

A Review on Challenges and Successes in Atomic-Scale Design of Catalysts for Electrochemical Synthesis of Hydrogen Peroxide

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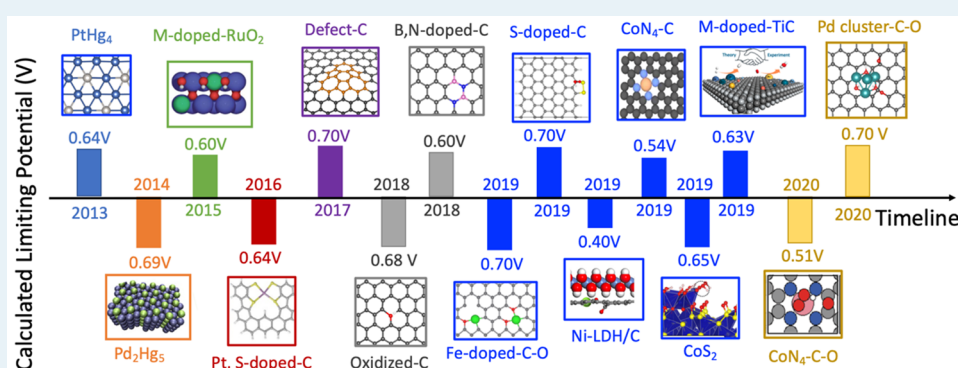
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ABSTRACT: Hydrogen peroxide is a valuable chemical oxidant with a wide range of applications in a variety of industrial processes, especially in water sanitation. Electrochemical synthesis of hydrogen peroxide (H₂O₂) through a two-electron oxygen reduction reaction (2e-ORR) or a two-electron water oxidation reaction (2e-WOR) has emerged as an appealing process for onsite production of this chemically valuable oxidant. On-site produced H₂O₂ can be applied for wastewater treatment in remote locations or any applications where H₂O₂ is needed as an oxidizing agent. This Review studies the theoretical efforts in understanding the challenges in catalysis for electrochemical synthesis of H₂O₂ as well as providing design principles for more efficient catalyst materials.

KEYWORDS: electrochemical synthesis of hydrogen peroxide, oxygen reduction reaction (ORR), water oxidation reaction (WOR), computational material design, density functional theory (DFT)

1. INTRODUCTION

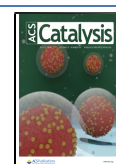
Hydrogen peroxide (H₂O₂) is a benign chemical oxidant with variety of applications in industrial processes such as paper bleaching, textile, water treatment, and chemical synthesis. Taking water treatment as an example, the most beneficial aspect of H₂O₂ is that it breaks down into water and oxygen after interacting with polluted water. In comparison with chlorine, the more commonly used chemical for water purification, H₂O₂ has higher oxidation potential (~1.8 V) and works twice as fast over a wider pH range. However, the cost associated with synthesis of H₂O₂ through the energy-intensive, industrial anthraquinone process¹ and its transportation to the place of use hinder its widespread application in water treatment. For a similar concentration, hydrogen peroxide is more expensive than chlorine. For example, chlorine bleach usually costs \$2 to \$5 a gallon for 5% to 7% chlorine. However, hydrogen peroxide may cost \$10 to \$14 a gallon for a 7% peroxide solution. At present, the main industrial process for manufacturing H₂O₂ is the anthraquinone oxidation (AO). This process involves four main steps: (1) hydrogenation of anthraquinone with H₂ over Pd or Pt

catalyst, (2) oxidation using O₂, (3) H₂O₂ extraction, and (4) treatment of working solution. While AO meets the global demand of H₂O₂, it is an energy-intensive multistep process which requires large infrastructures. Further, the method is not environmentally friendly as it generates substantial waste and generated H₂O₂ requires purification, storage, and transport which negatively impacts the production cost and sustainability.¹ Thus, with all its green credentials, hydrogen peroxide would be more extensively and efficiently used if it could be made substantially and readily on-site. Direct synthesis of hydrogen peroxide (DSHP) from its constituents, H₂ and O₂, provides a straightforward pathway which has been the subject of massive research.^{2–8} Palladium and its alloys are the most studied catalysts for DSHP.^{3,9,10} This process has not yet been

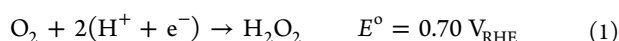
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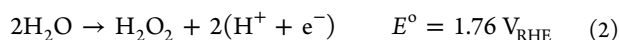
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applied at an industrial level because of several challenges associated with thermodynamics, explosion risk, and degradation of produced hydrogen peroxide. Furthermore, the emergence of electrochemical processes has enabled local production of this valuable chemical oxidant with high efficiency and safe operation.¹¹ H₂O₂ can be generated on-site from a two-electron reduction of oxygen (2e-ORR, eq 1) and used as an onsite oxidizing agent for water treatment.¹² This process has motivated intense research in recent years to find efficient and selective catalysts for the 2e-ORR to H₂O₂.^{13–21} The combination of computational material design and versatile synthetic methods as well as electrochemical evaluation has led to the design and discovery of the state-of-the-art platinum and palladium mercury alloys for this reaction.^{13,14} Recently, carbon-based materials,^{12,16,22,23} nitrides,²¹ carbides,²⁴ sulfides,^{25,26} and oxides^{27,28} have attracted attention as alternative cost-effective nontoxic catalysts for 2e-ORR.



An alternative process for onsite production of H₂O₂ and oxidizing organic pollutants of water is to oxidize water in a two-electron oxidation process (2e-WOR eq 2) in an aqueous media.¹



Compared with 2e-ORR, less effort has been devoted to developing catalysts for electrochemical synthesis of H₂O₂ via 2e-WOR. Mostly transition metal oxides have been examined for this reaction. Among them, some have shown high selectivity and activity and demonstrated the feasibility of this process.^{29–32} Recently carbon-based materials, coupled with unique new electrode designs, have been tested and shown additional promise for this reaction.³³

Given the growth of research interest in electrochemical H₂O₂ synthesis shown in Figure 1 (reference Scopuz), and the

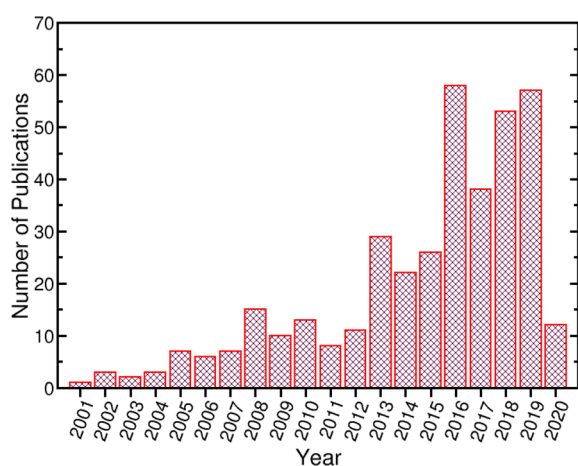


Figure 1. Number of publications for electrochemical synthesis of H₂O₂ via 2e-ORR and 2e-WOR.

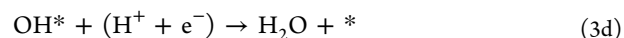
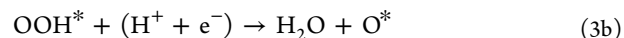
advent of widespread adaptation of data-driven approaches to materials design, theory, and computation will play an important role in the discovery of new materials for this reaction. In this Review, we will give an overview of the emergence of computational guidance in understanding the challenges and providing solutions in designing active and

selective catalysts for both 2e-ORR and 2e-WOR to produce H₂O₂. We demonstrate how simulations using the computational hydrogen electrode model reveal the Sabatier principle for H₂O₂ synthesis, explaining trends in activity toward both ORR and WOR. In this model, maximum activity is a trade-off between not too strong nor too weak adsorption energy of the adsorbates to the surface of the catalyst.³⁴ Furthermore, we demonstrate how simulations can be used to construct activity volcano maps based on the Sabatier principle. This approach has proven to be powerful in predicting trends in activity across different classes of materials for many different reactions.^{35–37} We emphasize that the literature includes a number of high-quality pure experimental studies in the area of 2e-ORR, which have been thoroughly addressed in other review papers.^{38–41} However, purely experimental studies are out of the scope of this Review, and our focus herein is on the simulation-based guidance of trends in H₂O₂ synthesis.

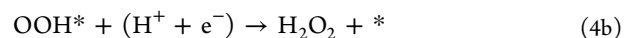
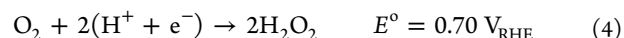
2. ELECTROCHEMICAL SYNTHESIS OF H₂O₂ THROUGH 2E-ORR

The oxygen reduction reaction (ORR, eq 3, Figure 2a), where molecular oxygen is electrochemically reduced via a four-electron proton transfer to water, is an emerging process of interest for chemical-to-electrical conversion technologies such as fuel cell and metal–air batteries. Both fuel cells and metal–air batteries are set to play increasingly important roles in our future sustainable energy landscape. Performance bottlenecks in zero-emission fuel-cell technologies have motivated efforts in the past three decades to discover novel catalysts and optimize fuel-cell device design.^{42–47} The four-electron ORR (4e-ORR) that occurs in a fuel cell is out of the scope of current contribution. Rather, our focus is on the 2e-ORR (eq 4, Figure 2b), where oxygen is electrochemically reduced to H₂O₂. Similar to the 4e-ORR, this process is accompanied by generation of electrical energy.

The mechanism of 4e-ORR:



The mechanism of 2e-ORR:



Since water is the thermodynamically favored product, the 4e-ORR competes with the 2e-ORR and the selectivity of the catalyst toward the two-electron product is an obstacle for synthesis of H₂O₂. In reality, the final product of the ORR strongly depends on the selected catalyst material. Equations 3a–3d and 4a–4b are the mechanisms for 4e- and 2e-ORR, respectively. Panels c and d of Figure 2 are the schematics of the two mechanisms showing that OOH* is the common intermediate between the two ORR pathways and determines the reaction product. Catalyst materials that preserve the O–O

Fuel Cell

ORR = Oxygen Reduction Reaction

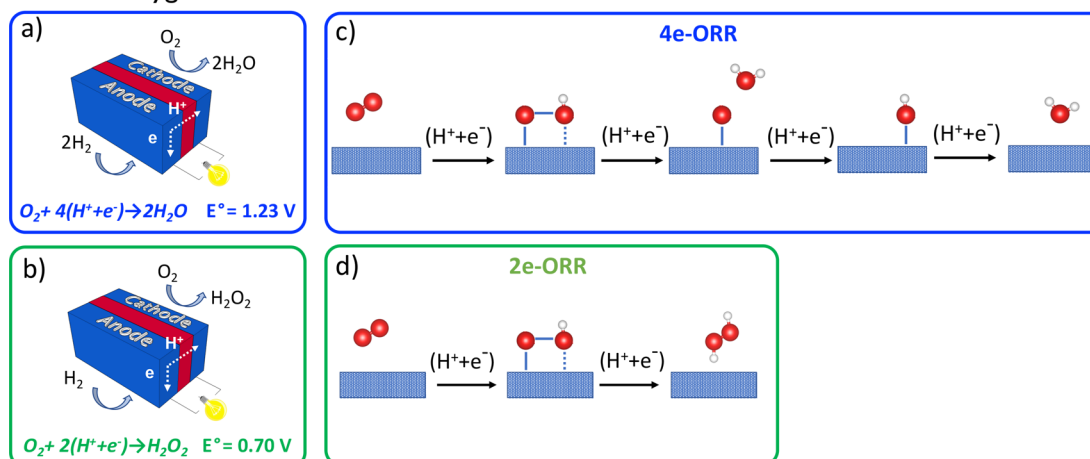


Figure 2. (a,b) Schematics of the fuel cells for the 4e-ORR that fully reduces oxygen to water as the main product and 2e-ORR which partially reduces oxygen and results in hydrogen peroxide as the major product, respectively. (c,d) Schematics of the mechanisms for 4e-ORR with water and 2e-ORR with H_2O_2 as the main products.

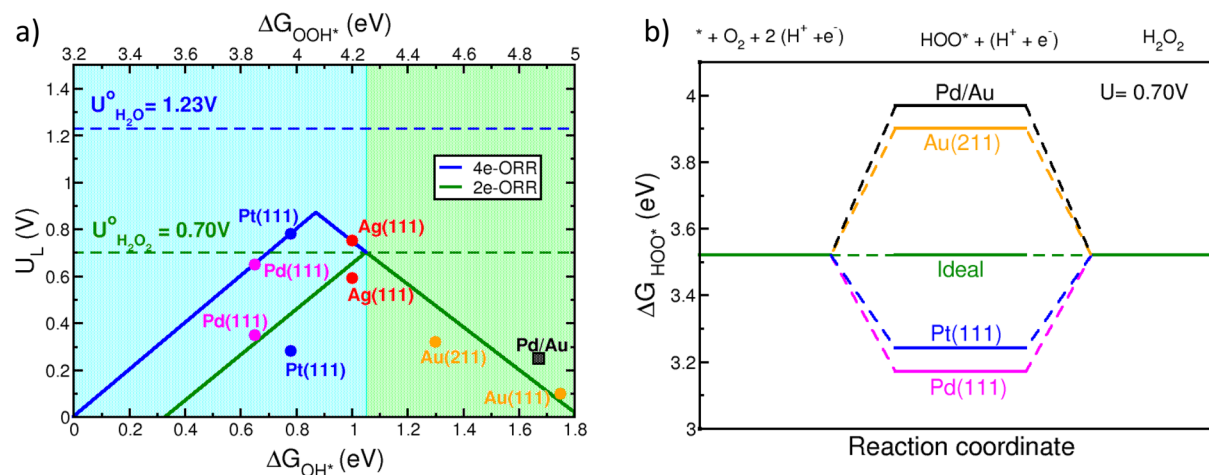


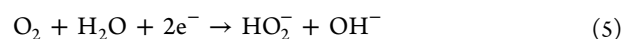
Figure 3. (a) 2e-ORR (green) and 4e-ORR (blue) activity volcano plots including the activity of noble transition metals such as Pt, Pd, and Au. Shaded blue and green areas represent the regions with high selectivity for H_2O and H_2O_2 , respectively. (b) Free energy diagram for the 2e-ORR at 0.70 V. Data for figures are adapted from ref 50. Copyright 2013 IOP Publishing.

bond in the key OOH^* intermediate tend to be selective toward H_2O_2 . In contrast, catalysts with strong oxygen binding energies easily dissociate the O–O bond and are selective to form water as the main product. Therefore, catalysts for H_2O_2 are limited to those that bind oxygen not too strongly. In the following, we show how this simple principle has led to catalyst design principles and multiple discoveries during the past few years. We first focus on pure transition metals and then turn our focus to alloys and other classes of materials such as carbon-based materials, sulfides, and oxides.

Similarly, the adsorption strength of O_2 to the surface can be used to explain selectivity between 2e- and 4e-ORR. It has been shown that strongly bonded O_2 molecule has a parallel orientation to the surface, whereas weakly adsorbed O_2 is vertical.⁴⁸ Ab initio studies of O_2 adsorption to metal surfaces suggests that the lowest reaction barrier corresponds to a parallel orientation of oxygen followed by dissociation reaction. The perpendicular orientation of oxygen will result in a higher reaction barrier for O–O bond scission, which results in higher

2e-ORR product.⁴⁹ These results show that as the reactivity of the surface increases, it is more likely for oxygen to react with the surface through side-on mode, which results in O–O bond scission and the subsequent 4e-ORR pathway.

We note that the mechanism of eqs 4a–4b is based on acidic conditions where two coupled proton–electrons are transferred to the O_2 molecule and form OOH^* and subsequently H_2O_2 . The 2e-ORR mechanism can also be considered for alkaline conditions:



where hydrogenation of oxygen (eq 5a) is followed by the reduction of OOH^* to form peroxide ion. Similar to the acidic mechanism, the only involved intermediate is OOH^* in a basic mechanism. The difference is that the proton source in acid environment is hydronium, while it is water in base. Hence, the

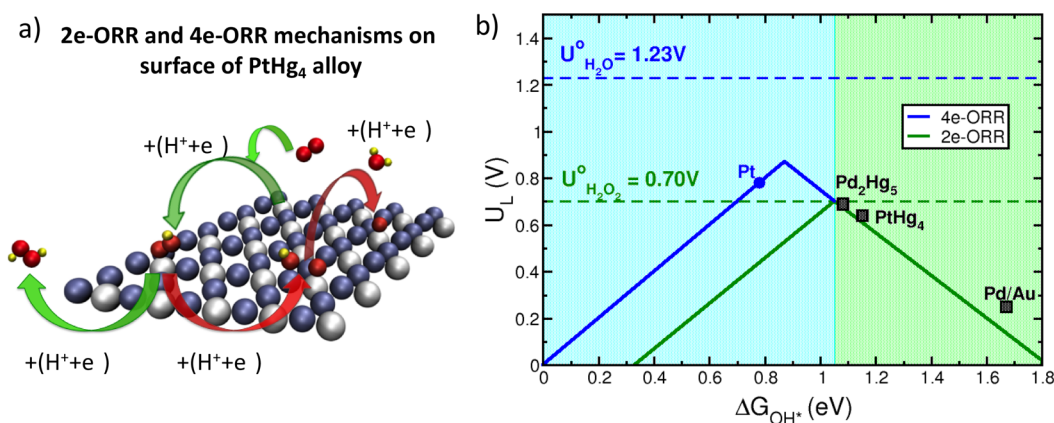


Figure 4. (a) Isolated active sites in PtHg₄ alloy preserve O–O bond (green arrows) and maximize selectivity toward production of hydrogen peroxide. Reproduced with permission from ref 13. Copyright 2013 Nature Publishing Group. (b) Activity volcano plot, describing both 2e- and 4e-ORR activity plots. Shaded blue and green areas represent the regions with high selectivity for H₂O and H₂O₂, respectively.

adsorption energy of OOH* remains the best descriptor of activity in both acid and base. Adsorption energy is a surface property; therefore, it should not be affected by the proton source. Moreover, in computational modeling, everything is modeled on the basis of RHE scale (i.e., pH = 0), which means if the active sites in the catalyst remain unchanged in acid and base, a similar trend in activity is observed among several active sites in acid and base.

2.1. Pure Metals. To model the adsorption energy of the intermediates, we assume the computational hydrogen electrode (CHE) model,³⁴ which takes the chemical potential of a proton and electron pair equivalent to that of gas-phase H₂ at potential of $U = 0$ V. The effect of the electrode potential on the free energy of reaction intermediates is taken into account by shifting the electron energy by $-eU$, where e and U are the elementary charge and electrode potential, respectively. Figure 3a shows the activity volcano maps for the 2e-ORR (green) and 4e-ORR (blue) and includes the calculated limiting potential (U_L) for several transition metals as a function of OH* and OOH* intermediates.⁵⁰ Dashed lines refer to the standard equilibrium potentials for 2e-ORR and 4e-ORR. The peak of the volcano graphs represents the highest activity (highest limiting potential and lowest overpotential) that can be achieved for each pathway. Shaded areas indicate the selectivity regions for H₂O (blue) or H₂O₂ (green) products. On the far right of both 2e- and 4e-volcano maps, there are catalyst materials with weak OOH* and OH* adsorption energies which indicate high selectivity for 2e-ORR and synthesis of H₂O₂. It is worth noting that OH* and OOH* intermediates follow the scaling relationship ($\Delta G_{OOH^*} = \Delta G_{OH^*} + 3.2$).⁵¹ Therefore, both OH* or OOH* adsorption energies can be used as a descriptor of 2e and 4e-ORR activities. Figure 3a includes the analysis for both of these two descriptors. This figure shows that Au(111) weakly interacts with oxygen, and therefore, it is selective for the 2e-ORR. Indeed, Au is experimentally known as the only transition metal that selectively reduces oxygen to H₂O₂.⁵² However, although the selectivity is predicted, activating oxygen to form key intermediate OOH* becomes difficult due to the weak interaction of Au(111) surface with oxygen. Therefore, it costs a lot of energy to reduce oxygen to H₂O₂ on Au(111) surface. This means very low activity and high selectivity, whereas ideally both high selectivity and activity are desired. Other facets of Au such as (211) boost the activity toward 2e-ORR

due to slightly stronger oxygen binding energy. However, the activity is still far below the optimum. Other transition metals such as Pt, Pd, and Ag bind OH* and OOH* strongly such that the O–O is dissociated, and they proceed via the 4e-ORR with water as the main product (Figure 3a). Figure 3b shows the free energy diagram for the 2e-ORR at the standard potential of 0.70 V. The free energy of the ideal catalyst is flat at 0.70 V which results in zero overpotential with maximum activity. Transition metals such as Pt and Pd bind OOH* intermediate too strongly such that formation of H₂O₂ becomes a bottleneck step. Additionally, on Au(211), formation of OOH* is uphill, preventing the reaction to proceed at 0.70 V.

2.2. Alloys. As shown in the previous section, none of the transition metals are sufficiently active and selective for 2e-ORR. In 2011, Jirkovsky et al.⁵³ showed that active-site geometry plays a major role in determining its selectivity. They investigated alloying the surface of Au(111) with single-atom sites of Pd, Pt, Rh, and so on, and showed that this design helps preserving the O–O bond. As shown in Figure 3a,b, the activity of Pd/Au alloy is improved compared to Au(111) but it is almost identical to the activity of Au(211).⁵⁰

In 2013, Siahrostami et al.¹³ investigated a wide range of bulk alloys containing a single active element toward ORR (such as Pd, Pt, Rh, Ru, Ir, etc.) surrounded by an inert element (such as Hg and Au). The active element was capable of adsorbing an oxygen molecule and reducing it to OOH* but was unable to dissociate the O–O bond because the neighboring site was not prone to bond the dissociated product, that is, OH* (Figure 4a). The isolated active sites in the bulk alloys were predicted to effectively activate oxygen, therefore boosting activity and preserving selectivity toward the desired H₂O₂ product by not allowing O–O dissociation. Following these predictions, active and H₂O₂ selective Pt–Hg¹³ and later Pd–Hg¹⁴ alloys for this reaction were experimentally verified (Figure 4b). More specifically, these alloys exceeded all previous experimental activity benchmarks and exhibited 98% selectivity toward desired product. To date, they remain the most active and selective known electrocatalysts for aqueous synthesis of H₂O₂ in acidic media.

Other alloys of mercury such as Ag–Hg and Cu–Hg have also been examined both experimentally and computationally, where Ag–Hg was shown to have an order of magnitude improvement in activity over Au.⁵⁴ Apart from alloys of

which perform well in acidic media, glassy carbon and annealed glassy carbon are shown as among the highest-performing catalysts for alkaline media in Figure 5b. Many other reports on carbon-based materials show similar performance in alkaline media, which we discuss in section 2.3.

2.3. Carbon-Based Materials. Carbon is a key constituent of a number of nontoxic, active, and earth-abundant materials for 2e-ORR. Porous carbon materials have shown great promise in this regard owing to their high surface area, tailorable porosity, and high electronic conductivity. Hierarchical porous carbon includes various porosities from micro-/meso-/macroporous network, which can be tuned to facilitate both mass transport and activity. The electronic properties of carbon-based materials can be further tailored by introducing heteroatom or single metal dopants,^{56–58} defects, and oxygen functional groups.⁵⁹ In the past few years, the field of electrochemical synthesis of H₂O₂ has witnessed a significant revolution in designing carbon-based materials both experimentally and computationally.^{60–65} Herein we mostly focus on highlighting literatures which have emphasized the computational aspect as the experimental literature have been thoroughly discussed in other review articles.^{38,41,66,67}

Figure 6a schematically outlines a summary of the different structural motifs used in various research efforts that may tune the activity and selectivity of carbon-based materials for 2e-ORR. Figure 6b summarizes the results of several different reports on carbon-based materials in the context of the activity volcano shown previously. These studies can be divided into several categories; these include metal and heteroatom-free carbon-based materials, oxidized carbon, carbon-based single atom catalysts, and heteroatom doping, which will be discussed separately.

2.3.1. Metal and Heteroatom-Free Carbon-Based Materials. Carbon-based materials with no metal or heteroatom have been widely examined for ORR.^{12,22,68–74} Intrinsic carbon defects (defects created by a physical or chemical method) are known to be responsible for the ORR activity. The nature of the active site has been controversial as it requires fine characterization techniques such as high-resolution transmission electron microscope (HRTEM) for direct imaging of the atomic structure and observation of different defects. Liu et al.⁶⁸ suggested that certain defects and sp³-C bonds are the active sites. In the past years, several different computational studies have been conducted to measure the activity of different possible defects.^{22,70,75,76} For example, Chen et al.²² systematically examined a variety of different defects consisting of pentagons, heptagons, and octagons in a graphene lattice with no dangling bonds. These defects are known to form during a synthesis procedure of different carbon samples. This study predicted that most of defects in carbon-based materials are inherently selective for production of H₂O₂ and some are very active, especially the ones with pentagons.²²

2.3.2. Oxidized Carbon. Incorporating functional groups through chemical functional design is an effective strategy to enrich the catalytic activity of carbon-based materials. In particular, oxygen functional groups have proven to significantly improve the performance of different carbon nanostructures toward 2e-ORR. A pioneer study by Lu et al.¹⁶ showed that particular oxygen-containing functional groups such as ether (C–O–C) or carboxyl (–COOH) can also promote activity and selectivity for 2e-ORR in carbon materials. This work revolutionized the view about the ability of different oxygen for enhancing the 2e-ORR activity and selectivity.

Many follow up works were published trying to improve selectivity and activity for 2e-ORR using different carbon nanostructures and preparation methods. The field is still growing in this direction. A recent combined experimental computational study by Han et al.⁷⁷ shows that quinone functional groups in the edge of carbon nanostructure exhibit high selectivity and activity for 2e-ORR.

2.3.3. Carbon-Based Single-Atoms Catalysts (SACs). Single-atom catalysts SACs have emerged as an interesting catalytic system providing a unique chemistry with a great platform to explore many different reactions such as CO₂ reduction reaction, oxygen evolution reaction, and oxygen reduction reaction.^{78,79} Among different possible SACs, carbon-based SACs have attracted a lot of attention because of the recent advances in synthesis and characterization methods. Jiang et al.¹⁷ showed that incorporating single atoms of Fe in a partially oxidized carbon substrates enhances the selectivity and activity for ORR.

A special attention has been paid to synthesizing and exploring catalytic activity of metal–nitrogen–carbon (M–N–C), in which metal is coordinated with four nitrogen atoms making a MN₄ motif also known as porphyrin in carbon substrate.^{65,80,81} These systems provide a unique platform for enhancing the selectivity toward 2e-ORR while maintaining activity. A computational study by Siahrostami et al.⁸² in 2013 on a variety of MN₄ (M = Cr, Mn, Fe, Co, Ni and Cu) embedded in graphene showed that CoN₄ has the ideal OOH* binding energy (4.23 eV) and therefore predicted to exhibit the highest activity for production of H₂O₂ among other MN₄ motifs. The recent experimental techniques have enabled careful and targeted synthesis of MN₄ motifs, and works have demonstrated that indeed CoN₄ is active and selective for 2e-ORR. In the following we overview some of the recent works in this area. A combined experimental-computational study by Sun et al.⁶⁵ investigated the activity and selectivity of metal–nitrogen–carbon (M–N–C) for a series of M = Mn, Fe, Co, Ni, and Cu. Among these, Co–N–C was found as the most active and selective moiety for 2e-ORR both experimentally and computationally. The experimental trend in activity of different M–N–C moieties was well captured by DFT calculations and the value for the calculated limiting potential of Co–N–C was reported as 0.54 V. Similarly, Gao et al.⁸⁰ calculated the activity of the same M–N–C moieties (M = Mn, Fe, Co, Ni, and Cu) and showed that Co–N–C is the most active. They attributed this high activity to the end-on adsorption mode of O₂ molecule to the single metal atoms that results in optimum binding energy of OOH* and d-band center of the single metal atom. Jung et al.⁸⁸ synthesized a single atom catalyst in nitrogen-doped graphene. They showed that addition of electron-rich (e.g., O) or electron-poor (H⁺) species near the metal-N moiety results in a change of the ΔG_{OOH*}.

In addition to incorporating single metal atoms in nitrogen-doped carbon, several studies have focused on adding single metal atoms in sulfur-doped carbon nanostructures to enhance the 2e-ORR selectivity and activity. Choi et al.²⁰ experimentally showed a high selectivity for atomically dispersed Pt in S-doped carbon substrate. Using DFT calculations, they investigated several possible active sites for a single Pt atom surrounded by sulfur in graphene and reported a calculated limiting potential of 0.64 V. Tang et al.⁸³ prepared a high loading of Mo-SAC with oxygen and sulfur coordination in carbon substrate and showed over 95% selectivity for 2e-ORR.

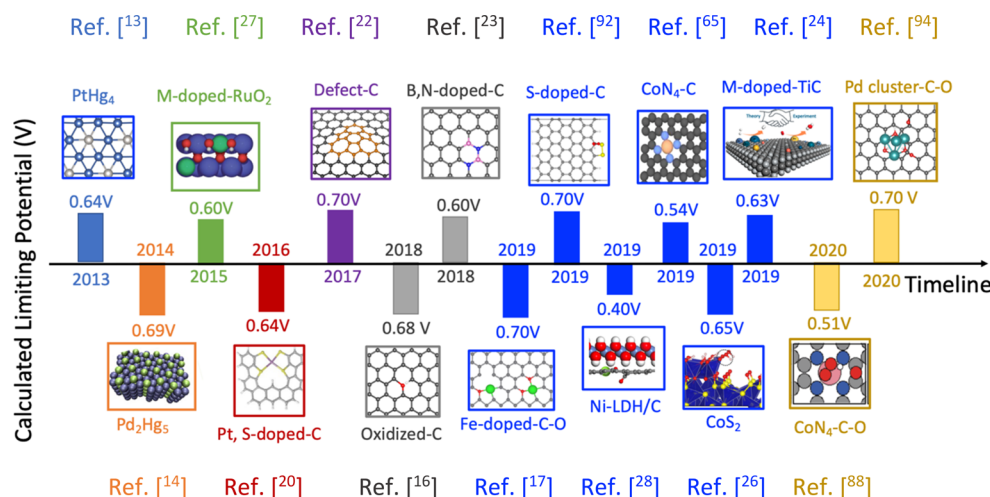


Figure 7. Timeline showing the computational reports for 2e-ORR. The bars show corresponding reported calculated limiting potentials (U_L) for the most active structure in each literature. The corresponding selectivity measured by experiment can be found in Table S2, Supporting Information.

DFT calculations on several Mo–O/S–C model structures revealed the critical role of coordination environment for Mo–SAC.

There are also other studies that include SACs in noncarbon-based substrates. For example, a study by Shen et al.⁸⁴ shows that including single atoms of Pt in CuSx directs the selectivity toward 2e-ORR with H₂O₂ selectivity around 92%–96% in acidic electrolyte.

Apart from SACs, there are studies in the literature that focus on incorporating metal nanoparticles for tuning the electronic structure of the carbon materials and controlling the selectivity toward 2e-ORR. For example, N-doped graphitic carbon with embedded cobalt nanoparticles was examined by Lenarda et al.⁸⁵ and shown to produce H₂O₂ with almost 100% faradaic efficiency at 0.5 V vs RHE. Gan et al.⁸⁶ investigated the activity and selectivity of different Pt nanoparticles supported on the carbon nanotube (CNT) structure. This study demonstrated that selectivity is correlated with the size of Pt nanoparticles on the CNT such that by decreasing the size, the 2e-ORR increases. Similarly, Kim et al. examined activity and selectivity over a range of atomically dispersed metals (Os, Ru, Rh, Ir, and Pt) on CNT.⁸⁷ Based on this study, Pt showed the greatest selectivity toward formation of H₂O₂, while Rh showed the best activity. Selectivity was attributed to the adsorption energies of both OOH* and O*, where a proportional increase in H₂O₂ selectivity was observed with weakening of O* adsorption energy.

So far, we have shown that there are many recent studies to demonstrate the synergistic effect of the metal single atoms or nanoparticles with carbon nanostructures to enhance the performance toward 2e-ORR. However, we note that careful experimental analysis shows that many synthesis procedures for carbon-based materials will incorporate a wide range of metal impurity types and amounts.⁸⁹ These metallic impurities can significantly change the electrochemical properties of the carbon-based materials. Therefore, careful characterization techniques are required to make sure of the absence of unanticipated metal impurities.

2.3.4. Heteroatom Doping. Doping carbon-based materials with heteroatoms has also been extensively studied for boosting activity and selectivity of the 2e-ORR. Although mostly studied for 4e-ORR, N-doped carbon has been also

examined for 2e-ORR.^{15,62,64,90,91} A combined experimental-computational study by To et al.⁴⁴ shows that N-doped into pentagonal defects drives 4e-ORR while N-doped in six-membered ring graphitic carbon drives the 2e-ORR. Chen et al.²³ systematically examined different concentrations of boron and nitrogen codoped in carbon. Their combined experimental and computational results revealed that hexagonal boron nitride (*h*-BN) domains formed in the graphitic structure of carbon, which are energetically more favorable than individual B- and N-doped moieties, yield higher activity and selectivity toward 2e-ORR.²³ Other heteroatoms such as sulfur⁹² and fluorine⁹³ have also been examined for the 2e-ORR. Sulfur-doped carbon has been experimentally examined by Chen et al.⁹² which showed 70% selectivity. Computational modeling using DFT calculations showed limiting potential around 0.70 V.

Although carbon materials have shown superior activity and selectivity for 2e-ORR, their performance is limited to alkaline media. This results in difficulties in the long term storage and transportation, since H₂O₂ is not stable under alkaline conditions. Therefore, the focus of recent studies on carbon-based materials has turned toward developing materials that are reasonably active in neutral and acidic media. The two separate studies by Lu et al.¹⁶ and Jiang et al.¹⁷ demonstrated reasonable activity and selectivity for 2e-ORR under neutral pH. Very recently, Chang et al.⁹⁴ showed for the first time that dispersed Pd clusters in a fully oxidized carbon nanotube shows not only superior activity but also high selectivity and stability under acidic conditions.

2.4. Sulfide, Oxides, Carbides, and Molecular Catalysts. Apart from carbon-based materials, other classes of materials such as transition metal sulfides,^{25,26} oxides,^{27,28} and carbides²⁴ have been examined for 2e-ORR. Several metal-doped RuO₂ structures have been experimentally and computationally investigated by Abbott et al.,²⁷ where Ni-doped RuO₂ was shown to have selectivity and activity toward 2e-ORR with calculated limiting potentials around 0.6 V. Hybrid structures of Ni-based layered double hydroxide (Ni-LDH) dispersed on carbon nanosheets (CNS) have been shown to hinder the 4e-ORR pathway and favor the 2e-ORR.²⁸ Using DFT study, a synergetic relationship between the Ni-LDH and the CNS was revealed in which, through steric

Electrolyzer

WOR = Water Oxidation Reaction

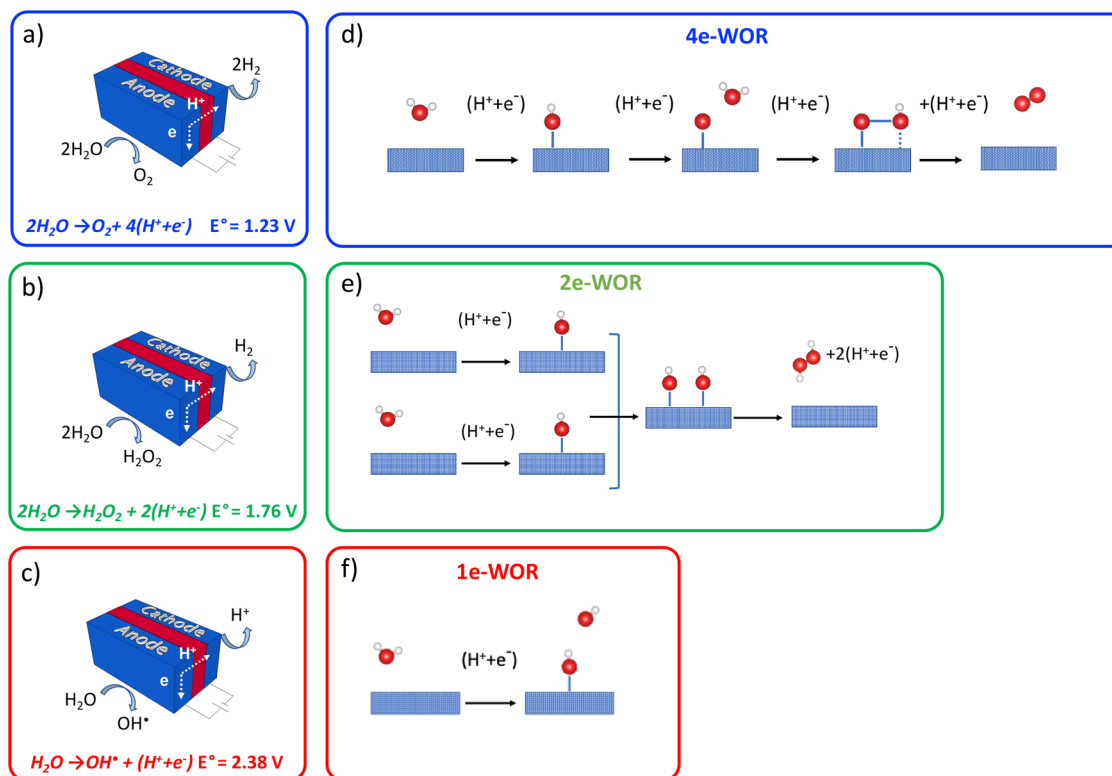


Figure 8. (a) 4e-WOR that fully oxidizes water to oxygen and hydrogen as main products. (b) 2e-WOR which partially oxidizes water and results in hydrogen peroxide as the major product. (c) 1e-WOR, which results in OH radical. Schematics of the mechanisms for the three WORs: (d) 4e-WOR, (e) 2e-WOR, (f) 1e-WOR.

effects, the CNS suppressed O–O bond cleavage and production of H_2O , whereas the Ni-LDH provided defective Ni edge active sites for 2e-ORR. On the basis of a combined computational and experimental study, Sheng et al.²⁵ argued that structural properties of cobalt pyrite (CoS_2) disfavor the O–O scission that is required for the 4e-ORR. They explained that the large spacing between neighboring Co active sites prevents the two oxygens in OOH^* to be adsorbed. Consequently, the O–O bond is preserved in OOH^* , and H_2O_2 formation is favored. However, a study by Zhao et al.²⁶ shows that CoS_2 is strongly prone to oxidation under relevant pH and potential of ORR. This suggests the active phase of CoS_2 is the Co-oxy-hydroxy passivation layer on its surface. Taking several oxy-hydroxy models into account for the DFT calculations this work identifies the relevant active sites for the 2e-ORR on CoS_2 structure. Experiments on TiC-supported single atoms by Sahoo et al.²⁴ showed reasonable activity and selectivity for 2e-ORR. Trends in activity for different single atoms examined were reproduced by DFT, and the limiting potential calculated for the Au doped in the TiC was reported as 0.63 V.

In addition to oxides and sulfides, advances in homogeneous catalysis are happening as well, but it is outside of the scope of this article.^{95,96}

Figure 7 shows the timeline for evolving new materials for 2e-ORR in the field that are investigated with the aid of computational guidelines. For simplicity, this figure only represents the calculated limiting potentials which can be related to the activity of the material. The closer the potential

to the equilibrium potential of 2e-ORR (i.e., 0.70 V), the higher is its activity. We would like to emphasize once more that both activity and selectivity are important metrics in discovering new catalyst materials for 2e-ORR. Currently, there is not a well-defined computational protocol to estimate selectivity trends. However, the rotating ring disk electrode (RRDE) measurement is a proven experimental technique to measure selectivity with reasonable accuracy. The reported numbers for selectivity are collected in Table S2 for references in Figure 7.

3. ELECTROCHEMICAL SYNTHESIS OF H_2O_2 THROUGH WATER OXIDATION REACTION

Oxidizing water is a well-known process for sustainable production of hydrogen via a four-electron water oxidation reaction (4e-WOR, eq 6). Although the 4e-WOR (the half-oxidation reaction of water splitting) has been at the center of attention for H_2 production,^{97–105} this reaction is out of the scope of this Review. Rather, our focus is on the two-electron water oxidation (2e-WOR) to produce the thermodynamically less favorable H_2O_2 (eq 7). Apart from the 2e-WOR, a one-electron water oxidation (1e-WOR) may also occur which results in hydroxyl radical (eq 8). Both H_2O_2 and hydroxyl radicals are powerful oxidizing agents and can be used for water disinfection. Among these, H_2O_2 is of particular interest because of its green credentials and less-demanding oxidation potential (1.78 V).

The 4e-WOR:

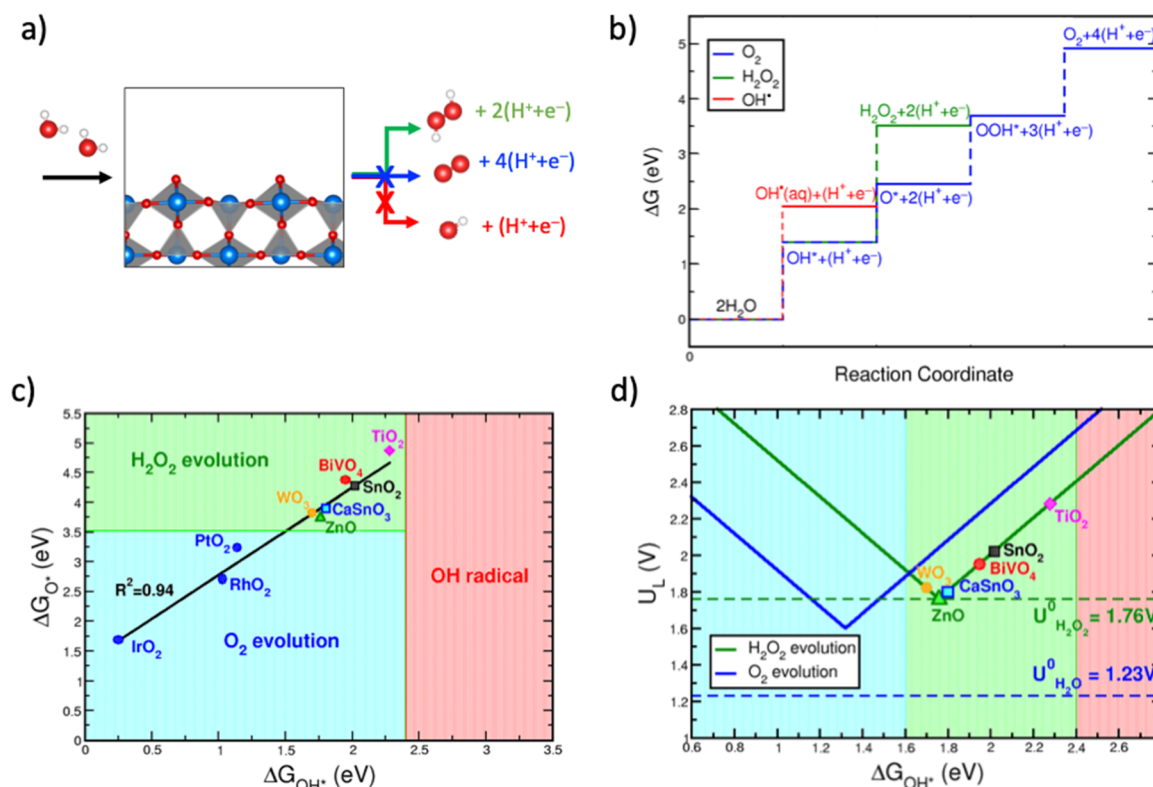
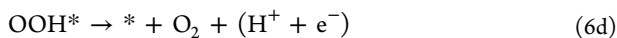
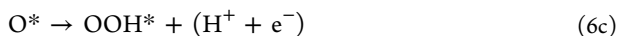
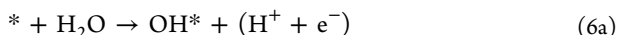
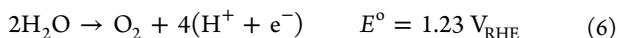
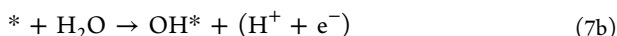
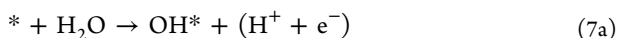
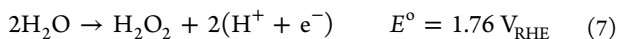


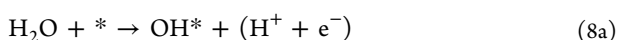
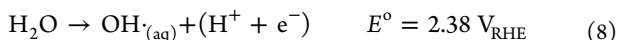
Figure 9. (a) Schematics of different possible WOR pathways. (b) Free energy diagram for 2e-WOR (green) vs 4e-WOR (blue) and 1e-WOR (red). (c) Product selectivity map in terms of the binding energies of O^* vs OH^* showing different regions of selectivity for H_2O_2 , O_2 and OH radical products. The black dashed line displays the scaling line between O^* and OH^* on different oxides (data adapted from refs 29–31,118,120,123–125). (d) Activity volcano plots for the 2e-WOR (green) and 4e-WOR (blue) showing trends in activity across different classes of materials. The corresponding equilibrium potential for each reaction has been shown in dashed lines.



The 2e-WOR:



The 1e-WOR



Compared with the 4e-WOR, less attention has been paid to selective oxidation of water to H_2O_2 (2e-WOR) owing to the fact that it is a challenging reaction. The first experimental evidence of electrochemical oxidation of water to H_2O_2 was reported on MnO_x .^{106,107} Reactive O-containing species,

namely, hydroxyl radicals, hydrogen peroxide, and superoxide anions, have been detected at the surface of titanium dioxide under UV irradiation.^{108–112} Small amounts of hydroxyl radical have been detected on the BiVO_4 under the visible light.^{113–116} Fuku et al. reported the first successful photoelectrode system capable of producing and accumulating hydrogen peroxide.¹¹⁷ In 2015, Viswanathan et al.¹¹⁸ investigated the 2e-WOR using density functional theory (DFT) and showed that adsorption free energy of OH^* can be used to explain the selectivity between 2e- and 4e-WOR. They also suggested OH^* adsorption free energy is an appropriate descriptor for the trends in activity across different examined oxides. Later in 2017, Siahrostami et al.,¹¹⁹ addressed challenges associated with the water oxidation to hydrogen peroxide including the 1e-WOR (eq 7) that produces OH radicals. They identified thermodynamic constraints that limit the design of a selective and active catalyst for this reaction. On the basis of these, we are now capable of screening large classes of materials to identify efficient catalysts for the water oxidation to hydrogen peroxide. Herein, we briefly overview the procedure that led to identifying constraints for selectivity and activity trend across different oxide materials.

3.1. Selectivity and Activity. The first step to capture the trends in selectivity and activity is to construct free energy diagrams for all the three WORs (Figure 8) assuming the computational hydrogen electrode (CHE) model.³⁴ Figure 9b shows the free energy diagram for the 2e-WOR (green solid line) to hydrogen peroxide versus the 4e-WOR (blue solid line) to oxygen on ideal catalysts at zero potential. One of the main challenges for 2e-WOR is to prevent the 4e-WOR (eq 5),

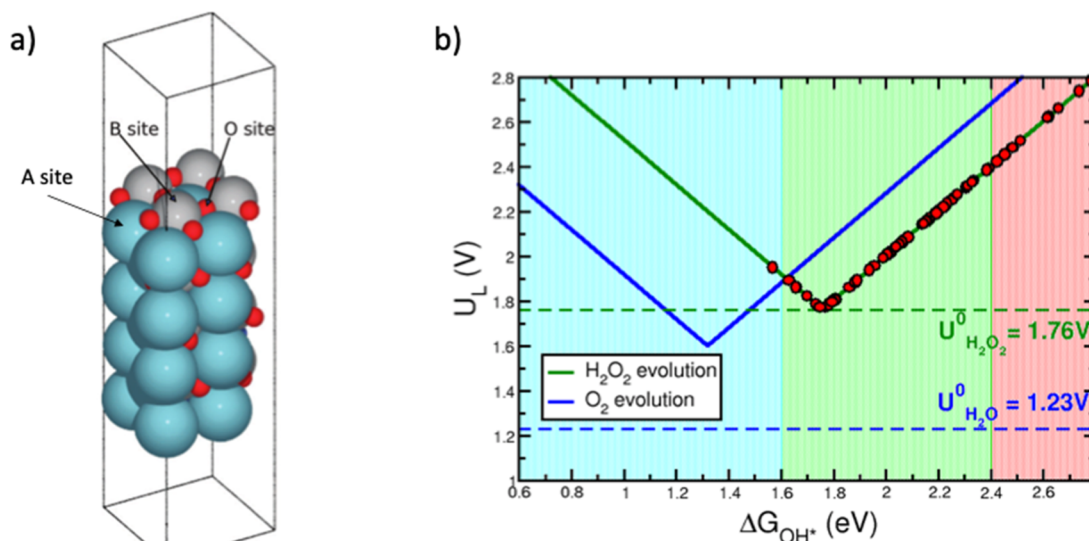
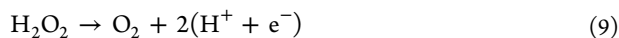


Figure 10. (a) Crystal structure of ABO_3 perovskite that is used as simulation model for DFT calculations in ref 127. (b) Activity volcano plot summarizing the results of ref 127 for the 2e-WOR process in red circles. Many of the perovskites examined in this report are promising for synthesis of H_2O_2 through 2e-WOR (data in Table S3, Supporting Information).

which evolves oxygen instead of H_2O_2 . This also means that once H_2O_2 forms through the 2e-WOR (eq 6), further oxidation to O_2 (eq 9) must be avoided.



In order to meet these criteria and advance the reaction along the desired two-electron route, a number of constraints, in terms of binding energy of different reaction intermediates, must be imposed on the catalyst. One such constraint is that the catalyst material should be able to cleave the HO–H bond in water to ensure formation of the OH^* (eq 6a). This is an important step as the OH^* is a key intermediate determining the oxidation product. Ideally, we would minimize the overpotential associated with the 2e-WOR. The overpotential for 2e-WOR is governed by the binding of a key OH^* intermediate to the catalyst surface, so controlling the overpotential is a matter of tuning the free energy of OH^* . The theoretical overpotential will be zero if the free energy diagram is totally flat at the equilibrium potential (i.e., 1.76 V). The H_2O_2 free energy shifts two times the equilibrium potential in response to a change in potential because it contains two electrons. Since the OH^* level contains only half the number of electrons, the shift will be half as large. As a result, an OH^* adsorption free energy (ΔG_{OH^*}) of 1.76 eV, when calculated at zero potential and relative to liquid water, will give zero overpotential. Moreover, to ensure that the four-electron path is suppressed, the catalyst must have $\Delta G_{\text{OH}^*} \geq 1.76$ eV. This is due to strong OH^* binding ($\Delta G_{\text{OH}^*} < 1.76$ eV), which results in further oxidation and forms O^* and subsequently OOH^* (eq 8) (the unfavored reaction path). This is a direct consequence of the scaling relation between the oxygenated species.^{120,121} In other words, we require a catalyst with weak binding of O^* and OH^* not only to quench the 4e-WOR path but also to avoid further oxidation of the produced H_2O_2 (eq 5). In terms of the free energy of adsorption, this means we require a catalyst with $\Delta G_{\text{O}} \geq 3.52$ eV, and $\Delta G_{\text{OH}^*} \geq 1.76$ eV simultaneously. Simply put, a poor catalyst for 4e-WOR with high oxygen evolution overpotential has a greater chance to be a selective catalyst for the 2e-WOR.¹¹⁸

Figure 9 also represents another important constraint on the ΔG_{OH^*} for production of H_2O_2 . This constraint is related to the free energy of the solvated OH radical (see eq 7). The total free energy of solvated OH radical is ~ 2.4 eV.¹²² In fact, we require a catalyst with at least $\Delta G_{\text{OH}^*} < 2.4$ eV and a simultaneously low barrier for recombining two OH^* to form H_2O_2 . If the OH^* binding is weak and the barrier for recombination of the two OH^* is high, an OH radical will be released to the solution, which results in suppression of H_2O_2 production. Note that formation of the OH radical is also beneficial for water purification, as it is able to oxidize organic pollutants. However, the production of H_2O_2 requires a lower redox potential than the OH radical.

The above-mentioned, purely thermodynamic constraints have been summarized in Figure 9c in terms of O^* and OH^* adsorption free energies in a selectivity diagram. This figure shows why PtO_2 , RhO_2 , and IrO_2 are known to be effective catalysts for the 4e-WOR to O_2 .¹¹⁸ The black dashed line in Figure 9c displays the scaling relationship between O^* and OH^* binding energies. Figure 9c also shows that there is a very narrow window (highlighted in green) where H_2O_2 is expected to evolve. Using these guidelines, we can rationalize the selectivity trend across a wide range of oxide materials and identify those with high selectivity for H_2O_2 product. These guidelines explain the selectivity of BiVO_4 for H_2O_2 production and have predicted new catalysts such as CaSnO_3 ³¹ and ZnO .²⁹

The analysis reported in ref 118 that applies ΔG_{OH^*} as descriptor can be used to plot an activity volcano underlining the activity of the above-mentioned catalyst materials toward 2e-WOR. Limiting potential, U_L , can be used as a metric of activity, defined as the lowest potential at which all the reaction steps are downhill in free energy. Figure 9d shows the calculated limiting potentials as a function of ΔG_{OH^*} for both 2e-WOR and 4e-WOR. It also includes the three regions of selectivity combined with the activity volcano plot to determine the selectivity and activity of the catalyst for H_2O_2 , O_2 , or OH radical evolution. Several oxides, namely, TiO_2 , SnO_2 , BiVO_4 , WO_3 , CaSnO_3 , and ZnO , have been

identified in the H_2O_2 region. The OH^* binding energy of WO_3 is close to the intersection of the two volcano plots, where the two- and four-electron paths run in parallel. This agrees well with the experimental results showing that WO_3 has a low selectivity for H_2O_2 production.³⁰ However, BiVO_4 shows very high selectivity for H_2O_2 production both computationally and experimentally.³⁰ CaSnO_3 ³¹ and ZnO ²⁹ are very close to the peak of 2e-WOR activity volcano with nearly zero overpotential and they have experimentally been shown to be both active and selective for production of H_2O_2 .

These thermodynamic guidelines can be used to search for selective and active catalysts for H_2O_2 production. We emphasize that the thermodynamic analysis has played an essential role in providing insights into the nature of active sites and guiding the design and optimization of various catalysts.³⁵ It has been shown that there is a close connection between the kinetic and thermodynamic formulations for oxygen electrocatalysis reactions.¹²⁶ Figure 10 applies this analysis on high-throughput computational data reported by Montoya et al.,¹²⁷ that includes around 560 different ABO_3 cubic perovskites. This report includes the adsorption energies of OH^* , O^* , and OOH^* on all the ~ 560 $\text{ABO}_3(100)$ perovskites (Figure 10a). Figure 10b shows the activity volcano map including 59 different perovskite structures with a promising range of adsorption energy for O^* and OH^* and which are potentially interesting to be explored experimentally (Table S3, Supporting Information). This descriptor-based analysis gives a straightforward method to quickly screen the most promising catalyst materials among a large data set of structures.

3.2. Stability. So far, we have focused on identifying active and selective catalyst materials for 2e-WOR. However, catalyst stability is another key metric for materials for electrocatalytic synthesis of H_2O_2 , and stability is strongly affected by both the extreme oxidation potential of 2e-WOR and the pH of the electrolyte. The only catalyst materials that have shown promise for this reaction are transition metal oxides, which is likely due to their partially higher tolerance of the oxidative environment. However, not all the known transition metal oxide catalysts survive long-term operation. For example, a recent study by Baek et al.,³² shows that BiVO_4 is very unstable at oxidizing potentials of >1.6 V vs RHE, especially when illumination is used to activate BiVO_4 for 2e-WOR. This is consistent with theoretical predictions of solid and solution-phase ion thermochemistry¹²⁸ which predict that BiVO_4 should decompose under the operating potential of H_2O_2 production (i.e., ~ 2.0 V into a solution-phase VO_4^- ion and a Bi_4O_7 solid). This instability is shown in the Pourbaix diagram constructed from high-throughput Materials Project data¹²⁹ (Figure 11, yellow star point). However, the stability of the BiVO_4 can be significantly improved by including some amount of an oxophilic element like gadolinium.³² Gadolinium helps stabilize the VO_4 units in the lattice of BiVO_4 which results in less degradation compared with bare BiVO_4 .

Moving forward, there is a high demand for finding stable catalyst materials under harsh operating conditions of 2e-WOR in order to make sure they are not dissolved and therefore their catalytic activities do not degrade over time. Similar to the 2e-ORR, acidic and neutral electrolytes are highly preferred for the storage and transportation of H_2O_2 . Therefore, future efforts should focus on identifying not only selective and active but also stable oxide materials for 2e-WOR.

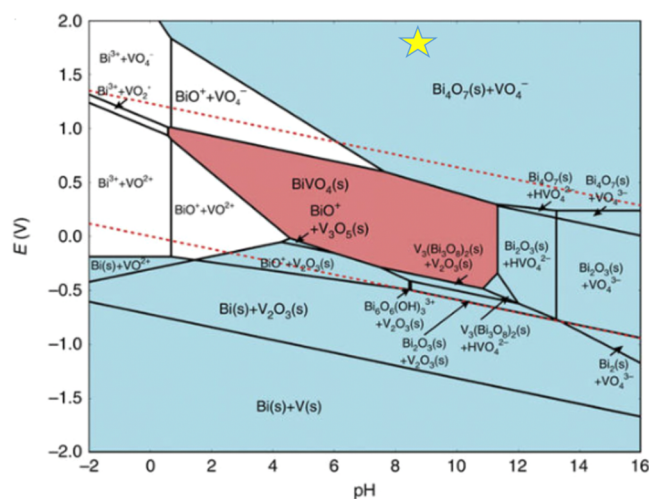


Figure 11. Pourbaix diagram of 50–50% Bi–V system in aqueous solution, assuming a Bi ion concentration at 10^{-5} mol/kg and V ion concentration at 10^{-5} mol/kg. The upper and lower red dashed lines correspond to the equilibrium potentials for oxygen evolution reaction (OER) and hydrogen evolution reaction (HER), respectively. The cyan regions denote stable solid compounds, while the pink region is BiVO_4 . The yellow star denotes the 2e-WOR reaction condition. Reproduced with permission from ref 130. Copyright 2016 Nature Publishing Group.

Pourbaix diagrams provide a useful tool that map out the compositional change for a wide range of pH and electrode potential. In other words, they represent the thermodynamic equilibrium ground states of any combination of solid and aqueous states under different pH values and potentials.¹²² Software and data sets developed by the Python Material Genome (Pymatgen)¹³¹ and Materials Project¹²⁹ enable construction of Pourbaix diagrams to evaluate electrochemical stability. More recently, capabilities for quantitative prediction of electrochemical metastability¹³² and rapid analysis of many-element compositions¹³³ have made Pourbaix analysis of nearly every DFT-simulated material straightforward. Using these tools, one can screen a large number of oxide structures with different compositions and identify the most stable ones under desired pH and potential of the 2e-WOR. As with BiVO_4 , one may also identify the modes of degradation depending on the decomposition product. These range from complete dissolution into solution-phase species (typically fast), partial dissolution and surface passivation (slower), or decomposition into solid-phase ground states (typically slowest under room-temperature conditions).

To illustrate this analysis in practice, Figure 12 shows screening of 559 ABO_3 perovskite structures on the basis of the thermodynamic descriptor and the electrochemical stability ($\text{pH} = 0, 7, 14$ and $2.0 \text{ V}_{\text{RHE}}$). A filter using the thermodynamic descriptor (ΔG_{OH^*} , ΔG_{O^*}) results in 59 perovskite structures with an appropriate range of O^* and OH^* adsorption energies. An additional stability filter using the Pourbaix diagrams generated by Pymatgen results in only 10 perovskite structures that are reasonably stable under relevant pH and potential of 2e-WOR. Note that none of the perovskites are predicted to be stable under the acidic conditions ($\text{pH} = 0$). This highlights the importance of considering the electrochemical stability, and future research efforts should be toward the development of both active and stable catalysts.

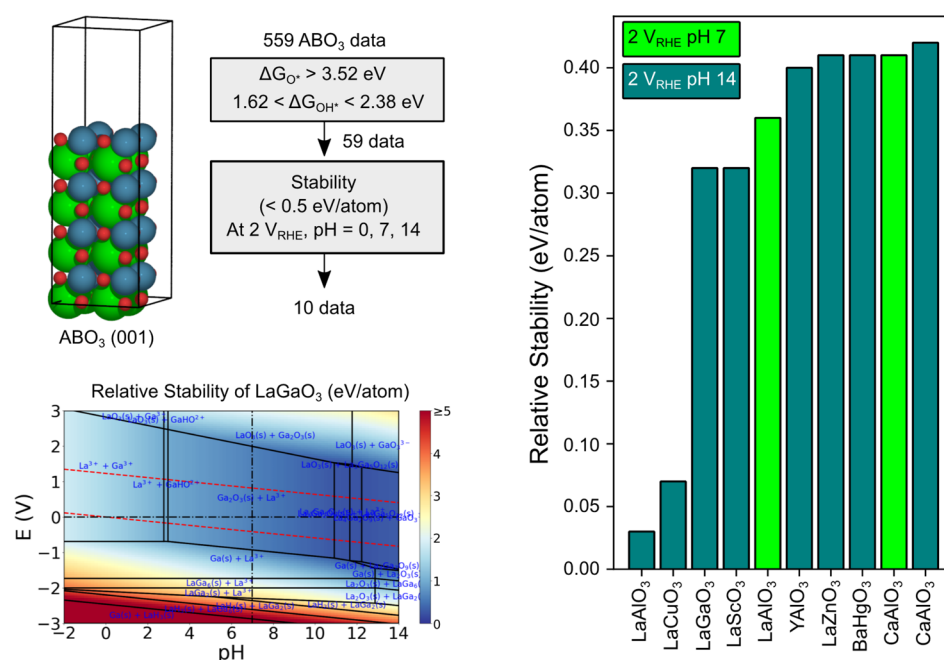


Figure 12. Screening of ABO₃ perovskites structures reported in ref 127. We first collected promising candidate perovskites for 2e-WOR using the thermodynamic descriptors, followed by the stability analysis based on the Pourbaix diagram, which resulted in only 10 promising perovskites.

SUMMARY AND PERSPECTIVE

Electrochemical synthesis via 2e-ORR and 2e-WOR are emerging processes of interest for onsite and sustainable production of H₂O₂. There have been numerous efforts in the literature in recent years to identify efficient, cost-effective, and selective catalysts for each of these two reactions. In silico computational techniques such as density functional theory calculations have played a major role in paving the road for mechanistic understanding of these reactions and designing more efficient catalyst materials.

The 2e-ORR has been widely investigated, especially after the discovery of the state-of-the-art Pt- and Pd-Hg alloys using computational guidelines in 2013 and 2014. The main body of the research published after 2014 has been focused on the carbon-based materials, which are attractive for the 2e-ORR because of their low cost, ease of synthesis, and facile tuning of their electronic structure. One of the drawbacks of most of the carbon-based materials is that their activity is limited to the alkaline environment in which H₂O₂ product deteriorates. This is obviously not ideal for long-term operation and storage of H₂O₂. Therefore, future research should focus on finding ways to enhance the activity of carbon-based materials in neutral and acidic environments. The work is in progress, and there are already several examples of carbon materials working with excellent selectivity and activity for H₂O₂ formation.

One of the emerging areas of research in the field of electrochemical synthesis of H₂O₂ is finding strategies to avoid contamination of the product solution by extraneous ions coming from the electrolyte. This would alleviate the need for preprocessing of the produced H₂O₂. Using a porous solid electrolyte (PSE) layer instead of the liquid electrolyte is an effective approach demonstrated by Xia et al.¹³⁴ to reach this goal. In this method, HOO⁻ and H⁺ are electrochemically produced at the cathode and anode, respectively. Then these two ions are transported across the membranes and

recombined within the solid electrolyte layer to produce pure H₂O₂ solutions.

Additionally, designing proper electrodes would be necessary for the 2e-ORR to increase the H₂O₂ production rate by overcoming limitations with oxygen mass transfer and low utilization efficiency of sparged oxygen. Zhang et al.¹³⁵ showed that a Janus electrode (JE) with asymmetric wettability structure (a hydrophobic gas storage layer and a hydrophilic catalyst layer) provides adequate oxygen supply and results in improving the H₂O₂ generation rate and oxygen utilization efficiency. Alternatively, gas diffusion electrodes (GDE) with a conjunction of a solid, liquid, and gaseous interface can ideally be used to enhance oxygen mass transport and H₂O₂ production rate as demonstrated by Zhu et al.¹³⁶

The 2e-WOR for electrochemical synthesis of H₂O₂ is relatively new and has recently been proven to be feasible. The first practical catalyst introduced for 2e-WOR was BiVO₄, which was later examined by DFT calculations and shown to be relatively active. DFT calculations have also been valuable in providing guidelines and descriptors for identifying selective and active catalysts in the materials space. However, stability under high oxidizing potentials (~2.0 V) for 2e-WOR poses a real challenge for long-term operation of the catalyst materials and *catalytic activity degradation*. Descriptor-based analysis and new software tools like Pymatgen can predict electrochemical stability. With these techniques, one can shortlist a large number of possible structures and *construct Pourbaix diagrams to evaluate electrochemical stability*. Moving forward, catalyst design for the 2e-WOR reaction should follow the same protocol.

Apart from transition metal oxides, other classes of materials have been examined for the 2e-WOR. Very recently, carbon-based materials have been studied by Xia et al.³³ and demonstrated to outperform previously reported transition metal oxide-based catalysts in terms of selectivity and activity. This work applies a novel approach in designing electrode interfacial engineering, whereby coating the carbon catalyst

with hydrophobic polymers allowed in situ confinement of produced O₂ gas and thereby successfully tuned the water oxidation reaction pathway. Bioinspired artificial replica is another material that have been reported for 2e-WOR. Han et al.¹³⁷ reported site-differentiated trinuclear manganese complexes that oxidize water to H₂O₂. These systems are interesting, although the faradic efficiency is only 15% and not competent with reported faradic efficiencies over transition metal oxides.

■ ASSOCIATED CONTENT

SI Supporting Information

The Supporting Information is available free of charge at <https://pubs.acs.org/doi/10.1021/acscatal.0c01641>.

Data used for plotting Figures 6b, 7, and 10b (PDF)

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Notes

The authors declare no competing financial interest.

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