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# Atomically dispersed Cu and Fe on N-doped carbon materials for CO<sub>2</sub> electroreduction: insight into the curvature effect on activity and selectivity†

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CO<sub>2</sub> electroreduction reaction (CO<sub>2</sub>ER) by single metal sites embedded in N-doped graphene (M@N-Gr, M = Cu and Fe) and carbon nanotubes (M@N-CNT, M = Cu and Fe) has been explored by extensive first-principles calculations in combination with the computational hydrogen electrode model. Both atomically dispersed Cu and Fe nanostructures, as the single atom catalysts (SACs), have higher selectivity towards CO<sub>2</sub>ER, compared to hydrogen evolution reduction (HER), and they can catalyze CO<sub>2</sub>ER to CO, HCOOH, and CH<sub>3</sub>OH. In comparison with Cu@N-Gr, the limiting potentials for generating CO, HCOOH, and CH<sub>3</sub>OH are reduced obviously on the high-curvature Cu@N-CNT. However, the curvature effect is less notable for the single-Fe-atom catalysts. Such discrepancies can be attributed to the d-band center changes of the single Cu and Fe sites and their different dependences on the curvature of carbon-based support materials.

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## 1 Introduction

In recent decades, the optimal utilization of CO<sub>2</sub> has been drawing continual attention from both industrial and academic communities, because it is not only mainly responsible for handling the greenhouse effect,<sup>1</sup> but also an abundant, non-toxic and recyclable C1 resource. Therefore, an enormous amount of effort has been devoted to the catalytic conversion of CO<sub>2</sub> into high value-added chemicals and reduction of greenhouse-gas emissions.<sup>2–8</sup> The electrochemical reduction reaction of CO<sub>2</sub> (CO<sub>2</sub>ER) can produce a variety of platform chemicals and liquid fuels through renewable electricity, such as formic acid (HCOOH), carbon monoxide (CO) and methanol (CH<sub>3</sub>OH). However, there are still many challenges for the large-scale application of CO<sub>2</sub>ER, including slow kinetics, low product selectivity, low Faraday efficiency and high overpotentials,<sup>6,9,10</sup> and it is thus highly required to find suitable electrocatalysts to improve selectivity and efficiency of CO<sub>2</sub>ER.

In the catalytic conversion of CO<sub>2</sub>, the heterogeneous catalysis stands out due to the better durability of catalyst used and reaction conditions,<sup>6,10,11</sup> in which the conventional catalysts mainly include metals,<sup>12–14</sup> alloys,<sup>15–17</sup> single-atom catalysts (SACs),<sup>18–20</sup> *etc.* Since the pioneering work on the SAC by Zhang and coworkers,<sup>21,22</sup> the heterogeneous catalysis with the SACs

has received great interest owing to its prominent electrocatalytic performance (*e.g.*, high catalytic activity, stability, and selectivity) and the maximal utilization of metal atoms. Hence, SACs has been considered to be a promising alternative in various electrocatalytic reactions (*e.g.*, CO<sub>2</sub>ER, NRR, HER, *etc.*).<sup>23–27</sup> As important components of the SAC system, the single atom as the active site and its supported substrate are the key factors to influence the catalytic efficiency of CO<sub>2</sub>ER.

Recently, one of the most representative SAC substrates is the carbon-based two-dimensional (2D) material.<sup>28–32</sup> For example, the N-doped graphene monolayer with a large specific surface area and a conjugated structure has been widely used as a substrate for SACs.<sup>29,31,33–35</sup> Last year, Zhang *et al.* reported experimentally the catalytic activity of Fe-embedded N-doped graphene for CO<sub>2</sub>-to-CO reduction and the plausible reaction pathway, in combination with theoretical calculations.<sup>19</sup> Zhou *et al.* theoretically studied the catalytic activity of Co-embedded N-doped graphene towards CO<sub>2</sub>ER, based on the predicted free-energy profile,<sup>36</sup> and their results demonstrate that different Co-centered nanostructures can catalyze the electrochemical reduction of CO<sub>2</sub> to CO. Besides, the N-doped graphene and N-doped nanotubes (CNT) have also been confirmed to possess good catalytic properties for CO<sub>2</sub>ER.<sup>37–39</sup> On the other hand, the most common atomically dispersed active sites in SACs are transition-metal atoms, such as Fe, Co, Ni and Cu,<sup>20</sup> and the corresponding products and catalytic efficiencies are usually metal dependent. Previous reports have revealed that Cu is a rather unique metal that produces CO as well as various hydrocarbons (such as alcohols), which has been widely applied in several types of catalysts.<sup>40–42</sup>

Very recently, Yang *et al.* have synthesized a highly stable CO<sub>2</sub>ER electrocatalyst, CuSAs/TCNFs with the single-atom-Cu

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active site, which can catalyze conversion of CO<sub>2</sub> into CH<sub>3</sub>OH with a high Faraday efficiency of 44%.<sup>43</sup> According to the results of Extended X-ray Absorption Fine Structure (EXAFS), the copper-centered Cu–N<sub>4</sub> unit was proposed as the catalytic active site. Generally, the surface curvature of catalysts has a great effect on the selectivity of the product and the reaction paths, as shown in previous studies,<sup>30,44,45</sup> For example, Chai *et al.*<sup>30</sup> investigated the CO<sub>2</sub>ER catalyzed by the N-doped graphene/CNT by the first-principles calculations, and their results indicate that the surface curvature can effectively tune the CO<sub>2</sub>ER selectivity and the limiting potentials of specific products. Fan *et al.*<sup>45</sup> explored the catalytic performance of Bi nanosheets and nanotubes in electrochemical reduction of CO<sub>2</sub>, and they found that the increase of curvature may enhance the activity of Bi catalyst towards the CO<sub>2</sub> reduction to HCOOH over a wide potential range. On the contrary, the energy barrier for the CO product increases with the curvature.

Inspired by these important contributions, herein, we constructed the Cu- and Fe-embedded N-doped nanotube (Cu@N-CNT & Fe@N-CNT) and N-doped graphene (Cu@N-Gr & Fe@N-Gr) with the M–N<sub>4</sub> (M = Cu and Fe) active site, and their structural and electronic properties, as well as the CO<sub>2</sub>ER catalytic performance of these single-atom Cu/Fe catalysts have been systematically investigated by first-principles calculations. Finally, the exerting effects of curvature on the selectivity and the limiting potentials have been discussed.

## 2 Computational details

### 2.1 Energy calculation

The binding energy ( $E_b$ ) of a metal atom in M@N-Gr and M@N-CNT (M = Cu and Fe) can be defined as:

$$E_b = E_{\text{total}} - (E_{\text{substrate}} + E_M)$$

where  $E_{\text{substrate}}$ ,  $E_M$  and  $E_{\text{total}}$  are energies of the substrate, the metal atom, and the metal-embedded substrate, respectively.

According to the computational hydrogen electrode (CHE) model proposed by Nørskov *et al.*,<sup>46</sup> the Gibbs free energy change ( $\Delta G$ ) of each elementary step in the CO<sub>2</sub>ER is defined as:

$$\Delta G(U) = \Delta G(0 \text{ V}) + neU$$

where  $U$  is the applied potential relative to the reversible hydrogen electrode (RHE) and  $n$  is the number of proton–electron pairs ( $\text{H}^+ + e^-$ ) transferred. When  $U = 0 \text{ V}$ ,  $\Delta G$  can be expressed as:

$$\Delta G = \Delta E + \Delta ZEP + \int C_p dT - T\Delta S + \Delta G_{\text{pH}}$$

where  $\Delta E$  is the electron energy difference directly obtained by DFT calculations,  $\Delta ZEP$ ,  $\int C_p dT$ , and  $T\Delta S$  are the zero-point energy change, enthalpy change contributed by molecular vibration and entropy change at 298 K, respectively, and  $\Delta G_{\text{pH}}$  represents the free energy correction caused by variations in  $\text{H}^+$  concentration, which can be expressed as  $\Delta G_{\text{pH}} = k_B T \ln 10 \times \text{pH}$ , and the pH value is set to be 0 in this work. As shown in

Table S1,<sup>†</sup> the free energy of gaseous species is calculated at the standard atmospheric pressure of 1 bar, while the free energy of liquid species is obtained by using the corresponding vapor fugacity ( $f$ ), based on the ideal gas-model calculations. According to previous studies,<sup>47</sup> the chemical potential corrections of  $-0.09$ ,  $-0.22$ , and  $-0.07 \text{ eV}$  for H<sub>2</sub>O (aq), HCOOH (aq), and CH<sub>3</sub>OH (aq), respectively, have been considered in determination of the Gibbs free energy change.

To evaluate the influence of solvent on the reaction, we apply an implicit solvent model to mimic the solvation of H<sub>2</sub>O. In this case,  $\Delta G$  can be expressed as:

$$\Delta G = \Delta E + \Delta ZEP + \int C_p dT - T\Delta S + \Delta E_{\text{sol}}$$

where  $\Delta E_{\text{sol}}$  is the correction of solvation effect. The limiting potential ( $U_L$ ) for the hydrogenation step is defined by the maximum free energy change ( $\Delta G_{\text{MAX}}$ ) as follows:  $U_L = -\Delta G_{\text{MAX}}/e^-$ , where  $e^-$  is the elementary charge.

### 2.2 Models and DFT calculations

Based on  $5 \times 3$  graphene monolayer and (8, 0) carbon nanotubes doped with four N atoms, we constructed the Cu/Fe@N-Gr and Cu/Fe@N-CNT models by replacing a C<sub>2</sub> moiety of graphene and CNT with the single Cu/Fe atom, as shown in Fig. 1. The structures of Cu/Fe@N-Gr and Cu/Fe@N-CNT were optimized by Perdew–Burke–Ernzerhof (PBE) exchange–correlation function within the generalized gradient approximation (GGA).<sup>48</sup> The energy cutoff was set to be 450 eV, and the electronic energy and the force on each ion were converged to  $10^{-5} \text{ eV}$  and  $0.01 \text{ eV \AA}^{-1}$ , respectively. To consider van der Waals interaction, the dispersion corrected DFT-D3 method<sup>49</sup> was used in all calculations. The  $k$ -points of the Brillouin zone were set to  $3 \times 3 \times 1$  and  $1 \times 1 \times 4$  for Cu/Fe@N-Gr and Cu/Fe@N-CNT, respectively. The projected density of states (PDOS) of Cu/Fe@N-Gr and Cu/Fe@N-CNT were also calculated under optimized geometries to deeply analyze the electronic properties. Furthermore, the implicit water solvent model in VASPsol<sup>50</sup> was considered, and the electron transfer features were discussed by using the Bader charge analysis.<sup>51</sup> All the above spin polarization density functional theory (DFT) calculations were carried out using the plane-wave code of Vienna *ab initio* simulation package (VASP).<sup>52,53</sup>

## 3 Results and discussion

### 3.1 Electronic structure and stability of M@N-Gr and M@N-CNT (M = Cu & Fe)

The optimized Cu–N bond length of Cu@N-Gr is 1.93 Å (see Fig. S1<sup>†</sup>), which is in good agreement with the experimental value (1.94 Å) measured by the EXAFS.<sup>43</sup> Due to the existence of curvature in CNT, the Cu–N bond length of Cu@N-CNT extends to about 2.02 Å. The calculated Fe–N bond length of Fe@N-Gr (1.89 Å) is in good agreement with the previously reported value (1.89 Å),<sup>19</sup> while the Fe–N bond length of Fe@N-CNT increases to 1.95 Å. The projected density of states (PDOS) of Cu@N-Gr, Cu@N-CNT, Fe@N-Gr and Fe@N-CNT (Fig. S1<sup>†</sup>)



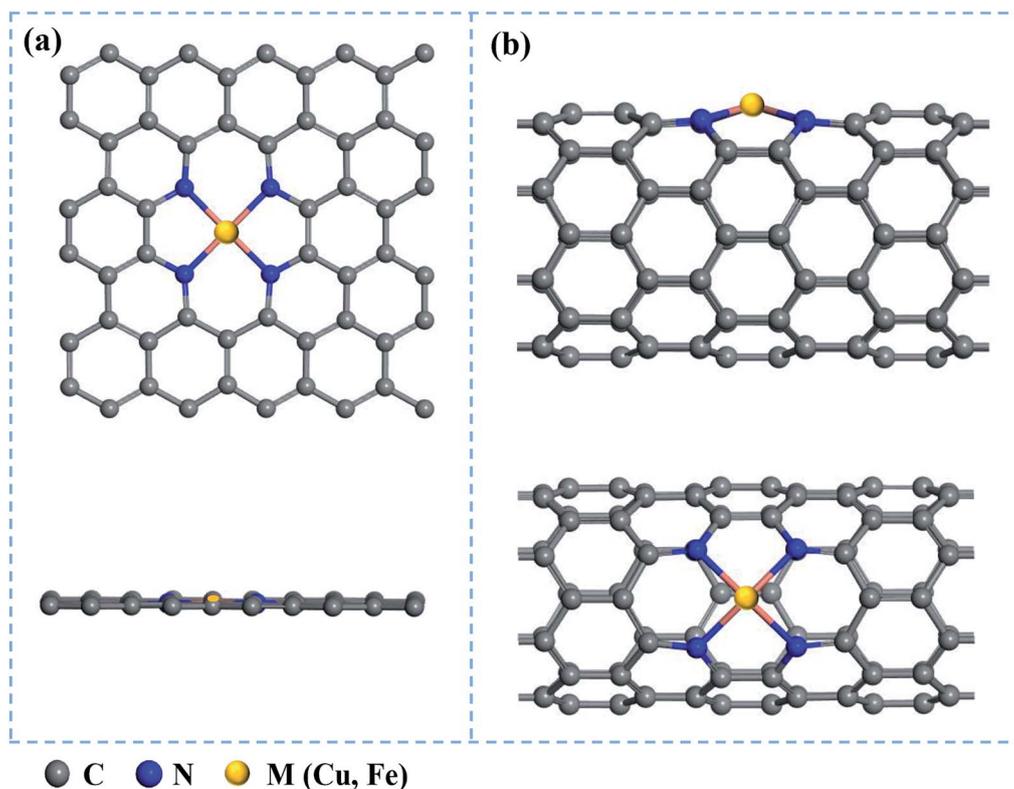


Fig. 1 Top and main views of nanostructures (a) M@N-Gr and (b) M@N-CNT (M = Cu & Fe), where gray, blue, and yellow balls represent the C, N, and metal (Cu or Fe) atoms, respectively.

show considerable overlap between the Cu/Fe(3d) and N(2p) orbital levels in both nanostructures, suggesting strong bonding interactions between Cu/Fe atom and adjacent pyridine-N atoms. It is well known that the inherent electronic structure of SACs determines their catalytic properties, in which the d-band center ( $\varepsilon_d$ ) has been widely used to describe the surface activity.<sup>36,54–57</sup> From Cu@N-Gr to Cu@N-CNT, the  $\varepsilon_d$  of Cu rises by about 0.55 eV (see Fig. S1<sup>†</sup>), indicating that Cu@N-

CNT may have a single-atom-Cu site with higher activity, compared to Cu@N-Gr. As for Fe@N-Gr and Fe@N-CNT, the  $\varepsilon_d$  of Fe is less changed, and both d-band centers are higher than the  $\varepsilon_d$  of Cu in Cu@N-Gr and Cu@N-CNT.

Fig. 2a shows the differential charge density of Cu@N-Gr, Cu@N-CNT, Fe@N-Gr and Fe@N-CNT, where yellow and blue regions denote increase and decrease of electron density, respectively. As Fig. 2 shows, for all nanostructures, the charge

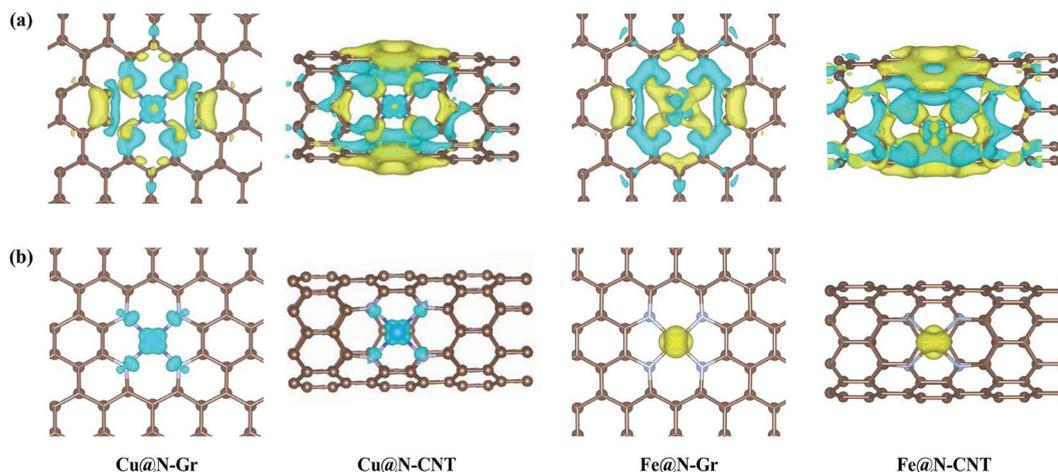


Fig. 2 (a) The differential charge density (yellow and blue represent the electron accumulation and depletion) and (b) electron spin densities of Cu@N-Gr, Cu@N-CNT, Fe@N-Gr and Fe@N-CNT.



density around the Cu and Fe atoms decreases, while the charge density on the pyridine N increases, suggesting that the electron is transferred from the central Cu/Fe to the adjacent N atoms. The Bader charge analyses reveal that there are charge transfers of  $0.93e^-$  and  $0.88e^-$  from the Cu atom in Cu@N-Gr and Cu@N-CNT to its surrounding atoms, respectively, indicating that the Cu atom is positively charged (about +1), which is consistent with the experimentally measured valence state of the Cu atom.<sup>42</sup> And the charges transferred by the Fe atom in Fe@N-Gr and Fe@N-CNT are  $1.12e^-$  and  $1.09e^-$ , respectively, more notable than those by the Cu atom. From the electron spin densities in Fig. 2b, it can be seen that the net spins are mainly localized on the metal (Cu & Fe) and N atoms. Obviously, these charge and spin populations indicate that both single metal atoms Cu and Fe have strong bonding interactions with the N-doping graphene and carbon nanotube, and the atomically dispersed Cu and Fe may be served as the active site in catalysis.

Stability is one of the essential factors to evaluate the SAC performance. Herein, taking Cu@N-Gr and Fe@N-Gr as examples, the phonon spectra were calculated to confirm the dynamic stability of Cu/Fe nanostructures. As shown in Fig. S2,<sup>†</sup> none of Cu@N-Gr and Fe@N-Gr have imaginary phonon branch, indicating that both nanostructures are dynamically stable. Besides, the predicted binding energies ( $E_b$ ) of Cu@N-Gr, Cu@N-CNT, Fe@N-Gr and Fe@N-CNT are  $-1.2$ ,  $-0.4$ ,  $-2.2$  and  $-1.1$  eV, respectively, *i.e.*, both Cu and Fe embedding into the substrates are thermodynamically favorable, suggesting that Cu@N-Gr, Cu@N-CNT, Fe@N-Gr and Fe@N-CNT have relatively high thermodynamic stability.

### 3.2 CO<sub>2</sub>ER on M@N-Gr and M@N-CNT (M = Cu & Fe)

The electrochemical reduction reaction of CO<sub>2</sub> catalyzed by Cu@N-Gr, Cu@N-CNT, Fe@N-Gr, and Fe@N-CNT has been explored by the first-principles calculations here. Based on the optimized stable intermediate configurations, we proposed two possible reaction pathways for four nanostructures (Fig. 3). First of all, the initial step of the CO<sub>2</sub>ER process—CO<sub>2</sub> adsorption was explored. As shown in Fig. S3,<sup>†</sup> the adsorption of CO<sub>2</sub> on Cu@N-Gr and Cu@N-CNT has a physisorbed linear configuration, in which the distances between Cu and CO<sub>2</sub> in both adsorption configurations are slightly larger than 3 Å, which is similar to the situation on the Cu (111) surface.<sup>58</sup> Similarly, the adsorption of CO<sub>2</sub> on Fe@N-Gr is also physical adsorption, and the distance between CO<sub>2</sub> and Fe is 3.4 Å. On the contrary, the CO<sub>2</sub> adsorption on Fe@N-CNT shows a chemisorbed configuration with the Fe–CO<sub>2</sub> bond length of 2.27 Å and the ∠OCO bond angle of 158°.

**3.2.1 Initial protonation steps (CO<sub>2</sub>ER vs. HER).** The initial protonation process in CO<sub>2</sub>ER may produce two different intermediates from the O and C sites of CO<sub>2</sub>, *i.e.*, \*COOH/\*OCHO (\*CO<sub>2</sub> + H<sup>+</sup> + e<sup>-</sup> → \*COOH/\*OCHO). The proposed CO<sub>2</sub>ER pathways catalyzed by all nanostructures are shown in Fig. 3, and the predicted relative free energies for the corresponding elementary steps involved in CO<sub>2</sub>ER are compiled into Table S2.<sup>†</sup> However, the hydrogen evolution reaction (HER) is a competitive side reaction during CO<sub>2</sub>ER, and thus we

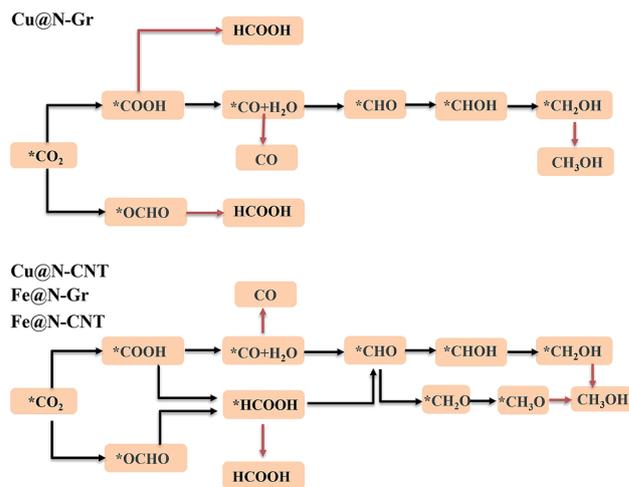


Fig. 3 Proposed reaction paths for CO<sub>2</sub>RR on Cu@N-Gr, Cu@N-CNT, Fe@N-Gr and Fe@N-CNT.

evaluated the competition among the initial protonation steps for CO<sub>2</sub>ER and HER generated by the Volmer–Heyrovsky mechanism.<sup>59</sup> Simultaneously, we calculated the CO<sub>2</sub>ER process under vacuum and water solvent to evaluate the solvent effect on the reaction intermediates and CO<sub>2</sub>ER process, and the corresponding  $\Delta G$  values are listed in Table S2.<sup>†</sup> Similarly, Table S3<sup>†</sup> lists the solvation energy ( $\Delta E_{\text{sol}}$ ) of the main reaction intermediates in CO<sub>2</sub>ER catalyzed by Cu@N-Gr, Cu@N-CNT, Fe@N-Gr and Fe@N-CNT, where a negative  $\Delta E_{\text{sol}}$  value represents an enhancement of adsorption.

Fig. 4 depicts the correlation relationship between the free energy changes ( $\Delta G$ ) for the formation of \*COOH/\*OCHO and \*H at the Cu/Fe site, where the smaller the  $\Delta G$ , the more favorable the process. As the results in Fig. 4 show, both Cu@N-Gr and Cu@N-CNT have higher selectivity towards CO<sub>2</sub>ER in both vacuum or aqueous solution, compared to HER, and the

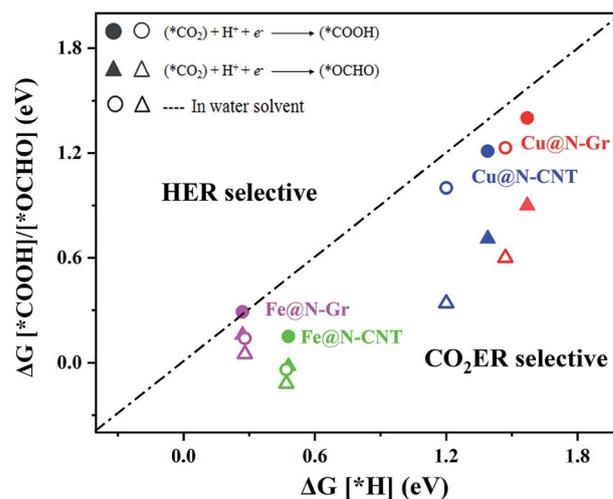


Fig. 4 Comparison of the free energy changes ( $\Delta G$ ) for the first hydrogenation to \*COOH or \*OCHO in CO<sub>2</sub>ER and \*H in HER in vacuum and water solvent.



formation of \*OCHO intermediate ( $\text{CO}_2 + \text{H}^+ + \text{e}^- \rightarrow \text{*OCHO}$ ) should be dominant in the initial protonation. Similarly, both Fe@N-Gr and Fe@N-CNT have higher selectivity toward  $\text{CO}_2\text{ER}$  than HER in aqueous solution, and the free energy changes in the initial protonation to form \*OCHO and \*COOH intermediates are very close. In addition, the solvation effect on the relative energies of the intermediates (\*COOH/\*OCHO) was also studied. As shown in Table S3,<sup>†</sup> the solvation energies ( $\Delta E_{\text{solv}}$ ) of \*COOH are  $-0.15$  eV for Cu@N-Gr and  $-0.17$  eV for Cu@N-CNT, respectively, while the corresponding  $\Delta E_{\text{solv}}$  values of \*OCHO are  $-0.28$  and  $-0.33$  eV, indicating that there is relatively stronger solvent effect on the \*OCHO intermediate for Cu@N-Gr and Cu@N-CNT, compared to \*COOH. For Fe@N-Gr and Fe@N-CNT, the effects of solvation on the intermediates \*COOH and \*OCHO are similar, and the corresponding  $\Delta E_{\text{solv}}$  values varies from  $-0.08$  to  $-0.15$  eV. Accordingly, the solvent effect in  $\text{CO}_2\text{ER}$  cannot be ignored. In the following discussion, the free energy changes involved are all solvent-based.

As shown in Fig. S4,<sup>†</sup> the PDOS and differential charge density of COOH/OCHO-adsorbed on Cu@N-Gr and Cu@N-CNT indicate that there are relatively strong orbital interactions of C/O(p) of \*COOH/\*OCHO with Cu(d) of Cu@N-Gr and Cu@N-CNT. Compared with the \*COOH species, there are stronger charge-transfer interactions between \*OCHO and Cu@N-Gr or Cu@N-CNT, and the formation of \*OCHO is more favorable thermodynamically, as shown in Fig. S4 and S5.<sup>†</sup>

**3.2.2  $\text{CO}_2\text{ER}$  to CO.** As we all know,  $\text{CO}_2\text{ER}$  is the multiple protonation and electron-transfer process. For the production of CO on Cu@N-Gr, Cu@N-CNT, Fe@N-Gr, and Fe@N-CNT, a two-electron reduction through consecutive electron/proton transfers, *i.e.*,  $\text{CO}_2 + \text{H}^+ + \text{e}^- \rightarrow \text{*COOH} + \text{H}^+ + \text{e}^- \rightarrow \text{*CO} + \text{H}_2\text{O}$ , is involved. The detailed free energy profiles for  $\text{CO}_2\text{ER}$  to CO catalyzed by Cu@N-Gr, Cu@N-CNT, Fe@N-Gr and Fe@N-CNT are shown in Fig. 5. Note that the rate-limiting step for the channel to CO on Cu@N-Gr and Cu@N-CNT is  $\text{CO}_2 + \text{H}^+ + \text{e}^- \rightarrow \text{*COOH}$ , and the corresponding reaction  $\Delta G$  is 1.51 eV for Cu@N-Gr and 1.35 eV for Cu@N-CNT. As Fig. S1<sup>†</sup> shows, the  $\epsilon_{\text{d}}$  of Cu in Cu@N-CNT is notably higher than that of Cu@N-Gr, and closer to the Fermi energy level, which is consistent with the order of relative activities and reaction  $\Delta G$  values in Fig. 5. Unlike atomically Cu-embedded nanostructures, the rate-

limiting step for the CO production on Fe@N-Gr and Fe@N-CNT is the desorption process of CO ( $\text{*CO} \rightarrow \text{*} + \text{CO}$ ), and the corresponding reaction  $\Delta G$  values are close each other (1.02 eV for Fe@N-Gr and 1.07 eV for Fe@N-CNT).

Followed by the proton-electron transfer to the \*COOH species, the \*CO is formed with the release of  $\text{H}_2\text{O}$ . As Fig. 5 shows, the adsorbed state of \*CO on the Fe-embedded nanostructure is much more stable than that on the Cu-embedded nanostructure, and its desorption is difficult accordingly. Here the \*CO on Cu@N-Gr, Cu@N-CNT, Fe@N-Gr, and Fe@N-CNT generally has a vertical adsorption configuration through Cu/Fe-CO bonding interactions, as observed in previous studies,<sup>60,61</sup> where the C-O bond length on the Cu- and Fe-embedded nanostructures slightly increases to 1.16 and 1.17 Å, respectively, compared to the free CO (1.15 Å), indicating that the CO bond is weakened to some extent. We note that  $5\sigma$  and  $2\pi^*$  orbitals of CO are mainly contributed by  $p_z$  and  $p_x/p_y$  of the C atom (Fig. S6<sup>†</sup>), respectively, and there are similar bonding interactions for the chemisorption of CO on all nanostructures, as shown in Fig. 6. The  $\sigma$  bonding interaction between C( $p_z$ ) and Cu/Fe( $d_z^2$ ) and the weak back-donation bonding interaction between C( $p_x/p_y$ ) and Cu( $d_{xz}/d_{yz}$ ) account for the CO chemisorption on nanostructures. Although the bonding mechanism is similar for both systems, the Cu-CO (1.79 Å) and Fe-CO (1.72 Å) bonds have different strengths. The  $\epsilon_{\text{d}}$  of Fe in Fe nanostructures is closer to the Fermi level than the d-band center of Cu, as shown in Fig. 6 and S1,<sup>†</sup> and thus there are stronger bonding interactions between Fe and CO, compared to \*CO on Cu@N-Gr and Cu@N-CNT, resulting in stronger CO adsorption on Fe nanostructures with the binding free energies of  $-0.64$  eV for Fe@N-CNT and  $-0.69$  eV for Fe@N-Gr than that on Cu nanostructures with the binding free energies of  $-0.13$  eV for Cu@N-CNT and 0.62 eV for Cu@N-Gr. Linear correlation between the \*CO binding energy ( $E_{\text{b}}$ ) and  $\epsilon_{\text{d}}$  of the metal atom is shown in Fig. S7.<sup>†</sup> The present results show that the CO adsorption on the Cu/Fe-embedded nanostructures is enhanced with the increase of  $\epsilon_{\text{d}}$ .

**3.2.3  $\text{CO}_2\text{ER}$  to HCOOH.** As for the generation of HCOOH, plausible reaction pathways from different initial protonation steps and predicted relative free energy profiles are depicted in Fig. S5.<sup>†</sup> For Cu@N-Gr, since there is no stable \*HCOOH

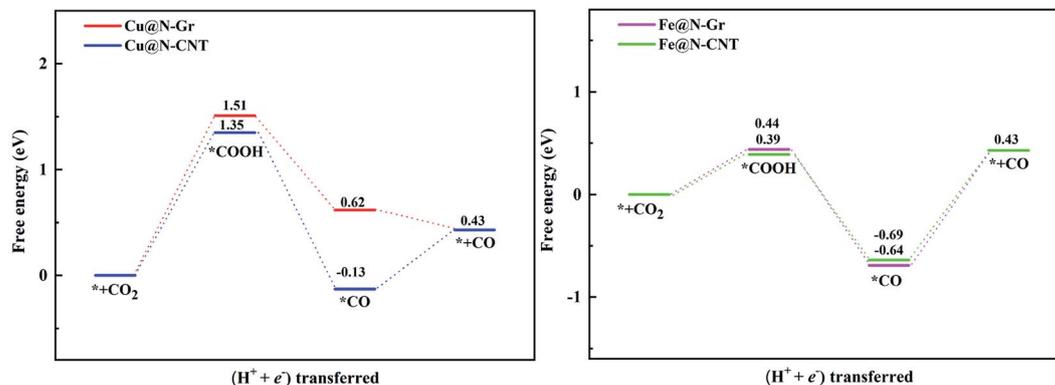


Fig. 5 The predicted free energy diagram of  $\text{CO}_2\text{ER}$  to CO on Cu@N-Gr, Cu@N-CNT, Fe@N-Gr and Fe@N-CNT.



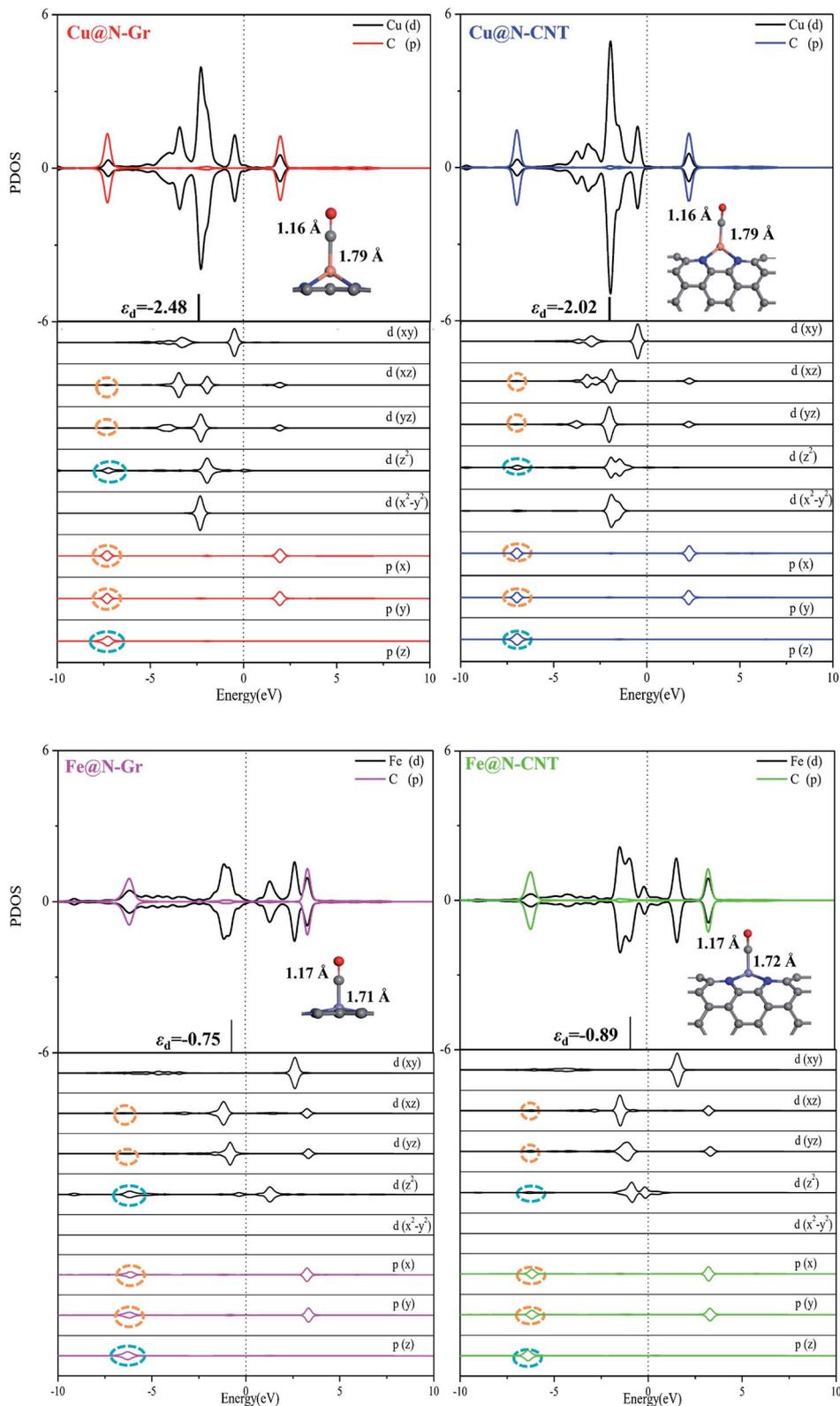


Fig. 6 The PDOS after \*CO adsorbed on Cu@N-Gr, Cu@N-CNT, Fe@N-Gr and Fe@N-CNT.

intermediate, HCOOH can be produced directly by a two-electron reduction process. For both Cu@N-CNT and Cu@N-Gr, the low-energy route to HCOOH formation is  $\text{CO}_2 \rightarrow$

\*OCHO  $\rightarrow$  \*HCOOH  $\rightarrow$  HCOOH, and the corresponding energy limiting step is formation of the \*OCHO intermediate, as shown in Fig. 7. For Cu@N-CNT, the hydrogenation of the



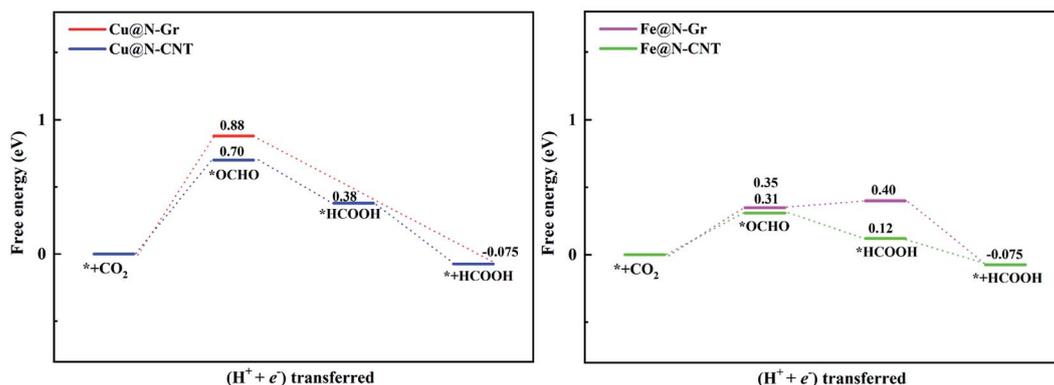


Fig. 7 The free energy diagram of  $\text{CO}_2\text{ER}$  to  $\text{HCOOH}$  on  $\text{Cu@N-Gr}$ ,  $\text{Cu@N-CNT}$ ,  $\text{Fe@N-Gr}$  and  $\text{Fe@N-CNT}$ .

\*OCHO intermediate in the low-energy pathway yields \*HCOOH and its desorption produces HCOOH with the reaction  $\Delta G$  of  $-0.45$  eV. Note that for  $\text{Fe@N-CNT}$  and  $\text{Fe@N-Gr}$ , the low-energy pathway to form HCOOH is the same as  $\text{Cu@N-Gr}$  ( $\text{CO}_2 \rightarrow \text{*OCHO} \rightarrow \text{*HCOOH} \rightarrow \text{HCOOH}$ ), and their limiting energy step is also the formation of \*OCHO. The corresponding  $\Delta G$  of the limiting energy step for  $\text{CO}_2\text{ER}$  to HCOOH on  $\text{Cu@N-CNT}$  is  $0.70$  eV, which is  $0.18$  eV lower than that on  $\text{Cu@N-Gr}$ , indicating that  $\text{Cu@N-CNT}$  is more favorable to generate HCOOH thermodynamically, compared to  $\text{Cu@N-Gr}$ . The  $\Delta G$  values of the limiting energy steps for  $\text{CO}_2\text{ER}$  to HCOOH on  $\text{Fe@N-Gr}$  and  $\text{Fe@N-CNT}$  are very close, and both are lower than those on Cu nanostructures.

**3.2.4  $\text{CO}_2\text{ER}$  to  $\text{CH}_3\text{OH}$ .** Unlike the production of CO and HCOOH, the formation of  $\text{CH}_3\text{OH}$  requires six hydrogenation steps, and the whole reaction process is more complicated. On  $\text{Cu@N-Gr}$ , the pathway of  $\text{CH}_3\text{OH}$  formation starts from \*CO, as shown in Fig. S8†. The initial hydrogenation of \*CO may lead to \*COH or \*CHO, and the former is quite unfavorable thermodynamically. The \*COH formation requires the reaction  $\Delta G$  of  $2.33$  eV, much higher than  $0.71$  eV for the \*CHO generation (see Fig. S8†), suggesting that the \*CO hydrogenation to \*CHO is dominant channel. Accordingly, the low-energy process of  $\text{CO}_2\text{ER}$  to  $\text{CH}_3\text{OH}$  on  $\text{Cu@N-Gr}$  follows consecutive single-electron reductions, *i.e.*,  $\text{CO}_2 \rightarrow \text{*COOH} \rightarrow \text{*CO} \rightarrow \text{*CHO} \rightarrow \text{*CHOH} \rightarrow \text{*CH}_2\text{OH} \rightarrow \text{CH}_3\text{OH}$ , as shown in Fig. 8.

For the electrochemical reduction of  $\text{CO}_2$  to  $\text{CH}_3\text{OH}$  on  $\text{Cu@N-CNT}$ , there are several plausible routes to  $\text{CH}_3\text{OH}$ , as depicted in Fig. S8†. The pathway starting from the key intermediate \*CO is the same as that on  $\text{Cu@N-Gr}$ , but the strong binding of \*CO on  $\text{Cu@N-CNT}$  makes its initial hydrogenation, *i.e.*,  $\text{CO} + \text{H}^+ + \text{e}^- \rightarrow \text{*CHO} / \text{*COH}$ , requires relatively high free energies (see Fig. S8†), and thus the intermediate \*CO may tend toward desorption to CO, compared to the initial hydrogenation through one electron reduction (see Fig. 5). We note that another pathway to generate  $\text{CH}_3\text{OH}$  through intermediates \*OCHO and \*HCOOH on  $\text{Cu@N-CNT}$  is much favorable thermodynamically, as shown in Fig. S8† and Fig. 8. The formation of \*CHO through the intermediate \*HCOOH is much easier than that through the \*CO species. Accordingly, the low-energy route for  $\text{CO}_2\text{ER}$  to  $\text{CH}_3\text{OH}$  on  $\text{Cu@N-CNT}$ , *i.e.*,  $\text{CO}_2 \rightarrow \text{*OCHO} \rightarrow \text{*HCOOH} \rightarrow \text{*CHO} \rightarrow \text{*CH}_2\text{O} \rightarrow \text{*OCH}_3 \rightarrow \text{CH}_3\text{OH}$ , is different from that on  $\text{Cu@N-Gr}$ , as shown in Fig. 8. Clearly, the curvature of  $\text{Cu@N-CNT}$  can promote its catalytic activity and adjust the  $\text{CO}_2\text{ER}$  selectivity. The optimized structures of reaction intermediates involved in  $\text{CO}_2\text{ER}$  to  $\text{CH}_3\text{OH}$  are shown in Fig. S9.†

Similar to  $\text{CH}_3\text{OH}$  production on  $\text{Cu@N-CNT}$ , the \*HCOOH intermediate on  $\text{Fe@N-CNT}$  and  $\text{Fe@N-Gr}$  has also been located, and their low-energy pathways to form  $\text{CH}_3\text{OH}$  are:  $\text{CO}_2 \rightarrow \text{*OCHO} \rightarrow \text{*HCOOH} \rightarrow \text{*CHO} \rightarrow \text{*CHOH} \rightarrow \text{*CH}_2\text{OH} \rightarrow \text{CH}_3\text{OH}$  for  $\text{Fe@N-Gr}$  and  $\text{CO}_2 \rightarrow \text{*OCHO} \rightarrow \text{*HCOOH} \rightarrow \text{*CHO} \rightarrow \text{*CH}_2\text{O} \rightarrow \text{*OCH}_3 \rightarrow \text{CH}_3\text{OH}$  for  $\text{Fe@N-CNT}$ . Here the

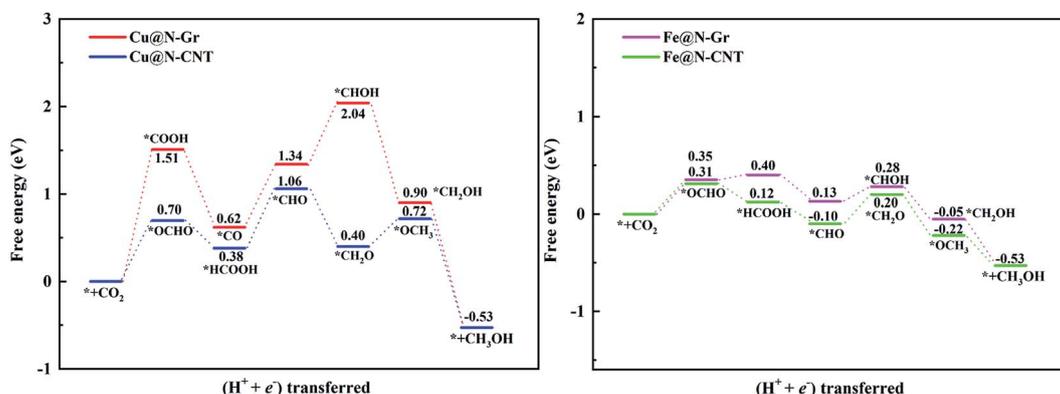


Fig. 8 The free energy diagram of  $\text{CO}_2\text{ER}$  to  $\text{CH}_3\text{OH}$  on  $\text{Cu@N-Gr}$ ,  $\text{Cu@N-CNT}$ ,  $\text{Fe@N-Gr}$  and  $\text{Fe@N-CNT}$ .



**Table 1** Rate-limiting steps (RLS) and limiting potentials ( $U_L$ , V) for generating specific products on Cu@N-Gr, Cu@N-CNT, Fe@N-Gr and Fe@N-CNT in water solution

Products	CO		HCOOH		CH <sub>3</sub> OH	
	RLS	$U_L$	RLS	$U_L$	RLS	$U_L$
Cu@N-Gr	$\text{CO}_2 + \text{H}^+ + \text{e}^- \rightarrow \text{*COOH}$	-1.51	$\text{CO}_2 + \text{H}^+ + \text{e}^- \rightarrow \text{*OCHO}$	-0.88	$\text{CO}_2 + \text{H}^+ + \text{e}^- \rightarrow \text{*COOH}$	-1.51
Cu@N-CNT	$\text{CO}_2 + \text{H}^+ + \text{e}^- \rightarrow \text{*COOH}$	-1.35	$\text{CO}_2 + \text{H}^+ + \text{e}^- \rightarrow \text{*OCHO}$	-0.70	$\text{CO}_2 + \text{H}^+ + \text{e}^- \rightarrow \text{*OCHO}$	-0.70
Fe@N-Gr	$\text{*CO} \rightarrow \text{*} + \text{CO}$	-1.02	$\text{CO}_2 + \text{H}^+ + \text{e}^- \rightarrow \text{*OCHO}$	-0.35	$\text{CO}_2 + \text{H}^+ + \text{e}^- \rightarrow \text{*OCHO}$	-0.35
Fe@N-CNT	$\text{*CO} \rightarrow \text{*} + \text{CO}$	-1.07	$\text{CO}_2 + \text{H}^+ + \text{e}^- \rightarrow \text{*OCHO}$	-0.31	$\text{CO}_2 + \text{H}^+ + \text{e}^- \rightarrow \text{*OCHO}$	-0.31

limiting energy step for CO<sub>2</sub>ER to CH<sub>3</sub>OH on Fe nanostructures is different from that on Cu@N-CNT, and the corresponding  $\Delta G$  of the limiting energy step is also smaller (Fig. 8). Such discrepancies in the low-energy mechanism for CO<sub>2</sub>ER to CH<sub>3</sub>OH on Cu@N-Gr, Cu@N-CNT, Fe@N-Gr and Fe@N-CNT can be mainly ascribed to the formation of key intermediate \*HCOOH, and the presence of the stable \*HCOOH on Cu@N-CNT, Fe@N-Gr and Fe@N-CNT provides a new channel to CH<sub>3</sub>OH, instead of \*CO as the initial precursor for Cu@N-Gr.

As shown in Fig. S9,<sup>†</sup> the O–Cu and O–Fe distances of \*HCOOH adsorbed on Cu@N-CNT, Fe@N-Gr and Fe@N-CNT are 2.28, 2.32, and 2.12 Å, respectively. The corresponding adsorption energies ( $E_{\text{ads}}$ ) are -0.38, -0.50, and -0.60 eV, indicating the relatively strong interactions between HCOOH and Cu@N-CNT, Fe@N-Gr and Fe@N-CNT, which are beneficial to the following catalytic reaction to yield CH<sub>3</sub>OH. Taking the \*HCOOH intermediate on Cu@N-CNT as an example, the predicted differential charge density and PDOS of \*HCOOH on Cu@N-CNT in Fig. S10<sup>†</sup> also reveal that the O atom of HCOOH and the Cu center have relatively strong bonding interactions, differing from the situation of Cu@N-Gr without the curvature.

### 3.3 The limiting potential

The limiting potentials ( $U_L$ ) of generating CO, HCOOH, and CH<sub>3</sub>OH on Cu@N-CNT and Cu@N-Gr in water solution are shown in Fig. S11,<sup>†</sup> and the corresponding rate-limiting steps and  $U_L$  values are compiled into Table 1. Here the required limiting potentials to produce HCOOH and CH<sub>3</sub>OH on Cu/Fe nanostructures are generally lower than that for the CO product (except for CH<sub>3</sub>OH on Cu@N-Gr), and this is because the initial protonation is more conducive to the formation of \*OCHO. For Cu@N-Gr, the production of CO and CH<sub>3</sub>OH possess the same limiting potential of -1.51 V, and corresponding rate-limiting step is  $\text{CO}_2 + \text{H}^+ + \text{e}^- \rightarrow \text{*COOH}$ . For Cu@N-CNT, the  $U_L$  values of CO, HCOOH and CH<sub>3</sub>OH are significantly lower than that of Cu@N-Gr. As Table 1 shows, the limiting potential difference for the same product on Cu@N-Gr and Cu@N-CNT is:  $\text{CO} \approx \text{HCOOH} < \text{CH}_3\text{OH}$ , suggesting that the curvature of Cu@N-CNT may improve the catalytic performance of CO<sub>2</sub>ER, especially for the selectivity of CH<sub>3</sub>OH.

For Fe@N-Gr and Fe@N-CNT, the  $U_L$  values of CO, HCOOH and CH<sub>3</sub>OH are smaller than those on Cu nanostructures, the corresponding limit potential differences (Fe@N-Gr vs. Fe@N-CNT) are generally small, indicating that the curvature effect is less remarkable for Fe nanoparticles in comparison with the

corresponding Cu-embedded N-doped carbon materials. We note that the  $U_L$  values of CO on Cu@N-CNT, Fe@N-Gr, and Fe@N-CNT are larger than those of CH<sub>3</sub>OH, suggesting relatively high selectivity toward CH<sub>3</sub>OH, compared to Cu@N-Gr.

## 4 Conclusions

In summary, we have systematically investigated the catalytic activity and possible CO<sub>2</sub>ER pathways on the single Cu/Fe embedded N-doped graphene and carbon nanotube by means of first-principles calculations. Here the atomically dispersed metal catalysts of Cu@N-Gr, Cu@N-CNT, Fe@N-Gr and Fe@N-CNT are predicted to be stable, both thermodynamically and dynamically, and they exhibit higher selectivity toward CO<sub>2</sub>ER, compared to HER. Our calculations indicate that different initial hydrogenation steps account for CO<sub>2</sub>ER to CO, HCOOH, and CH<sub>3</sub>OH, respectively. The main reaction pathway for CO<sub>2</sub>ER to CO on Cu@N-Gr, Cu@N-CNT, Fe@N-Gr and Fe@N-CNT is composed of the consecutive hydrogenations, *i.e.*,  $\text{CO}_2 \rightarrow \text{*COOH} \rightarrow \text{*CO} \rightarrow \text{CO}$ , where the energy limiting step is formation of the key intermediate \*COOH for Cu@N-Gr, Cu@N-CNT and the desorption of CO for Fe@N-Gr and Fe@N-CNT. The \*OCHO intermediate from the initial protonation and one electron reduction is responsible for the HCOOH product. The intermediates \*COOH and \*OCHO are the precursors to CH<sub>3</sub>OH on Cu@N-Gr and Cu@N-CNT and Fe nanostructures, respectively. The predicted limiting potentials for the formation of CO, HCOOH, and CH<sub>3</sub>OH reveal that Cu@N-CNT, Fe@N-Gr and Fe@N-CNT generally have higher activity towards CO<sub>2</sub>ER than Cu@N-Gr. For CO<sub>2</sub>ER to CO, HCOOH, and CH<sub>3</sub>OH on these single metal-atom embedded catalysts, Cu@N-Gr has higher selectivity to HCOOH, while Cu@N-CNT, Fe@N-Gr, and Fe@N-CNT have higher selectivity to both HCOOH and CH<sub>3</sub>OH. The present results show that the curvature of the N-doped carbon materials notably elevate the d-band center of single Cu atom and promote the catalytic performance of CO<sub>2</sub>ER, especially for the selectivity of CH<sub>3</sub>OH. On the contrary, the curvature has less influence on the  $\epsilon_d$  of Fe, and the activity of the atomically dispersed Fe catalysts is changed indistinctively. As a consequence, the d-band center of metal atoms can be modified by the curvature of catalyst supports, but its exerting influence depends on the electronic structure of embedded single metal atoms.

## Conflicts of interest

There are no conflicts to declare.



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