



Theoretical study of single transition metal atom catalysts supported on two-dimensional Nb₂NO₂ for efficient electrochemical CO₂ reduction to CH₄

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ABSTRACT

The design of highly efficient catalysts for electrochemical reduction CO₂ (ECR) to value-add chemicals and fuels is important for CO₂ conversion technologies. In this work, earth abundant transition metal (TM = V, Cr, Mn, Fe, Co and Ni) atoms embedded into two-dimensional (2D) Nb₂NO₂ (TM@Nb₂NO₂) as single-atom catalysts (SACs) for ECR was investigated by first-principles study. We demonstrated that Nb₂NO₂ can be an excellent substrate for anchoring single TM atom due to its excellent stability and electronic conductivity. Besides, V, Cr and Ni@Nb₂NO₂ could effectively promote CO₂ adsorption and reduction. All TM@Nb₂NO₂ exhibit high selectivity towards CH₄, and V, Cr and Ni@Nb₂NO₂ show low limiting potentials. The activity origin was revealed by analysing adsorption energy, *d* band centre, bonding/antibonding population and the change of valence state of TM atoms.

1. Introduction

With the rapid development of the global economy, energy crisis and environment issues have become increasingly prominent. Carbon dioxide (CO₂) is a primary greenhouse gas, while it could also be a valuable carbon source. In recent years, electrochemical CO₂ reduction reaction (ECR) has received considerable attention among various CO₂ conversion technologies due to numerous advantages [1,2]. For instance, ECR can be driven under ambient temperature and pressure using renewable energy source such as wind and solar power [3,4]. The external voltages as well as electrolytes solutions can be adjusted for the generation of specific products. Furthermore, ECR technology could not only mitigate CO₂ emission, but also effectively convert CO₂ to value-added chemicals and fuels, which has been regarded as an appealing technology path for closing the carbon circle [5–7]. Nevertheless, physicochemical properties of the CO₂ molecule make electrochemical conversion of CO₂ challenging [8,9]. In the past decades, metals or related oxides, carbon-based materials and nanocomposites have been widely investigated as electrocatalysts for ECR. Despite that great progress has been made to exploit electrocatalysts for ECR, the process is still impeded by the sluggish kinetics, poor product selectivity, catalyst stability, and high overpotential [10–13]. Taking copper as an example, it can

electrochemically convert CO₂ to CH₄ with a high overpotential around 0.9 V, but the selectivity to specific products is low [14,15]. Therefore, it is highly desirable to develop electrocatalysts with high activity and selectivity for ECR.

It has been well established that the catalytic activity can be improved by reducing the size of catalysts. Specifically, single atoms catalysts (SACs) with single atom as active centre have aroused huge interest due to maximum atom utilization and excellent performance in various catalytic reactions such as water splitting, CO₂ reduction, N₂ reduction, etc. [16–20]. It is worth noting that the preparation of SACs is a challenge because single atoms with high surface energy are easy to aggregate into clusters, leading to catalyst deactivation. Thus, a suitable support which could offer anchoring sites and possesses good stability will greatly improve the activity of SACs. Two-dimensional (2D) materials are appealing substrates for anchoring single transition metal atom due to their unique structures and electronic properties [21–23]. Moreover, it has been disclosed that the interaction between *p*-orbital of substrates and *d*-orbitals of single transition metal atom are beneficial for highly effective electrocatalysts [24,25]. For example, single transition metal atoms embedded into graphene, graphitic carbon nitride (g-C₃N₄), graphyne, boron nitride (BN), phthalocyanine (PC), etc. have been widely studied as promising SACs for CO₂ reduction [26–29].

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Recently, a family of 2D transition metal carbides, nitrides and carbonitrides, known as MXenes, were reported and synthesized from the layered $M_{n+1}AX_n$ phase [30]. In $M_{n+1}AX_n$, M stands for early transition metals, A denotes the group 13 or 14 elements, X denotes C or N, and n is between 1 and 3 [31]. There are a variety of MXenes that have been predicted and synthesized experimentally, which are explored for applications in many fields [32]. For instance, Li et al. reported that MXenes from the group IV to VI series are active for CO₂ capture, while Cr₃C₂ and Mo₃C₂ are promising catalysts for CO₂ conversion to CH₄ [33]. Both simulation study and experimental work have shown that MXenes have large surface areas, excellent electronic conductivity, tunable surface composition and great stability [32,34]. Thanks to these merits, MXenes have also been demonstrated to be promising substrates for anchoring single transition metal atoms in catalytic reactions [35]. Generally, $M_{n+1}N_n$ is more difficult to synthesize compared to $M_{n+1}C_n$. Interestingly, it has been demonstrated that nitride MXenes exhibit better conductivity in comparison with carbide MXenes [36]. During synthesis, the basal plane of MXenes could be functionalized by various atoms or groups including O, OH and F, which affect their inherent properties [30]. Recent investigations have demonstrated that under high temperature treatment the F group can be eliminated and OH group can be converted to O groups [37,38]. Studies have confirmed that these different functional groups could tune the work function and electronic properties of MXenes [39].

Nb-based MXenes have gained great attention in energy storage and conversion [40,41]. Pt-doped Nb-based MXene has been reported to be an excellent bifunctional OER/ORR catalyst [42], while nitride Nb₂N for ECR has not been studied. In this work, for the first time, we investigated the single transition metal atoms (V, Cr, Mn, Fe, Co, Ni) embedded O group terminated Nb₂N monolayer (Nb₂NO₂) as ECR catalysts by first-principles calculation. It is found that Nb₂NO₂ can be an ideal support for anchoring sing TM atoms because of excellent stability and

conductivity. TM@Nb₂NO₂ show excellent CO₂ adsorption capacity, which benefits CO₂ activation and reduction. Among six SACs catalysts, V, Cr and Ni@Nb₂NO₂ are identified as efficient electrocatalysts for ECR to CH₄, with smaller limiting potential of -0.45, -0.47 and -0.28 V, respectively. Meanwhile, the origin of the ECR activity was revealed by several key descriptors.

2. Computational method

All calculations were carried out by spin-polarized density functional theory (DFT) in the Vienna Ab initio Simulation Package (VASP) with projector augmented wave (PAW) [43,44]. The generalized gradient approximation (GGA) implemented Perdew-Burke-Ernzerhof (PBE) was used to calculate the exchange-correlation energy [45,46]. The empirical correction (DFT-D3) was employed to describe the van der Waals (vdW) interactions [47]. The parameter for dipole correction along z-direction are considered in our calculations. DFT+U calculations are also considered for single TM atoms. The values of U-J were set to be 2.72, 2.79, 3.06, 3.29, 3.42 and 3.4 eV for V, Cr, Mn, Fe, Co, and Ni, respectively [18]. A $3 \times 3 \times 1$ TM@Nb₂NO₂ containing 45 atoms was constructed by anchoring one TM atom in site1 (N site) and site 2 (Nb site) (Fig. 1a). The 18 Å thickness vacuum region in the z-direction was added to eliminate the spurious interactions from periodic boundary. The cutoff energy was set to 500 eV. The K-points for geometry optimization and electronic calculations were set to be $6 \times 6 \times 1$ and $10 \times 10 \times 1$, respectively. The convergence of energy and force was set to be 1.0×10^{-5} eV and 1.0×10^{-2} eV/Å, respectively. Solvent effect was included in our calculations by using implicit solvent model based on VASPsol, and the dielectric constant of water was 78.4 [48]. Moreover, to explore structure stability, the ab initio molecular dynamics (AIMD) simulation was performed in NVT ensemble and phonon spectra was calculated based on the density functional perturbation theory (DFPT)

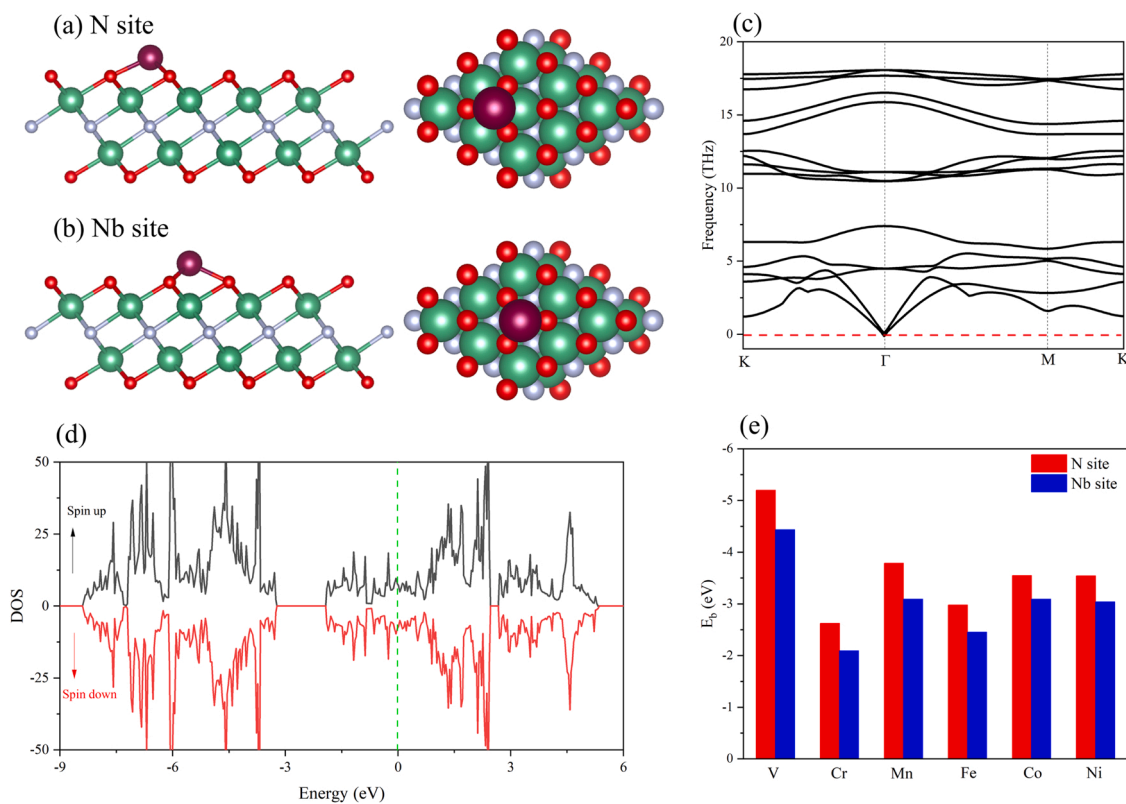


Fig. 1. The two possible adsorption sites for TM atoms (a) N site and (b) Nb site, where the whitesmoke, red, turquoise and purple ball denote the N, O, Nb and TM atoms; (c) The phonon curves of Nb₂NO₂; (d) The total density of state of Nb₂NO₂, where the green dash line is Fermi energy level; (e) The binding energies of TM atoms on N site and Nb site.

[49,50]. The TM atom transition energy barrier on Nb₂NO₂ monolayer was calculated by the climbing image nudged elastic band method (CINEB) [51], transition states were confirmed by vibration frequency analysis. The Bader charge analysis was used to analyze electron transfer [52].

The binding energy (E_b) of TM atoms on Nb₂NO₂ monolayer was calculated by Eq. 1:

$$E_b = E(\text{TM@Nb}_2\text{NO}_2) - E(\text{TM}) - E(\text{Nb}_2\text{NO}_2) \quad (1)$$

where $E(\text{TM})$, $E(\text{Nb}_2\text{NO}_2)$ and $E(\text{TM@Nb}_2\text{NO}_2)$ denote the total energies of single TM atom, Nb₂NO₂, and TM@Nb₂NO₂, respectively. With such definition, a more negative value indicates a stronger binding of TM atoms to the Nb₂NO₂ substrate.

The gas adsorption energy (E_{ads}) was calculated by Eq. 2:

$$E_{\text{ads}} = E(\text{gas@Nb}_2\text{NO}_2) - E(\text{gas}) - E(\text{Nb}_2\text{NO}_2) \quad (2)$$

where $E(\text{gas})$, $E(\text{Nb}_2\text{NO}_2)$ and $E(\text{gas@Nb}_2\text{NO}_2)$ are the total energies of gas, Nb₂NO₂ and gas adsorbed Nb₂NO₂.

The Gibbs free energy of ECR were calculated by the computational hydrogen electrode (CHE) method [53]. After intermediate was adsorbed on the surface of catalyst, the translation and rotation freedom could be ignored and only vibration freedom is contributed to the entropy. The free energy of H⁺/e⁻ pair is equivalent to the chemical potential of H₂ at standard conditions. The Gibbs free energy change (ΔG) can be obtained by Eq. 3:

$$\Delta G = \Delta E + \Delta E(\text{ZPE}) - T\Delta S + \Delta G(\text{pH}) + \Delta G(\text{U}) \quad (3)$$

in which ΔE was the energy difference between reactants and products directly obtained from DFT calculations, $\Delta E(\text{ZPE})$ and ΔS are zero-point energy correction and entropy change at temperature T of 298.15 K. $\Delta G(\text{pH})$ is the free energy correction due to the effect of H concentration, and was calculated by the formula $\Delta G(\text{pH}) = k_B T \ln 10 \times \text{pH}$. In this work, the pH value was set to be zero under acidic condition. $\Delta G(\text{U})$ is the contribution of the applied electrode potentials. The limiting potential (U_L) from potential-determining step (PDS) can be obtained by Eq. 4:

$$U_L = -\Delta G_{\text{max}}/e \quad (4)$$

where ΔG_{max} is the maximum free energy change in the ECR process along the most favourable pathway.

3. Result and discussion

3.1. Structure and stability of Nb₂NO₂

After geometry optimization, the obtained lattice parameter a of clean Nb₂N monolayer is 3.11 Å, consistent with previous study [54]. Nb₂N monolayer shows a hexagonal symmetry with P6₃/mmc space group. O was then added on the centre of three Nb atoms, similar to the O functionalized Ti₂C MXene (Fig. 1a and b) [55]. The binding energy (E_b) of O on Nb₂N monolayer was calculated by the equation: $E_b = (E(\text{Nb}_2\text{NO}_2) - E(\text{O}_2) - E(\text{Nb}_2\text{N}))/2$, where $E(\text{Nb}_2\text{NO}_2)$, $E(\text{O}_2)$, $E(\text{Nb}_2\text{N})$ are the total energy of Nb₂NO₂, O₂ and Nb₂N [56]. A negative value of $E_b = -5.34$ eV demonstrates that Nb₂N monolayer can be easily covered by O atoms. It is possible for O group transforming to OH during ECR process. Therefore, we calculated the Gibbs free energy for H adsorption on O atoms, with ΔG^*H of -0.16 eV. A moderate ΔG^*H indicates that the proton can easily adsorb on and desorb from the surficial O atom, which may promote protonation of the ECR intermediates. The phonon curves and AIMD simulation were performed to check its stability, as shown in Fig. 1c and Fig. S1. There are no imaginary bands in phonon spectra. The fluctuation of the total energy of Nb₂NO₂ is quite small and around the equilibrium. Meanwhile, the structure does not show any obvious changes, confirming that Nb₂NO₂ monolayer possesses excellent stability. On the other hand, the calculated density of state of

Nb₂NO₂ exhibits metallic behaviour, indicating good capability for electron transfer (Fig. 1d). This endows Nb₂NO₂ monolayer excellent electrical conductivity, a prerequisite for an ideal substrate for SACs used in ECR.

3.2. Structure and stability of TM@Nb₂NO₂

The stability of TM anchored Nb₂NO₂ will be the key for the synthesis and application of MXene based SACs. As presented in Fig. 1a and b, there are two possible anchoring sites for single TM atoms: (1) the centre site between three neighbouring N atoms and the top of Nb atom (Nb site), (2) the centre site between three neighbouring Nb atoms and the top of N atom (N site). After structure relaxation, the anchored TM atoms have slight effects on lattice parameters a . The thermodynamic stabilities of TM@Nb₂N were investigated by calculating E_b (Fig. 1e and Table S1). Notably, a more negative value of E_b on N site indicates that TM atoms prefer to bind on N site. Moreover, the transition energy barriers (E_T) of single TM atoms from N to Nb site were calculated to evaluate its kinetic stability. The E_T were calculated by $E_T = E_{\text{TS}} - E_{\text{IS}}$, in which E_{TS} is the total energy of transition state (TS) from N to Nb site, while E_{IS} is the total energy of TM embedded in N site. As shown in Table S1, the E_T of TM atoms are quite large in the range of 0.87–2.58 eV, implying that it is difficult for TM atoms to diffuse and aggregate into clusters. These results suggest that single TM atom can firmly anchor on N site. We therefore will only consider this site as active site for further study. In addition, Bader charge analysis show that the charge transfer from TM atoms to substrate decreases with the atomic number. Consequently, V and Cr atom present higher oxidation state (+1.08 and +1.02), while Ni atom shows lower oxidation value (+0.50).

3.3. CO₂ adsorption and activation on TM@Nb₂NO₂

CO₂ adsorption on the surface of electrocatalysts is important for CO₂ activation and transformation into intermediates such as *COOH and *OCHO [57]. The optimized CO₂ adsorption configurations on TM@Nb₂NO₂ were shown in Fig. 2. Obviously, the carbon or oxygen atom of CO₂ molecule is absorbed on TM atoms. Meanwhile, it can be observed that CO₂ molecule is not absorbed on TM@Nb₂NO₂ in linear state, but with a certain degree of bending. The corresponding adsorption energies, bond lengths of C–TM and O–TM, bond angles of CO₂ molecule, and charge transfer between TM and CO₂ molecule are summarized in Table 1. It is clear that the bond angle of CO₂ molecule on TM@Nb₂NO₂ increases with the atomic number, ranging from 138.39° to 154.34°. Specially, V@Nb₂NO₂ greatly deviated from the linear state, which indicates higher CO₂ adsorption capacity. The bond lengths of C–TM and O–TM are quite close to 2.00 Å, demonstrating strong adsorption between substrate and CO₂ molecule, consistent with previous studies [26,58]. The CO₂ adsorption energies on TM@Nb₂NO₂ range from -0.77 and -0.30 eV. The negative values indicate that CO₂ adsorption on the SACs is thermodynamically favourable. V, Cr and Ni@Nb₂NO₂ exhibit relatively strong interaction with CO₂. Bader charge analysis confirm that there is a significant net charge transfer from V, Cr and Ni atoms to CO₂, with a value of $-0.60e$, $-0.53e$, $-0.31e$, respectively. Thus, CO₂ molecules can be effectively activated by V, Cr and Ni@Nb₂NO₂, and these three SACs potentially exhibit high performance for producing specific ECR products.

3.4. Competition between HER and ECR during first protonation

The ECR process starts with the hydrogenation of CO₂ molecule to form *COOH (* + CO₂ + (H⁺ + e⁻) → *COOH) or *OCHO (* + CO₂ + (H⁺ + e⁻) → *OCHO) on active centres by H atom binding O or C atom. However, the side-reaction HER (* + H⁺ + e⁻ → *H) may occur due to the direct interaction between proton and TM atoms, resulting in low ECR selectivity. It has been widely accepted that the Gibbs free energy change (ΔG) for *COOH/*OCHO and *H formation can be used to

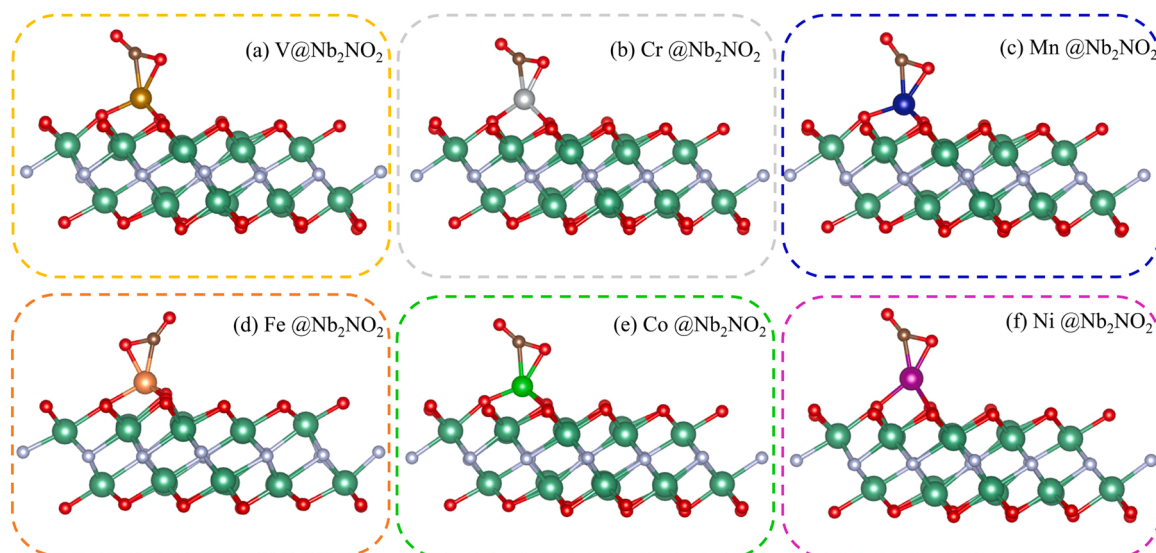


Fig. 2. The most stable CO₂ adsorption configurations on (a) V@Nb₂NO₂, (b) Cr@Nb₂NO₂, (c) Mn@Nb₂NO₂, (d) Fe@Nb₂NO₂, (e) Co@Nb₂NO₂ and (f) Ni@Nb₂NO₂.

Table 1

CO₂ adsorption on TM@Nb₂NO₂: adsorption energy (E_{ads}) with unit eV, the angle of O–C–O with unit °, the bond length of TM–O and TM–C with unit Å, net charge accepted by CO₂ molecule with unit e.

Catalysts	E_{ads} (CO ₂)	O–C–O angle	$d_{\text{TM}-\text{c}}$	$d_{\text{TM}-\text{o}}$	Q
V@Nb ₂ NO ₂	– 0.77	138.39	2.00	1.93	– 0.60
Cr@Nb ₂ NO ₂	– 0.51	142.59	2.00	1.97	– 0.53
Mn@Nb ₂ NO ₂	– 0.34	141.62	2.00	1.93	– 0.58
Fe@Nb ₂ NO ₂	– 0.46	150.77	2.04	2.00	– 0.25
Co@Nb ₂ NO ₂	– 0.30	154.34	2.05	1.99	– 0.26
Ni@Nb ₂ NO ₂	– 0.54	151.74	1.96	1.92	– 0.31

evaluate the ECR selectivity versus HER selectivity [59]. Therefore, $\Delta G_{\text{r}^{\ast}\text{COOH}/^{\ast}\text{OCHO}}$ were calculated and compared with $\Delta G_{\text{r}^{\ast}\text{H}}$. As plotted in Fig. 3, all TM@Nb₂NO₂ electrocatalysts prefer ECR (below the diagonal) to HER (above the diagonal). Notably, V, Cr and Fe@Nb₂NO₂ are ECR selective with two favourable initial protonation processes ($^{\ast}\text{COOH}$ and $^{\ast}\text{OCHO}$), while Ni, Co and Mn@Nb₂NO₂ exhibit ECR selectivity only with one favourable initial protonation step ($^{\ast}\text{COOH}$ or $^{\ast}\text{OCHO}$). Meanwhile, $\Delta G_{\text{r}^{\ast}\text{OCHO}}$ is smaller than $\Delta G_{\text{r}^{\ast}\text{COOH}}$ for V, Cr and

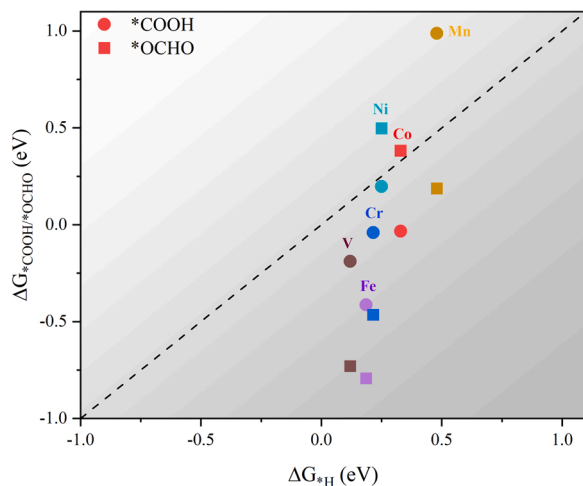


Fig. 3. The Gibbs free energy changes (ΔG (eV)) for the first protonation step in ECR and HER on TM@Nb₂NO₂.

Fe@Nb₂NO₂, demonstrating that the formation of $^{\ast}\text{OCHO}$ is more energetically favourable. Therefore, the $^{\ast}\text{COOH}$ reduction path and the corresponding CO product will not be considered on these three SACs in the further protonation process.

3.5. ECR to C1 products on TM@Nb₂NO₂

The reduction products from CO₂ could involve C₁, C₂ and C₃ due to complex protonation and C–C coupling. However, the formation of high carbon products (C₂₊) is impossible because C–C coupling will not occur on SACs. Therefore, only C₁ products by accepting 2e to 8e electrons, including CO, HCOOH, HCHO, CH₃OH, CH₄, were investigated in this work. These different products are formed by different number of protons binding C or O atoms. A possible pathway was plotted in Fig. 4 by taking the optimized configuration of intermediates on Fe@Nb₂NO₂ as an example. It is obvious that only TM atom binds with the C or O atoms during the whole ECR process, demonstrating TM atom as active site.

After $^{\ast}\text{COOH}$ or $^{\ast}\text{OCHO}$ formation via accepting first proton-electron pair, further hydrogenation by obtaining a second proton-electron pair will produce $^{\ast}\text{OCHOH}$ or $^{\ast}\text{CO}$ intermediates. Therefore, the binding strength between these two intermediates and active centre will decide HCOOH or CO generation. We calculated the E_{ads} of HCOOH and CO on TM@Nb₂NO₂ (Table 2). For HCOOH formation from $^{\ast}\text{OCHO}$, V, Cr, Mn and Fe@Nb₂NO₂ show a large E_{ads} with – 1.07, – 1.25, – 0.87 and – 1.51 eV, respectively. For CO formation from $^{\ast}\text{COOH}$, the E_{ads} of CO on Co and Ni@Nb₂NO₂ are – 1.95 and – 1.73 eV, respectively. It means that both HCOOH and CO could be further protonated on these SACs instead of desorbing from the SACs as final products. In addition, the generation of $^{\ast}\text{OCHOH}$ or $^{\ast}\text{CO}$ on Fe, Co, Cr, Ni and V@Nb₂NO₂ are overall exothermic. The generation of $^{\ast}\text{OCHOH}$ is only slightly endothermic on Mn@Nb₂NO₂, benefiting the further reduction of intermediates.

For further hydrogenation of $^{\ast}\text{OCHOH}$ or $^{\ast}\text{CO}$, three possible intermediate including $^{\ast}\text{CHO}$, $^{\ast}\text{COH}$ and $^{\ast}\text{OCH}$ could be generated. Notably, $^{\ast}\text{COH}$ from $^{\ast}\text{CO}$ ($^{\ast}\text{CO} + (\text{H}^+ + \text{e}^-) \rightarrow ^{\ast}\text{COH}$) on Co and Ni@Nb₂NO₂ underwent a larger energy uphill in comparison with the formation of $^{\ast}\text{CHO}$ ($^{\ast}\text{CO} + (\text{H}^+ + \text{e}^-) \rightarrow ^{\ast}\text{CHO}$). Similarly, For V, Cr, Mn and Fe@Nb₂NO₂, the formation of $^{\ast}\text{OCH}$ from $^{\ast}\text{OCHOH}$ ($^{\ast}\text{OCHOH} + (\text{H}^+ + \text{e}^-) \rightarrow ^{\ast}\text{OCH} + \text{H}_2\text{O}$) are more energy consuming than the production of $^{\ast}\text{CHO}$. Thus, it can be concluded that $^{\ast}\text{CHO}$ will be the key intermediate for the third hydrogenation process.

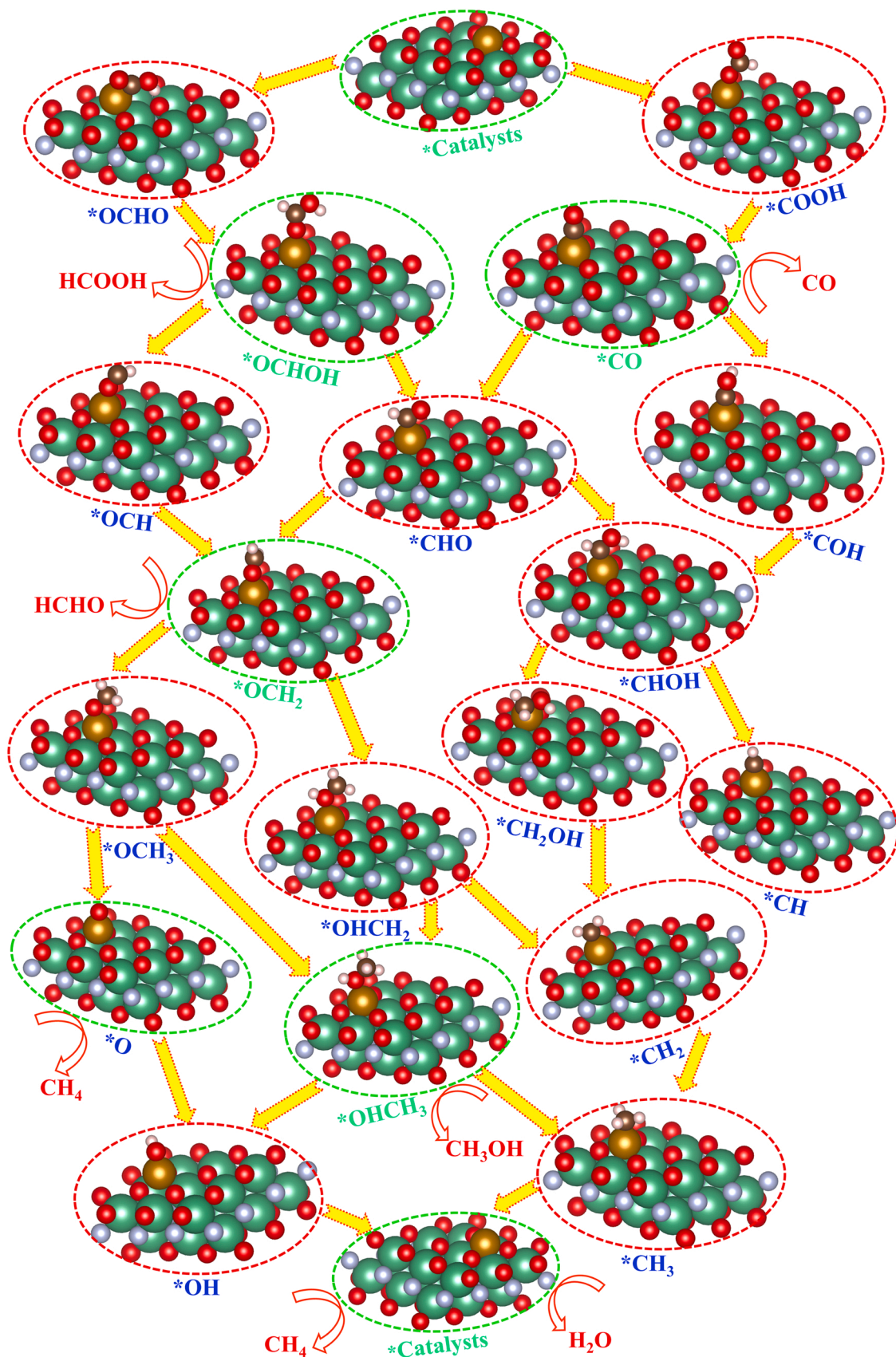


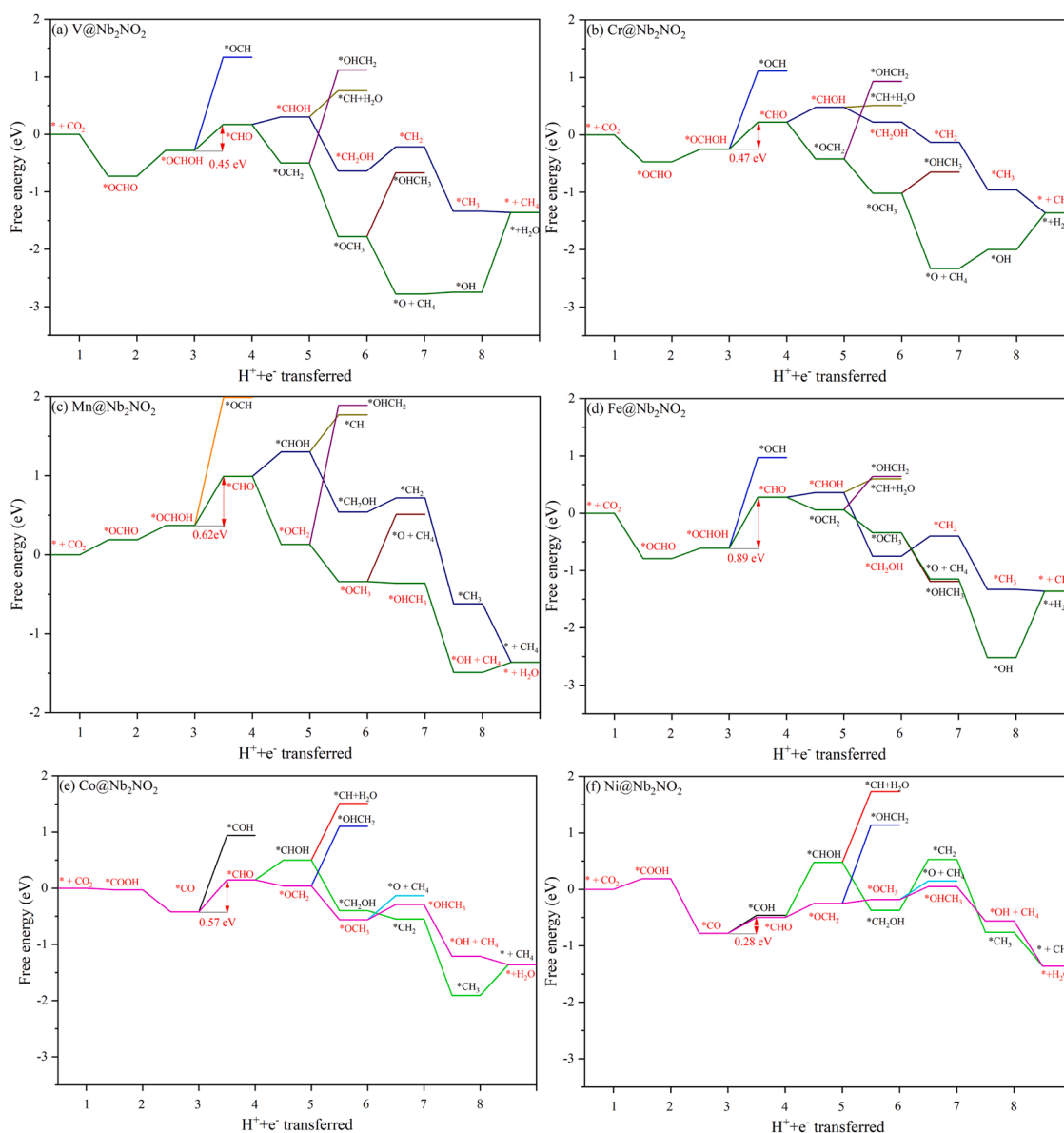
Fig. 4. The optimized configuration of intermediates adsorbed on Fe@Nb₂NO₂ during the whole ECR process from one-electron to eight-electron products.

Table 2The adsorption energy of different products CO, HCOOH, HCHO, CH₃OH and CH₄ with unit eV, and the limiting potential for generating final product CH₄ with unit V.

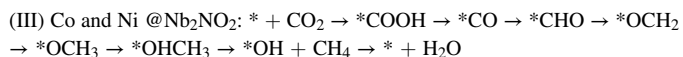
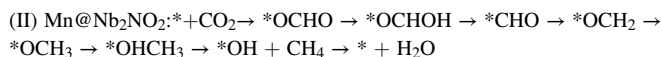
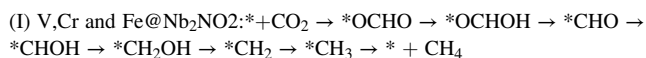
Catalysts	E _{ads} (CO)	E _{ads} (HCOOH)	E _{ads} (HCHO)	E _{ads} (CH ₃ OH)	E _{ads} (CH ₄)	U _L (CH ₄)
V@Nb ₂ NO ₂	–	– 1.07	– 1.59	– 1.15	– 0.35	– 0.45
Cr@Nb ₂ NO ₂	–	– 1.25	– 1.48	– 1.17	– 0.47	– 0.47
Mn@Nb ₂ NO ₂	–	– 1.20	– 0.96	– 0.88	– 0.23	– 0.62
Fe@Nb ₂ NO ₂	–	– 1.51	– 1.06	– 0.75	– 0.41	– 0.89
Co@Nb ₂ NO ₂	– 1.95	–	– 1.08	– 1.07	– 0.38	– 0.57
Ni@Nb ₂ NO ₂	– 1.73	–	– 1.20	– 1.03	– 0.36	– 0.28

*OCH₂ and *CHOH intermediates can be produced after *CHO accepting the fourth proton-electron pair. It is evident from Fig. 5 that the ΔG of *CHOH on these six SACs show energy uphill, while the ΔG for the formation of *OCH₂ on these SACs show energy downhill. Therefore, these TM atoms exhibit strong oxophilicity to form TM–O bonds. The four-electron product HCHO will be desorbed from the electrocatalyst if the interaction between *OCH₂ and TM atom is too weak. The calculated E_{ads} of HCHO on these SACs are in the range of – 1.59 to – 0.96 eV, suggesting that it is difficult for HCHO to desorb and thus can be further reduced.

*CHOH then accepted the fifth proton-electron pair to produce *CH and *CH₂OH intermediates, while the hydrogenation products of *OCH₂ are *OCH₃ and *OHCH₂. However, ΔG of *CH and *OHCH₂ are energetically unfavourable and will not form. In contrast, *CH₂OH and *OCH₃ will be the key intermediates and participate in later hydrogenation. CH₃OH is the six-electron product via *OCH₃ + (H⁺ + e[–]) → *OHCH₃ → * + CH₃OH. Nevertheless, the formation of *OHCH₃ only show energy downhill on Fe and Mn@Nb₂NO₂. The E_{ads} on V, Cr, Mn, Fe, Co, Ni@Nb₂NO₂ is – 1.15, – 1.17, – 0.88, – 0.75, – 1.07 and – 1.03 eV, respectively. Thus, CH₃OH can still be stably bonded with

**Fig. 5.** The Gibbs free energy diagram for ECR on TM@Nb₂NO₂ to produce the final product CH₄ under U = 0 V; the red pathway denotes the optimal pathway.

SACs and further reduced. The eight-electron product CH₄ can be generated from diverse paths such as $^*CH_3 + (H^+ + e^-) \rightarrow ^* + CH_4$, $^*OCH_3 + (H^+ + e^-) \rightarrow CH_4 + ^*O$ and $^*OHCH_3 + (H^+ + e^-) \rightarrow CH_4 + ^*OH$. Remarkably, the E_{ads} of CH₄ on TM@Nb₂NO₂ are significantly smaller than the other C₁ products, ranging from -0.47 to -0.23 eV, indicating that CH₄ can easily desorb from the SACs and become the final product. According to principle of minimum free energy increase at each step, the optimized paths for ECR to CH₄ on TM@Nb₂NO₂ were concluded as below (Fig. 5):



Thus, TM@Nb₂NO₂ can be promising candidates in electrochemically converting CO₂ to CH₄.

To evaluate the ECR performance of TM@Nb₂NO₂, the PDSs and the corresponding U_L were summarized in Table 2. Generally, the lower the

value of U_L , the higher the activity of SACs. In path I and II, $^*OCHOH \rightarrow ^*CHO$ was identified as PDS for V, Cr, Mn and Fe@Nb₂NO₂. The U_L for CH₄ generation on these four SACs are -0.45 , -0.47 , -0.62 and -0.89 V. The PDS of Co and Ni@Nb₂NO₂ in path III is $^*CO \rightarrow ^*CHO$, and the corresponding U_L are -0.57 and -0.28 V. Intriguingly, U_L for the ECR to CH₄ on V, Cr, Co and Ni@Nb₂NO₂ are lower than that the state-of-the-art catalyst Cu (211) (-0.74 V) [60], demonstrating potentially excellent performance of TM@Nb₂NO₂ for ECR to CH₄. Particularly, the U_L of Ni@Nb₂NO₂ is among the best reported in literature. Finally, we investigated the stability of Ni@Nb₂NO₂ by AIMD simulations with a time step of 3 fs at the temperature of 300 K for 18 ps (Fig. S2). It can be found that Ni atom can still stay at the vacancy, which evidenced that diffusion will not occur.

3.6. Electronic structure of intermediates adsorbed TM@Nb₂NO₂

The excellent activity of TM@Nb₂NO₂ for CH₄ generations is mainly related to the interaction between active TM atom and substrate. As shown in Table S1, the Nb₂NO₂ monolayer is negatively charged by TM atoms. The different amount of charge transfer indicates the different interaction strength. Consequently, the single TM atom with different

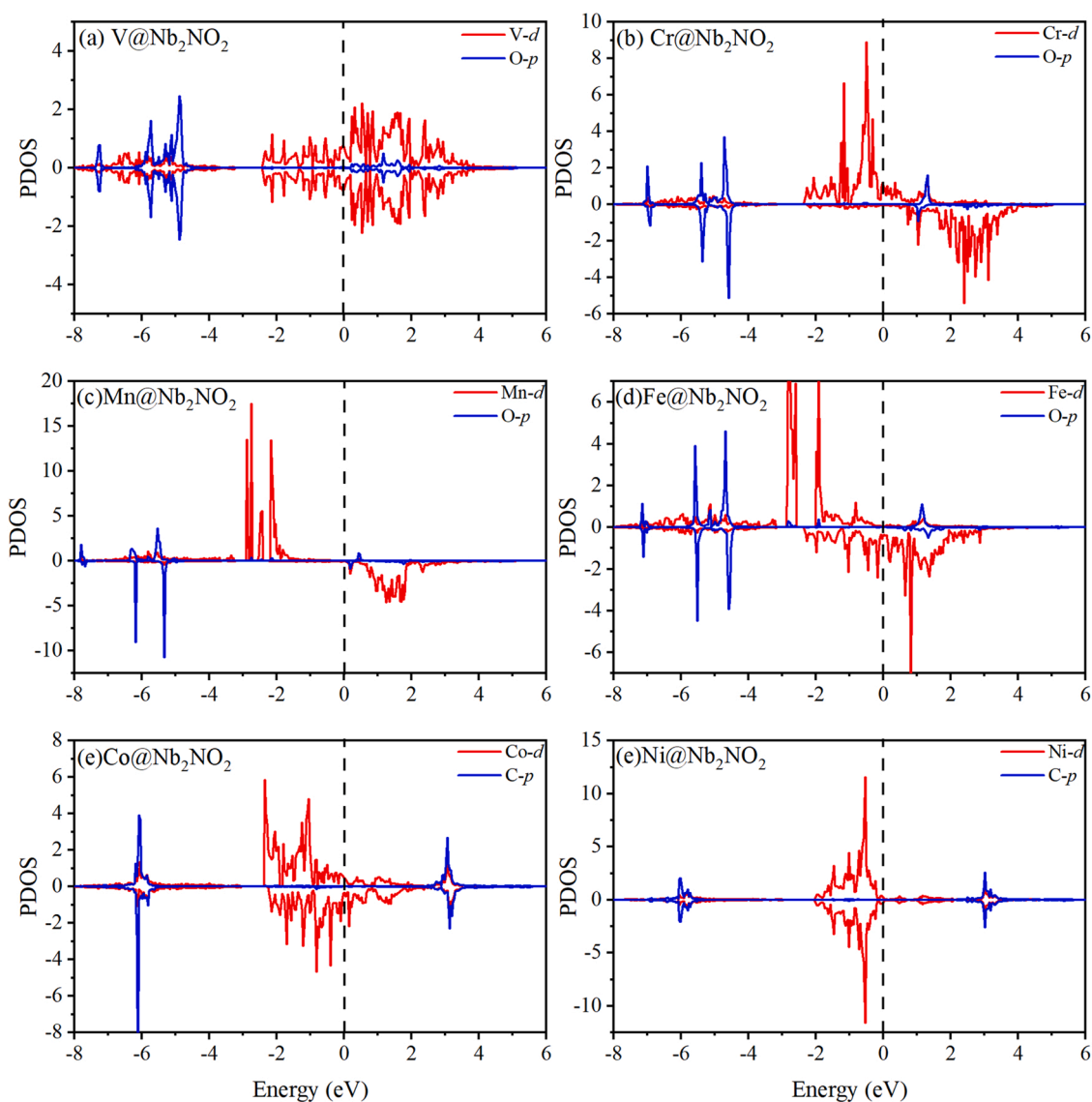


Fig. 6. The PDOS of *OCHOH adsorbed on (a) V, (b) Cr, (c) Mn and (d) Fe@Nb₂NO₂; and *CO adsorbed on (e) Co@Nb₂NO₂ and (f) Ni@Nb₂NO₂; the dashed line represents the Fermi energy level.

positive charge will contribute to different catalytic activity. After intermediate adsorption on the single TM atom, the binding strength between them will directly determine U_L . According to the Sabatier principle, too strong or too weak binding strength will result in low catalytic activity [61]. As shown in Fig. 6, the PDOS of key intermediates from PDSs of TM@Nb₂NO₂ exhibit different interaction between TM and C or O atoms. For instance, the Mn-3*d* orbitals and the O-2*p* orbitals of *OCHOH in Mn@Nb₂NO₂ have slight overlap, contributing to weak binding strength. Fe-3*d* orbitals interact greatly with O-2*p*, exhibiting strong interaction. The corresponding adsorption energy of OCHOH on these two SACs is -0.95 and -1.51 eV, suggesting that too strong or weak interaction could increase the free energy of PDSs.

3.7. Activity origin of ECR to CH₄ on TM@Nb₂NO₂

We further investigated the activity origin on TM@Nb₂NO₂ by using descriptors. The PDSs of TM@Nb₂NO₂ can be assigned to *OCHOH and *CO, therefore we distinguish them by two different areas (palegreen and slateblue in Fig. 7). Since the *d*-band centre of TM atoms has often been used to correlate the catalytic properties, the locations of *d* band centres (ϵ) were calculated and plotted against U_L , as shown in Fig. S3 and Fig. 7a. With the increase of the TM-*d* electron number, ϵ shifts to a more negative energy level, resulting in the increase of U_L . When the key intermediate is *OCHOH, there is a good linear relationship between ϵ and U_L ($U_L = 0.35\epsilon - 0.40$, $R^2 = 0.97$). For *CO as key intermediate, only Co and Ni@Nb₂NO₂ are distinguished. Generally, the more negative the value of ϵ , the weaker the adsorption between intermediates and catalysts. For example, it can be found that Mn@Nb₂NO₂ shows a lower ϵ , while the E_{ads} for *OCHOH is smaller, indicating weak adsorption and a large U_L . However, ϵ is not associated with E_{ads} for a specific TM atom in a small range, because of the neglect of the *d*-band shape and the effect of the TM-*s* and *p* orbitals. Thus, the linear relationship is not apparent (Fig. 7b). For *CO intermediate, the higher ϵ of Co atoms contributed a strong E_{ads} of *CO and high U_L .

The crystal orbital Hamilton populations (COHP) were employed to analyse the bonding and antibonding states of the TM and key intermediates *OCHOH and *CO [13]. Meanwhile, the integrated COHP (ICOHP) was calculated to give a more quantitative explanation (Fig. S4). For O atom bonding with V, Cr, Mn and Fe@Nb₂NO₂, it shows obvious antibonding states below Fermi level, demonstrating weak adsorption. The corresponding ICOHP values are -1.32, -1.44/-1.57, -1.47/-1.75, -1.28/-1.61 eV, respectively. V and Cr@Nb₂NO₂ have similar antibonding states in spin up state, resulting in similar U_L . For C atom bonding with Co and Ni@Nb₂NO₂, there is no antibonding state below Fermi level with value of -2.56/-2.66 and -2.40 eV, respectively, indicating strong adsorption. The more negative the ICOHP, the more stable of bonding, thus Fe@Nb₂NO₂ shows a large U_L . A good linear relationship between ICOHP and U_L was obtained for V, Cr, Mn and Fe@Nb₂NO₂ ($U_L = 1.58\Phi + 1.70$, $R^2 = 0.86$), disclosing the role of different metal centres in the bonding/antibonding orbital populations.

Recently, charge transfers of active atoms have been reported as descriptor to explain the performance of catalysts [62]. Herein, we calculated the valence state (δ) of TM atoms after adsorbing intermediates. The δ of different atoms for different binding atoms vary in a range from +0.55 to +1.32, indicating an increase of charge transfer from TM atoms after intermediates adsorption and different interaction strength between them. Fe atom had the largest $\Delta\delta$ increase of 0.37 after intermediates adsorption, implying a possible strong interaction between Fe and *OCHOH and a large U_L . Meanwhile, an approximate linear relationship ($U_L = -3.02\Delta\delta - 0.31$, $R^2 = 0.86$) was obtained, demonstrating that binding strength between catalysts and intermediates can be represented by $\Delta\delta$. Therefore, ϵ , Φ and $\Delta\delta$ can be used as descriptors to describe the activity origin well. Meanwhile, the E_{ads} can be a nominal descriptor for the ECR activity to CH₄ due to the close connection between energy and electronic structure, while ϵ , Φ and $\Delta\delta$ can quantitatively describe the intrinsic activity of ECR to CH₄ on TM@Nb₂NO₂. Overall, the results show that Ni@Nb₂NO₂ is the best

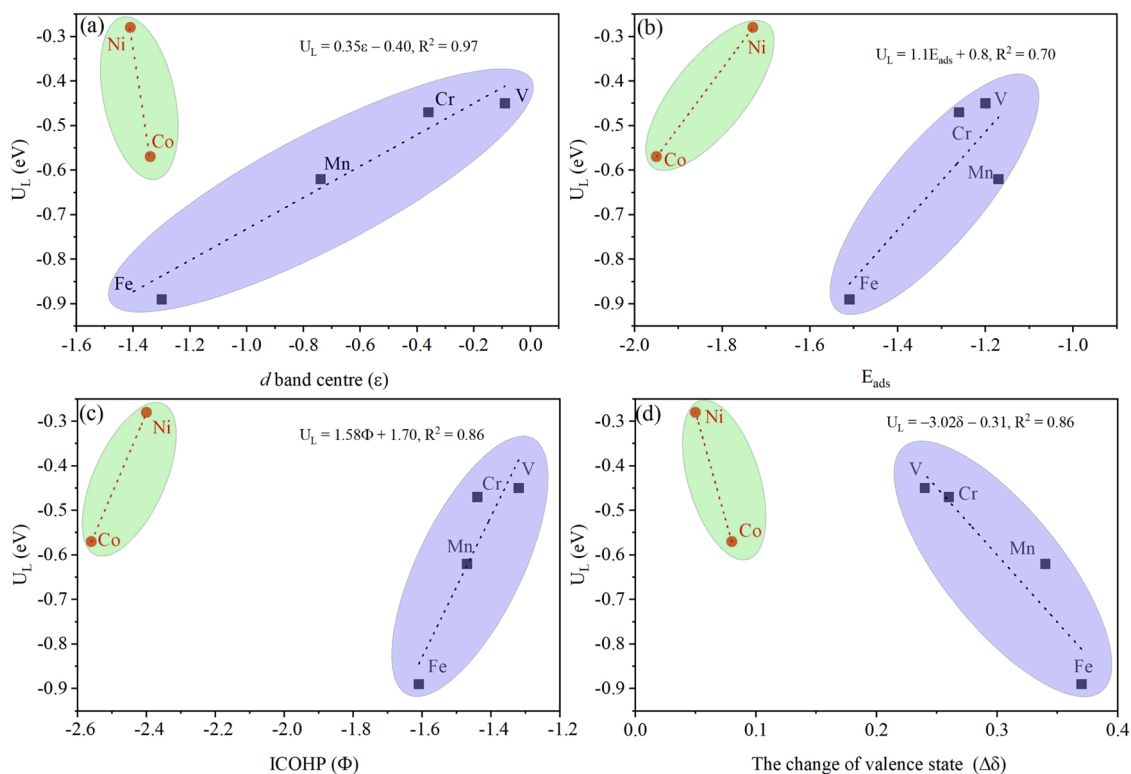


Fig. 7. The limiting potential for the generation of CH₄ on TM@Nb₂NO₂ as a function of (a) *d* band centre (ϵ), (b) adsorption energy (E_{ads}), (c) ICOHP (Φ), and (d) the change of TM atom.

ECR catalyst for CH₄ generation, while Fe@Nb₂NO₂ is not an ideal catalyst.

4. Conclusion

Single TM atoms (V, Cr, Mn, Fe, Co and Ni) anchored Nb₂NO₂ monolayer as potential SACs for electrochemical CO₂ reduction were studied by first-principles calculation. Results demonstrate that TM atoms can be stably embedded into N site and will not aggregate into clusters. CO₂ molecules can be effectively activated by V, Cr and Ni@Nb₂NO₂ due to charge transfer and large adsorption energy. All TM@Nb₂NO₂ electrocatalysts exhibit high selectivity for ECR in comparison with HER. The E_{ads} of C₁ products (CO, HCOOH, HCHO, CH₃OH) is too large for them to desorb from the surface of catalysts, while CH₄ can easily desorb due to the small E_{ads}. The PDS on these SACs for ECR to CH₄ can be divided into two categories: *OCHOH to *CHO for V, Cr, Mn and Fe, and *COOH to *CHO for Co and Ni. The U_L for CH₄ generation on V, Cr and Ni@Nb₂NO₂ SACs are -0.45, -0.47 and -0.28 V, exhibiting high performance for ECR to CH₄ and is even better than the Cu (211) electrocatalyst. Furthermore, the adsorption energy of the key intermediates (E_{ads}) can serve as a nominal descriptor to indicate ECR activity, while *d* band center (ϵ), ICOHP (Φ), the change of valence state ($\Delta\delta$) can quantitatively describe the ECR activity. This work demonstrated that MXene based earth abundant metal SACs are promising for electrocatalytic CO₂ reduction.

CRedit authorship contribution statement

Song Lu: Methodology, Formal analysis, Investigation, Writing – original draft, Writing – review & editing, Visualization. **Yang Zhang:** Investigation, Formal analysis, Writing – review & editing. **Fengliu Lou:** Investigation, Formal analysis, Writing – review & editing. **Zhixin Yu:** Conceptualization, Formal analysis, Validation, Resources, Supervision, Writing – review & editing

Declaration of Competing Interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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Appendix A. Supporting information

Supplementary data associated with this article can be found in the online version at [doi:10.1016/j.jcou.2022.102069](https://doi.org/10.1016/j.jcou.2022.102069).

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