

# Origin of the Electrocatalytic Oxygen Reduction Activity of Graphene-Based Catalysts: A Roadmap to Achieve the Best Performance

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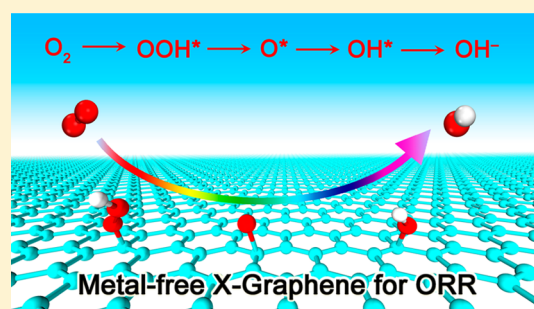
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**S** Supporting Information

**ABSTRACT:** The mutually corroborated electrochemical measurements and density functional theory (DFT) calculations were used to uncover the origin of electrocatalytic activity of graphene-based electrocatalysts for oxygen reduction reaction (ORR). A series of graphenes doped with nonmetal elements was designed and synthesized, and their ORR performance was evaluated in terms of four electrochemical descriptors: exchange current density, on-set potential, reaction pathway selectivity and kinetic current density. It is shown that these descriptors are in good agreement with DFT calculations, allowing derivation of a volcano plot between the ORR activity and the adsorption free energy of intermediates on metal-free materials, similarly as in the case of metallic catalysts. The molecular orbital concept was used to justify this volcano plot, and to theoretically predict the ORR performance of an ideal graphene-based catalyst, the ORR activity of which is comparable to the state-of-the-art Pt catalyst. Moreover, this study may stimulate the development of metal-free electrocatalysts for other key energy conversion processes including hydrogen evolution and oxygen evolution reactions and largely expand the spectrum of catalysts for energy-related electrocatalysis reactions.



## INTRODUCTION

Graphene electrochemistry has gained paramount interest owing to its unique role in energy conversion and storage devices such as fuel cells, water splitting cells, and supercapacitors.<sup>1–7</sup> One of the most extensively studied electrocatalytic applications of graphene is the oxygen reduction reaction (ORR) occurring at the cathode of fuel cells and metal-air batteries, in which advanced metal-free graphene-based electrocatalysts are considered as promising alternatives to the state-of-the-art precious Pt catalysts due to their low cost, fuel tolerance, and long-term durability.<sup>8–14</sup> Tremendous efforts have been undertaken, both on the experimental and theoretical level, to improve the ORR performance of graphene-based materials by tuning their electronic properties through doping nonmetallic heteroatoms into a graphene matrix.<sup>2,15–21</sup> However, the key ORR activity properties (e.g., exchange current density, on-set potential,  $4e^-$  pathway selectivity, and kinetic current density) of metal-free materials are still incomparable with those of Pt-based catalysts, which stimulates the ongoing debate on whether graphene is indeed an efficient catalyst for ORR.<sup>22</sup> This issue is unresolved, largely due to the lack of knowledge on the origin of graphene activity toward ORR and the effect of the doping of nonmetallic heteroatoms on the graphene's (electro)chemical properties. In other words, understanding the nature of the ORR process on

the surface of doped graphene and recognizing the origin of its electrocatalytic activity open a new era in the design of graphene-based materials with superior electrocatalytic activity toward ORR.

In general, monitoring the reaction intermediates formed on the surface of catalysts represents a possible platform for understanding the pathway and mechanism of ORR electrocatalysis;<sup>23,24</sup> however, it is difficult to observe *in situ* these adsorbed species due to their extremely short lifetimes.<sup>25</sup> Importantly, the development of computational quantum chemistry provides a feasible methodology to predict the possible intermediates formed during the ORR process and to evaluate their stabilities on the surface of catalysts in terms of the adsorption free energies. For example, a theoretical methodology has been developed for studying ORR on a wide variety of metal catalyst surfaces, and the free energy diagram for this reaction was constructed together with a volcano-shaped plot that correlates the apparent electrocatalytic ORR activity with inherent oxygen adsorption strength.<sup>26–28</sup> Consequently, various Pt and nonprecious metal alloys with superior experimentally measured ORR activities comparable to that of a pure Pt catalyst were designed and developed guided

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by the prediction of this theoretical methodology.<sup>29–34</sup> However, such advanced methodology has not been applied to metal-free catalysts such as the most popular graphene-based catalysts; whether these metal-free counterparts can possess similar catalytic behavior or be even more active than metallic electrocatalysts is unknown from both theoretical and experimental viewpoints.

Here, we extend for the first time the aforementioned methodology used for metal catalysts to metal-free systems by exploring the relationship between the experimentally measured electrocatalytic ORR performance and the theoretically predicted free energy of reaction intermediates for a series of graphenes doped with nonmetal elements. The starting point of this methodology is the construction of the ORR free energy diagrams for various doped graphene models by density functional theory (DFT) calculations. Next, the ORR exchange current density, the on-set potential, and the reaction pathway selectivity are theoretically predicted on the basis of the free energy diagrams for each model catalyst. Also, all these descriptors of the ORR activity are obtained on the basis of the electrochemical voltammograms measured for the synthesized catalysts that correspond to the models studied. The origin of the oxygen reduction activity of the graphene-based catalysts studied is explained in-depth in terms of the molecular orbital theory. By combining experimental and theoretical data, it was possible to predict for the first time the electrocatalytic ORR performance of an ideal graphene-based catalyst (X-graphene) which possesses a  $2.1 \times 10^{-6}$  A/cm<sup>2</sup> ORR exchange current density, a 0.33 V on-set potential (vs normal hydrogen electrode, NHE), and a nearly 100% 4e<sup>-</sup> pathway selectivity; these values are comparable with or even better than those of the state-of-the-art Pt catalyst. This combined computational and experimental study reveals the nature of ORR electrocatalysis for graphene-based materials and paves the way to the molecular design of more highly efficient metal-free electrocatalysts for applications beyond ORR.

## METHODS

**Materials: Synthesis and Structural Characterization.** To study the effect of different dopants on the ORR activity of graphene, we designed and synthesized nitrogen (N)-, boron (B)-, oxygen (O)-, sulfur (S)-, and phosphorus (P)-doped graphenes, respectively, as well as undoped graphene. All graphene-based samples were synthesized from chemically exfoliated graphene oxide (GO) prepared by a slightly modified Hummer's method from graphite.<sup>35</sup> After dialysis for one week, the graphite oxide dispersion was diluted, exfoliated, and centrifuged with the resulting GO concentration of ~0.5 mg/mL. The GO powder was collected by lyophilization for further doping processes. Graphite powder was considered as a representative of pure graphene (G) without any heteroatom doping. Oxygen-doped graphene (O-graphene), which can be considered as reduced GO, was synthesized by thermally reducing initial GO powder at 900 °C in flowing Ar for 3 h without any additional precursor. Due to the strong oxidation process preceding chemical exfoliation of graphite oxide, the latter possesses many oxygen-containing functional groups. During high-temperature thermal reduction (900 °C in Ar atmosphere), most of the oxygen species are removed (oxygen concentration decreases from ~50 atomic % in pristine GO to ~5 atomic % in O-graphene); only four relatively stable species are retained. Nitrogen-, boron-, sulfur-, phosphorus-doped graphenes (N-graphene, B-graphene, S-graphene, P-graphene) were produced by annealing GO powder with various heteroatom-containing precursors (the mass ratio of the initial GO to the respective precursor = 1:10) at 900 °C in flowing Ar for 3 h. Melamine (C<sub>3</sub>H<sub>6</sub>N<sub>6</sub>), boron oxide (B<sub>2</sub>O<sub>3</sub>), benzyl disulfide

(C<sub>6</sub>H<sub>5</sub>CH<sub>2</sub>SSCH<sub>2</sub>C<sub>6</sub>H<sub>5</sub>), and triphenylphosphine ((C<sub>6</sub>H<sub>5</sub>)<sub>3</sub>P) were used as the sources of N, B, S and P elements, respectively.

The X-ray photoelectron spectra (XPS) were measured on a Kratos Axis ULTRA X-ray Photoelectron Spectrometer equipped with a 165 mm hemispherical electron energy analyzer. The incident radiation was monochromatic Al K $\alpha$  X-rays (1486.6 eV) at 225 W (15 kV, 15 mA). The survey scans were taken at the analyzer pass energy of 160 eV, and the multiple high-resolution scans were recorded at 20 eV. Transmission electron microscope (TEM) imaging was conducted on a FEI Tecnai G2 Spirit TEM at a voltage of 120 kV. Nitrogen-sorption isotherms were collected on a Tristar II, Micromeritics nitrogen sorption analyzer at 77 K. Prior to each measurement, the samples were degassed at 150 °C for at least 10 h. The Brunauer–Emmett–Teller (BET) specific surface area was calculated using adsorption data at a relative pressure range of  $P/P_0 = 0.05–0.25$  (Figure S1, Supporting Information [SI]). Raman spectra were recorded on a HORIBA LabRAM with 514.3 nm Ar laser (Figure S2, SI).

**Electrochemical Characterization.** All electrochemical measurements were performed using the same mass of catalyst (~0.2 mg/cm<sup>2</sup>). Linear sweep voltammograms (LSV) were recorded using a glassy carbon rotating disk electrode (RDE, 0.196 cm<sup>2</sup>, Pine Research Instrumentation, U.S.A.) with a scan rate of 5 mV/s or a rotating ring-disk electrode (RRDE, 0.283 cm<sup>2</sup>, Pine Research Instrumentation, U.S.A.) with a scan rate of 2 mV/s. The data were recorded using a CHI 760 D potentiostat (CH Instruments, Inc., U.S.A.). The reference electrode was an Ag/AgCl in 4 M KCl solution (all potentials were referenced to NHE by adding a value of 0.205 V) and the counter electrode was platinum wire. Electrolyte was O<sub>2</sub>-saturated 0.1 M KOH solution (pH = 13).

**Kinetic Current.** The kinetic current for ORR occurring on the electrode can be calculated from the intercept of Koutecky–Levich plot using the following equation (Figures S3 and S4, SI):<sup>36</sup>

$$1/j_D = 1/j_K + 1/B\omega^{1/2} \quad (1)$$

where  $j_K$  is the kinetic current density at a constant potential,  $j_D$  is the measured current density on RDE,  $\omega$  is the electrode rotating speed in rpm, and  $B$ , the reciprocal of the slope, could be determined from the slope of Koutecky–Levich plot using the Levich equation:

$$B = 0.2nFA\nu^{-1/6}C_{O_2}D_{O_2}^{2/3} \quad (2)$$

where  $n$  is the number of electrons transferred per oxygen molecule,  $F$  is the Faraday constant,  $D_{O_2}$  is the diffusion coefficient of O<sub>2</sub> in 0.1 M KOH,  $\nu$  is the kinetic viscosity, and  $C_{O_2}$  is the bulk concentration of O<sub>2</sub>. The constant 0.2 is adopted when the rotating speed is expressed in rpm.

**Electron Transfer Numbers.** The overall electron transfer numbers per oxygen molecule involved in a typical ORR process were determined on the basis of RRDE voltammograms recorded by using a RRDE configuration with a 320  $\mu$ m gap Pt ring electrode. The disk electrode was scanned cathodically at a rate of 2 mV/s, and the ring potential was constant at +0.5 V for oxidizing any OOH<sup>-</sup> intermediate. The electron transfer number ( $n$ ) and OOH<sup>-</sup> intermediate production percentage (%OOH<sup>-</sup>, which serves as 2e<sup>-</sup> pathway selectivity) were determined as follows (Figure S5, SI):<sup>37</sup>

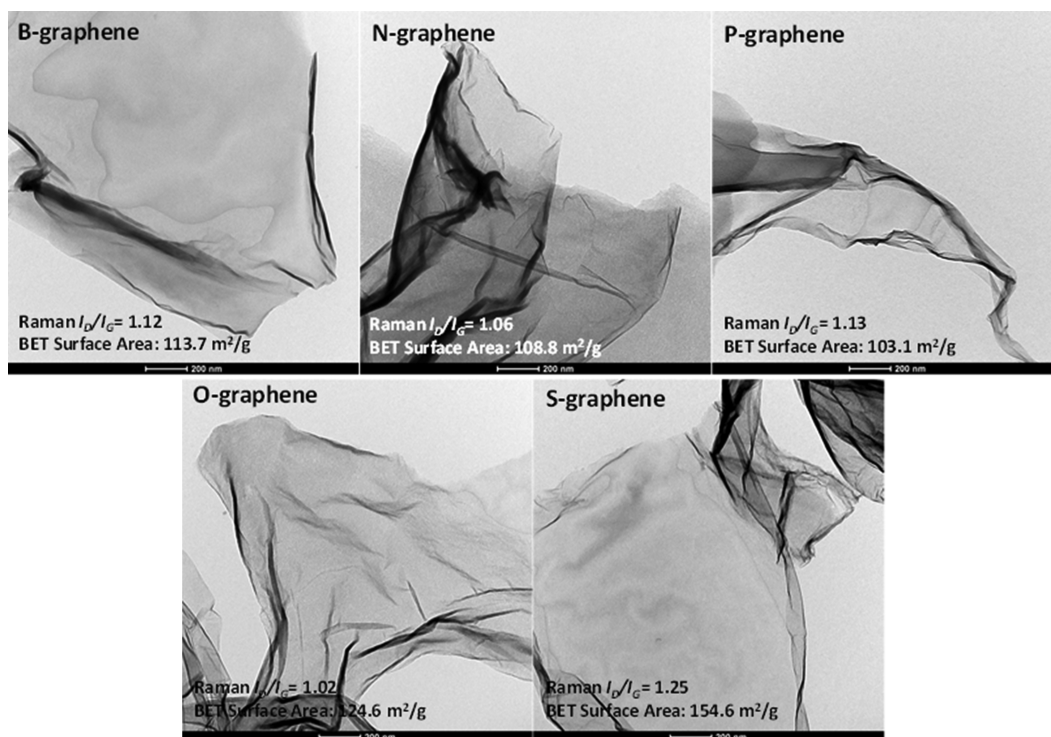
$$n = 4 \times \frac{I_d}{I_d + I_r/N} \quad (3)$$

$$\%OOH^- = 200 \times \frac{I_r/N}{I_d + I_r/N} \quad (4)$$

where  $I_d$  is the disk current,  $I_r$  is the ring current, and  $N$  is the current collection efficiency of the Pt ring, which was determined to be 0.37.

**Tafel Slope and Exchange Current Density.** The Tafel analysis of the ORR polarization was evaluated by using the relation between the kinetic current density ( $j_k$ ) and overpotential ( $\eta = U_{NHE} - 0.455$ ) as:

$$\eta = a + b \log j_k \quad (5)$$



**Figure 1.** TEM images of various single-doped graphene samples. The inset values represent the  $I_D/I_G$  ratios and the specific surface areas obtained from Raman spectra and nitrogen adsorption isotherms, respectively for each sample (see Figures S1 and S2, SI for details).

where  $a$  (V) is the Tafel constant related to the exchange current density ( $j_0$ ) and  $b$  (V/dec) is the Tafel slope. A more complete version of this equation can be derived by simplifying the Butler–Volmer equation as:

$$\eta = \frac{RT}{\alpha nF} \times \ln(j_0) + \frac{RT}{\alpha nF} \times \ln(j) \quad (6)$$

where  $R$  is the ideal gas constant,  $\alpha$  is the transfer coefficient,  $n$  is the number of electrons transferred, and  $j_0$  is the exchange current density. Combination of eq 6 with eq 5 gives the following expression for calculation of the experimental  $j_0$  (Table S1, SI):

$$\log(j_0) = -a \times \frac{2\alpha F}{2.31RT} \quad (7)$$

**DFT Calculations.** The electrocatalytic active sites and the pathways of ORR on the surface of various electrocatalysts were examined on the basis of hybrid DFT calculations performed by using Gaussian 09 program.<sup>38</sup> All the calculations were carried out using UB3LYP/6-31G(d,p) level of theory with all atoms fully relaxed. The solvent (water) effect was considered by the Polarizable Continuum Model (PCM).<sup>39</sup> Only intermediate states in the ORR process, as well as the reactant and product states, were proposed and evaluated; extra energy barriers might exist but were not considered due to the unbalanced electron numbers borne by different states.

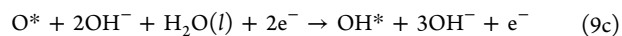
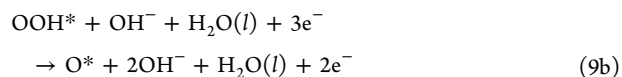
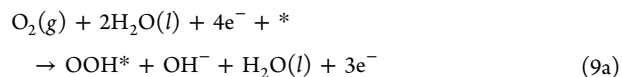
**Free Energy Calculations.** The calculation of the free energy diagrams was performed by setting up the reference level as that of the reaction product (Table S2, SI), and the reference electrode was set up to be the NHE; at pH = 0 and 0 V vs NHE, reaction ( $H^+ + e^- \leftrightarrow 1/2 H_2$ ) is at the equilibrium under standard conditions. The free energies of reactants and each intermediate state at an applied electrode potential  $U$  were calculated as follows:  $G(U) = G - neU$ , where  $n$  is the electron number of such state and  $G$  is the free energy obtained by frequency calculations at room temperature (298.15 K) after geometry optimization. Hence, the equilibrium potential  $U^0$  for ORR (eq 8) at pH = 13 was determined to be 0.455 V vs NHE where the reactant and product are at the same energy level. The free energy of  $H_2O(l)$  was derived as  $G_{H_2O(l)} = G_{H_2O(g)} + RT \times \ln(p/p_0)$  since only  $G_{H_2O(g)}$  can be directly obtained by DFT calculations, where  $R$  is the ideal gas

constant,  $T = 298.15K$ ,  $p = 0.035$  bar, and  $p_0 = 1$  bar. The free energy of  $O_2(g)$  was derived as  $G_{O_2(g)} = 2G_{H_2O(l)} - 2G_{H_2} - 4.92$  eV since the high-spin ground state of oxygen molecule is notoriously poorly described in DFT calculations.<sup>40</sup> The free energy of  $OH^-$  was derived as  $G_{OH^-} = G_{H_2O(l)} - G_{H^+}$ , where  $G_{H^+} = 1/2G_{H_2} - k_B T \ln 10 \times pH$  ( $k_B$  is Boltzmann's constant).

The overall reaction scheme of  $O_2$  reduction to  $OH^-$  in alkaline environment is:<sup>41,42</sup>



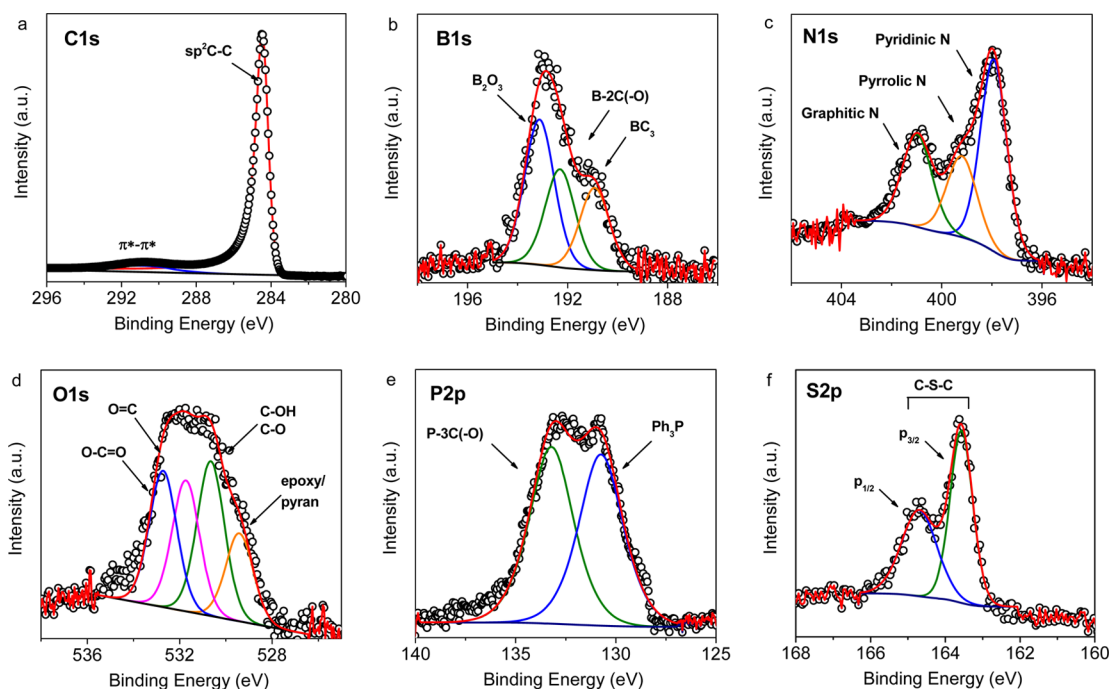
with three possible reaction pathways (one dissociative and two associative) as demonstrated in Scheme S1, SI. Specifically, since the surface of a doped graphene features the relatively high energy barrier (>1.2 eV) in the dissociative pathway (Figure S7, SI),<sup>43</sup> the following associative mechanism is dominant and considered in our calculations:



where \* refers to a given atom in the specific graphene model (i.e., possible active site).

**Exchange Current Density.** Calculation of the current density at low overpotentials includes the following assumptions: (1) the amount of active sites on different graphene surfaces is the same; (2) the rate constant represents the upper bound of the overall reaction rate; if there are additional barriers to  $OOH^*$  formation/ $OH^*$  desorption, the overall reaction rate should be lower.

According to reference 36, the exchange current density for a certain electrocatalytic process can be theoretically calculated as follows:



**Figure 2.** High-resolution XPS spectra of different heteroatoms in doped graphenes: (a) graphite; (b) B-graphene; (c) N-graphene; (d) O-graphene; (e) P-graphene; (f) S-graphene.

$$j_0 = nFk^0C_{\text{total}}[(1 - \theta)^{1-\alpha}\theta^\alpha] \quad (10)$$

where  $n$  is the electron transfer number,  $F$  is Faraday's constant,  $k^0$  is the standard rate constant,  $C_{\text{total}}$  is the total number of active sites,  $\alpha$  is the transfer coefficient (a measure of the symmetry of the potential energy surface, ranging from 0 to 1), and  $\theta$  is a quantity related to the highest free energy change of the whole reaction (see SI eqs S5–9, Figure S8 for a detailed derivation of this equation and parameter fitting).

## RESULTS AND DISCUSSION

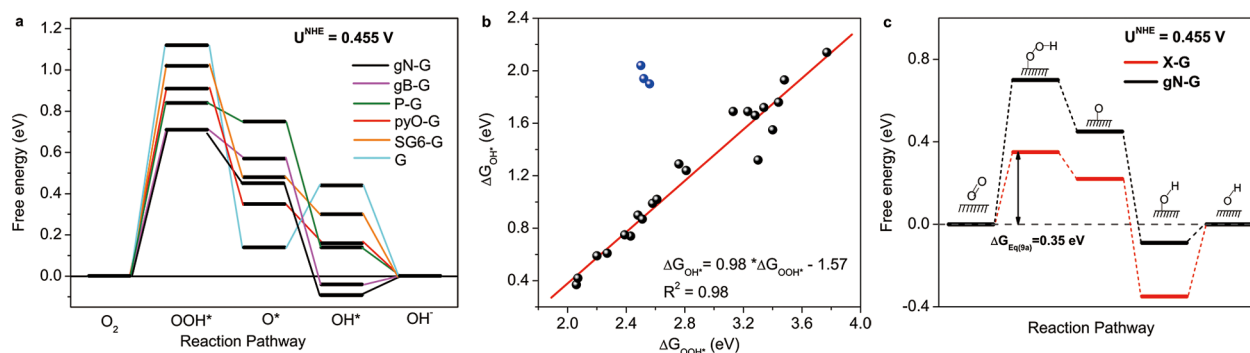
### Synthesis and Characterization of Electrocatalysts.

We selected five nonmetallic elements (B, N, P, O, S) with various electron negativities to dope graphenes to obtain single-doped graphene materials.<sup>44,45</sup> All the doped graphene electrocatalysts were chemically prepared from GO by using appropriate doping procedures (see the Methods section). In all five resultant samples (B-graphene, N-graphene, P-graphene, O-graphene, S-graphene) the nanosheet morphology of the pristine GO was well preserved without noticeable residues of the solid precursors, as shown in the transmission electron microscopy (TEM) images (Figure 1). Note that the incorporation of different heteroatoms could not change the physicochemical properties of doped graphene samples such as morphology, surface area, and defects. Nitrogen-adsorption studies indicate that all samples show similar surface areas in a range between 100 and 150 m<sup>2</sup>/g, which also assures similar concentrations of the ORR active sites present on the samples studied (considering that the concentrations of all doped heteroatoms are also similar, between 3 to 5 atomic % based on the XPS survey results; not shown here). The Raman results indicate that all samples have similar concentrations of defects with the  $I_D/I_G$  values in a range of 1.0–1.2, which are closely related to the electrical conductivity of these samples. Therefore, it is presumed that the differences in the electrocatalytic ORR activity of various doped graphene samples do not originate from their physicochemical properties

but only from the nature of the dopant affecting their ORR activities.

The nature of doping was investigated by analyzing high-resolution XPS spectra shown in Figure 2. Peak deconvolutions were conducted as in the case of the reported respective single-doped graphenes.<sup>46–50</sup> The five heteroatoms chemically substituted edge or central carbon atoms in the graphene matrix, yielding 13 different species in- or out-of the graphene basal plane. Specifically, natural graphite was considered as a defect-free (nondoped) graphene with an intensive typical sp<sup>2</sup>-hybridized carbon (Figure 2a). B-graphene has two boron containing species as central B-3C and edge B-2C–O species (excluding B<sub>2</sub>O<sub>3</sub> precursor residue) (Figure 2b). N-graphene has three nitrogen species as central graphitic nitrogen and edge pyridinic and pyrrolic N in the graphene plane (Figure 2c). O-graphene has two kinds of oxygen species as in-plane central pyran-type oxygen, edge carbonyl and hydroxyl oxygens, and out-of-plane epoxy oxygen (Figure 2d). P-graphene and S-graphene both have one heteroatom doping configuration as P–3C(–O)-type phosphorus (excluding Ph<sub>3</sub>P precursor residue) (Figure 2e) and edge C–S–C sulfur (Figure 2f), respectively.

**Model Construction.** We constructed the cluster models (Figure S6, SI) for the aforementioned doped graphenes according to each heteroatom's chemical environments obtained from the XPS spectra discussed above. The explored models contain 14 hexagonal rings terminated with C–H bonds, which have been previously adopted for investigation of ORR on graphene doped with nitrogen or boron.<sup>20,51</sup> Five heteroatoms could induce 13 different doping configurations in graphene clusters with very different electronic properties; concomitantly, 32 possible ORR active sites, either heteroatoms themselves or adjacent carbon atoms, were theoretically studied to build the ORR free energy diagram for each catalyst by obtaining the free energy for each reaction step.



**Figure 3.** (a) Free energy diagram of different heteroatom-doped graphenes at the equilibrium potential  $U^0$ . (b) The adsorption free energies of intermediates  $\text{OOH}^*$  ( $\Delta G_{\text{OOH}^*}$ ) and  $\text{OH}^*$  ( $\Delta G_{\text{OH}^*}$ ) on the investigated sites of different doped graphene models. Blue points were not considered in the linear fitting because normal  $\text{OOH}^*$  chemisorption did not occur on the corresponding graphene clusters. The specific values of  $\Delta G_{\text{OOH}^*}$  and  $\Delta G_{\text{OH}^*}$  for different models are provided in Table S3, SI. (c) Calculated free energy diagram of the predicted X-graphene at the equilibrium potential; data for gN-G model are also included for the purpose of comparison. Reaction intermediates for each step are shown as inset animation.

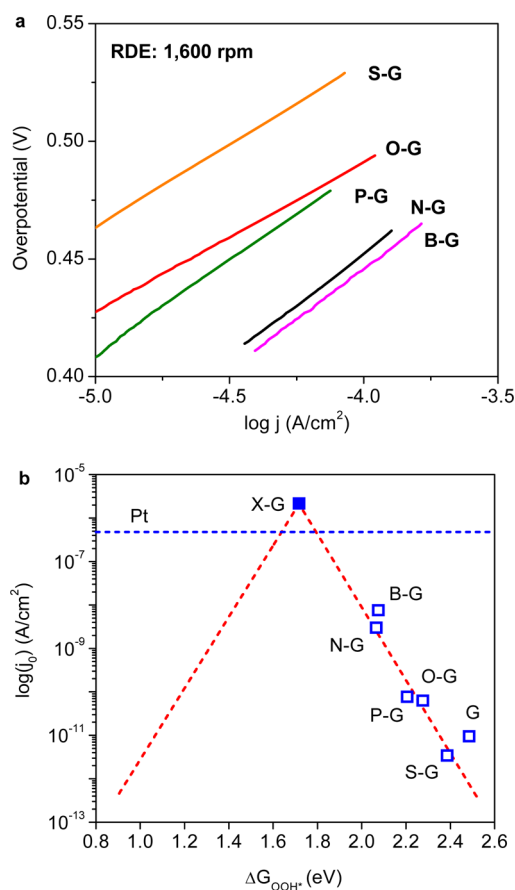
**Free Energy Diagram.** According to eq 9, the associative  $4e^-$  reaction pathways for each doped graphene at the equilibrium potential  $U^0 = 0.455$  V vs NHE can be illustrated on a free energy diagram as presented in Figure 3a. From such diagrams, nitrogen- and boron-doped graphene models (gN-G and gB-G) exhibit the lowest overall reaction free energy change at  $U^0$ , suggesting their ORR performance is the best from the theoretical viewpoint, which has been confirmed by previous reports<sup>15,16</sup> and the experiments reported in this work (Figure S3, SI). Taking the gN-G cluster model as an example (Figure S3, SI), the diagram indicates that the first electron transfer step to form  $\text{OOH}^*$  (eq 9a) is an endothermic reaction with a free energy change  $\Delta G_{\text{eq } 9a}(U^0) = 0.70$  eV, while the second electron transfer step (eq 9b) to form chemisorbed  $\text{O}^*$  and the third electron transfer step (eq 9c) to form  $\text{OH}^*$  are all exothermic with  $\Delta G_{\text{eq } 9b}(U^0) = -0.25$  eV and  $\Delta G_{\text{eq } 9c}(U^0) = -0.54$  eV, respectively. The last electron transfer step reflecting  $\text{OH}^*$  desorption (eq 9d) possesses an easily surmountable free energy difference of  $\Delta G_{\text{eq } 9d}(U^0) = 0.09$  eV. Therefore,  $\Delta G_{\text{eq } 9a}(U^0)$  is the largest one among the free energy changes of all four reaction steps, which indicates that this step is the most sluggish one and represents the highest resistance for the whole ORR. Such trend is true for all other heteroatom-doped graphene models, indicating that the ORR rate-determining step for these catalysts is the same. Note that each graphene doped by one heteroatom can result in several different cluster configurations, which possess their own reaction pathways. The lines in Figure 3a only represent the model with best performance (i.e., the lowest overall reaction free energy change) among all the investigated cluster models for each dopant. The free energy diagrams for ORR on all possible active sites of each model are presented in Figures S9–S14, SI.

According to the developed theories for metal surfaces,<sup>26,52</sup> the ORR electrocatalytic activity descriptors (specifically, the exchange current density, on-set potential,  $4e^-$  pathway selectivity, and kinetic current density) of a given catalyst are governed by the adsorption free energies of ORR intermediates including  $\text{OOH}^*$ ,  $\text{O}^*$ , and  $\text{OH}^*$ , which are represented by  $\Delta G_{\text{OOH}^*}$ ,  $\Delta G_{\text{O}^*}$ , and  $\Delta G_{\text{OH}^*}$ , respectively (equation S1, SI). As shown in Figure 3b,  $\Delta G_{\text{OOH}^*}$  for a wide variety of the doped graphene surfaces studied scales roughly with  $\Delta G_{\text{OH}^*}$ , similarly as in the case of metal surfaces.<sup>53,54</sup> Additionally, the  $\text{O}^*$  chemisorption is more complicated than that of  $\text{OH}^*$  and  $\text{OOH}^*$ , since it could either form single bonding with the adsorption center on graphene or form epoxy-type bonding;

within each bonding type, a linear relationship is also observed (Figure S15, SI). On the basis of these linear relationships ( $\Delta G_{\text{OOH}^*}$  vs  $\Delta G_{\text{OH}^*}$  or  $\Delta G_{\text{O}^*}$ ), we can predict the ORR free energy diagram of an optimal X-graphene, which is the basis to obtain its corresponding electrocatalytic properties at the macroscopic level. The free energy diagram of X-graphene can be obtained on the basis of the Sabatier principle that an ideal catalyst should bind the reaction intermediates not too strongly nor too weakly;<sup>55</sup> therefore, at equilibrium potential  $U^0$ , the optimal overall reaction pathway on an ideal X-graphene should follow the relationship of  $\Delta G_{\text{eq } 9a}(U^0) = \Delta G_{\text{eq } 9d}(U^0)$ . At the same time,  $\Delta G_{\text{eq } 9a}(U^0)$  and  $\Delta G_{\text{eq } 9d}(U^0)$  are associated to each other *via* the linear relationship of  $\Delta G_{\text{OOH}^*}$  and  $\Delta G_{\text{OH}^*}$  as shown in Figure 3b; therefore by obeying these requirements,  $\Delta G_{\text{eq } 9a}(U^0)$  for X-graphene is determined to be 0.35 eV, representing the largest free energy change on the overall pathway as shown in Figure 3c (red line, see eq S4, SI for free energy changes of other steps). This predicted free energy difference is lower than those for all other investigated doped graphene models (for example, gN-G denoted by black line) and is close to that calculated for Pt by DFT.<sup>26</sup>

**Exchange Current Density ( $j_0$ ).** For a given catalyst  $j_0$  is defined as the current density at the equilibrium potential in one direction for a given reaction,<sup>36</sup> which reflects the intrinsic catalytic activity of the catalyst. The measured exchange current densities,  $j_0^{\text{expt}}$ , for each synthesized graphene surface can be obtained from the respective Tafel plot as shown in Figure 4a (specific values could be found in Table S1, SI). Simultaneously, knowing the free energy diagram for each graphene model, the theoretical exchange current density,  $j_0^{\text{theory}}$ , can be calculated by using a microkinetic model with one prefactor fitted from  $j_0^{\text{expt}}$  by eq 10.

The predicted  $j_0^{\text{theory}}$  values for various graphene models form a volcano-shaped plot versus  $\Delta G_{\text{OOH}^*}$  (Figure 4b red line), while  $j_0^{\text{expt}}$  for each synthesized sample perfectly follows the trend of this plot (blue squares), similarly as in the case of metal surfaces.<sup>26</sup> Additionally, due to the weak binding of  $\text{OOH}^*$  on graphene-based surfaces, the calculated points are all on the right branch of the volcano plot, while an optimal catalyst should possess a higher  $j_0$  induced by a  $\Delta G_{\text{OOH}^*}$  closer to the volcano center.<sup>56</sup> Following such trends, the  $j_0^{\text{theory}}$  value for an ideal X-graphene should be located at the summit of the volcano, with a calculated value of  $2.12 \times 10^{-6}$  A/cm<sup>2</sup>, which is even  $\sim 5$  times higher than that of Pt/C catalyst at same testing conditions (Figure S4c, SI).



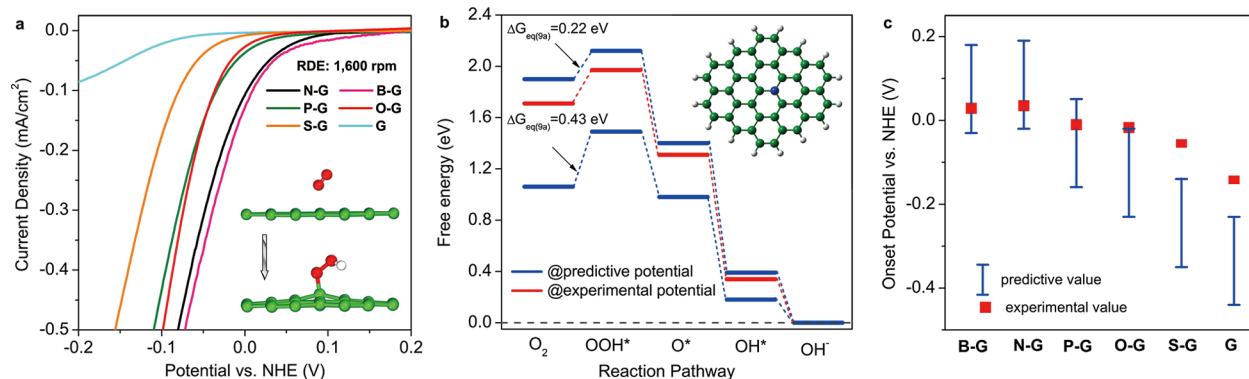
**Figure 4.** (a) Experimentally determined Tafel plots for different catalysts from ORR polarization curves shown in Figure S3, SI, data were collected at RDE = 1600 rpm. (b) Volcano plot between  $j_0^{\text{theory}}$  and  $\Delta G_{\text{OOH}^*}$  with charge-transfer coefficient  $\alpha = 0.5$  (red dashed line). Blue hollow squares are  $j_0^{\text{expt}}$  obtained from Tafel plots and DFT-derived  $\Delta G_{\text{OOH}^*}$  for each doped graphene catalyst.  $\Delta G_{\text{OOH}^*}$  for X-graphene (blue solid square) was obtained from eq S4e, SI and its  $j_0^{\text{theory}}$  was obtained from eq 10. The  $j_0^{\text{expt}}$  value for Pt was also shown by the blue dashed line as a reference.

**On-set Potentials ( $U^{\text{on-set}}$ ).** Due to the existence of a high free energy difference for the first electron transfer step  $\Delta G_{\text{eq}9a}(U^0)$  as shown in Figure 3a, the initialization of oxygen

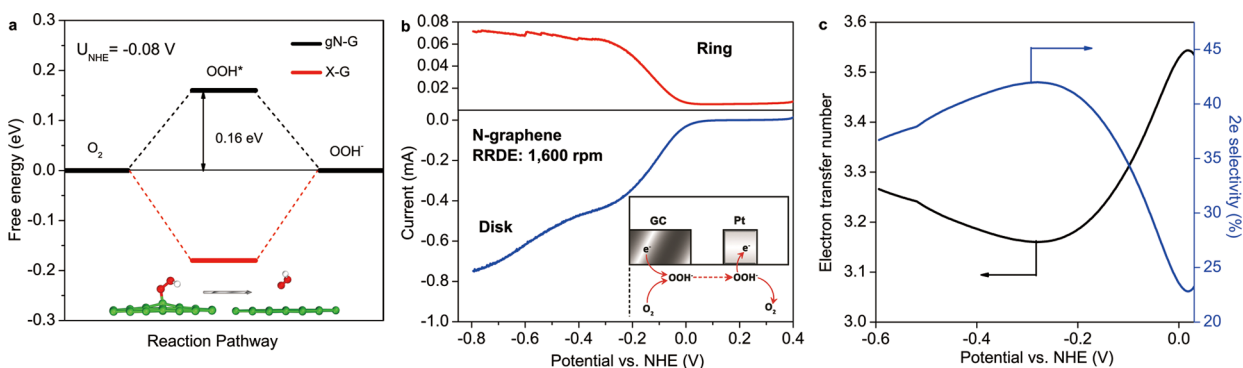
reduction requires a potential bias  $\eta = U^{\text{on-set}} - U^0$  to reduce the free energy difference to  $\Delta G_{\text{eq}9a}(U^{\text{on-set}})$  that could be overcome at room temperature. Taking chemically synthesized N-graphene as an example, the measured on-set potential  $U_{\text{N}}^{\text{on-set}} = 0.029$  V vs NHE (from the polarization curve shown in Figure 5a). From the theoretical viewpoint (gN-G model), under this potential  $U_{\text{N}}^{\text{on-set}}$ , the free energies of the reactant and intermediates states (Figure 3c black line) shift upward as compared to those under the equilibrium potential (Figure 5b red line); as a result,  $\Delta G_{\text{eq}9a}(U_{\text{N}}^{\text{on-set}})$  reduces to an easily surmountable value of 0.26 eV. In the zone of  $U > U_{\text{N}}^{\text{on-set}}$ ,  $\Delta G_{\text{eq}9a}(U)$  keeps decreasing with increasing  $U$ , which indicates the first electron transfer step is no longer the rate-limiting step for the overall reaction, i.e. the whole ORR process is 'activated'. A similar trend was also observed for other graphene models as demonstrated in Figures S9–S14, SI.

Theoretically, the on-set potential for a given graphene model can be thermodynamically predicted from its free energy diagram at equilibrium potential by eqs S2–3, SI. First, a range for  $\Delta G_{\text{eq}9a}$  is defined as [0.22 and 0.43] eV on the basis of classical reaction thermodynamics (Table S4, SI).<sup>57</sup> It is assumed that, if  $\Delta G_{\text{eq}9a}$  at a given electrode potential possesses a value within this range, the free energy difference can be overcome. The obtained theoretical on-set potentials that satisfy  $0.22 \text{ eV} \leq \Delta G_{\text{eq}9a} \leq 0.43 \text{ eV}$  as well as the experimentally determined ones for all chemically synthesized graphenes are shown in Figure 5c. Most of the experimentally obtained values (red squares) are in the theoretically predicted range (blue bars), except for S-graphene and pure graphene samples (slightly above the theoretical range), which could be attributed to the influence of Nafion and glassy carbon working electrodes on the overall current density. Furthermore, based on the same criterion, the predicted on-set potential for X-graphene that corresponds to  $\Delta G_{\text{eq}9a} = 0.43$  eV was 0.33 V, which is closer to the ORR equilibrium potential than the experimental value obtained for Pt catalyst.<sup>58</sup>

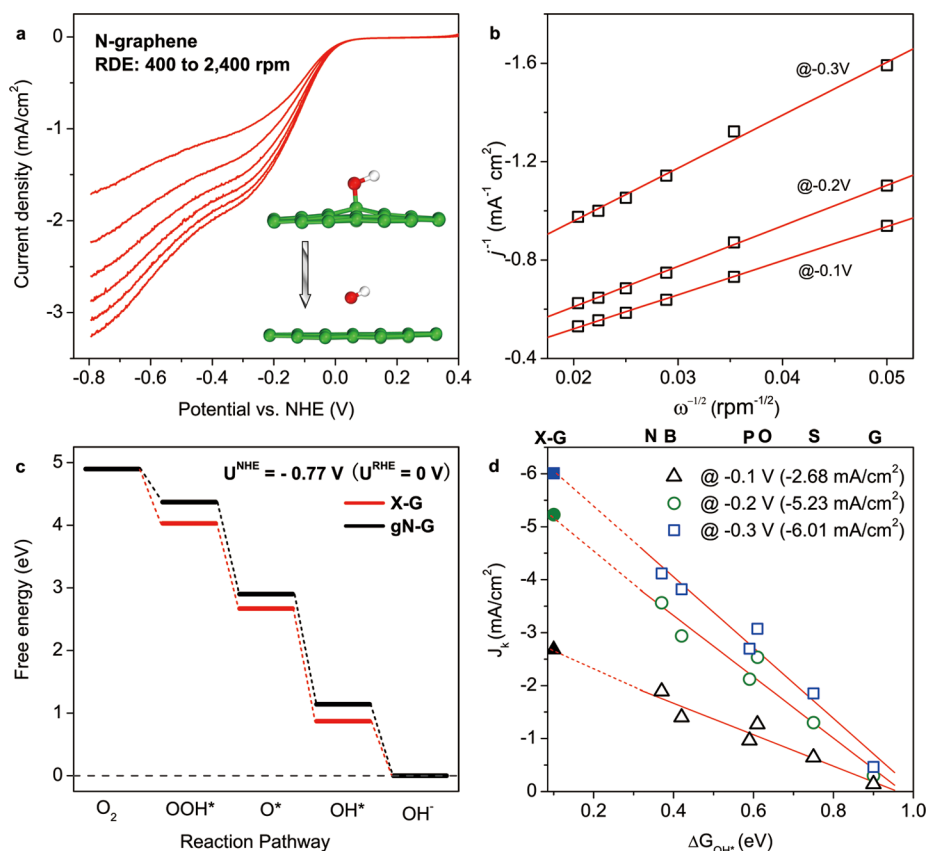
**$4e^-$  Pathway Selectivity.** Theoretically, as demonstrated in Scheme 1 in SI, ORR can proceed either by two sequential two-electron reactions ( $2e^-$ ) with formation of  $\text{OOH}^-$  intermediate or a more efficient direct four-electron reaction ( $4e^-$ ). Therefore understanding the nature of the  $2e^-$  pathway is essential to design more appropriate catalysts for ORR that possesses high  $4e^-$  pathway selectivity to enhance the



**Figure 5.** (a) Enlarged LSVs plots at the ORR initial region for different catalysts on RDE at 1600 rpm in an  $\text{O}_2$ -saturated 0.1 M solution of KOH. Inset illustrates the first electron transfer step that is  $\text{O}_2$  to adsorbed  $\text{OOH}^*$ . (b) Potential corrected free energy diagram for gN-G at experimentally observed on-set potential  $U_{\text{N}}^{\text{on-set}}$  (red) and theoretically predicted  $U_{\text{N}}^1$  and  $U_{\text{N}}^2$  which meet  $\Delta G_{\text{eq}9a}(U_{\text{N}}^1) = 0.43$  eV and  $\Delta G_{\text{eq}9a}(U_{\text{N}}^2) = 0.22$  eV, respectively (blue). Inset shows the atomic configuration of gN-G cluster. (c) Experimentally derived on-set potentials of doped graphenes (red squares), and the predicted values (blue bars).

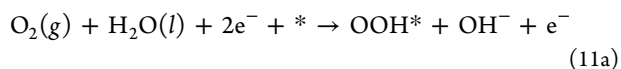


**Figure 6.** (a) Free energy diagrams of 2e<sup>-</sup> ORR pathway for gN-G model (black) and X-graphene (red) at equilibrium electrode potential for 2e<sup>-</sup> pathway  $U_{2e^-}^0 = -0.08$  V vs NHE. Under this potential, the rate-limiting step of ORR on gN-G is the activation of O<sub>2</sub> to OOH\*, the atomic configuration of which is shown in Figure 5a inset, whereas that for X-graphene is the reduction of OOH\* to OOH<sup>-</sup>, which atomic configuration is shown in the inset of this figure. (b) Experimental ring and disk currents for the synthesized N-graphene catalyst on RRDE at 1600 rpm in an O<sub>2</sub>-saturated 0.1 M solution of KOH. Inset is the scheme of measuring OOH<sup>-</sup> production on the Pt ring. (c) RRDE measured electron transfer numbers (black) and corresponding 2e<sup>-</sup> pathway selectivity (blue) for N-graphene catalyst according to eqs 3 and 4



**Figure 7.** (a) Electrochemically measured LSV of N-graphene catalyst at different rotating speeds in an O<sub>2</sub>-saturated 0.1 M solution of KOH. Inset illustrates the last electron transfer step: OH\* desorption to generate OH<sup>-</sup>. (b) Koutecky–Levich plots for N-graphene at -0.3 V, -0.2 V, and -0.1 V vs NHE, data were collected from panel a. (c) Potential corrected free energy diagram for gN-G and X-graphene models at  $U^{\text{RHE}} = 0$  V ( $U^{\text{NHE}} = -0.77$  V). (d) The relationship between  $\Delta G_{\text{OH}^*}$  and  $j_k$  for various synthesized graphene catalysts under different potentials (open symbols), data were collected from Figure S3, SI. The values in parentheses of the legend are  $j_k$  values for X-graphene, which are predicted by extending the fitted lines to  $\Delta G_{\text{OH}^*} = 0.10$  eV, shown as closed symbols.

electrocatalytic efficiency. In alkaline solution, the mechanism of 2e<sup>-</sup> pathway is:



According to previous studies, 2e<sup>-</sup> and 4e<sup>-</sup> pathway selectivity is associated with the desorption of OOH\* and OH\* on a metal surface, respectively;<sup>52</sup> therefore, at a given potential  $U$ , the probability of 2e<sup>-</sup> reaction pathway depends on the value of  $\Delta G_{\text{eq } 11\text{b}}(U)$  in comparison to  $\Delta G_{\text{eq } 9\text{d}}(U)$ . Taking gN-G model as an example (Figure 6a), at equilibrium electrode potential for 2e<sup>-</sup> pathway  $U_{2e^-}^0$  (-0.08 V vs NHE

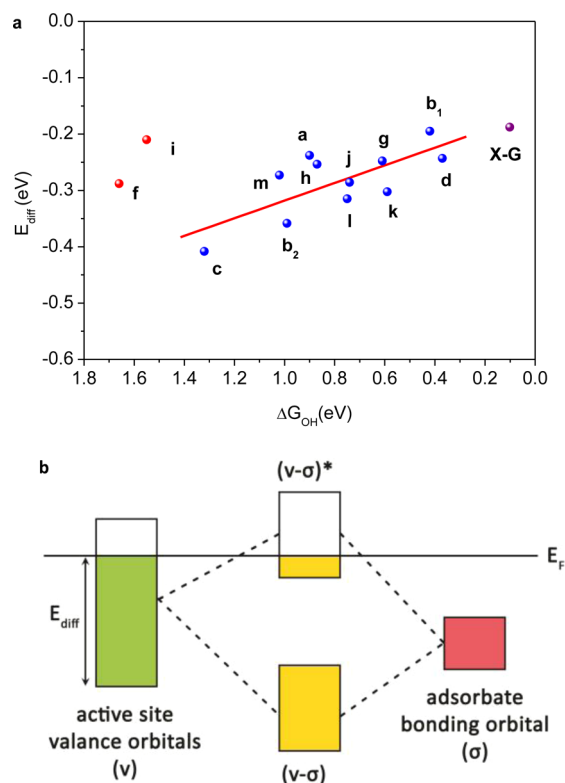
at pH = 13<sup>42</sup>), the desorption of OOH\* (eq 11b) is exothermic with an energy difference of  $\Delta G_{\text{eq } 11\text{b}}(U_{2e^-}^0) = -0.16$  eV, which means  $2e^-$  pathway is unavoidable to compensate the  $4e^-$  pathway on gN-G model. Experimentally, we used the rotating ring-disk electrode (RRDE) technique to verify this theoretically derived pathway selectivity prediction by monitoring the formation of intermediate peroxide species (e.g., OOH<sup>-</sup> in the alkaline solution) under different electrode potential as shown in Figure 6b. The measured electron-transfer number at  $U_{2e^-}^0$  was 3.35 for chemically synthesized N-graphene; it corresponds to a mixed 33%  $2e^-$  pathway selectivity and 67%  $4e^-$  pathway selectivity as shown in Figure 6c. Also note that at more negative electrode potentials,  $2e^-$  pathway is always unavoidable due to the negative  $\Delta G_{\text{eq } 11\text{b}}$ , which is consistent with the RRDE observation (Figure 6c). Additionally, the same property (mixed  $2e^-$  and  $4e^-$  pathways for ORR) has been observed for all other chemically synthesized graphene catalysts. To fundamentally eliminate the  $2e^-$  pathway, a catalyst surface that binds OOH\* strongly enough to induce an endothermic OOH\* desorption process is required. This criterion is met by the ideal X-graphene model, as shown by its free energy diagram at  $U_{2e^-}^0$  in Figure 6a (red line): at the equilibrium electrode potential for  $2e^-$  pathway  $U_{2e^-}^0$ , OOH\* desorption on X-graphene is endothermic while OH\* desorption is exothermic, which therefore avoids the  $2e^-$  reduction pathway to present a nearly 100%  $4e^-$  pathway selectivity, similar as in the case of Pt catalyst.

**Kinetic Current Density ( $j_K$ ).**  $j_K$  is the cathodic oxygen reduction current under the kinetic limitation zone when the reactant mass transfer is efficient enough to keep the concentration of O<sub>2</sub> at the electrode surface equal to the bulk value,<sup>36</sup> which represents the ORR kinetic electrochemical property at a given electrode potential (always more negative than ORR on-set potential). Experimentally, for N-graphene (Figures 7a,b) and other chemically synthesized graphenes (Figure S3, SI),  $j_K$  was measured by rotating disk electrode (RDE) voltammogram with different rotating speeds followed by performing Koutecky–Levich plot as presented in eqs 1 and 2 (see the Methods section).

From the theoretical perspective, the above electrochemical measured  $j_K$  values can be related to the free energy change of the last electron transfer step ( $\Delta G_{\text{OH}^*}$ ) by a linear relationship shown in Figure 7d. The microkinetic scenario of this relationship might be due to the fact that the last step in the reaction pathway, OH\* desorption as shown in the inset of Figure 7a, now becomes the rate-determining step of the whole ORR as shown in Figure 7c.<sup>52</sup> On the basis of this trend, the predicted  $j_K$  for X-graphene can be obtained from the value of the extended fitted lines at  $\Delta G_{\text{OH}^*} = 0.10$  eV (obtained by eq S4, SI), as shown in Figure 7d closed symbols, which is 6.01 mA/cm<sup>2</sup> at -0.3 V, comparable to Pt catalyst's value (7.35 mA/cm<sup>2</sup> at -0.3 V, calculated from Pt's LSV plots in Figure S4c, SI). It should be noted that these predicted  $j_K$  values for X-graphene were obtained on the basis of a mixture of  $2e^-$  and  $4e^-$  ORR pathways (since the experimentally observed  $j_K$  for line fitting all contain  $2e^-$  pathway as shown in Figure 6c and Figure S5, SI), which could be further enhanced if only  $4e^-$  pathway exists like in the case of Pt catalyst.<sup>59</sup>

**Molecular Orbital Origin.** On the basis of the former theoretical and experimental observations of  $j_0$ ,  $U^{\text{on-set}}$ ,  $4e^-$  pathway selectivity, and  $j_K$  for various graphene-based catalysts, we found that all these electrochemical quantities relate well to the binding strength of intrinsic oxygen-containing intermedi-

ates (adsorbed species) on the catalyst surface. Inspired by the success of the d-band center theory that the energy level of a metal atom's d-band center serves as the activity descriptor for metal surfaces,<sup>60</sup> we searched for a simple activity descriptor suitable for metal-free catalysts that could accomplish a similar correlation between the binding strength and each ORR active atom's molecular valence orbital levels. We first investigated the origin of the binding strength for different graphene cluster models *via* natural bond order (NBO)<sup>61</sup> analysis to explore the orbital information of each active site. Since the valence orbital of each active center participates in the bond formation with an oxygen-containing intermediate on the graphene surface (e.g., OH\*), the valence orbital level should greatly influence its adsorption energy  $\Delta G_{\text{OH}^*}$ . Therefore, we introduced a descriptor  $E_{\text{diff}}$  which is defined as the difference between lowest valence orbital energy of the active center and the highest valence orbital energy of the entire graphene cluster (Fermi energy level in the form of natural atomic orbitals) to quantitatively represent the valence orbital level. As shown in Figure 8a,  $\Delta G_{\text{OH}^*}$  data plotted against  $E_{\text{diff}}$  formed a linear



**Figure 8.** (a) The relationship between  $\Delta G_{\text{OH}^*}$  and  $E_{\text{diff}}$  data were collected for the most active site of various doped graphene models and labeled according to the corresponding molecular configurations shown in Figure S6, SI. Red points were not considered in the line fitting. The prediction of X-graphene is shown as pink point. (b) Scheme of orbital hybridization of valence band from active sites and adsorbates bonding orbital.  $E_F$  refers to highest valence orbital energy of the entire graphene cluster.

relationship for a wide variety of graphene active sites. The principle that underlies this linear relationship is that the valence band ( $v$ ) of the active sites hybridizes with the bonding ( $\sigma$ ) orbital of the adsorbed species to form bonding ( $v-\sigma$ ) and antibonding ( $v-\sigma^*$ ) states, as illustrated in Figure 8b. For the investigated graphene models, the ( $v-\sigma$ ) state is full, while the



filling of  $(v-\sigma)^*$  state depends on the valence orbital levels of the active atom on the graphene surface. An increased filling of the antibonding  $(v-\sigma)^*$  state, induced by a lower valence band, could lead to destabilization of the graphene–adsorbate interaction and hence diminish the binding between them; on the other hand, a decreased filling of  $(v-\sigma)^*$  state corresponds to an enhanced binding between ORR intermediates and the graphene surface. As a result, a better graphene-based ORR catalyst such as X-graphene should possess higher valence orbital energies of the ORR active atom to induce a smaller  $E_{\text{diff}}$  and lead to stronger adsorption of  $\text{OOH}^*$  and  $\text{OH}^*$  intermediates, as marked in Figure 8a, resulting in better ORR activity. Such an X-graphene could in principle be realized by doping with multiple elements,<sup>20</sup> introducing structural defects,<sup>8</sup> or any possible combination.

## CONCLUSIONS

In summary, by combining experimental data and DFT calculations, we systematically investigated the nature and origin of ORR activity of a series of heteroatom-doped graphene catalysts. Although the stability of each model, the electric double layer effect, and hydrogen bonding were not considered in the quantum chemistry study, our models are in good accordance with the experimental observations, from the viewpoint of the ORR exchange current density, on-set potential, pathway selectivity, and the kinetic current density. This agreement also validates the predictive capability of the powerful DFT model employed beyond traditional metallic catalysts. Our study shows further that graphene-based metal-free catalysts possess the potential to surpass the ORR performance of the state-of-the-art Pt catalyst. Using ORR as a probe reaction, the explored methodology should be applicable to other energy-related electrocatalysis processes such as oxygen evolution and hydrogen evolution reactions.

## ASSOCIATED CONTENT

### Supporting Information

Experimental measurements of electron transfer, Tafel slope, and exchange current densities; graphene cluster models, overall reaction scheme and free energy calculations; adsorption of intermediates on each graphene surface, definition of activation energies, computational derivation of exchange current density. This material is available free of charge via the Internet at <http://pubs.acs.org>.

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### Notes

The authors declare no competing financial interest.

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