



Activity Trends in the Propane Dehydrogenation Reaction Catalyzed by M^{III} Sites on an Amorphous SiO₂ Model: A Theoretical Perspective

C. S. Praveen^{1,2} · A. Comas-Vives³

Accepted: 9 November 2021 / Published online: 30 November 2021
© The Author(s) 2021

Abstract

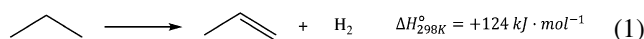
One class of particularly active catalysts for the Propane Dehydrogenation (PDH) reaction are well-defined M(III) sites on amorphous SiO₂. In the present work, we focus on evaluating the catalytic trends of the PDH for four M(III) single-sites (Cr, Mo, Ga and In) on a realistic amorphous model of SiO₂ using density functional theory-based calculations and the energetic span model. We considered a catalytic pathway spanned by three reaction steps taking place on selected M^{III}–O pair of the SiO₂ model: σ -bond metathesis of propane on a M^{III}–O bond to form M-propyl and O–H group, a β -H transfer step forming M–H and propene, and the H–H coupling step producing H₂ and regenerating the initial M–O bond. With the application of the energetic span model, we found that the calculated catalytic activity for Ga and Cr is comparable to the ones reported at the experimental level, enabling us to benchmark the model and the methodology used. Furthermore, results suggest that both In(III) and Mo(III) on SiO₂ are potential active catalysts for PDH, provided they can be synthesized and are stable under PDH reaction conditions.

Keywords M^{III} sites · Lewis acidic sites · Transition-metals · Silica · Propane dehydrogenation reaction · Amorphous model

1 Introduction

Industrial processes involving the cleavage of strong C(sp³)–H bonds [1] are among the most challenging ones, being highly energy demanding processes [2–4]. Within alkane dehydrogenation, propane dehydrogenation (PDH) to propylene and hydrogen (Eq. 1) has gained major interest in the past years due to the discovery of shale gas [5] mainly in the US [6–8]. Moreover, the PDH reaction in combination with metathesis, i. e. propane to olefins (PTO) can provide

a way to produce propene, ethene and butene in a single-step [9].



Nevertheless, to overcome the thermodynamic limitations imposed by the highly endothermic PDH reaction (standard enthalpy $\Delta H_{298}^\circ = +124 \text{ kJ mol}^{-1}$), high temperatures are required to obtain significant conversions (typically above 550 °C). This leads to deactivation and poisoning of the catalysts via coke formation [10]. In industry, there are two historical heterogeneous catalysts used for the PDH reaction: the alumina-supported PtSn nanoparticles and the CrO_x/Al₂O₃ system, also known as the Houdry or Catofin catalyst [11], albeit both systems suffer from deactivation and need frequent regeneration. Therefore, the synthesis of new catalysts is crucial [12]. Among the first family of catalysts, i.e. based on Pt NPs, it was shown that silica-supported PtGa-based catalysts were highly efficient for the PDH reaction [13] and their high performance and stability was recently rationalized via first principles calculations in combination with metadynamics [14].

Metal-based single-site catalysts on SiO₂ have also been found to display high activity towards the PDH reaction

✉ A. Comas-Vives
Aleix.Comas@uab.cat

¹ International School of Photonics, Cochin University of Science and Technology, University Road, South Kalamassery, Kalamassery, Ernakulam, Kerala 682022, India

² Inter University Centre for Nano Materials and Devices, Cochin University of Science and Technology, University Road, South Kalamassery, Kalamassery, Ernakulam, Kerala 682022, India

³ Department of Chemistry, Universitat Autònoma de Barcelona, 08193 Cerdanyola del Vallès, Catalonia, Spain

[10]. For instance, Cr(III) centres on silica [15], analogous to the Houdry and Catofin catalysts in alumina, are also active catalysts in the reaction. Lewis acidic Ga(III) centres on SiO₂ also display high activity and remarkable selectivity and stability [16, 17], Ga₂O₃ is also catalytically active towards the PDH reaction [2, 18] and recently Ga(III) sites have also been proposed as their active reaction centers [19].

Moreover, other single-metal centres on SiO₂ based on Fe(II), Zn(II) and mono- and bimetallic Co(II) centres on silica are catalytically active in the PDH reaction [20–23].

In previous studies, we showed how the use of an amorphous SiO₂ model [24] is important to understand the reactivity of single-sites present on silica, being able to account for strain, an aspect which is not as straightforward to capture using cluster models [25]. This was exemplified by the olefin polymerization reaction catalyzed by Cr(III)/SiO₂ [26, 27]. More recently, for the PDH reaction, we could also show by evaluating the reactivity of different Ga(III) sites that strain is a key parameter controlling the activity, showing that an intermediate strain of the reactive Ga–O pair leads to the highest catalytic activity in the PDH reaction [28].

The considered propane dehydrogenation pathway has the following reaction steps: (1) the C–H bond activation of propane on the M^{III} site forming a M^{III}-propyl intermediate and an OH group (Step 1), (2) the β-hydride transfer producing a hydride and propene (Step 2), (3) the H–H coupling or reverse σ-bond metathesis of H₂ (Step 3) following the de-coordination of propene to regenerate the initial M^{III} site. This catalytic route was already considered for Cr [29] and Ga-single sites using cluster [30] and amorphous periodic models, respectively [28].

Given that Cr and Ga single-sites on SiO₂ are known to be active catalysts of the PDH reaction, together with the latter elements, we decided to evaluate two additional representative elements laying just below Cr and Ga in their respective groups of the periodic table, i.e. In and Mo. Therefore, in this work, we evaluated the reactivity of four different single metal(III) sites on silica (M = Cr, Mo, Ga and In) using the previously mentioned SiO₂ amorphous model [24]. For the present study, we selected the M–O pair that displayed the highest activity towards the PDH for the Ga(III)/SiO₂ system. Here, we extend our work on Ga to three additional metals and compare among them. Our study displays the catalytic differences among the evaluated metal sites, highlighting their differences in the key PDH steps, finally proposing which one should display the highest catalytic activity in PDH using the energetic span approach.

2 Construction of the M(III) single-sites on SiO₂

M^{III}(Cr,Mo,Ga,In)/SiO₂ models are constructed using a previously developed amorphous silica model [24], which corresponds to a slab of dimensions 21.4 Å × 21.4 Å × 34.2 Å and contains 372 atoms. The silica model exposes five isolated silanol groups (SiOH) and has a surface silanol density (1.1 OH nm⁻²) close to the density found for silica partially dehydroxylated under vacuum at 700 °C (SiO₂₋₇₀₀, 0.8 OH nm⁻²), which is for instance, the one used experimentally to prepare well-defined Ga^{III} sites active in the propane dehydrogenation reaction and related systems [16]. The M^{III} sites can be introduced into the silica model by substituting surface “SiOH” groups by a M³⁺ i.e. turning (≡SiO)₃SiOH sites into (≡SiO)₃M^{III} sites as previously carried out to build the corresponding Cr^{III} and Ga^{III} sites [26–28]. This model provided five types of Ga, Cr^{III}/SiO₂ models, namely models I–V [26–28]. In our previous work on Ga, we probed the reactivity of all sites towards the propane dehydrogenation reaction [28]. We found that the most active site corresponds to the V–O3 site, in which V refers to the site label of the metal, while O3 refers to the specific oxygen involved in the PDH reaction. Therefore, in the current study, we selected V–O3 site to compare the reactivity of the single-site systems composed of the previously discussed metals: Cr, Mo, Ga and In, respectively. Figure 1 shows all the constructed tri-coordinated single-sites on the amorphous SiO₂ model together with the geometrical characteristics of each of the four metal sites (see Fig. 1), such as M–O distances and O–M–O angles.

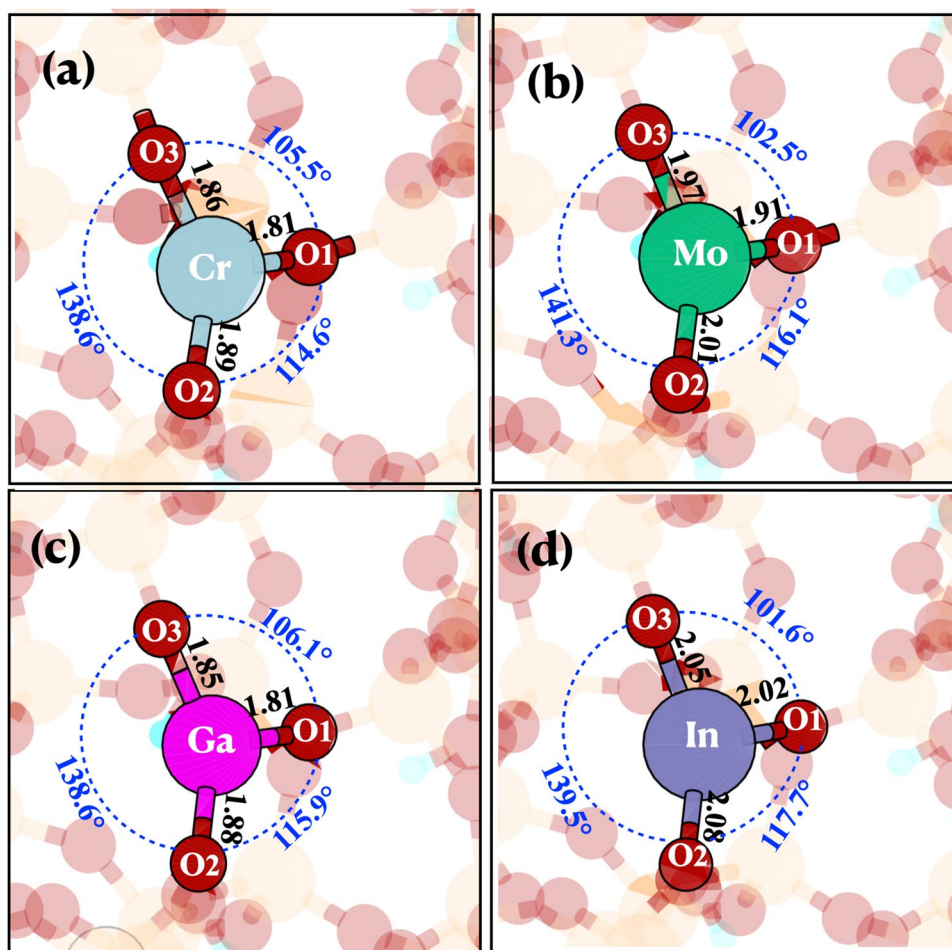
3 Evaluation of the Propane Dehydrogenation on the Selected M(III)/SiO₂ Sites

We evaluated the propane dehydrogenation reaction catalyzed by four different single-site M^{III} metals (Cr, Mo, Ga and In) considering the previously discussed catalytic cycle, as shown in Scheme 1.

3.1 Step 1: C–H Bond Activation of Propane

The reactivity of the four M(III)–O(3) site towards the C–H activation of propane was the first reaction step evaluated. Table 1 summarizes, both the energy barrier heights

Fig. 1 Single sites on the amorphous model of SiO₂ based on **a** Cr, **b** Mo, **c** Ga and **d** In



(ΔE^\ddagger) and reaction energies (ΔE) for the C–H activation of propane (in kcal mol⁻¹) on all the evaluated M–O sites. This site has a high degree of strain, and therefore is the most active site among all the previously evaluated sites for the case of the Ga single-sites on SiO₂ using the same amorphous model than the one used in the current study [28].

The energy barriers follow the trend: Ga < In < Cr ≪ Mo. The reaction energy barriers take values within 18.5 and 27.8 kcal mol⁻¹, while reaction energies range between – 2.0 and – 26.2 kcal mol⁻¹. In addition, for most metals, the energy barrier for the C–H activation decrease when the reaction energy is more favored. The only exception to this trend is between Ga and In, since the C–H activation energy barrier is slightly lower on Ga than on In (18.5 vs. 18.9 kcal mol⁻¹) whereas the reaction is slightly less favored on Ga than on In (– 25.2 vs. – 26.2 kcal mol⁻¹). In any case, the energies obtained for Ga and In are very alike, being the two most active metals for the direct propane activation via a σ -bond metathesis; forming a M-propyl group and a new O–H bond. The next most active

metal for this reaction step is Cr with a slightly higher energy barrier (21.9 kcal mol⁻¹) than In and Ga (18.9 and 18.5 kcal mol⁻¹, respectively). In contrast, Mo presents a significantly higher energy barrier than the other metals: 27.8 kcal mol⁻¹.

Similar to what we found when analyzing the C–H activation of propane on different Ga sites on silica, there is a Brønsted–Evans–Polanyi relationship followed to certain extent ($R^2=0.816$) between the electronic energy barrier and the reaction energy (Figure S1 in electronic energies and Figure S2 and $R^2=0.763$ in Gibbs energies). There is actually a good correlation between the energy barrier and the reaction energies of the reverse step of the C–H activation, as reported in the ESI ($R^2=0.956$ in electronic energies, Figure S3 and $R^2=0.899$ in Gibbs energies, Figure S4).

The geometries corresponding to the transition-state structures are shown in Fig. 2 together with their most important geometric characteristics. The transition-states are characterized by the elongated C–H bond of the propane molecule. The corresponding C–H distances are

Scheme 1 The proposed reaction mechanism for the dehydrogenation of propane on M^{III}/SiO_2 sites. For some metals, an additional siloxane group coordinates to the M^{III} centre which is shown in grey. In the present work, we report the reaction mechanism on four $M(III)$ centers ($M=Cr, Mo, Ga,$ and In)

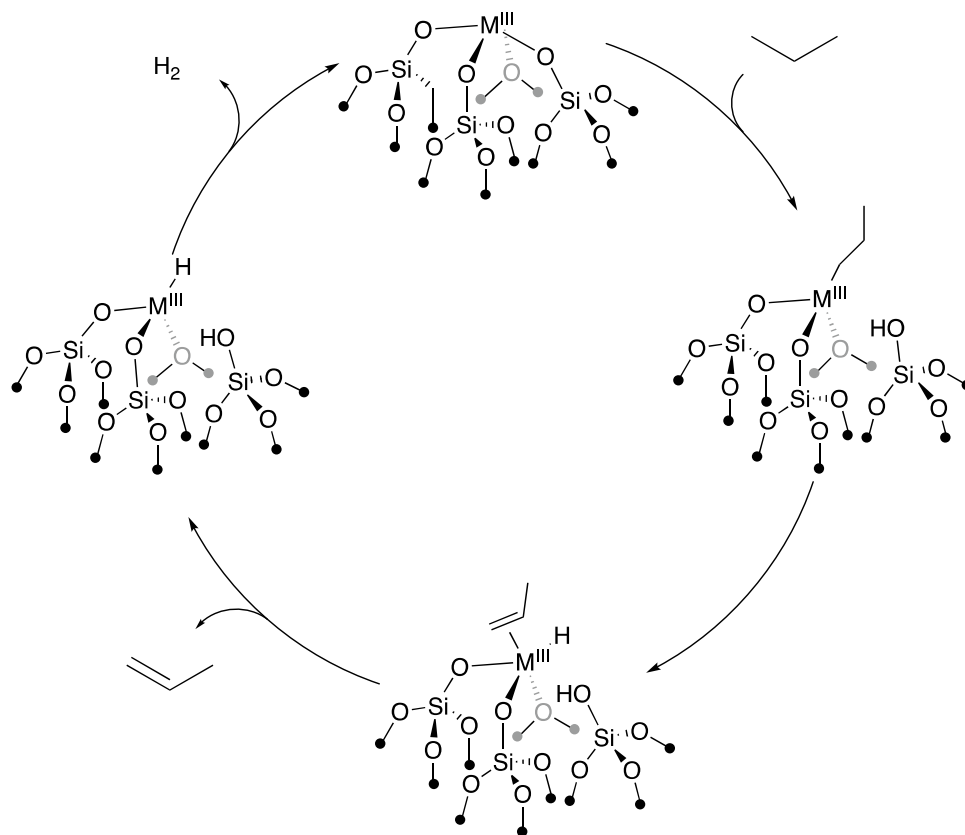


Table 1 Energy barrier heights (ΔE^\ddagger) and reaction energies (ΔE) for the C–H activation of propane (in kcal mol^{-1}) on the four evaluated M–O sites ($M=Cr, Mo, Ga$ and In)

M–O pair	ΔE^\ddagger (kcal mol^{-1})	ΔE (kcal mol^{-1})
Cr	21.9	– 6.8
Mo	27.8	– 2.0
Ga	18.5	– 25.2
In	18.9	– 26.2

Both quantities are referenced with respect to the minima before the transition-state, in which propane interacts with the corresponding M–O site

equal to 1.351, 1.353, 1.423 and 1.407 Å for Ga, In, Cr and Mo, respectively.

3.2 Step 2: β -H Transfer and Propene Decoordination

The next reaction step considered in the PDH reaction is the β -H transfer, in which one H atom in β -position of the propyl group is transferred to the metal atom forming an M–H bond, while propene remains coordinated to the $M(III)$ center. Table 2 summarizes the energetics of this reaction step for all the evaluated metals. This step is endoenergetic and has rather high energy barriers for all metal atoms.

Moreover, the calculated energy barriers take significantly higher values than the previously evaluated C–H activation of propane reported in the former subsection (*vide supra*). The values of the energy barriers for the β -H transfer step follow the trend: $Cr < Mo < Ga \ll In$. As expected, Cr and Mo, which are transition metals with partially filled d orbitals have lower energy barriers (35.4 and 37.2 kcal mol^{-1} , respectively) than Ga and In (41.7 and 53.7 kcal mol^{-1} , respectively), belonging to the group 13 of the periodic table.

The corresponding geometries for all the transition-state structures are shown in Fig. 3, which depicts their most characteristic geometrical features concerning the β -H transfer step. The geometry of the corresponding structure for Mo is different than for the other metals. In this case, the TS corresponds to the change of conformation of H from one side of the O–M–O plane to the other with propene barely interacting with the Mo (see Fig. 3c). In this case, the β -H transfer preceding this TS is slightly lower in energy than this H migration. Therefore, we took the latter process as the key transition state connecting M-propyl and the M–H + propene species.

In this case, the relation between ΔE^\ddagger (kcal mol^{-1}) and ΔE does not follow a linear trend ($R^2 = 0.584$, Figure S5). On the other hand, in our previous study on five different Ga sites, this step followed a rather well transition-state scaling,

Fig. 2 Transition-states corresponding to the C–H activation of propane for the four evaluated single-metal (III) sites on SiO₂: **a** Cr, **b** Mo, **c** Ga and **d** In

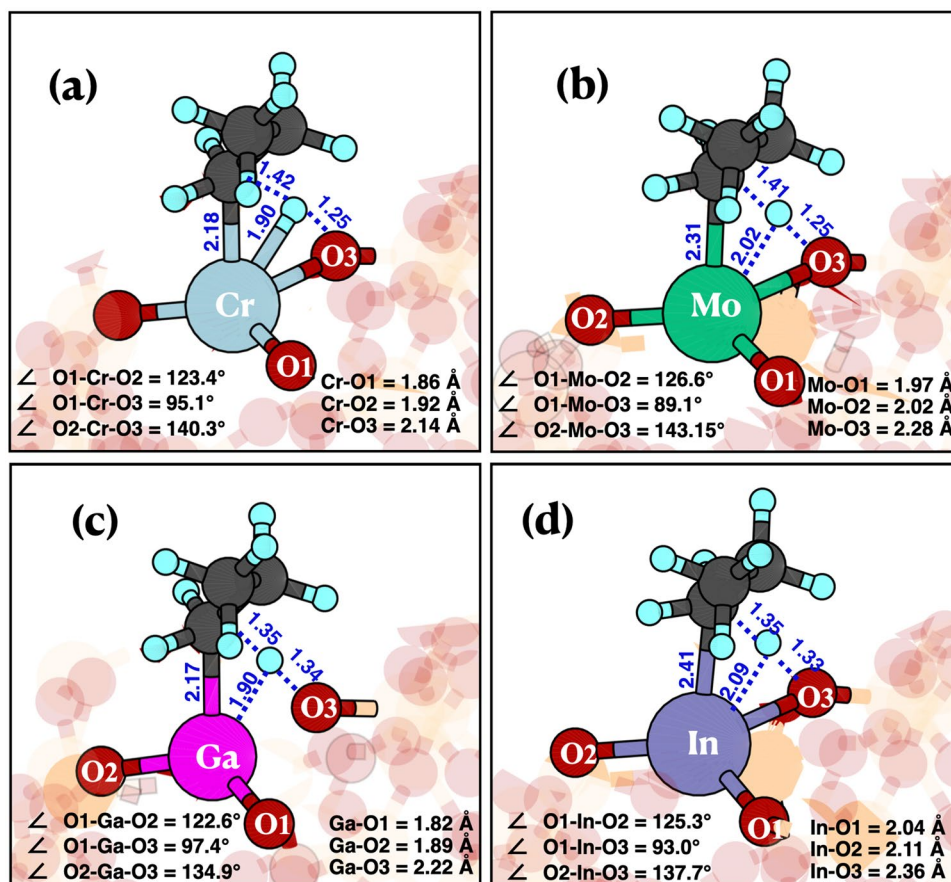


Table 2 Energy barrier heights (ΔE^\ddagger) and reaction energies (ΔE) for the β -H transfer step (in kcal mol⁻¹) on the four evaluated M(III) sites (M=Cr, Mo, Ga and In) on SiO₂

M(III)-site	ΔE^\ddagger (kcal mol ⁻¹)	ΔE (kcal mol ⁻¹)
Cr	35.4	13.2
Mo	37.2	6.7
Ga	41.7	13.4
In	53.7	18.1

Both quantities are referenced with respect the minima before the transition-state

relating the energy of a given TS and its product. Both energies are referenced against the energy of the initial reactant and the catalyst, i. e. propane and the corresponding M(III)-site. The transition-state scaling improves ($R^2=0.857$ in electronic energies, Figure S6 and $R^2=0.843$ in Gibbs energies, Figure S7) with respect to the previously mentioned relation between ΔE^\ddagger and ΔE ($R^2=0.57$). The scaling trend is, however, not as high as the one we reported when comparing the five different Ga sites ($R^2=0.997$) [28]. Possibly, more data and complex functions, such as those provided by machine learning algorithms, are needed to predict the

energy barriers of this reaction step with a high degree of confidence.

The next step we considered in our mechanistic analysis was the decooordination of propene from the metal moiety. In all cases, the decooordination is endoenergetic taking values equal to 20.1, 27.2, 18.0 and 21.3 kcal mol⁻¹ for Cr, Mo, Ga and In, respectively. The decooordination is preferred in the order of: Ga > In > Cr \gg Mo. While Ga, In, and Cr present rather similar values ranging 18.0–21.3 kcal mol⁻¹ for the decooordination of propene step, the decooordination of propene from Mo is much more energy demanding (27.2 kcal mol⁻¹) since the bond between the propene and Mo is significantly stronger than for the rest. In any case, at the high temperatures needed for the PDH reaction, the propene decooordination is clearly exergonic ($\Delta G < 0$) for all metals as it is a highly entropically-driven step owing to the release of propene into the gas-phase.

3.3 Step 3: H–H Coupling and H₂ Formation

Finally, we calculated the last reaction step along the postulated mechanism for the PDH reaction, which is the coupling of M–H and O–H groups, i.e. the H–H coupling—or

Fig. 3 Transition-states corresponding to the initial β -H transfer for the four evaluated single-metal (III) sites on SiO_2 : **a** Cr, **b** Mo, **c** Ga and **d** In. For Mo this transition-state structure corresponds to a H migration step instead

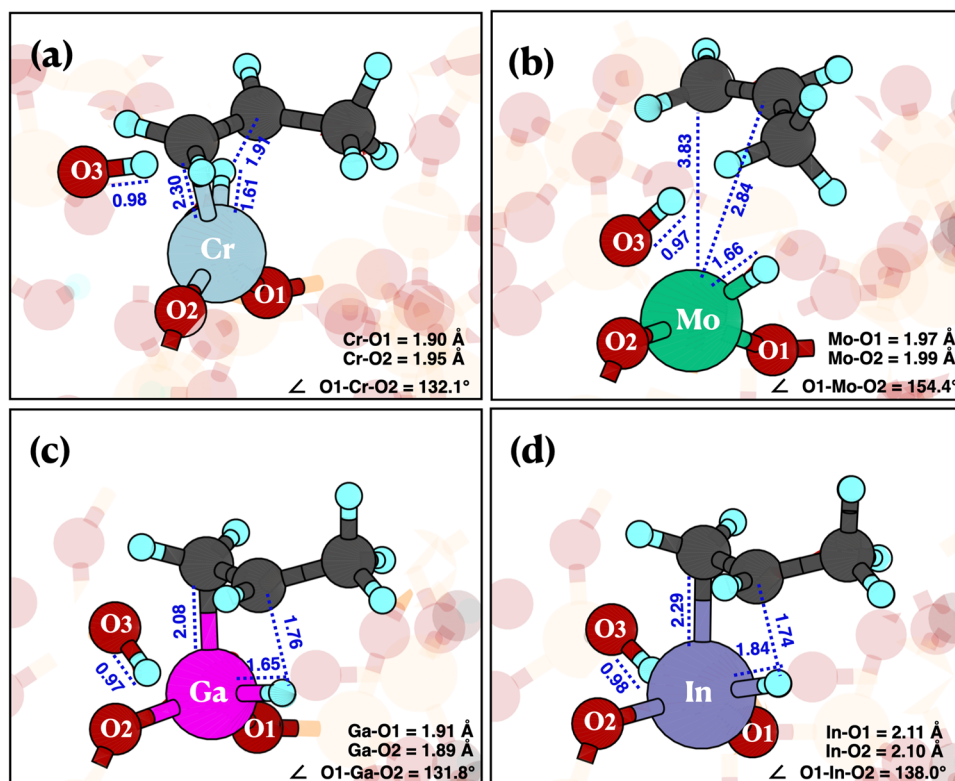


Table 3 Energy barrier heights (ΔE^\ddagger) and reaction energies (ΔE) for the H–H coupling step (in kcal mol^{-1}) on the four evaluated M(III) sites ($M = \text{Cr, Mo, Ga and In}$) on SiO_2

M(III) site	ΔE^\ddagger (kcal mol^{-1})	ΔE (kcal mol^{-1})
Cr	23.3	13.6
Mo	18.1	8.0
Ga	43.1	33.2
In	36.1	27.4

Both quantities are referenced with respect the minima before the transition-state

inverse σ -bond metathesis step—forming H_2 and recovering the initial M–O bond cleaved during the initial activation of propane. The energy barriers (ΔE^\ddagger) and reaction energies (ΔE) for this reaction step for the four evaluated M(III) sites on SiO_2 are summarized in Table 3. The energy barriers follow the trend in values as: $\text{Mo} < \text{Cr} \ll \text{In} < \text{Ga}$. The two transition metals, *i.e.* Mo and Cr, have relatively low energy barriers for this step, taking values equal to 18.1 and 23.3 kcal mol^{-1} , respectively. Conversely, the energy barrier values for this step for Ga and In are 36.1 and 43.1 kcal mol^{-1} , respectively. In this case, all four points followed a very clear linear trend when representing ΔE^\ddagger vs. ΔE of the H–H coupling step, with an $R^2 = 0.998$ (Figure S8, and $R^2 = 0.966$ in Gibbs energies, Figure S9).

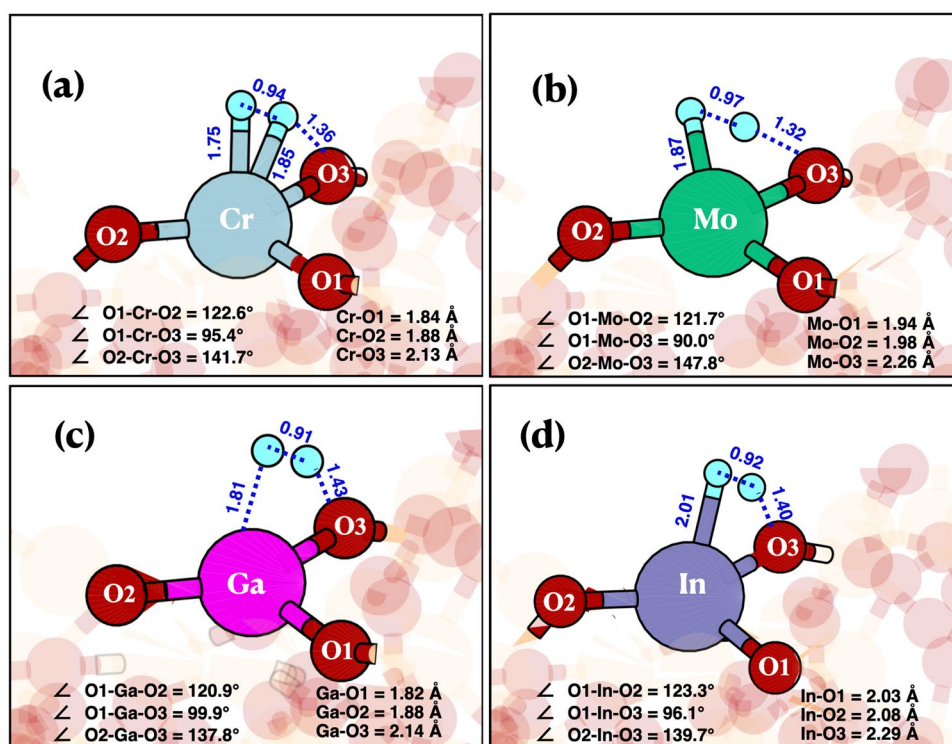
The transition-state structures corresponding to all H–H coupling steps are shown in Fig. 4, which depicts their most characteristic geometrical features.

4 Overall Catalytic Cycles for PDH

At this point, we can discuss the overall reactivity of the four evaluated metal sites based on the Gibbs energy profiles at 550 °C and 1 bar, which are shown in Fig. 4. The energy profile in electronic energies is given in the ESI (Figure S10). Figure 5 provides the information to compare the reactivity among all four evaluated metal sites. As previously reported, the propane dehydrogenation reaction is endergonic by 7.4 kcal mol^{-1} , in good agreement with the experiment, since the PDH reaction has ca. 30% equilibrium conversion for propane at 550 °C and 1 bar [10].

Subsequently, we used the energetic span model [31] to compare the catalytic activity of the four evaluated systems. Within this approach, the turnover frequency (TOF) of a catalytic cycle is a function of the energetic span (∂E). This quantity (∂E) depends on the energy of the TOF-determining transition state (TDTS), and the TOF-determining intermediate (TDI). Simplifying the approach, the TDTS corresponds to the highest energy in the Gibbs energy profile, while the TDI is generally the most stable intermediate in the energy profile. When the TDTS of a catalytic cycle

Fig. 4 Transition-states corresponding to the initial H–H coupling steps for the four evaluated single-metal (III) sites on SiO₂: **a** Cr, **b** Mo, **c** Ga and **d** In



appears after the TDI in the Gibbs energy profile, ∂E is the energy difference between these two steps. Conversely, when the TDI appears after the TDTS, the ΔG_r is added to this difference. Overall, the energetic span model defines ∂E using the following equation.

$$\partial E = \begin{cases} T_{TDTS} - I_{TDI} \\ T_{TDTS} - I_{TDI} + \Delta G_r \end{cases}$$

Based on the energetic span ∂E , the TOF is calculated at 550 °C for all systems using the expression:

$$TOF = \frac{k_B T}{h} e^{-\partial E/RT}$$

The former equation is in principle valid for exergonic reactions, which leads to a positive TOF when calculated. The TOF is understood as a catalytic flux via the span model, in analogy with Ohm's law in electric circuits [31]. Thus, within the flux analogy, it is positive and goes forward for exergonic reactions, while it is negative and goes backwards for endergonic reactions. Nevertheless, the TOF is defined differently at the experimental level and is always positive, since it is obtained based on the conversion of the reactants to products. The PDH reaction is endergonic under our evaluated conditions (the ΔG_r term is positive at 550 °C), and therefore we would obtain a negative TOF, meaning the catalytic flux would go backwards. Thus, in order to compare the catalytic activity of the evaluated sites

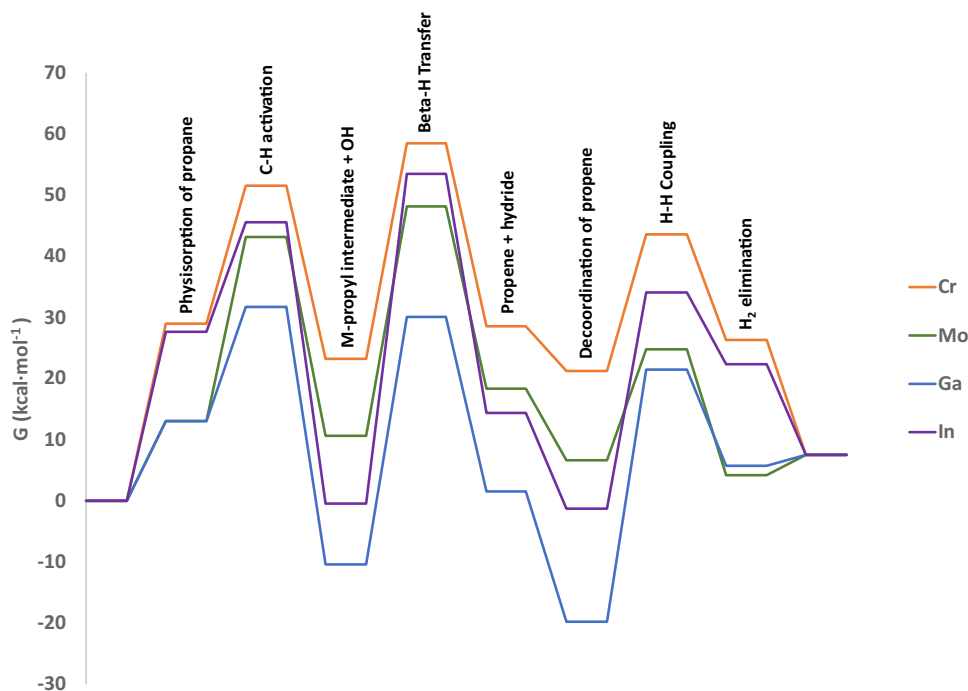
with the reported positive experimental TOF, we will use the above-mentioned equation to compare the catalytic activity of the four metal sites in a semiquantitative way, although the ΔG_r term is positive in our case. We refer the reader to our previous work for further details and discussion about the specificities and caveats of the application of the span model to the PDH reaction [28].

For the Cr(III)/SiO₂ single-site, the TDTS corresponds to the β -H transfer step, being located at +58.5 kcal mol⁻¹ with respect to initial reactants. Since all intermediates are less stable than initial reactants, the TDI species within the energetic span model corresponds to the origin of energies of the Gibbs energy profile (catalyst + reactants). Therefore, the value for the energetic span is equal to +58.5 kcal mol⁻¹, leading to a calculated TOF equal to 18.1 h⁻¹. Our calculated TOF agrees rather well with the initial turnover frequency (TOF) of 10.3 h⁻¹ reported experimentally for Cr(III)/SiO₂ at 550 °C and 1.5 bar [15].

The TDTS of the Mo(III)/SiO₂ single-site is the TS of the β -H transfer step, which is located at 48.1 kcal mol⁻¹ with respect to the initial reactants. Similar to Cr, the TDI in this case also corresponds to the origin of energies of the Gibbs energy profile. Therefore, taking the energetic span for Mo equal to 48.1 kcal mol⁻¹, leads to a rather high calculated TOF of 1.05 · 10⁵ h⁻¹.

The TDTS of the catalytic cycle for the evaluated Ga site corresponds to the C–H activation step located at 31.7 kcal mol⁻¹ in the Gibbs energy profile. In this case,

Fig. 5 Gibbs energy profile of the propane dehydrogenation reaction on the Cr, Ga, In and Mo single-sites on Silica (in kcal mol⁻¹). The Gibbs energy of all the species along the energy profile are referenced against the sum of the respective energy of the site and the energy of the propane molecule in the gas phase



the TDI of the catalytic cycle appears after the TDTS. The TDI corresponds to the gallium hydride species, with a relative energy equal to -19.8 kcal mol⁻¹ with respect to initial reactants. Thus, the energetic span after summing up the ΔG_r term ($+7.4$ kcal mol⁻¹) is equal to 58.9 kcal mol⁻¹ corresponding to a TOF of 14.2 h⁻¹. This result agrees well with the value reported experimentally for the Ga(III)/SiO₂ system, which took a value of 20.4 h⁻¹ at 550 °C [32].

Finally, for In(III)/SiO₂, the TDTS corresponds to the β -H transfer step, which is located at 53.5 kcal mol⁻¹ above initial reactants. In this case, two species compete as the TDI, the In-propyl species formed after the activation of the C–H bond of propane and the In–H species after propene decooordination. Both species have similar energies, being equal to -0.39 and -1.27 kcal mol⁻¹, respectively. After the application of the energetic span model [31] the former species is the TDI, *i.e.* the In-propyl species, located at -0.39 kcal mol⁻¹ in the Gibbs energy profile. Making this assumption, the energetic span is equal to 53.9 kcal mol⁻¹ and the calculated TOF takes a value of 3.02×10^2 h⁻¹.

Comparing the calculated TOF for all four metals on the evaluated sites, the obtained results suggest that the overall PDH activity follows the trend $Ga \approx Cr < In \ll Mo$. Therefore, the present study suggests In(III) and Mo(III) single-sites on SiO₂ could be potentially active catalysts for the PDH reaction, in particular Mo(III). One has to bear in mind, however, the following considerations: (i) the selectivity of the PDH reaction was not evaluated in the present work, but only the activity, (ii) the hypothetical In(III) and Mo(III)

sites should be synthesized and remain stable under reactions, and (iii) surface heterogeneity was not evaluated in depth in the present study since we only evaluated one M–O site on the SiO₂ amorphous model.

5 Conclusions

In the present work, we evaluated at theoretical level the reactivity of four M(III) sites (Cr, Mo, Ga and In) on an amorphous model on silica towards the propane dehydrogenation reaction (PDH). We considered three activated steps for the reaction, taking place on a M–O reactive pair: namely the C–H activation of propane, the β -H transfer step from the M-propyl intermediate generating M–H and propene, and the H–H coupling step, which forms H₂ and regenerates the initial M–O bond.

A comparison in reactivity among the four evaluated metals based on electronic energies shows that the most active centres towards the σ -bond metathesis of propane are the Lewis acidic Ga(III) and In(III) centres, while the least active ones are the Cr(III) and Mo(III) sites. Conversely, for the β -H transfer step, Cr and Mo have much lower Gibbs energy barriers than Ga and In centres. The H–H coupling step, *i.e.* the inverse of the σ -bond metathesis step has also much lower Gibbs energy barrier for Cr and Mo than for Ga and In.

When comparing the overall Gibbs energy profiles within the energetic span model for the four evaluated metals, the TDTS for Cr, Mo, and In is the β -H transfer step, while for Ga, it is the C–H activation step, which is located slightly higher than the β -H transfer in the Gibbs energy profile. Within the energetic span model, Cr and Ga are predicted to have similar catalytic activity with values in good agreement with the experimental results. Based on our results, In and Mo centers should have even higher activity, provided they are stable under reaction conditions and have high selectivity towards the desired products, *i.e.* propene and H₂.

5.1 Computational Methods

DFT calculations based on the Gaussian and plane waves (GPW) formalism [33] were carried out using the Quickstep (QS) module [34] of the CP2K program package [35, 36]. The functional chosen was PBE [37–39] with short range Gaussian double- ζ basis sets [40] optimized from molecular calculations. The energy cutoff of the auxiliary plane wave basis set was set to 500 Ry. Goedecker–Teter–Hutter pseudopotentials [41–43] were used. For the faster convergence of the wavefunction, the orbital transformation (OT) method was used [44, 45]. The OT method is based on a minimization of the energy functional using a new set of variables to perform orbital transformations. This method is demonstrated to be very efficient in comparison to diagonalisation/DIIS based methods, especially for large systems and basis sets. A tetragonal simulation box of base area 21.4 Å × 21.4 Å and thickness 34.2 Å (*ca.* 24 Å of which correspond to a vacuum slab added in order to avoid interactions between images in the *z* direction) was used [24]. Ground state structures were obtained by energy minimization with the BFGS algorithm [46–50]. Initial transition state guesses were generally obtained from CI-NEB [51–55] band calculations. Transition state structure optimizations were performed using the dimer method [56, 57] with the conjugate gradient optimizer and the two point based line search. It was further confirmed that TS structures actually corresponded to saddle points by frequency analysis via the finite difference method with a displacement equal to 0.01 bohrs. The Gibbs energies of the gas phase species was estimated by considering translational, rotational and vibrational degrees of freedom (DOF) at 550 °C and a pressure equal to 1 bar. All DOF of adsorbed species, including TSs, were treated as vibrational within the harmonic approximation under the same conditions to obtain the Gibbs energies. Thermal effects from the atoms of the catalysts were not considered.

Supplementary Information The online version contains supplementary material available at <https://doi.org/10.1007/s11244-021-01535-9>.

Acknowledgements CSP would like to acknowledge DST-India for an INSPIRE Faculty Fellowship with Award IFA-18 PH217 for funding. A.C.-V. acknowledges the Spanish MEC and the European Social Fund (Ramon y Cajal Fellowship: RyC-2016-19930) and the Spanish “Ministerio de Ciencia, Innovación y Universidades” (PGC2018-100818-A-I00) for financial support.

Funding Open Access Funding provided by Universitat Autònoma de Barcelona.

Declarations

Conflict of interest The authors declare no competing financial interests.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit <http://creativecommons.org/licenses/by/4.0/>.

References

1. Labinger JA, Bercaw JE (2002) *Nature* 417:507–514
2. Coperet C (2010) *Chem Rev* 110:656–680
3. Rascón F, Coperet C (2011) *J Organomet Chem* 696:4121–4131
4. Basset JM, Copéret C, Soulivong D, Taoufik M, Cazat JT (2010) *Acc Chem Res* 43:323–334
5. Malakoff D (2014) *Science* 344:1464–1467
6. Bruijninx PCA, Weckhuysen BM (2013) *Angew Chem Int Edit* 52:11980–11987
7. Wang Q, Chen X, Jha AN, Rogers H (2014) *Renew Sust Energ Rev* 30:1–28
8. Joskow PL (2015) *Econ Energy Env Pol* 4:1–4
9. Monai M, Gambino M, Wannakao S, Weckhuysen BM (2021) *Chem Soc Rev* 50:11503
10. Sattler JJHB, Ruiz-Martinez J, Santillan-Jimenez E, Weckhuysen BM (2014) *Chem Rev* 114:10613–10653
11. Sanfilippo D, Miracca I (2006) *Catal Today* 111:133–139
12. Docherty SR, Rochlitz L, Payard P-A, Copéret C (2021) *Chem Soc Rev* 50:5806–5822
13. Searles K, Chan KW, Mendes Burak JA, Zemlyanov D, Safonova O, Copéret C (2018) *J Am Chem Soc* 140:11674–11679
14. Payard PA, Rochlitz L, Searles K, Foppa L, Leuthold B, Safonova OV, Comas-Vives A, Copéret C (2021). *JACS Au* 1:1445–1458
15. Conley MP, Delley MF, Núñez-Zarur F, Comas-Vives A, Copéret C (2015) *Inorg Chem* 54:5065–5078
16. Searles K, Siddiqi G, Safonova OV, Coperet C (2017) *Chem Sci* 8:2661–2666
17. Cybulskis VJ, Pradhan SU, Lovón-Quintana JJ, Hock AS, Hu B, Zhang G, Delgass WN, Ribeiro FH, Miller JT (2017) *Catal Lett* 147:1252–1262
18. Copéret C, Estes DP, Larmier K, Searles K (2016) *Chem Rev* 116:8463–8505

19. Castro-Fernández P, Mance D, Liu C, Moroz IB, Abdala PM, Pidko EA, Copéret C, Fedorov A, Müller CR (2021) *ACS Catal* 11:907–924
20. Hu B, Schweitzer NM, Zhang G, Kraft SJ, Childers DJ, Lanci MP, Miller JT, Hock AS (2015) *ACS Catal* 5:3494–3503
21. Hu B, Bean Getsoian A, Schweitzer NM, Das U, Kim H, Niklas J, Poluektov O, Curtiss LA, Stair PC, Miller JT, Hock AS (2015) *J Catal* 322:24–37
22. Schweitzer NM, Hu B, Das U, Kim H, Greeley J, Curtiss LA, Stair PC, Miller JT, Hock AS (2014) *ACS Catal* 4:1091–1098
23. Estes DP, Siddiqi G, Allouche F, Kovtunov KV, Safonova OV, Trigub AL, Koptyug IV, Copéret C (2016) *J Am Chem Soc* 138:14987–14997
24. Comas-Vives A (2016) *Phys Chem Chem Phys* 18:7475–7482
25. Tielens F, Gierada M, Handzlik J, Calatayud M (2020) *Catal Today* 354:3–18
26. Delley MF, Praveen CS, Borosy AP, Núñez-Zarur F, Comas-Vives A, Copéret C (2017) *J Catal* 354:223–230
27. Floryan L, Borosy AP, Núñez-Zarur F, Comas-Vives A, Copéret C (2017) *J Catal* 346:50–56
28. Praveen CS, Borosy AP, Copéret C, Comas-Vives A (2021) *Inorg Chem* 60:6865–6874
29. Lillehaug S, Børve KJ, Sierka M, Sauer J (2004) *J Phys Org Chem* 17:990–1006
30. Delley MF, Silaghi M-C, Nuñez-Zarur F, Kovtunov KV, Salnikov OG, Estes DP, Koptyug IV, Comas-Vives A, Copéret C (2017) *Organometallics* 36:234–244
31. Kozuch S, Shaik S (2011) *Acc Chem Res* 44:101–110
32. Searles K, Siddiqi G, Safonova OV, Copéret C (2017) *Chem Sci* 8:2661–2666
33. Lippert G, Hutter J, Parinello M (1997) *Mol Phys* 92:477–488
34. VandeVondele J, Krack M, Mohamed F, Parrinello M, Chassaing T, Hutter J (2005) *Comp Phys Commun* 167:103–128
35. Hutter J, Iannuzzi M, Schiffmann F, Vande-Vondele J (2014) *Wiley Interdiscipl Rev* 4:15–25
36. CP2K version 2.5.1 (2014) <http://www.cp2k.org/>
37. Perdew JP, Burke K, Ernzerhof M (1996) *Phys Rev Lett* 77:3865–3868
38. Zhang Y, Yang W (1998) *Phys Rev Lett* 80:890–890
39. Perdew JP, Ruzsinszky A, Csonka GI, Vydrov OA, Scuseria GE, Constantin LA, Zhou X, Burke K (2008) *Phys Rev Lett* 100:136406
40. VandeVondele J, Hutter J (2007) *J Chem Phys* 127:114105
41. Goedecker S, Teter M, Hutter J (1996) *Phys Rev B* 54:1703–1710
42. Hartwigsen C, Goedecker S, Hutter J (1998) *Phys Rev B* 58:3641–3662
43. Krack M (2005) *Theor Chem Acc* 114:145–152
44. VandeVondele J, Hutter J (2003) *J Chem Phys* 118:4365
45. Weber V, VandeVondele J, Hutter J, Niklasson AMN (2008) *J Chem Phys* 128:084113
46. Broyden CG (1970) *Mathem Comp* 24:365–365
47. Goldfarb D (1970) *Mathem Comp* 24:23–23
48. Shanno DF, Kettler PC (1970) *Mathem Comp* 24:657–657
49. Nocedal J (1980) *Mathem Comp* 35:773–773
50. Liu DC, Nocedal J (1989) *SIAM J Sci Stat Comp* 10:1–17
51. Jónsson A, Minnhagen P, Nylén M (1994) *Phys Rev Lett* 72:1945–1945
52. Mills G, Jónsson H, Schenter GK (1995) *Surf Sci* 324:305–337
53. Jonsson H, Mills G, Jacobsen KW (1998) In: Berne BJ, Ciccotti G, Coker DF (eds) *Nudged elastic band method for finding minimum energy paths of transitions*. World Scientific, Singapore, pp 385–404
54. Henkelman G, Jónsson H (2000) *J Chem Phys* 113:9978
55. Henkelman G, Uberuaga BP, Jónsson H (2000) *J Chem Phys* 113:9901
56. Heyden A, Bell AT, Keil FJ (2005) *J Chem Phys* 123:224101
57. Kästner J, Sherwood P (2008) *J Chem Phys* 128:014106

Publisher's Note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.