

# Dynamical Solvent Effects on the Charge and Reactivity of Ceria-Supported Pt Nanoclusters

Lucie Szabová,<sup>†</sup> Matteo Farnesi Camellone,<sup>‡,||</sup> Fabio Negreiros Ribeiro,<sup>‡,⊥</sup> Vladimír Matolín,<sup>§</sup> Yoshitaka Tateyama,<sup>†</sup> and Stefano Fabris<sup>\*,‡,||</sup>

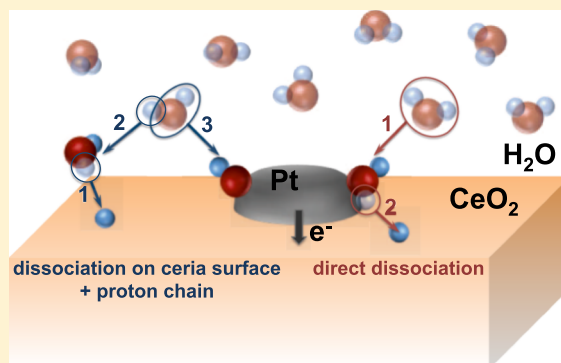
<sup>†</sup>Center for Green Research on Energy and Environmental Materials (GREEN) and International Center for Materials Nanoarchitectonics (MANA), National Institute for Materials Science (NIMS), 1-1 Namiki, Tsukuba, Ibaraki 305-0044, Japan

<sup>‡</sup>CNR-IOM DEMOCRITOS, Istituto Officina dei Materiali, Consiglio Nazionale delle Ricerche, via Bonomea 265, I-34136 Trieste, Italy

<sup>§</sup>Faculty of Mathematics and Physics, Department of Surface and Plasma Science, Charles University, V Holešovičkách 2, 18000 Prague, Czech Republic

## Supporting Information

**ABSTRACT:** Supported Pt nanoparticles are key components in heterogeneous catalysis for energy and environment applications that involve vapor and wet conditions. In the latter case, the reaction proceeds at the catalyst–water interface where the solvent actively participates in the reaction mechanism. In this work, ab initio molecular dynamics simulations shed light on the effects of solvation on the reactivity and electronic properties of Pt<sub>6</sub> nanocatalysts supported by ceria (CeO<sub>2</sub>), a highly reducible oxide. The calculated trajectories show that H<sub>2</sub>O molecules spontaneously dissociate at both the supported Pt<sub>6</sub> cluster and at the ceria surface already at *T* = 350 K. Water dissociation leads to hydroxylation of the ceria surface and, most importantly, to the selective decoration of the metal–oxide periphery with hydroxide ions, which are stabilized by solvent-induced electronic effects and which quickly diffuse to the interfacial Pt sites via Grotthius-like proton chains. The periphery of the metal–oxide interface is thus identified as the active region of ceria-supported Pt clusters in wet environments. Solvation is shown to drive dynamic charge transfers across the metal/oxide interface that modify the cluster charge, a key parameter of the catalyst reactivity.



## INTRODUCTION

The interaction between water and catalytic surfaces plays a crucial role in many technological applications, such as (photo-)electrochemical cells, environmental chemistry, or fuel cell technologies. A very significant field is the development of heterogeneous catalysis involving water-based approaches, which represent cheaper and safer alternatives to more traditional methods employing expensive and toxic solvents.<sup>1</sup> Complex reactions happen at solid–liquid interfaces where water, the most common solvent, takes active part in chemical reactions, affecting the charge and stability of surface adsorbates, reactants, and products, as well as of the relevant transition states.<sup>2–7</sup> The complexity of the atomistic and electronic processes occurring at these solid–liquid interfaces challenges fundamental experimental studies that require highly advanced in situ and in operando approaches. On the other side, material modeling can provide valuable fundamental insight, but it requires demanding dynamical approaches capable to sample the large configurational space of the solid–liquid interface.

Several ab initio molecular dynamics (AIMD) studies have recently focused on the interaction between water and catalytically relevant oxides surfaces, such as ZrO<sub>2</sub>,<sup>8</sup> ZnO,<sup>9,10</sup> TiO<sub>2</sub>,<sup>11–13</sup> GaP(001), InP(001),<sup>14</sup> and Fe<sub>2</sub>O<sub>3</sub>(001).<sup>15</sup> For the solid–liquid interfaces involving ZrO<sub>2</sub>, ZnO, InP(001), and Fe<sub>2</sub>O<sub>3</sub>, these studies show that interfacial water molecules dissociate already at room temperature, leading to surface hydroxy groups and to solvated hydroxide ions at the interface. The resulting hydroxide displays a dynamical equilibrium with interfacial water molecules that is governed by proton transfer between the hydroxide species, the partially hydroxylated surface sites, and the neighboring water molecules. This solvent-induced dynamics at the solid–liquid contact results in a very complex scenario where H<sub>2</sub>O molecules, hydroxy groups and hydroxide ions play an important role in increasing the proton transfer rate and in accelerating the diffusion of reaction products or intermediates. For solid–liquid interfaces invol-

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ing other oxides, such as TiO<sub>2</sub> surfaces, the interfacial water molecules do not dissociate because of the strong bonding with the five-fold coordinated Ti surface sites.<sup>11</sup>

The presence of supported catalytic clusters greatly increases the complexity of the catalyst and therefore represents an additional challenge to the simulations. For the paradigmatic case of TiO<sub>2</sub>-supported Au clusters, it has been reported that gold particles larger than 4 nm, which are usually catalytically inert, show enhanced oxidation activity under aqueous conditions because of O<sub>2</sub> activation at the Au–liquid interface.<sup>16</sup> Indeed, the presence of moisture on Au/TiO<sub>2</sub> surfaces has been shown to increase the catalytic activity toward CO oxidation by orders of magnitude.<sup>17</sup> AIMD simulations showed that although water molecules do not dissociate at the solid–liquid interface, the solvent allows for stabilizing distinctive charge states of the metal nanoparticle that is shown to feature both “cationic” and “anionic” solvation depending on charge fluctuation and polarization effects.<sup>12,13</sup>

Here, we go beyond these studies by addressing metal nanoparticles supported by *highly reducible* oxide surfaces in wet chemical environments. We therefore consider a much more complex system including a supported metal nanoparticle at the water/oxide interface. In particular, we focus on the effects of the solvent on the charge, structure, and reactivity of Pt clusters supported by CeO<sub>2</sub> surfaces. Ceria is one of the most reducible oxides that is widely used in catalysis because of its high oxygen-storage capacity.<sup>18–24</sup> The improved reactivity of platinum–ceria catalysts can be traced back to the high reducibility of the ceria support and to the activation of the Pt catalyst through electron transfer at the metal–oxide contact. There is an extended literature addressing the structural and electronic properties of Pt clusters in the gas phase, particularly in the context of fuel cell catalysts,<sup>25–28</sup> but very little is known about *water-solvated* Pt/CeO<sub>2</sub> systems.

Recently, by AIMD simulations, we have investigated the impact of solvation on a CeO<sub>2</sub>(111) surface in contact with liquid water showing that surface wetting strongly affects the equilibrium of water dissociation at the ceria/water contact.<sup>29</sup> Water dissociation yields a local increase of hydroxide OH<sup>−</sup> ions and hydroxyl groups H<sup>+</sup> that activates the surface diffusion of hydroxide OH<sup>−</sup> species via a Grotthus-like process. In the mentioned work, we included an example of how the Grotthus-like proton transport can provide a way for the dissociation products to transfer to and adsorb at the Pt cluster driving a charge transfer.

In this follow-up work, we extend our study to detailed analysis of the water solution effect on the ceria-supported Pt cluster. We describe the solvation pattern and solvent-induced charge transfer between the nanoparticle and the support as well as the water dissociation mechanisms at the H<sub>2</sub>O/Pt<sub>6</sub>/CeO<sub>2</sub> interface.

## METHODS

The density functional theory calculations were performed using the Perdew–Burke–Ernzerhof (PBE)<sup>34</sup> generalized gradient-corrected approximation (GGA) for the exchange–correlation functional and ultrasoft pseudopotentials<sup>35</sup> for the electron–ion interactions as implemented in the Quantum-ESPRESSO computer package.<sup>36</sup> The spin-polarized Kohn–Sham equations were solved with a plane-wave basis cutoff of 30 Ry. It is well known that local and semi-local approximations to the XC functional fail to capture the correct insulating electronic structure of ceria-based materials, because

of self-interaction effects arising from the Ce 4f electrons. The addition of an on-site Hubbard *U* term to the Hamiltonian has been shown to be an effective strategy to capture the atomistic and electronic structures of ceria-based materials.<sup>37–44</sup> In line with our previous works<sup>30,45–47</sup> we employed the GGA(PBE) + *U* approach in the implementation of Cococcioni and de Gironcoli<sup>48</sup> with a fixed value of *U* = 4.5 eV for the Ce f states. The occupations of the Ce f-states were computed by using atomic-like wave function projectors.

The Pt/CeO<sub>2</sub>/water system was modeled with a Pt<sub>6</sub> cluster supported on a stoichiometric CeO<sub>2</sub>(111) surface. We employed (4 × 4) supercell slabs with three O–Ce–O trilayers to model the CeO<sub>2</sub>(111) substrate. The Brillouin zone was sampled with the  $\Gamma$ -point, and the slabs were separated by more than 15 Å in the direction perpendicular to the surface (see Figure S1a,b). The initial lowest energy morphology of the supported Pt<sub>6</sub> cluster was determined in a previous work<sup>30</sup> that employed global optimisation algorithms. To model the Pt/CeO<sub>2</sub>/water interface, the space between the slabs was filled with 66 H<sub>2</sub>O molecules to obtain the effective density of water at *p* = 1 atm (1 g/cm<sup>3</sup>) as displayed in Figure S1c.

The AIMD simulations were performed using the Car–Parrinello propagation scheme.<sup>49,50</sup> The canonical ensemble was sampled employing a fictitious mass 400 au for the electronic degrees of freedom, and the nuclear mass of deuterium was used for all H atoms. This allowed employing a time step of 0.12 fs for the integration of the equation of motions. The temperature of the nuclei was thermostated using Nosé–Hoover<sup>51</sup> chains at 350 K to establish the canonical ensemble; the orbital degrees of freedom were also coupled to Nosé–Hoover chains to ensure Car–Parrinello adiabaticity.

We have performed two sets of AIMD simulations. The first set simulated the gas-phase Pt<sub>6</sub>/CeO<sub>2</sub> system for ~15 ps, so as to generate a reference, solvent-free situation. In the second set, the Pt<sub>6</sub>/CeO<sub>2</sub> system was solvated filling the vacuum space with 66 H<sub>2</sub> molecules as described above.

To study the dynamics, the following step-by-step procedure was adopted. First, all the atoms of the CeO<sub>2</sub> slab were kept fixed and the water molecules were allowed to relax. The system was then equilibrated with a NVT simulation at 350 K. A further equilibration step was applied, by repeating the NVT simulation and by allowing the movement of all the atoms in the supercell, except those in the lowest laying O–Ce–O trilayer, which were constrained to their equilibrium bulk-like positions. Finally, we have produced about 30 ps of equilibrated trajectories, which were used to achieve the results reported. Snapshots from the AIMD simulations were collected every ~0.12 ps for electronic structure analysis.

The analysis of the charge rearrangement induced by the solvent at the oxide–liquid interface was performed by computing the Bader charges for selected species along the simulated trajectory. We quantify the charge rearrangement by introducing the following charge difference

$$\Delta Q^\alpha(t; t_0) = \sum_{i=1}^{n_\alpha} (q_i^\alpha(t) - q_i^\alpha(t_0)) \quad (1)$$

where  $\alpha$  indicates the given atomic species (Pt, Ce, O, ...) or water molecule,  $q_i^\alpha(t)$  and  $q_i^\alpha(t_0)$  are the charge of the *i*-th atom of species  $\alpha$  (or *i*-th water molecule) at time *t* and at a reference time *t*<sub>0</sub>, respectively. Overall,  $\Delta Q^\alpha(t)$  is a time-dependent measure of the charge difference for the species  $\alpha$

with respect to a reference value calculated at  $t = t_0$ . In the gas phase simulation, the reference snapshot  $t_0$  is the one obtained after the initial structural and electronic optimization of the  $\text{Pt}_6/\text{CeO}_2$  system. In the solvated case, the reference snapshot is selected from the AIMD trajectory before dissociation of any  $\text{H}_2\text{O}$  molecule. The quantity  $\Delta Q^a(t)$  is used to quantify the time evolution of the charge rearrangement experienced by the system at the oxide–liquid interface.

Water molecules were considered as dissociated on the basis of interatomic distances between hydrogen (H), water oxygen ( $\text{O}^w$ ), and surface oxygen ( $\text{O}^s$ ) atoms. This allowed us to define the number of  $\text{H}^+$  and  $\text{OH}^-$  species adsorbed at the interface upon water dissociation. A surface  $\text{OH}^-$  hydroxyl group is defined when the  $\text{O}^s\text{--H}^+$  distance is smaller than 1.15 Å and hydroxide  $\text{OH}^-$  species is defined when one of the  $\text{O}^w\text{--H}$  distances is smaller than 1.3 Å, whereas all the others are larger than 1.3 Å. Analogously, a OH group results to be adsorbed at the  $\text{Pt}_6$  cluster when the  $\text{Pt}\text{--O}$  distance is smaller than 2.3 Å.

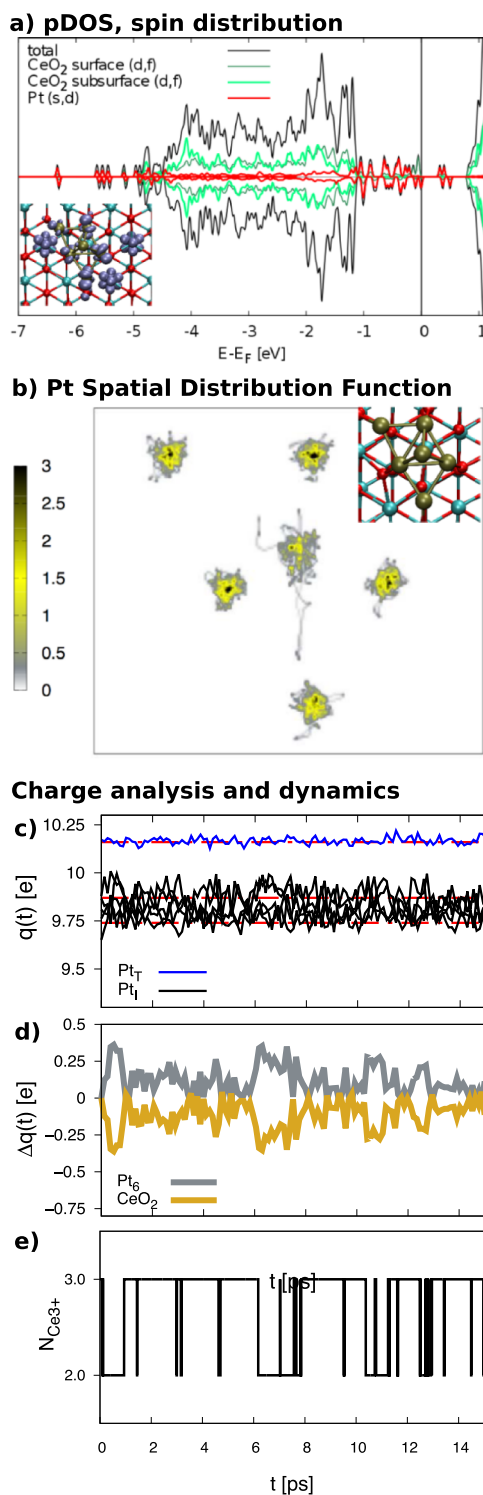
## RESULTS AND DISCUSSION

**$\text{Pt}_6/\text{CeO}_2$  Gas-Phase System.** We start by describing the time evolution of the structure and charge of the  $\text{Pt}_6/\text{CeO}_2(111)$  system exposed to vacuum, that is without solvating water molecules. The starting configuration of these AIMD simulations was the fully optimised  $\text{Pt}_6/\text{CeO}_2(111)$  system (see the Supporting Information and Figure S1a,b). The  $\text{Pt}_6/\text{CeO}_2(111)$  model comprises five  $\text{Pt}$  interfacial atoms (denoted as  $\text{Pt}_1$ ) that are in contact with the ceria surface, and one  $\text{Pt}$  atom ( $\text{Pt}_T$ ) that occupies a face-centered cubic (fcc) position on top of the interfacial  $\text{Pt}_1$  layer. The cluster is strongly bound to the ceria surface with a calculated binding energy of 6.7 eV. This strong metal–support interaction is reflected in the electron transfer from the  $\text{Pt}$  cluster to the support that leads to the formation of three  $\text{Ce}^{3+}$  centers on the substrate.<sup>30</sup> The projected density of states (PDOS) and spin density analysis reveals that these three reduced  $\text{Ce}^{3+}$  ions are located on the uppermost trilayer of the  $\text{CeO}_2(111)$  surface, at the cluster periphery (see inset in Figure 1a and ref 30).

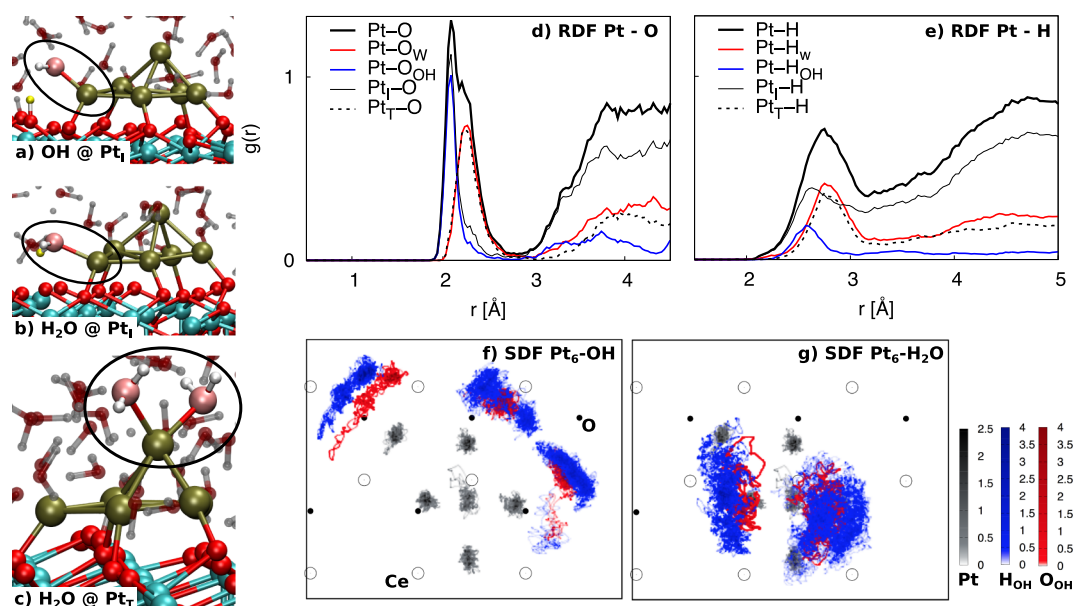
We do not claim that the small size of  $\text{Pt}$  used in our simulations precisely reproduces the response to the solvent of larger and supported nanoparticles. The extensive AIMD simulations reported in this work could not be performed on larger clusters because they already required state-of-the-art highly parallelized software and large-scale high-performance computing facilities. We remark however that the value of our simulations is to provide a first description of the solvent effects on charge and reactivity for a small but well-defined  $\text{Pt}_6$  cluster, through a careful comparison between its properties in vacuum and solvated.

Our first analysis of the AIMD trajectory focuses on the structural stability and dynamics of the supported  $\text{Pt}$  cluster. To this end, the  $\text{Pt}$  atomic positions were projected on a plane parallel to the surface every 1.2 fs. This defines the projected SDFs of the  $\text{Pt}$  atoms that are displayed in Figure 1b. This analysis shows that the thermal fluctuations of the interfacial  $\text{Pt}_1$  atoms are very small (mean squared displacement,  $\text{MSD} \approx 0.4\text{--}0.5$  Å), whereas the apical  $\text{Pt}_T$  atom clearly displays a larger mobility ( $\text{MSD} \approx 0.7$  Å). It occasionally diffuses to the other neighboring fcc sites, as evident from the SDF.

The analysis of the charge dynamics along the AIMD trajectory is displayed in Figure 1c). The blue and black lines



**Figure 1.** (a) Calculated DOS/PDOS of the  $\text{Pt}_6/\text{CeO}_2(111)$  system in the gas phase and corresponding spin density plotted for the value  $0.004 \text{ e}/\text{\AA}^3$  (inset). (b) Spatial distribution functions (SDFs) of the  $\text{Pt}$  atoms of the supported  $\text{Pt}$  nanocluster projected onto the  $xy$  plane. The inset in panel (b) shows a representative snapshot extracted from the gas phase AIMD simulation. Time evolution of the Bader charges of  $\text{Pt}_T$  and  $\text{Pt}_1$  atoms (panel c), of the  $\text{Pt}_6$  cluster and of the ceria substrate (d), and of the number of  $\text{Ce}^{3+}$  ions in the  $\text{CeO}_2$  surface (e). Horizontal lines in panel (c) correspond to the values of Bader charges of the  $\text{Pt}_T$  atom and the range of values of the  $\text{Pt}_1$  atoms in the equilibrium lowest energy configuration.



**Figure 2.** Representative AIMD configurations showing an interfacial Pt<sub>1</sub> site coordinating (a) hydroxide and (b) water species, and (c) the apical Pt<sub>T</sub> site coordinating two water molecules. (d) Pt–O and (e) Pt–H radial distribution functions (RDFs) and their deconvolution into individual components involving the Pt<sub>T</sub> and Pt<sub>1</sub> sites and the O atoms from water (O<sub>W</sub>) and hydroxide (O<sub>OH</sub>) species. SDFs projected on the  $xy$  plane of (f) Pt atoms and OH species, and (g) Pt atoms and H<sub>2</sub>O species.

report the computed Bader charges of the Pt<sub>T</sub> and Pt<sub>1</sub> atoms, respectively. The horizontal-dashed lines represent the Bader charge values calculated at the equilibrium positions. Overall, the cluster is polarized with a clear charge depletion at the interfacial Pt<sub>1</sub> atoms with respect to the apical Pt<sub>T</sub> atom (time average of the Bader charges  $\langle q^{\text{Pt}_1} \rangle = 9.8$  lel;  $\langle q^{\text{Pt}_T} \rangle = 10.2$  lel). The Pt<sub>T</sub> Bader charge is compatible with the one calculated in the bulk phase ( $\langle q^{\text{Pt}_{\text{bulk}}} \rangle = 10$  lel), and its fluctuations are four times smaller than those of the Pt<sub>1</sub> charges. The reason of this difference is in the interfacial charge dynamics/transfer that is activated by the thermal fluctuations of the Pt and CeO<sub>2</sub> atoms.

This is shown more clearly by plotting the collective Bader charge differences of the Pt<sub>6</sub> and CeO<sub>2</sub> systems,  $\Delta Q^{\text{Pt}_6}(t)$  and  $\Delta Q^{\text{CeO}_2}(t)$ , respectively, that are reported in Figure 1d) as a function of time. These differences are defined with respect to the reference Bader charges computed at the beginning of the production trajectory (see Methods). The time-evolution of  $\Delta Q^{\text{Pt}_6}(t)$  (grey line) does not fluctuate regularly around an average value but it displays sharp transitions, which are perfectly correlated with equivalent and opposite transitions in the charge of the CeO<sub>2</sub> support  $\Delta Q^{\text{CeO}_2}(t)$  (yellow line). Furthermore, the latter charge transitions correlate with the change in the number of reduced Ce<sup>3+</sup> ions,  $N_{\text{Ce}^{3+}}$ , which are plotted in Figure 1e, and which fluctuates between 3 and 2.

Besides providing the reference to assess the effects of solvation on cluster properties, this analysis shows that, at room temperature, the charge of the supported Pt cluster is not constant. It dynamically fluctuates because of charge transfers across the metal/oxide interface of  $\approx 1$  electron, which are activated by the atomic displacements and which affect the degree of reduction of the ceria support.

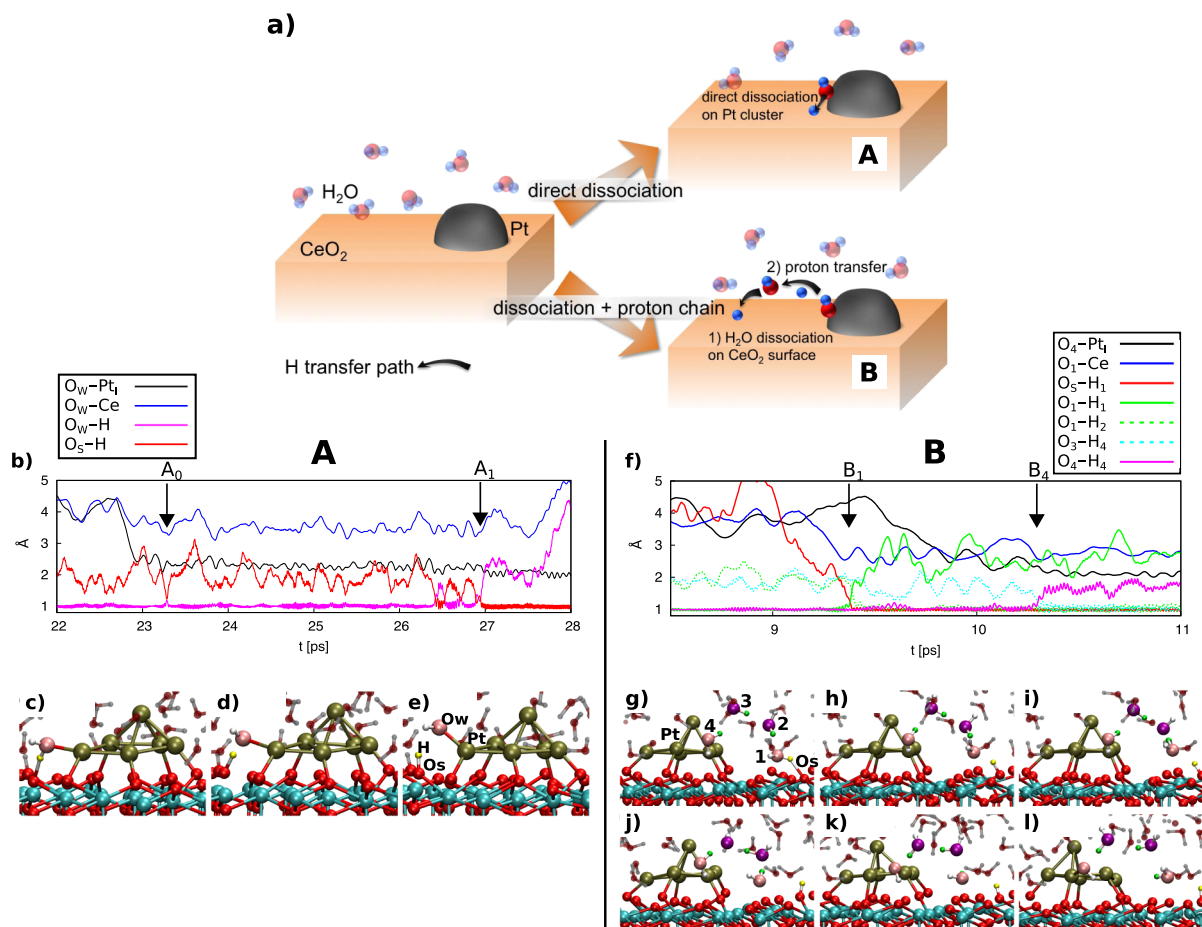
**Pt<sub>6</sub>/CeO<sub>2</sub>/Water System.** Having established the electronic structure and dynamical properties of the Pt/CeO<sub>2</sub> gas-phase system, we now analyse the effect of solvation on the ceria-supported Pt cluster. To this end, we have performed extensive ( $\sim 30$  ps) PBE +  $U$  AIMD simulations of the Pt<sub>6</sub>/

CeO<sub>2</sub>/water system, (see the Supporting Information and Figure S1c). Representative snapshots of these AIMD simulations are displayed in Figure 2a–c).

We first analyze the structure of the solvation shell around the Pt<sub>6</sub> cluster in terms of the Pt–O RDF, displayed by the black line in Figure 2d. The black thick line indicates the total Pt–O RDF calculated between all the Pt atoms and all the O atoms of the solvent water molecules. This first peak in this Pt–O RDF provides insight into the solvation shell structure of the supported Pt cluster. It has two clear components at 2.09 and 2.24 Å, and it is well separated from the larger Pt–O contributions of bulk water molecules.

Our simulations show that the two components of the first solvation peak can be attributed to specific OH and H<sub>2</sub>O species that bind selectively to different cluster sites. To demonstrate this, we deconvolute the Pt–O RDF into its components (Figure 2d) involving the interfacial (Pt<sub>1</sub>–O, thin solid black line) and top (Pt<sub>T</sub>–O, dashed line) Pt atoms, as well as the O atoms from dissociated (Pt–O<sub>OH</sub>, blue line) and molecular (Pt–O<sub>W</sub>, red line) water molecules. This analysis clearly demonstrates that hydroxide species binds preferentially to the interface Pt<sub>1</sub> atoms, which give rise to the Pt–O RDF peak at 2.09 Å. One instance of this configuration is shown in Figure 2a, in which one of the interacting OH groups has been highlighted. Water molecules instead preferentially interact with the top Pt atom (Pt<sub>T</sub>–O<sub>W</sub>), which is the most metallic and the furthest away from the metal/oxide interface, leading to the peak at 2.24 Å. A representative configuration is shown in Figure 2c.

Although the interfacial Pt<sub>1</sub> atoms stabilise mostly OH species, water molecules are stable on Pt<sub>1</sub> sites for shorter times during our AIMD simulation run. This is evident in the Pt–O<sub>W</sub> RDF, which displays a nonnegligible contribution to the 2.24 Å Pt–O peak. This contribution is because of those water molecules at the Pt<sub>1</sub> cluster sites that undergo dissociation during the AIMD simulation. This demonstrates the active role of the periphery of the Pt/CeO<sub>2</sub> interface toward water



**Figure 3.** (a) Water dissociation pathways occurring at the Pt/ceria interface (A) and at the ceria surface (B). (b,f) Time evolution relevant bond lengths during water dissociation pathway A and B, respectively. Representative snapshots of the dissociation reactions A (c–e) and B (g–l).

dissociation, which will be discussed in the following. One instance of a metastable water molecule at the Pt/CeO<sub>2</sub> interface before dissociation is shown in Figure 2b. The proton that is transferred to the oxide support is displayed in yellow in Figure 2a,b. The conclusion that the interfacial Pt<sub>i</sub> and metallic Pt<sub>T</sub> atoms coordinate mostly OH and H<sub>2</sub>O species, respectively, is further supported by the analysis of the Pt–H RDF (Figure 2e).

The structural analysis of the solvation shell resulting from the AIMD simulation points to a *cationic* solvation pattern of the Pt<sub>6</sub>/CeO<sub>2</sub> system, that is the molecular and dissociated water molecules in the solvation shell point their O atoms toward the Pt<sub>i</sub> and Pt<sub>T</sub> sites. Note that this solely *cationic* solvation pattern differs from that one observed in AIMD simulations of other water-solvated oxide-supported metal clusters. For example, the solvation shell around the Au<sub>11</sub>/TiO<sub>2</sub> system displays both *cationic* and *anionic* solvation pattern depending on the fluctuating charge state of the metal sites.<sup>12,31</sup> This dual solvation structure is not observed for the present Pt<sub>6</sub>/CeO<sub>2</sub>/H<sub>2</sub>O system and the reason can be traced back to the different polarisation of the solvated Au and Pt clusters. Two opposite charge states can be identified in the Au atoms of the solvated Au<sub>11</sub>/TiO<sub>2</sub> system, which then stabilize the coexisting anionic and cationic solvation pattern. Only one charge state (positive) is instead predicted for the Pt atoms of the solvated Pt<sub>6</sub>/CeO<sub>2</sub>/H<sub>2</sub>O system, which therefore underpins the cationic solvation pattern. The cluster size may likely influence the latter cluster property.

The *xy*-projected SDFs calculated for Pt and hydroxide ions (Pt–O<sub>OH</sub>), and for the Pt and H<sub>2</sub>O molecules (Pt–O<sub>w</sub>) are reported in Figure 2f,g, respectively. This analysis confirms the selective adsorption of hydroxide OH<sup>−</sup> species to the interfacial Pt<sub>i</sub> atoms and the preferential water coordination of the apical Pt<sub>T</sub> atom. This selectivity is fully due to solvation because it is absent for the ceria-supported Pt cluster exposed to vacuum (see the Supporting Information).

This SDF analysis shows that solvation affects also the dynamics and structure of the supported Pt cluster. A direct comparison of the projected-SDFs of the solvated (Figure 2f,g) and gas-phase Figure 1b Pt cluster shows that the Pt<sub>T</sub> apical atom occupies, on average, different positions with respect to the underlying Pt layer in contact with the oxide. When the supported Pt cluster is exposed to vacuum, the Pt<sub>T</sub> atom is in an fcc site, thus binding to three neighboring Pt<sub>i</sub> atoms. When the cluster is solvated, the interaction of the water molecules with the Pt<sub>T</sub> atom displaces it to a lower-coordinated bridge site, thus binding to two neighboring Pt<sub>i</sub> atoms.

Our simulations predict that water dissociation is activated by this Pt<sub>6</sub>/CeO<sub>2</sub> solid/liquid interface already at *T* = 350 K. The analysis of the trajectories shows that two different dissociation mechanisms take place during the 30 ps of the AIMD run (A and B in Figure 3a). They differ in the active sites that promote the reaction: (A) direct water dissociation at the Pt<sub>i</sub> site of the metal–oxide periphery, and (B) chain of water dissociations activated by the ceria surface. Note that both processes lead to the same final product, i.e., an OH

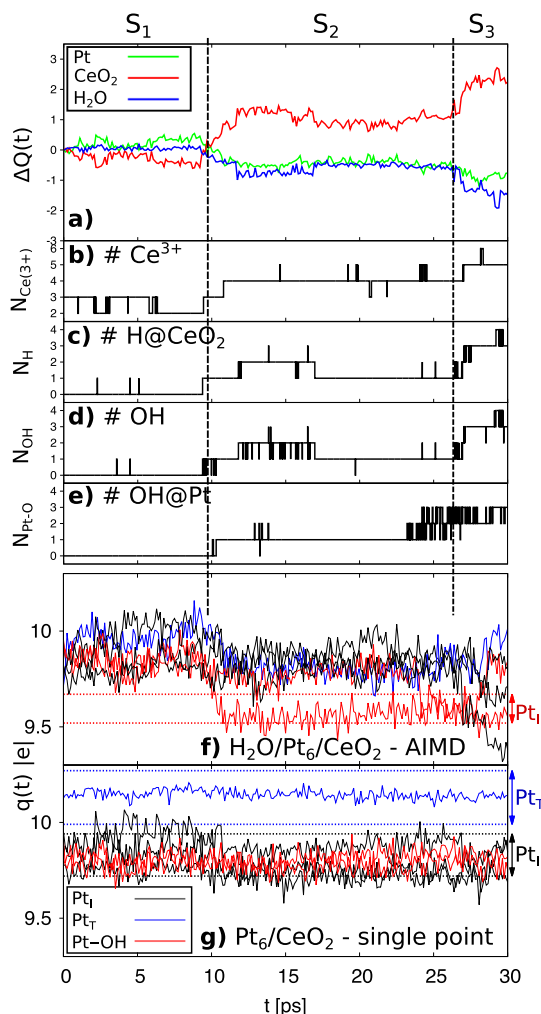
species bound to a  $\text{Pt}_1$  cluster site. These reaction mechanisms are analyzed by plotting the time evolution of selected bond lengths involved in the dissociation processes (Figure 3b,f).

Process A takes place between  $t = 23$  and  $t = 27$  ps. It begins with the binding of a water molecule to a  $\text{Pt}_1$  site, as seen from the shortening of the  $\text{Pt}_1\text{--O}_W$  distance (black line at time frame  $A_0$ ) to  $\approx 2.3$  Å. The water molecule points its  $\text{O}_W$  atom to the  $\text{Pt}_1$  site, as displayed by the representative snapshot in Figure 3c. The water molecule dissociates after  $\approx 3.5$  ps ( $t = 27$  ps, time frame  $A_1$ ), via proton transfer to the closest surface  $\text{O}_S$  atom, as seen from the correlated  $\text{O}_S\text{--H}$  (red) shortening and  $\text{O}_W\text{--H}$  (purple) lengthening. Figure 3d,e displays the intermediate and final configurations that lead to the formation of the  $\text{O}_S\text{--H}$  and  $\text{Pt}_1\text{--O}_W\text{H}$  groups. We anticipate here that this dissociation process drives the charge transfer of  $\approx 1$  electron from the hydroxide species, to the Pt cluster and finally to the ceria surface (see below for details of the charge analysis).

Process B takes place between  $t = 9$  and  $t = 11$  ps. It involves a proton chain between four water molecules that mediate the diffusion of a hydroxide species from the ceria surface—which triggers the first dissociation—to the  $\text{Pt}_1$  site—which captures and immobilizes the hydroxide into a  $\text{Pt}_1\text{--OH}$  group. This complex interface reaction is described in Figure 3f in terms of the time evolution of interatomic distances involving protons  $\text{H}^+$  and O atoms of the four participating water molecules, which are labeled  $\text{H}_i^+$  and  $\text{O}_i$  with  $i = 1, \dots, 4$  (see Figure 3g). We omit here the W subscript.

The first water dissociation ( $t \approx 9.4$  ps, time frame  $B_1$ ) takes place on the ceria surface at  $10.2$  Å away from the Pt cluster and involves the transfer of the  $\text{H}_1^+$  proton to a surface  $\text{O}_S$  site. See the shortening (lengthening) of the  $\text{O}_S\text{--H}_1$  ( $\text{O}_1\text{--H}_1$ ) distance and the snapshot in Figure 3h). The resulting hydroxide  $\text{O}_1\text{H}_1^-$  triggers the dissociation of a neighboring bulk water molecule, which transfers its proton to the  $\text{O}_1\text{H}_1^-$  hydroxide and turns it back into a water molecule (see Figure 3i). This creates a new  $\text{O}_2\text{H}_2^-$  hydroxide, which activates the same proton transfer described above with the neighboring water molecule 3 and leads to a new  $\text{O}_3\text{H}_3^-$  hydroxide displayed in Figure 3j). Finally, the latter accepts a proton from the water molecule 4, which is close to the  $\text{Pt}_1$  site (see Figure 3k). This fourth water dissociation ( $B_4$  in Figure 3f) and the related proton transfer takes place  $\approx 1$  ps after the first water dissociation  $B_1$ . It leads to the  $\text{Pt}_1\text{--O}_4\text{H}_4$  species displayed in Figure 3l, which is the same product of dissociation mechanism A. The overall effect of this proton chain is to effectively transfer hydroxide ions from the ceria surface, where they are formed after water dissociation, to the periphery of the metal oxide. This fast hydroxide diffusion toward the supported Pt cluster is mediated by a Grotthus-like mechanism described before.<sup>29</sup> The charge transfer induced by the interaction of the hydroxide ion with the  $\text{Pt}_1$  site (see below) locks the  $\text{Pt}_1\text{--OH}$  product and prevents the reverse conversion to  $\text{Pt}_1\text{--OH}_2$ .

We now investigate the charge reorganization at the Pt/CeO<sub>2</sub>/water interface induced by the solvent and by the water dissociation reactions. Similarly to the reference gas-phase system, the charge dynamics is analyzed in terms of time-dependent Bader charge differences  $\Delta Q^{\text{Pt}_6}(t)$ ,  $\Delta Q^{\text{CeO}_2}(t)$ ,  $\Delta Q^{\text{H}_2\text{O}}(t)$ , and of the number of fully reduced  $\text{Ce}^{3+}$  ion (see Figure 4a,b, respectively). Panels (c–e) of the same figure report a statistical analysis of water dissociation in terms of the number of H and OH species interacting with the ceria substrate and  $\text{Pt}_6$  cluster. The analysis of the charge dynamics



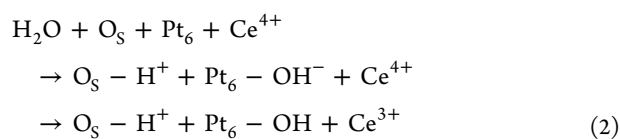
**Figure 4.** (a) Bader charge differences of the  $\text{Pt}_6$  cluster,  $\text{CeO}_2$  surface, and  $\text{H}_2\text{O}$  molecules. (b) Number of reduced  $\text{Ce}^{3+}$  ions on the ceria surface. Number of protons  $\text{H}^+$  (c) and hydroxide  $\text{OH}^-$  groups (d). (e) Number of  $\text{H}_2\text{O}$  and  $\text{OH}$  species interacting with the Pt cluster. (f) Bader charges of Pt atoms in the solvated system and (g) in the corresponding gas phase system obtained by removing all the water molecules.

along the AIMD trajectory displayed in Figure 4 can be divided in three sections (labeled  $S_1$ ,  $S_2$ , and  $S_3$ ) according to the average values of Bader charge differences, with particular reference to  $\Delta Q^{\text{H}_2\text{O}}(t)$ .

During the first 10 ps of the AIMD simulation (section  $S_1$ ), the Bader charge differences  $\Delta Q^{\text{Pt}_6}(t)$  and  $\Delta Q^{\text{CeO}_2}(t)$  display fluctuations and sharp transitions that correlate with the number of  $\text{Ce}^{3+}$  ions in the cluster and substrate that take place simultaneously and have opposite signs. The abrupt changes of average values in the  $\Delta Q^{\text{Pt}_6}(t)$  and  $\Delta Q^{\text{CeO}_2}(t)$  along the dynamics in section  $S_1$  reflect the charge transfers of  $\approx 1$  e between the supported Pt cluster and the ceria substrate that are induced by the cluster/substrate dynamics. Quite importantly, water is not involved in these charge transfers: The solvent  $\Delta Q^{\text{H}_2\text{O}}(t)$  fluctuates around 0. Note that no water dissociation takes place during section  $S_1$  of the trajectory.

Section  $S_2$  (from  $t \approx 10$  ps to  $t \approx 27$  ps) of the AIMD simulation exhibits a different charge pattern. The charge analysis of Figure 4a clearly shows a significant charge transfer

from the solvent and supported Pt cluster to the ceria substrate. The analysis of the trajectory around  $t = 10$  ps reveals that this event originates from the water dissociation  $B_1$  described above which leads to the  $Pt_1$ -OH product (Figure 4). Hydroxide adsorption to the  $Pt_1$  cluster site drives the transfer of  $\approx 1$  electron to the substrate, thus increasing the average number of  $Ce^{3+}$  ions from 3 to 4 (Figure 4b). This is further corroborated by the analysis reported in Figure 4c–e that highlights the correlation between the increase in the number of hydroxide species adsorbed to the Pt cluster and in the number of reduced  $Ce^{3+}$  species. With respect to the average values in section  $S_1$ , the Bader charge differences  $\Delta Q^{Pt_6}(t)$ ,  $\Delta Q^{CeO_2}(t)$ , and  $\Delta Q^{H_2O}(t)$  change in Section B by  $-0.65$ ,  $1.27$ , and  $-0.59$  e, respectively. Differently from the gas phase, the charge transfer does not involve only the  $Pt_6/CeO_2$  system [red and green lines in Figure 4a but also the solvent water molecules (blue line)]. In particular, upon water dissociation and hydroxide adsorption, the charges of both the  $Pt_6$  and hydroxide species decrease by  $\approx 1$  e, which is transferred to the ceria substrate and localizes on a Ce ion, reducing it to  $Ce^{3+}$ . Overall, the process can be described as:



Note that the dissociation of  $H_2O$  molecules on the ceria surface in the absence of the Pt cluster does not reduce the ceria substrate as described in refs.<sup>29,32,33</sup> Therefore, the increase in the number of reduced  $Ce^{3+}$  ions is only related to the hydroxide interaction with the solvated Pt cluster and to the related charge transfer from the  $Pt_6$ -OH<sup>-</sup> system to the ceria substrate.

At the beginning of the last part of the simulations (section  $S_3$ , from  $t \approx 27.5$  ps to  $t = 30$  ps), another water dissociation event takes place, which triggers the same set of charge-transfer processes described above for section  $S_2$ . The data reported in (Figure 4) show that, during section  $S_3$ , an additional hydroxide species binds to a  $Pt_1$  cluster site. It drives electron transfer from the cluster to the oxide substrate and leads to the appearance of another  $Ce^{3+}$  ion, that is further reducing the ceria substrate. As a result, the Bader charge differences  $\Delta Q^{Pt_6}(t)$ ,  $\Delta Q^{CeO_2}(t)$ , and  $\Delta Q^{H_2O}(t)$  change with respect to the average values in section  $S_2$  by  $-0.46$ ,  $1.30$ , and  $-0.84$  e, respectively.

The effect of solvation on the cluster charge can be further assessed by comparing the Pt Bader charges computed in the presence and absence of the water molecules for the same  $Pt_6/CeO_2$  configurations. This charge analysis can be done by performing two single-point self-consistent calculations for each selected snapshot of the AIMD trajectory: one calculation of the full  $Pt_6/CeO_2$ /water system, the other calculation of the  $Pt_6/CeO_2$  excluding all the water molecules, that is in the same structural configuration of the  $Pt_6/CeO_2$ /water snapshot. The results for the  $Pt_6/CeO_2$  solvated and in-vacuum are reported in Figure 4f,g, respectively.

Before water dissociation (section  $S_1$ ), all the Pt Bader charges of the solvated cluster fluctuate over the same [9.6–10.2] e interval (Figure 4f). Instead, without solvating water, the  $Pt_T$  and  $Pt_1$  Bader charges fluctuate around distinctively different ranges, [10.1,10.2] e and [9.6,10.1] e, respectively (Figure 4g). The latter result is in good agreement with the

charge analysis performed on the AIMD dynamics of the  $Pt_6/CeO_2$  system exposed to vacuum (see Figure 1c and red lines in Figure 4f). The solvated cluster is therefore much less polarized than in the gas phase because of the dielectric nature of the solvent and related screening.

After water dissociation (sections  $S_2$  and  $S_3$ ), in the solvated system, the Bader charge of the  $Pt_1$  atom binding an OH adsorbate decreases to [9.4–9.6 e], whereas the charge of all the other solvated  $Pt_1$  and  $Pt_T$  atoms remains in the [9.6, 10.2 e] range (Figure 4f). This specific charge depletion due to water dissociation is much weaker when removing the solvating water molecules [see Figure 4g and Supporting Information].

## CONCLUSIONS

In conclusion, our extensive AIMD simulations allowed unveiling the solvent effects at the interface between water and a ceria-supported Pt cluster. We demonstrate that  $H_2O$  molecules can directly dissociate at the periphery of the supported nanoparticle into protons  $H^+$  that hydroxylate the surface and hydroxide  $OH^-$  ions that selectively bind to the metal–oxide interfacial sites of the platinum cluster. We also observe that water molecules dissociate away from the nanoparticle, on the oxide surface, and that the resulting hydroxide species are quickly transferred to the same interfacial Pt sites via a Grotthus-like proton transfer chain mediated by interfacial solvent molecules. The two observed processes are accompanied by substantial charge reorganization at the metal oxide contact, resulting in charge transfer from the solvent and Pt cluster to the oxide support.

We can therefore conclude that solvation not only controls the selective binding of the  $OH^-$  species to the  $Pt_1$  sites at the periphery of the metal–oxide interface, but also determines the charge of the cluster, by driving electron transfer to the substrate that is proportional to the number of coordinating  $OH^-$  species. Moreover, the oxidation of the  $Pt$ -OH<sup>-</sup> sites—coupled to the reduction of the  $Ce^{3+}$  underneath—locks the OH species to the cluster, preventing its back transformation into a solvent water molecule. Because the charge is a key parameter controlling reactivity of supported clusters, our results have general important implications in wet heterogeneous catalysis, with particular reference to hydrogenation/dehydrogenation and electro-chemical reactions.

## ASSOCIATED CONTENT

### Supporting Information

The Supporting Information is available free of charge on the ACS Publications website at DOI: 10.1021/acs.jpcc.8b09154.

Computational supercells and gas-phase properties of the  $Pt_6/CeO_2$  system (PDF)

## AUTHOR INFORMATION

### Corresponding Author

\*E-mail: fabris@iom.cnr.it.

### ORCID

Lucie Szabová: 0000-0003-1901-1490

Matteo Farnesi Camellone: 0000-0001-9180-0115

Yoshitaka Tateyama: 0000-0002-5532-6134

Stefano Fabris: 0000-0003-2562-8788

## Present Addresses

<sup>||</sup>CERIC-ERIC S.S. 14—Km 163.5 in AREA Science Park, I-34139, Trieste (Basovizza), Italy.

<sup>†</sup>Universidade Federal do ABC, Av. dos Estados, 5001 Bairro Bangu, Santo André SP, CEP 09210-580 Brazil.

## Notes

The authors declare no competing financial interest.

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