

Heterogeneous Electrocatalysts for Aqueous Nitrate Reduction and Nitrogen Chemistry

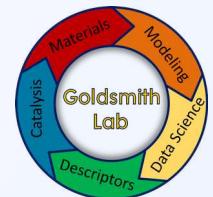
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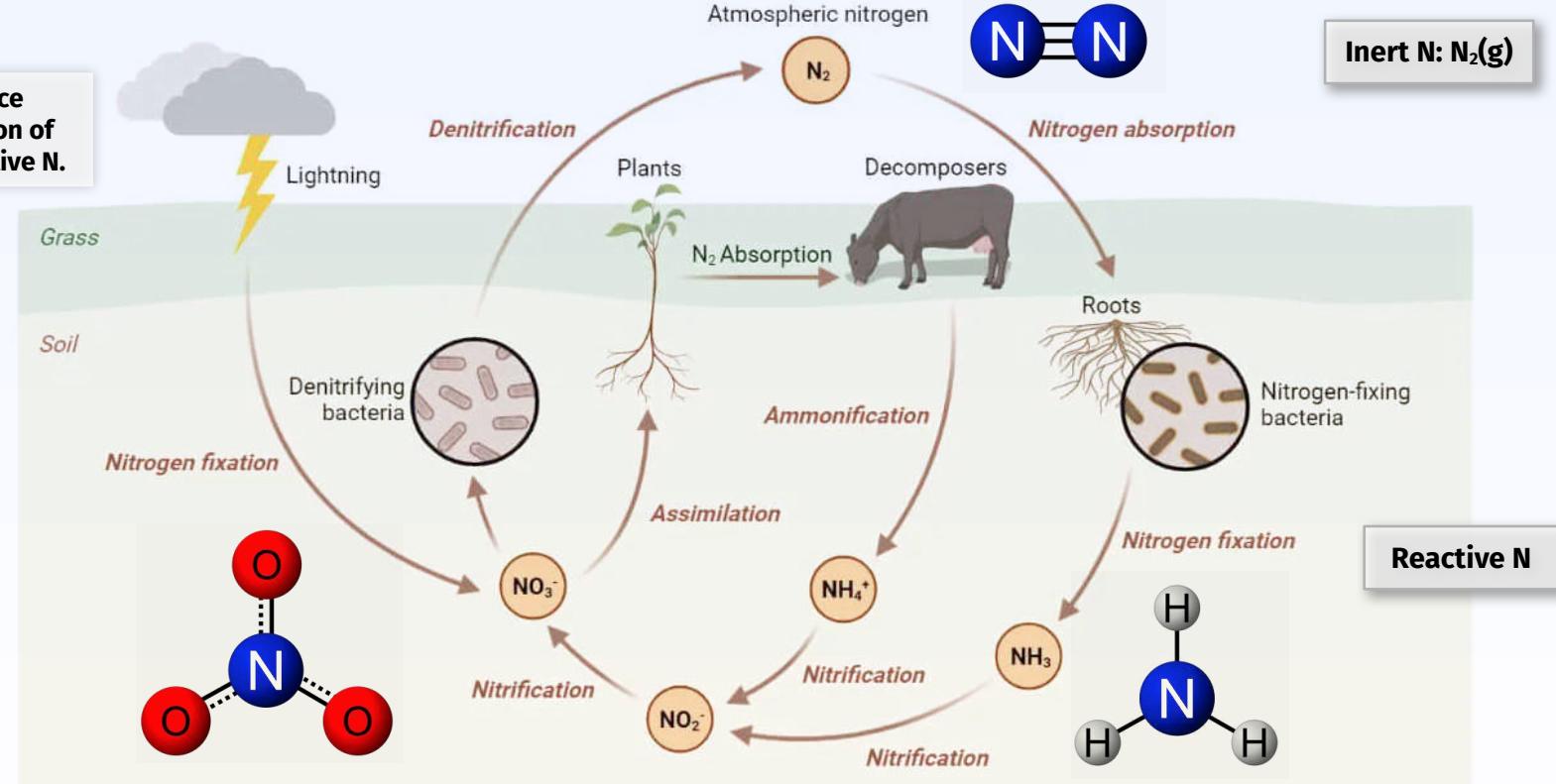
Oral Defense – 07 Aug 2023

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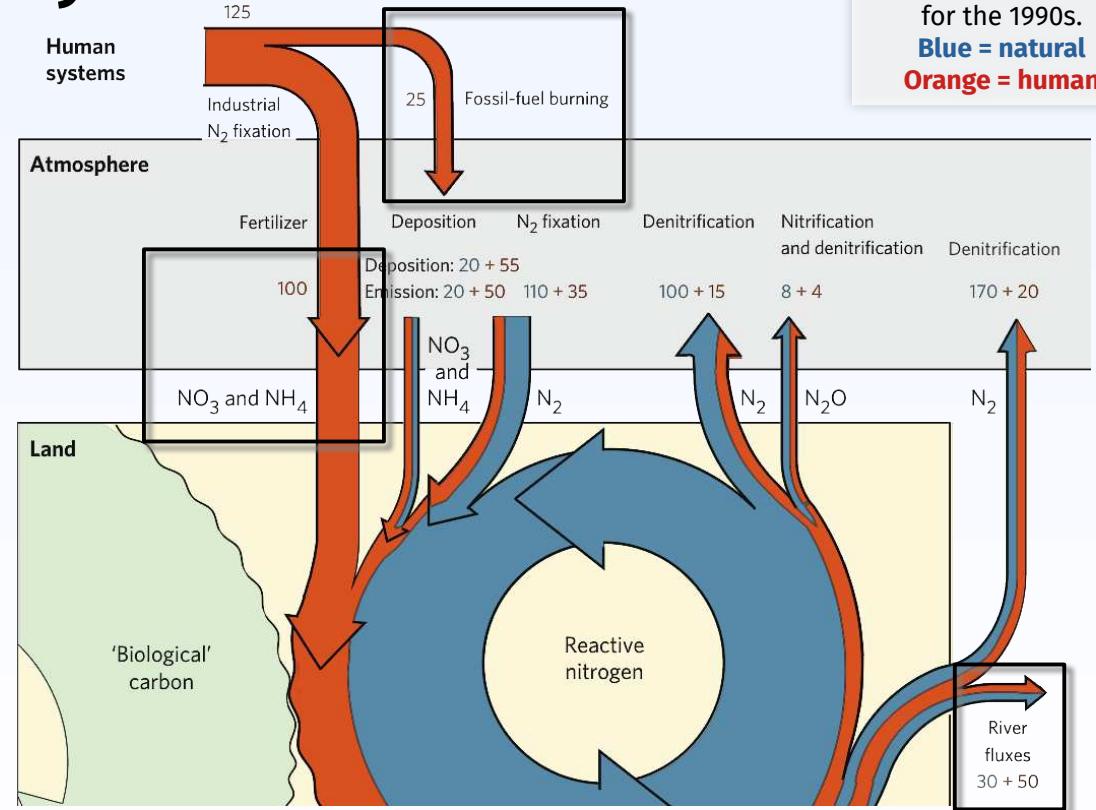
<http://cheresearch.engin.umich.edu/goldsmith/>

The Nitrogen Cycle is Key to Sustaining Life on Earth



The Global Nitrogen Cycle is Out of Balance

- To balance the nitrogen cycle, we need to better understanding N chemistry.
- **How can we consume excess NO_3^- from water systems?**
- **How can we produce NH_3 more efficiently?**





Why Should We Care About Lowering Terrestrial Nitrate Levels?

Nitrate, NO₃⁻

Nitrate is a major water pollutant

- Human N contribution to environment: 10^8 tonnes/yr.^[1, 2]
 - Largest source: ammonia fertilizer (> 100 Tg N).
 - NO_3^- is one of the most widespread water pollutants.
- Adverse health effects:^[3–5]
 - Methemoglobinemia.
 - Ovarian and thyroid cancers.
- Adverse environmental, economic effects:^[2]
 - Eutrophication and aquatic death.
 - Impacts to fishing economies.



Ammonia fertilizer in agriculture [1].



Methemoglobinemia patient (left) [5].

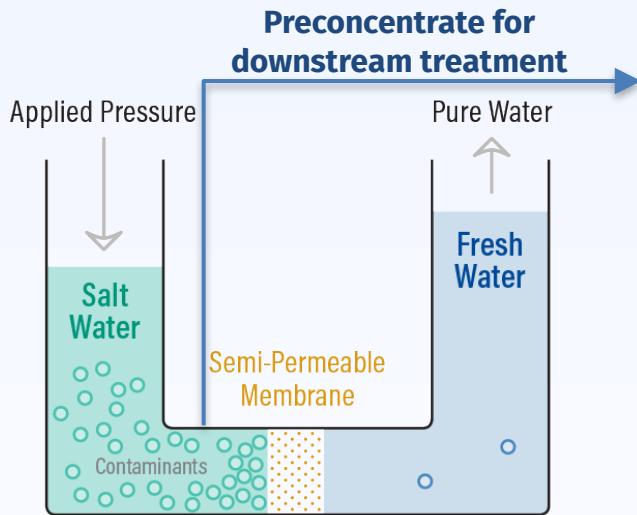


Algae bloom in nearby Lake Erie [2].

1. Fields, S. *Environmental Health Perspectives* **112**, A556–A563 (2004).
2. Duca, M. & Koper, M. T. M. *Energy Environ. Sci.* **5**, 9726–9742 (2012).
3. Farkas, J. Methemoglobinemia in *Internet Book of Critical Care* (2019).

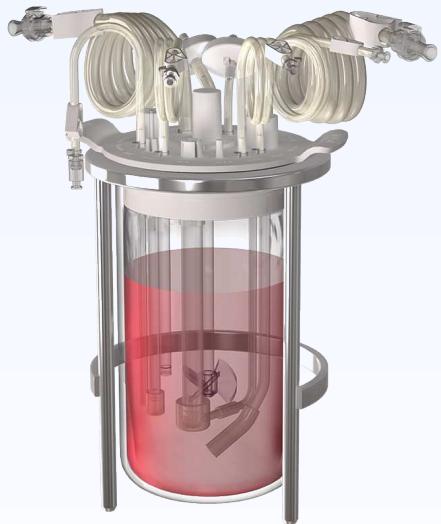
4. Xie, L. et al. *Oncotarget* **7**, 56915–56932 (2016).
5. Soliman, D. S. & Yassin, M. Congenital methemoglobinemia misdiagnosed as polycythemia vera: Case report and review of literature. *Hematol Rep* **10**, (2018).

Approaches to Balance Nitrogen Cycle Through NO_3^- Removal



Physical^[1]

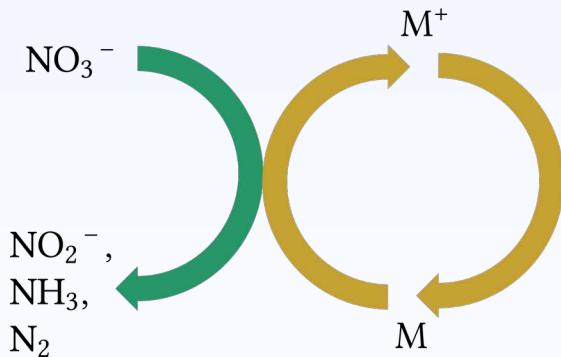
- Produces concentrated waste
- Need regular membrane/resin purging/regeneration



Bacteriological^[2]

- Need carbon source and controlled conditions
- Can produce biotoxins

Nitrate Reduction Reaction (" NO_3RR ")



Catalytic^[3]

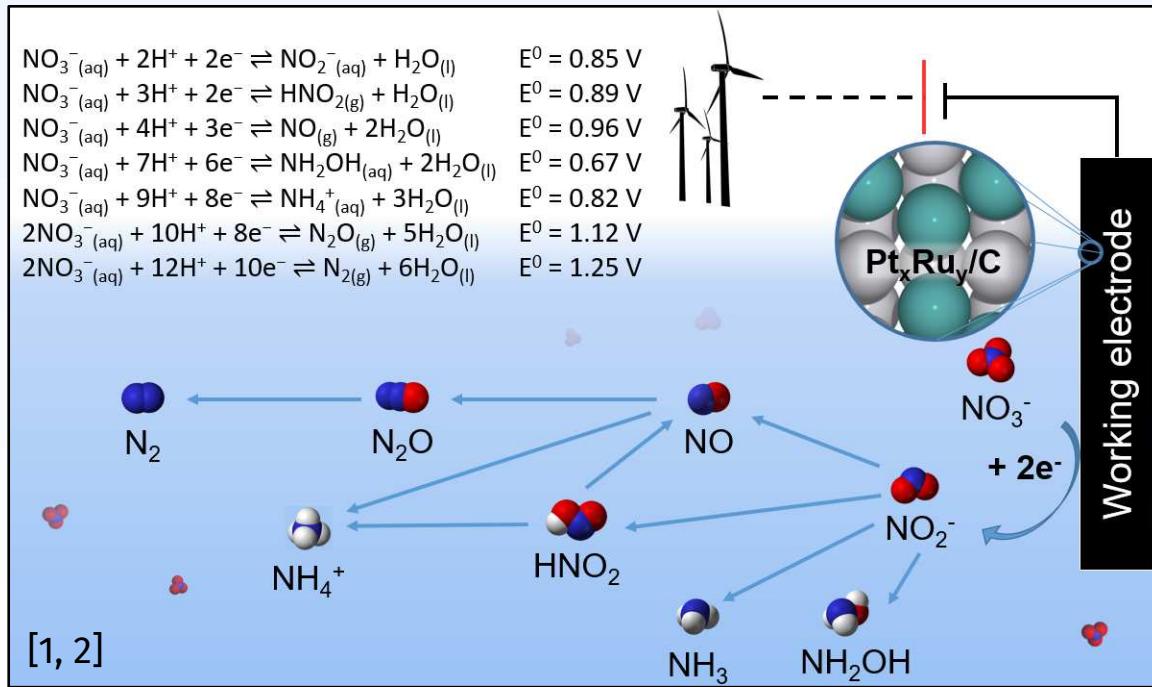
- Catalyst can be poisoned
- Need electricity or reductant

[1] PureTec Industrial Water. What is Reverse Osmosis? <https://puretecwater.com/reverse-osmosis/what-is-reverse-osmosis>

[2] Distek, Inc. BIOOne Single-Use Bioreactor System. <https://www.distekinc.com/products/bione-single-use-bioreactor-system/>

[3] Adapted from Hasnat, M. et al., *J. Ind. Eng. Chem.* **28** (2015) 131–137

Electrocatalytic Nitrate Reduction (NO₃RR) is a Sustainable Route for Nitrate Remediation



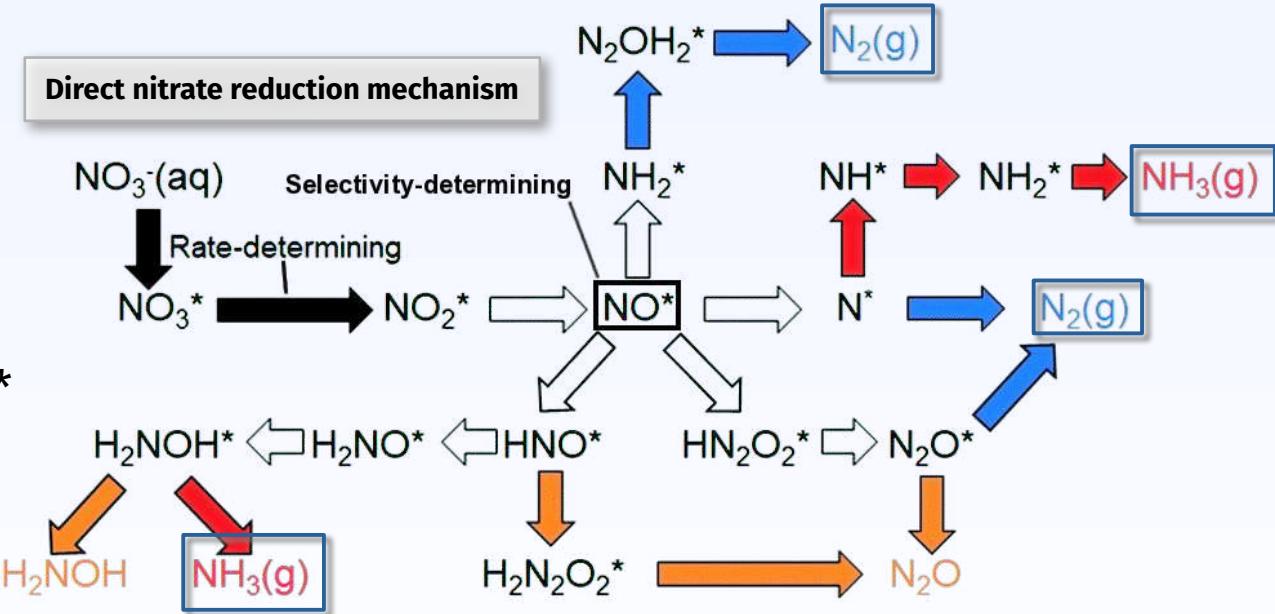
- Could be powered with renewable electricity
- Many benign or value-added products possible, especially NH₃, NH₄NO₃.
- **Challenge: need active, selective, and stable electrocatalysts.**

[1] Wang, Z., Young, S. D., Goldsmith, B. R. & Singh, N. Increasing electrocatalytic nitrate reduction activity by controlling adsorption through PtRu alloying. *Journal of Catalysis* **395**, 143–154 (2021).

[2] Singh, N. & Goldsmith, B. R. Role of Electrocatalysis in the Remediation of Water Pollutants. *ACS Catal.* **10**, 3365–3371 (2020).

NO₃RR Mechanism on Metals Informs Catalyst Design

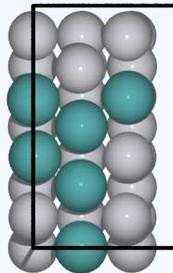
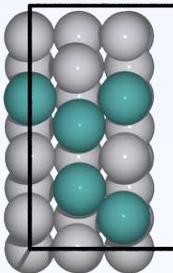
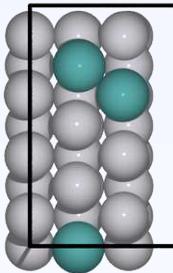
- On transition metals, rate-limiting step is^[1]
 $\text{NO}_3^* \rightarrow \text{NO}_2^* + \text{O}^*$.
- Active catalysts should hold onto NO₃⁻ tightly.
- A low NO₃^{*} → NO₂^{*} + O^{*} barrier is important.



Pt-group metal activities: Rh > Ru > Ir > Pd ≈ Pt
Coinage metal activities: Cu > Ag > Au

[1] Dima, G. E.; de Vooy, A. C. A.; Koper, M. T. M. *Journal of Electroanalytical Chemistry* **2003**, 554–555, 15–23. DOI: 10.1016/S0022-0728(02)01443-2.
[2] Wang, Z.; Richards, D.; Singh, N. *Catalysis Science & Technology* **2021**, 11 (3), 705–725. DOI: 10.1039/D0CY02025G.

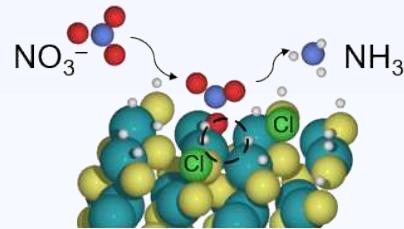
I Focus on Three Electrocatalyst Materials to Help Balance the Nitrogen Cycle



Platinum–Ruthenium Alloys



$\text{Rh}_x\text{S}_y/\text{C}$
NO₃RR Activity
Cl⁻ Poison Resistance



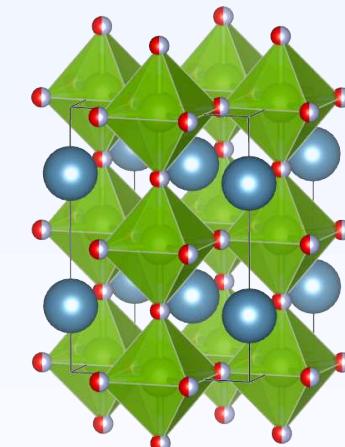
Rh₃S₄(100) with Sulfur Vacancy



Rhodium Sulfides



Nitrate reduction



Perovskite Oxynitrides



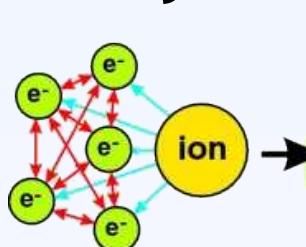
Ammonia synthesis

[1] Wang, Z., Young, S. D., Goldsmith, B. R. & Singh, N. *Journal of Catalysis* **395**, 143–154 (2021).

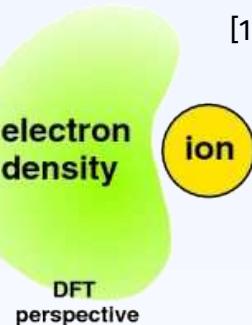
[2] Richards, D., Young, S. D., Goldsmith, B. R. & Singh, N. *Catal. Sci. Technol.* **11**, 7331–7346 (2021).

[3] Young, S. D., Chen, J., Sun, W., Goldsmith, B., Pilania, G. *ACS Chemistry of Materials* (2023). <https://doi.org/10.1021/acs.chemmater.3c00943>.

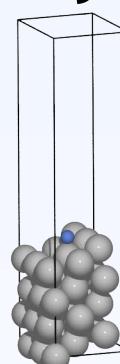
Density Functional Theory (DFT) Simulates Electron Behavior



Many-body perspective



DFT perspective



DFT

$$E = -43.873 \text{ eV}$$



U-M Great Lakes [1]



NERSC Perlmutter [2]



XSEDE Expanse [3]



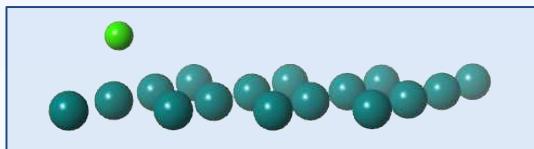
Advancing Innovation

[1] Bechstedt, F. (2015). Density Functional Theory. In: Many-Body Approach to Electronic Excitations. Springer Series in Solid-State Sciences, 181. Springer, Berlin, Heidelberg. https://doi.org/10.1007/978-3-662-44593-8_5

[2] Kresse, G.; Furthmüller, J. Efficient Iterative Schemes for Ab Initio Total-Energy Calculations Using a Plane-Wave Basis Set. *Physical Review B* **1996**, 54 (16), 11169–11186. <https://doi.org/10.1103/PhysRevB.54.11169>.

DFT Can Calculate Adsorption Energies

Adsorption energy^[3]: $E_A = E_{A^*} - E_* - E_A(g)$



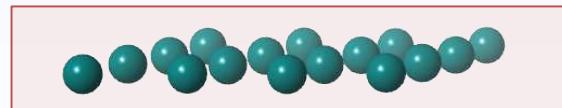
Surface + Adsorbate



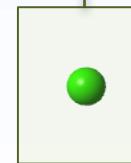
A



Surface



Bare surface



Adsorbate alone



(using PBE and BEEF-vdW functionals^[2, 3])

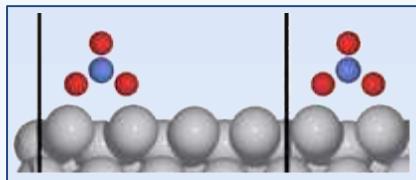
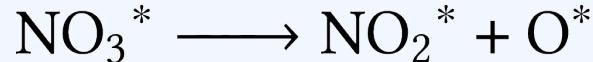
[1] The VASP Site. <https://www.vasp.at/index.php/about-vasp/59-about-vasp>

[2] Wellendorff, J. et al. *Phys. Rev. B* **85**, 235149 (2012).

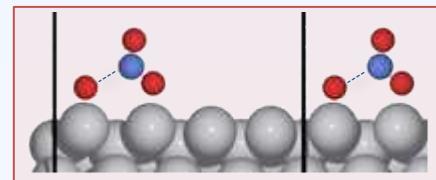
[3] Perdew, J. P., Burke, K. & Ernzerhof, M. Generalized Gradient Approximation Made Simple. *Phys. Rev. Lett.* **77**, 3865–3868 (1996).

[4] Liu, J.-X., Richards, D., Singh, N. & Goldsmith, B. R. *ACS Catal.* **9**, 7052–7064 (2019).

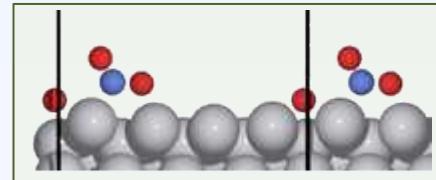
DFT Can Calculate Activation Barriers



Initial State ("I")



Transition State ("‡")

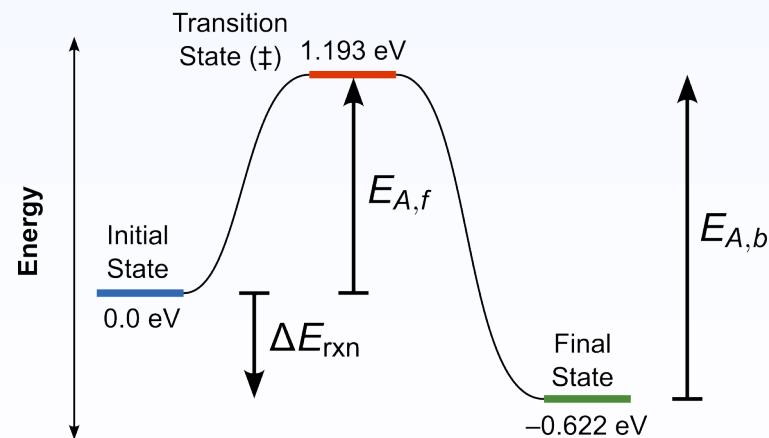


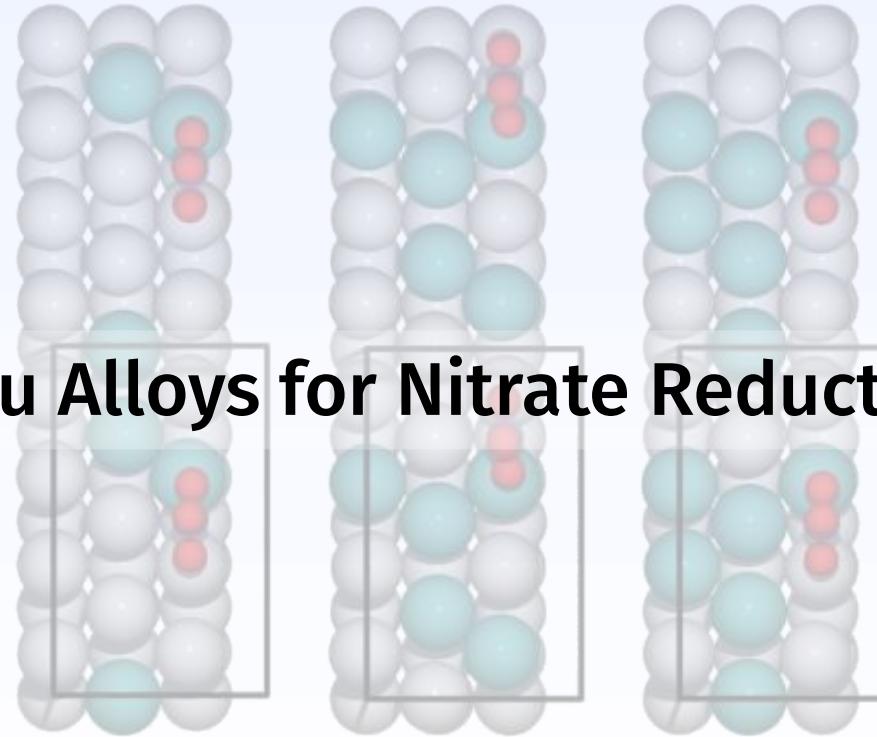
Final State ("F")

$$\text{Forward barrier: } E_{A,f} = E_{\ddagger} - E_I$$

$$\text{Backward barrier: } E_{A,b} = E_{\ddagger} - E_F$$

$$\text{Reaction energy: } \Delta E_{\text{rxn}} = E_F - E_I$$





PtRu Alloys for Nitrate Reduction

NO_3^- adsorbed on PtRu surface alloys

Objective: Verify Whether Pt₃Ru Alloy Predicted Using Pure Metal Microkinetics is Active Towards NO₃RR

- Previous study of pure metals found N, O binding energies as thermodynamic descriptors.
- Pt₃Ru alloys predicted to be promising.^[1, 2]
- **Questions:**
 - Is Pt₃Ru more active than Pt?
 - Can we systematically tune NO₃RR kinetics through alloying?
 - Can we use *pure metal* microkinetics to predict alloy activity?

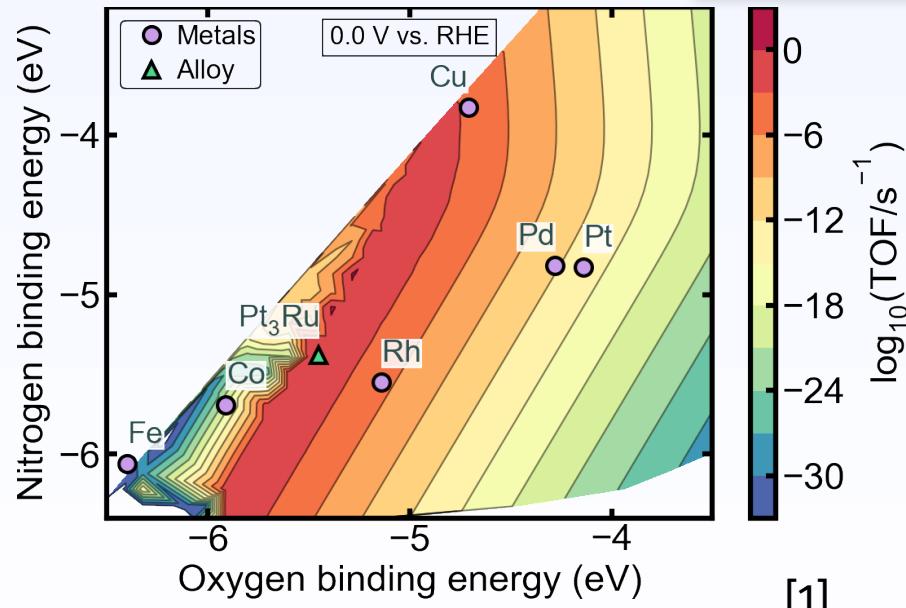


Jin-Xun Liu



Danielle Richards

TOF = “turnover frequency”, or intrinsic reaction rate



[1]

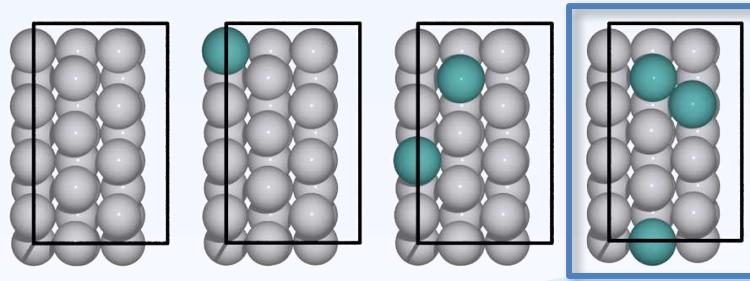
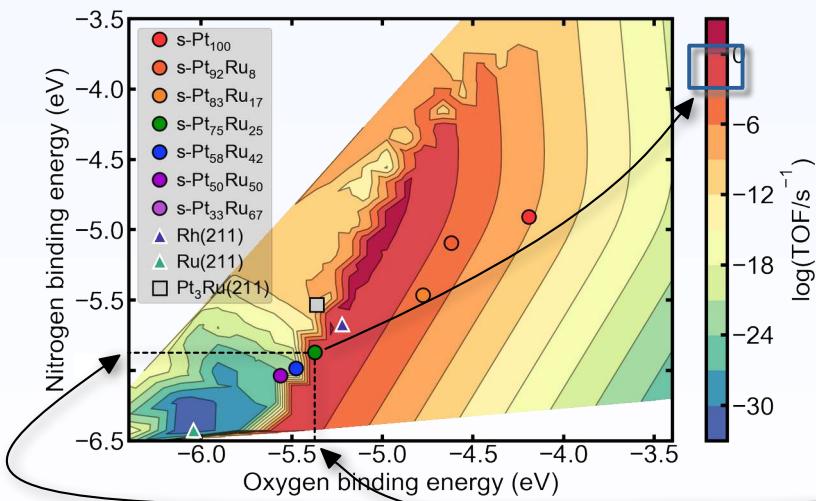


[1] Liu, J.-X., Richards, D., Singh, N. & Goldsmith, B. R. Activity and Selectivity Trends in Electrocatalytic Nitrate Reduction on Transition Metals. *ACS Catal.* **9**, 7052–7064 (2019).

[2] All potentials are relative to the reversible hydrogen electrode (RHE).

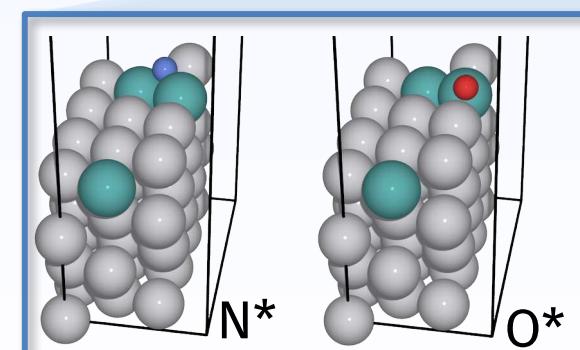
DFT Modeling of Pt_xRu_y Adsorption Energies

- How to control surface compositions?
Alloy the surface.
- Computed N and O binding energies correspond to a TOF on the volcano chart.



s-Pt₁₀₀ s-Pt₉₂Ru₈ s-Pt₈₃Ru₁₇ s-Pt₇₅Ru₂₅

● Pt
● Ru
● N
● O



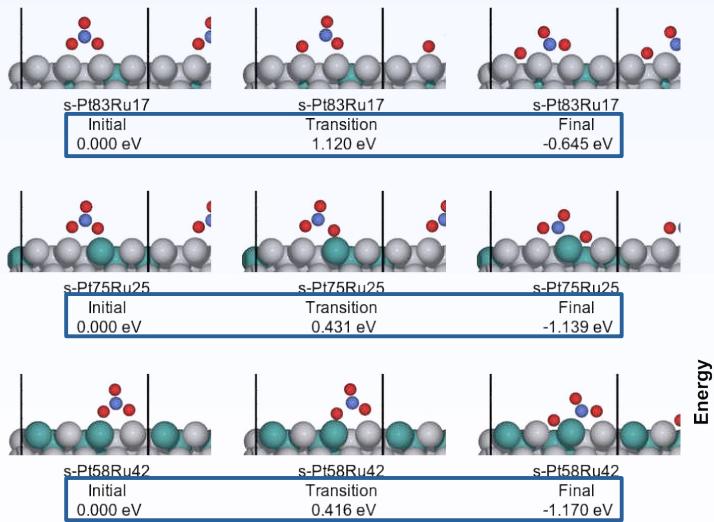
$$\Delta E_N = -5.869 \text{ eV}$$

$$\Delta E_O = -5.373 \text{ eV}$$

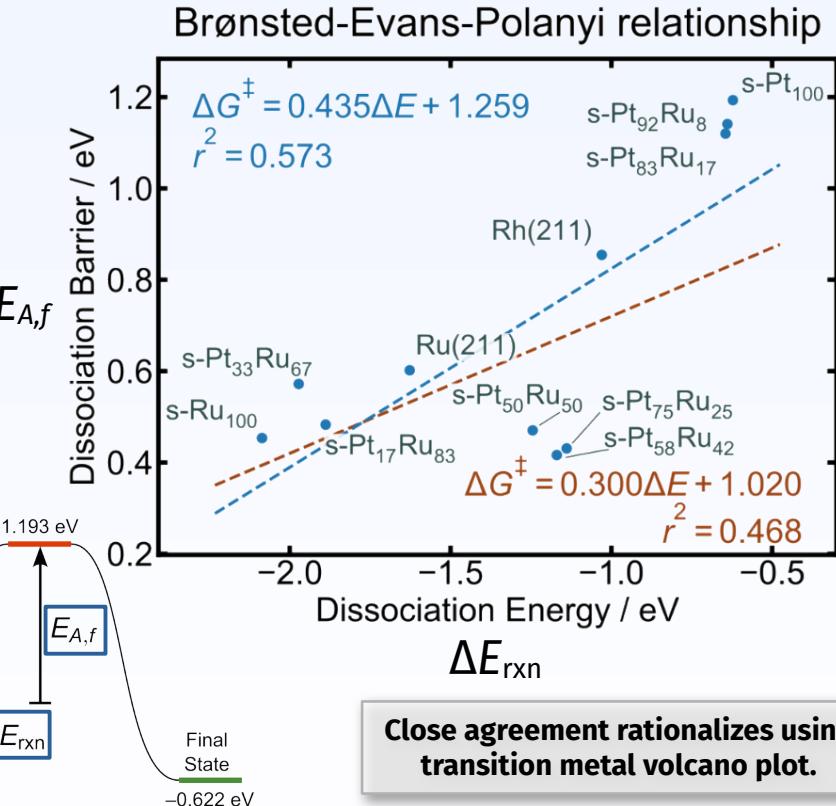
b-initio
VASP
package
Vienna

DFT Modeling of Pt_xRu_y Nitrate Dissociation Barriers

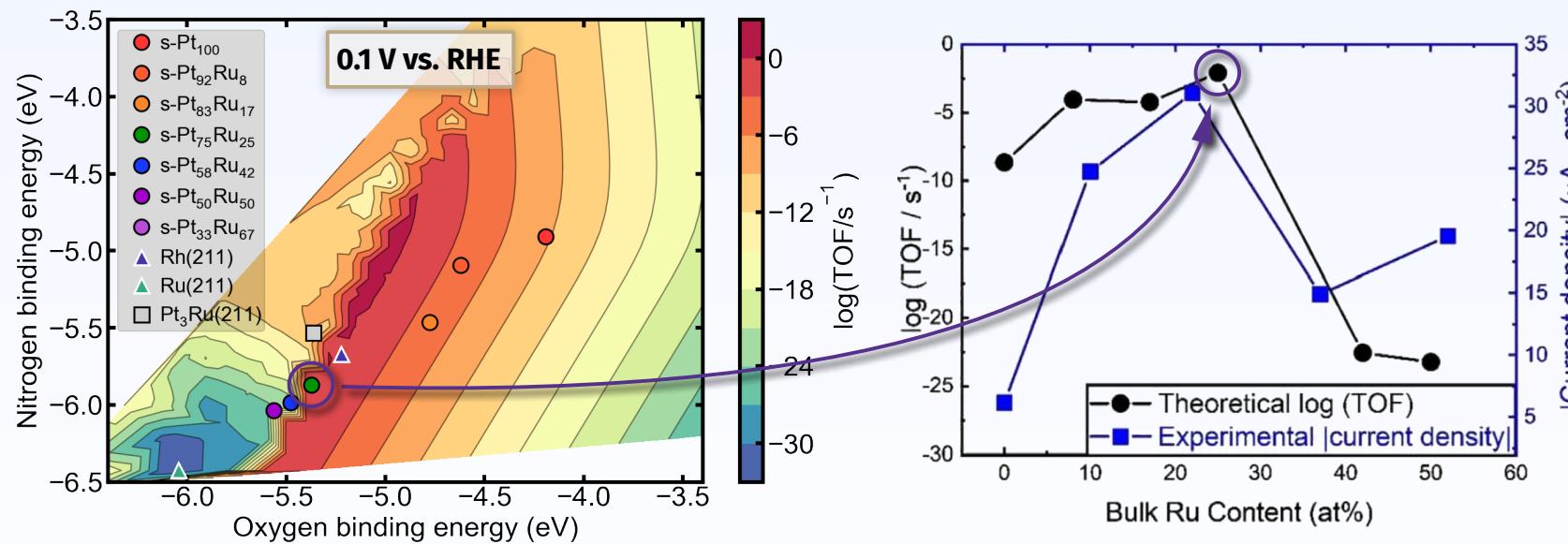
- Okay to use transition metal volcano chart on Pt_xRu_y alloys?
- Compare NO₃* → NO₂* + O* barriers.



Energy ↓



Tuning PtRu Composition Systematically Changes NO₃RR Activity

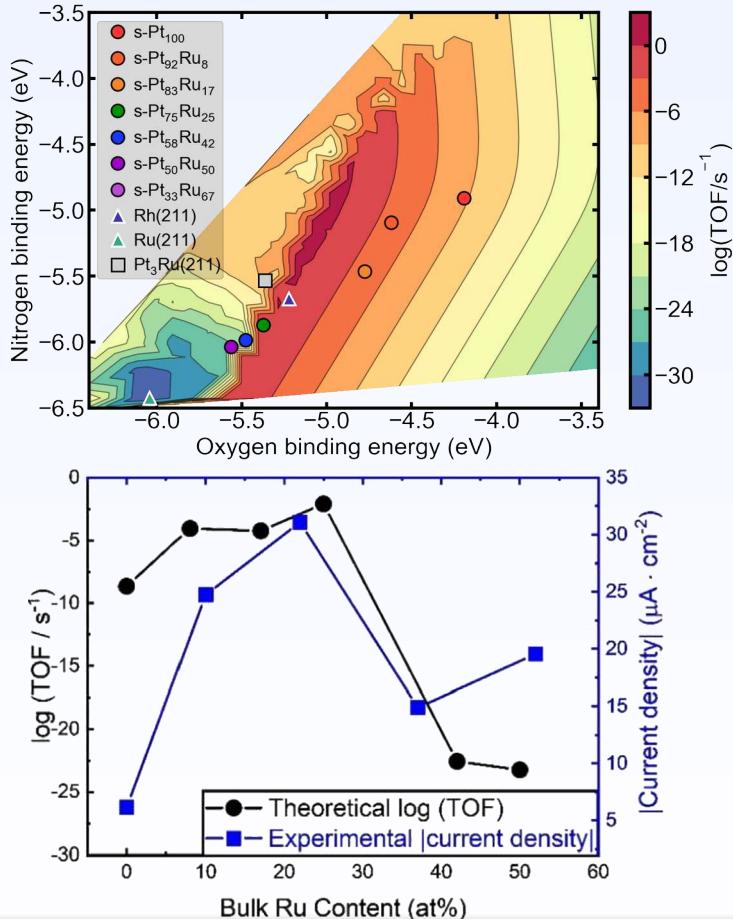


Zixuan Wang

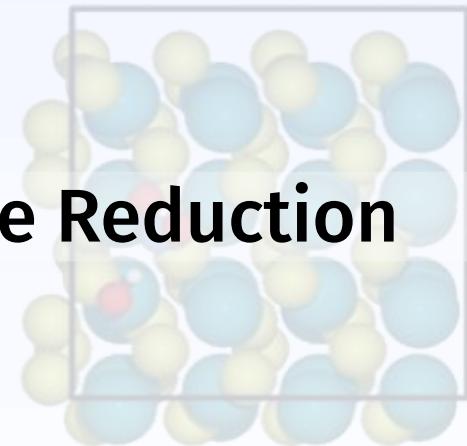
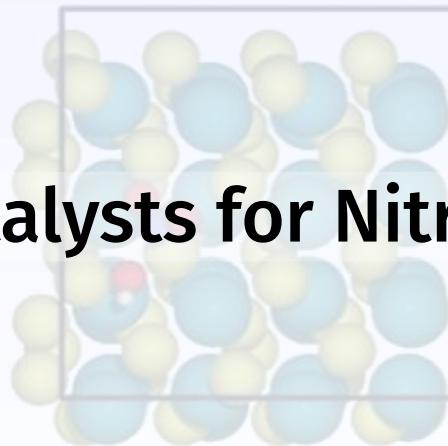
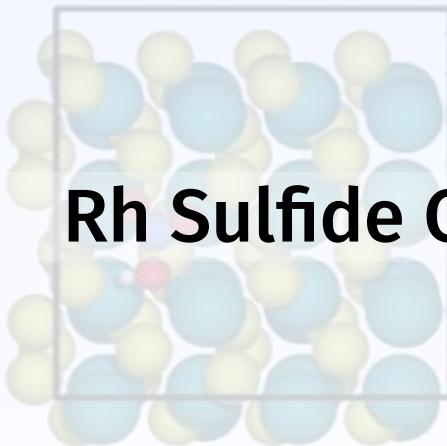
We hypothesize that the maximum in activity arises from a shift in the rate-determining step from nitrate dissociation to another step.

Conclusions and Implications

- Pt₃Ru (Pt₇₈Ru₂₂/C) is more active for NO₃RR than Pt/C.
- Pure metal microkinetics rationalize activity trends of alloys (Pt_xRu_y/C).
- *One can potentially save calculations when screening alloy electrocatalysts.*



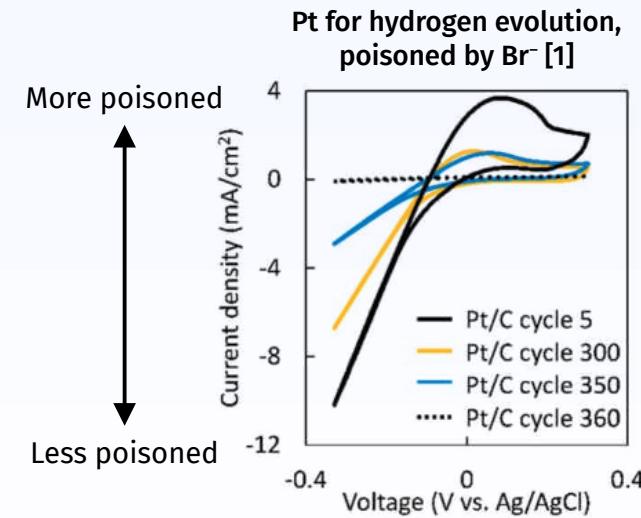
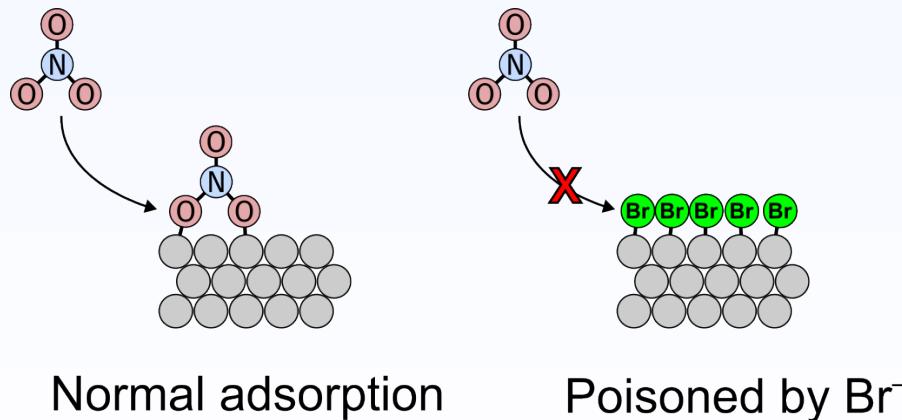
Rh Sulfide Catalysts for Nitrate Reduction



Rh₁₇S₁₅(100) surfaces

Halide Poisoning Limits Catalyst Effectiveness

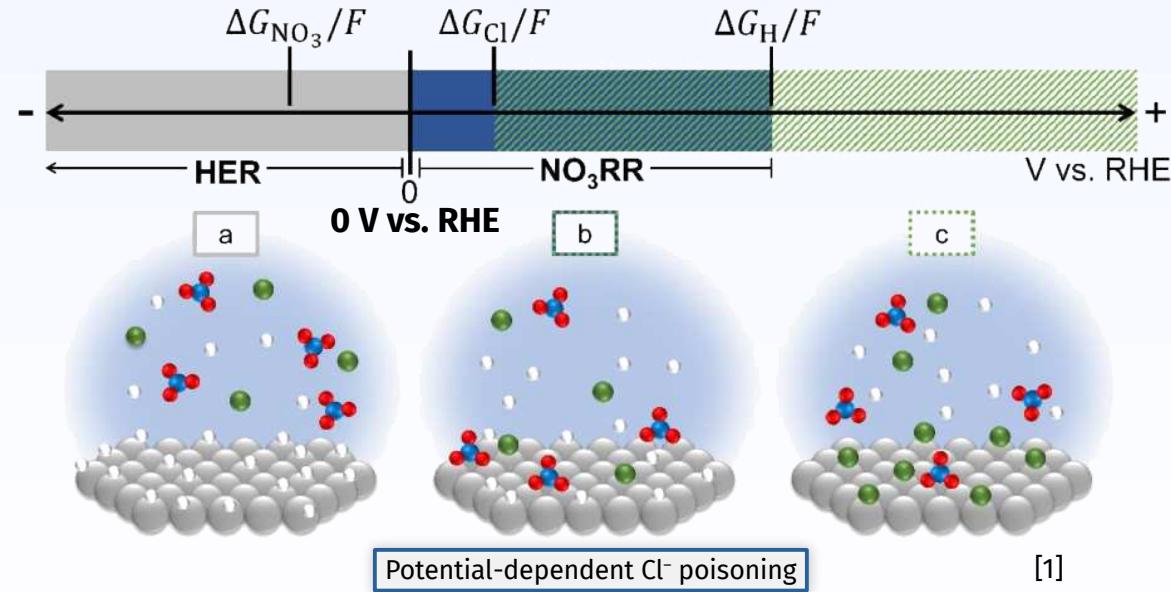
- Poisoning: sites on surface blocked by non-reactant molecules, decreasing activity.
- Cl^- , Br^- , I^- , and other halides are common in concentrated wastewater.
- Halides poison electrocatalysts for many electrocatalytic reactions.



[1] Singh, N. et al. Stable electrocatalysts for autonomous photoelectrolysis of hydrobromic acid using single-junction solar cells. *Energy Environ. Sci.* **7**, 978–981 (2014).
[2] PureTec Industrial Water. What is Reverse Osmosis? <https://puretecwater.com/reverse-osmosis/what-is-reverse-osmosis>

Chloride (Cl^-) Poisons Many Potential NO_3RR Catalysts

- Cl^- adsorption competes with nitrate adsorption at NO_3RR potentials.^[1]
- Even trace amounts of Cl^- can poison electrocatalysts.^[2]

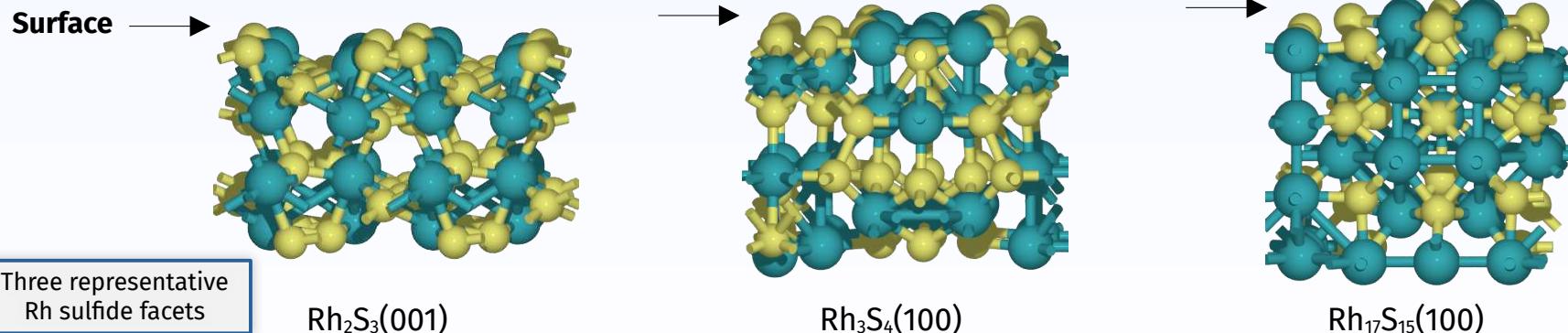


[1] Richards, D.; Young, S. D.; Goldsmith, B. R.; Singh, N. *Catal. Sci. Technol.* **2021**, *11* (22), 7331–7346.

[2] Juarez, F. et al. Why are trace amounts of chloride so highly surface-active? *Journal of Electroanalytical Chemistry* **847**, 113128 (2019).

Objective: Understand Rh Sulfide NO₃RR Activity and Cl⁻ Poisoning

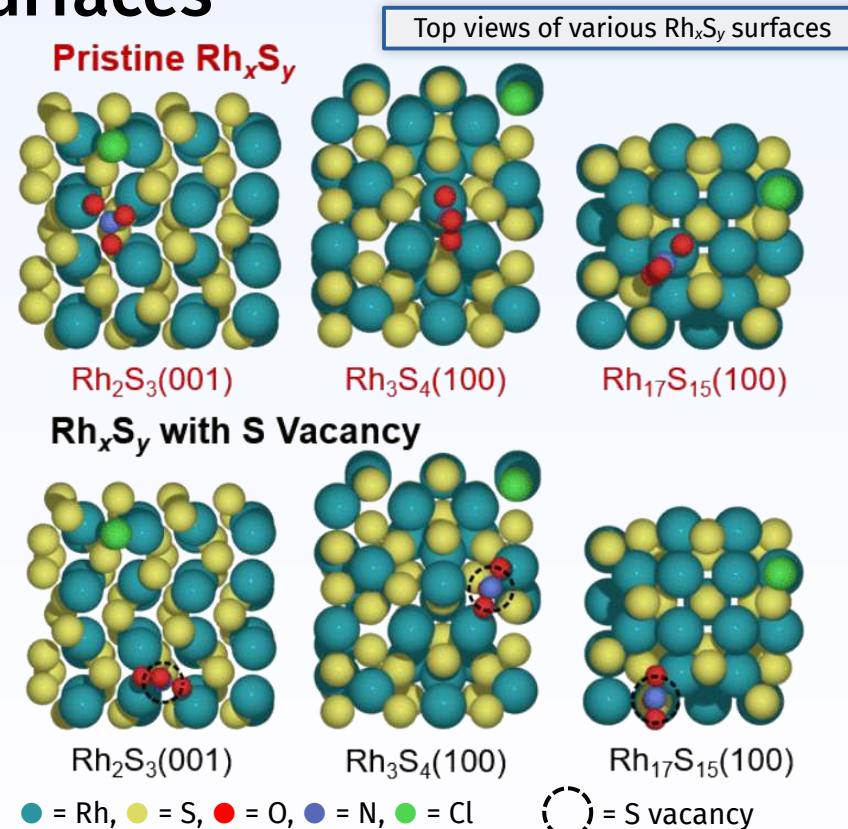
- Rh active for NO₃RR.^[1-2] Sulfides often resist halide poisoning.^[3-4]
 - Hypothesis: Rh sulfides will be active and resistant to Cl⁻ poisoning.
- **Questions:**
 - **What is the NO₃RR mechanism on Rh sulfides?**
 - **How does the presence of Cl⁻ affect NO₃RR performance?**



- [1] Liu, J.-X., Richards, D., Singh, N. & Goldsmith, B. R. Activity and Selectivity Trends in Electrocatalytic Nitrate Reduction on Transition Metals. *ACS Catal.* **9**, 7052–7064 (2019).
[2] Dima, G. E., de Vooy, A. C. A. & Koper, M. T. M. Electrocatalytic reduction of nitrate at low concentration. *Journal of Electroanalytical Chemistry* **554–555**, 15–23 (2003).
[3] Ivanovskaya, A. et al. Transition Metal Sulfide Hydrogen Evolution Catalysts for Hydrobromic Acid Electrolysis. *Langmuir* **29**, 480–492 (2013).
[4] Singh, N. et al. Stable electrocatalysts for autonomous photoelectrolysis of hydrobromic acid using single-junction solar cells. *Energy Environ. Sci.* **7**, 978–981 (2014).

DFT Modeling of Rh Sulfide Surfaces

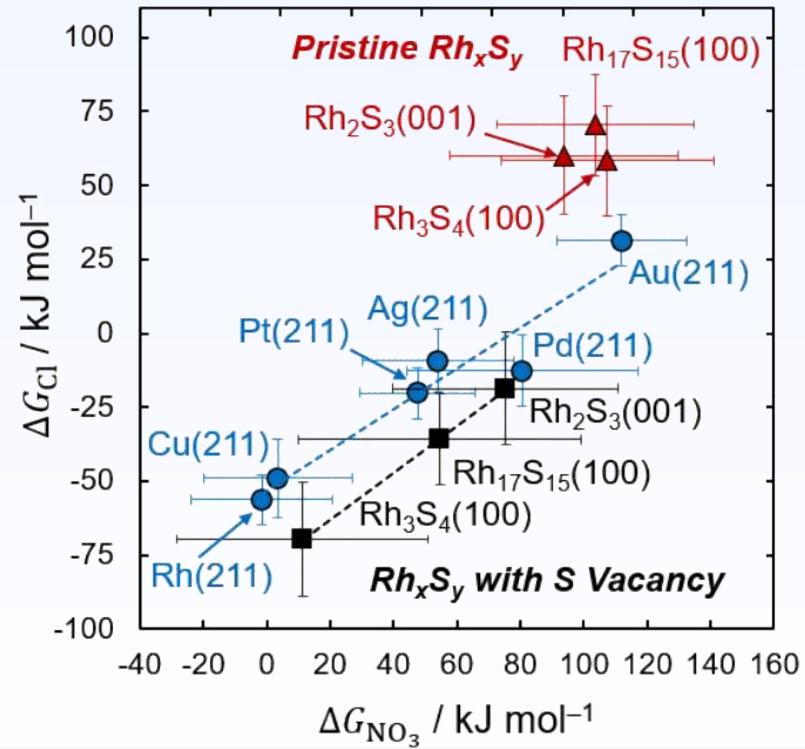
- Rh sulfides are modeled using $\text{Rh}_2\text{S}_3(001)$, $\text{Rh}_3\text{S}_4(100)$, and $\text{Rh}_{17}\text{S}_{15}(100)$.^[1]
- Density functional theory used to calculate binding energies and barriers.
- Central questions to answer:
 - (1) Do Rh_xS_y facets break unfavorable NO_3^- - Cl^- scaling relationship?
 - (2) What is the mechanism on Rh_xS_y ?
 - (3) Do S vacancies improve NO_3RR ?



[1] Singh, N. et al. Investigation of the Active Sites of Rhodium Sulfide for Hydrogen Evolution/Oxidation Using Carbon Monoxide as a Probe. *Langmuir* **30**, 5662–5668 (2014).

How Do Adsorbates Bind to Different Rh_xS_y Facets?

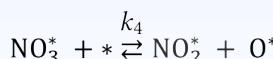
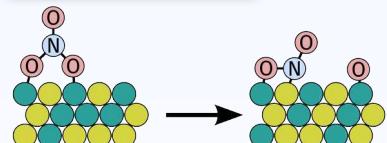
- Pure transition metals: **blue** line.
Want Rh_xS_y to be above **blue** line.
- Pristine sulfide surfaces: **red**. Binds NO_3^- and Cl^- very weakly.
- S-defected Rh_xS_y : **black**. Follows same trend as transition metals.
- S-defected $\text{Rh}_3\text{S}_4(100)$ should have fastest NO_3RR rate, but also be poisoned by Cl^- .



Which Site is The Active Site? Which Mechanism is Happening?

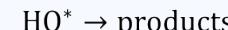
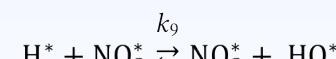
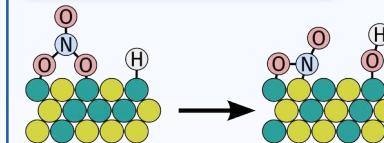
- Assume H⁺, Cl⁻, and NO₃⁻ compete to adsorb on Pt, Rh, and Rh_xS_y surfaces.
- NO₃RR can proceed through a direct^[1-2] or H-assisted mechanism.

Direct reduction



$$\text{rate} = \frac{k_4 K_{\text{NO}_3} [\text{NO}_3^-]_0}{(1 + K_{\text{H}}[\text{H}^+]_0 + K_{\text{NO}_3} [\text{NO}_3^-]_0 + K_{\text{Cl}}[\text{Cl}^-]_0)^2}$$

H-assisted reduction



$$\text{rate} = \frac{k_9 K_{\text{NO}_3} [\text{NO}_3^-]_0 K_{\text{H}}[\text{H}^+]_0}{(1 + K_{\text{H}}[\text{H}^+]_0 + K_{\text{NO}_3} [\text{NO}_3^-]_0 + K_{\text{Cl}}[\text{Cl}^-]_0)^2}$$

k_4, k_9 : rate constants

$K_{\text{NO}_3}, K_{\text{Cl}}, K_{\text{H}}$: equilibrium constants

$[\text{NO}_3]_0, [\text{H}^+]_0, [\text{Cl}^-]_0$: initial molar concentrations

Pt undergoes H-assisted reduction, but exact mechanism is unknown for Rh and Rh_xS_y.

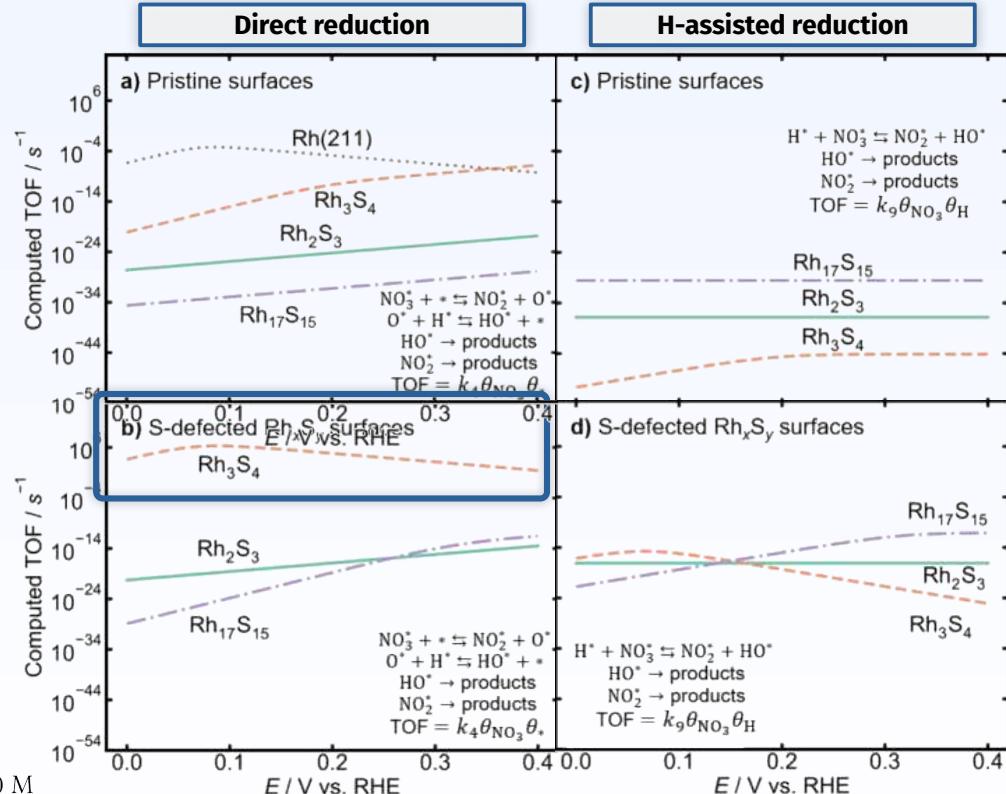
[1] Dima, G. E., de Vooy, A. C. A. & Koper, M. T. M. Electrocatalytic reduction of nitrate at low concentration on coinage and transition-metal electrodes in acid solutions. *Journal of Electroanalytical Chemistry* **554–555**, 15–23 (2003).

[2] Liu, J.-X., Richards, D., Singh, N. & Goldsmith, B. R. Activity and Selectivity Trends in Electrocatalytic Nitrate Reduction on Transition Metals. *ACS Catal.* **9**, 7052–7064 (2019).

S-defected $\text{Rh}_3\text{S}_4(100)$ is Predicted to be Most Active

- My computational results predict the highest activity for **S-defected $\text{Rh}_3\text{S}_4(100)$** under the **direct mechanism**.
- S vacancies facilitate NO_3RR .

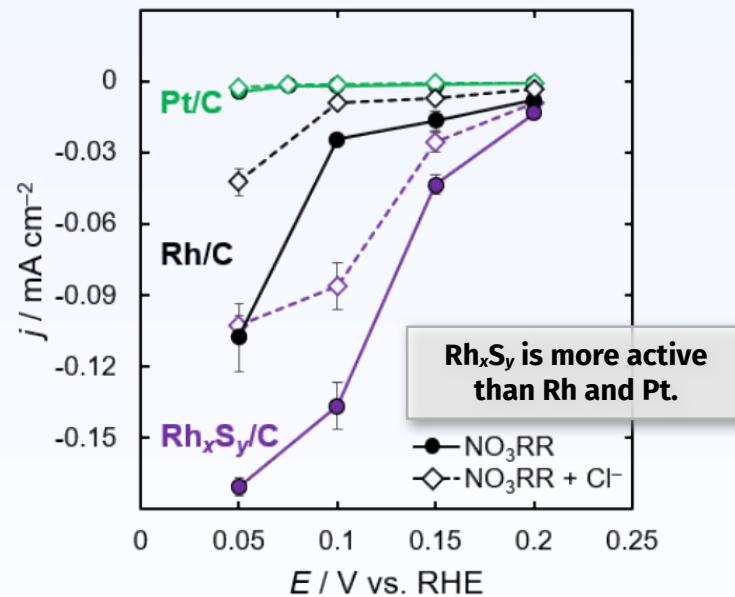
$[\text{NO}_3]_0 = [\text{H}^+]_0 = 1 \text{ M}; [\text{Cl}^-]_0 = 0 \text{ M}$



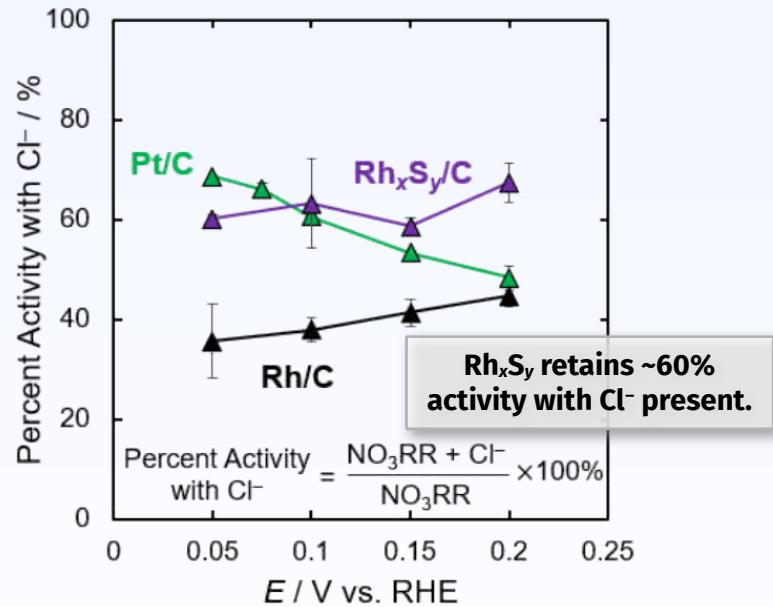
Rh_xS_y Retains Activity in Presence of Chloride



Danielle
Richards

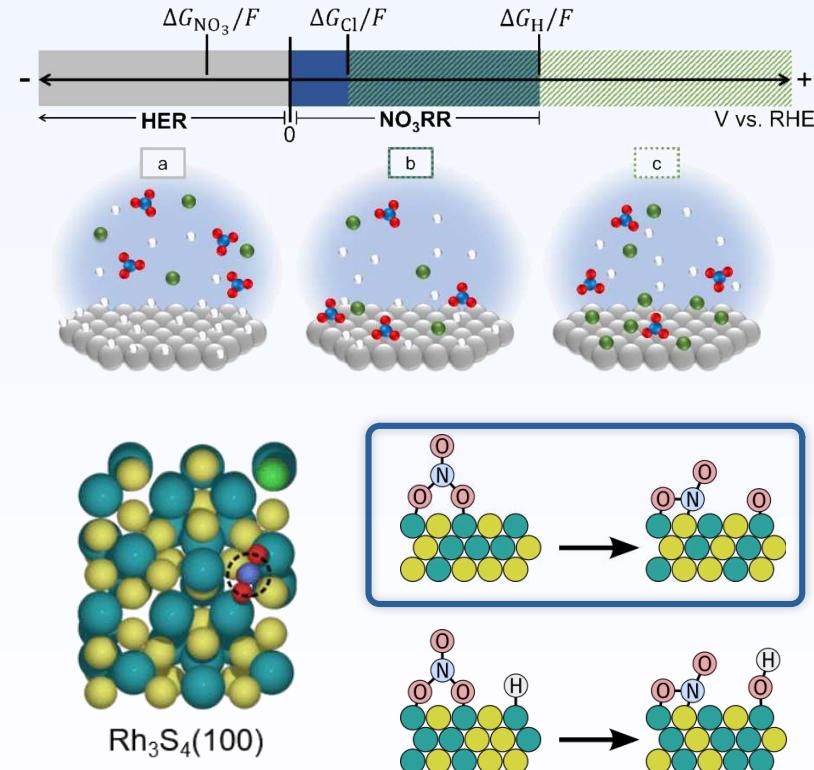


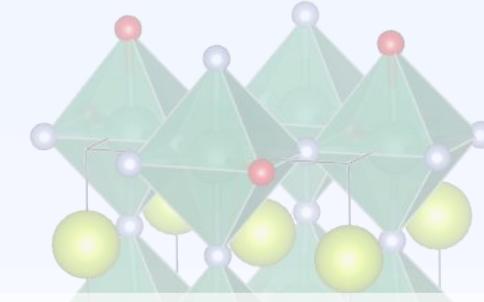
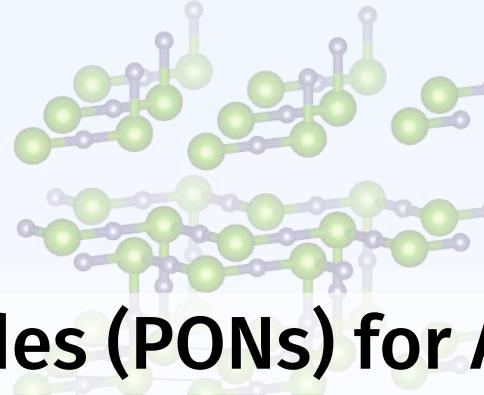
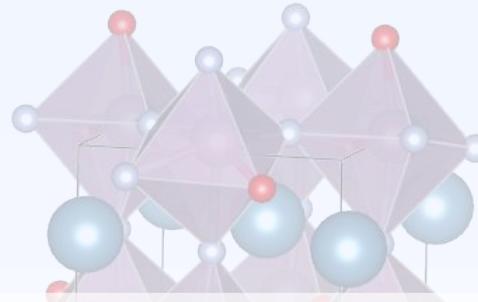
Rh_xS_y is more active than Rh and Pt.



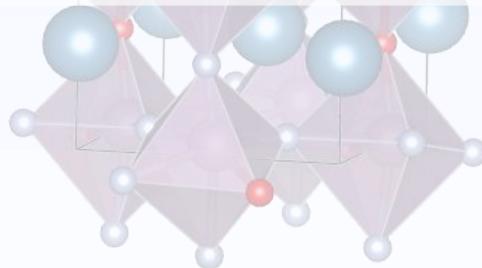
Rh_xS_y is Promising for Cl^- -Resistant NO_3 RR

- **$\text{Rh}_x\text{S}_y/\text{C}$ is active for NO_3 RR and exhibits Cl^- poison resistance.**
- **We predict S-defected $\text{Rh}_3\text{S}_4(100)$ to be the active site.**
- Future experiments:
 - EPR spectroscopy.
 - Isotopic labeling.
 - Core-shell or nanoparticle engineering.





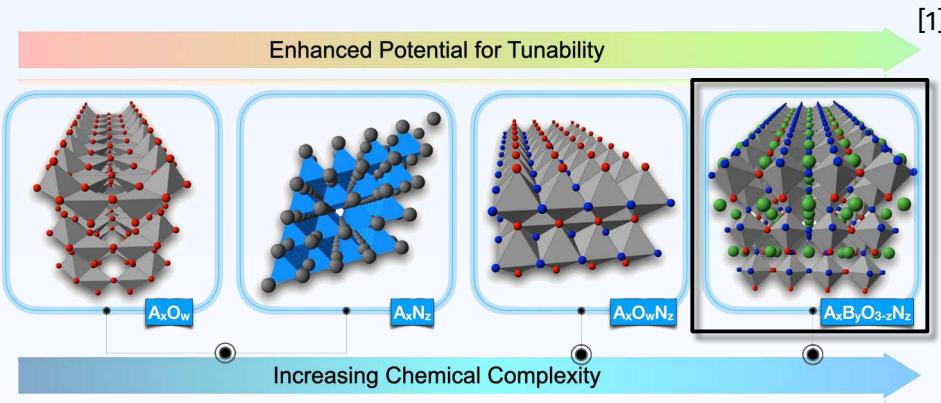
Perovskite Oxynitrides (PONs) for Ammonia Synthesis



Perovskite oxynitride crystals

PONs Are Tunable Materials With Potential Use for N Chemistry

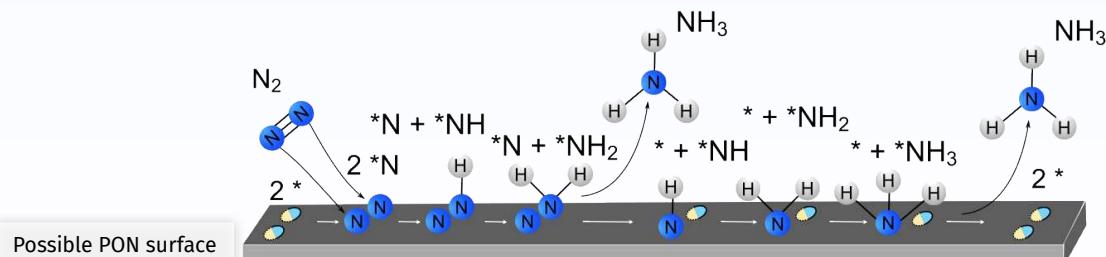
- Metal oxynitrides have been used for many electrochemical reactions.^[1-2]
- PONs may be useful for N chemistry, such as for efficient NH₃ synthesis.^[2]
- **Which factors govern PON stability during N chemistry reactions?**



Dissociative MvK

N surface vacancy or active site

[1]

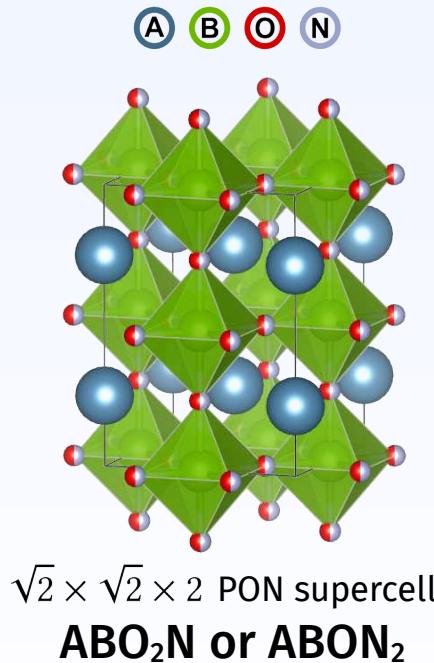
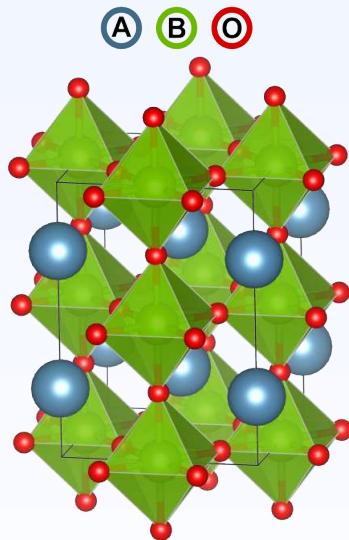


[1] Young, S. D.; Ceballos, B. M.; Banerjee, A.; Mukundan, R.; Pilania, G.; Goldsmith, B. R. Metal Oxynitrides for the Electrocatalytic Reduction of Nitrogen to Ammonia. *J. Phys. Chem. C* **2022**, 126 (31), 12980–12993.

[2] Young, S. D.; Banerjee, A.; Pilania, G.; Goldsmith, B. R. Perovskite Oxynitrides as Tunable Materials for Electrocatalytic Nitrogen Reduction to Ammonia. *Trends in Chemistry* **2021**, 3 (9), 694–696.

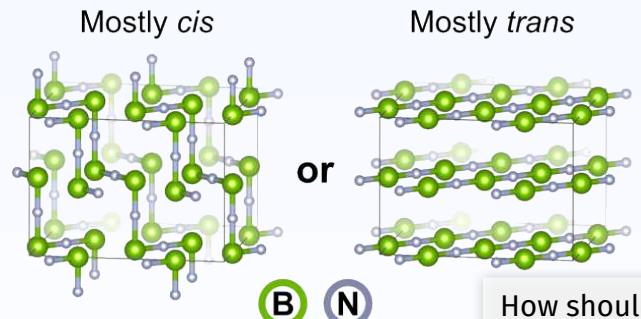
[3] Wang, Z.; Richards, D.; Singh, N. Recent Discoveries in the Reaction Mechanism of Heterogeneous Electrocatalytic Nitrate Reduction. *Catalysis Science & Technology* **2021**, 11 (3), 705–725.

What is a Perovskite Oxynitride (PON)?



$\text{ABO}_x\text{N}_{3-x}$

A Ca Ca La La ... ?
B Ti Cr Cr Re ... ?



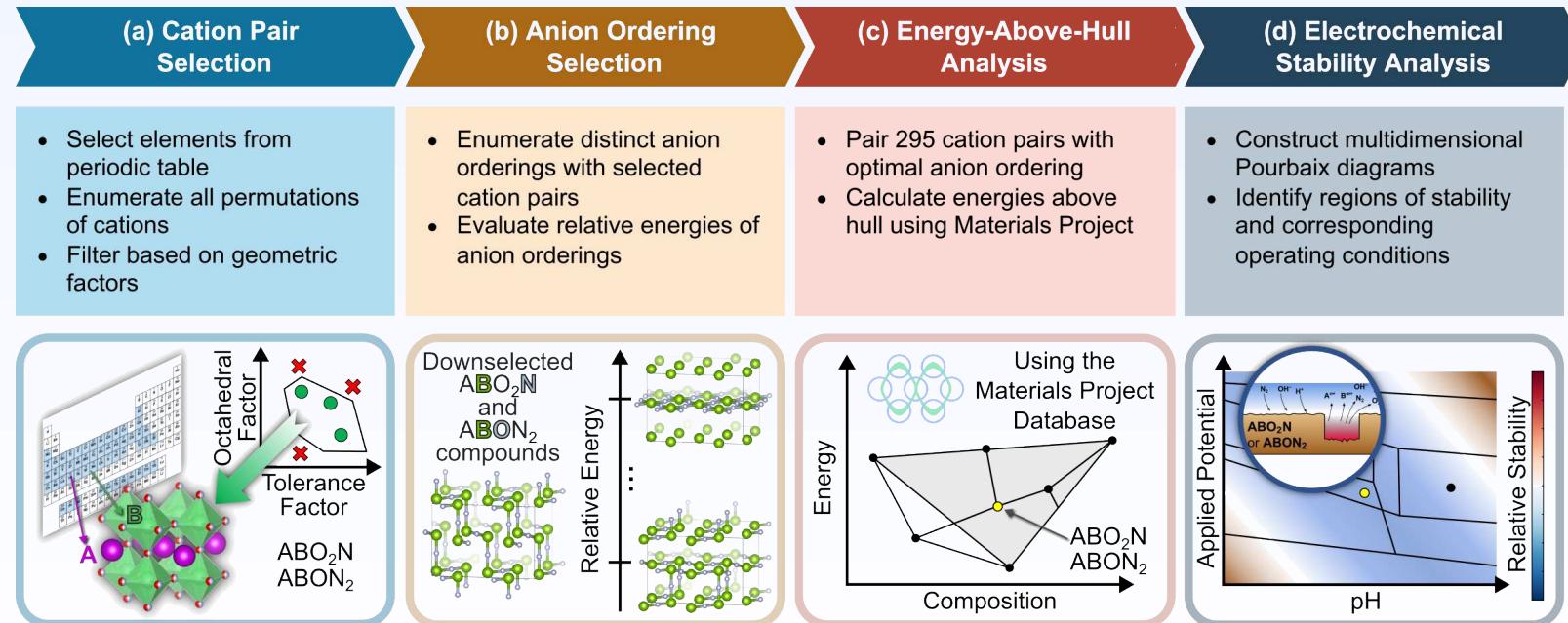
How should the N and O anions be arranged around the cell?

The structure and composition of a PON strongly impacts its performance and stability.

[1] Fuertes, A. Chemistry and applications of oxynitride perovskites. *J. Mater. Chem.* **22**, 3293–3299 (2012).

[2] Young, S. D.; Banerjee, A.; Pilania, G.; Goldsmith, B. R. Perovskite Oxynitrides as Tunable Materials for Electrocatalytic Nitrogen Reduction to Ammonia. *Trends in Chemistry* **2021**, 3 (9), 694–696.

Goal: Determine Thermodynamic Stability and Anion Ordering In ABO_2N And ABON_2 Perovskite Oxynitrides

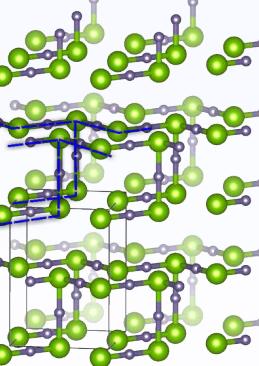
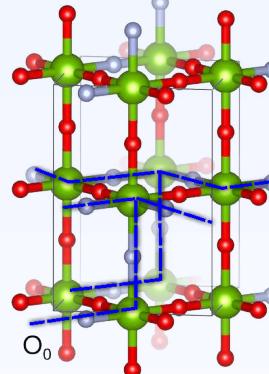


We Aim to Identify Preferred Anion Orderings

- For $\sqrt{2} \times \sqrt{2} \times 2$ supercell, there are 32 total symmetrically distinct anion orderings.^[1]



Low energy



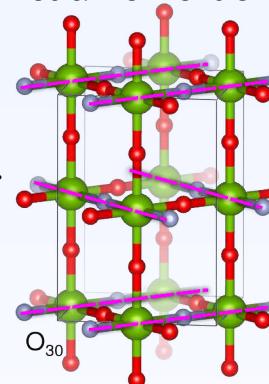
Topology



M = minority composition anion

Low energy

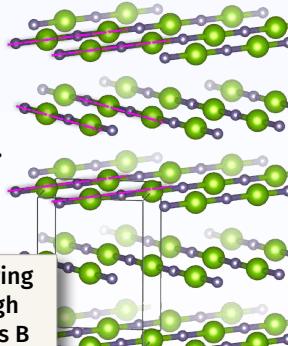
...30 more structures...



...30 more structures...

The most stable anion ordering (ordering O₀) contains a high degree of *cis* bonding across B atoms.

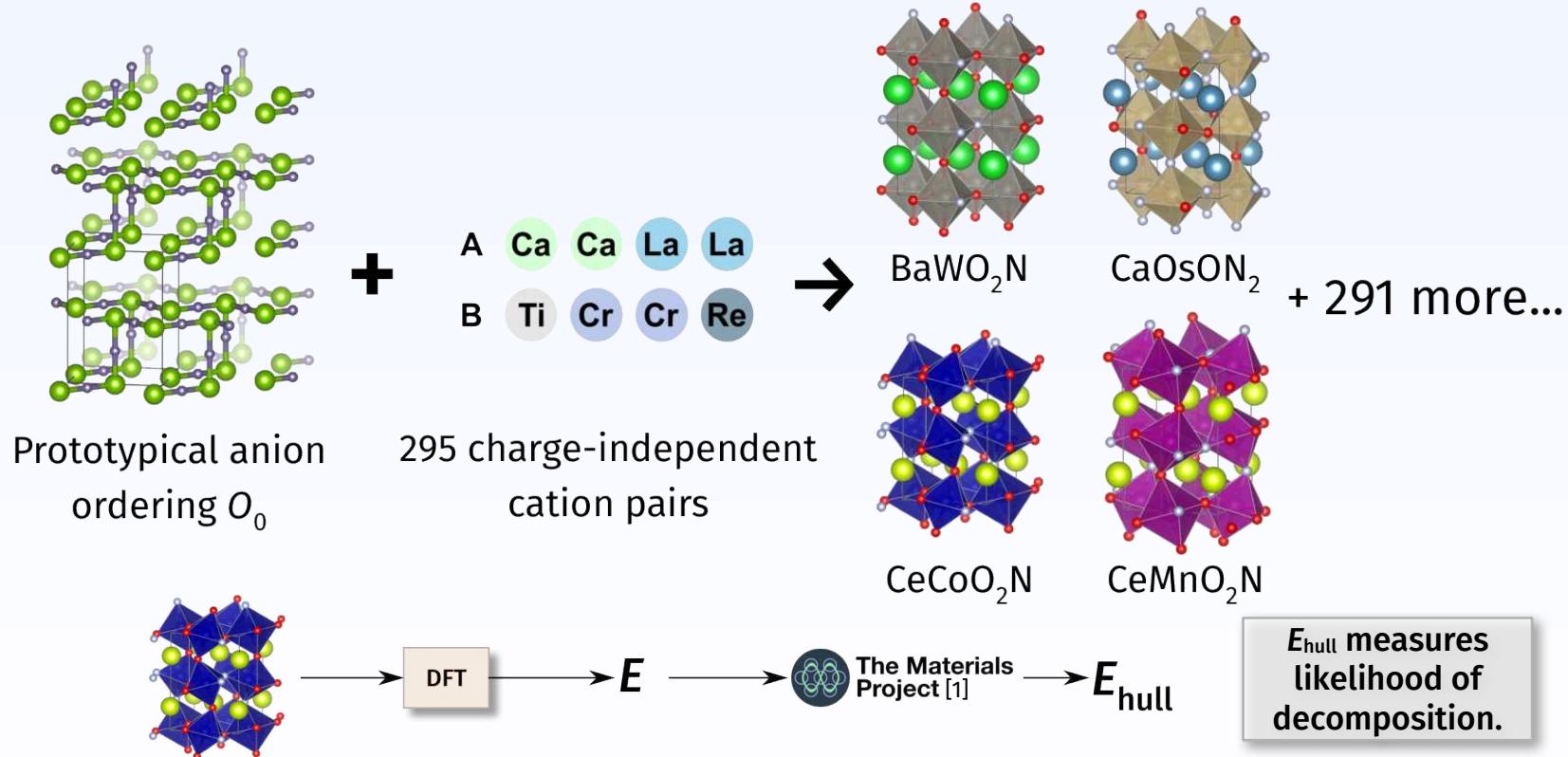
High energy



High energy

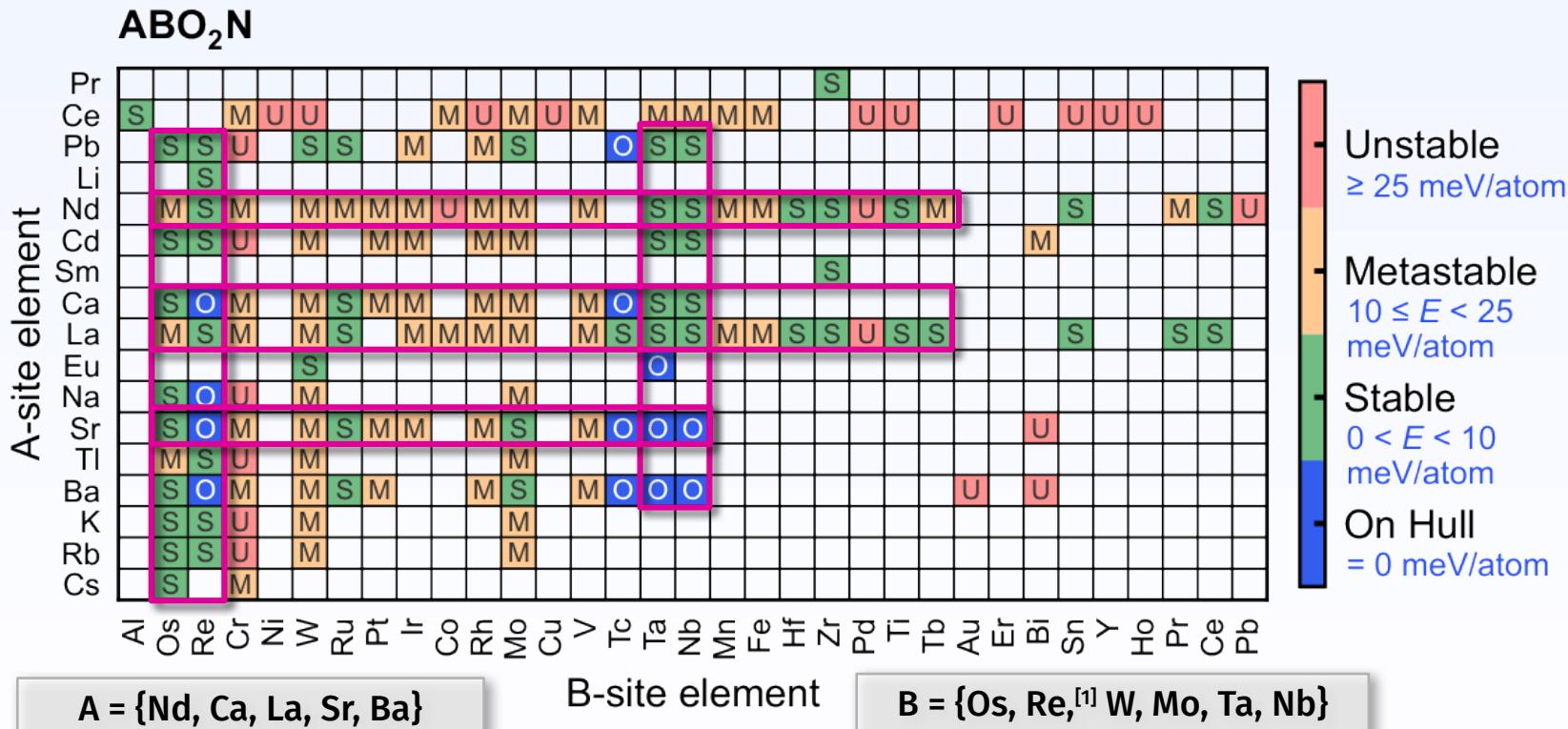
[1] Hart, G. L. W., Nelson, L. J. & Forcade, R. W. Generating derivative structures at a fixed concentration. *Computational Materials Science* **59**, 101–107 (2012).

Combine Optimal Anion Ordering with Cation Pairs



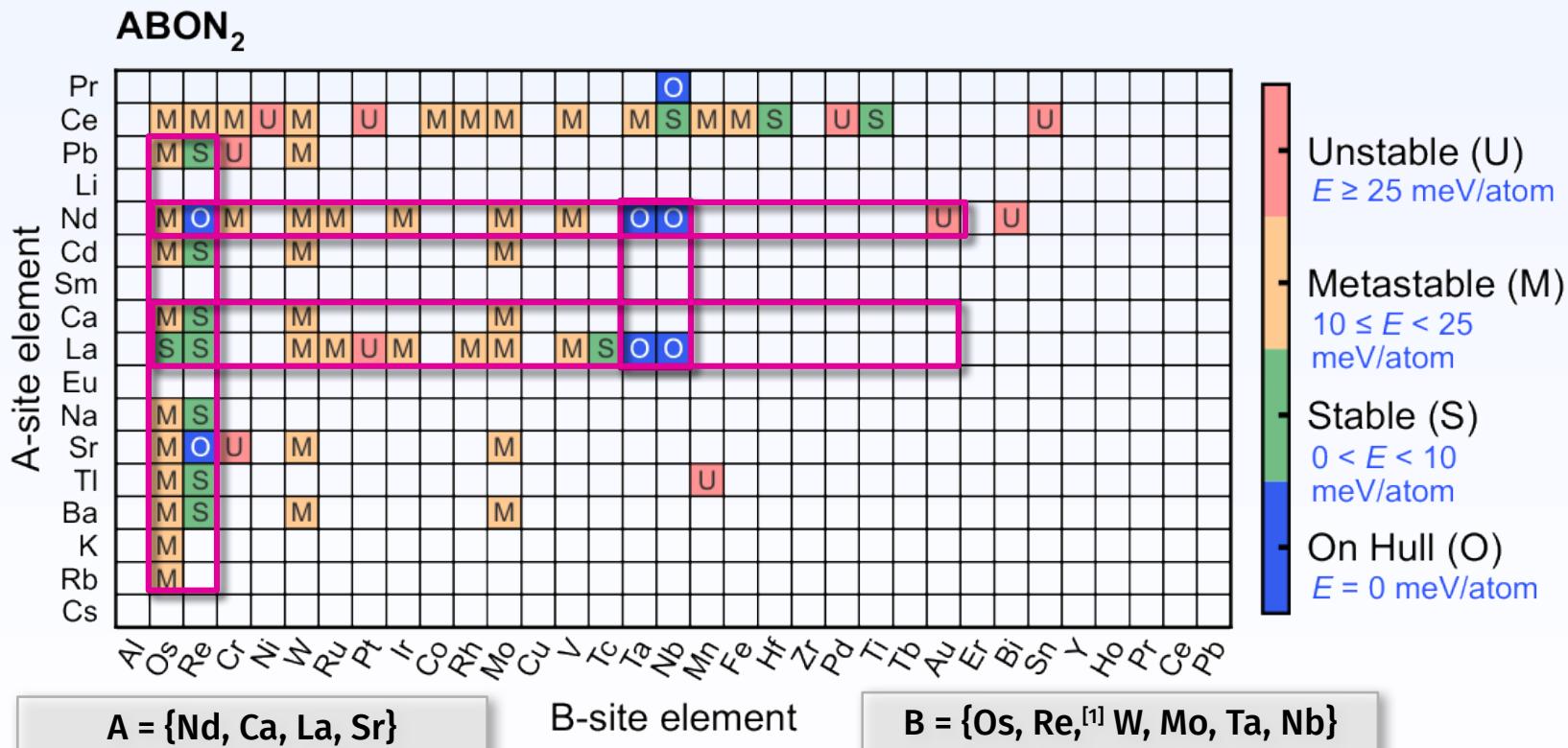
[1] Jain, A.; Ong, S. P.; Hautier, G.; Chen, W.; Richards, W. D.; Dacek, S.; Cholia, S.; Gunter, D.; Skinner, D.; Ceder, G.; Persson, K. A. Commentary: The Materials Project: A Materials Genome Approach to Accelerating Materials Innovation. *APL Materials* **2013**, 1(1), 011002. DOI: 10.1063/1.4812323.

We Identify 85 Stable PON Materials



Young, S.; Chen, J.; Sun, W.; Goldsmith, B.; Pilania, G. Thermodynamic Stability and Anion Ordering of Perovskite Oxynitrides. *ACS Chemistry of Materials*
2023. DOI: 10.1021/acs.chemmater.3c00943.

We Identify 85 Stable PON Materials

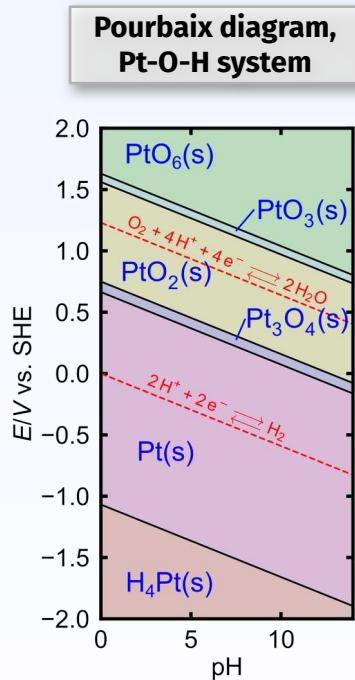


Young, S.; Chen, J.; Sun, W.; Goldsmith, B.; Pilania, G. Thermodynamic Stability and Anion Ordering of Perovskite Oxynitrides. *ACS Chemistry of Materials*
2023. DOI: 10.1021/acs.chemmater.3c00943.

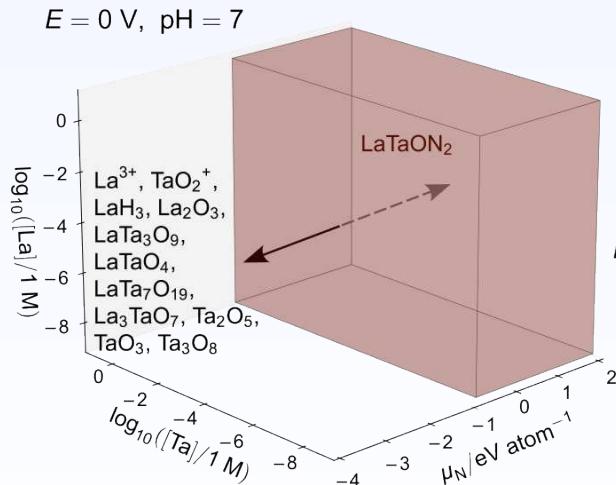
We Generate a Pourbaix Diagram for LaTaON₂



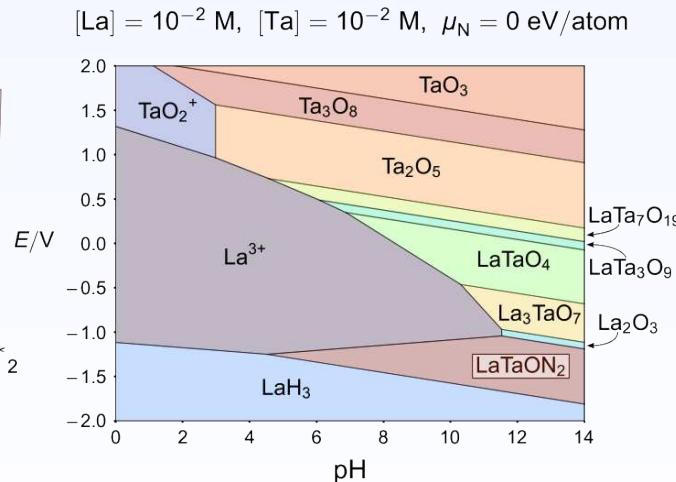
Jiadong Chen
Materials Science
Wen-hao Sun Lab
University of Michigan



Stability processing diagram
for the La-Ta-O-N-H system



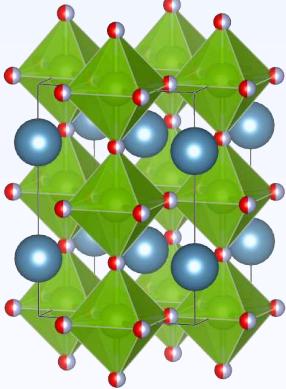
Pourbaix diagram, La-Ta-O-N-H
system, $\mu_{\text{La}} = \mu_{\text{Ta}} = 0$



LaTaON₂ potentially synthesizable with N-rich precursors; stable in alkaline conditions.

We Predict Many PONs That Are Waiting to be Synthesized

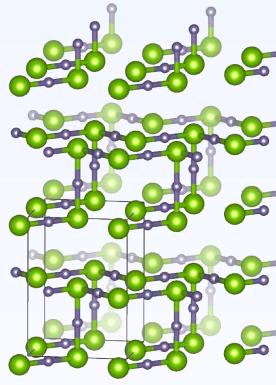
A B O N



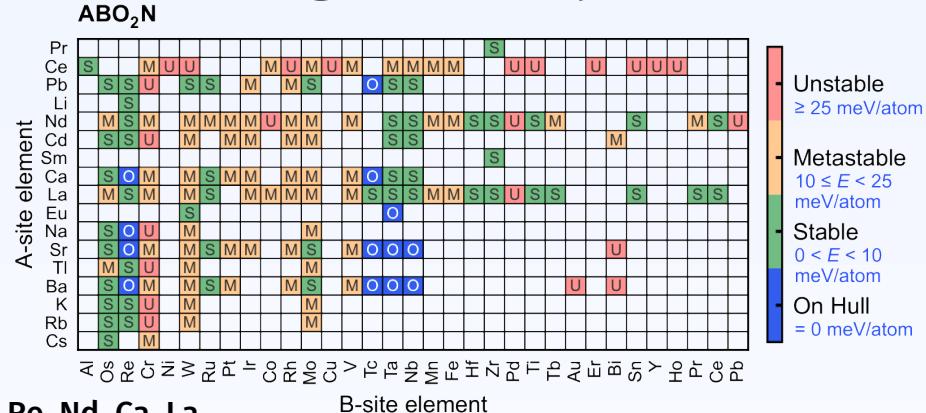
PONs are highly tunable in chemistry and ion ordering.

Ion-ordering-sensitive analysis could also be applied to complex perovskites, spinels, etc.

B M

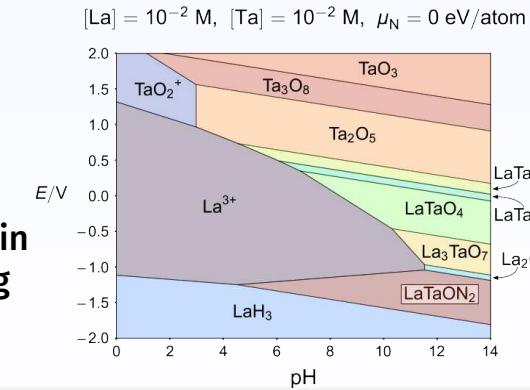


The optimal anion ordering has a high degree of M-B-M *cis* bonding.

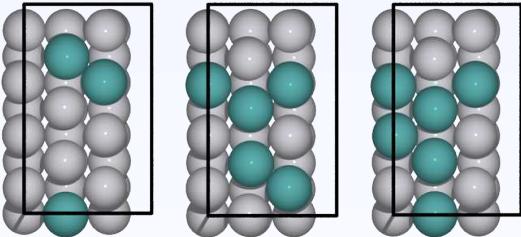


Os, Re, Nd, Ca, La, Sr, Ba, among others, correlate to PON stability.

LaTaON₂ is potentially stable in alkaline, reducing conditions.



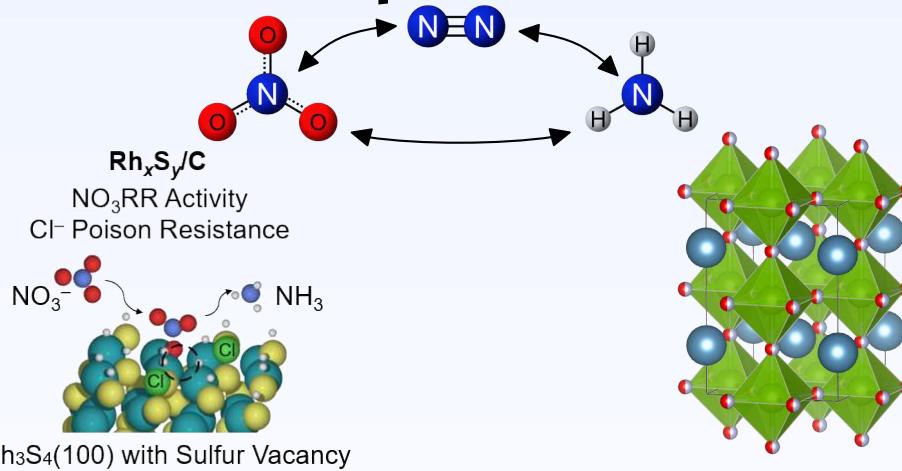
Effective Electrocatalysts Can Help Balance the Global Nitrogen Cycle



Pt₃Ru₁ more active and cheaper than Pt for NO₃RR.^[1]

Tuning alloy composition enables higher catalyst activity. Analysis of alloys can exploit results from pure metal studies.

Computational chemistry aids experimentalists and accelerates discovery of new catalyst materials.



Rh sulfide more active, less poisoned than Rh for NO₃RR.^[2]

As in other reactions, sulfur can help reduce halide poisoning. Surface vacancies may enable higher activity than on pure metals.

Cation chemistry correlates with stability; *cis* ordering is important.^[3]

Strategic searching in a combinatorial materials space can elucidate design guidelines without exhaustive calculations.

[1] Wang, Z.; Young, S. D.; Goldsmith, B. R.; Singh, N. *Journal of Catalysis* **2021**, 395, 143–154.

[2] Richards, D.; Young, S.; Goldsmith, B. R.; Singh, N. *Catal. Sci. Technol.* **2021**, 11 (22), 7331–7346.

[3] Young, S.; Chen, J.; Sun, W.; Goldsmith, B.; Pilania, G. *ACS Chemistry of Materials* **2023**.

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Innovation Graduate Fellows Program

Extreme Science and Engineering
Discovery Environment



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