Understanding the High Activity of Mildly Reduced Graphene Oxide Electrocatalysts in Oxygen Reduction to Hydrogen Peroxide

Xin Tan,*^a Hassan A. Tahini^a and Sean C. Smith *^a

^aIntegrated Materials Design Laboratory, Department of Applied Mathematics, Research School of Physics and Engineering, The Australian National University, Canberra, ACT 2601, Australia. *Email: Xin.Tan@anu.edu.au. Sean.Smith@anu.edu.au

The direct electrochemical synthesis of hydrogen peroxide (H₂O₂) would provide an attractive alternative to the traditional anthraquinone oxidation process for continuous on-site applications. Its industrial viability depends greatly on developing cost-effective catalysts with high activity and selectivity. Recent experiments have demonstrated that mildly reduced graphene oxide (mrGO) electrocatalysts exhibit highly selective and stable H₂O₂ formation activity [e.g., H. W. Kim, M. B. Ross, N. Kornienko, L. Zhang, J. Guo, P. Yang and B. D. McCloskey, Nat. Catal., 2018, 1, 282-290]. However, the identification of active site structures for this catalytic process on mrGO is doubtful. Herein, by means of firstprinciples calculations, we examine the H₂O₂ formation activities of active site structures proposed in the experiments, and find that their activities are actually very low. Then, we systematically investigate the H₂O₂ formation activities of different oxygen functional group structures on mrGO based on experimental observations, and discover two types of oxygen functional group structures (2EP and 1ET+1EP) that have comparable or even lower overpotentials (<0.10 V) for H₂O₂ formation compared with the state-of-the-art PtHg₄ electrocatalyst. Our theoretical results reveal that the graphene edge and the synergetic effects between different oxygen functional groups are essential for the superior performance of mrGO for H₂O₂ production. This work not only provides a feasible explanation of the cause of high H₂O₂ formation activity of mrGO, but also offers a guide for the design, synthesis, and mechanistic investigation of advanced carbon-based electrocatalysts for effective H₂O₂ production.

Introduction

Hydrogen peroxide (H₂O₂) is one of the 100 most important chemicals in the world with a wide range of applications, such as the paper and pulp, textile, and electronic industries, wastewater treatment, chemical oxidation (including the largescale production of propene oxide from propene oxidation) and others.[1-3] Its annual production exceeds 4 million tonnes and is expected to reach ~6 million tonnes in 2024, corresponding to US\$6.4 billion.[4] To date, the industrial synthesis of H₂O₂ still relies on the well established anthraguinone oxidation process, which is energy-intensive and is a multi-step method involving expensive palladium hydrogenation catalysts that generate substantial organic byproduct waste.[1] Furthermore, the transport, storage and handling of concentrated H_2O_2 are hazardous and expensive; therefore, on-site production of this chemical is highly desirable.[1] The direct synthesis of H₂O₂ from its constituent reagents (H₂ and O₂) in the presence of Pd-based catalysts provides a more effective and clean route.[5-7] However, the direct route needs to handle potentially explosive mixtures of H₂ and O₂, and satisfactory activity and desirable

selectivity still remain formidable challenges.[5,8,9] Another attractive and alternative route for continuous on-site direct production of H_2O_2 is electrochemical route through the oxygen reduction reaction (ORR), using only O_2 , H_2O , and electricity as inputs with no waste released, which is safer, equally ecological and proceeds under mild conditions such as ambient temperature and pressure.[10-15] However, industrially viable electrochemical production of H_2O_2 requires the development of an electrocatalyst that is stable, cost-effective, active and

Conceptual insights

Carbon-based metal-free electrocatalysts have attracted intensive interest over the past several years as cost-effective alternatives to noble metals for the direct electrochemical synthesis of H₂O₂. Recent experimental investigations have shown that mildly reduced graphene oxide (mrGO) electrocatalysts is an efficient electrocatalyst for H_2O_2 production through two-electron oxygen reduction pathway, exceeding the performance of current state-of-the-art electrocatalysts. Nevertheless, the atomistic structures of active sites on mrGO, which are undoubtedly important for determining the reaction mechanism of the H₂O₂ production on mrGO, and for the rational design of future catalysts, are not clear. To our best knowledge, the identification of active site structures for this catalytic process on mrGO, by means of firstprinciples calculations, has never been reported in the literature. Herein, for the first time, we systematically investigate the H_2O_2 formation activities of different oxygen functional group structures on mrGO based on experimental observations. Remarkably, two types of oxygen functional group structures (2EP and 1ET+1EP) are identified as the most active site structures with comparable or even lower overpotentials (<0.10 V) for H₂O₂ formation compared with the state-of-the-art PtHg₄ electrocatalyst. These theoretical results demonstrate that the graphene edge and the synergetic effects between different oxygen functional groups play a crucial role in the highly H₂O₂ formation activity of mrGO, which provides a guide for the design, synthesis, and mechanistic investigation of advanced carbon-based electrocatalysts for effective H_2O_2 production.

selective for this reaction.

Numerous materials have been explored as potential electrocatalysts for the electrochemical production of H_2O_2 , including noble metals and their alloys, such as Pd–Au,[16] Pt–Hg[14] and Pd–Hg[15], which require small overpotentials for ORR as well as high H_2O_2 selectivity (up to ~98%). Of note, density functional theory (DFT) computations have been successfully applied for the rational design of the efficient

electrocatalysts, and have found that PtHg₄ alloys are the stateof-the-art electrocatalysts for the electrochemical production of H₂O₂ in acidic conditions.[14] However, the scarcity and, thus, high cost of noble metals limit their large-scale application. Carbon-based metal-free materials are promising as alternative catalysts for the electrochemical synthesis of H₂O₂ because of multiple advantages, including their high electronic conductivities, tunable molecular structures, earth-abundance, and electrochemically stable under reaction conditions.[17,18] Very recently, the experimental results have shown that mildly reduced graphene oxide (mrGO) electrocatalysts exhibit highly selective and stable H_2O_2 formation activity at low overpotentials (<0.10 V), which exceed the performance of current state-of-the-art PtHg₄ electrocatalysts.[19] By using spectroscopic structural characterization and in situ Raman spectroelectrochemistry, they have proposed that sp²hybridized carbon near epoxy (EP) group on unannealed mrGO basal plane and ring ether (ET) defects along annealed mrGO sheet edges are the most active sites for H₂O₂ production (see Fig. 3e in ref. [19]). However, the identification of the most active site structures for this catalytic process on mrGO is doubtful, which is undoubtedly important for determining the reaction mechanism of H_2O_2 production on mrGO, and for the rational design of future catalysts. It is noteworthy that wellresolved DFT computations, especially when used in combination with experimental scattering and spectroscopic methods, have been proven as robust and powerful tools in exploring active site structures and reaction mechanisms in heterogeneous electrocatalysis. [20,21]

In this communication, we employ DFT computations to identify the active site structures for the electrochemical synthesis of H_2O_2 on mrGO. We examine the H_2O_2 formation activities of the active site structures proposed in the experiments, and find that their activities are actually very low. Remarkably, by calculating the H_2O_2 formation activities of different oxygen functional group structures on mrGO based on experimental observations, we discover two types of oxygen functional group structures (2EP and 1ET+1EP) that have comparable or even lower overpotentials (<0.10 V) for H_2O_2 formation compared with the state-of-the-art PtHg₄ electrocatalyst. These theoretical results demonstrate that the graphene edge and the synergetic effects between different oxygen functional groups play a crucial role in the highly H₂O₂ formation activity of mrGO. Our findings not only provides a feasible explanation of the cause of high H_2O_2 formation activity of mrGO, but also offers a guide for the design, synthesis, and mechanistic investigation of advanced carbon-based electrocatalysts for effective H₂O₂ production.

Results and discussion

In electrochemical ORR, the O_2 can be convert through one of two reactions: the 4–electron process to form H_2O (equation (1)) or the 2–electron process to synthesize H_2O_2 (equation (2)). [14,15]

$0_2 + 4\mathrm{H}^+ + 4\mathrm{e}^- \rightarrow 2\mathrm{H}_2\mathrm{O}$	<i>U</i> ⁰ = 1.23 V versus RHE	(1)
$O_2 + 2H^+ + 2e^- \rightarrow H_2O_2$	<i>U</i> ⁰ = 0.69 V versus RHE	(2)

where U^0 is the equilibrium potential for each reaction, and RHE is the reversible hydrogen electrode. For an efficient catalyst for electroreduction of O₂ to H₂O₂, the catalyst should provide high activity, by minimizing the overpotential for the 2–electron pathway (equation (1)), and high selectivity, by suppressing the 4–electron pathway (equation (2)).[14,15] In this work, we used the free energy of the sole adsorbed intermediate HOO* (ΔG_{HOO^*}), which is proven to be the key descriptor, to determine the catalytic activity and selectivity for electroreduction of O₂ to H₂O₂.[14,15] This leads to a Sabatier volcano where the highest activity is achieved on the surface with a moderate interaction with HOO*. For the ideal catalyst, the ΔG_{HOO^*} should be about 4.23 eV, so that the theoretical overpotential for H₂O₂ fomation (η) should be zero. [14,15]

The H₂O₂ formation activities of the active site structures on mrGO proposed in previous experiments

In previous experimental works, EP group on unannealed mrGO basal plane and ring ET defects along annealed mrGO sheet edges have been proposed as highly active site structures towards H₂O₂ production, based only on spectroscopic characterization structural and in situ Raman spectroelectrochemistry.[19] To examine the H₂O₂ formation activities of these active site structures on mrGO by means of DFT computations, we calculated the ΔG_{HOO^*} for these active site structures. Here, all sp²-hybridized carbon near oxygen functional groups were considered as possible HOO^{*} adsorption sites, as shown in Fig. 1a and b. Our DFT results confirm that the carbon atoms in close proximity to oxygen functional groups are the most active adsorption sites for HOO* (the optimized configurations are shown in Fig. 1c and d), where the overpotentials for H₂O₂ production are minimum. The computed values of $\Delta G_{\text{HOO}*}$ for these two structures are 5.15 and 5.18 eV, respectively, yielding high overpotentials of 0.92 and 0.95 V, respectively, suggesting that these two active site structures on mrGO does not significantly contribute to the H₂O₂ production. Therefore, from a DFT computation point of view, neither EP group on mrGO basal plane nor ring ET defects along mrGO sheet edge is a highly active site structure towards H₂O₂ production, which is in contrast to previous experimental conclusion.[19] Two questions arise, how to explain the experimentally high activity of mrGO for electrochemical H₂O₂ production and what is the most active site structure for this catalytic process on mrGO? To address these questions, in the following, we systematically investigated the H₂O₂ formation activities of a wide range of oxygen functional group structures on mrGO based on experimental observations.



Fig. 1 (a-b) Two oxygen functional group structures proposed in previous experiments as the highly active site structures towards H_2O_2 production (see Fig. 3e in ref. [19]). (a) The EP group on mrGO basal plane and (b) the ring ET defects along mrGO sheet edges. The *sp*²-hybridized carbon near the oxygen functional groups denoted by blue circles are possible HOO^{*} adsorption sites considered in this study. Top and side view for the optimized configurations of HOO^{*} adsorbed on carbon in close proximity to (c) the EP group on mrGO basal plane and (d) the ring ET defects along mrGO sheet edges, with the minimum overpotential for H_2O_2 production. The grey, red and white balls represent C, O and H atoms, respectively.

The H_2O_2 formation activities of highly active EP group structures on the unannealed mrGO

It has been demonstrated by previous experiments that EP group is the only oxygen functional group that contribute to the H_2O_2 production on the unannealed mrGO.[19] To identify the highly active site structures on the unannealed mrGO towards H_2O_2 production, we studied the H_2O_2 formation activities of different EP group structures.



Fig. 2 (a) Structure of the 8-zGNRs with hydrogen-saturated edges used in our calculations. The blue numbers denote the possible adsorption sites for O adatom located close to mrGO sheet edge, and the corresponding E_0^F are listed in the table on the right. The optimized configurations of (b) the EP group located at sites 3 and (c) after the adsorption of HOO^{*} at the active site. The optimized configurations of (d) the EP group located at sites 5 and (e) after the adsorption of HOO^{*} at the active site. In (b) and (d), the green numbers denote possible adsorption sites for HOO^{*}. The grey, red and white balls represent C, O and H atoms, respectively.

Since the above DFT results proved that the EP group structure on mrGO basal plane has very poor activity for H₂O₂ production, we focused on EP group structures located close to mrGO sheet edge. To determine the energetically stability of EP group at different locations of the graphene, we calculated the formation energy of O adatom, E_{O}^{F} , on graphene, which defined $E_0^F = E(\text{graphene} + 0) - E(\text{graphene}) - [E(H_2 0) - E(H_2 0)]$ as $E(H_2)$], where E(graphene + 0), E(graphene), $E(H_20)$, and $E(H_2)$ are the total energy of graphene with O adatom, bare graphene, H₂O gas, and H₂ gas, respectively. According to this definition, a less positive formation energy indicates a more energetically stable structure. Fig. 2a shows possible adsorption sites for O adatom located close to mrGO sheet edges, and the corresponding E_{Ω}^{F} are listed in the table on the right. Except for site 1, where the O adatom site on top of carbon atom, a surface EP group consists of O adatom above a bright C-C site is the

most stable configuration of O adatom located close to mrGO sheet edge. Since we focused on the EP group structures on graphene, O adsorbed on site 1 was not considered here. Interestingly, the E_0^F of EP group located at site 3 (Fig. 2b) and site 5 (Fig. 2d) are 3.17 and 3.31 eV, respectively, which are more energetically stable (less positive) than that for the EP group on mrGO basal plane ($E_0^F = 3.40 \text{ eV}$), indicating that the EP group prefer to locate close to mrGO sheet edges.

In order to calculate the H₂O₂ formation activities of the EP group structures located at the stable sites close to mrGO sheet edges, i.e. at site 3 and site 5, all carbon atoms in close proximity to the EP group were considered as possible HOO* adsorption sites, as shown in Fig. 2b and d. The computed values of $\Delta G_{
m HOO^*}$ for the EP group at site 3 and site 5 with HOO^{*} adsorbed at the active site (the optimized configurations are shown in Fig. 2c and e) are 4.52 and 4.89 eV, respectively, corresponding to the overpotentials of 0.29 and 0.66 V, respectively. These results indicate that the EP group structures located close to mrGO sheet edges are more active towards H_2O_2 production in comparison with the EP group structure on mrGO basal plane $(\eta = 0.92 \text{ V})$. Of note, the overpotentials of these structures are still quite high compared to that of the state-of-the-art PtHg₄ electrocatalyst ($\eta \approx 0.10 \ {\rm V}$), suggesting these structures are also not highly active structures for H_2O_2 production.



Fig. 3 Top and side view for the optimized configurations of (a) two neighbouring EP groups at site 3, and (b) one EP group at site 3 and neighbouring EP group at site 5, after the adsorption of HOO^{*} at the active site. The grey, red and white balls represent C, O and H atoms, respectively.

Previous studies have established that the synergetic effects between functional groups may significantly affect the catalytic activity of graphene-based electrocatalyst.[22,23] Encouraged by the above graphene edge effects on the enhancement of H_2O_2 formation activities of the EP group structures, we investigated the H_2O_2 formation activity of the structures consist of two neighbouring EP groups (2EP) located close to mrGO sheet edges. Here, we considered two structures, including two neighbouring EP groups at site 3, and one EP group at site 3 and neighbouring EP group at site 5, and the optimized configurations of these two structures after the adsorption of HOO^* at the active site are shown in Fig. 3a and b. The computed values of $\Delta G_{\mathrm{HOO}^*}$ for these two 2EP structures are 4.09 and 4.30 eV, respectively, yielding small overpotentials of 0.14 and 0.07 V, respectively. These values are comparable with the current state-of-the-art PtHg₄ electrocatalyst ($\eta \approx$ 0.10 V), suggesting these 2EP structures are highly active for H_2O_2 production, which are in good agreement with the

experimental observations that the unannealed mrGO with EP groups exhibit highly H_2O_2 formation activity at low overpotentials (<0.10 V).[19]

The H_2O_2 formation activities of highly active structures consist of ring ET and EP groups on the annealed mrGO

Now, we shifted our attention to active site structures on the annealed mrGO. Previous experiments have provided strong evidence that the mrGO thermal treatment at 600 °C produces ring ET groups at mrGO sheet edges,[19,24,25] resulting in higher H_2O_2 formation activity compared with unannealed mrGO.[19] In order to explain the experimental observations and identify highly active structures on the annealed mrGO towards H_2O_2 production, we studied the H_2O_2 formation activity of different oxygen functional group structures containing ring ET group along mrGO sheet edge. First, we considered a single ring ET group located along mrGO sheet edge (Fig. 4a). The computed value of ΔG_{HOO^*} for this structure after the adsorption of HOO^{*} at the active site (the optimized configuration is shown in Fig. 4b) is 4.63 eV ($\eta = 0.40$ V), which is relatively high compared with the state-of-the-art PtHg₄ electrocatalyst ($\eta \approx 0.10$ V). This implies that the single ring ET group located along mrGO sheet edge is not highly active structure for H_2O_2 production.

Synergetic effects between different functional groups have been shown to play an important role in adjusting the catalytic activity of graphene-based electrocatalyst.[22,23] EP group is the most likely oxygen functional group that might interact with the ring ET group along mrGO sheet edge because of the high stability of the EP group located close mrGO sheet edge, which has been confirmed by our DFT calculations. For this purpose, we studied the H₂O₂ formation activities of different oxygen functional group structures consist of a ring ET group and an EP group along mrGO sheet edge (1ET+1EP). Here, we considered all energetically stable sites for EP group close to mrGO sheet edge (in Fig. 2a), and constructed the structures by adding an EP group at one of the energetically stable sites near to the ring ET group along mrGO sheet edge. Based on our DFT calculations of the ΔG_{HOO^*} for different 1ET+1EP structures, we identified two highly active 1ET+1EP structures that exhibit superior H_2O_2 formation activity, as shown in Fig 4c and e. The computed values of $\Delta G_{\rm HOO^*}$ for these two structures after the adsorption of HOO^{*} at the active site (the optimized configurations are shown in Fig. 4d and e) are 4.23 and 4.20 eV, respectively, corresponding negligible overpotentials of less than 0.03 V, which are even lower than that for the state-of-the-art PtHg₄ electrocatalyst ($\eta \approx 0.10$ V). Our DFT calculations predict that these 1ET+1EP structures are the most active site structures on the annealed mrGO, and their H₂O₂ formation activities are even higher than that of the state-of-the-art PtHg₄ electrocatalyst. These results are in good agreement with the experimental observations that the H₂O₂ formation activities of the annealed mrGO with ET and EP groups are higher than that of the unannealed mrGO, which exceed the performance of the state-of-the-art PtHg₄ electrocatalyst.[19]



Fig. 4 The optimized configurations of (a) a single ring ET group located along mrGO sheet edge, and (b) after the adsorption of HOO^{*} at the active site. The green numbers denote the possible adsorption sites for HOO^{*} adsorption. The optimized configurations of (c, e) two most active 1ET+1EP structures, and (d, f) after the adsorption of HOO^{*} at the active site. The grey, red and white balls represent C, O and H atoms, respectively.

Theoretically calculated H_2O_2 formation activities of different oxygen functional group structures on mrGO $\,$

In order to clearly compare and further understand the H₂O₂ formation activities of different oxygen functional group structures on mrGO, we summarized our DFT calculation results in a Sabatier volcano plot of limiting potential (U_L) versus $\Delta G_{\rm HOO^*}$, as shown in Fig. 5. From this figure, we can draw two conclusions: 1. The oxygen functional groups (EP or ET groups) located close to mrGO sheet edges can significantly enhance the H₂O₂ formation activity (η for 1EP and 1ET are 0.29 and 0.40 V, respectively) in comparison with oxygen functional group on mrGO basal plane ($\eta = 0.92$ V), indicating the graphene edge effect is an important factor for the H₂O₂ formation activity of mrGO. 2. The synergetic effects between different oxygen functional groups can further increase the H₂O₂ formation activity of mrGO. For example, η for 2EP structures (< 0.10 V) are comparable with the state-of-the-art PtHg₄ electrocatalyst,

and η for 1ET+1EP structures are less than 0.03 V, which reach the top of volcano plot and exceed the state-of-the-art PtHg₄ electrocatalyst. To further understand the H₂O₂ formation activities of different oxygen functional group structures on mrGO, we calculated charge densities of the active sites, i. e. the carbon atoms where HOO* stick to, for different oxygen functional group structures on mrGO, and compared with 8zGNRs with no oxygen functional group (bare-G), as shown in Fig. S1 in ESI. The calculation results clearly show that the electrons on active sites follow the order of 2EP>1EP>bare-G and 1ET+1EP>1ET>bare-G, which indicate that more electrons in 2EP and 1ET+1EP structures can be donated to adsorbed HOO*, and lead to the stronger HOO* adsorption, i.e. the enhanced H₂O₂ formation activities, compared to that of bare-G. Overall, our theoretical results reveal that the graphene edge and the synergetic effects between different oxygen functional groups are essential for the superior performance of mrGO for H₂O₂ production.



Fig. 5 The calculated $U_{\rm L}$ for H₂O₂ production of various oxygen functional group structures as a function of $\Delta G_{\rm HOO^*}$. The blue solid lines represent the theoretical Sabatier volcano.[14,15,26] The empty squares are the data adapted from ref. [14], and PtHg₄ is the reported state-of-the-art electrocatalyst with $\eta \approx 0.10$ V .[14] The equilibrium potential for H₂O₂ production, $U_{O_2/H_2O_2}^0 = 0.69$ V, is shown as the dotted line. 1EP and 1ET denote a single EP group and a single ring ET group located close to mrGO sheet edge, respectively. 2EP denote the structures with two EP groups located close to mrGO sheet edge. 1ET+1EP denotes the structures consist of an EP group and an ET group located close to mrGO sheet edge to mrGO sheet edge. Please note that the calculation results for the active site structures proposed in previous experiments[19] are out of the range.

Conclusions

In conclusion, based on first-principles calculations, we have examined the H_2O_2 formation activities of the active site structures proposed in the experiments, and found that their

activities are actually very low. To explain the experimentally high activity of mrGO for electrochemical H₂O₂ production and identify the most active site structures for this catalytic process on mrGO, we have systematically investigated the H₂O₂ formation activities of different oxygen functional group structures on mrGO based on experimental observations, and discovered two types of oxygen functional group structures (2EP and 1ET+1EP) that have high H₂O₂ formation activities. 2EP structures have comparable η (< 0.10 V) with the state-of-theart PtHg₄ electrocatalyst, and 1ET+1EP structures have even lower η (< 0.03 V) than that for the state-of-the-art PtHg₄ electrocatalyst, which are in good agreement with the experimental observations that the H₂O₂ formation activities of the annealed mrGO with ET and EP groups are higher than that of the unannealed mrGO with EP groups. Our theoretical results reveal that the graphene edge and the synergetic effects between different oxygen functional groups are essential for the superior performance of mrGO for H_2O_2 production. This work not only provides a feasible explanation of the cause of high H₂O₂ formation activity of mrGO, but also offers a guide for the design, synthesis, and mechanistic investigation of advanced carbon-based electrocatalysts for effective H₂O₂ production.

Computational methods

Our DFT calculations were carried out using the linear combination of atomic orbital and spin-unrestricted method implemented in Dmol³ package.[27] The generalized gradient approximation (GGA) in Perdew-Burke-Ernzerhof (PBE) functional form[28] together with an all-electron double numerical basis set with polarization function (DNP) were adopted. Considering the standard PBE functional is incapable of giving an accurate description of weak interactions, we adopted a DFT+D (D stands for dispersion) approach with the Grimme vdW correction in our computations.[29] The real-space global cutoff radius was set to be 5.5 Å.

In order to simulate graphene basal plane and graphene sheet edge, we considered graphene monolayer and zigzag graphene nanoribbons (zGNRs), respectively, as shown in Fig. 1a and b. For graphene monolayer, a 9×9 supercell was used, and the vacuum space was set as 15 Å in the z direction to avoid interactions between periodic images. For zGNRs, we used 8zGNRs with hydrogen-saturated edges.[30] The supercell size was 30.7×24.6×15.0 Å, and the periodic boundary conditions were applied with the vacuum separation distance set to 13 and 15 Å along the x and z directions, respectively, to avoid interaction between two ribbons. The Brillouin zone was sampled with a 3×3×1 and 1×2×1 Γ centered k points grid[31] for graphene monolayer and zGNRs, respectively. In geometry optimizations, all the atomic coordinates were fully relaxed up to the residual atomic forces smaller than 0.002 Ha/Å, and the total energy was converged to 10⁻⁵ Ha. On the basis of previous experimental observations, two types of oxygen functional groups, EP group on the basal plane and ring ET group along the sheet edges, are closely related to the catalytic process on the mrGO.[19] Here we added those oxygen functional groups in our simulation models to model the mrGO.

It is generally accepted that the electroreduction of O_2 to H_2O_2 involves two coupled electron and proton transfers:[14,15]

$$0_2 + * + (H^+ + e^-) \to HOO^*$$
 (3)

$$HOO^* + (H^+ + e^-) \to H_2O_2 + *$$
 (4)

where * represents an unoccupied active site on electrocatalyst surface, and HOO* represents the sole adsorbed intermediate for the reaction. The $\Delta G_{\rm HOO^*}$ is proven to be the key parameter, or descriptor, to characterize the activity for electroreduction of O_2 to H₂O₂, which lead to a Sabatier volcano where the highest activity is achieved on the surface with a moderate interaction with HOO*.[14,15] The $U_{\rm L}$ is defined as the lowest potential at which the two reaction steps (equation (3) and equation (4)) are downhill in free energy, and η is defined as the maximum difference between the $U_{\rm L}$ and U^0 . For the ideal catalyst, the $\Delta G_{\rm HOO^*}$ should be about 4.23 eV, so that $\eta = 0$ V .[14,15] Weaker binding to HOO* (right-hand side of volcano) are limited by hydrogenation of O₂ (equation (3)), while stronger binding to HOO* (left-hand side of volcano) will lead to the overpotential due to the reduction of HOO* to H₂O₂ (equation (4)).[14,15]

The $\Delta G_{\rm HOO^*}$ was calculated based on a computational hydrogen electrode (CHE) model proposed by Nørskov *et al.*[32,33] In this model, the free energy changes at each electrochemical step involving an proton-electron transfer are calculated using the definition that the free energy of (H⁺ + e⁻) equals to $\frac{1}{2}$ H₂(g) for standard hydrogen electrode (SHE). According to this method, the $\Delta G_{\rm HOO^*}$ was calculated as:[14,33]

$$\Delta G_{\rm HOO^*} = \Delta E_{\rm HOO^*} + \Delta Z P E - T \Delta S \tag{5}$$

where ΔE_{HOO^*} is the binding energies of HOO^{*} directly obtained from DFT calculations, ZPE is the zero-point energy, *T* is temperature, and *S* is the entropy. Here, zero-point energies and entropies of HOO^{*} and non-adsorbed gas-phase molecules were adopted from the previous literatures.[14,33] As the ground state of O₂ molecule is poorly described in DFT calculations, we used gas-phase H₂O and H₂ as reference states as they are readily treated in the DFT calculations. Please noted that we also calculated the ΔG_{HOO^*} by using the plane-wave projector-augmented wave method as implemented in the Vienna ab initio simulation (VASP) package[34,35], and the results show that the difference of calculated values by using Dmol³ and VASP are less than 0.06 eV, as shown in Fig. S2 in ESI.

Conflicts of interest

There are no conflicts of interest to declare.

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