



# Simulating Materials for Energy Conversion and Storage from First Principles

Ismaila Dabo

*Advances, Challenges, and Long-Term Opportunities of Electrochemistry*  
Chemical Sciences Roundtable · November 18, 2019



**PennState**  
College of Earth  
and Mineral Sciences

Department of Materials  
Science and Engineering  
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# Acknowledgements

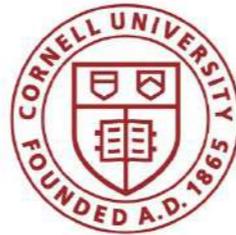
Venkatraman Gopalan  
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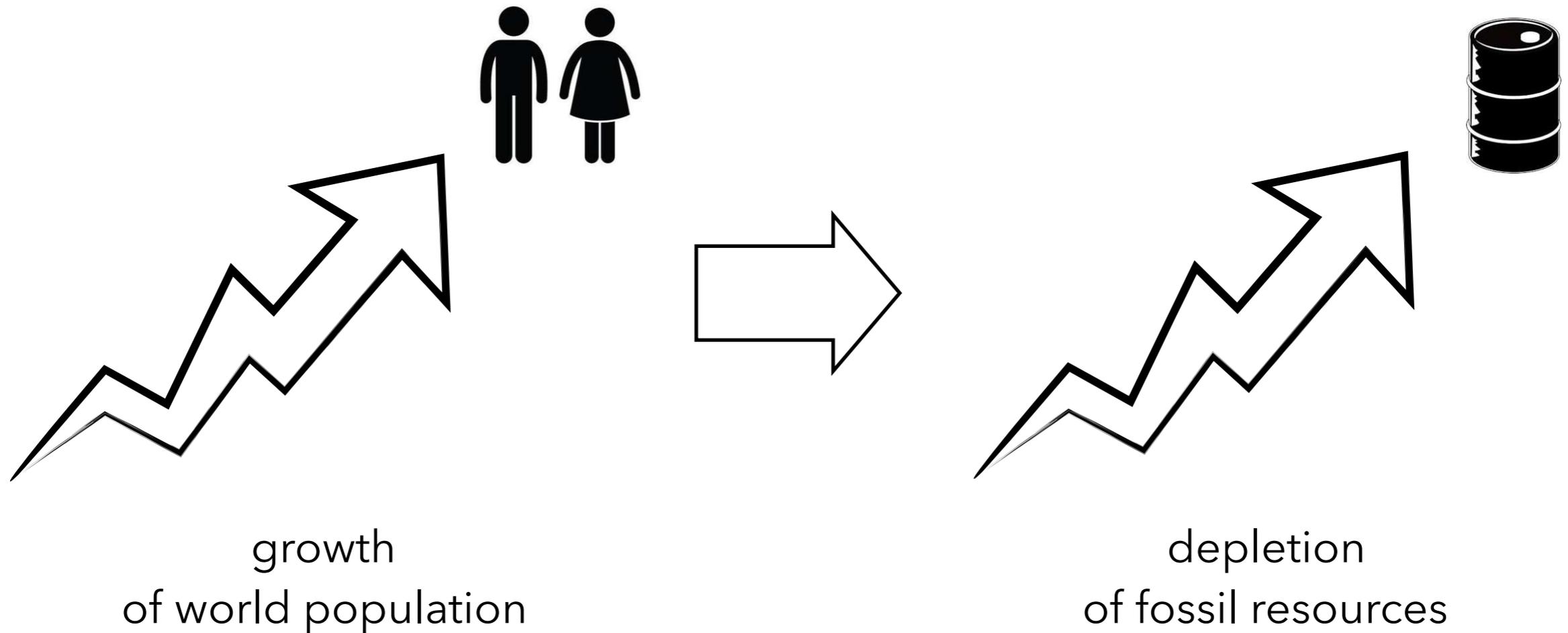
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Cathy Badding	Characterization of photocatalysts, Cornell
Steven Baksa	Modeling of interfaces, Penn State
Quinn Campbell	Screening of photocatalysts, Penn State
Chitiphon Chuaicham	Synthesis and characterization of photocatalysts, Kyushu
Julian Fanghanel	Synthesis and screening of photocatalysts, Penn State
James Goff	Modeling of fuel cell catalysts, Penn State
Nicole Hall-Kirchner	Modeling of interfaces, Penn State
Jared Mondschein	Synthesis of photocatalysts, Penn State
Paul Orbe	Modeling of interfaces (RET), Penn State
Xavier Quintana	Screening of photocatalysts (REU), Penn State
Tiffany Rivera	Synthesis of photocatalysts (REU), Penn State
Kriti Seth	Synthesis of photocatalysts, Penn State
Nathan Smith (REU)	Modeling of interfaces (REU), Penn State
Hugo Haiyu Wang	Characterization of photocatalysts, Penn State
Andrés Villarino	Characterization of photocatalysts, Cornell
Vincent Yihuang Xiong	Modeling of interfaces, Penn State

# How to achieve global energy sustainability?

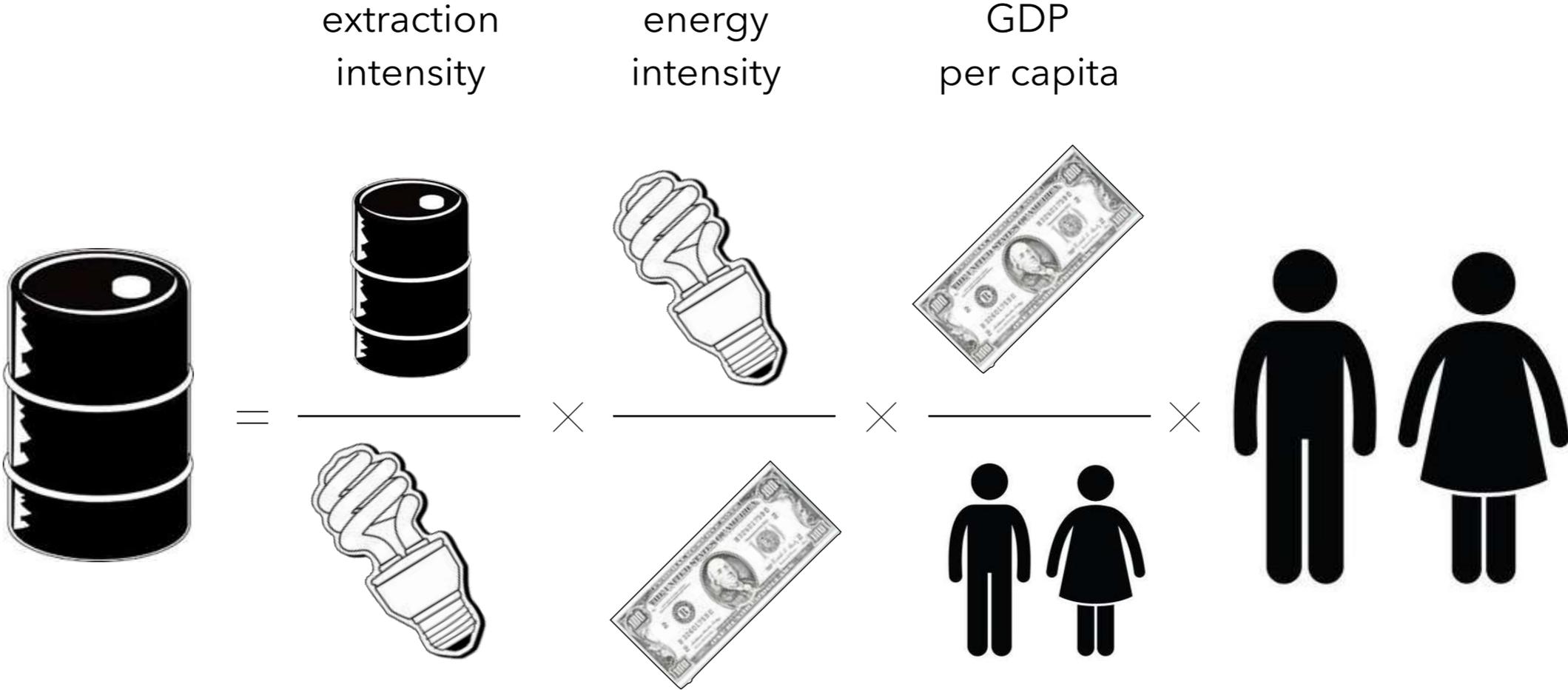
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To get a sense of the magnitude of the challenge...



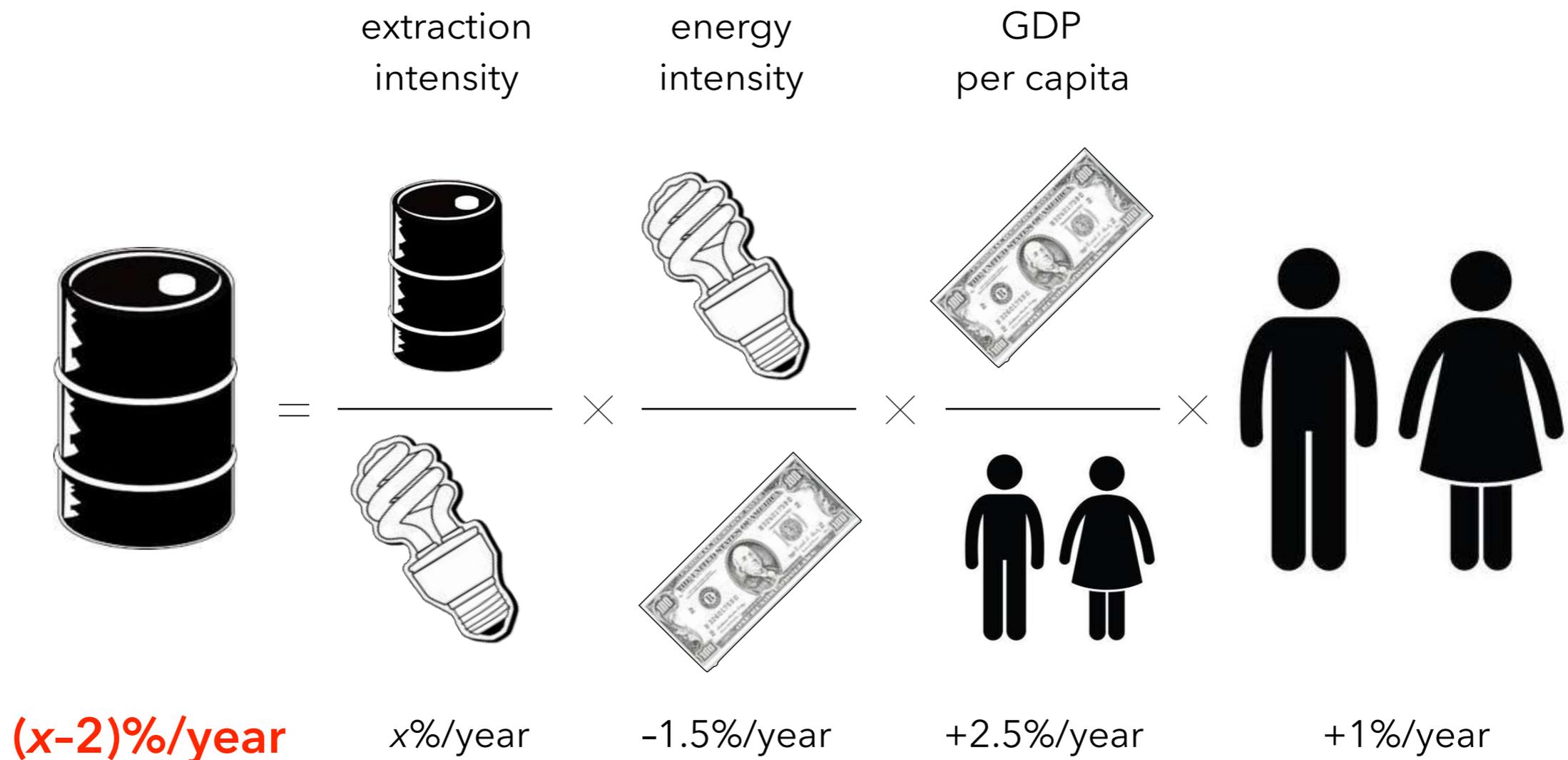
# How to achieve global energy sustainability?

The relation involves **3 factors**



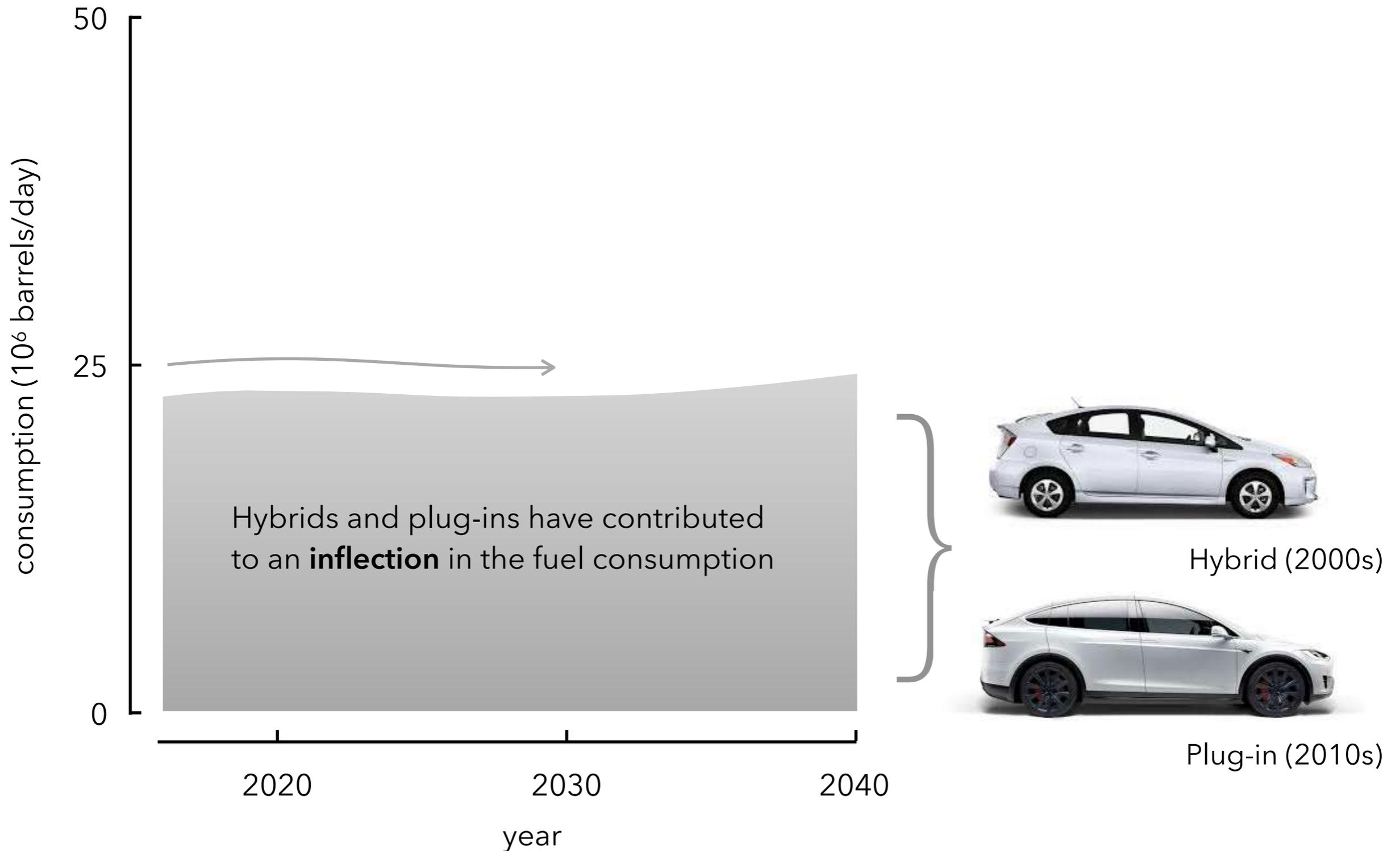
# How to achieve global energy sustainability?

The **pace** of the transition to renewables must be **>2%/year**



World Bank, *World Development Indicators* (2018)  
Enerdata, *Global Energy Statistical Yearbook* (2019)

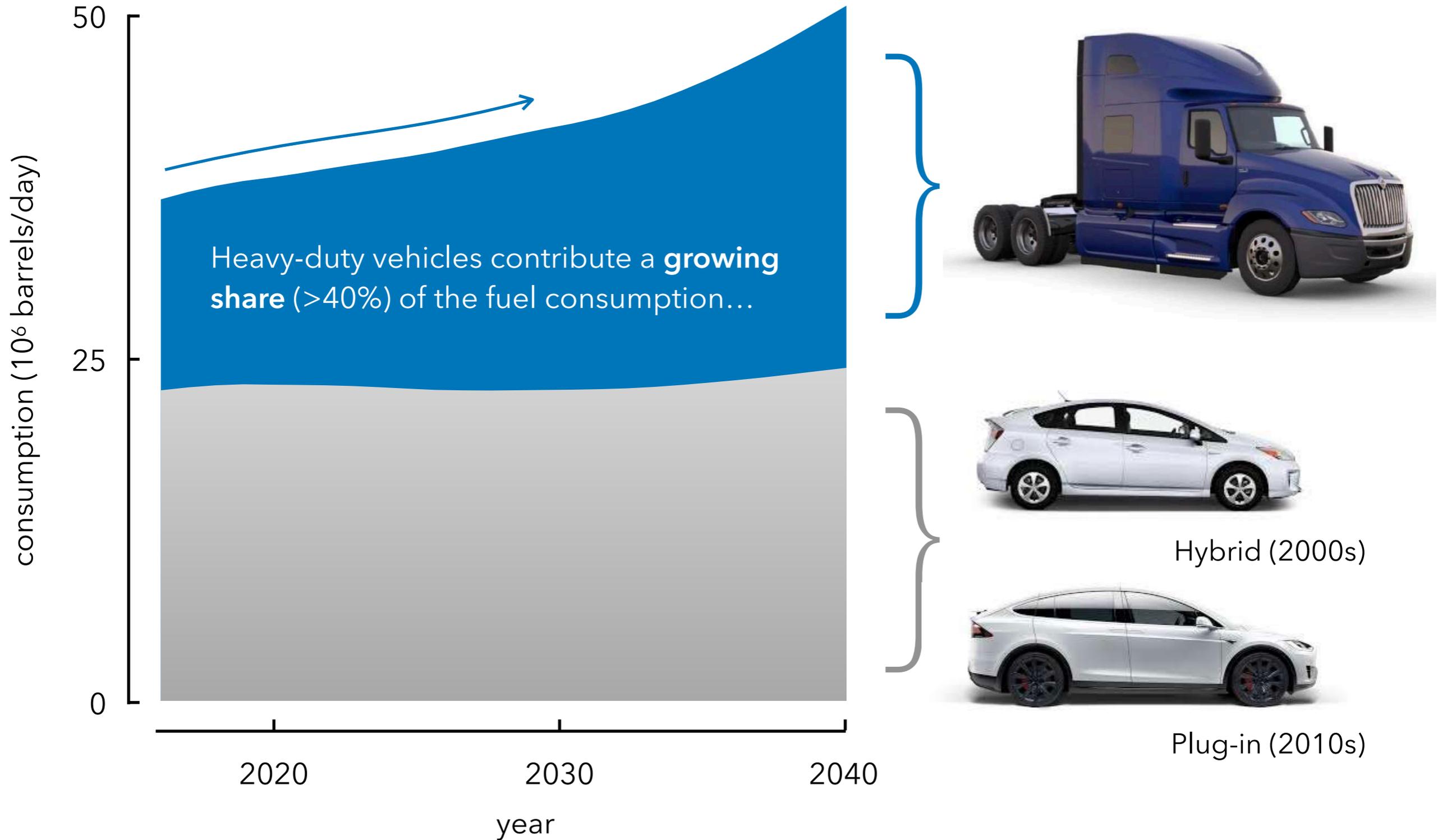
# Some reasons to be optimistic...



U.S. Energy Information Administration, *Annual Energy Outlook* (2018)

International Energy Agency, *Global Electric Vehicle Outlook: 'Two Million and Counting'* (2017)

# Some reasons to worry...



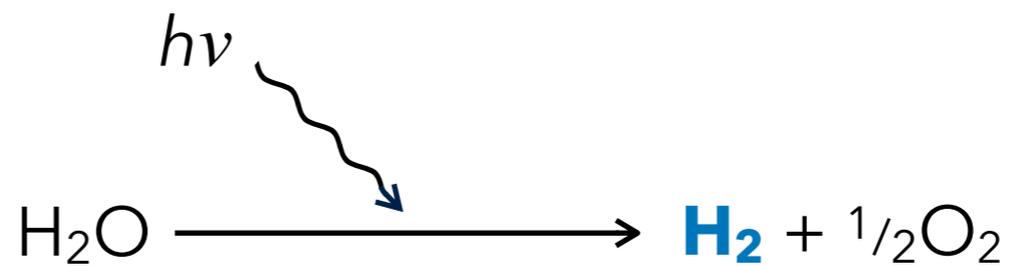
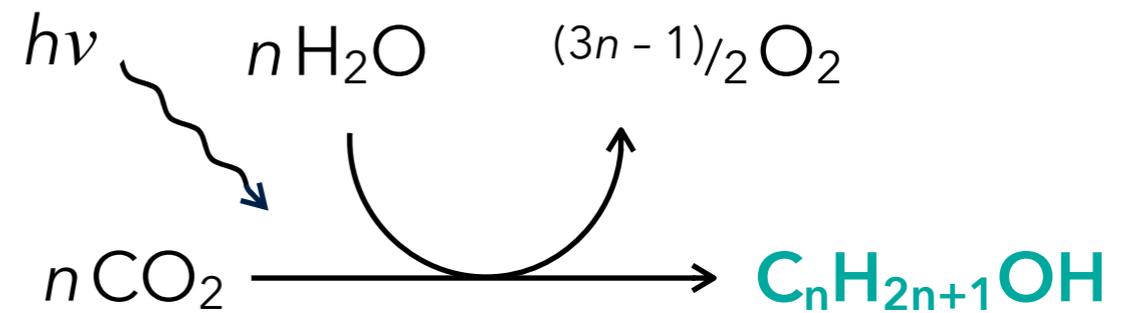
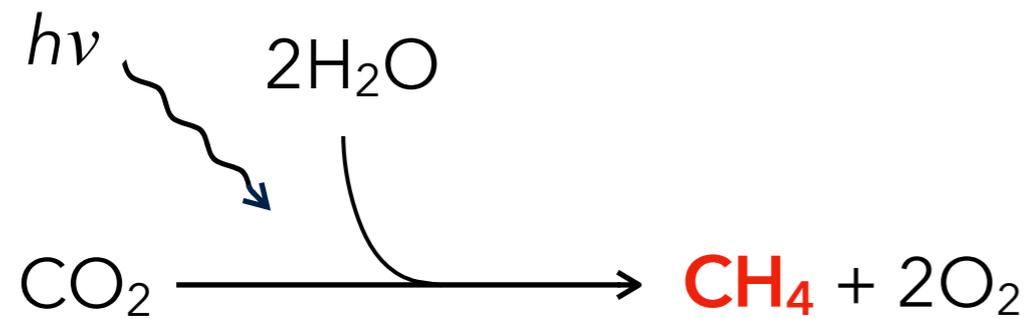
U.S. Energy Information Administration, *Annual Energy Outlook* (2018)

International Energy Agency, *Global Electric Vehicle Outlook: 'Two Million and Counting'* (2017)

# Artificial photosynthesis as a sustainable option

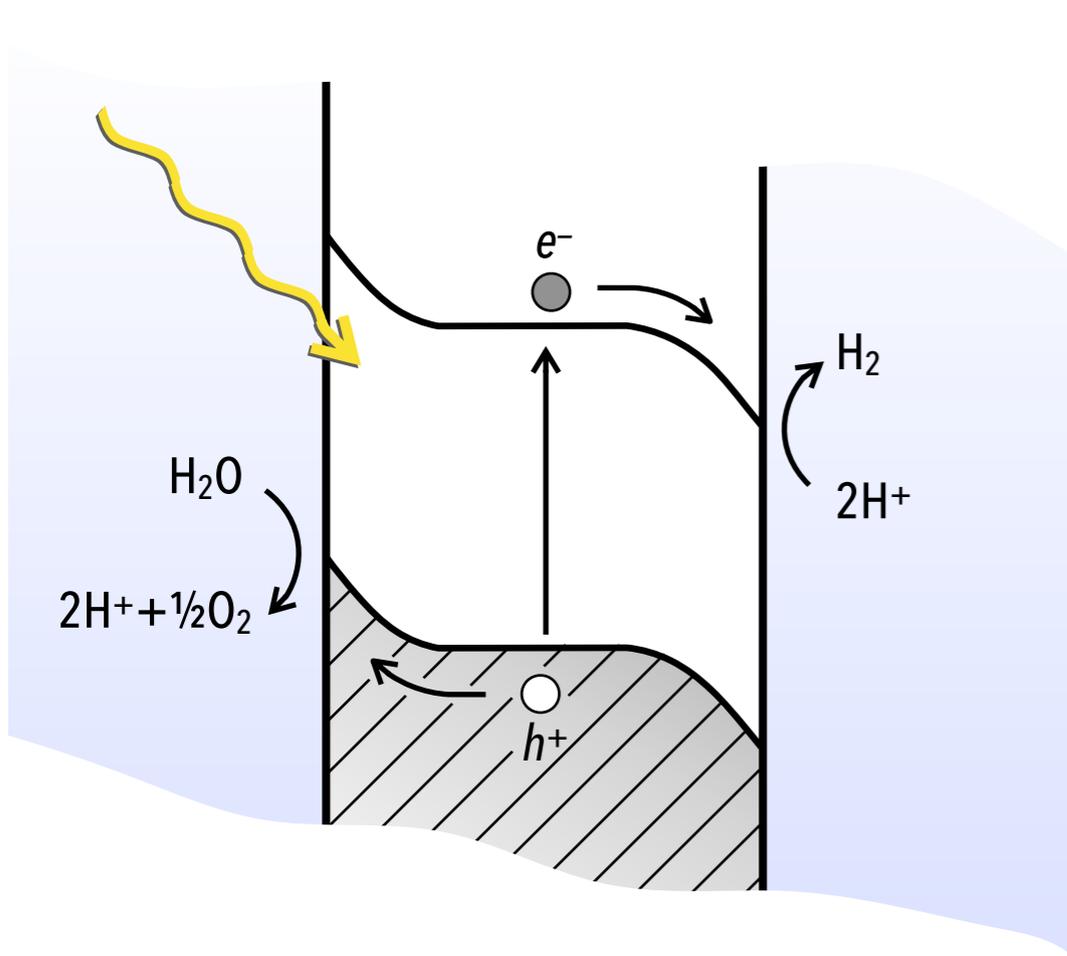
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Artificial photosynthesis uses sunlight to convert carbon dioxide and water into chemical fuels

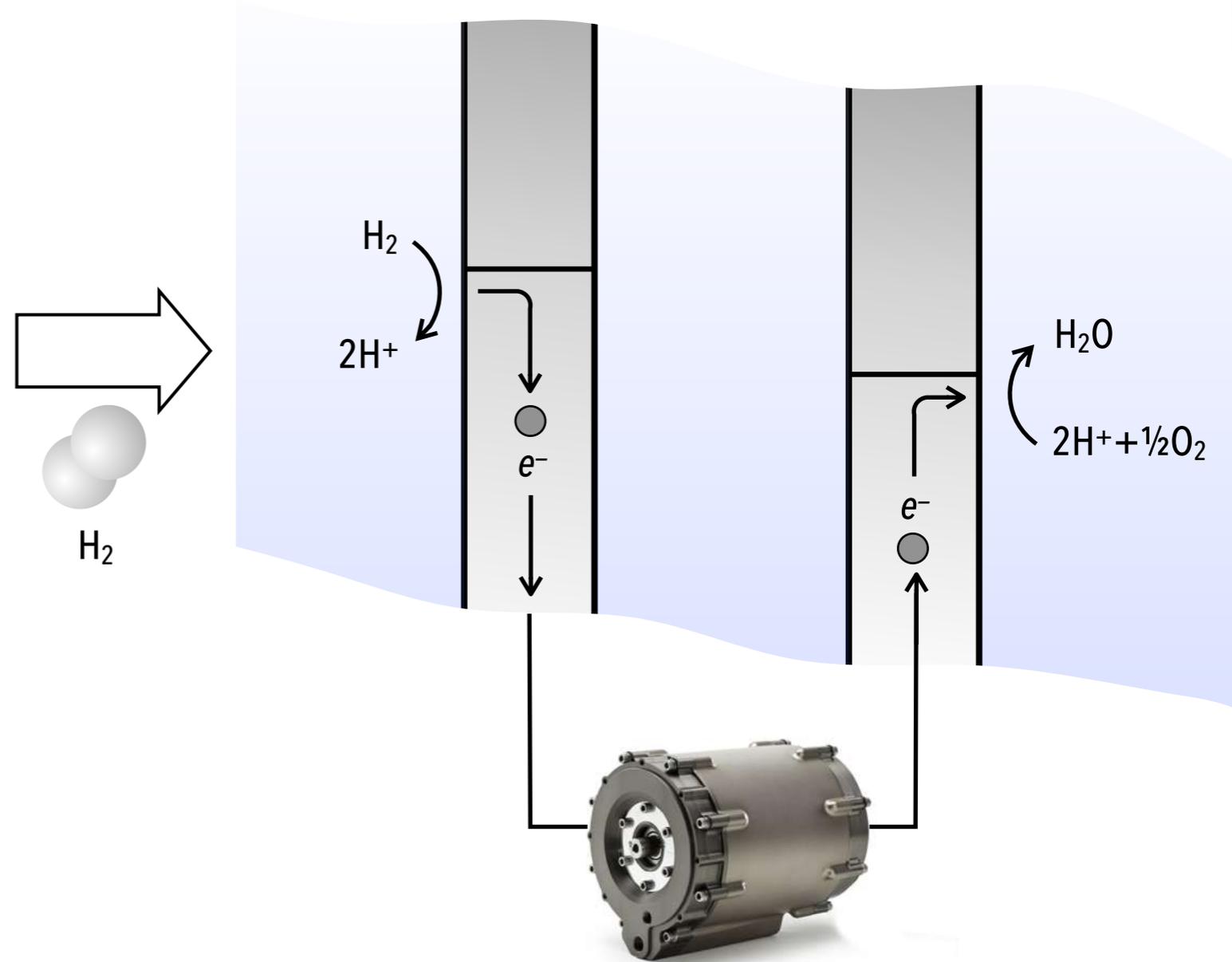


# Hydrogen as energy carrier

Water splitting can be promoted on a photocatalytic semiconductor



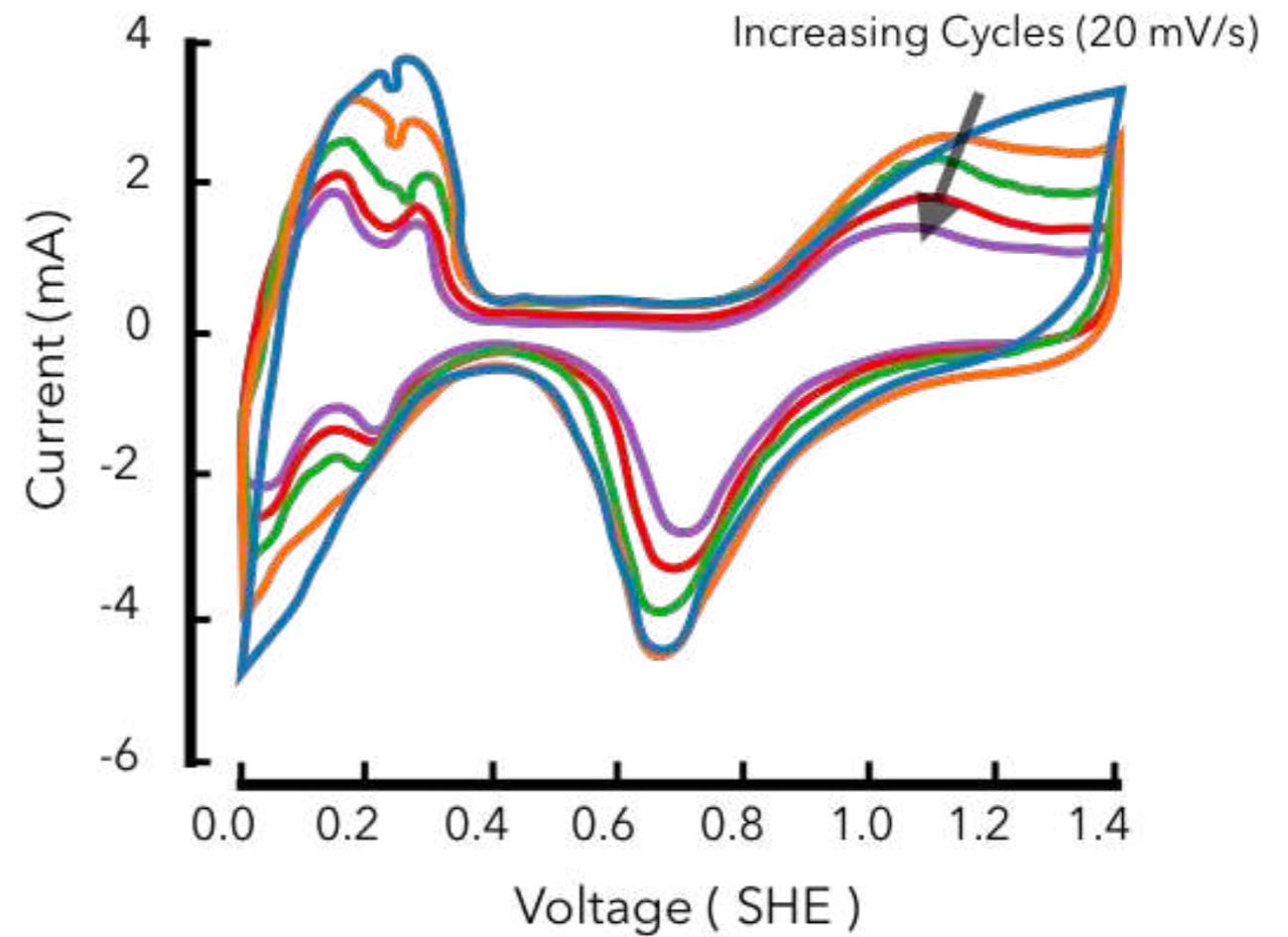
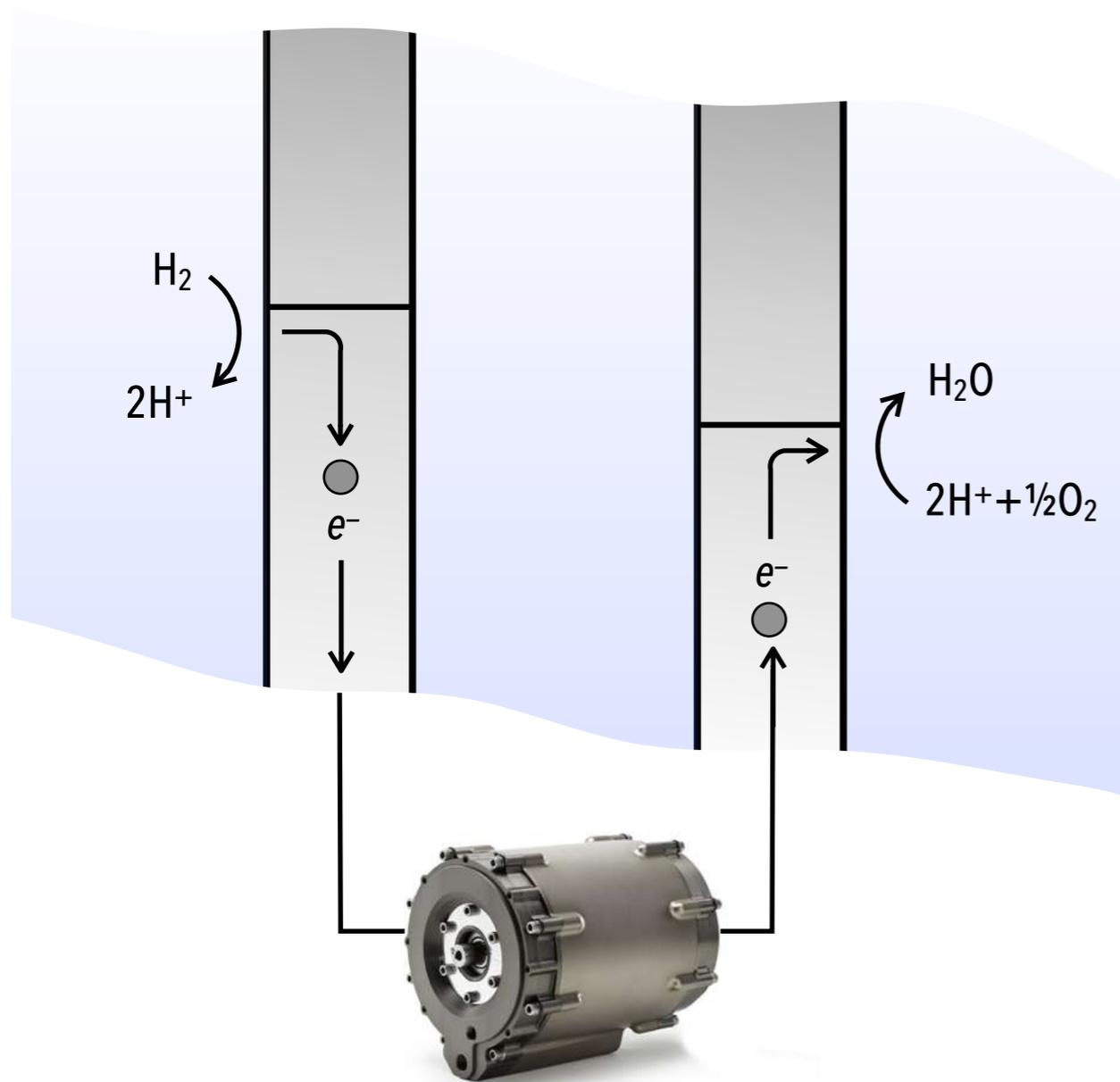
The process can be reversed in a fuel cell to produce electrical work



The cycle can be repeated, making hydrogen an attractive **energy carrier**

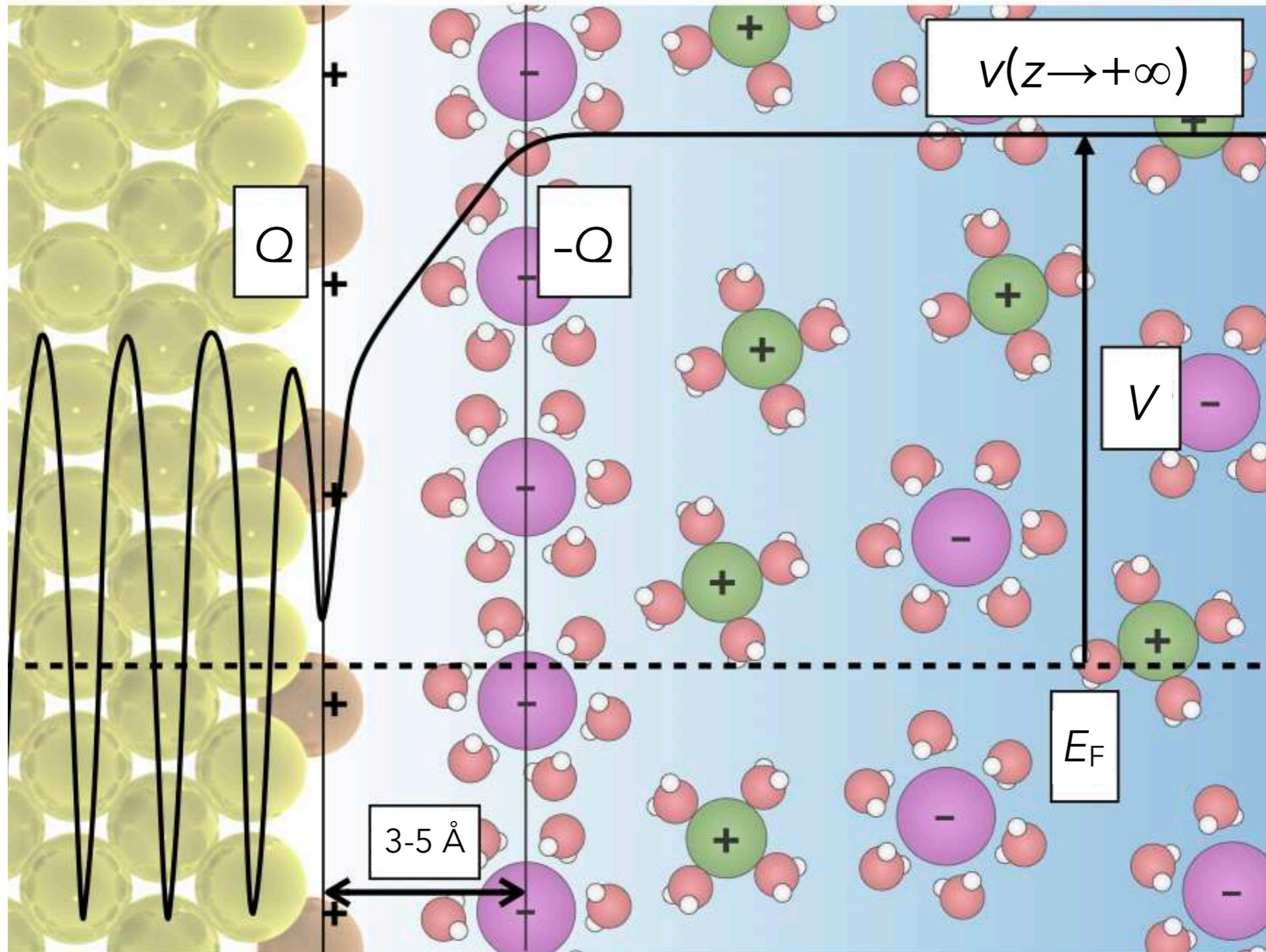
# Challenge: Durability of fuel-cell electrodes

The voltage window of fuel cells is limited due to the dissolution of catalytic nanoparticles



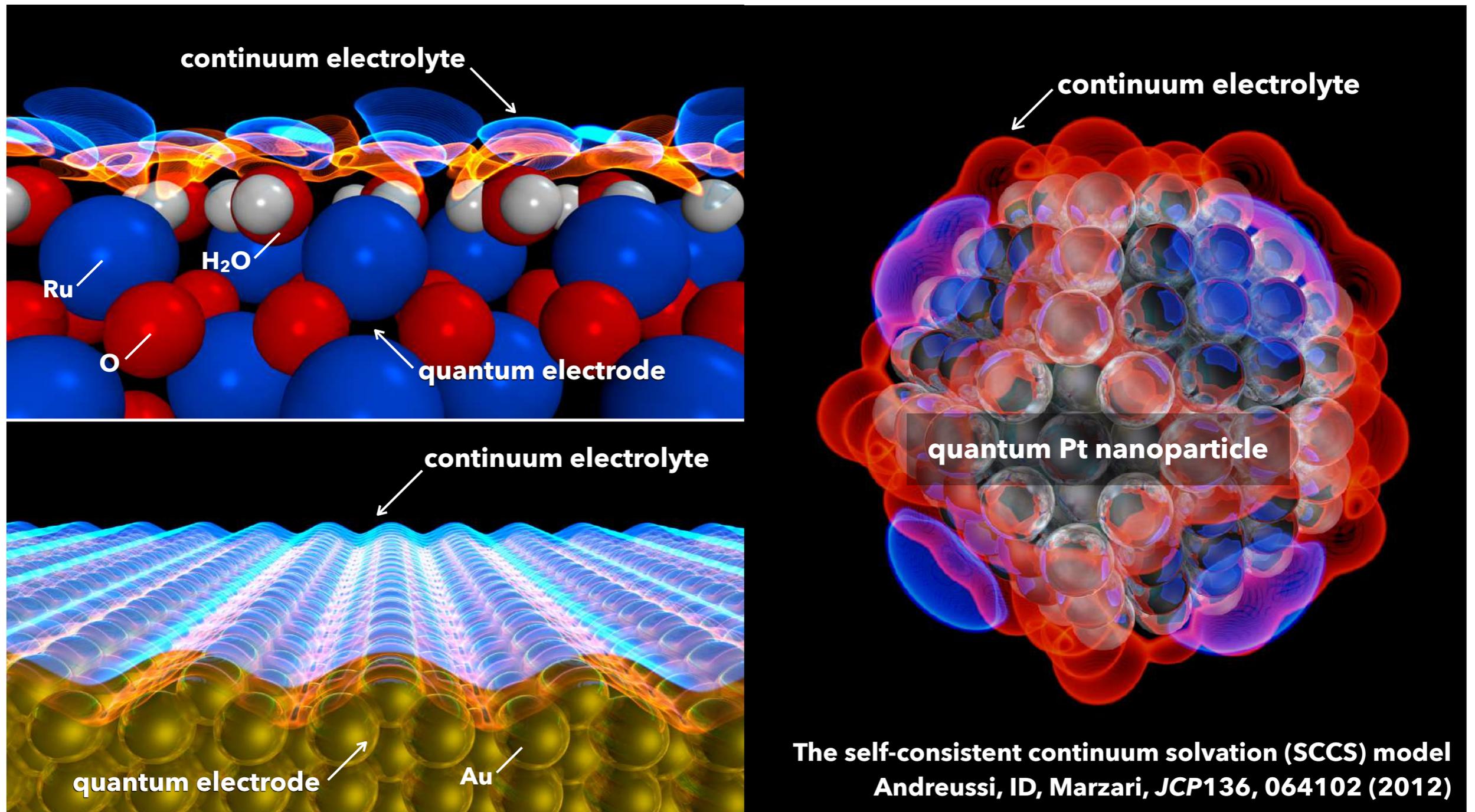
# Simulating electrochemical interfaces

Increasing the voltage causes charge accumulation and interface polarization



# How to account for long-range interface polarization in quantum simulations?

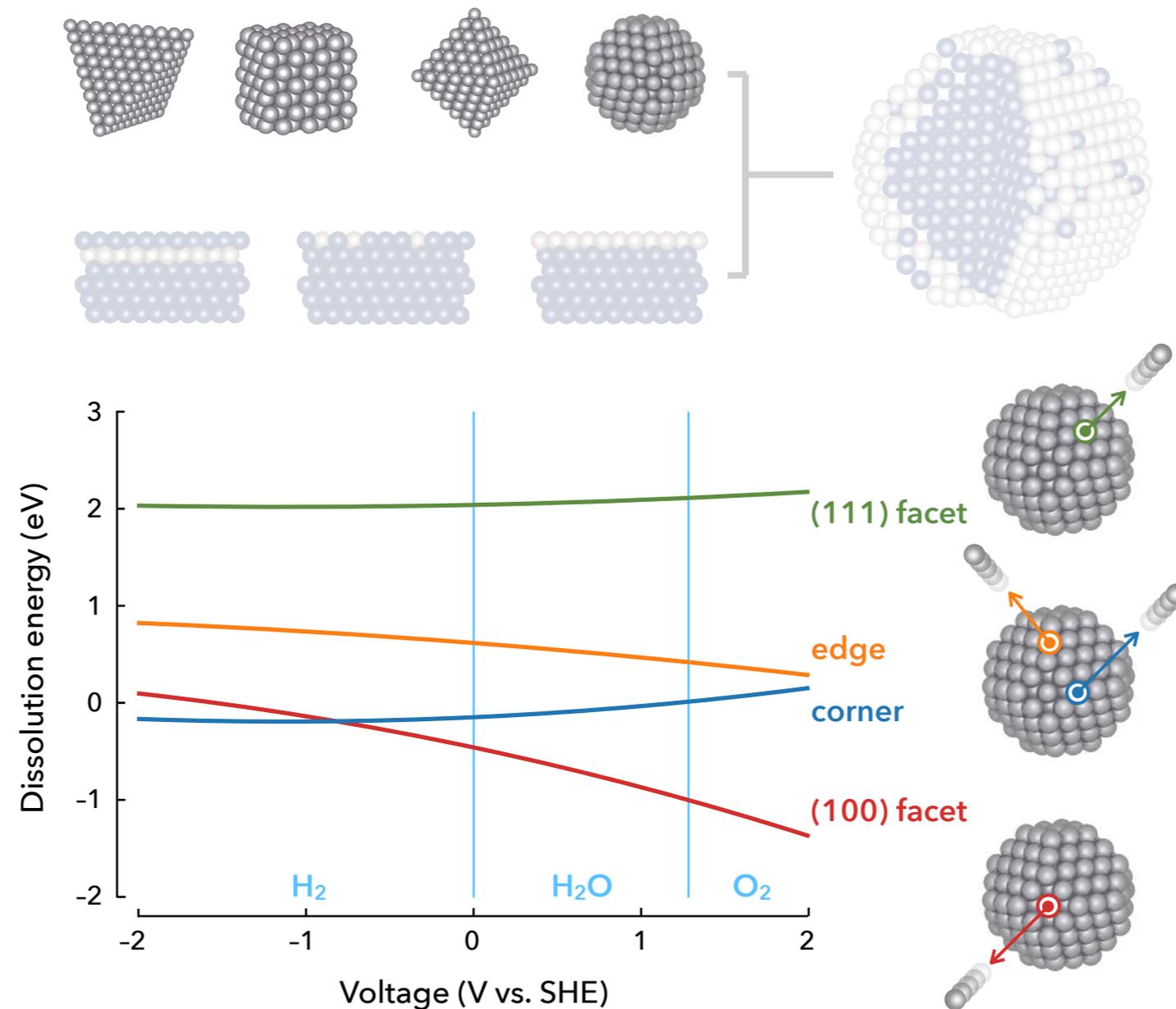
Quantum-continuum embedding is an effective approach to model quantum systems in electrochemical environments



The self-consistent continuum solvation (SCCS) model  
Andreussi, ID, Marzari, *JCP*136, 064102 (2012)

# Predicting electrochemical dissolution and restructuring

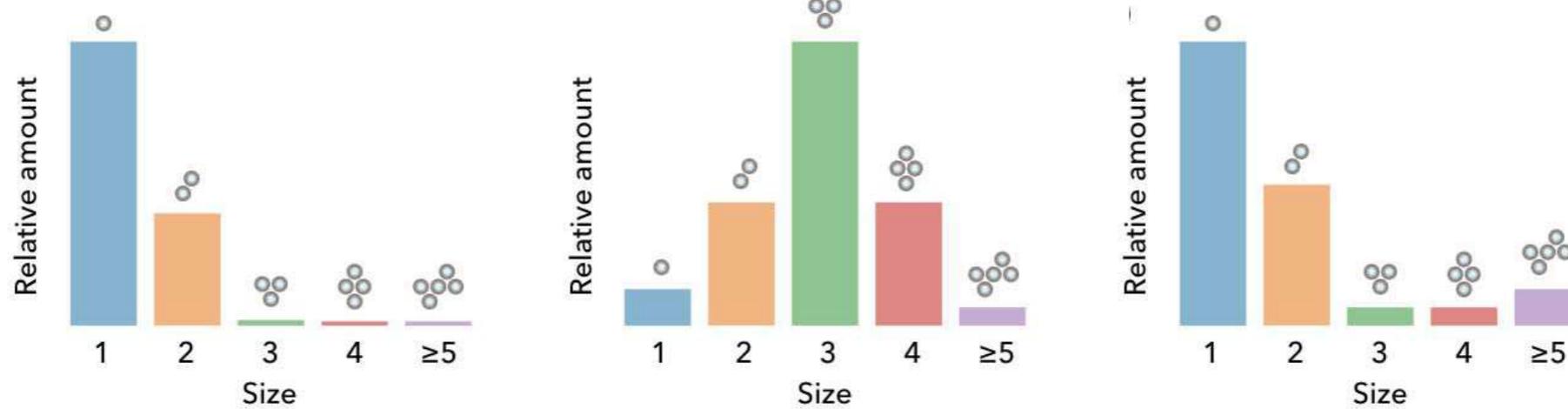
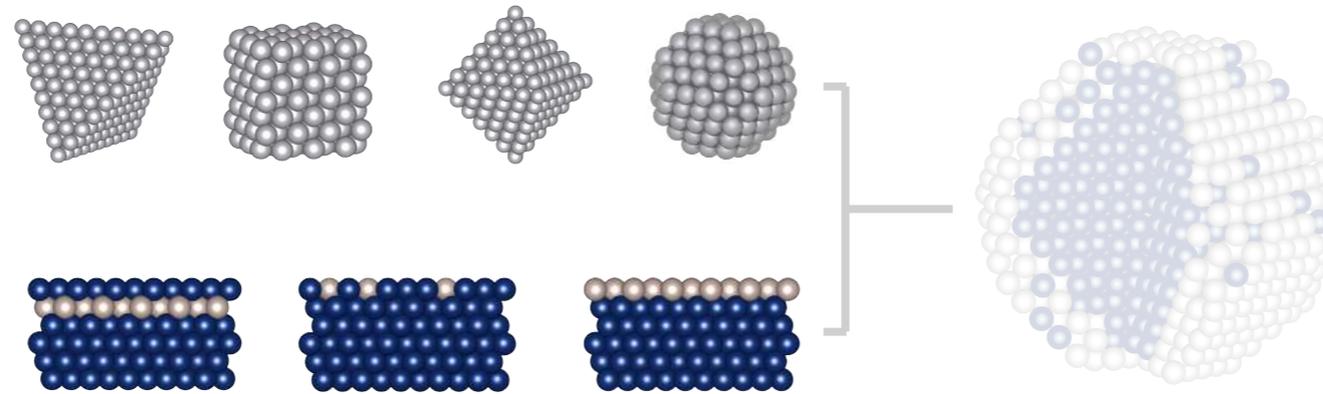
The ability to model electrochemical systems is of interest to understand which surface sites are the most susceptible to electrochemical dissolution...



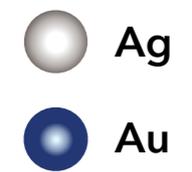
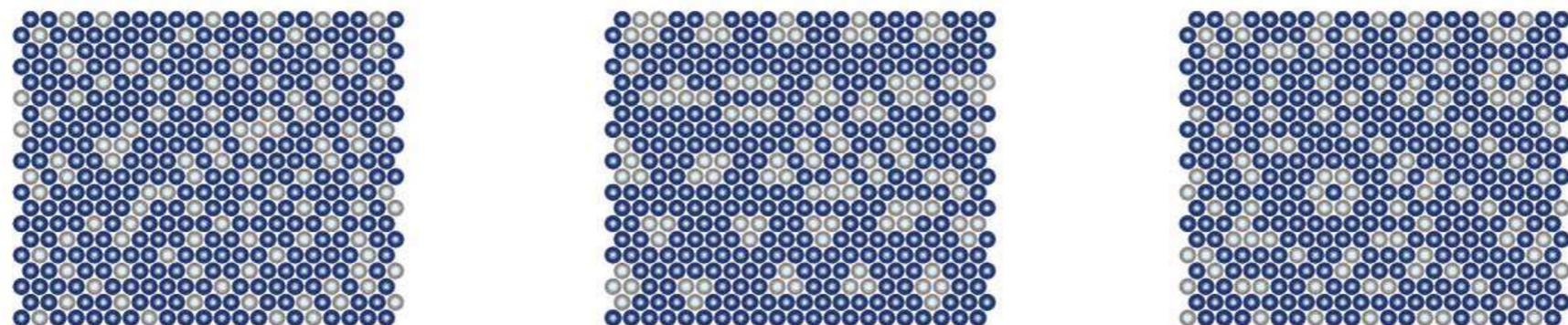
Goff, Sinnott, ID, *Journal of Chemical Physics* (submitted, 2019)  
Weitzner and ID, *Journal of Chemical Physics* 150, 041715 (2019)

# Predicting electrochemical dissolution and restructuring

The model can predict the influence of the voltage on clustering trends at bimetallic electrodes

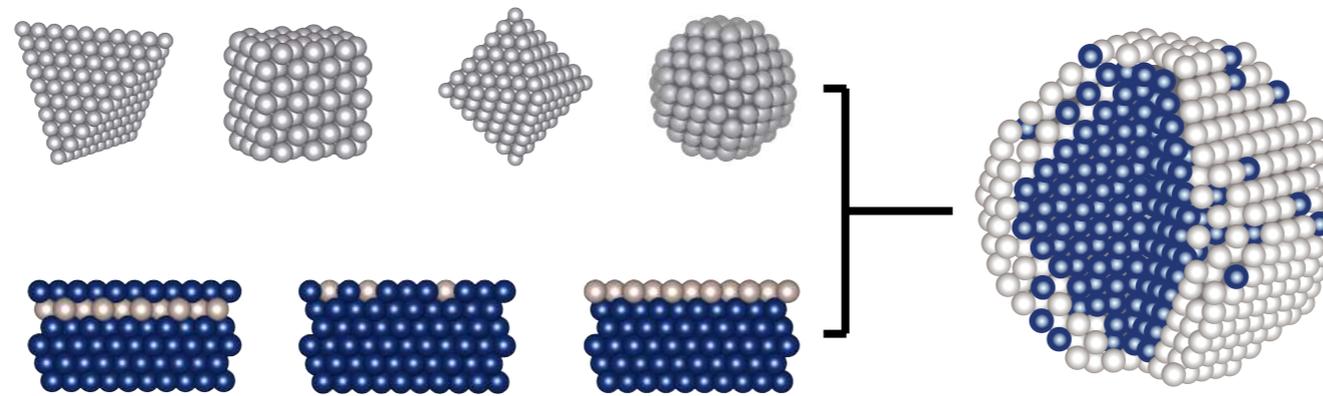


Cluster-expansion  
Monte-Carlo simulation  
under voltage

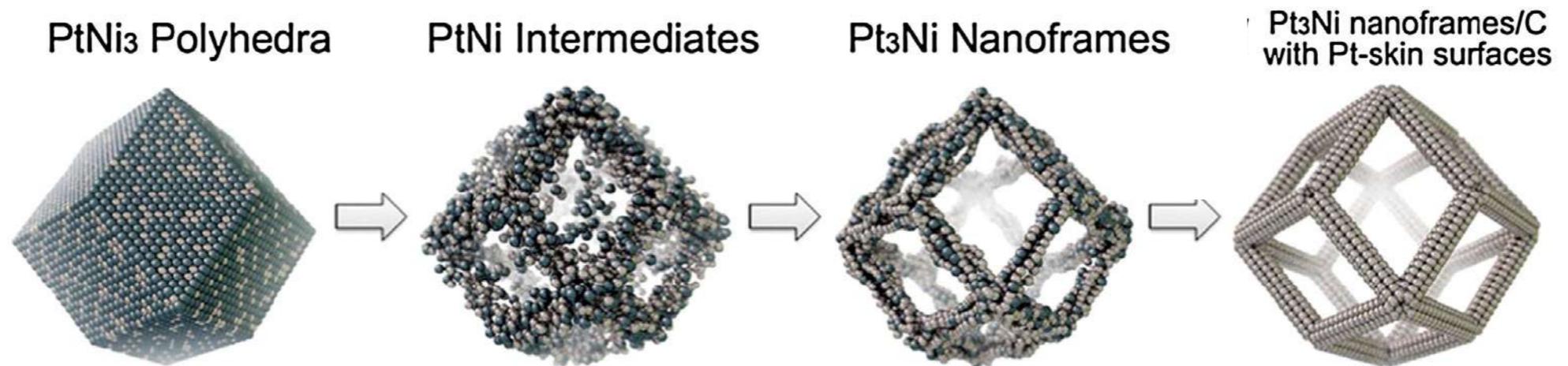


# Predicting electrochemical dissolution and restructuring

The model is being developed to tackle the stability of bimetallic and shape-controlled nanoparticles...

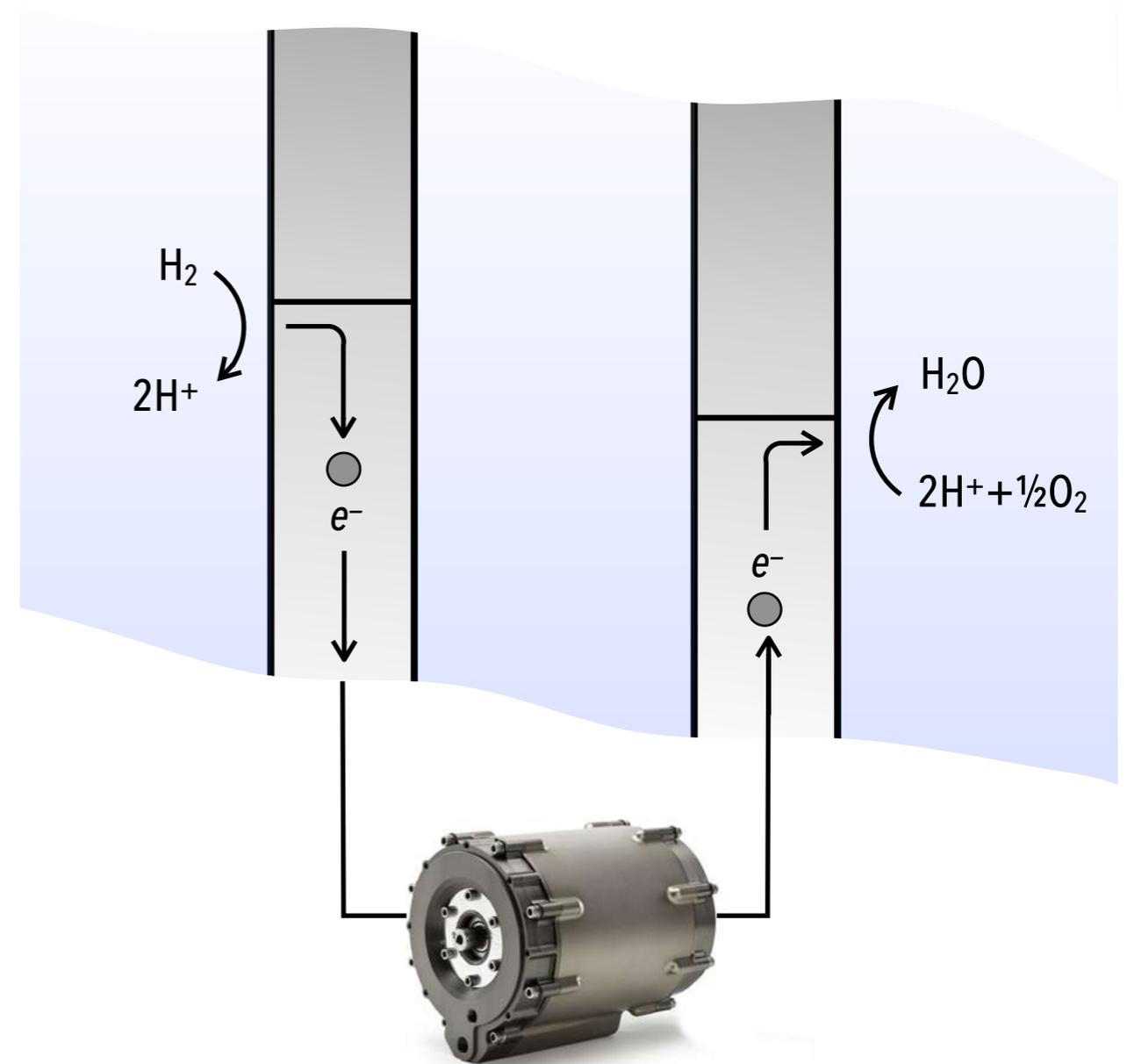
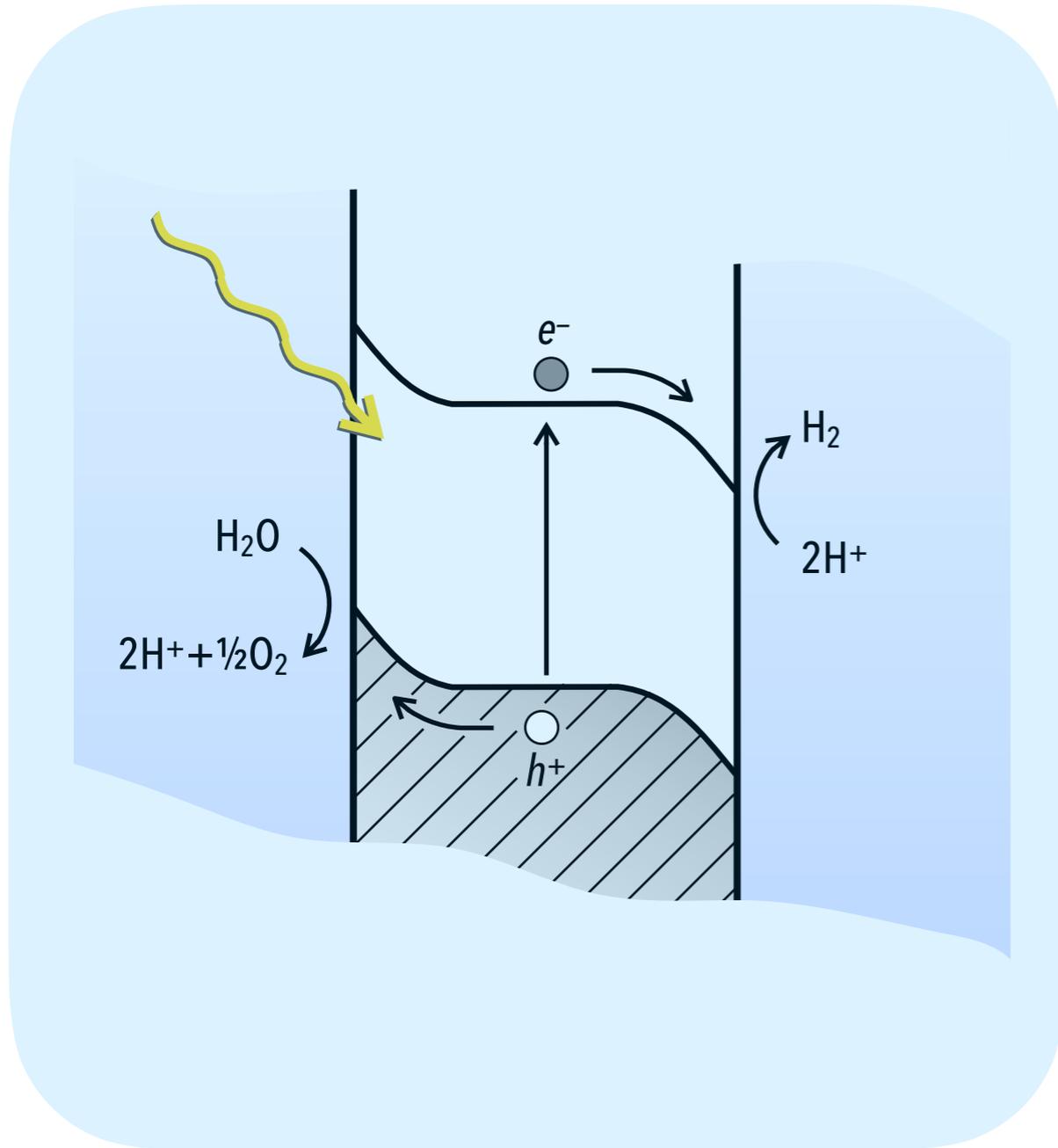


DOE, Office of Science, Basic Energy Sciences, CPIMS Program, Award No. DE-SC0018646 (2018)



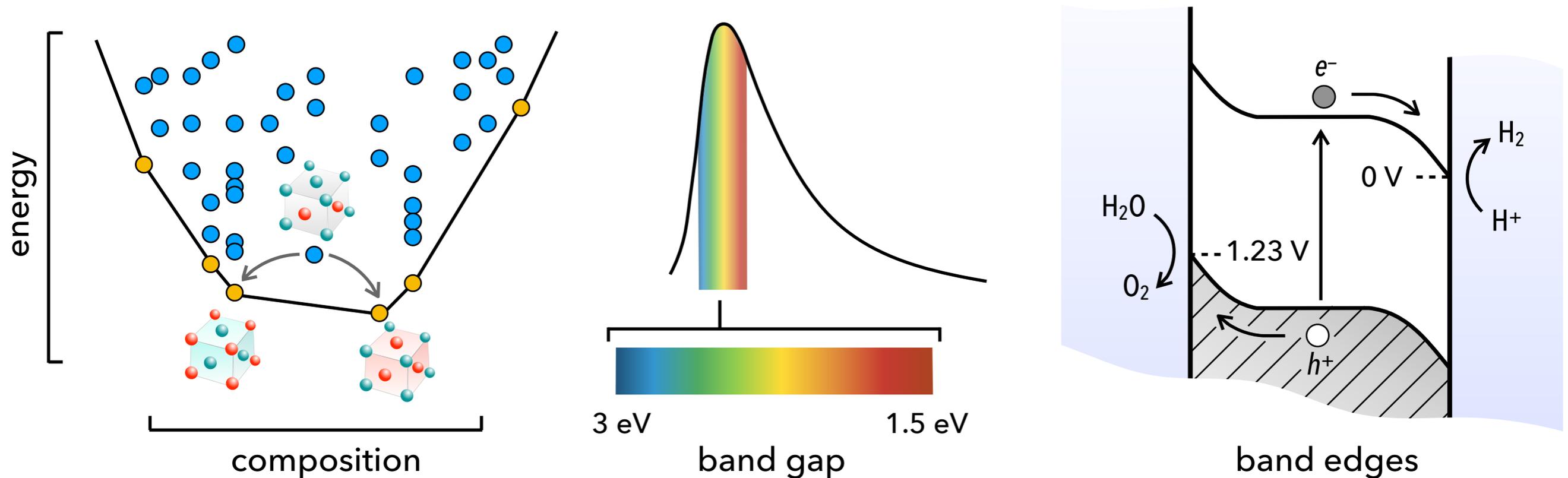
Kang, Yang, Markovic, Stamenkovic, *Nano Today* 11, 587 (2016)

# Challenge: Discovering water-splitting semiconductors



# First-principles computational screening

Fundamental **properties** of relevance to water splitting can be calculated from first principles



The **success** of this screening is critically dependent on the reliability of the first-principles approximation

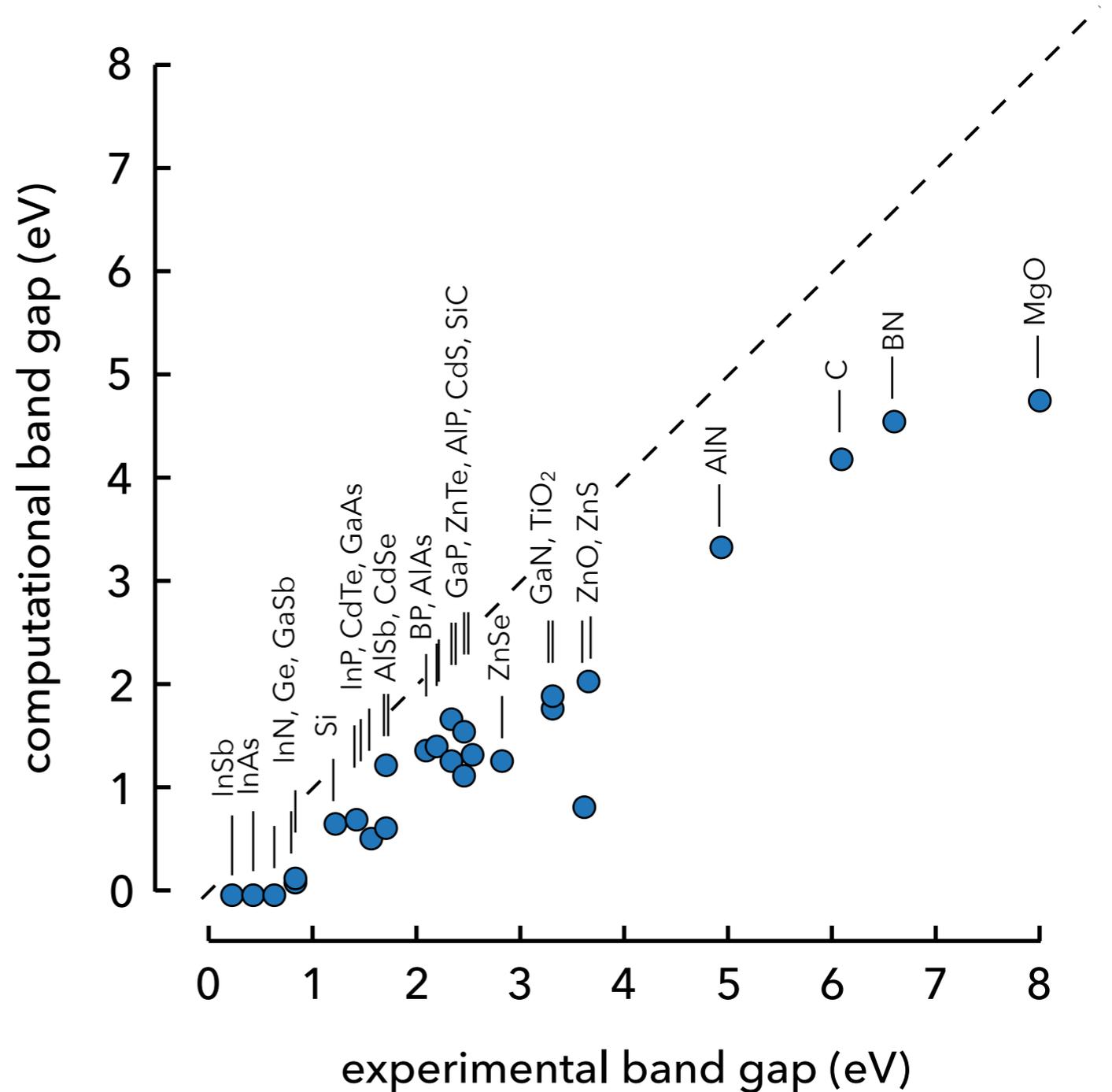
# What makes a reliable prediction?

many-body

$$H\Psi = E\Psi$$

one-body

$$h\rho\phi = \varepsilon\phi$$



Borghini *et al.*, *PRB* 90, 075135 (2015)  
 ID *et al.*, *PRB* 82, 115121 (2010)

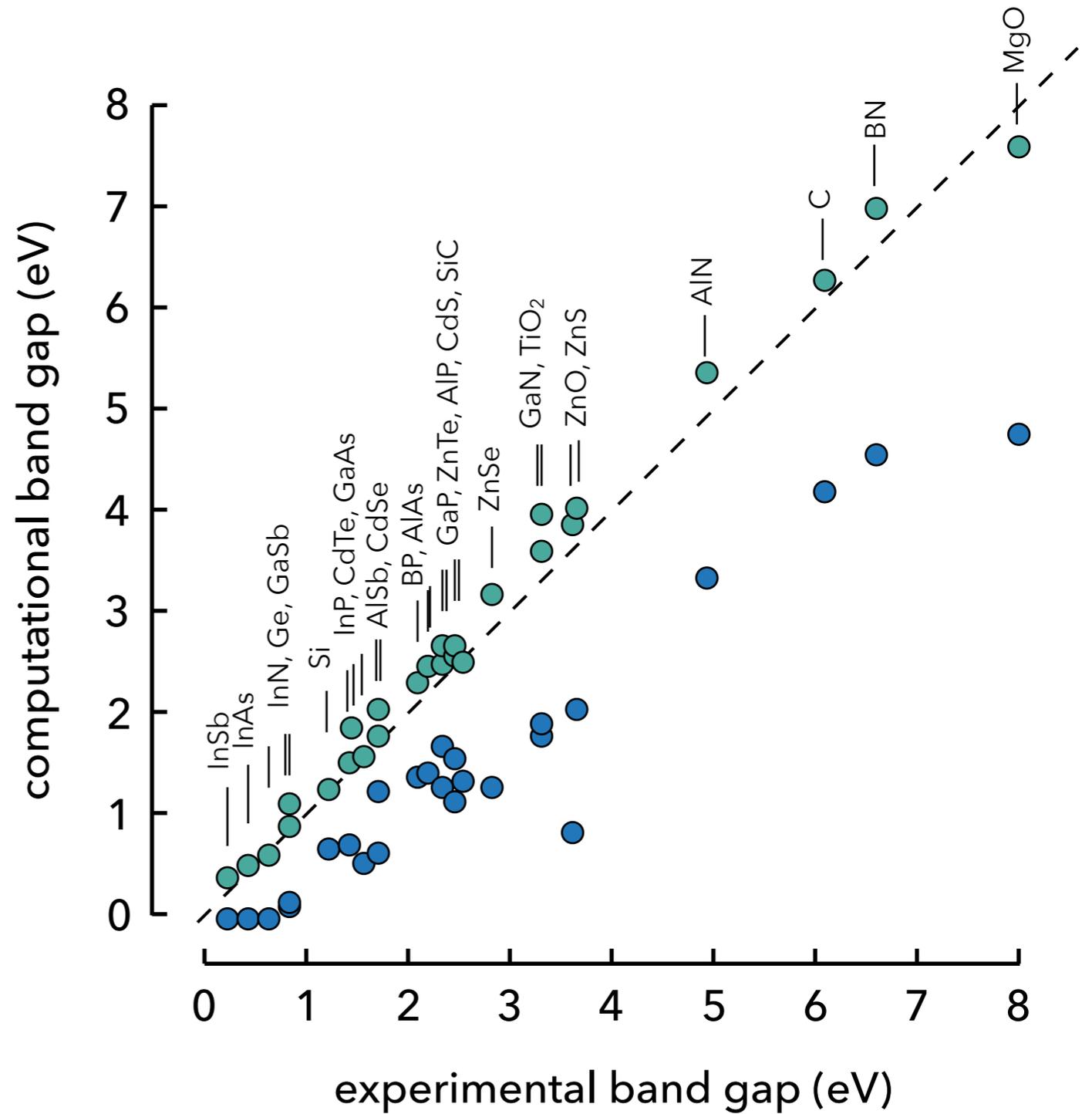
Nguyen *et al.*, *PRL* 114, 166405 (2015)  
 Nguyen *et al.*, *PRX* 8, 021051 (2018)

# What makes a reliable prediction?

$$H\Psi = E\Psi$$

$$h_{\rho} \varphi = \varepsilon \varphi$$

$$h_{\rho, \varphi} \varphi = \varepsilon \varphi$$



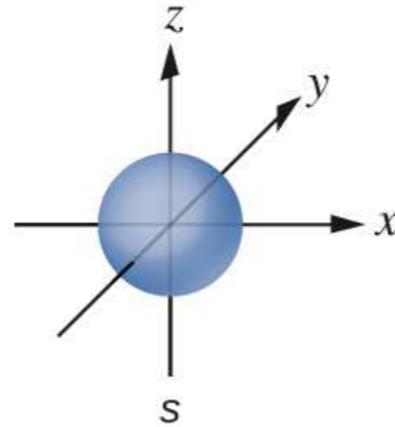
Borghini *et al.*, *PRB* 90, 075135 (2015)  
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 Nguyen *et al.*, *PRX* 8, 021051 (2018)

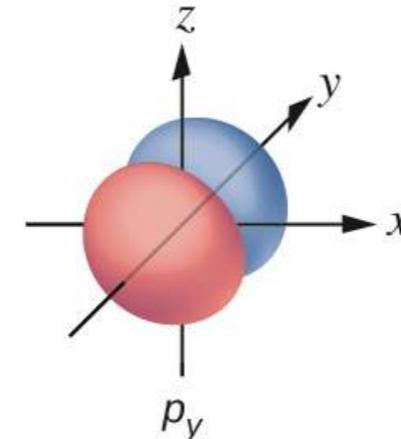
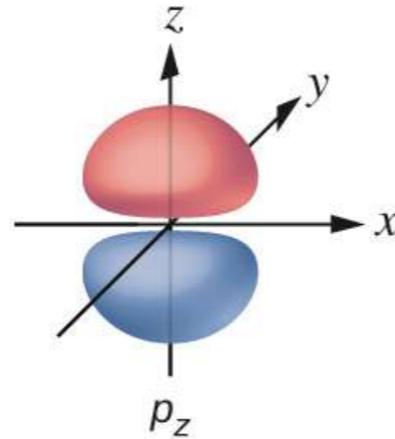
# What makes a reliable prediction?

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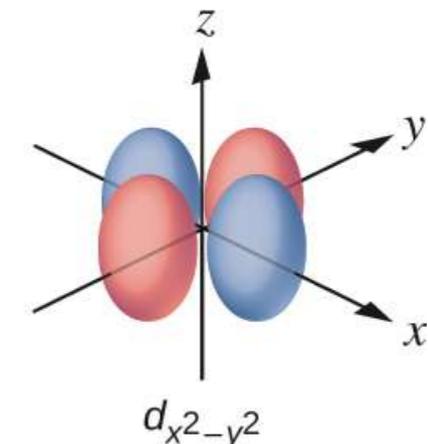
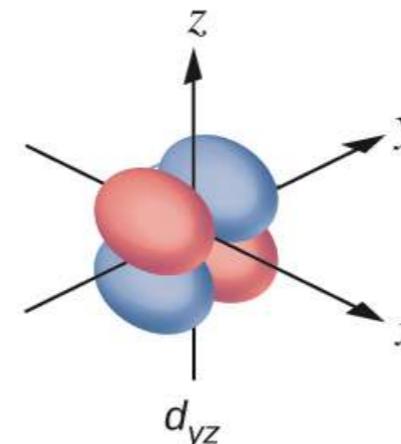
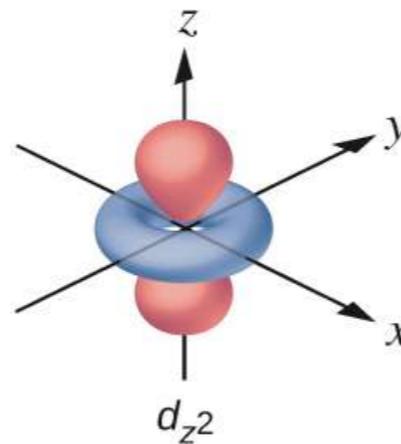
$$H\Psi = E\Psi$$



$$h_{\rho} \varphi = \varepsilon \varphi$$

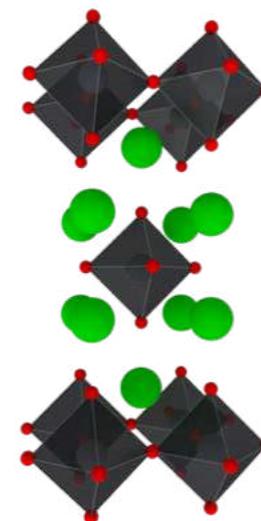
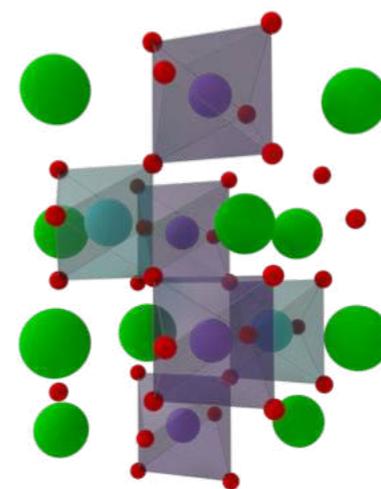
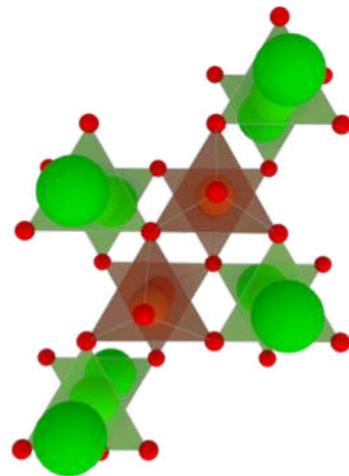
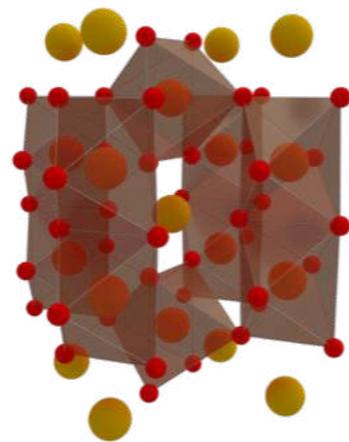
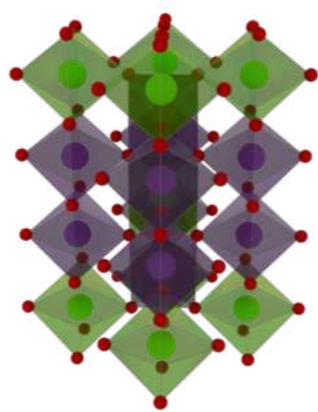
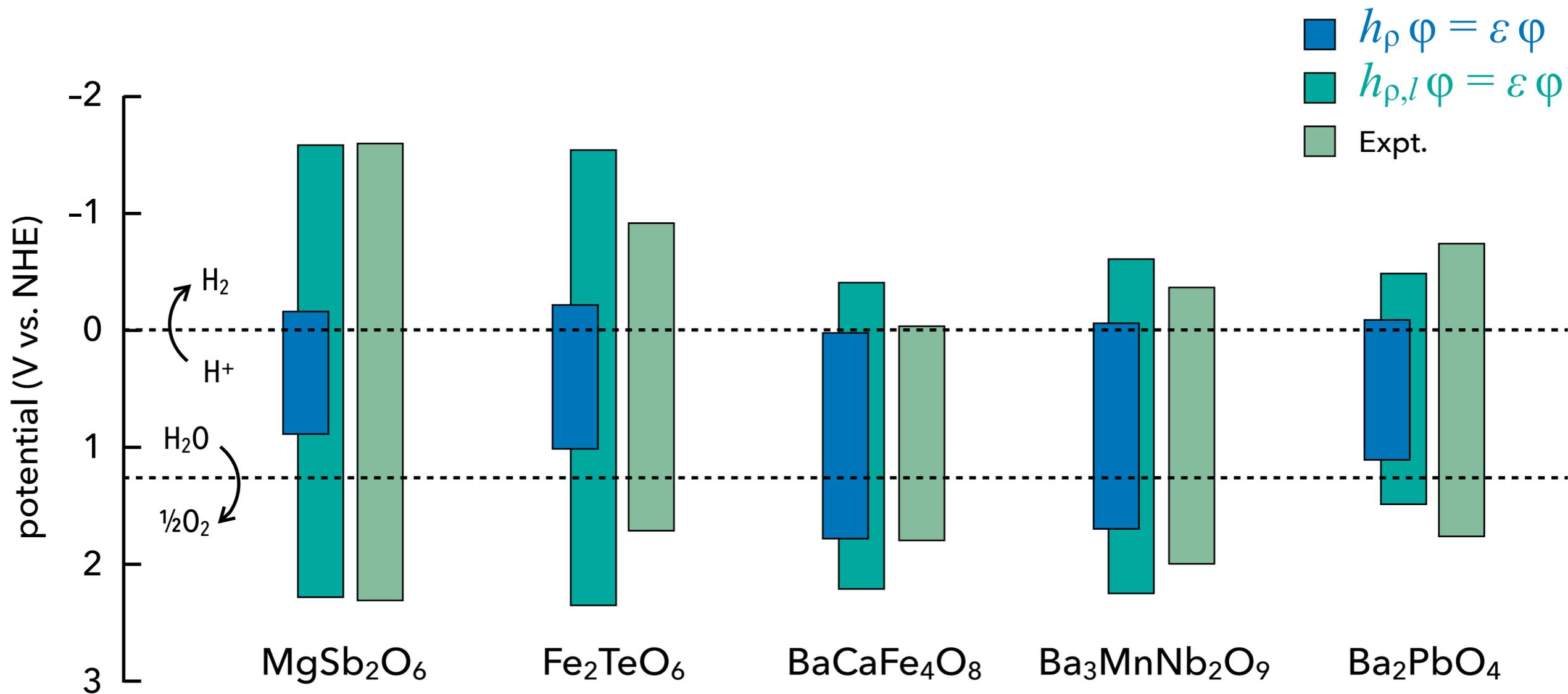


$$h_{\rho,l} \varphi = \varepsilon \varphi$$

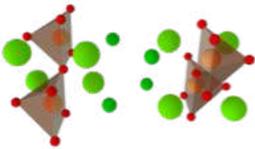
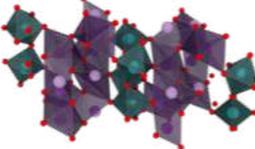
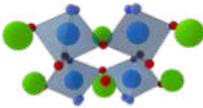
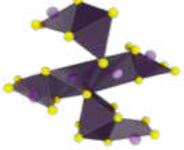
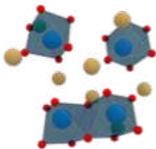
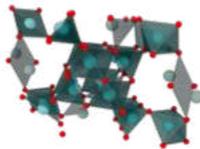
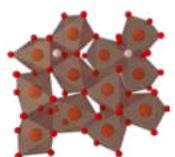
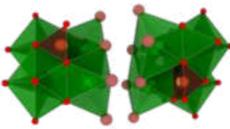
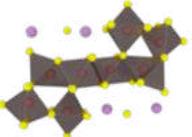
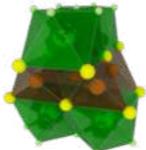
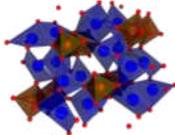
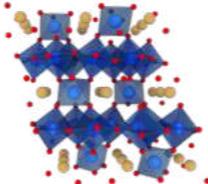
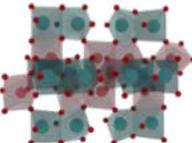
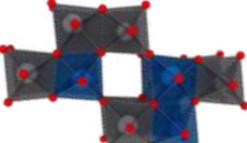
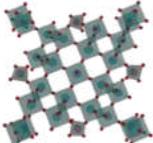
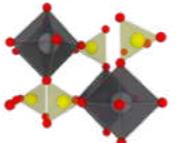
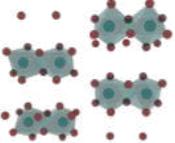
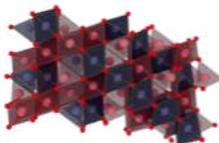
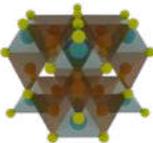
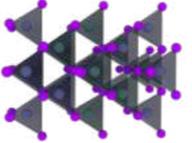


Timrov et al., *PRB* 98, 085127 (2018)  
Campbell et al., *in preparation* (2018)

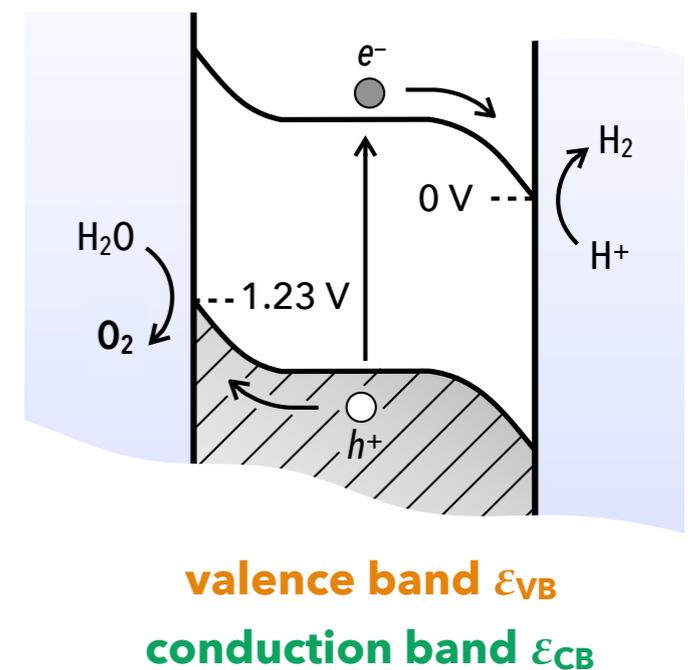
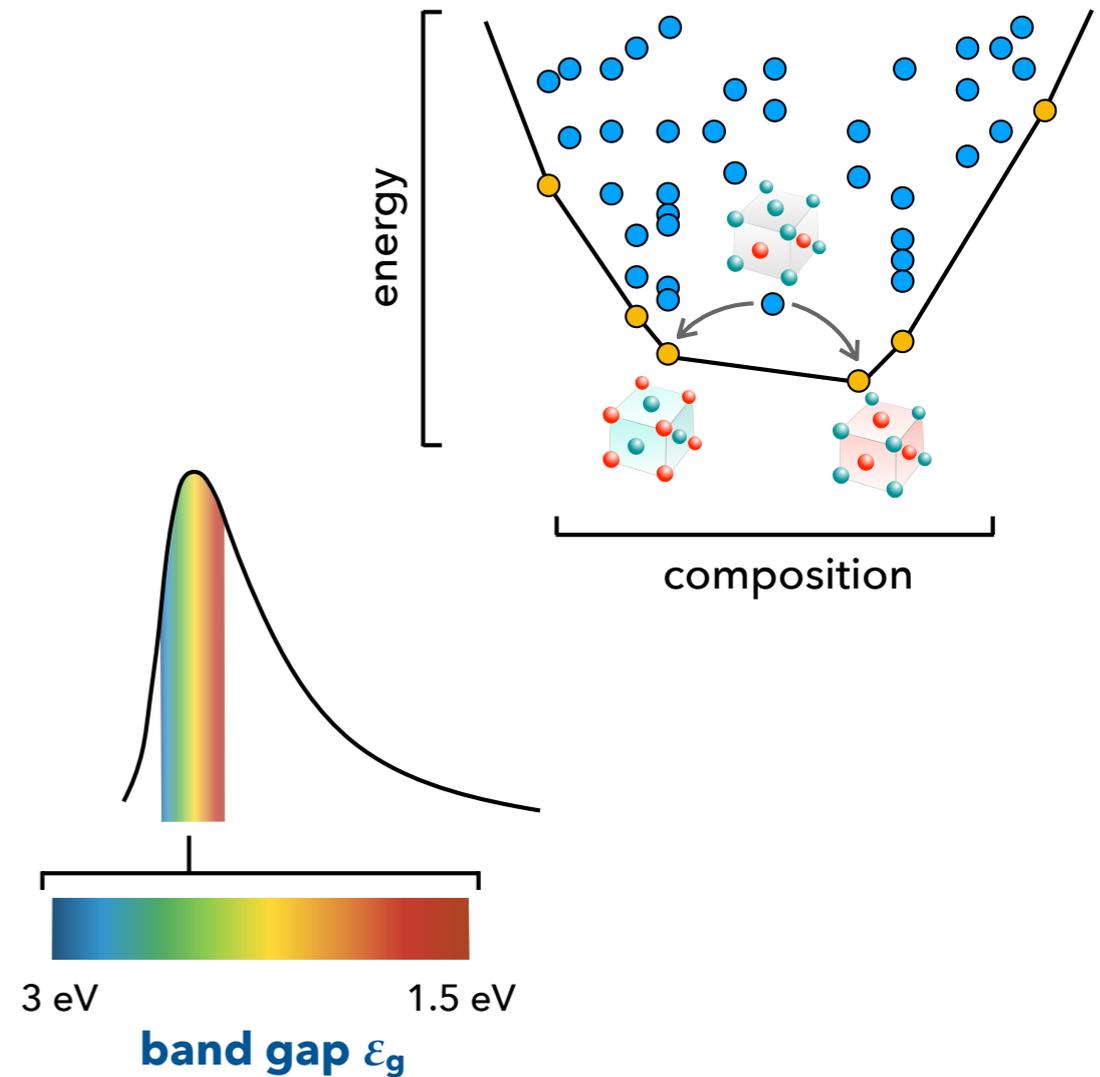
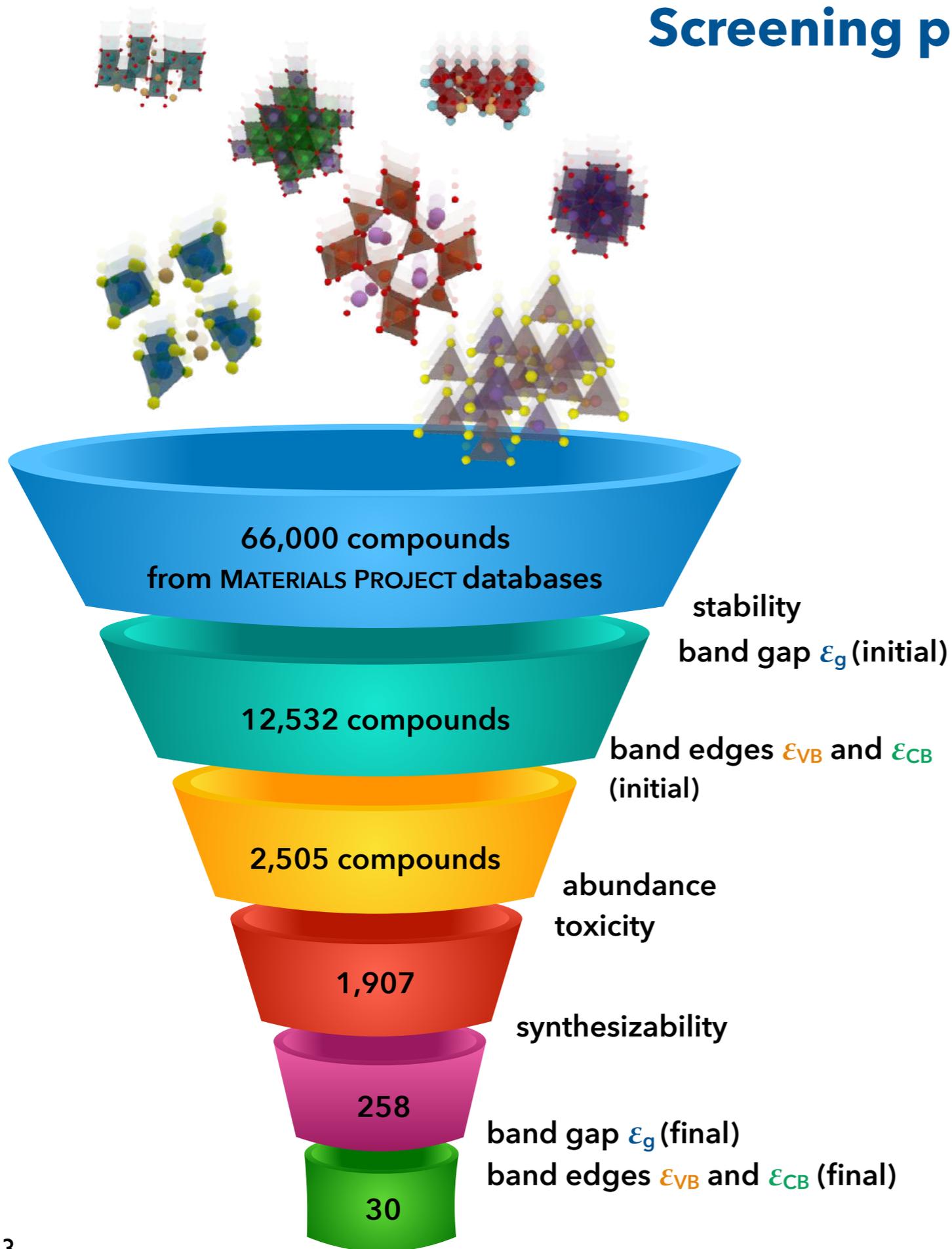
# Comparative assessment



# Which candidates can be made?

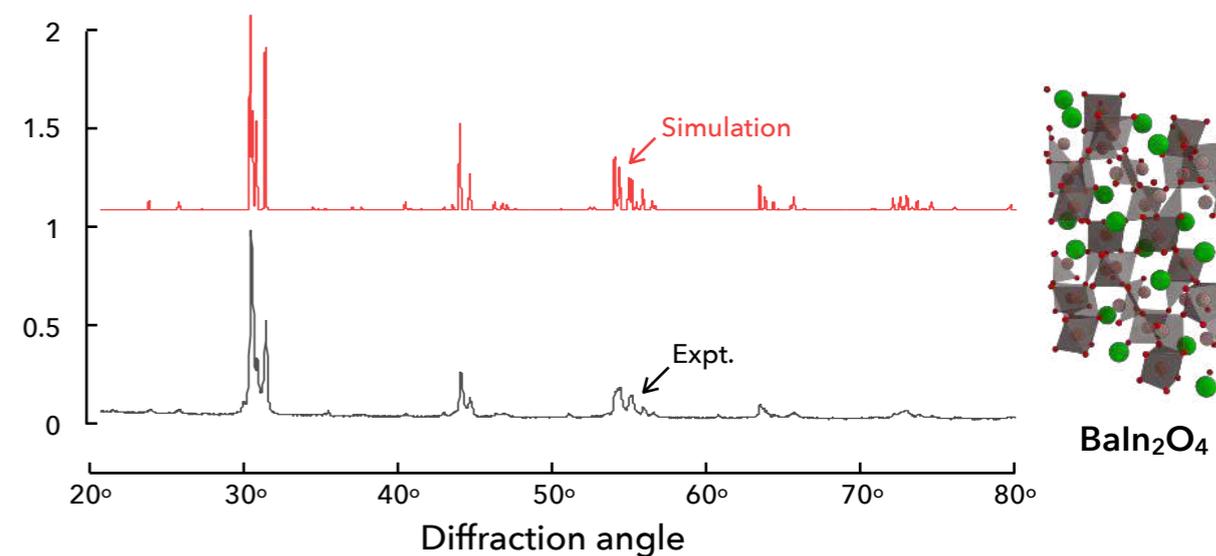
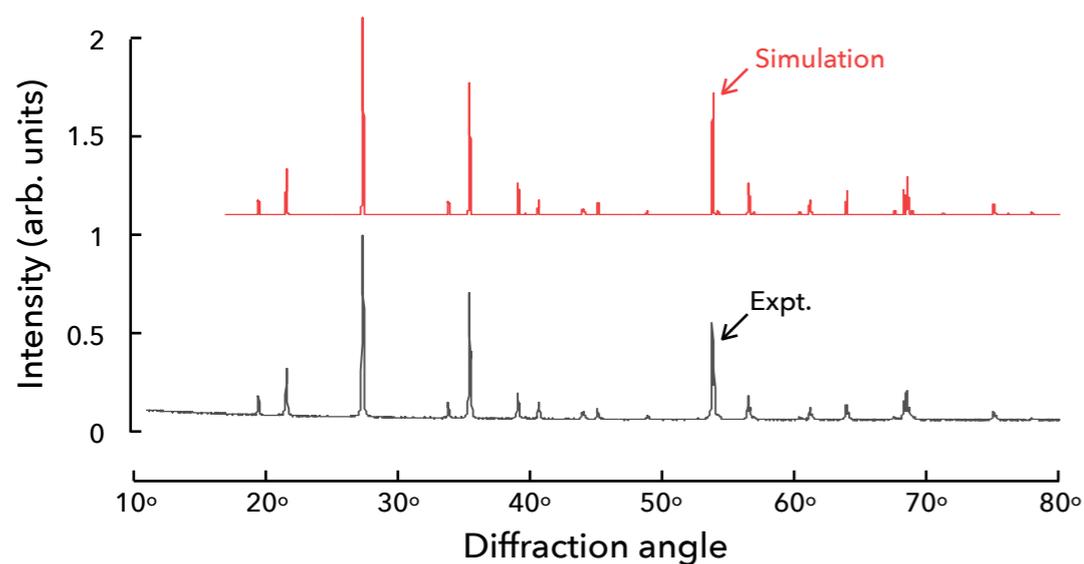
$\text{Ca}_2\text{FeClO}_3$		$\text{CaCl}_2 + \text{Fe}_2\text{O}_3$ in $\text{CaCl}_2$ flux at 850 °C for 5 h in Pt crucible	Ref. 63	$\text{Sb}_2\text{MoO}_6$		$\text{Sb}_2\text{O}_3 + \text{MoO}_3$ in sealed ampoule at 490 °C for 24 h	Ref. 187
$\text{CaTaNO}_2$		$\text{CaCO}_3 + \text{Ta}_2\text{O}_5$ at 900 °C in ammonia	Ref. 260	$\text{Sb}_2\text{S}_3$		$\text{Sb}_2\text{S}_3$ can be purchased	–
$\text{Cu}_2\text{WO}_4$		$\text{CuWO}_4$ ( $\text{CuO}$ and $\text{WO}_3$ at 800 °C for 20 h) + $\text{Cu}$	Ref. 52	$\text{SnMo}_5\text{O}_8$		$\text{SnO}_2 + 2\text{MoO}_3 + 3\text{Mo}$ in sealed Mo crucible at 1757 °C for 1 h	Ref. 60
$\text{Fe}_3\text{BO}_6$		$\text{Na}_3\text{BO}_3 + \text{Fe}_2\text{O}_3$ at 200 °C, then 1200 °C in air for 18 h then heated in boiling water then treated with HCl	Ref. 335	$\text{Sr}_2\text{FeBrO}_3$		$\text{Fe}_2\text{O}_3 + \text{SrCO}_3 + \text{SrBr}_2$ at 850 °C in air for 4 days	Ref. 171
$\text{In}_4\text{Bi}_2\text{S}_9$		$\text{Bi} + \text{In} + \text{S} + \text{I}$ via chemical vapor transport with thermal gradient of 680-600 °C	Ref. 268	$\text{SrCuSF}$		$\text{SrF}_2 + \text{SrS}$ ( $\text{SrSO}_4$ under $\text{H}_2$ at 1100 °C for 15 h) + $\text{Cu}_2\text{S}$ in sealed ampoule at 500 °C for 6 h	Ref. 229
$\text{Na}_2\text{TeO}_4$		$\text{NaOH} + \text{Te}(\text{OH})_6$ in hydro-thermal furnace at 580 °C	Ref. 343	$\text{Ta}_4\text{Cu}_2\text{O}_{11}$		$\text{CuCl} + \text{Ta}_2\text{O}_5$ in $\text{CuCl}$ flux heated to 665 °C for 1 h	Ref. 140
$\text{Nb}_2\text{Co}_4\text{O}_9$		$\text{Nb}_2\text{O}_5 + \text{CoO}$ heated at 1300 °C for 10 h	Ref. 337	$\text{V}_5\text{W}_3\text{O}_{20}$		$\text{WO}_3, \text{V}_2\text{O}_5 + \text{V}_2\text{O}_3$ in sealed ampoule at 1100 °C	Ref. 107
$\text{Nb}_9\text{VO}_{25}$		$\text{Nb}_2\text{O}_5 + \text{V}_2\text{O}_5 + \text{Na}_2\text{CO}_3$ at 350 °C for 24 h and 925 °C for x hours	Ref. 450	$\text{VSO}_5$		$\text{VSO}_5 \cdot 5\text{H}_2\text{O}$ heated to 330 °C for 1 h	Ref. 225
$\text{NbBr}_5$		$\text{NbBr}_5$ can be purchased	–	$\text{Zn}(\text{CoO}_2)_2$		$\text{ZnO} + \text{Co}_2\text{O}_3$	Ref. 35
$\text{NbCu}_3\text{S}_4$		$\text{Cu} + \text{Nb} + \text{S} + \text{I}$ via chemical vapor transport across 850-780 °C for 120 h	Ref. 277	$\text{ZnGeP}_2$		$\text{Zn} + \text{Ge} + \text{P}$ in Bi flux in sealed ampoule	Ref. 109

# Screening protocol



# Materials synthesis and testing

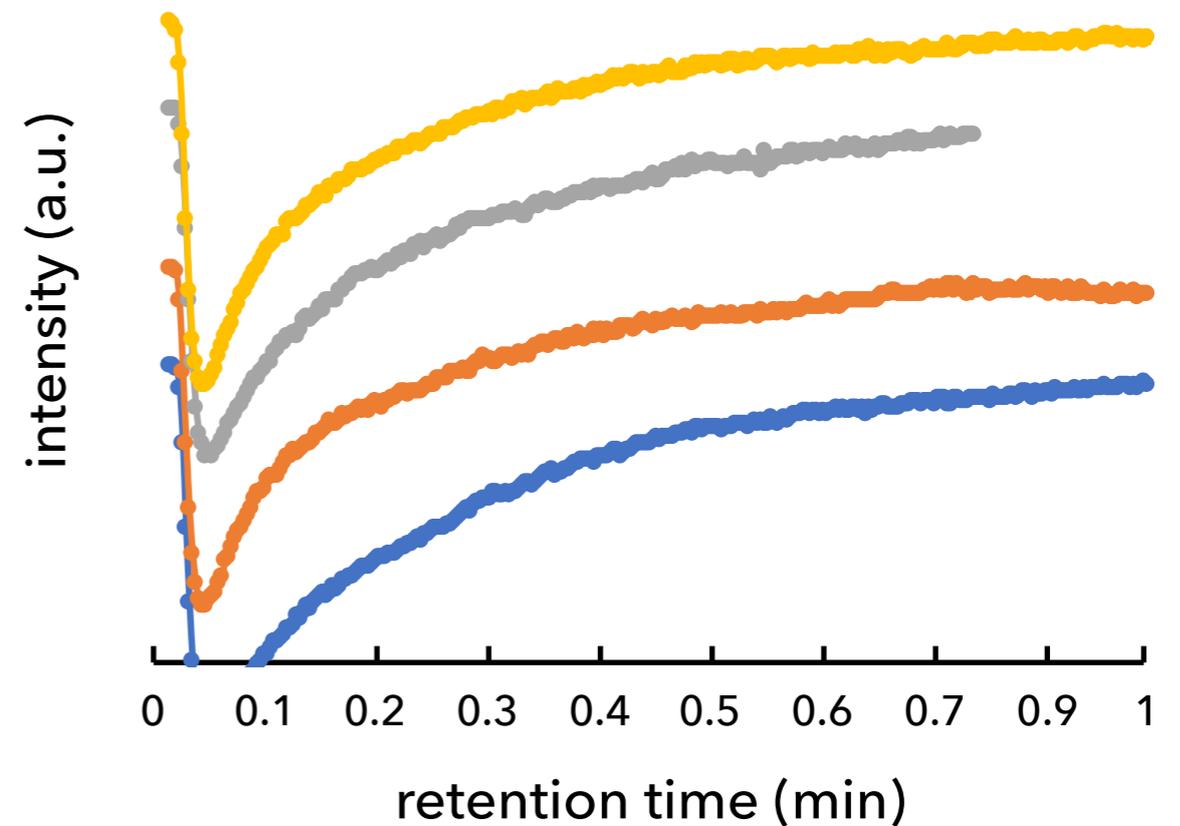
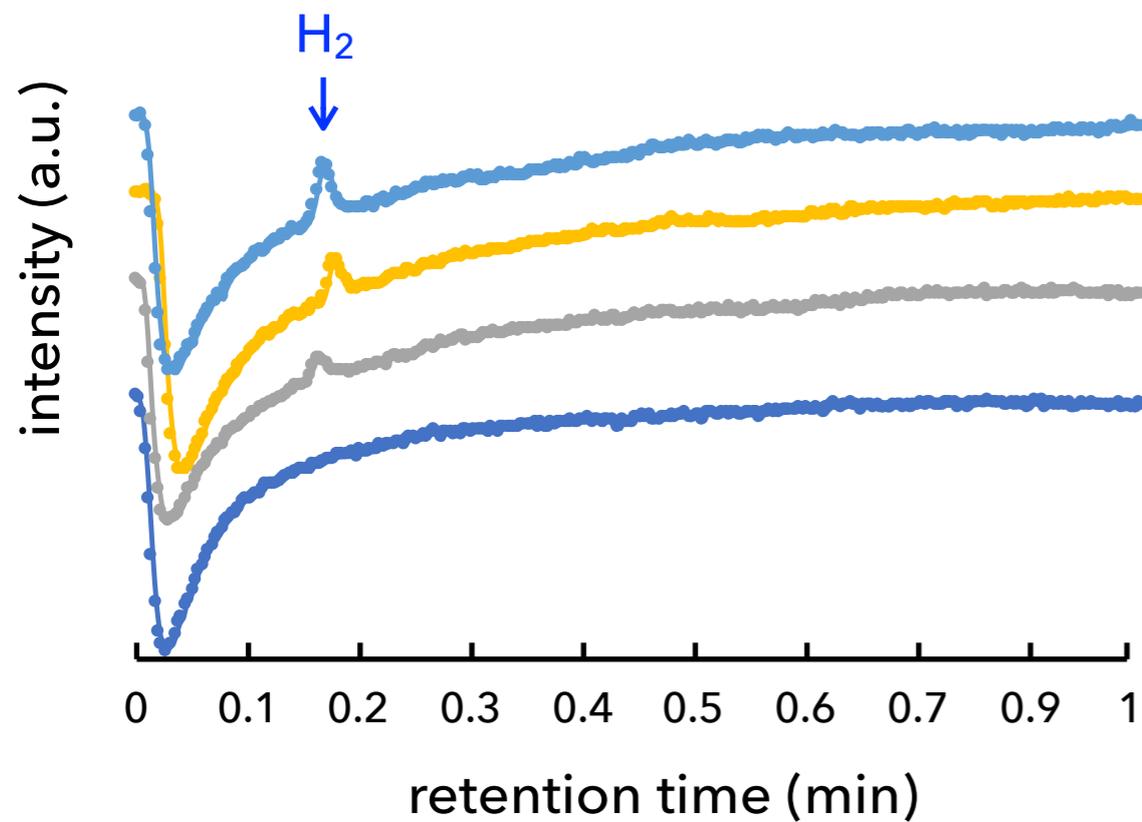
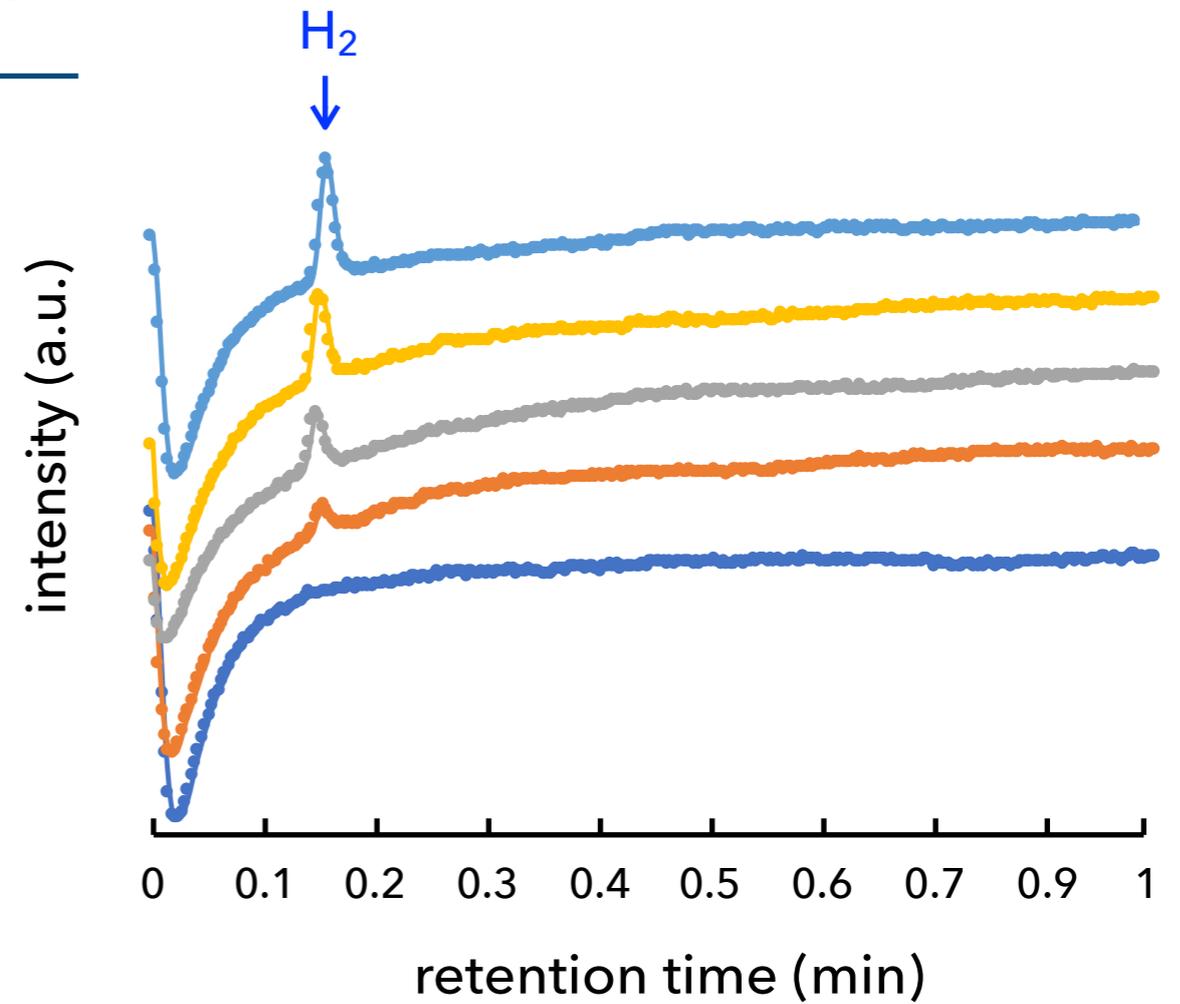
12 of the 30 compounds have been successfully synthesized with high purity and tested photoelectrochemically...



# Materials synthesis and testing

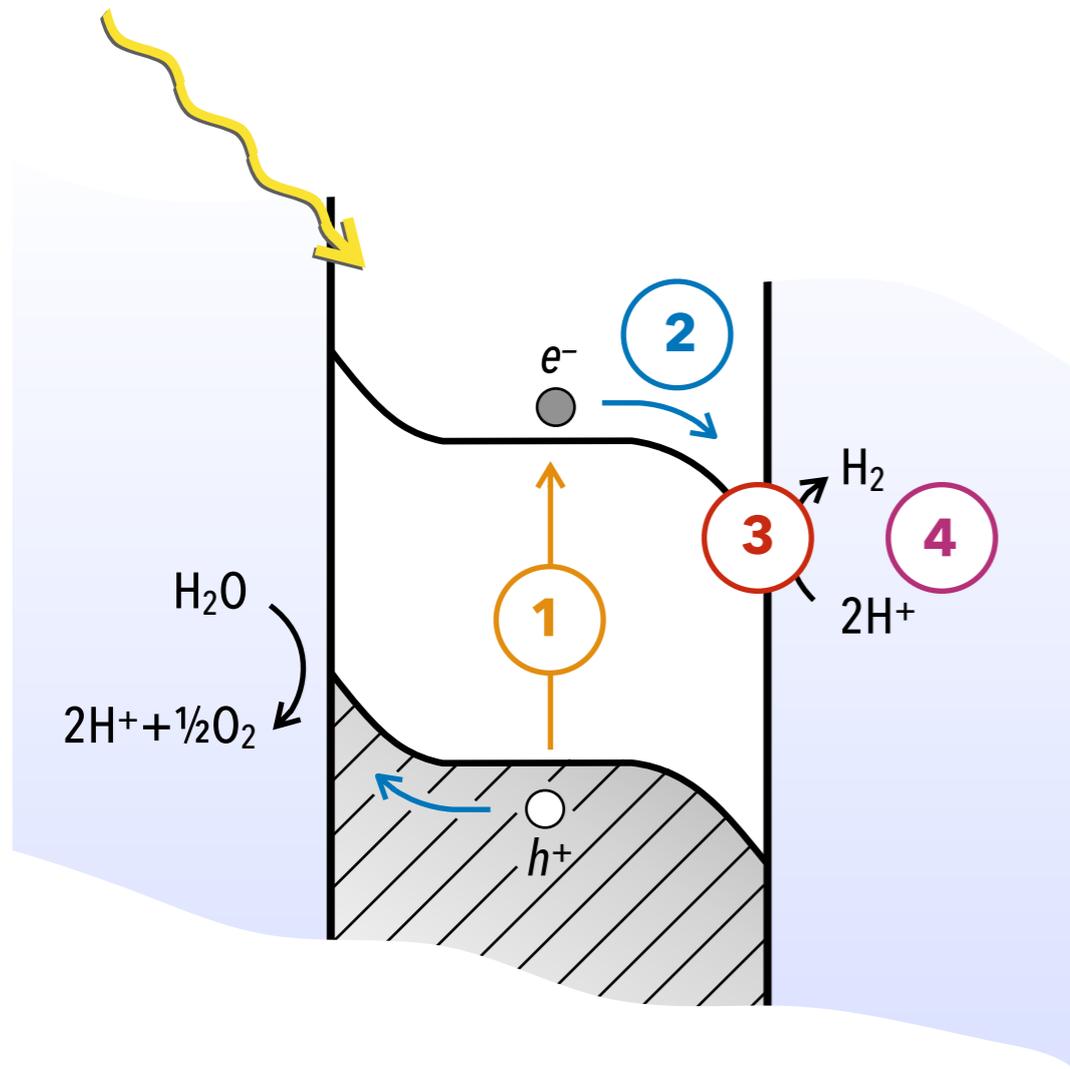


Ultimately, **7 of the 12 compounds** show hydrogen generation through gas chromatography



# Other limiting factors

Beyond solar compatibility and charge transfer, we need to examine other limiting mechanisms



1

SOLAR COMPATIBILITY

2

CHARGE SEPARATION ?

3

CHARGE TRANSFER

4

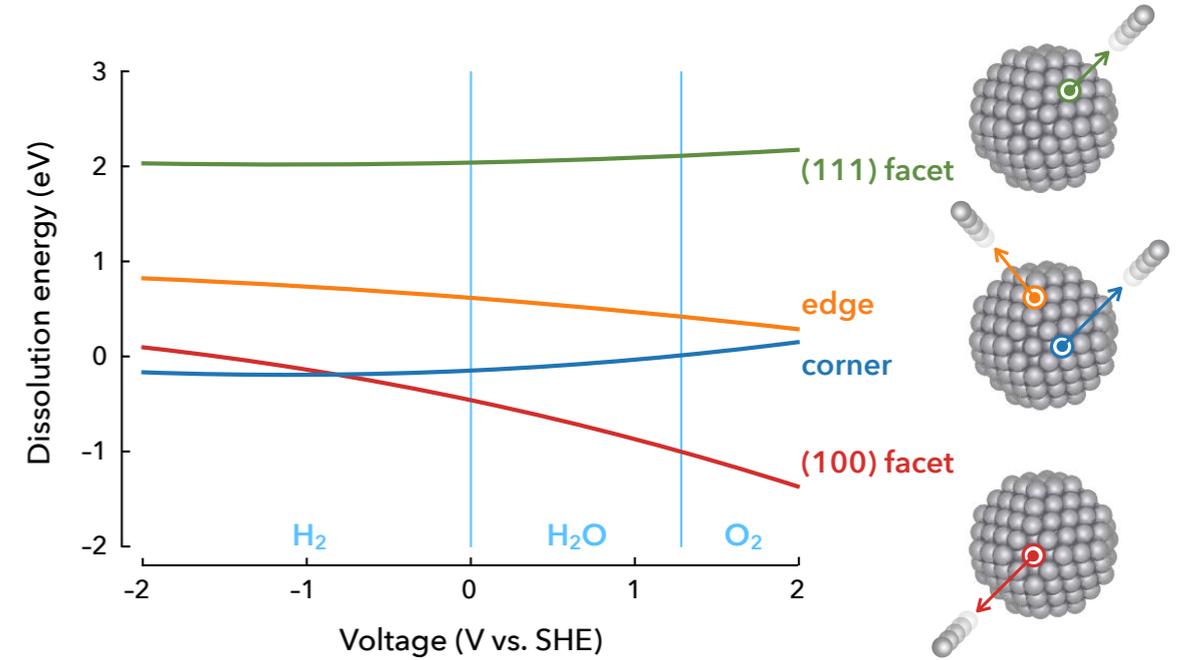
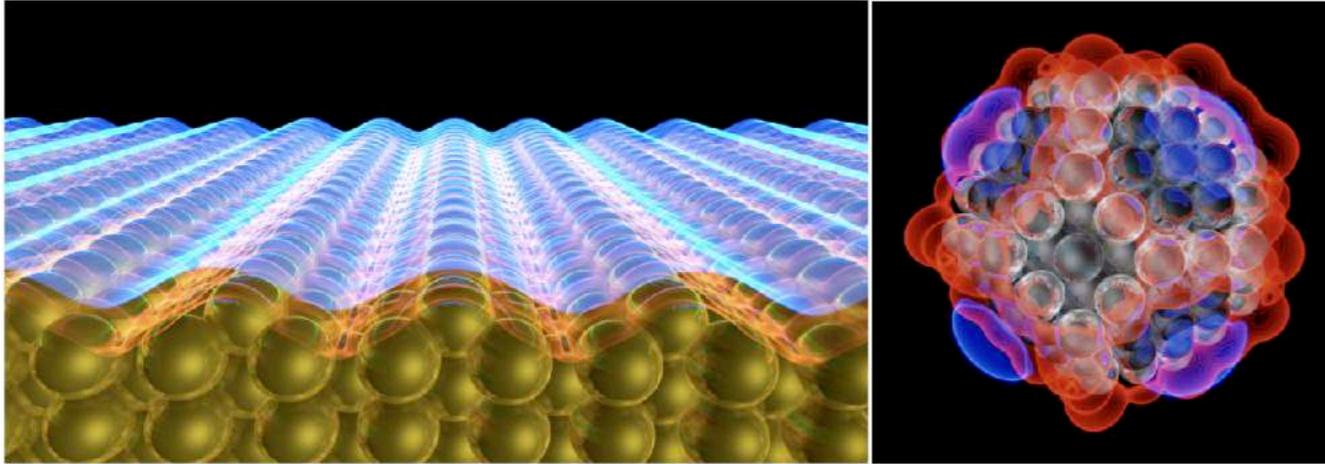
SURFACE ACTIVITY ?



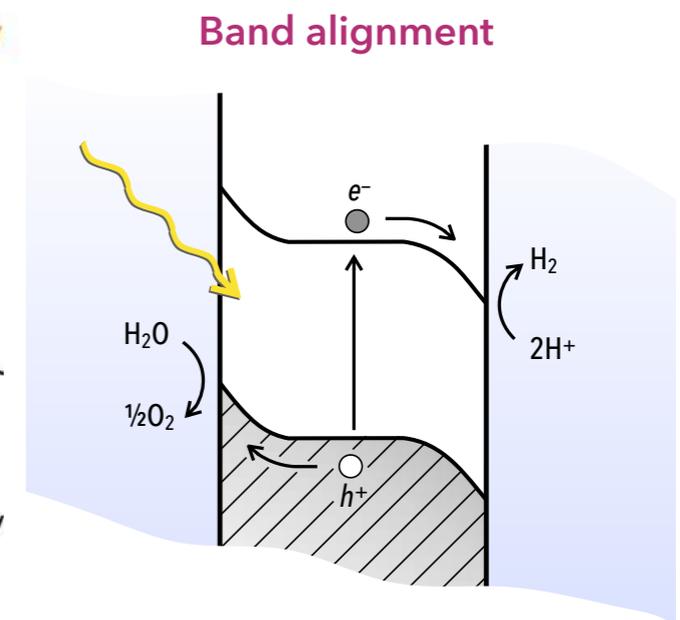
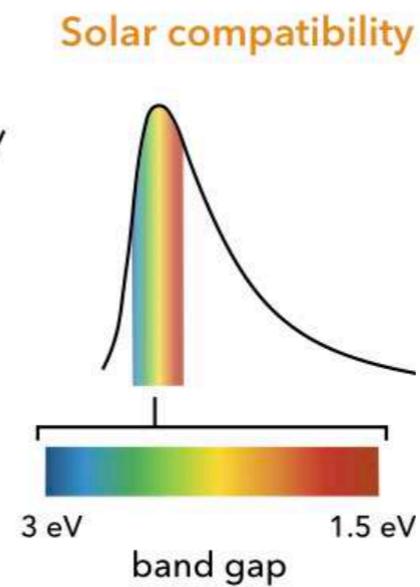
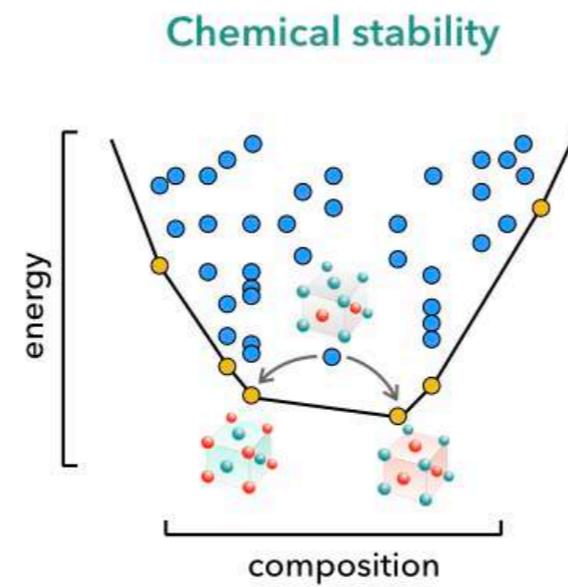
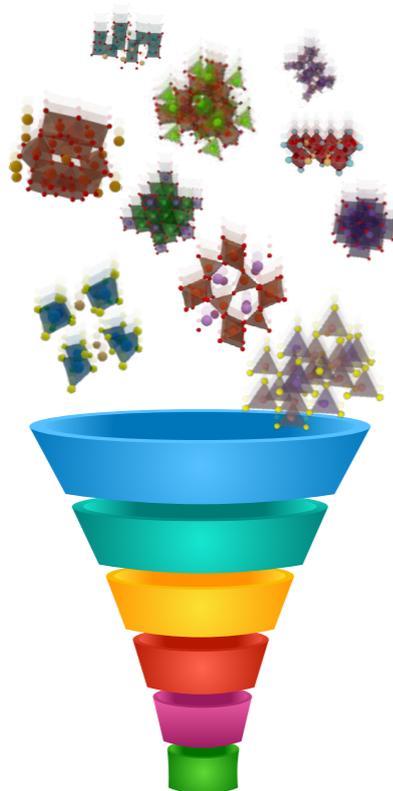
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# Summary



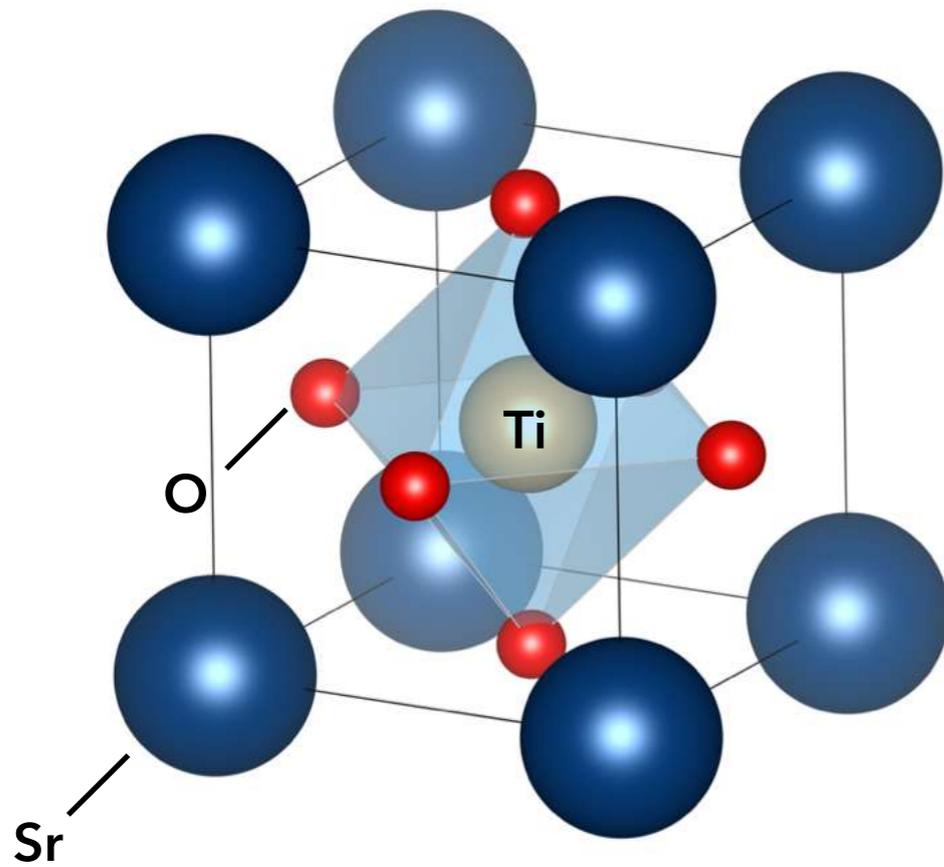
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CPIMS Program, Award No. DE-SC0018646



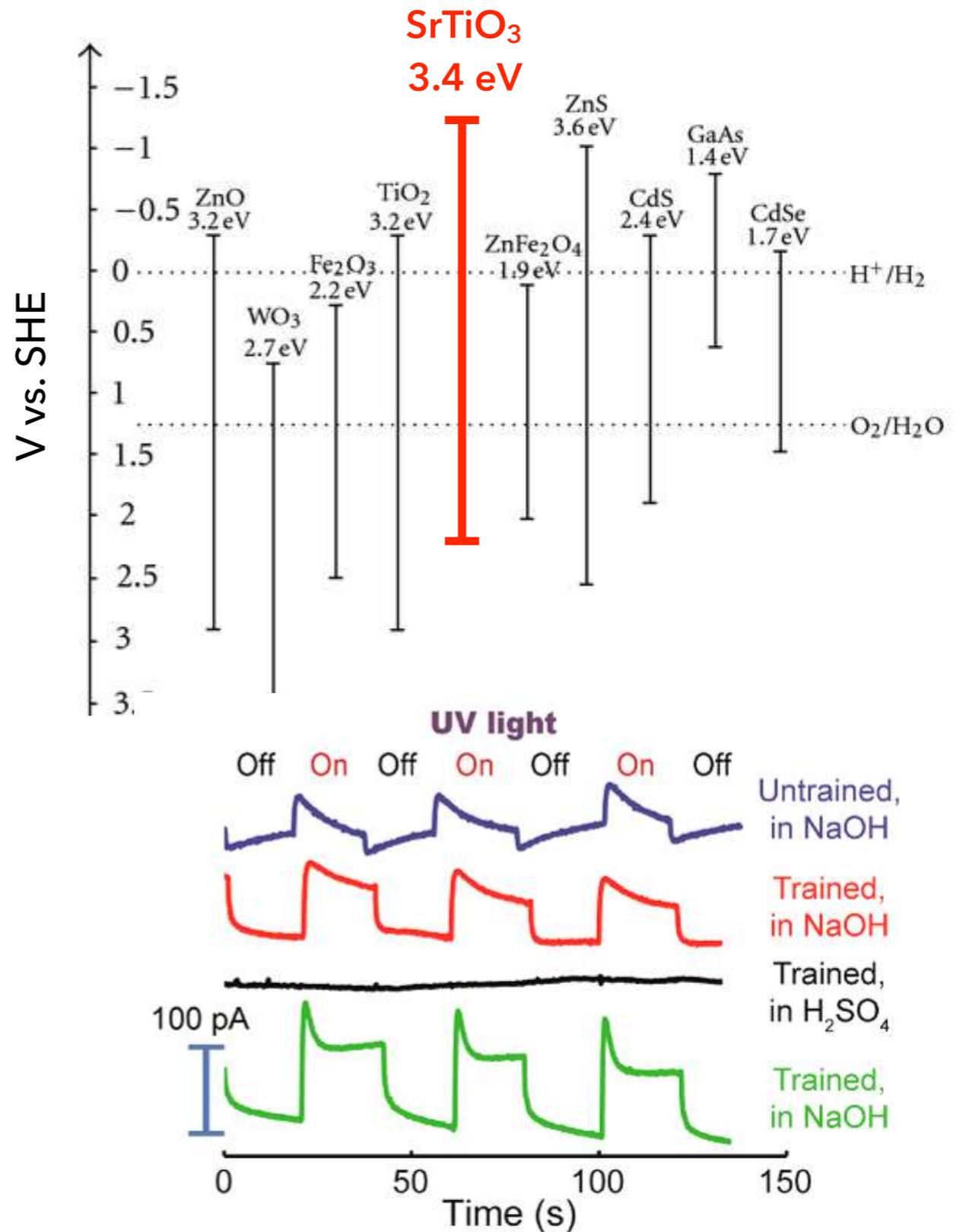
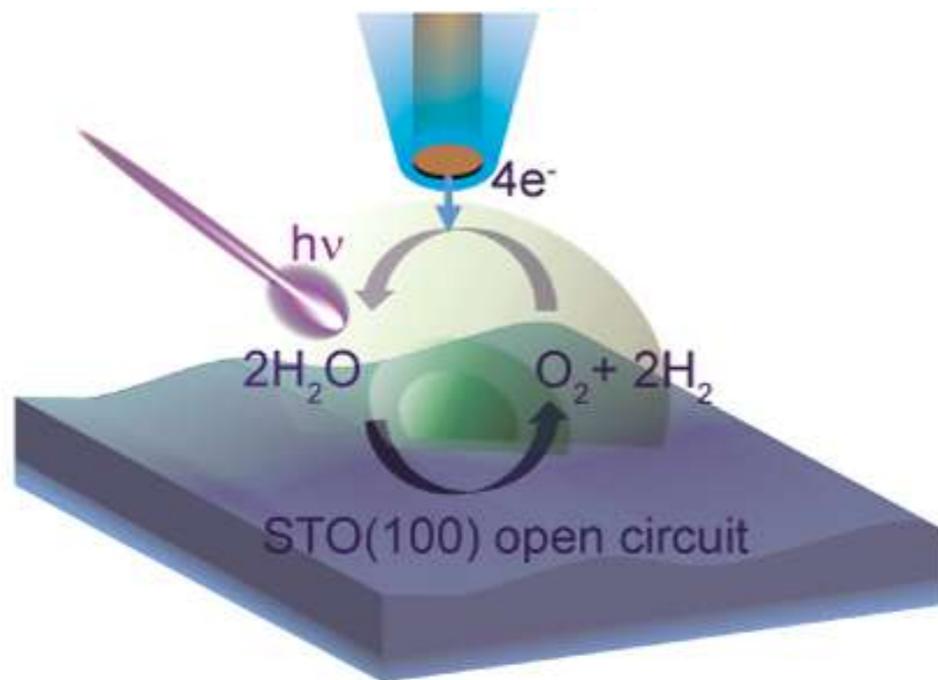
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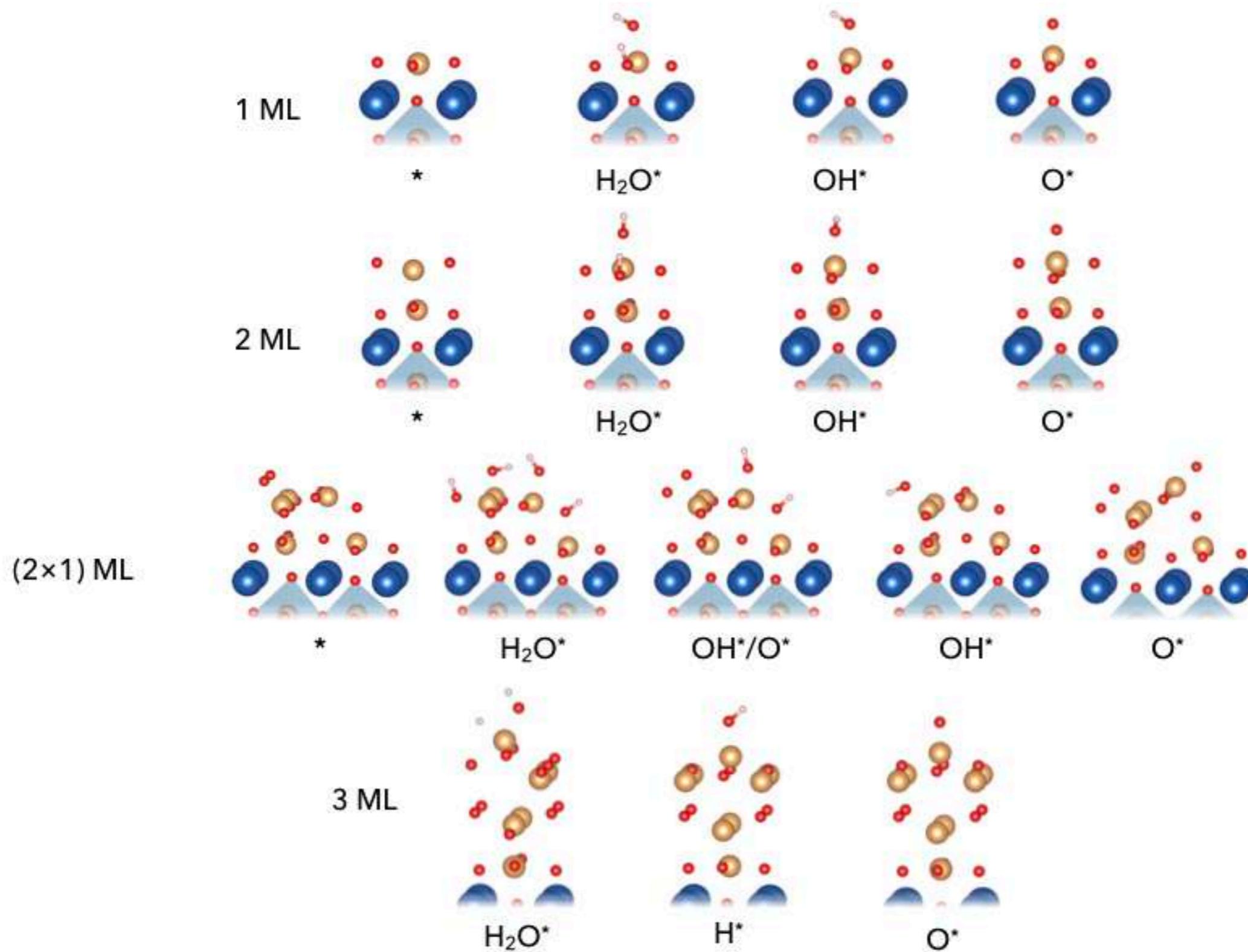
# Towards predicting surface photocatalytic activity



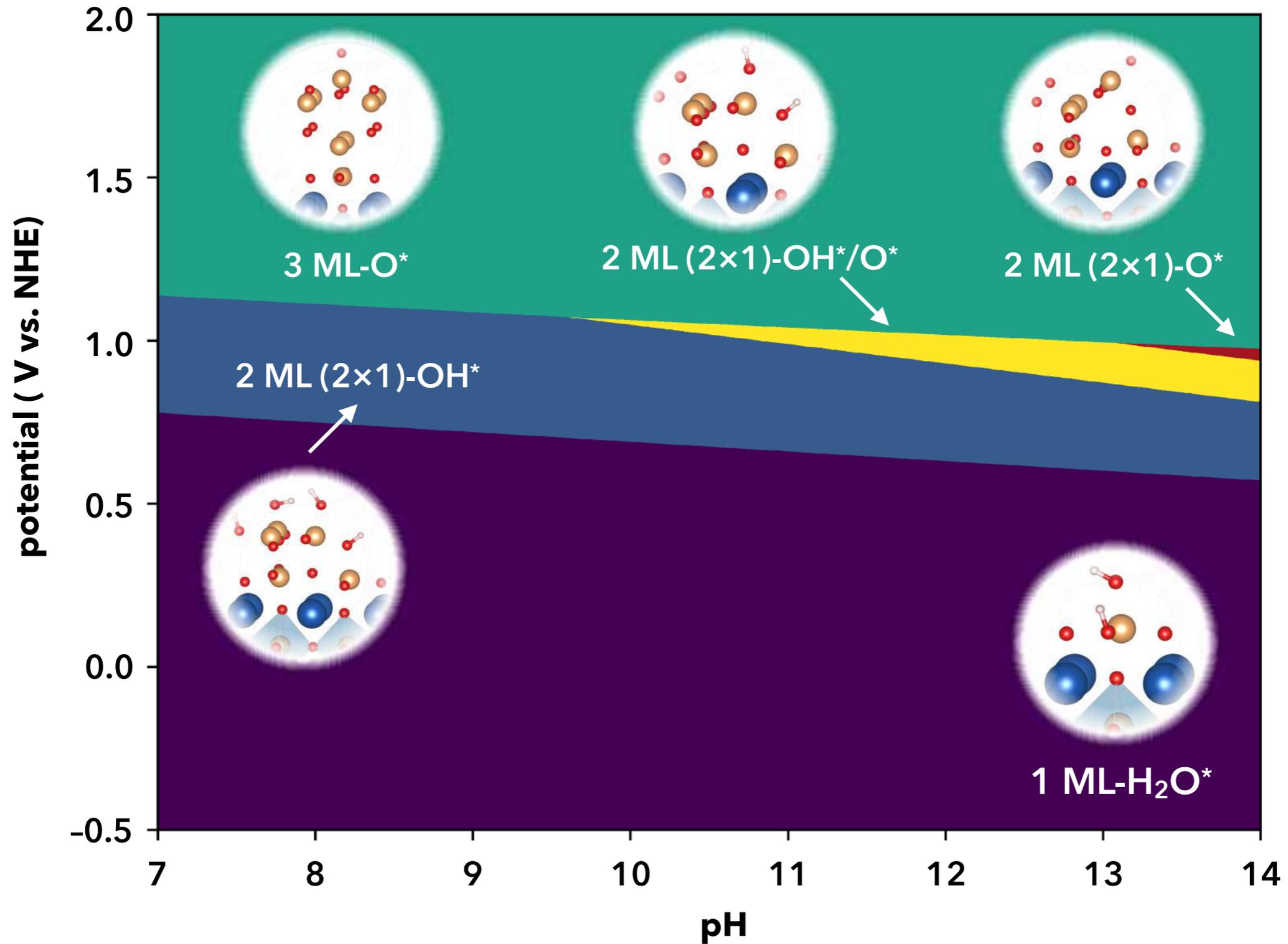
Scanning electrochemical microscopy



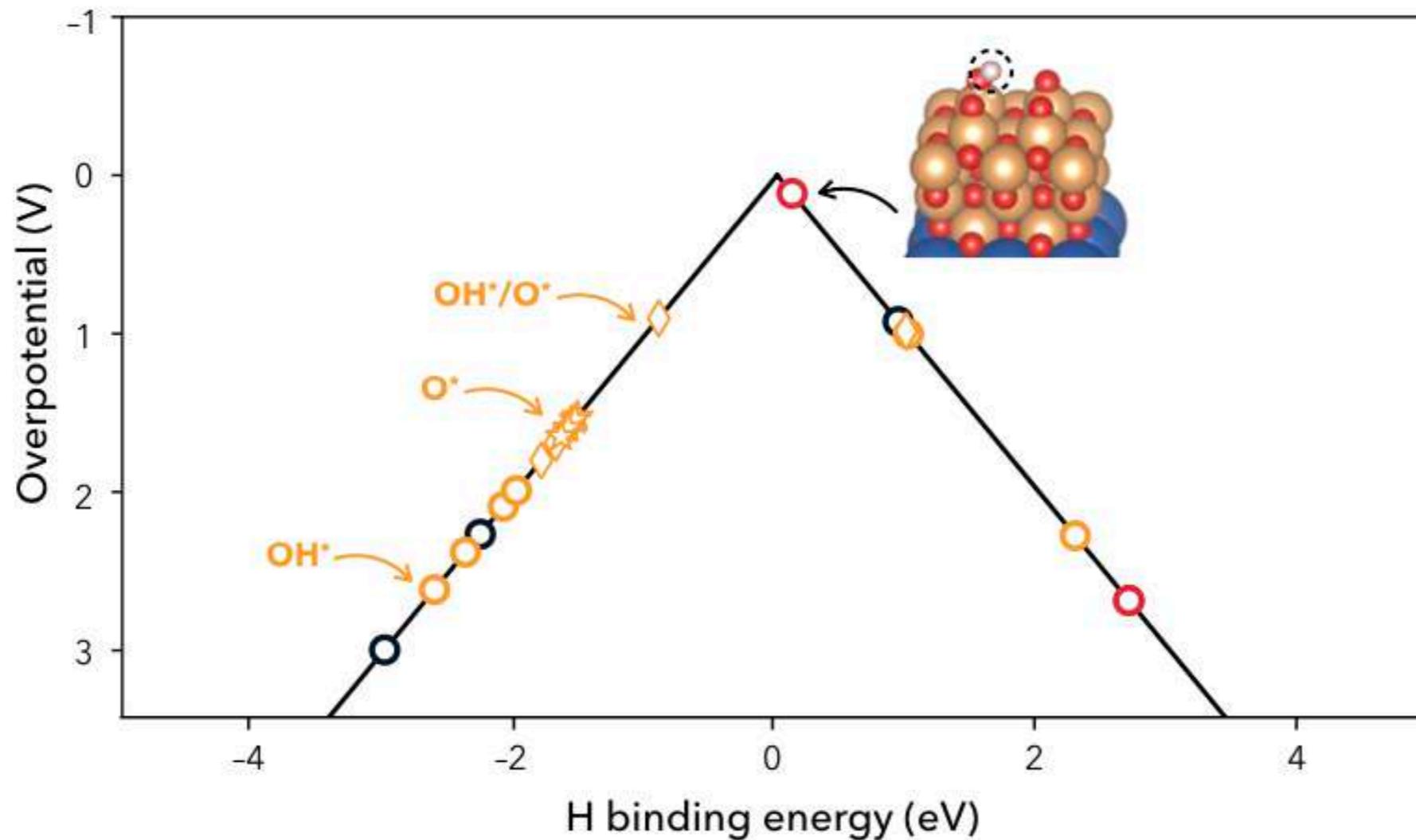
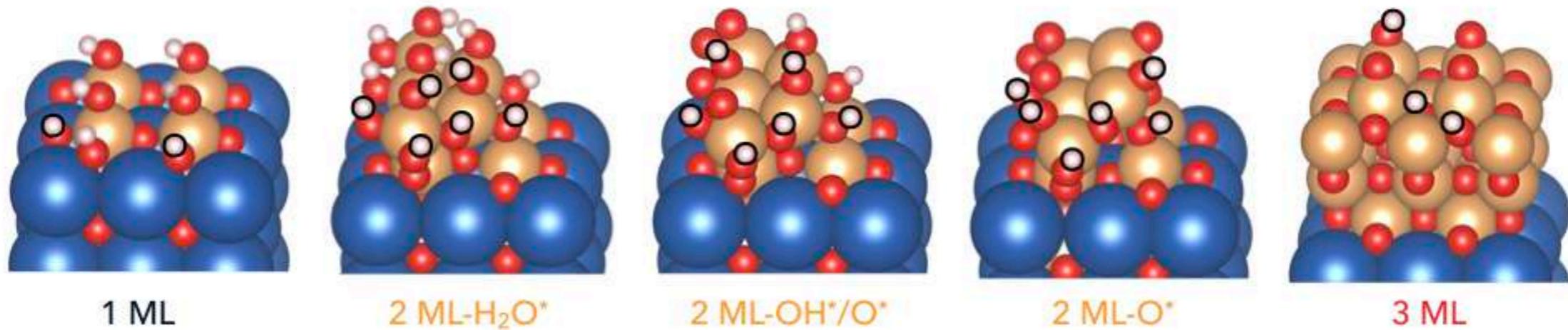
# Towards predicting surface photocatalytic activity



# Towards predicting surface photocatalytic activity



# Towards predicting surface photocatalytic activity



# Towards predicting pseudocapacitive charge storage

