

Material and Composition Screening Approaches in Electrocatalysis and Battery Research

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20 In light of the global effort to transform the energy supply away from fossil fuels toward renewables,
21 electrochemical devices have emerged as key technologies to store and convert energy as well as to
22 convert waste products such as CO₂ into high-value chemicals. Progress in advancing these
23 technologies (i.e., fuel cells, batteries, electrolyzers, or CO₂ conversion cells) hinges on the
24 development and improvement of key materials, especially electrocatalysts and charge storage
25 materials as well as electrolytes and transport materials. The complexity of the structure and
26 composition of the state-of-the-art materials synthesized in recent years has made the search for new
27 materials challenging. Trial-and-error-based screening of new materials is becoming less effective, as
28 there are too many material combinations, synthesis parameters and processing routes to try
29 experimentally. Hence, effective screening methods to designate experimental targets are required to
30 advance the discovery of next-generation materials in an effective way. The development of
31 advanced screening methods has led scientists on the hunt for the understanding of underlying
32 relationships (e.g., structure-property-performance), and guiding principles (like the Sabatier
33 principle). Additionally, the use of ever-more-powerful computational methods to avoid
34 cumbersome, expensive experiments, as well as the utilization of machine learning and artificial

intelligence techniques to re-create in-silico the intuition and experience of an experimenter, leads to a further increase of the efficiency of materials screening methods.

The articles comprised in this special issue highlight a broad range of applications, in which materials and composition screening is used. They range from advanced battery technologies (Dillenz, Kowalski, Tichter), to water splitting (Lim, Mukouyama, Zeradjanin) and CO₂ reduction (Malek, Verma) to general electrocatalysis (Kox, Ooka). The applied methods span the whole spectrum from computational methods like density functional theory (Dillenz, Kowalski, Lim, Verma) and ab-initio molecular dynamics simulations (Kox), continuum modeling (Mukouyama), artificial intelligence (Malek) as well as the interplay of theory and experiment (Tichter, Mukouyama).

Apart from the 8 Original Research articles, this special issue contains 2 review articles. Our editors Ooka, Huang and Exner have reviewed the famous Sabatier principle within the context of electrocatalysis. They have highlighted its limitations and challenges, and in doing so, have showed how moving beyond its current thermodynamic framework might lead to next-generation electrocatalysts. In the second review, Zeradjanin et al. have reviewed the current understanding of activity and stability trends of oxides for the anodic oxygen evolution reaction (OER). Their review brilliantly highlights that the topic is far from being concluded and ends with remaining fundamental questions and eight suggestions for future research directions.

Lim et al. partially followed one of the suggested directions by tuning the OER activity of transition-metal oxides via the strategic formation of a heterostructure with another transition metal oxide. They screened 11 transition metal oxides on a TiO₂ substrate using DFT, finding that these heterostructures follow the universal scaling relationship of metal oxides, thereby confirming RuO₂ and IrO₂ as highly active OER catalysts.

Staying in the field of electrochemical water splitting, Mukouyama et al. investigated the hydrogen evolution reaction and highlighted the importance of quantifying the surface pH. They developed and demonstrated an effective continuum model, which converts partial differential equations to ordinary differential equations, allowing the the surface pH to be estimated in a computationally efficient way. The resulting model explains measured experimental voltammograms of both the hydrogen evolution as well as the more complex hydrogen peroxide reduction reaction.

Another work focusing on the catalyst-electrolyte interface is presented by Kox et al. Using ab-initio molecular dynamics simulations, they unraveled the effect of water and solvation on the structure and reactivity of Co₃O₄ (001) A-type and B-type surface terminations.

Moving to the application in batteries, Tichter et al. have investigated the electro-oxidation of VO²⁺ on glassy carbon electrodes, as encountered in redox-flow batteries. They performed stationary and rotating linear sweep voltammetry, which they combined with Koutecký-Levich analysis. While the observed concentration dependence of the ordinate intercept in the Koutecký-Levich plots was so far unexplained by the theory, they introduced a concept of finite rate constants leading to a theory that captures mass transport limitations, Butler-Volmer kinetics, and finite heterogenous kinetics simultaneously.

In solid-state lithium ion batteries, Kowalski et al. gave an overview and discussed the role of atomistic modeling in accurately predicting thermodynamic properties of Li_xFePO₄ orthophosphates as well as fluorite- and pyrochlore-type zirconates, key materials for energy storage and solid-state ion conduction. Dillenz et al. also used periodic density functional theory calculations to screen the migration of various charge carriers in spinel-type MgSc₂Se₄, a potential candidate for solid

electrolytes in Mg-ion batteries. Screening the diffusion barriers of different ions in this material allowed disentangling structural and chemical factors in ion mobility. Not only the size and charge of the ion determines its mobility, but also charge redistribution and rehybridization caused by the migration of multivalent ions increase the resulting migration barriers.

Tackling the challenge to find suitable electrocatalysts for CO₂ reduction to CO, Verma et al. used computational screening of doped graphene electrodes. After establishing thermodynamically stable electrode materials, the CO₂ reduction reaction in alkaline media was studied. It was found that the CO₂ electrosorption and associated charge transfer along the decoupled proton and electron transfer mechanism significantly impacts the electrochemical performance, leading to their discovery of metal-doped 3 nitrogen-coordinated graphene as highly active electrodes.

Malek et al. made use of computational and experimental materials data in an artificial intelligence-based material recommendation and screening framework. This framework utilizes high-level technical targets, advanced data extraction, and categorization as well as data analytics and property-matching algorithms to recommend the most viable materials and reveal correlations that govern catalyst performance. This framework is demonstrated for certain classes of electrocatalyst materials for low or high temperature CO₂ reduction.

Overall, we thank all authors for their excellent, broad and multi-faceted contributions that highlight the importance and widespread application of diverse materials screening approaches and show up pathways for future energy materials discovery.

1 Conflict of Interest

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

2 Author Contributions

TK drafted the editorial. All authors discussed, reviewed, and approved the submission of this editorial

3 References

Dillenz, Manuel and Sotoudeh, Mohsen and Euchner, Holger and Groß, Axel, Screening of Charge Carrier Migration in the MgSc₂Se₄ Spinel Structure, *Frontiers in Energy Research* 2020, 8, 260.

DOI:10.3389/fenrg.2020.584654

Kowalski, Piotr M. and He, Zhengda and Cheong, Oskar, Electrode and Electrolyte Materials From Atomistic Simulations: Properties of Li_xFePO₄ Electrode and Zircon-Based Ionic Conductors, *Frontiers in Energy Research*, 2021, 9, 107. DOI:10.3389/fenrg.2021.653542

Kox, T. and Spohr, E. and Kenmoe, S., Impact of Solvation on the Structure and Reactivity of the Co₃O₄ (001)/H₂O Interface: Insights From Molecular Dynamics Simulations, *Frontiers in Energy Research* 2020, 8, 312. DOI: 10.3389/fenrg.2020.604799

Lim, Hyeong Yong and Park, Sung O and Kim, Su Hwan and Jung, Gwan Yeong and Kwak, Sang Kyu, First-Principles Design of Rutile Oxide Heterostructures for Oxygen Evolution Reactions, *Frontiers in Energy Research*, 2021, 9, 6. DOI:10.3389/fenrg.2021.606313

- 116 Malek, Ali and Wang, Qianpu and Baumann, Stefan and Guillon, Olivier and Eikerling, Michael and
117 Malek, Kourosh, A Data-Driven Framework for the Accelerated Discovery of CO₂ Reduction
118 Electrocatalysts, *Frontiers in Energy Research*, 2021, 9, 52. DOI:10.3389/fenrg.2021.609070
- 119 Mukouyama, Yoshiharu and Nakanishi, Shuji, An Ordinary Differential Equation Model for
120 Simulating Local-pH Change at Electrochemical Interfaces, *Frontiers in Energy Research*, 2020, 8,
121 298. DOI:10.3389/fenrg.2020.582284
- 122 Ooka, Hideshi and Huang, Jun and Exner, Kai S., The Sabatier Principle in Electrocatalysis: Basics,
123 Limitations, and Extensions, *Frontiers in Energy Research*, 2021, 8, xxx,
124 DOI:10.3389/fenrg.2021.654460
- 125 Tichter, Tim and Schneider, Jonathan and Roth, Christina, Finite Heterogeneous Rate Constants for
126 the Electrochemical Oxidation of VO₂⁺ at Glassy Carbon Electrodes, *Frontiers in Energy Research*,
127 2020, 8, 155. DOI:10.3389/fenrg.2020.00155
- 128 Verma, Anand M. and Honkala, Karoliina and Melander, Marko M., Computational Screening of
129 Doped Graphene Electrodes for Alkaline CO₂ Reduction, *Frontiers in Energy Research*, 2021, 8, 388.
130 DOI:10.3389/fenrg.2020.606742
- 131 Zeradjanin, Aleksandar R. and Masa, Justus and Spanos, Ioannis and Schlögl, Robert, Activity and
132 Stability of Oxides During Oxygen Evolution Reaction---From Mechanistic Controversies Toward
133 Relevant Electrocatalytic Descriptors, *Frontiers in Energy Research*, 2021, 8, 405.
134 DOI:10.3389/fenrg.2020.613092