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# Exploring the mechanistic role of alloying elements in copper-based electrocatalysts for the reduction of carbon dioxide to methane

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The promise of electrochemically reducing excess anthropogenic carbon dioxide into useful chemicals and fuels has gained significant interest. Recently, indium–copper (In–Cu) alloys have been recognized as prospective catalysts for the carbon dioxide reduction reaction (CO<sub>2</sub>RR), although they chiefly yield carbon monoxide. Generating further reduced C<sub>1</sub> species such as methane remains elusive due to a limited understanding of how In–Cu alloying impacts electrocatalysis. In this work, we investigated the effect of alloying In with Cu for CO<sub>2</sub>RR to form methane through first-principles simulations. Compared with pure copper, In–Cu alloys suppress the hydrogen evolution reaction while demonstrating superior initial CO<sub>2</sub>RR selectivity. Among the alloys studied, In<sub>7</sub>Cu<sub>10</sub> exhibited the most promising catalytic potential, with a limiting potential of –0.54 V versus the reversible hydrogen electrode. Analyses of adsorbed geometries and electronic structures suggest that this decreased overpotential arises primarily from electronic perturbations around copper and indium ions and carbon–oxygen bond stability. This study outlines a rational strategy to modulate metal alloy compositions and design synergistic CO<sub>2</sub>RR catalysts possessing appreciable activity and selectivity.

## KEYWORDS

first-principles calculations, electrochemical CO<sub>2</sub> reduction reaction, alloying effect, In–Cu alloy catalyst, overpotential

## 1 Introduction

Electrochemical reduction of CO<sub>2</sub> into fuels is a promising measure to mitigate global warming and address the energy crisis (James et al., 2006; Schwartz, 2008; Handoko et al., 2018a; Bushuyev et al., 2018; De Luna et al., 2019; BhosaleRashid, 2022; Kang et al., 2023). One of the core technologies in this transformation process is the application of efficient electrocatalysts. However, existing catalysts are still unable to meet the requirements for commercial applications because of their high overpotentials and low partial current densities (Colin et al., 2012; Luo et al., 2022; Timoshenko et al., 2022). Hori et al. (1989) performed pioneering studies on the carbon dioxide reduction reaction (CO<sub>2</sub>RR), in which most of the transition metal catalysts are studied. In fact, only Cu metal is capable of

producing large amounts of hydrocarbons from CO<sub>2</sub>, but it remains inefficient and requires a large overpotential (Calle-Vallejo and Koper, 2013; Ledezma-Yanez et al., 2016; Garza et al., 2018). Inevitably, the hydrogen evolution reaction (HER) competes with the CO<sub>2</sub>RR, resulting in reduced reaction efficiency and selectivity. In particular, the HER occurs at a limiting potential of approximately  $-0.5$  V (*versus* a reversible hydrogen electrode (RHE); all potentials in this paper are *versus* RHE unless otherwise specified), but CH<sub>4</sub> only starts to form at potentials of approximately  $-0.8$  V (Hori et al., 1989; Hori, 2008). In fact, a potential of  $-1.0$  V is required for a decent current density (to CH<sub>4</sub>) of  $2$  mA cm<sup>-2</sup>. Therefore, the design of highly active catalysts remains a major challenge in this field. As the process involves complex multi-electron and proton coupling steps, tuning the catalyst selectivity is equally, if not more, challenging.

Studies have proposed that alloying Cu with other metals, such as Au, Pd, and Sn, is an effective approach to enhancing CH<sub>4</sub> selectivity at a lower overpotential (Hansen et al., 2016; Lee et al., 2018; Tran and Ulissi, 2018; Xie et al., 2018). Peterson and Nørskov (2012) predicted theoretically that \*CO (\* represents a surface adsorption species) cannot be stably adsorbed on a single metal surface and that a second metal with stronger oxygen affinity is needed to enable adsorption of both \*CO and \*CHO at suitable potentials. To this end, alloy catalysts are believed to produce CH<sub>4</sub> at high selectivity by changing the binding strength of the key intermediates, such as \*COOH, \*OCHO, \*CO, \*CHO, and \*COH (Nie et al., 2016; Nie et al., 2018). For example, Rodriguez et al. showed that Au@Cu nanoparticles with well-defined surface structures can selectively reduce CO<sub>2</sub> to CH<sub>4</sub>, but the H<sub>2</sub> formation increases with the number of Cu metal layers (Monzo et al., 2015). Gong et al. studied Pd–Cu alloy catalysts with different structures and suggested that Cu<sub>3</sub>Pd can decrease the onset potential for CH<sub>4</sub> by 200 mV and show a seven-fold increase in CH<sub>4</sub> current density at  $-1.2$  V (Zhu et al., 2018). Recently, Cui et al. found electron donation from Sn to Cu in CuSn<sub>3</sub> alloy catalysts, resulting in Sn<sup>δ+</sup> oxidation states consistent with theory, as well as significantly improved selectivity of 95% at  $-0.5$  V (Zheng et al., 2019).

Indium, as an *sp*-block metal, exhibits completely different catalytic properties compared to Cu metal. The CO<sub>2</sub>RR on In metal mainly produces large amounts of HCOOH and CO, in addition to showing strong inhibition to the HER (Bitar et al., 2016; Luo et al., 2019). However, the formation of HCOOH requires a potential of  $-1.8$  V to achieve the highest current efficiency (Hori et al., 1989). These studies indicate that the bonding strengths of In and Cu metals to intermediate species such as \*COOH and \*OCHO are different. Takanabe et al. synthesized Cu–In alloy surfaces for electrochemical reduction of CO<sub>2</sub> from mixed metal oxides of CuInO<sub>2</sub> as the starting material. The sample was found to remarkably improve the selectivity of the CO<sub>2</sub> reduction to form CO and formic acid, with a total FE of 94% for CO<sub>2</sub> conversion (Jedidi et al., 2015). Giovanni et al. found that the potential range of the electrochemical reduction of CO<sub>2</sub> at Cu–In alloy electrocatalysts of some compositions is  $-0.8$  to  $-1.1$  V vs. RHE (Hoffman et al., 2017). Andreas et al. studied that with a thin layer of metallic In deposited on the surface of the Cu nanowires, the catalyst exhibits a CO Faradaic efficiency of  $\sim 93\%$  at  $-0.7$  to  $-0.9$  V vs. RHE (Luo et al., 2018). It can be seen that In–Cu alloys have also been explored for CO<sub>2</sub>RR, and they are mostly found to produce CO as the

predominant reduction product, and the overpotential range is high (Jedidi et al., 2015; Hoffman et al., 2017; Luo et al., 2018; Barasa et al., 2019). The formation of further reduced C<sub>1</sub> products, such as CH<sub>4</sub>, remains elusive. This is because the alloying effect of In and Cu metals is not well understood, leading to difficulties in controlling the In–Cu alloy composition to fine-tune the catalyst activity and selectivity. Overall, theoretical studies of the synergistic alloying effect in In–Cu catalysts for the CO<sub>2</sub>RR are still lacking.

In the present work, the alloying effect of In with Cu metal is systematically investigated through first-principles calculations. We explore CO<sub>2</sub>RR properties over Cu and In metals and four different In–Cu alloys from the perspective of thermodynamics and kinetics. It is found that the introduction of In can improve the selectivity of the catalyst and reduce the overpotential for CO<sub>2</sub>RR. The alloying of In and Cu metals provides Cu-based catalysts superior selectivity in the initial stage of the CO<sub>2</sub>RR. For subsequent hydrogenation of \*CO, the In–Cu alloys also exhibit a lower overpotential than Cu metal. Among these four different alloys, In<sub>7</sub>Cu<sub>10</sub> possesses the least negative CO<sub>2</sub>RR limiting potential of  $-0.54$  V. At the same time, the competing HER is significantly suppressed due to weak binding with H atoms. In order to clarify such a catalytic effect, the atomic adsorption configuration, the bonding characteristics, and the electron transfer of intermediate species were systematically analyzed by Bader charge, partial density-of-state (PDOS), and charge density analysis. The results indicate that the introduction of In metal changes the stability of intermediates and the electronic structure around Cu metal, thereby improving the catalytic activity significantly.

## 2 Methods and modeling

In this work, the first-principles calculations are performed based on density functional theory (DFT) as implemented in the Vienna *Ab initio* Simulation Package (VASP) code (Kresse and Furthmüller, 1996; Hafner and Kresse, 1997; Kresse and Joubert, 1999). The projector augmented wave (PAW) pseudopotential was adopted, and the generalized gradient approximation (GGA), as parametrized by Perdew–Burke–Ernzerhof (PBE) (Perdew et al., 1993; Perdew et al., 1996; Perdew et al., 1998), was used to treat the exchange–correlation effects of electrons. All simulations use a cutoff energy of 500 eV. During structure relaxation, the maximum force convergence accuracy acting on each atom is 0.01 eV/Å, and the total energy error is not more than  $1.0 \times 10^{-4}$  eV. To eliminate the interaction of the atoms between the slabs and avoid the interference of periodic alignment, the vacuum is set as large as 15 Å. The Brillouin zone was sampled using a Monkhorst–Pack *k*-point mesh of  $5 \times 5 \times 1$  for the  $3 \times 3 \times 1$  supercell. We also included the van der Waals (vdW) corrections by applying the vdW-DF2 method to all the systems. In this work, the climbing image-nudged elastic band (CI-NEB) method (Henkelman et al., 2000; Henkelman and Jónsson, 2000) is applied to search for the transition state and calculate the activation barrier of the reaction.

The CO<sub>2</sub>RR involves a multi-proton transfer step that produces many intermediate species (Handoko et al., 2018b; Handoko et al., 2019). Here, we focused on the catalytic effect of Cu metal and four different In–Cu alloys from the phase diagram, namely, In<sub>3</sub>Cu<sub>7</sub>, In<sub>4</sub>Cu<sub>9</sub>, InCu<sub>2</sub>, and In<sub>7</sub>Cu<sub>10</sub>. We optimized the bulk structure of the four

different alloys and then cut the different crystal facets according to different Miller indices. Each slab is a five-layer structure, with the bottom three layers fixed and the others fully relaxed. We selected the close-packed facet of each alloy with enough stability and more active sites. The [111] facet of Cu metal, the [111] facet of In metal, the [2-32] facet of In<sub>3</sub>Cu<sub>7</sub>, the [01-1] facet of In<sub>4</sub>Cu<sub>9</sub>, the [100] facet of InCu<sub>2</sub>, and the [0-10] facet of In<sub>7</sub>Cu<sub>10</sub> were adopted for the modeling simulation. In order to search for the most stable adsorption configuration of intermediate species, the lowest binding energies of 16 different adsorbed species, \*COOH, \*OCHO, \*CO, \*CHO, \*COH, \*H, \*CH, \*CH<sub>2</sub>, \*CH<sub>3</sub>, \*C, \*O, \*OH, \*CH<sub>2</sub>O, \*OCH<sub>3</sub>, \*CHOH, and \*CH<sub>2</sub>OH, are calculated. Herein, the binding energies are calculated using the following equation (Chuan et al., 2014):

$$E_{\text{bind},C_xH_yO_z} = E_{\text{slab}+C_xH_yO_z} - (E_{\text{slab}} + xE_{f,C} + yE_{f,H} + zE_{f,O}),$$

where  $E_{\text{slab}+C_xH_yO_z}$  represents the electronic energy of the slab-adsorbate complex minus the electronic energy of the clean slab and the formation energies of C, H, and O. The formation energy can be obtained by linearly combining the gas-phase electron energies of CO, H<sub>2</sub>O, and H<sub>2</sub>.

In this work, we adopted the computational hydrogen electrode (CHE) model to simulate the hydrogenation process of electrochemical reduction of CO<sub>2</sub>. In the CHE model, the free energy of each adsorbate along a reaction pathway that involves coupled proton-electron transfers is calculated using the following equation (Nørskov et al., 2004):

$$\Delta G_n(U) = \Delta G_n(U = 0) + neU,$$

where  $n$  is the number of protons and electrons transferred and  $U$  is the potential versus the RHE.  $\Delta G_n(U = 0)$  is the free energy at 0 V versus the RHE. It can be calculated as the free energy of an equivalent hydrogenation step, where the chemical potential of each proton-electron pair can be replaced by the chemical potential of H<sub>2</sub> at 1 bar because protons and electrons are in equilibrium with H<sub>2</sub> at 1 bar at 0 V. To calculate this, zero-point energy and entropic corrections through vibrational frequencies are also simulated, which can be achieved by the harmonic approximation.

### 3 Results and discussion

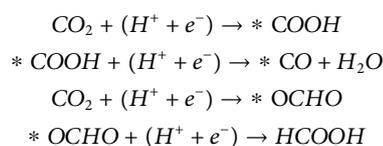
In order to clarify the effect of In-Cu alloy structure on CH<sub>4</sub> synthesis, we investigated the inhibition of the competitive HER, adsorption configuration, and electronic structure of key intermediates, as well as the energy profiles associated with CO<sub>2</sub> hydrogenation on Cu metal, In metal, and four different In-Cu alloys. Since the initial hydrogenation of CO<sub>2</sub> determines whether it can be reduced to hydrocarbons, we study this stage from the perspective of thermodynamics and kinetics. Finally, the effect of alloying on the limiting potential for hydrogenation of CO<sub>2</sub> to CH<sub>4</sub> is analyzed.

#### 3.1 Effect of In-Cu alloy structure on the initial hydrogenation of CO<sub>2</sub>

Before investigating the CO<sub>2</sub>RR catalytic activity, the adsorption capacities for H atoms on these six different catalysts are considered

in order to investigate the HER activity. The free energy for the HER was also calculated and is plotted in [Supplementary Figure S9](#). The limiting potentials for HER on In-Cu alloys range from -0.71 V to -0.63 V, much more negative than that on Cu metal (-0.38 V). In metal shows the strongest inhibition effect on HER, on which the \*H adsorption needs to overcome an energy of 0.81 eV. Thus, the In-Cu alloys are predicted to be less active than Cu metal for the HER, clearly indicating that the competitive HER can be efficiently suppressed on alloy surfaces.

Continuously, we investigated the effect of In-Cu alloy structure on the initial hydrogenation of CO<sub>2</sub> to \*COOH and \*OCHO intermediates. The energy profiles associated with these elementary steps are plotted in [Figure 1](#). The Gibbs free energy diagrams for CO<sub>2</sub>-to-\*CO and CO<sub>2</sub>-to-HCOOH can be calculated using the following reaction steps:



Here, the asterisk (\*) represents a surface adsorption species or an empty adsorption site. As shown in [Figure 2A](#), \*COOH is found to be the key reaction intermediate for CO<sub>2</sub>-to-\*CO. Moreover, the required reaction energy for this step on Cu metal (0.56 eV) is larger than that on In-Cu alloys. Particularly, In<sub>7</sub>Cu<sub>10</sub> requires the lowest reaction energy of only 0.39 eV. For In metal, although the reaction energy for CO<sub>2</sub>-to-\*COOH is smaller than that for Cu metal (0.49 eV), the further hydrogenation of \*CO to \*CHO or \*COH becomes difficult to occur because of the much higher reaction energy of 1.6 eV. Therefore, catalyzing CO<sub>2</sub> to hydrocarbons using In metal is rather difficult (Jitaru et al., 1997).

As a competitive reaction, the reaction of CO<sub>2</sub>-to-\*OCHO is also studied. In the pursuit of unraveling the intricate behavior of catalytic systems, a noteworthy discovery has been made with regard to the stable bidentate \*OCHO configuration. This configuration arises from a fascinating interplay between the C atom and the H atom, resulting in the bonding of two O atoms to the surface of the catalyst (as illustrated in [Figure 1](#)). To further probe the energetic landscape of this catalytic phenomenon, the Gibbs free energy associated with the conversion of CO<sub>2</sub> to HCOOH has been meticulously calculated (as demonstrated in [Figure 2C](#)). A compelling observation emerges, revealing that the reaction energy for CO<sub>2</sub>-to-\*OCHO on In metal and its distinct amalgamations with Cu is negative. Intriguingly, on the sole Cu metal substrate, this energy is measured to be a modest 0.1 eV. Such discerning disparities in energy profiles underscore the thermodynamic favorability of \*OCHO formation on the aforementioned alloys. Drawing parallels to the adsorption of \*COOH, it becomes apparent that the stability of the \*OCHO adsorption configuration escalates in tandem with the proportion of In atom content within the alloy. This observation highlights the synergistic effects between In and Cu atoms in promoting enhanced stability within the catalytic system. [Figure 2B](#) shows the different trends of limiting potential for \*CO and HCOOH on these five different catalysts, indicating that the introduction of In metal can result in stronger selectivity at the initial hydrogenation stage of CO<sub>2</sub>.

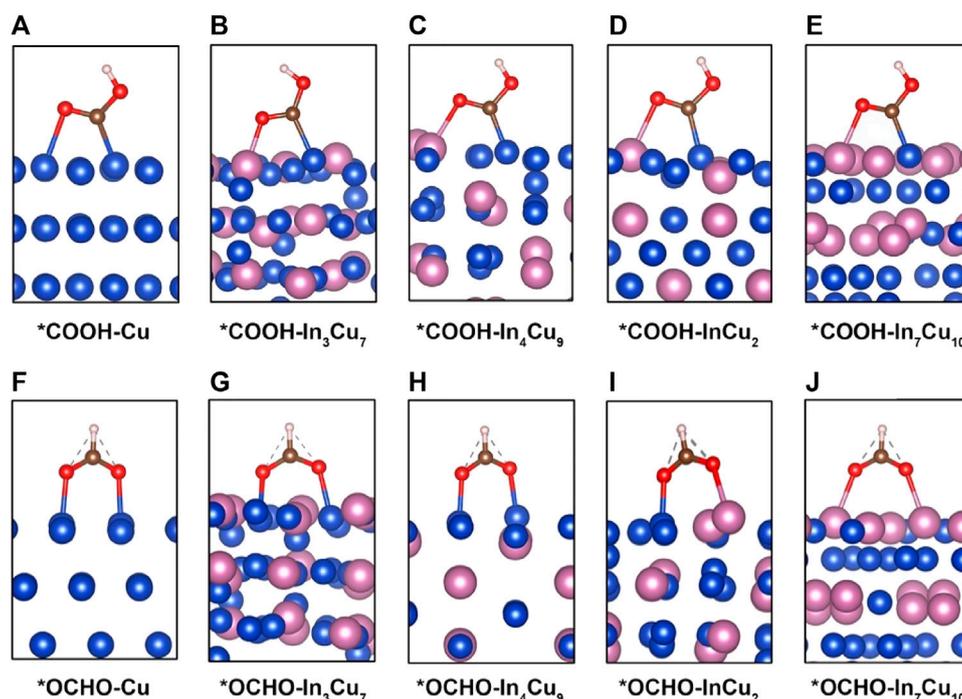


FIGURE 1

Adsorption configuration of intermediate  $^*\text{COOH}$  on (A) Cu metal, (B)  $\text{In}_3\text{Cu}_7$ , (C)  $\text{In}_4\text{Cu}_9$ , (D)  $\text{InCu}_2$ , and (E)  $\text{In}_7\text{Cu}_{10}$ . Adsorption configuration of intermediate  $^*\text{OCHO}$  on (F) Cu metal, (G)  $\text{In}_3\text{Cu}_7$ , (H)  $\text{In}_4\text{Cu}_9$ , (I)  $\text{InCu}_2$ , and (J)  $\text{In}_7\text{Cu}_{10}$ .

It can be rationally predicted that the distinct  $\text{CO}_2\text{RR}$  activity on In–Cu alloys can be attributed to the introduction of In metal. In order to explicate this phenomenon, the adsorption configurations of  $^*\text{COOH}$  and  $^*\text{OCHO}$  species on the surfaces of five distinct catalysts (Cu,  $\text{In}_3\text{Cu}_7$ ,  $\text{In}_4\text{Cu}_9$ ,  $\text{InCu}_2$ , and  $\text{In}_7\text{Cu}_{10}$ ) are visually depicted in Figure 1. Within the context of Cu metal, both the C atom and the O atom in the  $^*\text{COOH}$  moiety exhibit an affinity toward bonding with the Cu atom. Conversely, upon considering the In–Cu alloy catalysts, the O atom evinces a proclivity to establish a bond with the In atom, while the C atom persists in exhibiting an inclination to bond with the Cu atom. This amalgamation of bonding modalities engenders a hybridized bonding mode, thereby conferring enhanced stability upon the adsorption of the  $^*\text{COOH}$  species. This increased stability can be further explicated and corroborated through the employment of partial density-of-state (PDOS) analysis, as denoted in Supplementary Figure S1. On Cu metal, the energy level of bonding between the O atoms in the  $^*\text{COOH}$  and the Cu atoms on the surface is  $-7.5$  eV, while the bonding between the O and In atoms on all of the In–Cu alloys shifts to a lower energy level. For  $\text{In}_3\text{Cu}_7$ ,  $\text{In}_4\text{Cu}_9$ ,  $\text{InCu}_2$ , and  $\text{In}_7\text{Cu}_{10}$ , the typical bonding peaks correspond to the energies of  $-7.7$  eV,  $-8.4$  eV,  $-8.0$  eV, and  $-8.4$  eV, respectively. It is worth noting that the introduction of In metal cannot destroy the bonding between C and Cu atoms. Thus, this mixed bonding mode induced by In–Cu alloys is beneficial to the stability of  $^*\text{COOH}$ . A similar effect also exists on the surface adsorption of the  $^*\text{OCHO}$  intermediate. As shown in Supplementary Figure S1, both O atoms in  $^*\text{OCHO}$  forms a bond with Cu atoms on the surfaces of Cu,  $\text{In}_3\text{Cu}_7$ , and  $\text{In}_4\text{Cu}_9$  catalysts but forms a bond with

In atoms on the  $\text{In}_7\text{Cu}_{10}$  catalyst. It can also be seen from the PDOS profiles (Figure 2D) that the energy level of higher hybridization between the O atom and Cu atom is  $-7.2$  eV, while the energy level of hybridization between the O atom and In atom on the  $\text{In}_7\text{Cu}_{10}$  surface shifts to  $-8$  eV. The lower level indicates that the formation of the O–In bond is more favorable for  $^*\text{OCHO}$  on the In–Cu alloy catalysts.

The Gibbs free energy changes ( $\Delta G$ ) are closely related to the charge transfer of key ions. In order to prove it, we calculated the charge density difference of the  $^*\text{COOH}$  and  $^*\text{OCHO}$  atomic layers for Cu metal and four different In–Cu alloy catalysts (Figure 3). Meanwhile, the Bader charges on the key O and C ions in various intermediates have also been quantitatively calculated. We calculated the Bader charges in the initial state  $^*\text{CO}_2$  ( $e_{\text{ini}}$ ) and final state  $^*\text{COOH}/^*\text{OCHO}$  ( $e_{\text{fin}}$ ) and focused on the difference between them ( $\Delta e = e_{\text{fin}} - e_{\text{ini}}$ ). The  $\Delta e$  values for both  $\text{CO}_2$ -to- $^*\text{COOH}$  and  $\text{CO}_2$ -to- $^*\text{OCHO}$  reaction steps are summarized in Table 1. For  $^*\text{OCHO}$ , the charge change in the O ions is considered to be closely related to  $\Delta G$ . As shown in Table 1, the O ion on Cu metal can only capture approximately 0.15 e from the Cu ion. Based on the results of the PDOS analysis of bonded Cu atoms at the surface and bulk Cu atoms, we found that their electronic structures show different distributions. The peaks of the  $p_x$  and  $p_y$  orbitals of Cu metal are significantly reduced around the Fermi level after  $\text{CO}_2$  adsorption, while the peaks of the  $p_z$  orbital shift to a high energy level (Supplementary Figure S3). At the same time, it can also be clearly observed from Figure 3A that a large amount of charge is transferred from the  $p_z$  to  $p_x$  orbit inside the Cu ion, which clearly indicates that the on-site orbit transfer dominates when the

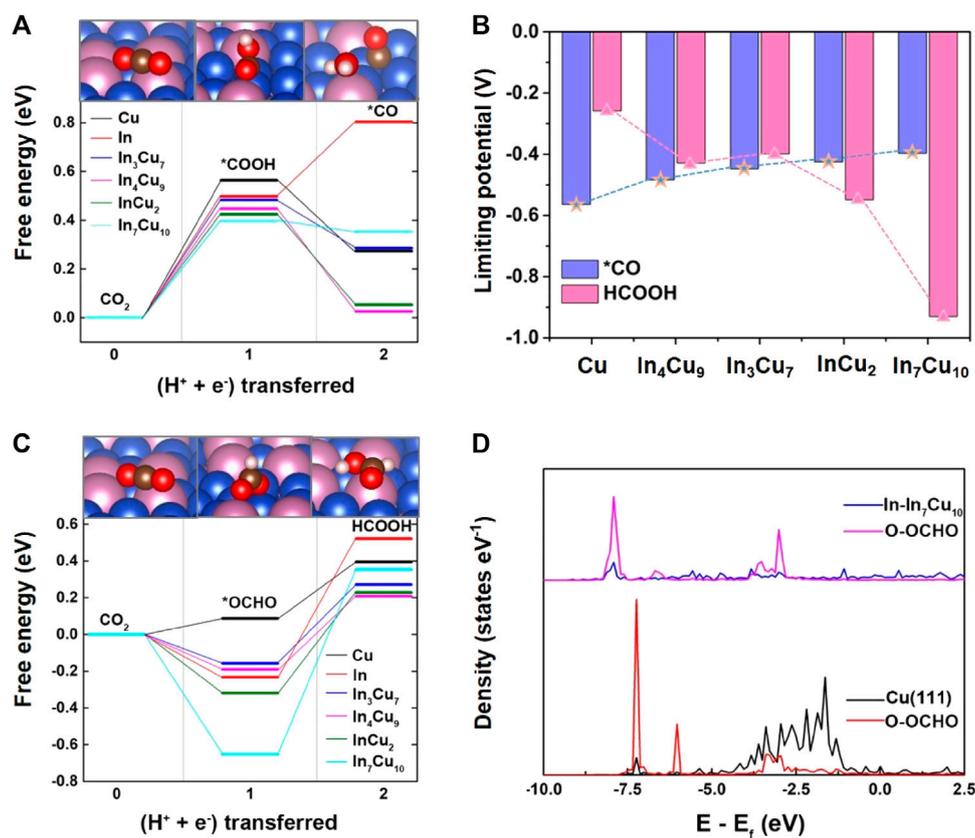


FIGURE 2

(A) Free energy diagrams for the lowest energy pathways to \*CO for Cu metal, In metal, In<sub>3</sub>Cu<sub>7</sub>, In<sub>4</sub>Cu<sub>9</sub>, InCu<sub>2</sub>, and In<sub>7</sub>Cu<sub>10</sub>. (B) Limiting potential required for CO<sub>2</sub>-to-\*CO and CO<sub>2</sub>-to-HCOOH on Cu metal, In<sub>3</sub>Cu<sub>7</sub>, In<sub>4</sub>Cu<sub>9</sub>, InCu<sub>2</sub>, and In<sub>7</sub>Cu<sub>10</sub>. (C) Free energy diagrams for the lowest energy pathways to HCOOH for Cu metal, In metal, In<sub>3</sub>Cu<sub>7</sub>, In<sub>4</sub>Cu<sub>9</sub>, InCu<sub>2</sub>, and In<sub>7</sub>Cu<sub>10</sub>. (D) Density of states of the intermediate \*OCHO adsorbed on the Cu and In<sub>7</sub>Cu<sub>10</sub> slabs.

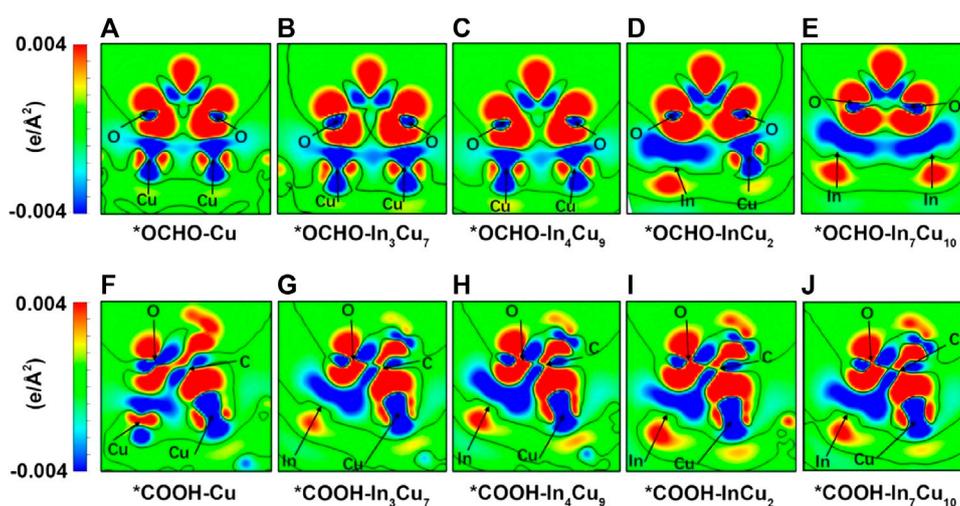


FIGURE 3

Charge density difference (the difference between the charge spatial distribution before and after species adsorption. The isosurface level is set to 1.49911 e-nm<sup>-3</sup>) for \*OCHO on (A) Cu metal, (B) In<sub>3</sub>Cu<sub>7</sub>, (C) In<sub>4</sub>Cu<sub>9</sub>, (D) InCu<sub>2</sub>, and (E) In<sub>7</sub>Cu<sub>10</sub>. Charge density difference for \*COOH on (F) Cu metal, (G) In<sub>3</sub>Cu<sub>7</sub>, (H) In<sub>4</sub>Cu<sub>9</sub>, (I) InCu<sub>2</sub>, (J) In<sub>7</sub>Cu<sub>10</sub>.

**TABLE 1** Bader charges of C/O ion and Cu/In ion in different slabs.  $\Delta e = e_{ini} - e_{fin}$  (where  $e_{ini}$  represents the charge of initial configuration and  $e_{fin}$  represents the final configuration).

System	$\Delta G$		$\Delta e$		$\Delta e$
Cu-OCHO	0.08	O	0.08	Cu	-0.15
		O	0.07	Cu	-0.14
In <sub>3</sub> Cu <sub>7</sub> -OCHO	-0.15	O	0.12	Cu	-0.18
		O	0.10	Cu	-0.16
In <sub>4</sub> Cu <sub>9</sub> -OCHO	-0.19	O	0.13	Cu	-0.17
		O	0.12	Cu	-0.17
InCu <sub>2</sub> -OCHO	-0.31	O	0.12	Cu	-0.26
		O	0.19	In	-0.28
In <sub>7</sub> Cu <sub>10</sub> -OCHO	-0.65	O	0.17	In	-0.27
		O	0.16	In	-0.26
Cu-COOH	0.56	C	0.77	Cu	-0.14
		O	0.09	Cu	-0.11
In <sub>3</sub> Cu <sub>7</sub> -COOH	0.48	C	0.82	Cu	-0.14
		O	0.15	In	-0.25
In <sub>4</sub> Cu <sub>9</sub> -COOH	0.44	C	0.87	Cu	-0.16
		O	0.17	In	-0.25
InCu <sub>2</sub> -COOH	0.42	C	0.89	Cu	-0.16
		O	0.16	In	-0.26
In <sub>7</sub> Cu <sub>10</sub> -COOH	0.39	C	0.89	Cu	-0.21
		O	0.17	In	-0.26

intermediate interacts with Cu metal. For In<sub>3</sub>Cu<sub>7</sub> and In<sub>4</sub>Cu<sub>9</sub>, the electrons around Cu ions are still undergoing an orbital transfer (Figure 3B; c), but the Bader charge indicates that more electrons transfer to the O ion from the Cu ion. This proves that the introduction of In ions can inhibit the on-site electron orbital transfer on the Cu ion and promote electron migration to the O ion. For both InCu<sub>2</sub> and In<sub>7</sub>Cu<sub>10</sub> catalysts, the In ion gradually replaced the Cu ion to bond with \*OCHO, inducing an increasing amount of charge around O ions (average 0.18 e). For the \*COOH configuration, charge transfer follows a similar trend to \*OCHO, and the introduction of In ions can also make the Cu ion lose more electrons. As the content of the In ion increases, the C and O ions in \*COOH receive more charge, which is consistent with the trend of the  $\Delta G$  for CO<sub>2</sub>-to-\*OCHO (more and more negative). Therefore, it can be clearly seen that the In ion can not only enhance the binding strength of the CO<sub>2</sub>RR intermediate but also regulate the charge distribution around the Cu ions.

The kinetic properties of In-Cu alloys also play a decisive role in the efficiency of the CO<sub>2</sub>RR. Here, we adopt the CI-NEB scheme to compute the activation barrier of the initial key step: CO<sub>2</sub>-to-\*COOH and CO<sub>2</sub>-to-\*OCHO on Cu metal and four different In-Cu alloys, while the energy evolution profiles are shown in Figure 4. For Cu metal, the barriers for \*COOH is 0.1 eV lower than that for \*OCHO. Such a negligible advantage on the barrier

cannot play a key role in the inhibition of HCOOH formation, which can be viewed as an important reason for its poor selectivity (Xie et al., 2016). This advantage has been expanded on In<sub>3</sub>Cu<sub>7</sub> and In<sub>4</sub>Cu<sub>9</sub>. For In<sub>3</sub>Cu<sub>7</sub>, the barrier for \*COOH is 0.3 eV lower than that for \*OCHO, while for In<sub>4</sub>Cu<sub>9</sub>, the difference was also increased to 0.28 eV. However, such a reaction trend has been changed on InCu<sub>2</sub> and In<sub>7</sub>Cu<sub>10</sub>. For InCu<sub>2</sub>, the barrier for \*OCHO is 0.31 eV lower than that for \*COOH. In addition, for In<sub>7</sub>Cu<sub>10</sub>, this difference is further expanded to 0.45 eV. Considering both aspects of thermodynamics and kinetics, we can clearly see that these four In-Cu alloys exhibit different selectivities for CO<sub>2</sub>-to-\*CO and CO<sub>2</sub>-to-HCOOH. For In<sub>3</sub>Cu<sub>7</sub> and In<sub>4</sub>Cu<sub>9</sub>, their thermodynamic-based pathway is consistent with the kinetic-based pathway, indicating that the alloying effect is more conducive to further hydrogenation of \*CO. However, for InCu<sub>2</sub> and In<sub>7</sub>Cu<sub>10</sub>, their kinetic-based pathways exhibit an opposite tendency to the thermodynamic-based pathways. According to the Eyring equation ( $k = \frac{k_B T}{h} K_c^\ddagger, K_c^\ddagger = A L e^{-\frac{E_0}{RT}}$ ) (Eyring, 1935), the hydrogenation reaction follows a thermodynamically favorable path (CO<sub>2</sub>-to-\*CO) at a lower temperature. However, as the reaction temperature increases, the kinetically favorable path (CO<sub>2</sub>-to-HCOOH) takes a significant advantage. Despite this, the formation of HCOOH becomes still difficult on InCu<sub>2</sub> and In<sub>7</sub>Cu<sub>10</sub> due to the high overpotential requirements. Therefore, at mild reaction temperatures and lower negative reaction potentials, In-Cu alloys can exhibit better selectivity than Cu metal for CO<sub>2</sub>-to-\*CO/CO<sub>2</sub>-to-HCOOH, which indicates that the In-Cu alloy is more promising to reduce CO<sub>2</sub> to hydrocarbons.

### 3.2 Limiting potential for CO<sub>2</sub> hydrogenation to CH<sub>4</sub> over In-Cu alloys

In order to investigate the limiting potential for CO<sub>2</sub> hydrogenation to CH<sub>4</sub> over In-Cu alloys, we calculated the complete Gibbs free energy phase diagram. Combining thermodynamics and kinetics, the optimal paths to CH<sub>4</sub> on Cu metal and four different In-Cu alloys are determined (Figure 5, Supplementary Figures S4–S8). We define the pathways as pathway A: CO<sub>2</sub> → \*COOH → \*CO → \*CHO → \*CH<sub>2</sub>O → \*CH<sub>3</sub>O → CH<sub>4</sub> + \*O → \*OH → H<sub>2</sub>O and pathway B: CO<sub>2</sub> → \*COOH → \*CO → \*CHO → \*CHOH → \*CH → \*CH<sub>2</sub> → \*CH<sub>3</sub> → CH<sub>4</sub>. Since \*CH<sub>2</sub>O and \*CH<sub>3</sub>O are not stable on the InCu<sub>2</sub> catalyst, the optimal path for InCu<sub>2</sub> is pathway A while that for the other three different In-Cu alloys is pathway B. We focus on the hydrogenation of \*CO to \*CHO, as it is a key step for further hydrogenation. As shown in Supplementary Figure S4, the reaction energy for this step on Cu metal is 0.87 eV, which means a relatively large limiting potential for the subsequent hydrogenation. The results (Supplementary Figures S5–S8) show that the reaction energies for In<sub>3</sub>Cu<sub>7</sub>, In<sub>4</sub>Cu<sub>9</sub>, InCu<sub>2</sub>, and In<sub>7</sub>Cu<sub>10</sub> are 0.69 eV, 0.71 eV, 0.65 eV, and 0.54 eV, respectively. In particular, the limiting potential is smaller than 0.6 V on In<sub>7</sub>Cu<sub>10</sub>. The calculation results show that the In-Cu alloys have the potential to exhibit better catalytic performance for the CO<sub>2</sub>RR than Cu metal.

In order to analyze the mechanism of the reduced reaction energy for the key step, we performed Bader charge and bonding analysis on \*CO and \*CHO configurations. It can be reasonably predicted that only In atoms near the molecule can participate in the

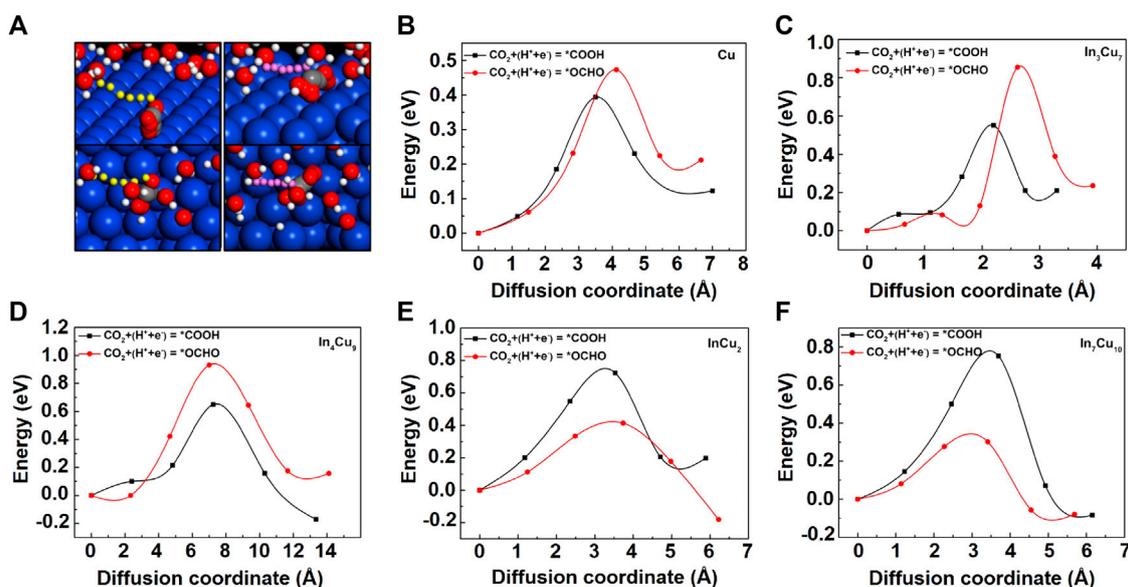


FIGURE 4

(A) The graph on the left shows CO<sub>2</sub>-to-\*COOH on Cu metal, and the graph on the right shows CO<sub>2</sub>-to-\*OCHO on Cu metal. The reaction pathways on the In-Cu alloys are the same as those on Cu metal. The six positions of the transferred proton (yellow on the left and pink on the right), the H atoms (white in H<sub>2</sub>O molecules), O atoms (red), and C atoms (gray), starting with the initial state and ending at the final state, are shown. The transition energy barrier for the CO<sub>2</sub>-to-\*COOH and CO<sub>2</sub>-to-\*OCHO reactions of (B) Cu metal, (C) In<sub>3</sub>Cu<sub>7</sub>, (D) In<sub>4</sub>Cu<sub>9</sub>, (E) InCu<sub>2</sub>, and (F) In<sub>7</sub>Cu<sub>10</sub>.

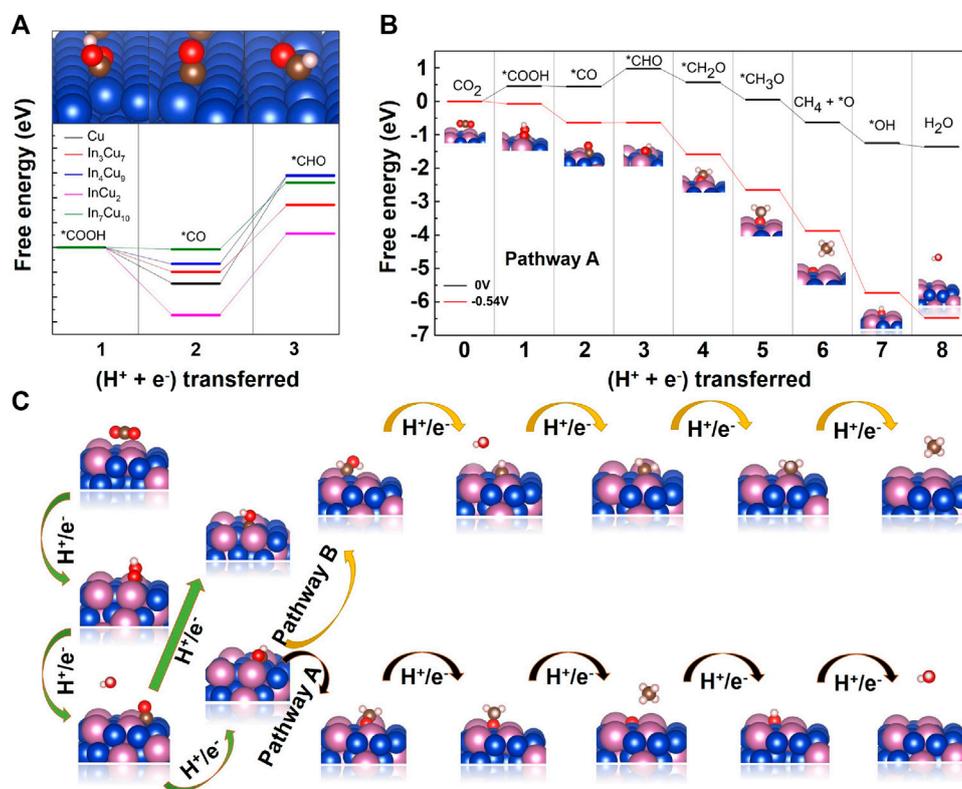


FIGURE 5

(A) Free energy diagrams for the lowest energy pathways to \*CHO on Cu metal, In<sub>3</sub>Cu<sub>7</sub>, In<sub>4</sub>Cu<sub>9</sub>, InCu<sub>2</sub>, and In<sub>7</sub>Cu<sub>10</sub>. (B) Free energy diagrams for the lowest energy pathways to CH<sub>4</sub> on In<sub>7</sub>Cu<sub>10</sub>. The pathway in black (higher) represents the free energy at 0 V vs. RHE, and the pathway in red (lower) represents the free energy at the indicated potential. (C) Two different pathways for hydrogenation of CO<sub>2</sub> to CH<sub>4</sub>.

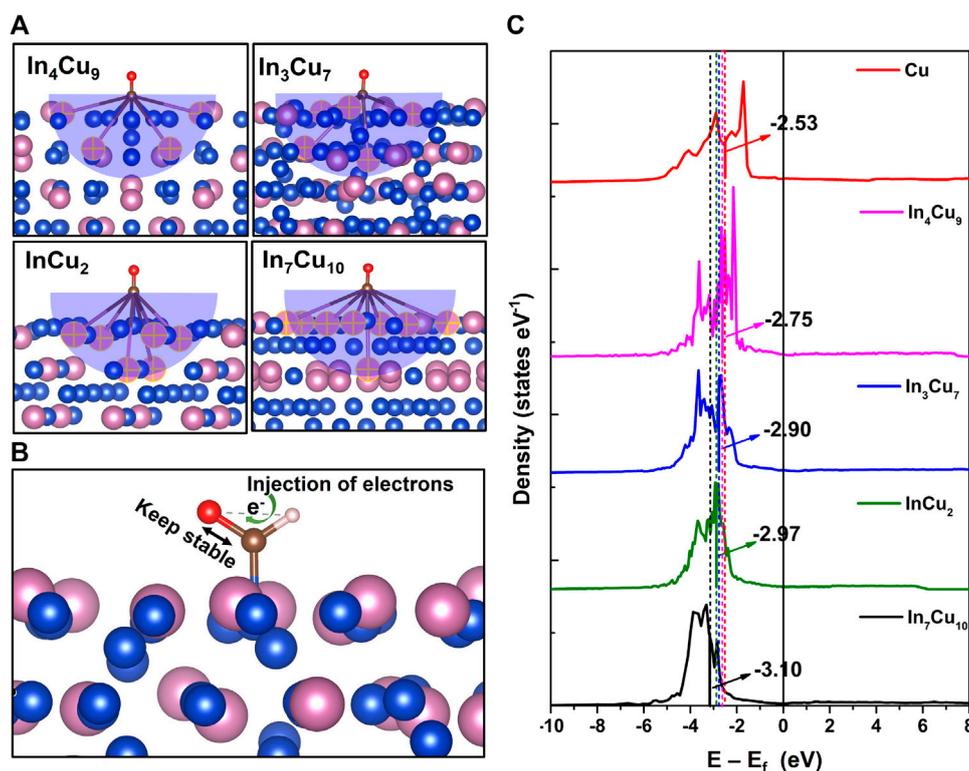


FIGURE 6

(A) Number of effective In atoms involved in the reaction determined by the Bader charge (marked by the yellow cross). (B) Schematic diagram of the H atom injecting electrons into C-O bonds to maintain C-O bond stability. (C) d-band center for the Cu atom in Cu metal, In<sub>4</sub>Cu<sub>9</sub>, In<sub>3</sub>Cu<sub>7</sub>, InCu<sub>2</sub>, and In<sub>7</sub>Cu<sub>10</sub>.

reaction of \*CO to \*CHO, so we first studied the effective interaction distance. We calculated the Bader charge of all ions in the slab before and after \*CO adsorption on Cu metal, In<sub>3</sub>Cu<sub>7</sub>, In<sub>4</sub>Cu<sub>9</sub>, InCu<sub>2</sub>, and In<sub>7</sub>Cu<sub>10</sub>. Then, the effective radius of 5.5 Å can be determined around the adsorption site, where the charge change on In ions is greater than 0.1 e. The absolute value of the charge change is negligible out of this range. As shown in Figure 6A, the numbers of effective In ions in In<sub>3</sub>Cu<sub>7</sub>, In<sub>4</sub>Cu<sub>9</sub>, InCu<sub>2</sub>, and In<sub>7</sub>Cu<sub>10</sub> are 5, 4, 6, and 8, respectively. At the same time, we counted the amount of charge on C-O pairs in \*CO and \*CHO and found that it remained almost the same during the process of \*CO-to-\*CHO. However, the Bader charge of H ions undergoes significant changes. For Cu metal, In<sub>3</sub>Cu<sub>7</sub>, In<sub>4</sub>Cu<sub>9</sub>, InCu<sub>2</sub>, and In<sub>7</sub>Cu<sub>10</sub>, the charge on H ions is 0.81 e, 0.90 e, 0.92 e, 0.95 e, and 0.97 e, respectively. Therefore, we predict that the C-O bond needs to be stable to ensure that it cannot be broken during further hydrogenation (\*CO → \*CHO → \*CH<sub>2</sub>O or \*CO → \*CHO → \*CHOH). The added H ions are responsible for injecting electrons into the C-O bond to maintain its stability, which is related to ΔG of the H adsorption process (Figure 6B). Furthermore, we extracted Cu atoms in the effective interaction range to calculate their d-band center, as shown in Figure 6C. It can be found that as the number of effective In atoms increases, the d-band center gradually shifts away from the Fermi energy level, indicating that the introduction of In metal not only regulates the charge transfer around Cu ions but also affects their d-band center. As a result, the dissociation effect from the *d* orbit electron to the C-O bond is weakened.

Based on the calculation results of the d-band center, we reasonably predict that the C-O bonds on all of the alloy catalysts are more stable than those on Cu metal. In order to confirm this, we further calculated the crystal orbital Hamilton population (COHP) (Deringer et al., 2011; Maintz et al., 2013; Maintz et al., 2016) for the C-O bond on Cu metal and four different In-Cu alloys, as shown in Figure 7A. When \*CO is adsorbed on Cu metal, the anti-bonding level of the C-O bond will be partially filled, but on In-Cu alloys, such an anti-bond occupation effect becomes insignificant. It is worth noting that the bonding levels of the C-O bond gradually shift to lower energy regions in the order of Cu, In<sub>4</sub>Cu<sub>9</sub>, In<sub>3</sub>Cu<sub>7</sub>, InCu<sub>2</sub>, and In<sub>7</sub>Cu<sub>10</sub>, which is consistent with the trend of potential. Occupied anti-bond states and higher bonding states indicate that the C-O bond is more unstable on Cu metal than on In-Cu alloys. For comparison, we calculated the COHP for freestanding CO molecules in these five different catalysts, as shown in Figure 7C. The results confirm that the anti-bond state is occupied after the freestanding CO molecule is adsorbed on the catalyst surface. In order to characterize the destruction of the C-O bond by the catalyst surface, we calculated the bond state integration of the C-O bond before and after freestanding CO molecule adsorption and focused on the integration difference between them (Figure 7B). It can be seen that the destruction effect caused by the catalyst is also decreasing in the order of Cu, In<sub>4</sub>Cu<sub>9</sub>, In<sub>3</sub>Cu<sub>7</sub>, InCu<sub>2</sub>, and In<sub>7</sub>Cu<sub>10</sub>. Particularly for the In<sub>7</sub>Cu<sub>10</sub> catalyst, the bonding state of C-O after CO molecule adsorption is almost the same as in the

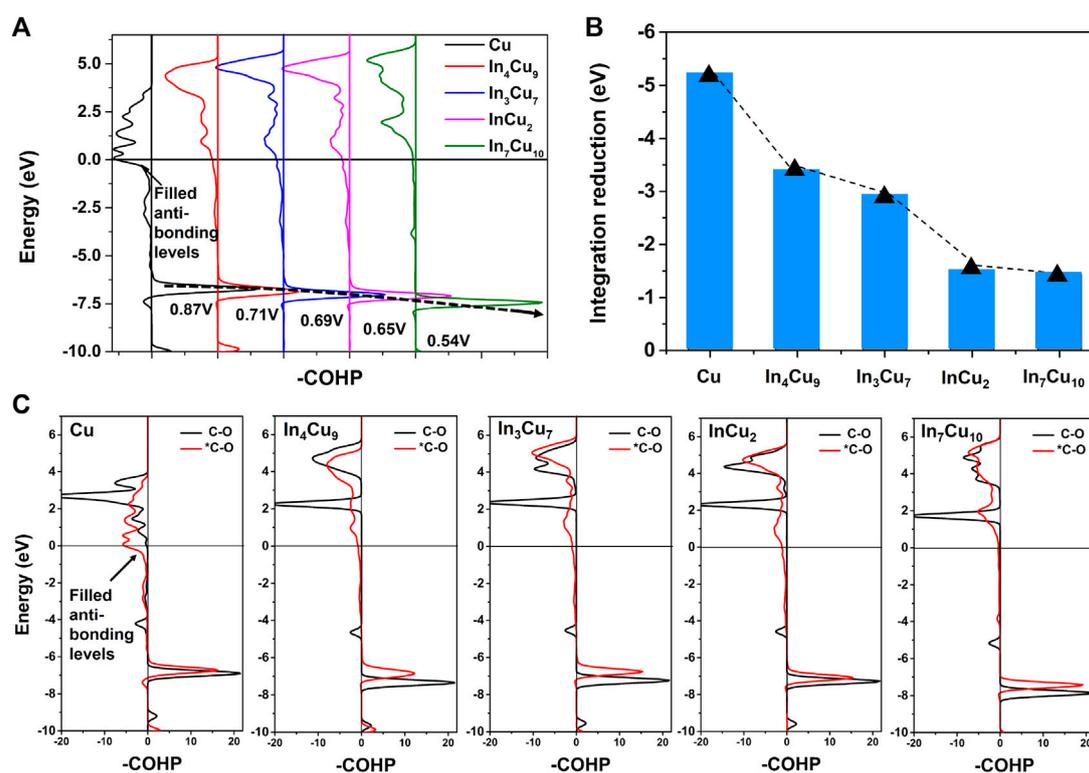


FIGURE 7

(A) -COHP for C-O bonds in \*CO on Cu metal, In<sub>4</sub>Cu<sub>9</sub>, In<sub>3</sub>Cu<sub>7</sub>, InCu<sub>2</sub>, and In<sub>7</sub>Cu<sub>10</sub>. (B) Reduction of C-O bond integration after freestanding CO is adsorbed on five different catalyst surfaces. (C) -COHP for C-O bonds in CO and \*CO on Cu metal, In<sub>4</sub>Cu<sub>9</sub>, In<sub>3</sub>Cu<sub>7</sub>, InCu<sub>2</sub>, and In<sub>7</sub>Cu<sub>10</sub>.

freestanding case. Therefore, we confirmed that the introduction of In metal will regulate the electronic structure around Cu metal, resulting in changeable stability of the surface intermediates and finally affecting the reaction energy of further hydrogenation.

## 4 Conclusion

In summary, we studied the catalytic properties of In-Cu alloys for the CO<sub>2</sub>RR and found that In-Cu alloys possess better selectivity for the initial stage of CO<sub>2</sub>RR and require less negative potential for CO<sub>2</sub>RR to form CH<sub>4</sub>. The In<sub>7</sub>Cu<sub>10</sub> catalyst is found to be the most promising catalyst, with a limiting potential of -0.54 V. By deeply investigating the mechanism at the atomic level, it is found that In metal improves the selectivity by affecting the stability of the adsorption configuration. In addition, In metal can adjust the electron transfer between the intermediate species and Cu metal, thereby affecting the reaction energy. The introduction of In metal shifts the Cu d-band center to a more negative energy level, which can change the stability of \*CO and facilitate further hydrogenation. As a result, compared with Cu metal, the In-Cu alloys can lead to completely different catalytic activity for CO<sub>2</sub>RR and effectively lower the overpotential required for CO<sub>2</sub>RR. Our study demonstrates the promise of In-Cu alloys in CO<sub>2</sub>RR and, at the same time, provides new insights into designing other synergistic metal alloy catalysts with high activity and selectivity.

## Data availability statement

The original contributions presented in the study are included in the article/Supplementary Material; further inquiries can be directed to the corresponding authors.

## Author contributions

MH: Investigation of literature papers and writing the original draft. BD: suggestion and providing data. GL: Plot the figures of article and supplement the simulation. JL: language polishing and modification. SL: making of a proposal and sharing information. SW: investigation of literature papers, editing, and data curation. JQ: writing—review and editing. All authors contributed to the article and approved the submitted version.

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## Conflict of interest

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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## Supplementary material

The Supplementary Material for this article can be found online at: <https://www.frontiersin.org/articles/10.3389/fchem.2023.1235552/full#supplementary-material>

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