Hybrid Combination of Quantum Mechanics with Quantum-based Polarizable **Reactive Force Field for Large Scale Full Solvent Simulations of Electrocatalysis** Yalu Chen, Soonho Kwon, Hai Xiao, and William A. Goddard III



#### **Abstract:**

To develop new generations of electrocatalysts required for energy and environmental sustainability, we need the accuracy of full solvent QM (free energy barriers to 0.05 eV, onset potentials to 0.05 V) but for practical sized nanoparticles and catalysts (1000's to millions of atoms). We report here a solution to this problem. We start with the RexPoN reactive force field that provides higher accuracy than DFT and combine it with QM to accurately include long-range interactions and polarization effects to enable reactive simulations with QM accuracy in the presence of solvent including 1000's to millions of waters. Here we apply this RexPoN embedded QM (ReQM) to reactive simulations of electrocatalysis demonstrating that ReQM accurately replaces DFT water for computing the Raman frequencies of reaction intermediates during CO<sub>2</sub> reduction to ethylene, with comparisons to operando electrocatalysis experiments and to full solvent QM calculations.

# Introduction

## Results, Highlights, and Accomplishments

**Quantum Mechanics (QM)** The first detailed reaction mechanisms for CO reduction on Lowest-energy pathways for the electro-reduction of CO to methane on Cu surface have been predicted Cu(100) at pHo (CH4, in black) and methanol (CH3OH, in red)<sup>1</sup>. from QM (Cheng et al.). We now want to extend such calculations Cu (100) 300K 1.00 ev 1.5 from the QM scale of ~300 atoms 0.45 ev and ~5 ps to more realistic models 1.0 0.58 ev CH<sub>3</sub>OH 0.64 ev 0.13 ev 0.30 ev (v) CHof the electrochemical cell with 0.55 ev ~10x10 nm<sup>2</sup> electrodes and 100 Energy 0.5 0.48 ev nm of solvent between the H<sub>2</sub>O CH<sub>2</sub> electrodes for time scales of е –0.5 milliseconds. We report a hybrid CH₃ computation framework (ReQM) CH<sub>3</sub>OH formation CH₄ that efficiently includes accurate -1.0CH<sub>4</sub> formation long-range interactions and polarization effects at the  $n(H^{+} + e^{-})$ electrode-electrolyte interface to <sup>1</sup>T. Cheng, H. Xiao, and W. A. Goddard, III, *J. Phys. Chem. Lett.* 2015, **6**, 4767–4773 predict complex reactions in the **RexPoN: QM-based Polarizable Reactive Force Field** presence of a realistic description of solvent while retaining the RexPoN provides the most accurate predictions of water properties accuracy of full solvent QM. In (better than DFT) compare to any other QM-based or empirical models<sup>2</sup>. addition, we combine ReQM with machine learning techniques and Expt. RexPoN TIP3P SPC/E PBE MB-pol Property use it to identify active sites of Molting tomp (K) 273 15 146 215 120 263 5 273 5 disordered Au surfaces including Au nanoparticles and dealloyed Au surfaces. This enables in silico design toward dramatically improved electrocatalysts and many other applications.

#### Results

• Identifying reaction intermediates during CO2RR



#### QM (no solvent) QM-MD (with solvent) ReQM-MD (with solvent) Raman \*0C-CO \*OC-COH \*HOC-COH observable \*C-COH and have a \*CH-COH \*C-CH observable \*C-CH<sub>2</sub> 1100 1200 1300 1400 1500 1600 1700 1800 1900 200 Wave Number (cm<sup>-1</sup>)



### **Moving from Surfaces to Nanoparticles with AI**

Identifying Active Sites of disordered Au surfaces: Au nanoparticles and dealloyed Au surfaces using combination of ReQM and Artificial Intelligence (AI)

#### Team

Saber Naserifar Soonho Kwon Hai Xiao • William A. Goddard III

## **Research Plans**

- Development of a polarizable reactive force field (RexPoN) for CO reduction on Cu surface.
- Development of RexPON embedded QM (ReQM) package
- Computing the Raman frequencies of reaction

Menning temp. (IX)	275.15	215.5	140	210	420	200.0
Entropy (J/mol/K)	69.9	68.43	72.51	60.30	51.32	-
Density (g/cm <sup>3</sup> )	0.9965	0.9965	0.98	0.994	0.944	1.007
Dielectric constant	78.4	76.1	94	68	112	68.4
Heat of <u>vap</u> . (kcal/mol)	10.52	10.36	10.05	11.79	6.20	10.93
RDF 1 <sup>st</sup> peak position (Å)	2.86	2.84	2.79	2.75	2.71	2.81
RDF 1 <sup>st</sup> peak height	2.50	2.34	2.79	3.05	3.69	2.76

<sup>2</sup> S. Naserifar and W. A. Goddard III, *J. Chem. Phys.*, 149,174502 (2018)

RexPoN can correctly explain the structure in the first coordination shell.



Charge and Electron Transf



intermediates during CO<sub>2</sub>RR. Combination of ReQM and machine learning for nanoparticles of catalyst

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S. Naserifar and W. A. Goddard, *Proc. Natl. Acad. Sci.*, 116, 1998 (2019)

**RexPoN Embedded QM (ReQM)** 

QM < 200 atoms





a-Value Mapping and Catalytic Activity Visualization.





# 2020 Solar Fuels Science Meeting

RexPoN FF with million atoms