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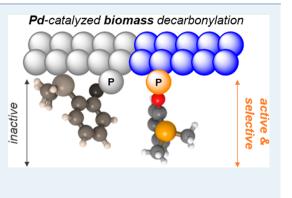
Creating Cavities at Palladium–Phosphine Interfaces for Enhanced Selectivity in Heterogeneous Biomass Conversion

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Supporting Information

ABSTRACT: Selective conversion of biomass-derived substrates in heterogeneous catalysis can be achieved through the functionalization of nanoparticles with surface modifiers (ligands). However, full understanding of reaction mechanisms at the atomic level of detail is still limited. Herein we rely on computational approaches to address this challenge. We employ Density Functional Theory to understand the role of phosphine-decorated palladium nanoparticles in the decarbonylation of fatty acids to produce linear α -olefins. While self-assembled monolayers of monodentate ligands completely passivate the metal surface, the flexibility of bidentate counterparts allows the creation of transient cavities that: (i) enhance selectivity and (ii) prevent catalyst deactivation. Such detailed insight provided by theory can pave the way for a rational design of metal–ligand interfaces in biomass upgrading.



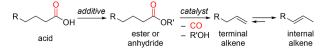
KEYWORDS: biomass, decarbonylation, density functional theory, metal-ligand interfaces, palladium, phosphine, selectivity

INTRODUCTION

Industrial processes are mainly dominated by heterogeneous catalysis. Nevertheless, the excellent activity and recyclability of these systems are sometimes tainted by poor selectivity. As a result, current efforts are heavily focused on the chemistry at the interface between metal nanoparticles and surface modifiers.^{1,2} The resulting ligand-decorated systems combine the advantages of heterogeneous systems with the selectivity of homogeneous counterparts.³ The most successful example is the selective semihydrogenation of alkynes using the Lindlar catalyst, consisting of Pd/CaCO₃, lead, and quinoline.⁴ More recently, the functionalization of metals with NanoSelect is producing highly active and selective nanostructured catalysts for a wide variety of applications.⁵ Selective modifiers^{6,7} can potentially: (i) block the catalytic site on the surface area thus controlling the catalytic ensemble, (ii) alter the properties of the metal–ligand boundaries, such as acidity,⁸ and (iii) impose steric and electronic effects⁹⁻¹¹ on reactants and products.

Due to their potential recyclability and selectivity, liganddecorated nanoparticles find a straightforward application on biomass upgrading,^{12,13} where *selective* deoxygenation is the key step.^{14–16} With readily available sources of vegetable oils and animal fats, we focus on the decarbonylation of fatty acids to yield linear α -olefins (LAOs),¹⁷ which are valuable materials in a myriad of applications, such as comonomers in polymerizations and precursors of surfactants and lubricants, among others.¹⁸ LAOs are usually prepared via ethylene oligomerization^{19,20} or Fischer–Tropsch processes,²¹ but the use of fatty acids allows direct access to odd numbered derivatives, which would be more expensive and less trivial to prepare otherwise. One big challenge of such a process is selectivity, in particular, precluding isomerization of the terminal alkene to the thermodynamically favored internal one (Scheme 1). Most

Scheme 1. Decarbonylation of Fatty Acids to Olefins via Ester or Anhydride Intermediates



homogeneously catalyzed systems are based on Pd–phosphine complexes and proceed through ester or anhydride intermediates. $^{22-30}$ In some cases, isomerization could be prevented by fine-tuning of ligands, 24,29,30 but CO inhibition might also become an issue. 31

Despite this early success, homogeneous catalysts lack recyclability, so the design of heterogeneous counterparts becomes quite appealing for industrial applications. Initial studies employed H₂ as coreactant, but that leads to product hydrogenation.^{32–36} Less attention has been drawn to H₂-free heterogeneous deoxygenation systems,¹⁶ where anhydrides have also been invoked as key intermediates.³⁷ Recent reports on decarbonylation processes are promising but still present low selectivity toward LAOs.^{38–40}

Inspired by homogeneous systems, Chatterjee and Jensen⁴¹ designed Pd/C catalysts functionalized with phosphine ligands. Interestingly, while the clean and monodentate-phosphine catalysts were inactive, the addition of bidentate phosphines completely changed the picture. At 250 °C, they obtained reasonable yields, LAO selectivities up to 98%, and no reactivity coming from leached species. Indeed, pioneer works by Fujihara and co-workers already reported Pd nanoparticles functionalized with bidentate phosphines for catalytic applications.^{42,43} In light on these experiments, we designed a computational study to address the Pd-phosphine interface at atomic level of detail to provide insight on activity and selectivity. Mechanistic studies have been reported for molecular catalysts,^{30,44,45} and Heyden and co-workers have extensively studied the decarbonylation of propanoic acid⁴⁴ and methyl propionate^{50,51} over Pd(111), Pd(211),^{52,53} and Ru(0001).⁵⁴ Some reports on adsorption of phosphines on Pd surfaces⁵⁵ and nanoclusters⁵⁶ exist, but little is known on how the reaction mechanism proceeds at such interfaces. To the best of our knowledge, this is the first computational approach of phosphine-decorated metal surfaces that fully addresses reactivity features at different coverages. Just a few reactivity studies can be found for P-functionalized Au-based systems.⁵⁷

Herein we simulate the decarbonylation of fatty acid derivatives to olefins on clean and phosphine-decorated Pd surfaces to unravel the role of ligands on activity and selectivity (Figure 1). We use pentanoic acid as model substrate to mimic

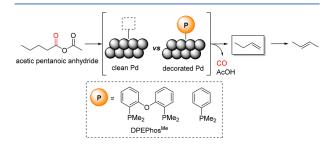


Figure 1. Heterogeneous Pd-catalyzed decarbonylation reaction under study.

long aliphatic chains. The product, 1-butene, is large enough to study the isomerization side reaction. As for ligands, we use DPEPhos^{Me} based on the best performing bidentate DPEPhos, and PPhMe₂ for the inactive monodentate PPh₃ (Figure 1), as experimentally reported.⁴¹

COMPUTATIONAL DETAILS

All calculations were performed at the Density Functional Theory (DFT) level of theory using the Vienna Ab-initio Simulation Package (VASP).^{60,61} The PBE functional⁶² was employed together with Grimme's D2 dispersion scheme⁶³ and our modified parameters for transition metals.⁶⁴ Core electrons were described by projector augmented wave (PAW) pseudopotentials⁶⁵ and valence electrons were represented by plane waves with a kinetic energy cutoff of 450 eV, as in previous related studies.^{8,46,50,59} Large Pd nanoparticles (~20 nm diameter)⁴¹ were described using Pd(111) slabs. We prepared p(4 × 4), p(5 × 5), and p(6 × 6) models to accommodate reactants and ligands. We used four-layer thick slabs, where the two upper layers were relaxed, and the two bottom ones were fixed to mimic the bulk. All reactants and

ligands were fully relaxed during geometry optimizations. The Brillouin zone for the $p(4 \times 4)$, $p(5 \times 5)$, and $p(6 \times 6)$ slabs was sampled by a $3 \times 3 \times 1$, $2 \times 2 \times 1$, and $2 \times 2 \times 1$ *k*-points mesh, respectively, generated through the Monkhorst-Pack method.⁶⁶ Density of states (DOS) were obtained with a denser $5 \times 5 \times 1$ *k*-points mesh. To avoid spurious interactions between the periodic images, a vacuum region between the slabs of 15 Å and dipole correction along z were included.⁶ Transition states (TSs) were located with the climbing image nudged elastic band⁶⁸ and improved dimer⁶⁹ methods. The assessment of the minima and transition states was performed by diagonalizing the numerical Hessian matrix obtained by ±0.015 Å displacements (metal and ligand atoms were fixed during frequency calculations). Normal modes associated with TS imaginary frequencies correspond with the chemical step described. Vibrational partition functions were computed for selected species using numerical frequencies (Γ -point) where all nonmetal atoms were relaxed (at 523 K). All frequencies below 200 cm⁻¹ were replaced by 200 cm⁻¹.⁷⁰ All inputs and final structures can be found in the ioChem-BD repository.^{71,72} 3D representations were prepared with the QuteMol visualization package.73

RESULTS AND DISCUSSION

We first present mechanistic studies using clean Pd(111) surfaces at low reactant coverage, **A**, and high reactant coverage, **B**. We then characterize phosphine-decorated Pd(111) surfaces, **C**, and evaluate them as potential active species during the catalytic cycle.

Reactivity on Clean Pd(111). Initially, we assume the in situ formation of acetic pentanoic anhydride³⁷ through the reaction of pentanoic acid with acetic anhydride. Similar to previous literature,⁴⁶ we compute the decarbonylation mechanism of one acetic pentanoic anhydride molecule on a clean Pd(111) surface **A** that minimizes close contacts between neighbors (i.e., a low coverage situation). The energy profile is presented in Figure 2. Initial adsorption of the anhydride is exothermic by 0.81 eV,^{74,75} where the aliphatic chain is interacting with the surface. The C–O bond breaking process has a barrier of 0.47 eV via **TS-A1** and gives rise to the acyl intermediate **A2** and adsorbed acetate (-1.49 eV). The

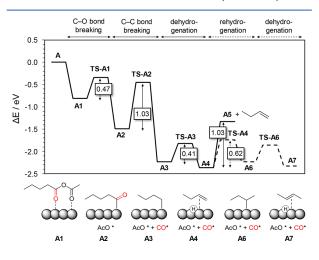


Figure 2. Decarbonylation (solid black line) and isomerization (dashed black line) mechanisms on clean Pd(111) A surfaces. Asterisks represent adsorbed species.

subsequent C–C bond breaking entails 1.03 eV via **TS-A2** and produces the alkyl intermediate **A3** and CO (-2.23 eV). An alternative mechanism involving α -carbon dehydrogenation⁴⁶ can be consulted in Figure S1 of the Supporting Information (SI). Then, **A3** quickly undergoes dehydrogenation via **TS-A3** with a barrier of 0.41 eV. Alkene release from **A4** to **A5** takes 1.03 eV, but terminal (**A4**) to internal (**A7**) alkene isomerization appears as a competitive process with a barrier of 0.62 eV via **TS-A4**.

The energy profile estimates an overall energy barrier of 1.03 eV and predicts a rather facile alkene isomerization involving 0.62 eV. At 250 °C, the reaction temperature, such barriers should be easy to overcome. However, catalytic runs using clean Pd/C (i.e., in the absence of phosphine ligands) report no reaction with recovery of starting materials.⁴¹

According to experiments, Pd is added in 1% mol and the resulting nanoparticles are very large (~20 nm diameter). Therefore, we would expect a large ratio between reactants and *accessible* (first surface layer) Pd atoms; in other words, a high coverage scenario. We then assume that acid molecules first cover the Pd surface, as acetic anhydride is added in a later step.⁴¹ We design a $p(4 \times 4)$ Pd(111) slab B (Figure 3) with

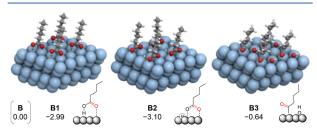


Figure 3. Adsorption energies (eV) of all four molecules for the high coverage model B. (Pd = light blue, O = red, C = gray, H = white).

four pentanoic acid molecules **B1** to model a self-assembled monolayer (SAM). The adsorption of reactants is highly exothermic at -2.99 eV.^{76} The adsorption energy per acid molecule, -0.75 eV, is similar to that of a single anhydride molecule in **A1**, -0.81 eV. The acidic hydrogen of the OH group dissociates to form **B2** at -3.10 eV. These values suggest that the initial full coverage of Pd by acid molecules might prevent further reaction with the acetic anhydride coreactant. Moreover, the C–O bond breaking step to access the key acyl intermediate, **B3**, is significantly endothermic, demanding 2.46 eV above **B2**. According to these results, the excess of acid prevents the decarbonylation step from a thermodynamic point of view, thus no alkene product should be observed.

Phosphine Self-Assembled Monolayers on Pd(111). Due to the large excess of reactant and ligand molecules compared to accessible metal atoms, we would expect a full coverage of Pd surfaces. The characterization of SAMs is quite important as such high coverage situations decide the fate of the active sites of the catalyst.⁷⁷ As seen below, the adsorption of phosphines is preferred over acid molecules, thus we design a model to reproduce phosphine SAMs over Pd.

We first calculate the interaction of different phosphines (PMe₃, PPhMe₂, PPh₃, and DPEPhos^{Me}) with $p(5 \times 5)$ Pd(111) to evaluate the contributions of ligands to the adsorption energy. PMe₃ binds to the surface through the P atom with an energy of -2.33 eV, and PPhMe₂ does the same through the P atom and the phenyl group with an energy of -3.54 eV. These data indicate that the major contribution is

coming from the formation of Pd…P interactions, although phenyl adsorption is also significant. Interestingly, differences in hydrogenation activity for aryl- and alkyl-derived phosphines have been noted in Ru-decorated nanoparticles.⁷⁸ The adsorption energy of PPh₃ (-3.73 eV) is quite similar to that of PPhMe₂ (-3.54 eV). Lastly, the bidentate DPEPhos^{Me} binds to the surface through two P atoms and one phenyl group, and thus an expected larger adsorption energy of -4.77 eV is found.

To properly design a model for a high coverage scenario, we now adsorb up to two DPEPhos^{Me} ligands on different Pd(111) slab sizes. Adsorption of one ligand on $p(4 \times 4)$, $p(5 \times 5)$, and $p(6 \times 6)$ takes -3.56, -4.77, and -4.83 eV, respectively. Looking at adsorption energies per area, we obtain -0.033, -0.029, and -0.020 eV $Å^{-2}$, respectively. We then add an additional ligand molecule to these slab models. While the second phosphine does not fit on $p(4 \times 4)$, it does on $p(5 \times 5)$ and $p(6 \times 6)$ with overall adsorption energies of -8.80 and -9.30 eV, respectively, and overall adsorption energies per area of -0.053 and -0.039 eV Å⁻², respectively. The adsorption energies of two bidentate phosphines are less than twice that of one, so we expect no cooperative effect between ligands. According to energetics, the $p(5 \times 5)$ slab with two phosphine ligands arises as the most stable structure at high coverage, and we therefore use this model for our following studies.

Figure 4 depicts the Pd(111) surface with two DPEPhos^{Me} ligands, namely C. Interestingly, these phosphines completely

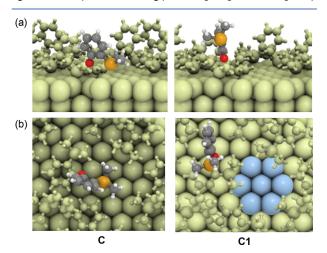


Figure 4. Side (a) and top (b) views of fully coordinated C (left) and partially coordinated C1 (right) surfaces with DPEPhos^{Me}. (Accessible Pd = light blue, P = orange, O = red, C = gray, H = white).

cover the metal surface and block access to reactants molecules. At this stage, we propose a partial decoordination^{79,80} of one of the phosphine arms to create a *cavity*, or binding pocket, on the surface. The proposed structure, **C1** in Figure 4, was found at 1.24 eV⁸¹ above **C** and should be accessible under experimental conditions (250 °C).⁸² Indeed, the hemilabile behavior of these ligands have been reported in homogeneous systems.^{30,83} In the gas phase, the relaxed conformation of the phosphine coming from **C1** is only 0.20 eV less stable than that coming from **C**. It is clear than the energy toll essentially emerges from the loss of Pd…P and Pd…C interactions after partial decoordination. Additionally, starting from the DPEPhos^{Me} model, we included two Ph groups in the P atom that detaches from the surface to better mimic the complete DPEPhos ligand. The energy difference between these species, **D** and **D1**, is now 0.85 eV.

This value is somehow lower than that of DPEPhos^{Me} species C and C1 (1.24 eV). This result might be related to: (i) the slightly more electron-donor character of alkyl phosphine (C) compared to aryl ones (D) and (ii) the liberation of bulkier Ph groups (cf. Me).

An interesting feature of experiments is that systems containing monodentate phosphines, such as PPh₃, do not perform well.⁴¹ Thus, we also modeled a SAM of PPhMe₂ as model for PPh₃. Using the same $p(5 \times 5)$ as before, we adsorb three ligands to obtain a fully covered surface, E. In contrast to C, which only requires partial decoordination to expose surface atoms in C1 via 1.24 eV, E requests the full desorption of one PPhMe₂ ligand via 2.61 eV to form E1. Even though the latter process should be entropically favored, it is still quite demanding compared to that involving the bidentate ligand.

To sum up, the lack of flexibility of monodentate phosphines explains the poor catalytic performance of these systems, since the metal surface is essentially poisoned by these ligands. However, the chelating features of bidentate phosphines allow the creation of transient cavities at the metal—ligand interface. In the next section, we will evaluate whether such surface sites, as those found in C1, are active and kinetically relevant during the catalytic cycle.

Reactivity on Phosphine-Decorated Pd(111). Similarly to clean Pd(111) (Figure 2), we compute the decarbonylation mechanism of acetic pentanoic anhydride to 1-butene on a phosphine-decorated Pd(111) surface. Since the adsorption energy of the phosphine is significantly larger than that of the acid, the metal surface is first covered by phosphine ligands, allowing fatty acids to react with acetic anhydride to form mixed anhydride intermediates.³⁷ The energy profile is shown in Figure 5, where we consider the previously discussed C1

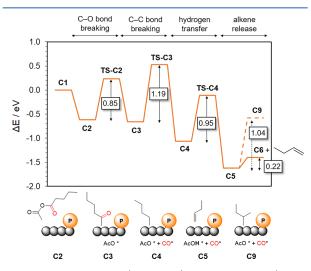


Figure 5. Decarbonylation (orange line) and isomerization (dashed orange line) mechanisms on phosphine-decorated Pd(111) C surfaces. Asterisks represent adsorbed species.

structure as starting point. Adsorption of pentanoic anhydride forms C2 at -0.62 eV. Due to the constrained pocket, the aliphatic chain does not interact with the metal surface but the organic groups from the nearby ligands. The C–O bond breaking of the anhydride (and concomitant formation of acetate) via TS-C2 involves 0.85 eV. The resulting acyl intermediate C3 goes through a C–C bond breaking process via TS-C3 (Figure 6 left) with a barrier of 1.19 eV⁸⁴ to produce

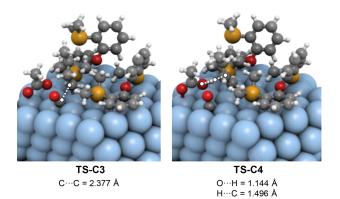


Figure 6. Transition states TS-C3 (C–C bond breaking) and TS-C4 (hydrogen transfer) for the phosphine-decorated Pd(111) C surface. (Pd = light blue, P = orange, O = red, C = gray, H = white). Key distances are shown with dashed white lines.

C4 and CO. 85 The alkyl intermediate should then undergo dehydrogenation to form the corresponding olefin product. However, hydrogen transfer from the alkyl group to the metal surface appears to be challenging⁸⁶ as most of Pd atoms are already interacting with adsorbed species (phosphines, acetate, or CO). Instead, the acetate bound to the surface acts as an internal base⁴⁴ and deprotonates the alkyl group via TS-C4 (Figure 6 right) with a barrier of 0.95 eV. Quite remarkably, the resulting alkene product C5 does not bind in a parallel fashion as in the clean surface (A4 and A7, Figure 2). Due to the steric hindrance imposed by the phosphine cavity, the π -system is found perpendicular to the surface, and the alkene desorption via C6 becomes essentially barrierless (0.22 eV above C5). Alkene isomerization would entail the transient formation of a secondary alkyl intermediate (analogue to A6). Such structure, C9, is found at 1.04 eV above C5, which further rules out the isomerization process.

Discussion. We find three major differences between the energy profiles of clean A (Figure 2) and phosphine-decorated C (Figure 5) systems. First, the C–C bond scission via TS-A2 demands 1.03 eV, while the same process via TS-C3 takes 1.19 eV. The larger energy barrier for system C is in line with the presence of ligands on the surface; in other words, the metal atoms on the surface are more coordinated and, therefore, less reactive. This is nicely reflected on the higher Pd d-band $center^{87,88}$ of clean Å, $-1.77\,$ eV, compared to that of phosphine-decorated C1, -1.84 eV. In the same line, the dehydrogenation via TS-A3 (0.41 eV) is significantly less demanding than the acetate-assisted hydrogen transfer via TS-C4 (0.95 eV). This is yet another feature of the highly functionalized surface, where little room is left for hydrogen adsorption on the decorated surface. Finally, we observe an opposite trend for the alkene desorption step. Clean A releases 1-butene via 1.03 eV and isomerizes it to 2-butene via 0.62 eV, while phosphine-decorated C1 desorbs the alkene in a barrierless step. The steric hindrance of the metal-phosphine interface pushes away the product and plays a beneficial role driving the reaction toward the linear α -olefin.

Previous DFT studies in homogeneous Pd catalysts^{30,44} suggested dehydrogenations as rate-determining TSs, while the present work on Pd(111) surfaces points toward the C–C bond breaking process (**TS-C3**). Interestingly, the relative activation energies for dehydrogenation (from the prior alkyl intermediate to the corresponding TS) are quite similar for

both systems, i.e., 1.05 eV in ref 44 and 0.95 eV from C4 to TS-C4. The main difference thus comes from the ability of metal surfaces to stabilize alkyl intermediates. While the formation of alkyl intermediates is systematically endothermic in molecular catalysts (+0.33 eV in ref 44), that process is exothermic on Pd(111) surfaces (-0.74 eV from A2 to A3 and -0.40 eV from C3 to C4). In other words, the highest point of homogeneous energy profiles usually corresponds to the dehydrogenation step due to the energy penalty required to form unstable alkyl intermediates.

We then consider the role of the ligand in catalyst deactivation.⁸⁹ The major byproduct of the reaction is CO, which is known to bind strongly to Pd. As expected, direct CO release from A4 requires 2.29 eV. This poison effect is indeed similar to that for PPhMe₂ release (2.61 eV) but still significantly larger than that for DPEPhos^{Me} partial decoordination (1.24 eV). For phosphine-decorated surfaces, we also considered CO release in an earlier stage of the reaction, that is, after the formation of the alkyl intermediate C4. However, this desorption energy was still large, 2.00 eV (Figure 7, left). Thus,

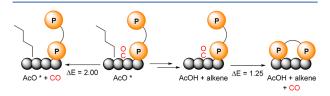


Figure 7. CO release (eV) on phosphine-decorated Pd(111) C surfaces.

in the presence of bidentate ligands, we propose a displacement of CO by the dangling phosphine arm. The CO-by-P exchange in the phosphine-decorated system only takes 1.25 eV (Figure 7, right), in line with the experimental detection of CO under reaction conditions.⁴¹

These general concepts on decorated surfaces can impact other biomass-related processes.^{90–92} Looking into the related furfural decarbonylation (Figure 8), we predict a barrier of 0.59

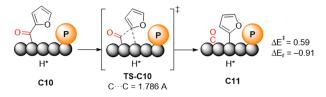


Figure 8. Furfural decarbonylation step (eV) on phosphine-decorated Pd(111) C surfaces.

eV for the C–C bond scission step at the Pd–phosphine interface in C1, which is comparable to previous data on clean Pd (0.68 eV^{93,94}). In this scenario, we also expect an enhanced CO release promoted by bidentate phosphines (Figure 7, right), which might prevent deactivation channels via CO poisoning.

Overall, we identify two main roles of bidentate ligands: (i) creation of reactive pockets that avoid alkene coordination and enhance selectivity, and (ii) displacement of CO, which attenuates surface CO poisoning and drives the reaction toward high conversions. On the basis of these results we enunciate some qualitative guiding rules to design metal–phosphine interfaces: (i) ligand adsorption should predominate over reactant adsorption on the metal surface to ensure that

ligands are not released during operation;^{80,95} (ii) a dynamic bidentate ligand is necessary to avoid complete passivation of the surface as found for monodentate derivatives; and (iii) sizable yet labile groups attached to phosphorus are recommended, so the freshly formed cavity is large enough to bind reactant molecules.

Homogeneous catalysis usually focuses on fine-tuning of ligands. In that sense, we devise that other bidentate ligands, such as those reported for Pd-catalyzed carbonylation of olefins, 96,97 might be of relevance for these types of transformations. However, heterogeneous catalysis mostly performs screening of metal surfaces.⁹⁸ In this work, we identify the need for a rational design of *interfaces* to control both activity and selectivity. Current efforts are underway in our laboratories.

CONCLUSIONS

In this contribution, we have computationally elucidated the role of phosphine–decorated Pd(111) catalysts in biomassderived decarbonylation transformations. Self-assembled monolayers of monodentate phosphines block the metal surface, in line with the poor activity experimentally observed. On the contrary, the inherent dynamics of bidentate ligands allows the creation of transient *cavities* that are kinetically relevant in the catalytic cycle. These highly crowded surface sites induce a rapid product release and preclude undesired side reactions. The flexibility of phosphine arms further promotes CO desorption, thus reducing surface poisoning. The unique nature of these systems holds promise for a rational design of metal– ligand interfaces and applications to other biomass-related processes.

ASSOCIATED CONTENT

Supporting Information

Alternative mechanism on A, energies and coordinates (PDF)

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Notes

The authors declare no competing financial interest.

ACKNOWLEDGMENTS

M.A.O. and N.L. acknowledge MINECO (CTQ2015-68770) for financial support and BSC-RES for computational resources. M.A.O. also acknowledges the "Juan de la Cierva–Incorporación" postdoctoral program (IJCI-2016-29762).

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