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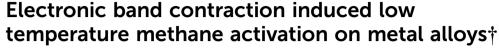


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The catalytic conversion of methane under mild conditions is an appealing approach to selectively produce value-added products from natural gas. Catalysts which can chemisorb methane can potentially overcome challenges associated with its high stability and achieve facile activation. Although transition metals can activate C-H bonds, chemisorption and low-temperature conversion remain elusive on these surfaces. The broad electronic bands of metals can only weakly interact with the methane orbitals, in contrast to specific transition metal oxide and supported metal cluster surfaces which are now recognized to form methane  $\sigma$ -complexes. Here, we report methane chemisorption can, remarkably, occur on metal surfaces via electronic band contraction and localization from metal alloying. From a broad screening including single atom and intermetallic alloys in various substrates, we find early transition metals as promising metal solutes for methane chemisorption and low-temperature activation. These findings demonstrate a combinatorial diversity of possible candidates in earth abundant metal alloys with this attractive catalytic behavior.

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# 1 Introduction

Methane is both a valuable energy source and a prime source of global warming. As a resource, vast untapped reserves of shale gas and methane hydrates remain on the planet which can be used as fuel and can be converted into value-added industrial products. 1,2 As a greenhouse gas, methane's contribution is over 25 times larger than CO2 by mass, and continues to increase in atmospheric concentration from anthropogenic sources.<sup>3,4</sup> Catalytic materials which can capture and convert methane would serve dual purposes of removing unwanted greenhouse gas and converting fossil fuels to greener products. Methane catalytic conversion is often limited by the first C-H activation, 1,5,6 which is closely determined by the methane adsorption strength on the catalyst and the energy barrier for C-H cleavage. In particular, a strong methane chemisorption can promote facile C-H activation by the electronic weakening of the C-H bonds, and by shifting the C-H cleavage transition state energy below the molecular gas phase energy in a precursor-mediated mechanism.<sup>7-9</sup> The low-temperature activation of methane has recently received intense interest for its selective conversion under mild conditions.9-12

Methane has been well established to interact only weakly with metal surfaces in the form of physisorption on the order of approximately -0.1 to -0.2 eV. $^{7,13,14}$  Instead, reports of

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strong methane interaction in the literature have been limited thus far to either metal oxide surfaces or supported metal atoms and sub-nanometer clusters. Strong methane binding on oxide surfaces was observed on PdO,15,16 and RuO2, 8,17 and IrO2. 11,18 Further theoretical studies have predicted a similar phenomenon may manifest on β-PtO2,19 single-atom doped rutile oxides20,21 and doped ceria.22 Supported metal adatoms and clusters such as Ni<sub>1</sub>/CeO<sub>2</sub> (ref. 10 and 23) and Ni<sub>4</sub>/TiC<sup>9</sup> have also been shown to exhibit similar low-temperature activation and conversion characteristics. A consistent picture of the electronic nature of the strong methane interaction in these systems can be linked to the localized, non-degenerate d-states in metal centers of oxides19-21,24 or molecule-like orbitals in metal clusters25-27 which can hybridize with the methane C-H  $\sigma$  and  $\sigma$ \* orbitals. Meanwhile, the broad, energetically degenerate d-band of metals interacts poorly with methane orbitals, while broad occupied s and p bands lead to a net repulsive interaction with methane.24,28,29 Only a few examples of weak chemisorption exist in the literature, with only Ir and Ru steps and kinks showing any appreciable interaction methane.30-32

From a glance, it is evident that metal surfaces are intrinsically unsuited for methane chemisorption and low-temperature activation compared to their oxide counterparts. Nonetheless, there exist several important reasons to revisit metal surfaces for this process. First, we hope to expand the list of known materials which can form methane complexes beyond the currently limited set of metal oxides and supported clusters from this study. There exists a high degree of structural and

compositional sensitivity to specific oxide facets and sites shown in the literature<sup>8,15,28,33</sup> such as for PdO(101) and rutile MO<sub>2</sub>(110) or specific atomic sizes of supported clusters (ca. 5-10 atoms or less) which limits a high throughput search for these materials. In contrast, metals and their corresponding alloys represent a diverse set of possible catalysts hitherto unstudied for methane chemisorption and low-temperature conversion. Metal alloys containing inert metals such as Cu could additionally prevent overoxidation of products for improved selectivity and coking resistance.34,35 Using alloys with these metals would also circumvent the tendency of metal oxides and undercoordinated metal clusters to overbind to the products of methane activation, namely, the H and CH3 moieties and their eventual overoxidation to CO2. Finally, metal alloys containing earth abundant elements have shown promise as a viable inexpensive alternative to catalysts containing precious metals such as Pt, Pd, Ir, and Rh.36-38

We propose a means to promote metal surfaces for methane chemisorption by engineering the contraction of the electronic bands of the metal surface sites from the formation of metal alloys, illustrated in Fig. 1. Previously, density functional theory calculations and X-ray photoemission and adsorption studies have observed a substantial contraction of the d-band when a metal is alloyed into an inert host metal such as Cu, Ag and Au.39-41 The weak electronic hybridization between the solute and solvent atoms leads to the formation of an "atom-like" electronic structure in the solute metals, characterized by sharp, degenerate d bands similar to those of the free metal atom. We hypothesize a contraction of electronic bands could better mix with methane orbitals in much the same way as metal oxide centers and metal cluster edge sites, as well as reduce the repulsive interaction from the broad sp-band. We also observed more localized d<sub>z</sub><sup>2</sup> states are conducive to stronger methane chemisorption in metal oxides in earlier studies.21 We believe a corresponding localization of the d-band in metals will have a similar positive effect for methane complex formation. In our current work, we focus on the intrinsic ability of the clean surface to chemisorb methane and activate C-H; for performance in catalysis the specific reaction conditions will need to be considered as well.

## 2 Results

#### 2.1 Catalyst screening on single atom alloys

We begin the study by screening methane adsorption on the model system of a single atom site alloyed in an otherwise inert and weakly bonding substrate of copper. The coinage metal, copper, along with gold and silver, are well-established to weakly interact with the solute metal. Though single atom alloys in coinage metals have been well studied for catalysis, 34,35,39,40,42-44 to our knowledge no such study has been performed in the context of methane chemisorption and complexmediated activation. We furthermore conduct the screening on four different Cu surface facets, (100), (111), (310) and (331), to model both flat terrace sites and step and kink sites. The (310) and (331) facets model steps intersecting the (100) and (111) terraces, respectively, which could serve as catalytically active sites as shown in the case of pure copper. 45,46 To focus on chemisorption, we use the PBE functional with no van der Waals correction for the initial screening, such that an adsorption energy of zero approximately corresponds to a physisorption-only interaction. The results of the screening, organized in Fig. 2, immediately reveal a wealth of possible methane chemisorbing alloys on all tested surface facets and a surprisingly large number of elements. It is evident that methane chemisorption is indeed possible, even on flat (100) and (111) metal surfaces, in apparent validation of our approach.

The methane chemisorption energies obtained on the single atom alloys are comparable to those on metal oxide surfaces and follow clear periodic trends. These energies can reach up to -0.40 eV on Zr/Cu(331), are larger than those of metals Ir(111)  $(-0.22 \text{ eV})^{30}$  and Ru(1010) (-0.10 eV),  $^{32}$  metal oxides PdO(101)  $(-0.17 \text{ eV})^{15}$  and RuO<sub>2</sub>(110) (-0.18 ev),  $^{18}$  and are similar to those of IrO<sub>2</sub>(110) of -0.37 to  $-0.41 \text{ eV}^{11,18,20}$  with the same level of theory. Of these, we find Ti, V, Zr, Nb, Mo, Ru, Hf, Ta, W, Re and Os with calculated adsorption energies larger than -0.2 eV using PBE. The strongest chemisorption appears to fall on the relatively overlooked group 4 metals Ti, Zr and Hf, and decreases nearly monotonically to group 12. Slight exceptions to the trend can be observed with strong adsorption energies

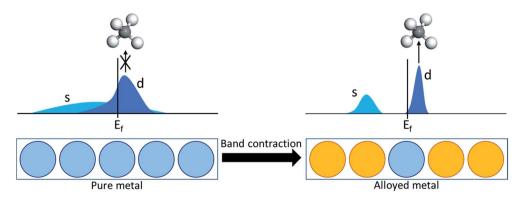


Fig. 1 Scheme of alloying on metal electronic states and adsorbate interaction. The electronic structure change of the metal site before and after alloying is illustrated here. From the broad electronic bands of the pure metal (left), there is a subsequent narrowing and shift of the bands (right) when the metal is alloyed with an inert solvent metal. These narrowed bands, especially the d-band, would result in stronger methane interaction.

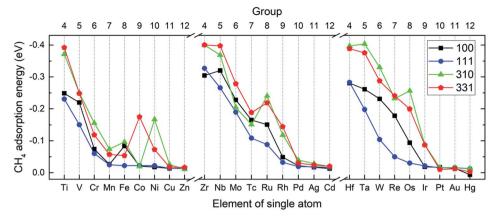


Fig. 2 Methane chemisorption on M/Cu single atom copper alloys. Methane adsorption energies obtained with PBE are plotted against the element of the solute single atom in copper. From left to right, the 3d, 4d and 5d transition metals were screened from groups 4 to 12. Four different surface facets of the copper substrate were tested, showing chemisorption can occur on all facets.

primarily in group 8 metals such as Ru and Os which is evocative of similar methane chemisorption on the pure Ru and Ir steps. 30,32 The out-of-trend cases fall exclusively on the high index facets, (331) and (310), which suggests under-coordination has an additional role in promoting chemisorption on midlate transition metals and warrants further exploration. More generally speaking, the higher index facets exhibit stronger methane binding by roughly 0.1 to 0.2 eV. We expect electronic effects at play and the lower steric repulsion from the surrounding Cu atoms on the step sites behind the stronger adsorption. Surprisingly, the better-known single atom alloys such as Pt/Cu do not exhibit any chemisorption of methane of any kind. The clear periodic trends which favor the group 4 to group 6 metals and disfavor metals such as Pt and Pd strongly suggest the d-electron count or d-band position and filling could have a primary role in determining methane chemisorption. We will explore the mechanisms underlying these trends from electronic structure analyses in the subsequent sections.

#### 2.2 Case study of chemisorption on Zr alloys

We investigate the role of alloying here in the case study of Zr, which was revealed to exhibit one of the strongest methane adsorption energies when alloyed with Cu (Fig. 3). The

adsorption energies between the single atom alloys in different Cu facets Zr/Cu(100), Zr/Cu(111), Zr/Cu(310), and Zr/ Cu(331) are compared with those of pure Cu(100) and fcc Zr(100) and that of the intermetallic alloy phase  $Cu_5Zr(100)^{47,48}$ in Table 1. With PBE, no apparent chemisorption was found on either Cu(100) or Zr(100) having energies close to zero, though the C-M distance on Zr(100) is lower by  $\sim$ 0.5 Å with a correspondingly lower adsorption energy by 0.04 eV. These minute differences could be a possible hint towards the enhanced chemisorption strength of Zr in its alloyed form, but nonetheless it is clear neither component metal has any significant interaction with methane. Moving to the intermetallic alloy Cu<sub>5</sub>Zr(100), methane was found to chemisorb (and on other surface facets shown in the ESI†) with a significant adsorption energy of -0.22 eV and a further decreased C-M distance of 2.834 Å. This finding is highly intriguing as it suggests the single atom criterion is not as strict as previously thought for the case of methane chemisorption, which is promising for the practical application of these catalysts. Finally, the Zr/Cu single atom alloys are found to have the strongest adsorption ranging from -0.3-0.4 eV. There does appear to be a slight benefit to extreme dilution of Zr, though the intermetallic alloys could still serve as active catalysts.

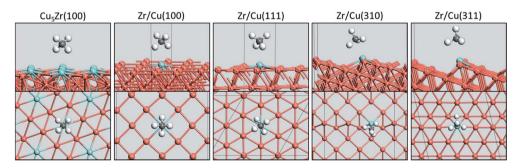


Fig. 3 Methane chemisorption geometries on Zr/Cu. The most stable adsorption geometries obtained with PBE are shown on the various intermetallic and single atom Zr/Cu alloys (C = grey, H = white, Zr = light blue, and Cu = orange). Energies and bond lengths are compiled in Table 1.

Table 1 Comparison of methane chemisorption on Zr/Cu alloys

Surface	Cu(100)	Zr(100)	Cu <sub>5</sub> Zr(100)	Zr/Cu(100)	Zr/Cu(111)	Zr/Cu(310)	Zr/Cu(331)
PBE $E_{ads}$ (eV)	-0.01	-0.05	-0.22	-0.30	-0.33	-0.40	-0.40
C–M distance (Å)	3.563	3.060	2.822	2.765	2.735	2.549	2.554
C–H distance (Å)	1.098	1.108	1.110	1.112	1.114	1.116	1.113
PBE + D3 $E_{ads}$ (eV)	-0.25	-0.26	-0.43	-0.56	-0.59	-0.62	-0.62
C-M distance (Å)	3.125	3.016	2.834	2.720	2.689	2.514	2.513
C–H distance (Å)	1.101	1.109	1.110	1.114	1.116	1.118	1.115
$SCAN + rVV10 E_{ads}$ (eV)	-0.26	-0.36	-0.71	-0.73	-0.70	-0.86	-0.88
C–M distance (Å)	3.600	3.110	2.834	2.718	2.798	2.513	2.528
C-H distance (Å)	1.098	1.120	1.082	1.121	1.104	1.121	1.118
C-fi distance (A)	1.098	1.120	1.082	1.121	1.104	1.121	1.118

On Cu<sub>5</sub>Zr(100), Zr/Cu(100) and Zr/Cu(111), we find a stable methane adsorption geometry in the form of  $\eta$ -H,H in the nomenclature for transition metal complexes,<sup>49</sup> whereas on the Zr/Cu(310) and Zr/Cu(331) cases, a  $\eta$ -H,H,H geometry was slightly more favorable. A comparison between  $\eta$ -H,H and  $\eta$ -H,H,H adsorption energies for M/Cu(331) can be found in the ESI,† where we find energetic differences between the two adsorption geometries to be around 0.1 eV. Thus, on metal alloy surfaces, one would expect both adsorption geometries would be detectable due to similar energetics. Here, the C–M distance is a strong indicator of methane chemisorption, as the Zr/Cu alloy cases have distances well within the combined van der Waals radius of Zr and C (4.29 Å), which range from 2.8–2.5 Å. A lengthening of the C–H bond can moreover be observed with lengths of  $\sim$ 1.11 Å.

We further extend our calculations on these systems to include van der Waals corrections, using the D3 damped atomic potential<sup>50</sup> and the nonlocal correlation functional rVV10 paired with the accurate meta-generalized gradient approximation functional SCAN.51,52 SCAN + rVV10 was chosen due to excellent agreement for energies and geometries for the adsorption of hydrocarbons such as benzene on coinage metals, outperforming most other functionals.52 Previous studies on methane chemisorbed complexes have emphasized the need for dispersion corrections to accurately predict experimental adsorption energies, where the dispersion accounts for approximately 30-60 percent of the total adsorption energy. 15,33 On metal surfaces we similarly find the D3 correction to add roughly 0.2 eV to the total adsorption energy across the board, which brings the non-chemisorbing surfaces to around -0.2 to -0.3 eV and the chemisorbing ones up to -0.62 eV. Here, we expect the van der Waals correction to preserve the relative energy trends observed in Fig. 2. Interestingly, the SCAN + rVV10 functional increases binding energies of the Zr-containing surfaces even further than PBE-D3, especially in bringing the Cu<sub>5</sub>Zr(100) energy to a level comparable to the single atom cases. The strongest adsorption energies using SCAN + rVV10 reach up to -0.88 eV for Zr/Cu(331), though we would expect overbinding could occur for this method. Further theoretical validation and eventual experimental data are needed to pinpoint the exact methane adsorption energies on these alloys, though the PBE-only and SCAN + rVV10 energies can conceivably serve as plausible upper and lower energetic bounds.

### 2.3 Low-temperature activation of methane

Given the methane chemisorption energies comparable to those on metal oxides, similar low-temperature activation is expected on metal alloys. We screen the methane activation barriers over the low-index M/Cu(100) and high-index M/Cu(331) surfaces using PBE + D3, shown in Fig. 4. The blue region in the figure indicates where desorption of methane to the gas phase lies higher in energy than its activation. To date, IrO2(110) has been the only surface which has been found through experimental and theoretical studies to exhibit this behavior, with methane activation occurring at as low as 150 K.11,18 In the 48 single atom alloys we screened, we find over 20 with this predicted behavior, with many more to be expected from additional bimetallic combinations. Promising single atom alloys include Ta, W, Re, and Os in Cu(100) and Nb, Ta, and W, Os, and Ru in Cu(331), and are primarily found to contain early to mid transition metal elements. In comparison, pure Cu(110) and Cu(331) are poor surfaces for methane activation with barriers of 1.39 and 1.20 eV,

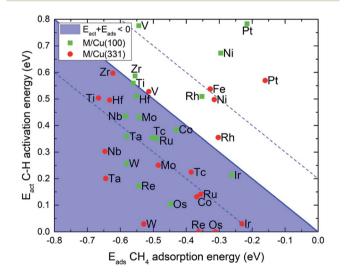


Fig. 4 Methane adsorption and activation energies. Methane adsorption and activation energies over M/Cu(100) and M/Cu(331) surfaces calculated using PBE + D3 are plotted. The region in blue denotes where the desorption energy of methane is higher than its activation barrier, predicting where facile methane activation is likely to occur. The shaded lines show the approximate range of error within 0.2 eV arising from the functional choice. Methane activation energies up to 0.8 eV are plotted, with the full list of surfaces shown in the ESI.†

respectively, and the single atom alloys of traditional methane conversion catalysts such as Ni and Pt still fall well beyond this region. While the higher index surface performed better overall with stronger chemisorption and lower activation barriers, both low and high index surfaces contained alloys where facile methane activation is possible.

Another important observation is that the obtained activation energies of the alloys in which chemisorption is present (early and mid transition metals) are significantly lower compared to those of their pure metal counterparts. For example, the barrier is reduced from 0.74 eV on pure Zr(100) to 0.43 eV on Zr/Cu(100), as seen in ESI Fig. 1.† In contrast, for the late transition metals with no chemisorption such as Pt, the single atom alloy form has a higher activation barrier than that of the pure Pt metal, as it was hypothesized that the activity had been quenched by the relatively inert Cu.35 These results strongly suggest methane chemisorption over the early and mid

transition metals reduces the C-H activation barriers, which is consistent with the observation of a lengthened C-H bond in the chemisorbed methane.

We further obtained free-energy profiles for methane first C-H activation using PBE + D3 at a range of temperatures, shown in Fig. 5. We chose Re/Cu(100) and Ta/Cu(331) as promising candidates from both low and high index surfaces with a combination of both strong chemisorption and low activation barriers. While Zr/Cu exhibits the strongest chemisorption, it also has a comparatively higher activation barrier. The energy profiles from these two surfaces show facile activation up to 300 K similar to oxides such as IrO2(110). For both tested facets, activation occurs via a chemisorbed initial state, followed by C-H cleavage by a M-Cu pair (M being the single atom dopant). The obtained transition state contains a hydrogen coordinated to both M and Cu. Following C-H cleavage, the methyl remains bonded to M, while the H binds to a nearby hollow site. The dissociation is exothermic

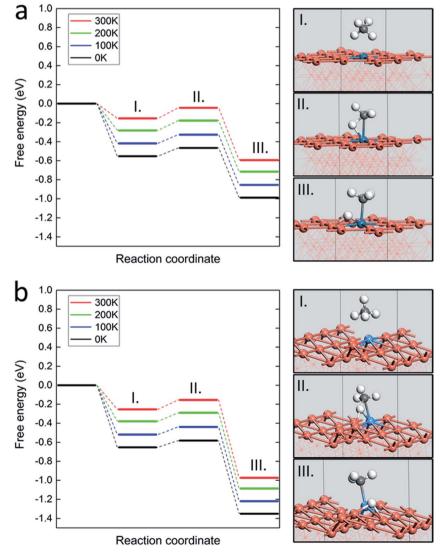


Fig. 5 Energy profile of methane activation on single atom alloys. The free energies of methane dissociation on (a) Re/Cu(100) and (b) Ta/Cu(331) are shown at various temperatures from 0-300 K calculated using PBE + D3 including zero-point and vibrational contributions to entropy. The geometries of the initial chemisorbed state I, the transition state II, and the final state III are shown to the right.

on both surfaces. A complete list of the adsorption, activation and dissociation energies can be found in the ESI.†

#### 2.4 Electronic properties of the methane surface complex

The results thus far show clear proof of methane chemisorption and activation on single atom alloys; we now seek to demonstrate a causal link between the electronic structure of the substrate and chemisorption. We begin by investigating the electronic structure of the chemisorbed methane complex on Zr/Cu(100). The density of states difference plot for the same methane complex is shown in Fig. 6a, which shows a clear depletion of empty d states (shown in red) in the region above the Fermi level from 0 to 2 eV, which is indicative of a dative interaction involving electron donation from methane C-H bonds into the empty metal states. A possible back-bonding interaction from filled d-states can also be observed from the slight depletion in the d-band from -5 to 0 eV below the Fermi level, though further analysis is warranted to identify this interaction. The observed hybridization of d-states above the Fermi level is characteristic of methane complexes in other surfaces such as metal oxides.18-21

A look at the density of states plot of the Zr/Cu single atom alloys in comparison with pure Zr indeed shows signs of electronic band contraction, as shown in Fig. 5b. Overall, the d states are clearly localized in the region centered around 0.5 eV relative to the Fermi level compared to pure Zr to form a distinct peak rather than a broad band. The observed d-band contraction falls short of the "free-atom-like" description for single atom alloys such as Ag/Cu,  $^{39,40}$  though the fact that methane chemisorption can still occur on Zr/Cu over the pure Zr metal suggests even a lesser degree of contraction can have a substantial improvement. We calculate the number of empty or unoccupied d-states in the relevant 0 to 2 eV region (d<sub>unocc</sub>) in Fig. 6b highlighted in green and find approximately 2.5–3 times the number of empty states available for donation by methane in Zr/Cu over the pure Zr, which further corroborates with the observed chemisorption.

From the pure electronic structure shown in Fig. 6, it is clear the methane chemisorption strength is closely linked to the number of available empty states for electron donation by methane. Here, we try to correlate these electronic descriptors with the adsorption energies. First of these is the d-band center, which has already been extensively used to predict adsorption properties for transition metals, plotted in Fig. 7a.53 Here, we find a lower dband center (d<sub>center</sub>) to approximately correlate with a weaker methane adsorption, with an  $R^2$  of 0.66 in the energy region where methane chemisorption is non-zero. Next, we plot the number of empty or unoccupied d-states (dunocc) in Fig. 7b. When considering the 4d and 5d transition metals, the correlation with adsorption energy works remarkably well, with an  $R^2$  of 0.94, though the energies for the 3d metals are consistently underestimated. One such reason for lower-than-expected energies is the greater contraction of the 3d orbitals which leads to a weaker degree of hybridization.20 From these descriptors qualitative predictions can be made, though it is clear other factors can play a role in the chemisorption energy of methane. Consequently, linear correlations containing individual descriptors become insufficient to capture all the interactions of the methane complex.

We turn to statistical learning to sample the feature space containing all the possible electronic parameters involved in determining methane chemisorption, which can aid in descriptor identification and the development of quantitative predictive models. <sup>54,55</sup> In our feature space we included solely electronic properties, which are the number of empty s, p and d states from 0 to 2 eV, number of filled s, p and d states from -2 to 0 eV, the s, p and d centers spanning the full energy range, and additionally the s, p and d orbital radii. <sup>56</sup> We used a compressed sensing method, SISSO (sure independence screening and sparsifying operator), to identify the best linear combination of candidate features from the space  $\Phi_{1-3}$ . <sup>57</sup> Here,  $\Phi_n$  is constructed from  $\Phi_0$  containing the twelve aforementioned primary features. A search over this space reveals a 1D  $\Phi_2$  descriptor with the lowest RMSE which provides a fit with  $R^2 = 0.94$  (Fig. 7c):

$$E_{\rm ads} = -0.436 \times 10^{-1} \left( \frac{r_{\rm p} d_{\rm unocc} p_{\rm unocc}^{0.5}}{\frac{p_{\rm occ} + s_{\rm occ}}{\log(r_{\rm p})}} \right) - 0.666 \times 10^{-2}$$

We find the adsorption energy is proportional to the number of empty d and p states ( $d_{unocc}$ ,  $p_{unocc}$ ), which determine the

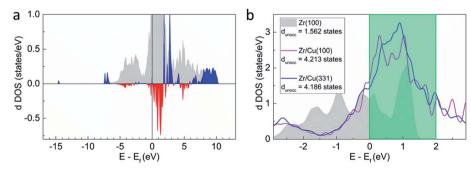


Fig. 6 Electronic structure of the Zr/Cu alloy and methane chemisorbed complex. (a) Density of states difference plot of the Zr atom in Zr/Cu(100) before and after methane chemisorption overlaid over the initial density of states (in grey). Decrease in states is shown in red and increase is shown in blue. (b) The projected density of states of Zr in Zr/Cu(100) and Zr/Cu(331) single atom alloys are compared with that of the Zr surface atom in pure Zr(100) shown in grey. The green region highlights states near the Fermi level from 0 to 2 eV as the integration range for  $d_{unocc}$ , with the values shown in the legend.

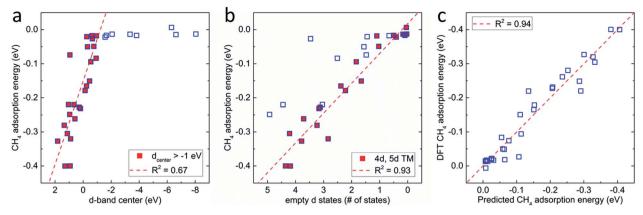


Fig. 7 Descriptors for methane adsorption. (a) Correlations of individual descriptors, d-band center and (b) # of empty d states with methane adsorption energy using PBE. Linear best fits (red dashed lines) are plotted for the selected points in red, which correspond to points with a d<sub>center</sub> above -1 eV, and the 4d and 5d transition metals. (c) Correlation between the predicted adsorption energies from SISSO-derived expression and the DFT energies with the linear best fit in red dashed lines applied to all points.

degree of electron transfer from the methane C-H bond to the metal site, and is inversely proportional to the number of filled s and p states (socc, pocc), which can modulate the repulsive interaction between the methane and the surface. Finally, the orbital radii  $(r_p)$  are present in the descriptor due to its role in determining the degree of overlap with methane orbitals. Using compressed sending, we are therefore able to obtain a simple analytical expression describing methane adsorption energy in close agreement with the observed physical picture of methane chemisorption, which also performs significantly better than conventional descriptors such as the d-band center (Fig. 7a).

Overall, we demonstrate the availability of electron acceptor states to have a primary contribution to methane chemisorption, followed by the repulsion from the sp bands, and finally the orbital radii which further determine the degree of orbital overlap. It is clear the first two contributions listed above are aided by the alloying effect in metals and corresponding electronic band contraction. In particular, the contracted d band observed in Fig. 4 can allow for more states to exist within the relevant energy window (ca. 0 to 2 eV) for methane bonding. The amount of electron acceptor states is also further influenced by the identity of the metal solute, whose intrinsic d-band position determines where the peak of d-states will fall once alloyed. This explains the favorability of early transition metal solutes (Ti, Zr, and Hf) towards methane chemisorption due to their high d-band centers in their pure forms, whereas the later transition metals with lower d-band centers (Ni, Pd, and Pt) have d-states which are almost completely occupied regardless of band contraction. The identity of the metal furthermore determines the orbital radii, which is why chemisorption on flat (100) and (111) surfaces is favored for the 4d and 5d metals with wider radii than the 3d, though these differences vanish on the high-index surfaces as the solute atom becomes more exposed on the surface.

#### Stability and expansion to other metal alloys

Finally, the exceptional performance of Zr and other metals alloyed in Cu raises the question of whether Cu has an exclusive role in the activity of the solute metal. An additional sampling of four additional solvent metals Co, Ni, Ag, and Au is organized in Table 2. Ag and Au, being in the same coinage group, show similar energies to that of Cu as anticipated. Unexpectedly, we find even the non-coinage metals, Co and Ni, could serve as effective substrates, though the interactions are slightly weaker by ca. 0.05 eV with marginally longer corresponding C-M distances. As revealed earlier in Fig. 4, true free-atom-like states are not necessary conditions for chemisorption, though they may certainly aid in a stronger interaction. Instead, a general contraction of the bands and a sufficient amount of empty states in the region above the Fermi level appear to be adequate to allow for methane complex formation. To this end, the degree of dilution and the elemental identity of the solute metal appear to be the primary determinants in chemisorption strength.

This observation is highly encouraging for the materials design of active catalysts as it suggests an extensive range of possible alloy combinations and stoichiometry where methane chemisorption and facile activation can occur. Within just the bimetallic regime, there exist several thousand combinations of the solute metals identified in this work (such as Ti, V, Zr, Nb, Mo, Ru, Hf, Ra, W, Re and Os) with the various metal solvents beyond Cu, and in concentrations ranging from the single-atom limit to stochiometric intermetallic compounds. Further modifications can also be applied onto this alloying framework, such as strain and coordination-based modification to induce further band narrowing and upshift.58,59 These adsorption properties can be calculated with an appropriate DFT functional or quickly screened via the electronic descriptors identified in this work.

Table 2 Comparison of methane chemisorption on Zr alloyed in different metal substrates

Surface	Zr/Co(100)	Zr/Ni(100)	Zr/Ag(100)	Zr/Au(100)
PBE $E_{ads}$ (eV)	-0.24	-0.25	-0.25	-0.29
C-M distance (Å)	2.829	2.822	2.784	2.770
C–H distance (Å)	1.110	1.110	1.114	1.113

Significant advances in metal alloy synthesis have made the predicted materials experimentally accessible, 60,61 such as through wet chemistry methods,62,63 physical vapor deposition,64 or more recent 'thermal shock' techniques.65,66 Another concern is whether the active solute metal will remain on the surface or become hidden in the subsurface. Under reaction conditions, the presence of reactants and intermediates is known to draw the more reactive metal to the surface, 67,68 which we find to be similarly true for many of the studied single atom alloys in this work. On Re/Cu(100) and Ta/Cu(331), we find the segregation energy of the dopant to be 0.27 eV and 0.36 eV, respectively, in the presence of methyl and hydrogen species on the surface (ESI Fig. 3†). Here, a positive energy denotes a thermodynamically unfavorable transition from the surface to the subsurface, aided by the fact that Cu is comparatively more inert and binds much more weakly to methyl and hydrogen than the dopants.

## 3 Conclusion

We have investigated whether metal alloys can act as viable surfaces for the chemisorption and low-temperature activation of methane, via an exhaustive screening of single atom alloys in Cu and several other substrates. We hypothesized the shift and contraction of the electronic states of the metal site in the alloy would allow for chemisorption to occur which would otherwise be impossible in the pure metal. From our screening, we have revealed unprecedented cases of strong chemisorption and facile activation over metal surfaces such as Re/Cu(100) and Ta/Cu(331). Clear energetic trends were also observed which favor the early to mid-transition metals. Electronic structure and statistical learning analyses reveal electron donation from methane to empty metal d states as the primary contributor to the formation of the chemisorbed complex, which can be predicted from d-band center and doccupancy based descriptors. The origin of strong chemisorption on alloys can be attributed to both the high intrinsic d-band center of the solute metals and the contraction of the solute electronic bands from alloying. Metal alloys which exhibit strong chemisorption furthermore show reduced C-H activation barriers, which can lead to facile methane activation at 300 K. Therefore, metal alloys show significant promise as a class of inexpensive low-temperature methane conversion catalysts which encompass a broad range of possible stoichiometries, surface geometries, and elemental compositions of the solute and solvent metals.

# **Author contributions**

VF conceived the project and carried out the calculations. All authors contributed to the writing of the manuscript.

## Conflicts of interest

There are no conflicts to declare.

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