

## RESEARCH ARTICLE

Pseudo-copper Ni–Zn alloy catalysts for carbon dioxide reduction to C<sub>2</sub> productsXiao-Dong Zhang<sup>1</sup>, Kang Liu<sup>1</sup>, Jun-Wei Fu<sup>1</sup>, Hong-Mei Li<sup>1</sup>, Hao Pan<sup>2</sup>, Jun-Hua Hu<sup>3</sup>, Min Liu<sup>1,†</sup><sup>1</sup>*School of Physics and Electronics, State Key Laboratory of Powder Metallurgy, Central South University, Changsha 410083, China*<sup>2</sup>*Department of Periodontics & Oral Mucosal Section, Xiangya Stomatological Hospital, Central South University, Changsha 410008, China*<sup>3</sup>*School of Materials Science and Engineering, Zhengzhou University, Zhengzhou 450002, China*Corresponding author. E-mail: <sup>†</sup>[minliu@csu.edu.cn](mailto:minliu@csu.edu.cn)  
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Electrocatalytic CO<sub>2</sub> reduction reaction (CO<sub>2</sub>RR) to obtain C<sub>2</sub> products has drawn widespread attentions. Copper-based materials are the most reported catalysts for CO<sub>2</sub> reduction to C<sub>2</sub> products. Design of high-efficiency pseudo-copper catalysts according to the key characteristics of copper (Cu) is an important strategy to understand the reaction mechanism of C<sub>2</sub> products. In this work, density function theory (DFT) calculations are used to predict nickel–zinc (NiZn) alloy catalysts with the criteria similar structure and intermediate adsorption property to Cu catalyst. The calculated tops of 3d states of NiZn<sub>3</sub>(001) catalysts are the same as Cu(100), which is the key parameter affecting the adsorption of intermediate products. As a result, NiZn<sub>3</sub>(001) exhibits similar adsorption properties with Cu(100) on the crucial intermediates \*CO<sub>2</sub>, \*CO and \*H. Moreover, we further studied CO formation, CO hydrogenation and C–C coupling process on Ni–Zn alloys. The free energy profile of C<sub>2</sub> products formation shows that the energy barrier of C<sub>2</sub> products formation on NiZn<sub>3</sub>(001) is even lower than Cu(100). These results indicate that NiZn<sub>3</sub> alloy as pseudo-copper catalyst can exhibit a higher catalytic activity and selectivity of C<sub>2</sub> products during CO<sub>2</sub>RR. This work proposes a feasible pseudo-copper catalyst and provides guidance to design high-efficiency catalysts for CO<sub>2</sub>RR to C<sub>2</sub> or multi-carbon products.

**Keywords** pseudo-copper catalysts, surface and electronic structure, adsorption abilities, Ni–Zn alloys, CO<sub>2</sub>RR C<sub>2</sub> products, DFT

## 1 Introduction

The excessive consumption of fossil fuels dramatically increases CO<sub>2</sub> concentration in the atmosphere and results in global warming and energy crisis. Developing and utilizing renewable energy sources to optimize the energy structure have received widespread attention [1–6]. Electrocatalytic or photocatalytic CO<sub>2</sub> reduction reactions (CO<sub>2</sub>RR) can convert intermittent electricity or solar energy into available chemical energy [7–11], and accelerate the carbon cycle. CO<sub>2</sub>RR to obtain C<sub>2</sub> products (ethylene [12–14] and ethanol [15–17], etc.) with higher energy density than C<sub>1</sub> products has become the focus in the energy catalysis field [18, 19]

Copper-based (Cu-based) materials are the most widely reported CO<sub>2</sub> reduction catalysts to generate C<sub>2</sub> prod-

ucts [19–21], due to its unique surface structure [22–24] electronic structure [25–29] and intermediate adsorption ability [30–33]. Many researches focus on improving the Faradic efficiency (FE) of C<sub>2</sub> products by forming Cu-based alloys, such as Cu–Ag [34, 35] and Cu–Zn [36, 37] alloys. In addition, other non-copperbased alloys (Ni–Al [38, 39] Ni–Ga [39, 40] and Pd–Au [41] alloy) have been reported to produce low yield of C<sub>2</sub> products, which indicates the possibility of non-copper-based catalysts producing C<sub>2</sub> products. According to the key characteristics of copper-based catalysts for C<sub>2</sub> products to design high-efficiency pseudo-copper catalysts is an important strategy to enhance the activity and selectivity of C<sub>2</sub> products. There are two criteria for evaluating pseudo-copper catalysts to generate C<sub>2</sub> products: (i) Copper-like surface structure and electronic structure. Cu(100) with unique surface structure sensitivity [23, 24, 42] and electronic structure [25–29] can control the activity and selectivity toward C<sub>2</sub> products. (ii) Copper-like adsorption abilities of \*CO<sub>2</sub>, \*CO and \*H. These adsorption abilities are the

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essential descriptors for CO<sub>2</sub> activation [43, 44] CO hydrogenation, C–C coupling [31, 32], and hydrogen evolution reaction (HER) [30, 33]. Based on above criteria, design of pseudo-copper catalysts with high-efficiency C<sub>2</sub> products is promising and significant.

Alloying is a feasible strategy for obtaining pseudo-copper catalysts [45], because the alloying effect is an effective method to regulate the adsorption abilities, surface and electronic structure of metal-based catalysts [38, 46]. The surface and electronic structure are primary consideration of component metals in pseudo-copper alloy catalysts. Nickel (Ni) and Zinc (Zn) are adjacent to Cu in the periodic table of elements. Ni has the face-centered cubic (fcc) lattice similar with Cu and its 3d states is adjustable [29]. Zn exhibits excellent potential in adjusting electronic structure of alloy catalysts [47]. Ni–Zn alloy can exhibit a similar electron/atom (*e/a*) ratio with Cu, which indicates that Ni–Zn alloy will have a stable copper-like lattice structure [48]. In addition, the electronic structure and intermediate adsorption ability of Ni–Zn alloys can be tuned by interaction between Ni and Zn. Ni–Zn alloys with copper-like surface and electronic structure, and intermediate adsorption ability are potential to obtain C<sub>2</sub> products in CO<sub>2</sub>RR.

In this work, NiZn(110) and NiZn<sub>3</sub>(001) are selected as the active facets due to their similar square geometric site structure to Cu(100). The CO<sub>2</sub> formation and C–C coupling on NiZn(110) and NiZn<sub>3</sub>(001) are further investigated to analyze the feasibility of C<sub>2</sub> products. The free energy profiles of C<sub>2</sub> products formation are used to study the reaction mechanism of NiZn(110) and NiZn<sub>3</sub>(001). The calculated results indicate that the NiZn and NiZn<sub>3</sub> alloys exhibit copper-like properties with these critical criteria. The energy barrier of C<sub>2</sub> products formation on NiZn<sub>3</sub>(001) is even lower than Cu(100). Therefore, the NiZn and NiZn<sub>3</sub> alloys are potential pseudo-copper catalysts for CO<sub>2</sub> reduction to C<sub>2</sub> products. This work proposes a feasible pseudo-copper catalyst and provides guidance to design high-efficiency catalysts for CO<sub>2</sub>RR to C<sub>2</sub> or multi-carbon products.

## 2 Computational methods

The Vienna *Ab initio* Simulation Package (VASP) was used to perform spin-polarized DFT [49–51]. The projector augmented wave (PAW) method was applied to describe the effective potential between the ion core and the electrons. The generalized gradient approximation (GGA) with Perdew–Burke–Ernzerhof (PBE) functional was adopted to calculate the exchange-correlation energy [52]. We set the kinetic cutoff energy of the plane wave as 450 eV. The convergence criteria for force and energy were set as 0.02 eV·Å<sup>-1</sup> and 10<sup>-5</sup> eV per atom, respectively [53]. We built the (3 × 3 × 4) surface supercells for all slab models, including NiZn(110),

NiZn(101), NiZn<sub>3</sub>(001), NiZn<sub>3</sub>(100), Cu(100) Cu(111), Ni(100), Ni(111), and Zn(001). The corresponding structures are shown in Fig. S1. For the Brillouin zone integration, we used a Monkhorst–Pack mesh with 3 × 3 × 1 K-points. The computational details of the adsorption energy and Gibbs free energy are shown in the Supporting Information.

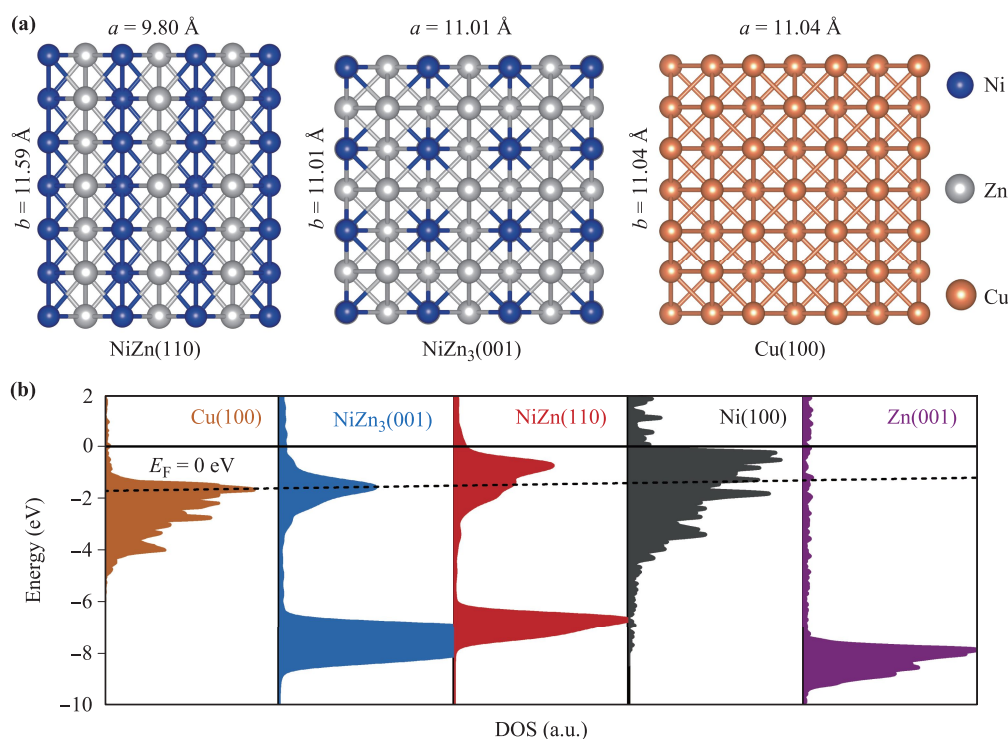
## 3 Results and discussion

### 3.1 Surface and electronic structures

Cu(100) is proven to be the most favorable surface orientation for C–C coupling [22], which can be attributed to its square ensemble sites [23, 24]. Like Cu, NiZn and NiZn<sub>3</sub> alloys also have a face-centered tetragonal (fct) structure. As shown in Fig. S1, the NiZn(110), NiZn(101), NiZn<sub>3</sub>(001), NiZn<sub>3</sub>(100), Ni(100) and Zn(001) exhibit the similar square geometric site structure to Cu(100). Furthermore, Table S1 compares the calculated lattice constants of these facets. The lattice constants of Cu(100) were calculated to be  $a = b = 11.04$  Å, while the Ni(100) and Zn(001) were  $a = b = 10.53$  Å and  $a = b = 11.25$  Å, respectively. This structural difference makes a big difference in catalytic performance. Interestingly, the lattice constants of NiZn(110) ( $a = 9.80$  Å,  $b = 11.59$  Å) and NiZn<sub>3</sub>(001) ( $a = b = 11.01$  Å) are more closer to Cu(100) [Fig. 1(a)] due to the structure rearrangement of Zn on Ni in alloy phases. The basic site configuration of NiZn(110) and NiZn<sub>3</sub>(001) can be same as that of Cu(100), which has a great influence on the whole catalytic C<sub>2</sub> formation reaction process.

As shown in Fig. 1(b), the d-band of Cu(100) mainly distributes below the Fermi level ( $E_F$ ), and its top of the 3d states are located around  $-1.8$  eV. The anti-bonding states are filled for Cu(100), which leads to Cu(100) has favorable adsorption for key intermediates [28]. As for Ni(100), the d-band cross the  $E_F$  and part of the anti-bonding states is empty for Ni(100), which will lead to strong adsorption abilities of intermediates and not conducive to further activation of adsorbate [29]. The d-band of Zn(001) mainly distributes at  $-8$  eV, which results in too weak adsorption of intermediates. Both NiZn(110) and NiZn<sub>3</sub>(001) exhibit copper-like electronic structure in the density of states (DOS) calculations. Moreover, the top of the 3d states of NiZn<sub>3</sub>(001) is almost the same to Cu(100). These results suggest that the formation of the alloy with Zn efficiently bring the apparent depression of the 3d states of Ni near  $E_F$ , which makes the DOS of NiZn alloys similar to that of Cu.

The d-band position is closely related to the binding strength between intermediates and catalysts. In detail, the electronic interaction between the adsorbate and the 3d states lead to the formation of bonding and antibonding states [29, 54]. The lower position (relative to the



**Fig. 1** (a) The top view of structure model on NiZn(110), NiZn<sub>3</sub>(001) and Cu(100). (b) Calculated valence electronic DOSs at Cu(100), NiZn<sub>3</sub>(001), NiZn(110), Ni(100) and Zn(001). The dotted line (-1.5 eV) was a guideline for comparing the positions of the d-band tops.

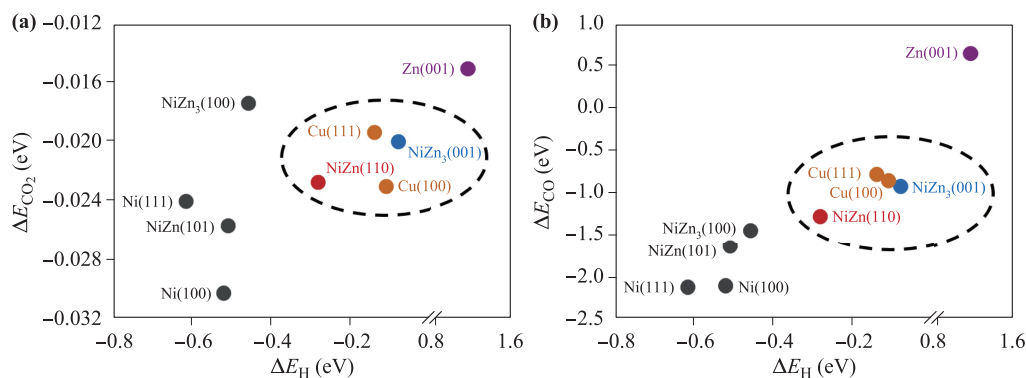
Fermi level) of the d-band, the weaker binding strength, due to the occupancy of anti-bonding states. Compared with Ni(100), the adjusted d-band positions of NiZn alloys indicate suitable adsorption properties of intermediates, similar to Cu(100), which is favorable to the further activation of intermediates (CO<sub>2</sub>, CO), and avoiding CO poisoning or strong hydrogen evolution reactions (HER).

### 3.2 Adsorption abilities of \*CO<sub>2</sub>, \*CO and \*H

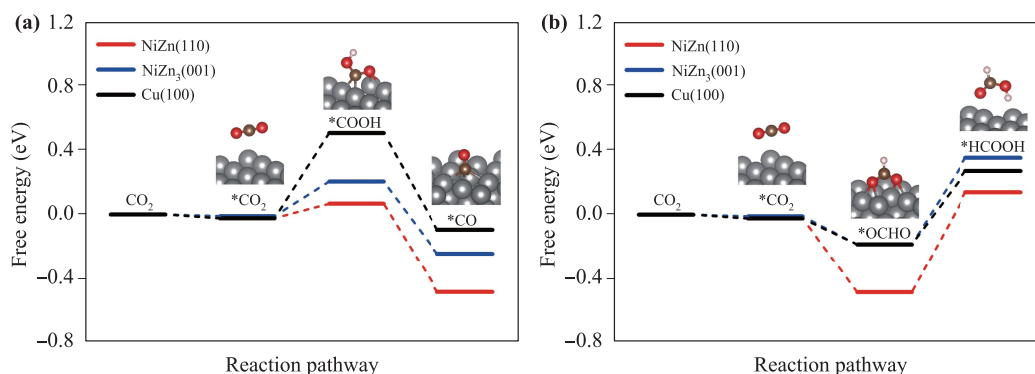
Copper-like adsorption abilities of \*CO<sub>2</sub>, \*CO and \*H are regarded as the key criterion to evaluate the potential cat-

alytic performance of pseudo-copper catalysts. The adsorption abilities of \*CO<sub>2</sub>, \*CO and \*H directly influence the CO formation [43, 44] and C-C coupling [31, 32, 55, 56], and HER [30, 33], respectively. The adsorption energies of \*CO<sub>2</sub>, \*CO and \*H on different facets are shown in Table S2.

The CO<sub>2</sub> reduction process is accompanied by the competitive HER and hydrogenation process. The relationship between the adsorption energy of \*H ( $\Delta E_H$ ) and reactants \*CO<sub>2</sub> ( $\Delta E_{CO_2}$ ) and the relationship between  $\Delta E_H$  and crucial intermediate \*CO ( $\Delta E_{CO}$ ) both are very important. As shown in Fig. 2(a), the upper right region



**Fig. 2** (a) The relationship between the adsorption energy of \*H ( $\Delta E_H$ ) and reactants \*CO<sub>2</sub> ( $\Delta E_{CO_2}$ ), and (b) the relationship between  $\Delta E_H$  and crucial intermediate \*CO ( $\Delta E_{CO}$ ).



**Fig. 3** Free energy profiles of the reaction pathway for (a) \*CO formation and (b) \*HCOOH formation on NiZn(110), NiZn<sub>3</sub>(001) and Cu(100).

indicates that both the  $\Delta E_{\text{CO}_2}$  and  $\Delta E_{\text{H}}$  are weak, not conducive to the CO<sub>2</sub> reduction reaction. The lower left region indicates that  $\Delta E_{\text{H}}$  is much stronger than  $\Delta E_{\text{CO}_2}$ , which will lead to the active site being occupied by \*H, and is not conducive to CO<sub>2</sub> activation. In the circle area, NiZn(110) and NiZn<sub>3</sub>(001) exhibit copper-like \*CO<sub>2</sub> and \*H adsorption energies. Proper  $\Delta E_{\text{CO}_2}$  and  $\Delta E_{\text{H}}$  indicate the suitable coordination of CO<sub>2</sub> adsorption and CO<sub>2</sub> hydrogenation process, which provides the possibility for the generation of intermediate CO. The adsorption abilities of \*CO and \*H are shown in Fig. 2(b). Similarly, the upper right region indicates that both the  $\Delta E_{\text{CO}}$  and  $\Delta E_{\text{H}}$  are weak, not conducive to the CO hydrogenation and C–C coupling reaction. The lower left region indicates that both  $\Delta E_{\text{CO}}$  and  $\Delta E_{\text{H}}$  are strong, which will lead to CO poisoning and severe competing HER. In the circle area, NiZn(110) and NiZn<sub>3</sub>(001) exhibit copper-like \*CO and \*H adsorption energies. Proper  $\Delta E_{\text{CO}}$  and  $\Delta E_{\text{H}}$  indicate the suitable coordination of CO hydrogenation and C–C coupling process, which provides the possibility for the generation of C<sub>2</sub> products.

The Cu-like adsorption abilities of NiZn(110) and NiZn<sub>3</sub>(001) are mainly due to the fact that Zn adjusts the surface and electronic structure of Ni. By screening and evaluation, NiZn(110) and NiZn<sub>3</sub>(001) are the potential pseudo-copper catalyst to generation C<sub>2</sub> products during CO<sub>2</sub>RR.

### 3.3 Reaction pathway of \*CO formation

CO is the key intermediate for the formation of C<sub>2</sub> products, and the first intermediate for CO formation from CO<sub>2</sub> is \*COOH [44, 46]. The reaction pathways of CO formation are analyzed on NiZn(110) and NiZn<sub>3</sub>(001) [Fig. 3(a)]. The formation energy barriers of \*CO ( $\Delta G_{*CO}$ ) on NiZn(110) and NiZn<sub>3</sub>(001) are 0.09 eV and 0.21 eV, respectively, which both are much lower than Cu(100) (0.53 eV) (Table S3). The adsorptions of \*COOH intermediate on NiZn(110) and NiZn<sub>3</sub>(001) are much stronger than on Cu(100), which is the key factor

of lower formation energy barriers of \*CO on NiZn(110) and NiZn<sub>3</sub>(001).

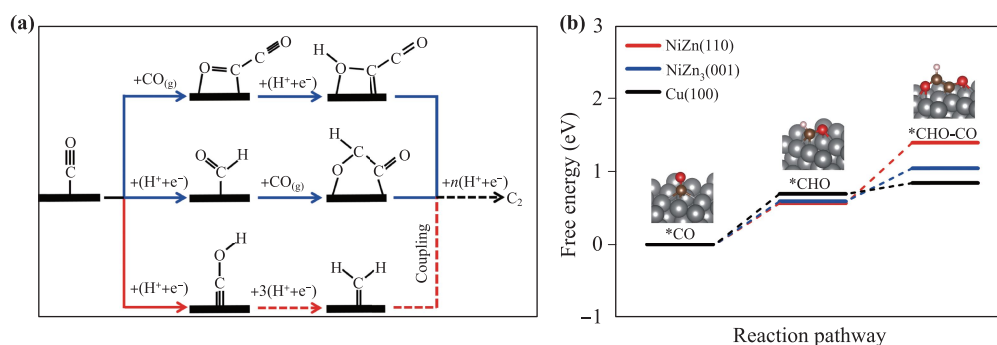
In addition, the competitive reaction of formate (\*HCOOH) formation is also considered on NiZn(110) and NiZn<sub>3</sub>(001) [Fig. 3(b)]. The formation energy barriers of formate ( $\Delta G_{*HCOOH}$ ) on NiZn(110) and NiZn<sub>3</sub>(001) are 0.62 eV and 0.53 eV (Table S4), which is higher than formation energy barriers of \*CO. This result indicates that the formation of \*CO on NiZn(110) and NiZn<sub>3</sub>(001) is easier than \*HCOOH. As for Cu(100), the formation energy barriers of formate ( $\Delta G_{*HCOOH}$ ) is 0.45 eV, which is slightly lower than  $\Delta G_{*CO}$  of 0.53 eV. It suggests that NiZn(110) and NiZn<sub>3</sub>(001) have higher selectivity to \*CO than Cu(100).

### 3.4 Reaction pathway of C–C coupling

C–C coupling is reported to be the crucial reaction for the C<sub>2</sub> formation [57]. There are three main pathways for the C–C coupling reaction [32] [Fig. 4(a)]: (i) \*CO–CO intermediate formed via \*CO coupling with CO<sub>(g)</sub>; (ii) \*CHO is formed via \*CO hydrogenation, and coupling with CO<sub>(g)</sub> to form \*CHO–CO intermediates; (iii) \*CO hydrogenation to form \*COH, then \*COH hydrogenation to form \*CH<sub>2</sub> intermediate, and the C–C bond formed via \*CH<sub>2</sub> dimerization.

The formation energy barriers of three intermediates (\*CHO, \*COH and \*CO–CO) during C–C coupling are calculated to study the C<sub>2</sub> product evolution. As shown in Table S5, both the free energy barriers of \*COH and \*CO–CO are much higher than \*CHO. Therefore, \*CHO–CO is considered as the main intermediates for C–C coupling reaction on NiZn(110), NiZn<sub>3</sub>(001), and Cu(100).

In the \*CHO–CO pathway, NiZn(110) and NiZn<sub>3</sub>(001) show similar reaction trends to Cu(100) [Fig. 4(b)]. Compared with Cu(100) and NiZn(110), NiZn<sub>3</sub>(001) has the lowest free energy barrier (0.60 eV) (Table S6) which can be attributed to the optimal Cu-like surface/electronic structure and intermediate adsorption abilities of NiZn<sub>3</sub>(001). For NiZn(110), although it has



**Fig. 4** (a) Schematic description of three main C-C coupling pathways from  $*CO$  intermediates. (b) Free energy profile of C-C coupling via  $*CHO-CO$  intermediate on NiZn(110), NiZn<sub>3</sub>(001) and Cu(100).

the lowest free energy barrier of  $*CO \rightarrow *CHO$  (0.57 eV), the energy barrier of  $*CHO \rightarrow *CHO-CO$  is higher due to the strong  $*CO$  adsorption abilities on NiZn(110), which is detrimental to the C-C bond formation.

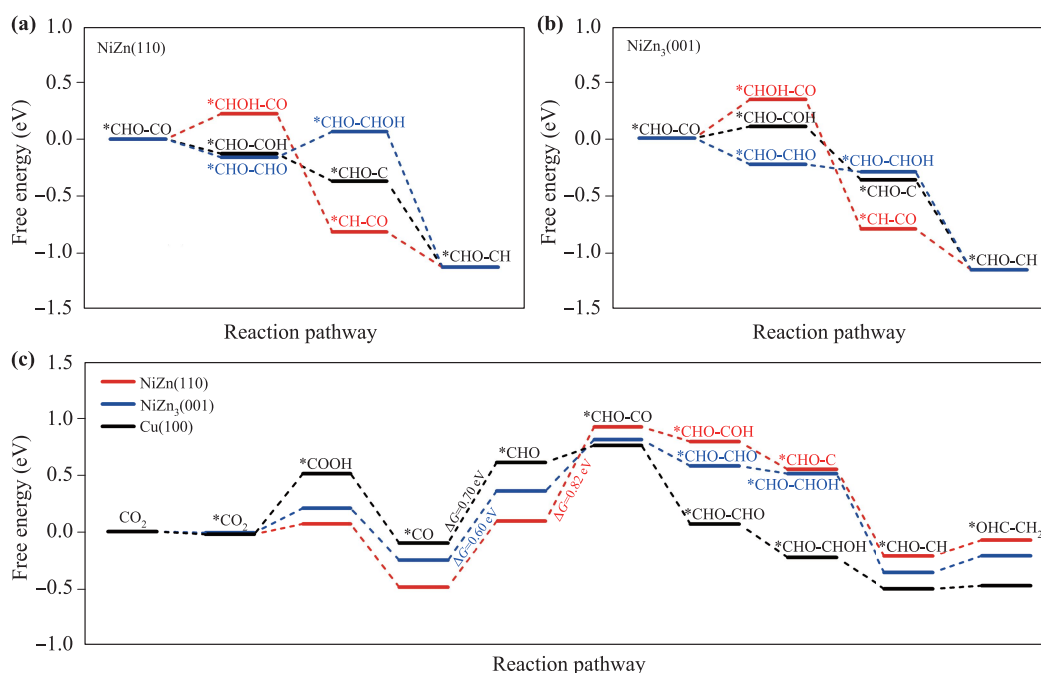
### 3.5 Reaction mechanism of $C_2$ products formation

To understand the reaction mechanism of  $C_2$  products formation on NiZn(110) and NiZn<sub>3</sub>(001), the  $C_2$  intermediates in the reaction pathway from  $*CHO-CO$  to  $*CHO-CH$  are investigated.  $*CHO-CH$  is the crucial precursor of the  $C_2$  product, and the  $*CHO-CH_2$  intermediate formed by its hydrogenation is considered to be the bifurcation of the pathway for  $C_2H_4$  and  $C_2H_5OH$  formation [32, 58].

Three possible pathways of  $*CHO-CO$  hydrogenation

on NiZn(110), NiZn<sub>3</sub>(001) and Cu(100) are considered: alternate ( $*CHO-CHO$ ) (Fig. S2 and Table S7), hybrid ( $*CHO-COH$ ) (Fig. S3 and Table S8) and distal ( $*CHOH-CO$ ) (Fig. S4 and Table S9) pathways. The lowest free energies of  $*CHO-CH$  formation on NiZn<sub>3</sub>(001) and Cu(100) both are alternate pathway [Fig. 5(b) and Fig. S5], while that on NiZn(110) is hybrid pathways [Fig. 5(a)].

The main formation mechanism of  $C_2H_4$  and  $C_2H_5OH$  are formed via the deoxygenation and hydrogenation of  $*CHO-CH_2$  intermediate, respectively. Figure 5(c) compares the free energies of the reaction pathway from  $CO_2$  to  $*CHO-CH_2$  on NiZn(110) (Fig. S6), NiZn<sub>3</sub>(001) (Fig. S7), and Cu(100) (Fig. S8). In detail, the step of  $*CO$  hydrogenation is the rate determination step (RDS) on NiZn<sub>3</sub>(001) and Cu(100), but the RDS on NiZn(110)



**Fig. 5** The three pathways of  $*CHO-CO$  hydrogenation to  $*CHO-CH$  on (a) NiZn(110), and (b) NiZn<sub>3</sub>(001). (c) The lowest free energy pathway for  $C_2$  formation from  $CO_2$  to  $*OHC-CH_2$  on NiZn(100), NiZn<sub>3</sub>(001) and Cu(100).

is the \*CHO–CO formation via \*CHO and \*CO coupling. Moreover, NiZn<sub>3</sub>(001) shows the lowest energy barrier (0.60 eV) for CO<sub>2</sub>RR to \*CHO–CH<sub>2</sub>, compare with Cu(100) (0.70 eV) and NiZn(110) (0.82 eV). This calculation result is consistent with the screening criteria. NiZn<sub>3</sub>(001) is an ideal pseudo-copper catalyst for CO<sub>2</sub> reduction to C<sub>2</sub> products.

## 4 Conclusion

In summary, we designed the Ni–Zn alloys as the promising pseudo-copper catalysts and predicated reaction mechanism for CO<sub>2</sub>RR to C<sub>2</sub>. DFT calculations revealed that NiZn and NiZn<sub>3</sub> had the two key criteria of pseudo-copper alloys: copper-like surface and electronic structure and intermediate adsorption abilities. NiZn<sub>3</sub>(001) alloy had lower free energy barrier (0.60 eV) than Cu(100) (0.70 eV) and NiZn(110) (0.82 eV) in the reaction from CO<sub>2</sub> to \*CHO–CH<sub>2</sub>, and the C–C bond was formed through the \*CHO and CO coupling. The \*CHO–CH<sub>2</sub> intermediate was preferred formed along the alternate hydrogenation pathway. Importantly, the copper-like nature of NiZn and NiZn<sub>3</sub> alloys were derived from the interaction of Ni and Zn, which tuned their lattice structure and 3d state toward Cu. Here, two critical criteria of the pseudo-copper catalyst are established to form C<sub>2</sub> products from CO<sub>2</sub>, and provides guidance to design high-efficiency catalysts for CO<sub>2</sub>RR to C<sub>2</sub> or multi-carbon products.

**Electronic supplementary material** Electronic supplementary materials are available in the online version of this article at <https://doi.org/10.1007/s11467-021-1079-4> and <http://journal.hep.com.cn/fop/EN/10.1007/s11467-021-1079-4> and are accessible for authorized users.

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