activity map dominates the catalytic performance of this ternary.



**Fig. S14.** Screening results for Cu-Sn-Zn ternary catalysts under  $N_2$  (left) and  $CO_2$  (right). Ternary compositions that are predominantly Cu and Zn have the lowest onset overpotential, but their onset overpotentials are higher than those of Au-containing ternaries.



**Fig. S15**. Calibration CV of the Ag wire pseudo-reference electrode. Ag wire was anodized in 1 M KCl solution and stored in saturated KCl when not in used. During calibration, Ag wire was used as the reference electrode and two Pt mesh electrodes was used as the counter and working electrodes. The same electrolyte was used as the screening experiment with the addition of the  $Fc/Fc^+$  redox couple. Ag wire was calibrated before each experiment and was consistent over the duration of the measurements.



**Fig. S16**. Electrochemical performance of the ternary catalysts in the screening electrolyte. Current density for a)  $Au_6Ag_2Cu_2$  and c)  $Au_4Zn_3Cu_3$ . Faradaic efficiency for b)  $Au_6Ag_2Cu_2$  and d)  $Au_4Zn_3Cu_3$ . All data were collected in ionic liquid electrolytes (1 M EMIM<sup>+</sup> and 0.5 M DI H<sub>2</sub>O mixture in acetonitrile). Linear sweep voltammetry was collected at 20 mV/s and Faradaic efficiency was calculated from the potentiostatic experiments by analyzing the gas output. Error bars show the standard deviation of three replicate experiments and points mark the mean value.



**Fig. S17.** A plot of the onset potential from the screening experiment (Fig 3) vs. the current density at -0.8 V vs. RHE, measured in the H-cell experiments (Fig 6) shows the correlation between the screening and testing results



**Fig. S18.** Representative CV traces at different scan rates of the alloyed catalysts for calculating the double layer capacitance. Scan rates were 5, 10, 25, 50, 75 and 100 mV/s for all the materials. The last graph shows a linear fit between the scan rate and the current density. All data were collected in 0.5 M KHCO<sub>3</sub> solution. The averaged values are shown in Table S3.

Materials	Capacitance (mF)	Std (mF)
Au	1.4	0.2
Au <sub>7</sub> Cu <sub>3</sub>	2.4	0.8
$Au_6Ag_2Cu_2$	3.3	0.5
Au₄Zn₃Cu₃	2.5	0.9

Table S3. Double layer capacitance values of the different alloyed catalysts.



**Fig. S19.** The comparison between the fits of three models for PDFs of the sample (a)  $Au_4Zn_3Cu_3$  (b)  $Au_6Ag_2Cu_2$ . The " $R_w$ " is the goodness of the fit. The name of each model is annotated at the right of the curves. The "one-psize" model is the fcc alloy crystal PDF attenuated by a spherical characteristic function. The "two-psize" model is the fcc alloy crystal PDF attenuated by a linear combination of two spherical characteristic functions. The "two-phase" model is the linear combination of two fcc alloy crystal phases PDFs, each attenuated by a spherical characteristic function. The optimal model for  $Au_4Zn_3Cu_3$  is the "two-psize" model because it has much better fits than "one-psize" model while the "two-phase" model yields negligible improvement in fits and similar lattice parameters in the two phases. The optimal model for the  $Au_6Ag_2Cu_2$  is the "two-phase" model because it yields significant improvement in the fits and distinct lattice parameters in the two phases.



**Fig. S20.** Overlay of the PDF signal from the two alloys. We can see that there is more disorder (broader peaks) in the  $Au_6Ag_2Cu_2$  than the  $Au_4Cu_3Zn_3$ .



**Fig. S21.** Fitting results of the PDF of  $Au_6Ag_2Cu_2$  nanoparticles as a function of the end point of the fitting range. The left and right panel shows the structure parameters refined in the fitting for two phases in  $Au_6Ag_2Cu_2$  respectively. The "scale" is the scale factor of the PDF, the "D" is the diameter of the spherical shape crystallites, the "a" is the lattice constant, the "U<sub>iso</sub>" is the isotropic displacement parameter.

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