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A Multitechnique Study of C_2H_4 Adsorption on $Fe_3O_4(001)$

Lena Puntscher,[⊥] Panukorn Sombut,[⊥] Chunlei Wang, Manuel Ulreich, Jiri Pavelec, Ali Rafsanjani-Abbasi, Matthias Meier, Adam Lagin, Martin Setvin, Ulrike Diebold, Cesare Franchini, Michael Schmid, and Gareth S. Parkinson*

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ABSTRACT: The adsorption/desorption of ethene (C_2H_4) , also commonly known as ethylene, on $Fe_3O_4(001)$ was studied under ultrahigh vacuum conditions using temperature-programmed desorption (TPD), scanning tunneling microscopy, X-ray photoelectron spectroscopy, and density functional theory (DFT)-based computations. To interpret the TPD data, we have employed a new analysis method based on equilibrium thermodynamics. C2H4 adsorbs intact at all coverages and interacts most strongly with surface defects such as antiphase domain boundaries and Fe adatoms. On the regular surface, C_2H_4 binds atop surface Fe sites up to a coverage of 2 molecules per ($\sqrt{2} \times$ $\sqrt{2}$ R45° unit cell, with every second Fe occupied. A desorption energy of 0.36 eV is determined by



analysis of the TPD spectra at this coverage, which is approximately 0.1-0.2 eV lower than the value calculated by DFT + U with van der Waals corrections. Additional molecules are accommodated in between the Fe rows. These are stabilized by attractive interactions with the molecules adsorbed at Fe sites. The total capacity of the surface for C_2H_4 adsorption is found to be close to 4 molecules per $(\sqrt{2} \times \sqrt{2})$ R45° unit cell.

1. INTRODUCTION

Iron oxides are some of the most abundant materials on earth. Their primary usage is as a feedstock for the steel industry, but their low toxicity, natural abundance, and magnetic properties make them popular in many applications. In catalysis, iron oxides serve as an active component for processes such as Fischer-Tropsch synthesis and the water-gas shift reaction. They are also frequently utilized as a robust, inexpensive, reducible support for precious metal nanoparticle catalysts.

In recent years, the field of "single-atom catalysis" (SAC) has emerged as an intensely studied topic in catalysis research, and iron oxides continue to be a common choice of support material.⁴⁻¹⁰ Such catalysts are typically prepared by coprecipitation, and the support is nominally an Fe₂O₃ powder. Nevertheless, it is often labeled FeO_x to reflect that the oxide, and especially its surface, is reduced when the catalyst is activated by heating in CO or H_2 . In recent years, we have utilized $Fe_3O_4(001)$ as a model support to study fundamental processes in single-atom catalysis. This work is enabled by a $(\sqrt{2} \times \sqrt{2})$ R45° surface reconstruction, based on an ordered array of subsurface interstitials and vacancies,¹¹ which stabilizes adsorbed transition metal cations up to temperatures as high as 700 K.¹²⁻¹⁷

To date, one of the major applications of SAC has been the hydrogenation of alkenes.^{18,19} There is also evidence that SAC can selectively catalyze the hydroformylation of alkenes to aldehydes.^{20,21} This reaction is usually catalyzed by coordination complexes in solution. The heterogenization of reactions currently performed by homogeneous catalysts is a particularly exciting target for SAC research.^{22–24} However, prior to studying the role of single atoms in catalyzing complex

multireactant processes, it is important to understand how the individual reactants interact with the support.

In this paper, we study how the simplest alkene, C_2H_4 , interacts with the $Fe_3O_4(001)$ surface. This work follows up on a recent study by Lee et al.,²⁵ who performed TPD and XPS measurements of C_2H_2 , C_2H_4 , and C_2H_6 on $Fe_3O_4(001)$ and concluded that C₂H₄ physisorbs weakly (adsorption energies between 0.29 and 0.41 eV) with four desorption peaks within the first monolayer. We reproduce the TPD data for C2H4 here, with the addition of three additional peaks at low temperature that are accessible due to the lower adsorption temperature employed in our measurements. Moreover, we supplement these data with STM images and DFT + U calculations and show how it is that the molecules are accommodated on the $Fe_3O_4(001)$ surface. Specifically, we show that C₂H₄ preferentially adsorbs at defects including antiphase domain boundaries, and then atop surface Fe³⁺ atoms up to a coverage of 2 molecules per $(\sqrt{2} \times \sqrt{2})$ R45° unit cell. Additional C₂H₄'s are stabilized between the Fe rows through attractive intermolecular interactions up to a coverage of 4 C_2H_4 molecules per $(\sqrt{2} \times \sqrt{2})R45^\circ$ unit cell.

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2. EXPERIMENTAL AND COMPUTATIONAL DETAILS

The experiments were performed on natural Fe₃O₄(001) crystals ($6 \times 6 \times 1$ mm, SurfaceNet GmbH). The samples were prepared in ultrahigh vacuum (UHV) by cycles of sputtering followed by annealing at 923 K for 20 min. For the STM experiment, we used 10 min of 1 keV Ar⁺ sputtering with a target current of 0.8 μ A. For the TPD/XPS experiments, we used 10 min of 1 keV Ne⁺ sputtering with a target current of 1 μ A. After every other cycle, the sample was oxidized by exposure to O₂ during annealing (2×10^{-6} mbar O₂, 20 min), which leads to the growth of a pristine Fe₃O₄(001) surface by migration of interstitial Fe from the sample bulk to the surface.²⁶

Two separate UHV setups were used to carry out the experiments. The STM data were acquired in a two-vessel UHV chamber consisting of a preparation chamber ($p < 10^{-10}$ mbar) and an analysis chamber ($p < 2 \times 10^{-11}$ mbar). The analysis chamber is equipped with a Tribus STM head (Sigma Surface Science) and a low-noise in-vacuum preamplifier.²⁷ The STM measurements were conducted in constant current mode with an electrochemically etched W tip. The STM images were corrected for distortion and creep of the piezo scanner as described in ref 28. C₂H₄ (Messer, 99.95%) was leaked into the analysis chamber at various pressures (up to a maximum of 5×10^{-9} mbar) through an open door in the thermal shield of the liquid-nitrogen-cooled STM head. The sample was held at 78 K. In experiments where a colder sample temperature was required, the nitrogen in the cryostat was pumped. This way a temperature of 68 K could be reached. The gas doses given for these STM experiments were measured in the analysis chamber; those at the sample are likely lower than the measured values. For adsorption, the tip was lifted to avoid shadowing the incoming molecules; thus, images for different gas doses do not show the same position on the sample.

The TPD and XPS spectra were obtained in a second vacuum system optimized to study the surface chemistry of single-crystal metal-oxide samples. The samples are mounted on a Ta backplate using Ta clips, with a thin Au sheet in between to aid the thermal contact. The sample is cooled using a liquid-He flow cryostat and can be counter heated to the dosing temperature (60 K) or higher temperatures via resistive heating of the Ta backplate.²⁹ The vacuum system is equipped with a home-built effusive molecular beam source based on an orifice with effective diameter 38.0 \pm 1.9 μ m, which delivers a close to top-hat profile at the sample with a 3.5 mm diameter and beam core pressure of $3.0 \pm 0.3 \times 10^{-8}$ mbar at the sample position.^{29,30} The base pressure in the chamber is below 10^{-10} mbar. A quadrupole mass spectrometer (Hiden HAL 3F PIC) is used in a line-of-sight geometry for TPD experiments, and a monochromatized Al/Ag twin anode X-ray source (Specs XR50 M, FOCUS 500) and a hemispherical analyzer (Specs Phoibos 150) are used for XPS measurements. The energy scale is calibrated after each bakeout using copper, silver, and gold foils attached to the cryostat. A complete description of the chamber design and capabilities is given in ref 29.

The Vienna *ab initio* Simulation Package (VASP) was used for all DFT calculations.^{31,32} We adopted the strongly constrained and appropriately normed meta-generalized gradient approximation (SCAN)³³ with the inclusion of van der Waals interactions (rVV10)³⁴ and an on-site Coulomb repulsion term $U_{\rm eff} = 3.61 \ {\rm eV}^{35,36}$ for Fe atoms to model the oxide. The surface calculations are based on the subsurface cation vacancy (SCV)-reconstructed model of the $Fe_3O_4(001)$ surface,¹¹ using the Γ -point only for the $(2\sqrt{2} \times 2\sqrt{2})$ R45° supercell. Calculations were performed with the experimental magnetite lattice parameter (a = 8.396 Å) using an asymmetric slab with 13 planes (7 planes with octahedral Fe and 6 with tetrahedral Fe; the bottom 9 planes are fixed, and only the 4 topmost planes relaxed) and 14 Å vacuum. Convergence is achieved when an electronic energy step of 10^{-6} eV is obtained, and forces acting on ions are smaller than 0.02 eV/Å, with the plane-wave basis cutoff energy set to 550 eV. Note that the SCV reconstruction is oxidized with respect to bulk Fe_3O_4 , and that all Fe in the outermost 4 layers are Fe^{3+} like. Consequently, there is a small bandgap in the surface layers. The Fe₃O₄ bulk also exhibits a small bandgap in our setup and thus represents the sub-Verwey transition (<125 K) phase.³⁷

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The average adsorption energy per C_2H_4 molecule is computed according to the formula

$$E_{\text{ads,a}} = (E_{\text{Fe}_{3}\text{O}_{4}} + n\text{C}_{2}\text{H}_{4}} - (E_{\text{Fe}_{3}\text{O}_{4}} + nE_{\text{C}_{2}\text{H}_{4}}))/n$$
(1)

where $E_{\text{Fe}_3\text{O}_4 + n\text{C}_2\text{H}_4}$ is the total energy of the Fe₃O₄(001) surface with adsorbed C₂H₄, $E_{\text{Fe}_3\text{O}_4}$ is the total energy of the clean Fe₃O₄(001) surface, the $E_{\text{C}_2\text{H}_4}$ represents the energy of the C₂H₄ molecule in the gas phase, and *n* is the number of C₂H₄ molecules.

The average adsorption energy corresponds to the stability of the system and is used as a search criterion to determine the lowest-energy configuration for a given coverage. However, the average adsorption energy is not what is observed experimentally in a TPD experiment. Rather, the peaks in TPD correspond to the energy required to remove the most weakly bound molecule from a given configuration, i.e., the differential adsorption energy. We define the differential adsorption energy accordingly to eq 2:

$$E_{\text{ads,d}} = E_{\text{Fe}_{3}\text{O}_{4} + n\text{C}_{2}\text{H}_{4}} - (E_{\text{Fe}_{3}\text{O}_{4} + (n-1)\text{C}_{2}\text{H}_{4}} + E_{\text{C}_{2}\text{H}_{4}})$$
(2)

where we assume that the system starts with the lowest-energy configuration for n molecules, and the nondesorbing molecules are able to freely relax and reach the new n - 1 lowest-energy configuration without hindrance (such as barriers). This assumption should be fulfilled, since the rearrangement of the remaining molecules is limited to rotations and minor relaxations; no major rearrangement is necessary. The calculated C 1s core-level binding energies are calculated in the final state approximation.³⁸

3. RESULTS

3.1. Temperature-Programmed Desorption. Figure 1 shows a series of TPD spectra for various initial coverages of $0.3-12.7 \text{ C}_2\text{H}_4$ molecules per $(\sqrt{2} \times \sqrt{2})\text{R45}^\circ$ unit cell. The absolute coverages were determined using the known flux of the molecular beam, the dosing time, and the experimentally determined coverage-dependent sticking coefficient determined using the King and Wells method.³⁹ The sticking probability is initially 0.975 at 60 K but increases quickly to unity as molecules accumulate on the surface (see Figure S1). In total, 7 desorption features are observed due to desorption of molecular C₂H₄ from Fe₃O₄(001). The two peaks in the range 70–75 K, labeled α and β in Figure 1, are attributable to C₂H₄ multilayer desorption. The peaks at higher temperatures, labeled γ - η , originate from the first monolayer. We also observe



Figure 1. TPD spectra for coverages ranging from 0 to 12.7 C_2H_4 molecules per Fe₃O₄(001) surface unit cell. C_2H_4 was dosed at 60 K using a molecular beam, and the TPD spectra were acquired using a temperature ramp of 1 K/s. Seven desorption features are labeled α - η . Peaks α and β result from desorption from multilayer C_2H_4 , while γ , δ , and ε originate from the first monolayer. The ζ and η peaks are due to adsorption at surface defects. The desorption feature at 215 K is an experimental artifact caused by adsorption of C_2H_4 on the Ta sample plate.

a desorption signal at 215 K that is already present for zero nominal dose and does not saturate with increasing coverage. Tests showed that C_2H_4 desorbs from the Ta backplate at this temperature, so we conclude this to be an experimental artifact originating primarily from adsorption of C_2H_4 outside the beam spot due to a slight increase of the C_2H_4 partial pressure during the TPD series. Consequently, we subtracted the spectrum for zero dose from all other datasets shown in Figure 1. Overall, our TPD data for the C_2H_4 system resemble those published recently by Lee et al.²⁵ for the same system, although the α , β , and γ peaks are not visible in ref 25 because the dosing temperature (≈ 80 K) was higher than employed here. Also, the shoulder we observe at 125-135 K (ζ) is a clear peak in the dataset acquired by Lee et al.²⁵ In what follows, we discuss the TPD peaks in descending temperature order.

The TPD data for the lowest exposure performed (0.3 molecules per unit cell, which corresponds to 0.075 molecules per surface Fe atom) already contain the η peak at ≈ 160 K and the onset of the ζ shoulder. Given the low coverage, these peaks must correspond to defects on the $Fe_3O_4(001)$ surface. The η peak exhibits the typical behavior for a strongly binding defect site, saturating already at a low coverage and remaining at this intensity as the coverage is increased. The ζ shoulder around 130 K is peculiar for two reasons. First, it exhibits different intensities for different samples. In Figure S2, we show a TPD curve acquired on a different sample in our setup, where this peak is significantly larger, and the data more closely resemble that shown by Lee et al.²⁵ Second, as already noted by Lee et al.,²⁵ this feature does not completely saturate prior to the onset of the ε peak. We will revisit the likely origin of the ζ peak in the discussion section.

The ε peak emerges at 115–120 K and shifts to lower temperatures with increasing coverage, eventually saturating with a maximum at 110–115 K for a coverage of 2.2 (±0.2) C_2H_4 per unit cell. Next, two very sharp peaks, δ and γ , emerge, which saturate close to 3.0 (±0.3) and 4.1 (±0.4) C_2H_4 per unit cell, respectively. As the coverage increases, there is nonzero desorption rate, which rapidly shifts to lower coverage (typical for a compression close to monolayer coverage), before the onset of the multilayer peaks. The multilayer region contains two peaks, α and β . The β peak emerges first (blue curves in the inset in Figure 1) and saturates at a coverage of 8.4 (±0.8) C₂H₄ molecules per unit cell (equivalent to approximately 2 layers of ethylene). For higher coverages, it is replaced by the α peak (red curves in the inset of Figure 1), which grows in intensity as the coverage is increased. Both multilayer peaks, α and β , exhibit the regular zero-order profile typical of multilayer desorption.

To further interpret the TPD data, we have employed a new analysis program fully described in ref 40. The procedure is based on equilibrium thermodynamics and builds on the approach pioneered by Kreuzer.⁴¹ Note that this method does not attempt to determine a pre-exponential factor from experiment, but rather calculates the relevant quantities from thermodynamics. This analysis method is based on a gedankenexperiment where one holds the TPD ramp at any temperature and supplies a gas with the right pressure to establish adsorption-desorption equilibrium. Then, at this temperature, the chemical potential values of the (hypothetical) gas phase and that of the adsorbate (at the given coverage) are equal. The chemical potential of the gas phase can be easily calculated, that of the adsorbates depends on the adsorption energy and configurational and vibrational entropy of the adsorbate. This allows us to determine the adsorption energies.

In our TPD analysis, the adsorbates are treated as a lattice gas (diffusion barrier well above $k_{\rm B}T$) on a surface containing a distribution of different adsorption sites. As the analysis is based on equilibrium thermodynamics, it requires that adsorbate diffusion is much faster than desorption, to establish equilibrium between the adsorbates. This condition is usually fulfilled for nearby adsorption sites, but not necessarily for different surface areas with a large separation, i.e., large domains or crystallites with different structures. The analysis does not explicitly take interactions between adsorbates into account; nevertheless, short-range repulsion is modeled as the occupation of sites with steadily weaker adsorption energy as the coverage increases. Our model does not include attractive interactions. These are usually recognizable by the experimental TPD peaks being sharper than the simulated ones.

The energy and entropy of the adsorbates are influenced by the low-frequency vibrational modes, i.e., the hindered translation and rotation modes, which can be determined by DFT. Specifically, our calculations in the limit of low coverage yield $h\nu = 4.5, 7.8, 11.0, 14.0, 15.8, and 19.1$ meV for these modes. Since the influence of the vibrations on the adsorption energies is only about 5%, we neglect the coverage dependence of the vibration frequencies. The results presented here assume Langmuirian sticking with an initial (low-coverage) sticking coefficient of $s_0 = 1$, but the calculated adsorption energies change by less than 3% if we instead assume either a coverageindependent sticking coefficient close to unity (as observed in our experiments during adsorption at low temperatures) or $s_0 =$ 0.3. The adsorption energy distribution is obtained from the TPD curve at saturation coverage (i.e., the 4.1 (± 0.4) molecules per unit cell), excluding the multilayer peaks.

Since the experimental TPD curves show a slight increase of the intensity with coverage at temperatures above 150 K, which we attribute to readsorption of desorbed gas from the sample on the Ta backplate, we have corrected the input for the TPD analysis program by subtracting this linear coverage dependence at high doses (apart from the noise of the experimental data, the black curve at T > 150 K in Figure 2b is identical to the corrected TPD spectrum).



Figure 2. Analysis of the TPD spectra using the method presented in ref 40. (a) Distribution of the adsorption energies derived from the TPD trace at saturation of the first monolayer (ML). The brown curve shows the cumulative distribution function, i.e., the fraction of molecules with stronger adsorption than the given value on the *x*-axis. Temperatures indicated at the peaks are based on a theoretical correspondence between the chemical potential of the adsorbate and the desorption temperature⁴⁰ and do not exactly agree with the desorption peaks. (\bar{b}) TPD spectra calculated from the adsorption energy $(E_{ads,d})$ distribution in panel a, plotted on top of the experimental data (corrected for background and velocity-dependent ionization probability). The model does not include attractive interactions between adsorbates, leading to a poor fit of the γ and δ peaks. Possible reasons for the discrepancies between the experiment and calculations in the region of the ζ shoulder are discussed in section 5.

The resulting adsorption energy distribution is shown in Figure 2a, and coverage-dependent TPD curves calculated from this energy distribution are shown in Figure 2b. The experimental background-corrected intensities also shown in this plot have been scaled with \sqrt{T} to account for the velocity-dependent ionization probability.⁴⁰ We find good agreement between experiment and simulation for the ε peak. The discrepancies between the experiment and calculations concerning the γ , δ , and ζ peaks are considered in the discussion.

3.2. Photoelectron Spectroscopy. XPS measurements were performed to gain information about the chemical state of the adsorbed molecules and $Fe_3O_4(001)$ surface (Figure 3).

XPS data were acquired for the pristine $Fe_3O_4(001)$ surface, after C_2H_4 adsorption, and after several heating steps up to 500



Figure 3. X-Ray photoelectron spectroscopy data for $C_2H_4/Fe_3O_4(001)$ measured at 61 K. The pristine surface exhibits no detectable C 1s signal. Following the adsorption of multilayer C_2H_4 (specifically 12.7 C_2H_4 per unit cell) at 61 K, a C 1s peak is visible at 284.8 eV, a binding energy typical for C=C bonding. Annealing to 80 K removes the molecules from the multilayer (peaks α and β in Figure 1). The C 1s signal from the saturated first monolayer (green) is slightly shifted to lower binding energy (248.7 eV). Subsequent annealing steps sequentially remove C_2H_4 molecules from the monolayer until the sample is again free from C after annealing to 500 K. Spectra were acquired with Al K α radiation in grazing emission (12° from normal).

K. Figure 3 shows the C 1s region. (Corresponding data from the Fe 2p and O 1s regions are shown as Figure S3.) The asprepared surface is free of C within the detection limit of the setup. A peak due to multilayer C₂H₄ appears at 284.8 eV after exposure to 12.7 C₂H₄ per surface unit cell at 61 K, with a second peak shifted by 8.3 eV to higher binding energy due to a π -3p Rydberg shake-up process (Figure S4).⁴²⁻⁴⁵ After the sample was heated to 80 K, the area of the C 1s peak decreases by 50%. Subsequent heating to 90 and 100 K further reduces the intensity of the C 1s peak as the molecules contained within the first monolayer desorb. The intensity after annealing to 100 K corresponds to approximately half of the complete monolayer, which makes sense as the molecules contained within the ε peak ($\approx 2 C_2H_4$ per surface unit cell) should remain on the surface at 100 K. Removing these molecules by heating to 145 K leaves only the molecules associated with surface defects. The fact that the binding energy remains unchanged shows that C2H4 is adsorbed molecularly even at defects. Finally, after heating to 500 K, the sample is free from C within the detection limit of the instrument. XPS data from the Fe 2p and O 1 s regions after C₂H₄ adsorption are representative of the clean $Fe_3O_4(001)$ surface throughout the experiment and show only a decrease in intensity when C₂H₄ is adsorbed (see Figure S3). The peak positions indicate that the molecules corresponding for the ε peak (orange curve in Figure 3) have a slightly higher binding energy (XPS peak shifted by 0.2 eV) than those completing the monolayer (γ and δ peaks) or those adsorbed at defects (the yellow curve in Figure S3).

3.3. Scanning-Tunneling Microscopy. Figure 4 shows STM images of the Fe₃O₄(001) ($\sqrt{2} \times \sqrt{2}$)R45° surface before and after exposure to different amounts of C₂H₄. Liquid nitrogen was used as the cryogen for the low-temperature (LT)-STM, which results in a sample temperature of 78 K for images a–c. For image d, pumping of the cryostat lowered the sample temperature to 68 K. Figure 4a is a typical image of the as-prepared Fe₃O₄(001) surface, showing the characteristic

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Figure 4. Empty-state STM images $(10 \times 10 \text{ nm}^2)$ of the Fe₃O₄(001) surface before and after exposure to C₂H₄. Images (a-c) were obtained at *T* = 78 K. (a) The as-prepared Fe₃O₄(001) surface exhibits rows of 5-fold coordinated Fe atoms along [110]. Each protrusion in the image corresponds to a pair of these Fe atoms.¹¹ Typical surface defects are labeled (see the main text for details). (b) After exposure to 0.5 L of C₂H₄ at 78 K. Bright protrusions titrate only the surface defects. (c) Upon exposure to C₂H₄ (5 L, dosed at 5×10^{-9} mbar), the surface Fe rows remain visible, as well as bright circular protrusions that order locally with a 6 Å square lattice (e.g. yellow circle). (d) An image acquired after lowering the temperature to 68 K and exposing to more ethylene (2.3 L, at 5×10^{-9} mbar) exhibits a nearly full coverage of bright protrusions separated by 6 Å along the [110] direction. The red arrow marks indications of mobility of the C₂H₄ molecules.

Fe³⁺ atoms of the clean surface.¹¹ Three different surface defects appear as bright protrusions: iron adatoms (Fe_{ad}) ,⁴⁶ surface hydroxyls (OH),⁴⁷ and antiphase domain boundaries (APDB).⁴⁸ After exposing the sample to 0.5 Langmuir (1 L = 1.33 mbar·s) at 78 K, bright protrusions appear at the defect sites (Figure 4b). Note that, since C_2H_4 was dosed into the cryostat through a small window, the exposure is significantly less than the nominal dose. Titration of the defect sites at higher temperatures is consistent with the TPD experiments, as desorption from surface defects is assigned to the ζ and η TPD peaks. Thus, diffusion must be sufficiently facile at 78 K for the molecules to locate the defects in the time frame of the experiment. A line of bright protrusions on the Fe rows in the top left of the image corresponds to C₂H₄ adsorbed on an APDB. The APDB has previously been shown to be an active site for CH₃OH adsorption.⁴⁶ Two different adsorption sites are marked in the image: the cyan circle shows an isolated protrusion located above the Fe row, which corresponds to C₂H₄ adsorbed atop a 5-fold coordinated surface Fe atom in a regular lattice position. This could be due to an unreconstructed unit cell defect,⁴⁶ which occurs when an additional Fe atom is accommodated in the subsurface, or potentially next to an OH group.⁴⁹ However, many OH groups remain visible in Figure 4b, so we infer that the defect responsible for C_2H_4 adsorption is probably the unreconstructed unit cell. The orange circle shows a bright protrusion between the surface Fe rows, which corresponds to C_2H_4 adsorption at a 2-fold coordinated Fe adatom defect. Some streakiness present in the image is attributed to molecules moving on the surface during the STM measurement.

Exposing the sample at 78 K to a nominal exposure of 5 L of C_2H_4 (Figure 4c) leads to bright protrusions on the surface Fe rows, similar to those observed in Figure 4b. In large areas of the image, the nearest-neighbor distance of the protrusions along the surface Fe row direction is 6 Å, which corresponds to every other Fe cation being occupied by a C_2H_4 molecule (yellow circle). The underlying Fe rows remain visible in patches, but the resolution is enhanced with clear protrusions at the position of all surface Fe atoms (nearest neighbor distance = 3 Å, different from the usual appearance where pairs of Fe atoms appear as protrusions, with a distance of 6 Å along the rows). There appears to be a gradual transition between the areas where every other Fe position appears bright due to an adsorbed C_2H_4 and the regions where all Fe positions in the

row are visible. This indicates that all protrusions are probably due to C_2H_4 . The molecules are pinned at defects, and the neighbors of a pinned molecule will be usually at a distance of 6 Å along the row. With increasing distance from the defects, the molecules are increasingly mobile, at a timescale shorter than that of imaging by the STM (note that mobility may be also aided by the STM tip). It is also possible that the tip is terminated by an ethylene molecule, which may facilitate the high resolution observed in Figure 4c.

The measurement temperature of 78 K falls close to the onset of the TPD desorption peak δ . Since the timescale of STM measurements (many minutes) is longer than that of TPD, the coverage seen by STM will be lower than that in TPD at the same temperature. Therefore, we pumped the cryogen in the cryostat of the STM to reduce the sample temperature to ≈ 68 K, which should allow to saturate the δ peak. Following exposure to C₂H₄ (an additional 2.3 L was dosed in addition to that shown in Figure 4c), we observe that the surface Fe rows are no longer visible, and the surface is imaged as a complete layer of circular protrusions (Figure 4d). As the molecules on the Fe rows are packed as closely as possible, we find indications of mobility in very few places only (Figure 4d, red arrow).

Some of the molecules appear clearly brighter than others. Images acquired before and after exposure to ethylene on the same sample area, as well as a quantitative analysis of the number of bright molecules and surface defect concentration lead us to the conclusion that the brighter protrusions are due to ethylene adsorbed on surface defects. More details of this analysis can be found in the Supporting Information (see Figure S5). Further cooling of the sample (i.e., using liquid He as the cryogen), to stabilize higher coverages, is hampered because the $Fe_3O_4(001)$ sample is not conductive enough for STM measurements at 4 K.

3.4. DFT Calculations. A systematic approach was utilized to determine the lowest-energy configurations of the ethylene molecules at relevant coverages on the $Fe_3O_4(001)$ surface. We utilized the strongly constrained and appropriately normed meta-generalized gradient approximation (SCAN) with the inclusion of van der Waals interactions (rVV10), but a comparison to several alternatives (generalized gradient-based functionals, GGA) with and without van der Waals corrections is included at the end of this section. All other settings of the DFT calculations and convergence criteria are the same for all

functionals. The selection of the SCAN functional over PBE was motivated by its demonstrated superior performance on various molecular and solid-state test sets, as reported in the literature.^{34,50} Moreover, SCAN is an attractive choice as it is reported to balance accuracy and computational efficiency.³³

The SCV termination of the clean $Fe_3O_4(001)$ surface has four equivalent 5-fold undercoordinated Fe atoms (Fe_{oct}) (truncated octahedral coordination, thus named Fe_{oct}) and eight surface O atoms per ($\sqrt{2} \times \sqrt{2}$)R45° unit cell (two thereof are 2-fold coordinated, and six 3-fold). We utilized a ($2\sqrt{2} \times 2\sqrt{2}$)R45° supercell to explore many different configurations in the coverage regime 1–4 C₂H₄/unit cell. We also modeled three experimentally observed defects in this surface:⁴⁶ (1) an Fe adatom, (2) an unreconstructed unit cell (i.e., an additional Fe atom in the third layer that allows to locally recover the spinel structure), and (3) a surface hydroxy group. For coverages of more than one molecule per unit cell, the calculated adsorption energy reported here is the average adsorption energy per C₂H₄ molecule (see eq 1).

On the defect-free Fe₃O₄(001) surface, we find that an isolated C₂H₄ molecule adsorbs molecularly on top of the 5-fold Fe_{oct} atom and adopts a flat-lying geometry with the C==C bond along or perpendicular to the Fe row ($E_{ads} = -0.48$ or -0.47 eV, respectively). These configurations are similar to those calculated for the RuO₂(110) surface,⁵¹ where easy inplane rotational motion of the π -C₂H₄ complex was found at the low coverage. Bonding via the π orbital to an undercoordinated cation was also found for C₂H₄ on rutile TiO₂(110).⁵² Increasing the coverage to one C₂H₄ per unit cell results in a slightly stronger adsorption energy ($E_{ads} = -0.51$ parallel to the Fe row, -0.49 eV perpendicular, see Figure 5c,d). We attribute this to van der Waals attraction between neighboring molecules.



Figure 5. Low-coverage structures (up to one C_2H_4 molecule per unit cell) determined by DFT + U (SCAN + rVV10) (top view). Panels a and b for isolated C_2H_4 molecules and panels c and d for one $C_2H_4/$ unit cell. The white, dashed square indicates the ($\sqrt{2} \times \sqrt{2}$)R45° unit cell. Surface Fe_{oct} atoms are dark blue, tetrahedrally coordinated Fe atoms (≈ 0.8 Å lower than the Fe_{oct}) slate blue, and oxygen is red.

At a coverage of two C_2H_4 molecules per unit cell, the corresponding adsorption energy is calculated as -0.49 eV in the configurations of Figure 6a,b. The optimal orientation of the C=C bond is perpendicular to the Fe_{oct} row. Aligning the C=C bond along the Fe_{oct} row yields a weaker adsorption energy of -0.46 eV (Figure 6c).

Our calculations (Figure 7) clearly show that placing three C_2H_4 on neighboring surface Fe_{oct} sites is substantially less



Figure 6. Structures for two C_2H_4 molecules per unit cell determined by DFT + U (top view). (a, b) C_2H_4 molecules adsorb on top of Fe_{oct} atoms, with the C=C bond aligned perpendicular to the row, and (c) C_2H_4 molecules adsorb on top of Fe_{oct} atoms, with the C=C bond aligned along the row. The white dashed square indicates the $(\sqrt{2} \times \sqrt{2})$ R45° unit cell.



Figure 7. Structures for three C_2H_4 molecules per unit cell determined by DFT + U (top view). (a) Two C_2H_4 molecules adsorb on the Fe_{oct} row, and one C_2H_4 molecule adsorbs between the Fe_{oct} rows, (b, c) three C_2H_4 adsorb on the Fe_{oct} row.

favorable than the structures at 1-2 C₂H₄ per cell. When placing more than two molecules per cell on the Fe rows, repulsive interactions between neighboring molecules cause the C₂H₄ molecules to tilt away from the ideal atop geometry, leading to a significant weakening of the average adsorption energy (Figure 7b,c). Our DFT results show that the better option is half occupation of the Fe rows and placing the additional C₂H₄ molecule between the Fe_{oct} rows (Figure 7a). The minimum-energy structure of Figure 7a exhibits a motif of the crystal structure of solid C₂H₄.⁵³ The H atoms of the "additional" molecules in the trough point toward the C==C bonds of the molecules on the Fe rows.

Searching for the optimal configuration at four molecules per unit cell is complicated by the many possibilities, but it is clear that two molecules adsorb atop Fe_{oct} atoms, with the other two molecules adsorbed weakly in between the rows. Two possibilities are shown in Figure 8a,b. A configuration with initially four C_2H_4 molecules all adsorbed atop Fe_{oct} sites is not stable; the molecules all moved away from the ideal geometry after structural optimization (Figure 8c), and the final structure was still less favorable than the other models. Overall, we can conclude that the coverage of two molecules per unit cell is a threshold above which additional molecules must be placed in relatively unfavorable configurations between the surface Fe rows. This nicely explains why the δ TPD peak saturates at a coverage of 2 C_2H_4 per unit cell.

We also computed the C 1s core-level binding energies in the final state approximation. The relative shift in binding energy between carbon atoms contained within C_2H_4 adsorbed on top of the Fe_{oct} atoms is 0.3 eV lower that those located between the rows at high coverage. This result is qualitatively consistent with our XPS data. The results were not very sensitive to the exact configuration of the additional molecule, because the molecule between the Fe_{oct} rows is bound mainly by van der Waals forces and its electrostatic quadrupole moment.



Figure 8. Structures for four C_2H_4 molecules per unit cell determined by DFT + U (top view). (a) Two C_2H_4 molecules adsorb on the Fe_{oct} row, and the other two C_2H_4 molecules adsorb between the Fe_{oct} rows where the two ethylene molecules lie flat on the surface. (b) Two C_2H_4 molecules adsorb on the Fe_{oct} row, and the other two C_2H_4 molecules adsorb between the Fe_{oct} rows where one ethylene molecule is positioned upright on the surface, shown in a yellow dashed oval. (c) An attempted configuration where the C_2H_4 molecules were initially placed on every Fe_{oct} atom on the row. The adsorbed C_2H_4 molecules to tilt or move away from the ideal-on-top of S-fold Fe_{oct} atoms during the structure optimization. The adsorption is weaker by 0.06–0.08 per ethylene molecule compared with the panels a and b configurations. The white dashed square indicates the ($\sqrt{2} \times \sqrt{2}$)R45° unit cell.

Finally, we turn our attention to adsorption at the surface defects. We find that C_2H_4 adsorbed at an Fe adatom defect exhibits the strongest adsorption energy of all sites considered here (-0.84 eV). The optimal configuration has the molecule atop the adatom, and the C=C parallel to the surface Fe rows (Figure 9a). The second type of defect (Figure 9b) considered



Figure 9. Structures for defects determined by DFT + U (top view). (a) An Fe adatom (orange) between the Fe_{oct} rows, in panel b, an unreconstructed unit cell (i.e., two additional Fe atoms in the third layer at the position marked by white arrows. Adding these atoms and removing a tetrahedral Fe_{int} atom from the site marked by a yellow dashed circle locally recover the spinel structure), and in panel c, a surface hydroxy group is shown.

is the so-called "unreconstructed unit cell", in which the second layer Fe_{int} atom is replaced by two third-layer Fe_{oct} atoms. This can be viewed as a local recovery of the bulk spinel structure. C₂H₄ binds on this surface with an energy of -0.66 eV. Since this defect is locally similar to the APDB,⁴⁶ we assume that adsorption at the APDB would yield a similar adsorption energy. Attempts to bind C₂H₄ adjacent to a hydroxy group resulted in a relatively weak adsorption energy ($E_{ads} = -0.47$ eV), as shown in Figure 9c. Formation of a C₂H₅ radical (by using the H atom from the hydroxy group) is less favorable than the separate hydroxyl and adsorbed C₂H₄ by 0.8 eV. This is substantially less than the adsorption energy of C₂H₄.

conclude that the hydroxyl group does not infer any significant change in the C_2H_4 adsorption energy (to within the uncertainty).

We found that the calculated $E_{ads,a}$ values are quite sensitive to the DFT approach chosen. Table 1 lists the calculated C_2H_4 adsorption energies at a coverage of 1 and 2 C_2H_4 per unit cell using different functionals that take account of van der Waals (vdW) effects as well as two common functionals without vdW corrections (PBE, SCAN).

Including van der Waals functionals, both semilocal and nonlocal, leads to higher adsorption energies than found experimentally. All functionals yield adsorption energies with a very weak coverage dependence for 1 and 2 C_2H_4 per unit cell. Among the vdW-corrected functionals, the D2 and SCAN + rVV10 provide the closest match to the experimental value. Table 1 shows that the vdW correction in the SCAN level is smaller than in the PBE level. This difference can be attributed to the fact that SCAN is capable of capturing intermediaterange London dispersion interactions, which allows it to capture noncovalent interactions more accurately, ultimately resulting in smaller vdW corrections for long-range interactions compared to PBE.

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Table 2 shows a full summary of the experimental data from TPD, the differential adsorption energies gained from the TPD analysis and the adsorption energy calculated using DFT. As already mentioned earlier in this section, the differential adsorption energy is the adsorption energy of the most weakly bound C_2H_4 molecule in a structure ($E_{ads,d}$, see eq 2). The values calculated by DFT + U (SCAN + rVV10) indicate stronger binding by approximately 0.1–0.15 eV than the value from the TPD analysis. We attribute the difference to the limited accuracy of the vdW functionals. A comparison of the TPD differential adsorption energies with the desorption energies from ref 25 where a different analysis method (inversion analysis) was used shows very good agreement for the δ and ε peaks. The defect peak η is not as well defined as the others, and thus, its desorption energy has a rather large error bar. It should be noted that the sign differs because the analysis of ref 25 provides desorption barriers (positive) whereas our analysis yields adsorption energies, but the absolute values should be approximately the same since the

Table 1. Comparison of the Average Adsorption Energies Obtained for 1 and 2 C_2H_4 on Fe₃O₄(001) Using Various Functionals

coverages	PBE	PBE-D2 ⁵⁴	PBE-D3 ⁵⁵	optPBE-DF ⁵⁶	optB86-DF ⁵⁷	optB88-DF ⁵⁶	SCAN ³³	SCAN+rVV10 ³⁴
$1 C_2 H_4$	-0.19	-0.50	-0.54	-0.50	-0.53	-0.58	-0.38	-0.51
$2 C_2 H_4$	-0.19	-0.48	-0.50	-0.52	-0.56	-0.57	-0.35	-0.49

TPD peaks	description	C ₂ H ₄ /unit cell saturation	desorption temperature (K)	$\begin{array}{c} \text{TPD-Analysis } E_{\text{ads,d}} \\ (\text{eV}) \end{array}$	$E_{\rm ads, d}$ from DFT (SCAN + rVV10) (eV)	inversion analysis in ref 25 $E_{\rm des,d}$ (eV)
α	multilayer	12.7 (±1.2)	73-76			
β	multilayer	8.9 (±0.8)	70-73			
γ	saturated monolayer	4.1 (±0.4)	90	-0.23	-0.35	
δ	3/4 monolayer	3.0 (±0.3)	100	-0.32	-0.43	0.34
ε	1/2/1/4 monolayer	2.2 (±0.2)	110-115	-0.36/-0.40	-0.47/-0.51	0.37/0.42
η	defects	≈0.3	160	-0.54/≈-0.6	-0.66/-0.84	≈0.51

Table 2. Summary of the Experimental and Computational Results for the Desorption Peaks and Those Determined Experimentally in Ref 25

difference is mainly the adsorption barrier, which should be negligible in the present case (near-unity sticking, see Figure S1).

4. DISCUSSION

Combining the information garnered from the various techniques employed in this work, it is possible to build up a comprehensive picture of how C_2H_4 interacts with the Fe₃O₄(001) surface. C_2H_4 binds most strongly at surface defects such as Fe adatoms, unreconstructed unit cells and APDB's, as seen in the STM image in Figure 4b. Desorption from these sites results in the η peak in TPD and may also contribute some intensity in the region down to the ζ peak. Our DFT calculations suggest that the Fe adatoms bind strongest of all, followed by unreconstructed unit cells. Since the APDB is locally similar in structure to an unreconstructed unit cell, we assume similar adsorption properties, even though we did not calculate an APDB explicitly. Surface OH groups are omnipresent on Fe₃O₄(001), but there is no evidence that they interact strongly with C₂H₄.

As mentioned above, and as noted by Lee et al.,²⁵ the ζ TPD peak exhibits unusual behavior, as it continues to grow following the onset of the ε peak. This suggests that diffusion cannot occur between the sites responsible for these desorption peaks. Interestingly, we have observed that this peak is almost absent on a brand new $Fe_3O_4(001)$ sample (as seen in Figure 1), but increases in intensity as the crystal is utilized for experiments (see Figure S2). This behavior suggests that its origin may lie in the Fe₂O₃ inclusions that slowly grow over time as an $Fe_3O_4(001)$ sample is oxidized during UHV preparation.²⁶ As such, we do not consider this peak as representative of the $Fe_3O_4(001)$ surface. It should be also noted that the temperature range with the largest discrepancy between the experimental spectra and simulation in Figure 2 is around the ζ peak. Since the simulation is based on equilibrium thermodynamics, it does not correctly describe the case of widely separated different regions on the surface that cannot quickly equilibrate through diffusion. In addition, in the temperature range of the ζ peak (120 K), magnetite bulk undergoes a phase transition (the so-called Verwey transition⁵⁸), which can be also observed at the surface.⁵⁹ This transition substantially changes the electronic structure of the sample, which could affect the adsorption energy of adsorbed molecules. Thus, part of the unusual behavior in TPD around this temperature may also be related to the Verwey transition.

The ε TPD peak emerges at $\approx 0.3 \text{ C}_2\text{H}_4$ per unit cell and shifts slightly to lower temperature before saturating at approximately 2 C₂H₄ per unit cell (Figure 1). This is likely due to repulsion between the C₂H₄ molecules. The DFT + U results show slight weakening of the adsorption energy shown between 1 and 2 C_2H_4 per unit cell in Figure 5 ($E_{ads} = -0.51$ eV) and 6 ($E_{ads} = -0.49$ eV), respectively, but this difference is certainly within the error of the calculations.

Calculations performed using other functionals (see Table 1) also suggest that the adsorption energies at 1 and 2 molecules per unit cell are very close, i.e., their interaction is weak. Quantitatively, however, we note that all the tested functionals with van der Waals corrections significantly overestimate the adsorption strength at 2 C₂H₄ per unit cell compared to the experimentally determined average adsorption energy of -0.38 eV. The overestimation is largest in the case of optB88 (0.19 eV), which is in line with the 0.2-0.3 eVoverestimation observed for CO adsorbed in various Fe₃O₄based SAC systems.⁶⁰ With the present weak binding, however, this would result in the adsorption being too strong by about 50%. In retrospect, it is perhaps unsurprising that including vdW functionals, such as optB88, do not perform quantitatively well for metal oxide systems, because they are typically optimized to account for the van der Waals interactions between gas-phase molecules and not for the interaction of molecules with surfaces.

Based on the STM, DFT, and TPD results, we conclude that the C₂H₄ molecules prefer to occupy the next-nearest neighbor positions along the surface Fe rows on the defect-free surface. Figure 4c indicates that molecules are pinned at surface defects, but otherwise mobile even at 78 K. The STM image shows a time average of the positions of C_2H_4 on the surface, which is why the apparent height of the molecules slowly decreases away from the defect until the protrusions appear equally bright at all Fe atoms at a greater distance. When the sample was cooled further, it became possible to complete the next-nearest neighbor periodicity (6 Å) along the surface Fe rows, but the overall coverage cannot be determined from the STM images. On the one hand, it could be two C_2H_4 per unit cell, as it appears based on the density of protrusions in Figure 4d, but it could also be that molecules are adsorbed between the rows but are not directly imaged. In either case, the preference for the next-nearest neighbor site occupancy on the Fe rows is clear.

Next, we turn to the δ and γ peaks, which occur between 2 C_2H_4 per unit cell and saturation of the monolayer at $\approx 4 C_2H_4$ per unit cell. These peaks are particularly sharp and are not well reproduced by the TPD simulation in Figure 2b. It is important to note that the TPD simulation program⁴⁰ does not include intermolecular interactions. Repulsive reactions are approximated as an occupation of sites with lower desorption energy as the coverage is increased (as in the case of the ε peak). Attractive interactions, on the other hand, can be inferred when the TPD peak is sharper than the peak width predicted based on occupation of a site with a singular

desorption energy. This is in line with the DFT model shown in Figure 7a, for example, where the molecules orient to maximize attraction in a similar fashion to that seen in crystalline C_2H_4 .

Finally, we note some interesting behavior within the C_2H_4 multilayer. Once saturation of the first layer is completed at 4 C_2H_4 /unit cell, additional molecules begin to desorb from a peak at lower temperature. This peak has a zero-order line shape typical for multilayer desorption. Once the coverage reaches $\approx 8 C_2H_4$ per unit cell, the leading edge (and with it the rest of the peak) shifts in its entirety to a higher temperature. This suggests that the structure changes abruptly once the 2nd layer is completed and the 3rd layer begins to grow. This might occur because the structure of the two-layer system is defined by the structure of the first monolayer, while the system adopts a more stable 3-dimensional crystal structure once additional molecules adsorb on top.

In closing, we remark that the similarity of the experimental TPD data between our work and that of Lee et al.²⁵ demonstrates that $Fe_3O_4(001)$ is a well-reproducible model system, and thus suitable for surface science investigations of iron-oxide surface chemistry. The TPD peaks appear at very similar temperatures, so the differences in the desorption energy calculated (see Table 2) are a result of different assumptions made in the analysis of the TPD data. As mentioned by Lee et al. in ref 25, the inversion analysis method is not well suited to broad desorption spectra such as those found for C_2H_4 on Fe₃O₄(001) because it is most sensitive to the leading edge. Our method utilizes DFT to estimate the vibrational entropy of the adsorbed molecules, and thus does not rely on the determination of a desorption prefactor from the experimental data. At coverages of 2 and 3 C₂H₄/unit cell, where the peaks are relatively sharp, the difference is approximately 0.02 eV, which is certainly less than the error of the methods. In any case, the weak, nondissociative binding of C_2H_4 along with the ability of $Fe_3O_4(001)$ to stabilize dense arrays of metal adatoms further makes this an ideal candidate model system to investigate hydrogenation and hydroformylation reactions by metal oxide-supported single atoms.

5. CONCLUSIONS

We investigated the interaction of a representative alkene, C_2H_4 , with the Fe₃O₄(001) surface by utilizing a combination of different techniques: TPD, XPS, STM, and DFT computations. C₂H₄ adsorbs most strongly at surface defects where it desorbs at \approx 160 K. DFT-based calculations predict an adsorption energy of -0.84 to -0.66 eV depending on the defect site. A broad desorption peak appears at 110-115 K and saturates at approximately 2 C₂H₄ per unit cell. The differential adsorption energies of 1 and 2 C2H4 molecules per unit cell were calculated by DFT as -0.51 and -0.47 eV, respectively, while TPD yields -0.40 and -0.36 eV. Some vdW-corrected DFT functionals overestimate the adsorption energy even more (by up to 0.18 eV). STM and DFT results suggest that, up to a coverage of 2 C_2H_4 per unit cell, the molecules prefer to occupy the next-nearest neighbor positions along the surface Fe rows. Suggested by DFT, additional C₂H₄'s are stabilized through attractive intermolecular interactions between the Fe rows up to a coverage 4 C₂H₄ molecules per unit cell. Multilayer desorption happens at 73-76 K. Our study shows that C_2H_4 weakly adsorbs at the Fe₃O₄(001) surface and desorbs molecularly below room temperature with a monolayer coverage of 4 C_2H_4 molecules per unit cell.

ASSOCIATED CONTENT

Supporting Information

The Supporting Information is available free of charge at https://pubs.acs.org/doi/10.1021/acs.jpcc.3c03684.

List of initial coverages for the TPD series shown in Figure 1, sticking coefficient measurement for C_2H_4 on Fe₃O₄(001), TPD data from a second sample showing the effect of sample aging, XPS data for C_2H_4 on Fe₃O₄(001) (O 1s, Fe 2p, C 1s), and STM images of the Fe₃O₄(001) surface during exposure to ethylene (PDF)

AUTHOR INFORMATION

Corresponding Author

Gareth S. Parkinson – Institute of Applied Physics, TU Wien, Vienna 1040, Austria; o orcid.org/0000-0003-2457-8977; Email: parkinson@iap.tuwien.ac.at

Authors

- Lena Puntscher Institute of Applied Physics, TU Wien, Vienna 1040, Austria
- **Panukorn Sombut** Institute of Applied Physics, TU Wien, Vienna 1040, Austria
- **Chunlei Wang** Institute of Applied Physics, TU Wien, Vienna 1040, Austria
- Manuel Ulreich Institute of Applied Physics, TU Wien, Vienna 1040, Austria
- **Jiri Pavelec** Institute of Applied Physics, TU Wien, Vienna 1040, Austria
- Ali Rafsanjani-Abbasi Institute of Applied Physics, TU Wien, Vienna 1040, Austria; © orcid.org/0000-0001-9155-7848
- Matthias Meier Institute of Applied Physics, TU Wien, Vienna 1040, Austria; Faculty of Physics, Center for Computational Materials Science, University of Vienna, Vienna 1090, Austria; © orcid.org/0000-0003-0198-1392
- Adam Lagin Institute of Applied Physics, TU Wien, Vienna 1040, Austria; o orcid.org/0000-0001-5062-6691
- Martin Setvin Institute of Applied Physics, TU Wien, Vienna 1040, Austria; Department of Surface and Plasma Science, Faculty of Mathematics and Physics, Charles University, Prague 180 00, Czech Republic
- Ulrike Diebold Institute of Applied Physics, TU Wien, Vienna 1040, Austria; o orcid.org/0000-0003-0319-5256
- Cesare Franchini Faculty of Physics, Center for Computational Materials Science, University of Vienna, Vienna 1090, Austria; Dipartimento di Fisica e Astronomia, Università di Bologna, Bologna 40126, Italy; © orcid.org/ 0000-0002-7990-2984
- Michael Schmid Institute of Applied Physics, TU Wien, Vienna 1040, Austria; © orcid.org/0000-0003-3373-9357

Complete contact information is available at: https://pubs.acs.org/10.1021/acs.jpcc.3c03684

Author Contributions

^{\perp}L.P. and P.S. contributed equally to this work.

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