Ab-initio design of light absorption through silver atomic clusters decoration of TiO$_2$

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A first-principles study of the stability and optical response of subnanometer silver clusters Ag$_n$ ($n \leq 5$) on a TiO$_2$(110) surface is presented. First, the adequacy of the vDw-corrected DFT-D3 approach is assessed using the domain-based pair natural orbital correlation approach DLPNO-CCSD(T) along with the Symmetry-Adapted Perturbation Theory [SAPT(DFT)] method with a cluster model. Next, using the DFT-D3 treatment with a periodic slab model, we analyze the interaction energies of the atomic silver clusters with the TiO$_2$(110) surface. Finally, the hybrid HSE06 functional and a reduced density matrix treatment are applied to obtain the projected electronic density of states and photo-absorption spectra of the TiO$_2$(110) surface, with and without adsorbed silver clusters. Our results show the stability of the supported clusters, the enhanced light absorbance intensity of the material upon their deposition, and the appearance of intense secondary broad peaks at the near-infrared and the visible region of the spectrum, with positions depending on the size and shape of the supported clusters. The secondary peaks arise from the photo-induced transfer of electrons from the photo-induced transfer of electrons from intra-band valence 5s orbitals of the noble-metal cluster to 3d Ti band states of the supporting material.

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TOC: This first-principles study reveals how stable subnanometer silver clusters on a TiO$_2$(110) surface lead to the onset of absorption bands in the near-infrared and visible regions.
1 Introduction

Due to their extraordinary stability and selectivity\(^1\) bare metal clusters of subnanometer size composed of a few atoms have recently emerged as a new generation of catalysts\(^2\)–\(^4\) and photocatalysts.\(^5\),\(^6\) The synthesis of such molecular-like species has been achieved by kinetic control using an electro-chemical technique without employing surfactants or capping agents.\(^7\) Appealing potential applications of these angstrom size objects have been found in important areas such as the development of cancer therapeutic drugs through intercalation of Ag\(_n\) clusters,\(^8\),\(^9\) and hydrogen photo-production by means of Ag clusters adsorbed on gold nanostructures.\(^5\) Realizing these atomic metal clusters as widely used functional materials requires them being stable and accessible through, for example, attachment to solid supports. Moreover, recently developed experimental tools have allowed to realize “soft-landing” conditions in the deposition of metal clusters on solid surfaces.\(^10\)–\(^13\) In this work, the stability of deposited Ag\(_n\) clusters (with \(n \leq 5\)) on the TiO\(_2\)(110) rutile surface is analyzed.

Titanium dioxide TiO\(_2\) has wide-ranging and well-known applications e.g. in semiconductor photocatalysis (for recent reviews see, e.g., Refs. 14,15), making it one of the most frequently studied support materials. However, TiO\(_2\) can only be activated by UV irradiation, i.e. by about 5–8% of the solar spectrum radiation. The photocatalytic activity of TiO\(_2\) surfaces is also much influenced by by the dynamics of the photo-generated holes and electrons which need to reach the surface to be catalytically active.\(^16\),\(^17\) The hole-electron recombination (about 90% of the photo-generated hole-electron pairs) in particular, severely limits the photocatalyst efficiency. As a result, the rate of formation of reaction products divided by the incident photon flow is below 10% in TiO\(_2\)-based photocatalysts.\(^14\),\(^18\) A successful alternative is to decorate the surface with adsorbed metal nanoparticles.\(^16\),\(^17\) They alter the electronic band structure near the surface increasing the photo-generation of electron-hole pairs very close to the site where the photocatalysis happens. Besides, at the metal-oxide interface a space charge or a depleted region develops that hinders electron-hole recombination. Furthermore, localized surface plasmon resonances (LSPR) at the nanoparticles induce light absorption in the visible region.\(^16\)

Within this context, stable surface attachment of metal atomic clusters opens a very promising new route to photocatalytic enhancement of solid surfaces such as those based in TiO\(_2\). Given its atomic scale they are ideally suitable for electronic band modification at the very surface, possibly in a profitable way for photocatalytic applications. Indeed, photocatalytic quantum efficiencies increased by three orders of magnitude has been already demonstrated using small Cu clusters.\(^5\) Here, once analyzed their stability, we explore, using ab-initio modelling, such a electronic band modification induced by deposited Ag\(_n\) clusters (with \(n \leq 5\)) on TiO\(_2\). Furthermore, with this applicability in mind, we have also calculated the corresponding light absorption spectra in search of prominent solar light absorption, an experimentally verifiable fingerprint to identify promising candidates for the development of photocatalytic and photovoltaic applications.

As far as the stability of the adsorbed atomic clusters is concerned, we have chosen the DFT-D3 method\(^19\),\(^20\) among the vDW-corrected DFT treatments after validation using both he domain-based pair natural orbital correlation approach DLPNO-CCSD(T)\(^21\) and the Symmetry-Adapted Perturbation Theory [SAPT(DFT)] method.\(^22\),\(^23\) In regarding the electronic band structure calculations, we have relied on the hybrid HSE06 functional\(^24\),\(^25\) since it have demonstrated a notorious accuracy on TiO\(_2\) band gap calculations. Finally, to calculate the absorption spectra, we use the reduced density matrix (RDM) theory within the Redfield approximation\(^26\) combined with HSE06 calculations This RDM treatment has been successfully applied to Ag\(_n\) clusters adsorbed on semiconductor silicon surfaces.\(^27\)–\(^29\) In the next section, we briefly present the methods used in this study. Our results are reported in Section 3. Finally, the main conclusions are provided in Section 4.

2 Method

2.1 Structural models

![Fig. 1 Figure illustrating a side view of the slab model of the TiO2(110) surface used in this work. The position of five-fold (Ti5f) and bridging oxygen (Ob) atoms is also indicated.](image-url)
The calculations on the periodic slabs were carried out using the 4×2 supercell (four TiO$_2$ trilayers giving ca. 13 Å width slab) model shown in Figure 1 and reported in Ref. 30. The adsorption of the silver clusters has been modeled on one side of the slab and the vacuum region above the slab was 38 Å thick. This large vacuum region allowed the description of long-range tails of the cluster-surface interaction potentials while avoiding unphysical overlaps of electronic densities. Periodic calculations were carried out by freezing the positions of the O and Ti atoms to those determined by Busayaporn et al.\cite{31} using X-Ray Diffraction (XRD). Following Ref. 32, the hydrogen-saturated cluster of stoichiometry Ti$_9$O$_{25}$H$_{14}$ (see Figure 2) was used in our finite cluster calculations. The geometry of the model cluster has also been frozen to the experimental geometry of the TiO$_2$(110)–(1×1) surface.\cite{31} Both periodic and cluster structural models have been previously used to study the adsorption of noble gases on the same surface,\cite{33} showing a good agreement for calculated adsorption energies with experimental measurements.\cite{34}

2.2 Theoretical approaches using surface cluster models

Using the cluster shown in Figure 2 to model the Ag$_2$/TiO$_2$(110) interaction, the DLPNO-CCSD(T) approach\cite{21} along with the SAPT(DFT) method have been applied to assess the performance of the chosen vdW-corrected DFT treatment. The interaction energies were calculated as a function of the cluster-surface distance and included the counterpoise correction\cite{36} to account for the basis set superposition error. The frozen-core treatment was used for 140 chemical core electrons. The SAPT(DFT) method was applied adopting the Perdew-Burke-Ernzerhof (PBE) density functional.\cite{37} This method\cite{22,23,38,39} has allowed to decompose the interaction energy as a sum of first- and second-order interaction terms, namely first-order electrostatic $E_{\text{elec}}$ and exchange $E_{\text{exch}}$, second-order induction $E_{\text{ind}}$ and dispersion $E_{\text{disp}}$ terms, along with their respective exchange corrections ($E_{\text{exch-ind}}$ and $E_{\text{exch-disp}}$). The $\delta$(HF) estimate\cite{40,41} of the higher-order induction plus exchange-induction contributions was added to the SAPT(DFT) interaction energies. Specifically, the $\delta$(HF) correction is defined as,\cite{40}

$$\delta(\text{HF}) = E_{\text{int}}(\text{HF}) - E_{\text{elec}}(\text{HF}) - E_{\text{exch}}(\text{HF}) - E_{\text{ind}}(\text{HF})$$

where $E_{\text{int}}$ is the supermolecular HF interaction energy and the other terms are calculated using the HF density matrices. The dispersion and exchange-dispersion SAPT(DFT) contributions were summed to provide the total exchange-repulsion part, as were the

In periodic and cluster calculations, the Ag$_2$ internuclear distance was fixed to the experimentally determined value\cite{35} (2.531 Å). Complementary results on the optimization of supported and unsupported Ag$_2$ structures are presented in the supplementary information.
induction, exchange-induction and δ(HF) contributions into the total induction term.

2.3 Theoretical approaches using periodic models
The periodic vdw-corrected PBE-D3 treatment has been applied to calculate interaction energies and optimized geometries after assessing its performance with the DLPNO-CCSD(T) and SAPT(DFT) approaches. Due to the underestimation of the band gap from the spurious electron self-interaction in the semilocal PBE treatment, the projected density of states and photo-absorption spectra were instead calculated with the hybrid HSE06 screened density functional.\textsuperscript{24,25} This functional has been chosen because its capability to provide accurate band gaps of dielectric and semiconductor compounds.\textsuperscript{42} It has also been the preferred approach in previous studies of optical and other electronic properties of TiO\textsubscript{2}.\textsuperscript{43–45} In this work, the HSE06 treatment has provided a direct band gap of 3.26 eV for the TiO\textsubscript{2}(110) surface, agreeing very well with experimental measurements for bulk rutile (3.3 ± 0.5 eV).\textsuperscript{46}

2.4 Reduced Density Matrix treatment

2.4.1 Steady State Density Matrix
In order to calculate light absorption in the system, we model the involved relaxation processes by means of the reduced density matrix (RDM) approach in the Redfield approximation\textsuperscript{26} and using an electronic basis set of orbitals generated from DFT calculations.\textsuperscript{47,48} When the monochromatic electromagnetic field ε of frequency Ω is applied, the evolution equation for the RDM, ρ, in the Schrödinger picture reads,

\[ \dot{\rho}_{jk} = -\frac{i}{\hbar} \sum_l (F_{jl} \rho_{lk} - \rho_{lj} F_{lk}) + \sum_{l,m} R_{jklm} \rho_{lm} \]  

(2)

\[ F = F^{KS} - \hat{D} \cdot \mathbf{\varepsilon}(t) \]  

(3)

\[ \varepsilon(t) = \varepsilon_0 (e^{i\Omega t} + e^{-i\Omega t}) \]  

(4)

where \( F^{KS} \) is the effective Kohn-Sham Hamiltonian, the indexes refers to the Kohn-Sham basis set, \( \hat{D} \) is the electric dipole moment operator and \( R_{jklm} \) stand for Kohn-Sham components of the relaxation tensor (Redfield coefficients). The Redfield coefficients are defined as in Ref. 26 and are implemented as described in Ref. 47. This approximation is valid for medium phenomena relaxing over times long compared with transient energy exchange between the adsorbate and its medium.

Within the Redfield approximation used here, the relaxation tensor not only describes the effect of the fast electronic dissipation due to electronic fluctuations in the medium at long times but also the relatively slow relaxation owing to the atomic lattice vibrations. It is convenient to change to a rotating frame accounting for the electromagnetic field oscillation,

\[ \dot{\rho}_{ij}(t) = \rho_{ij}(t) \exp(i\Omega t), \epsilon_i > \epsilon_j \]  

(5)

\[ \rho_{ij}(t) = \rho_{ij}(t) \exp(-i\Omega t), \epsilon_i < \epsilon_j \]  

(6)

\[ \rho_{ii}(t) = \rho_{ii}(t) \]  

(7)

where \( \epsilon_i \) is the energy of the \( i \)th Kohn-Sham orbital. After averaging out over time the fast terms in the equation of motion for the RDM, its stationary-state solution for the diagonal elements reads,\textsuperscript{47,49}

\[ \tilde{\rho}_{jj}^{SS} = 2\Gamma^{-1} \sum_{k=0}^{\infty} g_{jk}(\Omega), \ j \geq \text{LUMO} \]  

(8)

\[ \tilde{\rho}_{jj}^{SS} = 2 - 2\Gamma^{-1} \sum_{k=\text{LUMO}}^{\infty} g_{jk}(\Omega), \ j \leq \text{HOMO} \]  

(9)

where LUMO stands for the lowest unoccupied molecular orbital and HOMO denotes de highest occupied one. \( \Gamma \) is a depopulation rate and

\[ g_{jk}(\Omega) = \frac{\gamma_{jk}(\Omega)}{\Gamma^2 + \Delta_{jk}(\Omega)^2} \]  

(10)

Here \( \gamma \) is a decoherence rate, \( \Omega_{jk} \) are the Rabi frequencies given by \( \Omega_{jk} = -\mathbf{D}_{jk} \cdot \mathbf{\varepsilon}_0 / \hbar \) and \( \Delta_{jk}(\Omega) = \Omega - (\epsilon_j - \epsilon_k) \) are the detunings. The diagonal elements provide the populations of the KS orbitals. The population relaxation rate \( \hbar \Gamma \) and the decoherence rate \( \hbar \gamma \) were not computed but fixed to values of 0.15 meV and 150 meV (27 ps and 27 fs) and have been chosen to be of the order of rates for semiconductors following decay of phonon and electronic density excitations (see, e.g., Ref. 50 for values from measurements of adsorbates on TiO\textsubscript{2}).

As far as the populations are concerned, an averaging over many light periods, as happens to be the case in the usual measurements, is equivalent to take the stationary solutions in the rotating frame.\textsuperscript{47}

2.4.2 Absorption spectrum
In terms of the stationary populations the absorbance is given by,\textsuperscript{28,29,51}

\[ \alpha(\Omega) = \sum_{j=0}^{\text{HOMO}} \sum_{k=\text{LUMO}} T_{jk}(\tilde{\rho}_{jj}^{SS} - \tilde{\rho}_{kk}^{SS}) \frac{1}{\pi} \frac{\hbar \gamma / 2}{(\hbar \Gamma)^2 + (\hbar \gamma / 2)^2} \]  

(11)

where \( T_{jk} \) is an oscillator strength per active electron. This is the purely dissipative contribution to the absorbance. We are assuming a thin slab neglecting dispersive effects, i.e., assuming refraction index ca. 1. The solar flux absorption spectrum is then given by,

\[ F(\hbar \Omega) = \alpha(\Omega) F_{\text{solar}}(\hbar \Omega) \]  

(12)
where the solar flux is approximated by the black body flux distribution, normalized to an incident photon flux of 1 kW/m²,

\[ F_{\text{solar}}(\hbar \Omega) = \frac{\hbar \Omega^3}{\pi \hbar c^3} \frac{C_T}{\exp(\hbar \Omega/k_B T) - 1} \]  

(13)

with \( C_T \) the flux normalization constant and the temperature \( T \) set to 5800 K.

2.5 Computational details

2.5.1 Surface cluster calculations

Surface cluster calculations were carried out employing correlation-consistent basis sets such as the (augmented) polarized correlation-consistent triple-\( \zeta \) (aug-cc-pVTZ) basis of Woon and Dunning, Jr.\textsuperscript{52}, as reported in Ref. 32 for oxygen and titanium atoms, while the aug-cc-pVTZ-PP basis was used for silver,\textsuperscript{53,54} including a small-core (19-valence-electron) relativistic pseudopotential.\textsuperscript{55} When applying the DLPNO-CCSD(T) and PBE-D3 treatments, the ORCA package of programs\textsuperscript{56} was employed (version 4.0.1.2).

The SAPT(PBE) calculations were performed with the MOLPRO package\textsuperscript{57} using the density-fitting technique\textsuperscript{38} and adopting the same computational setup of Ref. 32. The exchange-correlation PBE potential was asymptotically corrected\textsuperscript{58} with the ionization potential value reported in the NIST Chemistry Web Book for the silver dimer (7.66 eV from Ref. 59). For the cluster model of the TiO\(_2\)(110) surface, an ionization potential value of 5.0 eV was chosen on the basis of work function values characterizing TiO\(_2\)(110) surfaces\textsuperscript{60} (in between 4.9 and 5.5 eV).

2.5.2 Periodic calculations

To perform the periodic calculations, the computational setup reported in a previous study of the He/TiO\(_2\)(110) interaction\textsuperscript{30} was applied. For this purpose, we used the Vienna Ab initio Simulation Package (VASP 5.4.4).\textsuperscript{61,62} To describe the electron-ion interaction, the projector augmented-wave method was applied,\textsuperscript{62,63} using the PAW-PBE pseudopotentials supplied with the same code.

The electrons from O(2s, 2p), Ti(3s, 4s, 3p, 3d) and Ag(4d, 5s) orbitals were treated explicitly as valence electrons. As in Ref. 30, we used plane wave basis sets with a kinetic energy cutoff of 700 eV and a Gaussian smearing of 0.05 eV to account for partial occupations, with the Brillouin zone sampled at the \( \Gamma \) point only. Test calculations showed that interaction energies at the potential minimum using a \( 5 \times 5 \times 1 \) Monkhorst-Pack\textsuperscript{64} \( k \)-point mesh are within ca. 0.005 eV with those calculated at the \( \Gamma \) point (see supplementary information).

All interaction energies were determined using the supermolecular approach as follows,

\[ E_{\text{tot}} = E_{\text{Ag}/\text{TiO}_2(110)} - E_{\text{Ag}} - E_{\text{TiO}_2(110)} \]  

(14)

where \( E_{\text{Ag}/\text{TiO}_2(110)} \) is the total energy of the system, \( E_{\text{TiO}_2(110)} \) stands for the energy of the substrate, and \( E_{\text{Ag}} \) denotes the energy of the bare silver cluster.

Table 1 Decomposition of the Ag\(_2\)/TiO\(_2\)H\(_2\) interaction energy using the SAPT(PBE) method. \( Z \) stands for the equilibrium distance between the Ag atom closest to the surface and the five-fold coordinated Ti\(_{5f}\) atom (see left-hand panel of Figure 2). Well-depths and \( Z \) values of DLPNO-CCSD(T) and PBE-D3(BJ) potential energy curves are also shown (see right-hand panel of Figure 2).

|            | SAPT(PBE) | DLPNO-CCSD(T) | PBE-D3(BJ) |
|------------|-----------|---------------|------------|
| \( Z_e \), Å | 2.86      | 2.90          | 2.92       |
| \( E_{\text{tot}} \), meV | −429      | −414          | −447       |
| \( E_{\text{elec}} \), meV | −358      | −           | −          |
| \( E_{\text{exch-\text{rep}}} \), meV | 1141      | −           | −          |
| \( E_{\text{ind}} \), meV  | −574      | −           | −          |
| \( E_{\text{disp}} \), meV | −648      | −           | −          |

3 Results and Discussion

3.1 Assessment of the PBE-D3(BJ) approach at DLPNO-CCSD(T) and SAPT(DFT) levels

Cost-efficient calculations accounting for the extended nature of cluster-surface systems use vdW-corrected DFT methods. When applying a vdW-corrected DFT approach, benchmarking against accurate reference values is crucial. The coupled-cluster single, doubles and non-iterative triples [CCSD(T)] approach is ideally suited for this purpose. When applied to clusters modelling the TiO\(_2\)(110) surface, the incremental method\textsuperscript{65} has allowed to apply the CCSD(T) approach to adsorbate-TiO\(_2\)(110) systems (see e.g., Refs. 12,32), with the employment of localized orbitals making it very efficient. Using the domain-based local pair natural orbital approximation, the DLPNO-CCSD(T)\textsuperscript{21} is other ab-initio option that, when applied to molecules adsorbed on TiO\(_2\)(110), has provided excellent (within 1 kcal/mol) agreement with experimental data.\textsuperscript{66} In addition, previous works on the He-TiO\(_2\)(110) system using cluster models have shown that the SAPT(DFT) approach provides interaction energies very close to those obtained at CCSD(T) level.\textsuperscript{12,32} The incremental approach has been also applied to describe the Ag\(_2\)/graphene interaction at CCSD(T) level\textsuperscript{67} with results showing an overall good performance with the PBE-D3 scheme.\textsuperscript{19,20} The PBE-D3 approach has thus been chosen for our periodic calculations while the DLPNO-CCSD(T) and SAPT(DFT) methods are used to validate its adequacy.

From Figure 2 and Table 1 it can be observed that the PBE-D3(BJ) approach closely reproduces the DLPNO-CCSD(T) and SAPT(DFT) results, with the well-depth values agreeing to within 10%. As can be also seen in Figure 2, the PBE-D3(BJ) potential energy curves obtained using periodic and cluster models are
rather close to each other, confirming the adequacy of both the cluster model and the electronic basis set to provide reference DLPNO-CCSD(T) values.

Table 1 also shows a SAPT-based decomposition of the total energy in the electrostatic $E_{\text{elec}}$, exchange-repulsion $E_{\text{exch-rep}}$, induction $E_{\text{ind}}$, and dispersion contributions $E_{\text{disp}}$. For the perpendicular orientation of the silver dimer, the attractive interaction is dominated by both dispersion and induction contributions, as can be expected from the pronounced polarization of the silver electronic density towards the titania surface. The importance of including dispersion corrections is also clear when comparing PBE and PBE-D3(BJ) interaction potentials, with the well-depth of the former being much smaller (−447 vs. −124 meV). The crucial role of the dispersion contribution has also been found for the interaction of silver atomic clusters with a TiO$_2$ (anatase) surface.\textsuperscript{68}

### 3.2 Interaction potentials and optimized geometries of Ag$_n$ clusters on the TiO$_2$(110) surface

#### Table 2 Energies (in meV) at the potential minima for the Ag$_n$-TiO$_2$(110) interaction, considering Ti$_{5f}$ and O$_b$ adsorption sites (see Fig. 3). Values in parenthesis stand for the vertical distance (in Å) from the Ag atom closest to the plane where the Ti$_{5f}$ atoms are located.

| Site   | Ag  | Ag$_2$ | Ag$_3$ | Ag$_5$ |
|--------|-----|--------|--------|--------|
| Ti$_{5f}$ | −733 (2.83) | −894 (2.94) | −1811 (2.59) | −1694 (2.61) |
| O$_b$   | −939 (3.64) | −756 (3.68) | −2251 (3.45) | −2016 (3.42) |

Once the PBE-D3(BJ) approach has been validated, we analyze the Ag$_n$-TiO$_2$(110) interaction by focusing on the supported, not yet explored, Ag$_3$ and Ag$_5$ clusters. First, the geometries of the free-standing clusters were optimized at second-order Möller-Plesset perturbation theory (MP2) level, resulting in isosceles planar triangular (Ag$_3$) and trapezoidal (Ag$_5$) structures (see supplementary information). These configurations were found as the most stable in previous studies using coupled-cluster approaches.\textsuperscript{69,70} A planar trapezoidal structure for Ag$_5$ was also revealed from experimental observations.\textsuperscript{71} Keeping these geometries fixed, Figure 3 shows scans of the interaction potentials as a function of the adsorbate-surface distance. We have considered two representative adsorption sites for which the cluster center-of-mass is located on top of either the fivefold coordination Ti atom (Ti$_{5f}$ site from now on) or the bridging O atom (O$_b$ site). The energies at the potential minima are presented in Table 2. As can be seen in Figure 3 (right-hand panel), we have chosen configurations for which the planar structures are oriented perpendicularly to the surface plane while the internuclear Ag–Ag (in Ag$_2$/Ag$_3$) and Ag–Ag–Ag (in Ag$_5$) axes lie parallel to the row of Ti$_{5f}$ atoms and O$_b$ atoms. These configurations are found to be more stable for Ag$_3$ and one Ag$_5$ isomer (see below). We have also explored configurations for supported Ag$_3$ clusters which are parallel to the surface plane, providing smaller adsorption energies (by 0.6 eV) when considering the adsorption O$_b$ site. However, the internuclear Ag–Ag axis for the most stable Ag$_2$ isomer is oriented perpendicular to the Ti$_{5f}$ row, and not shown here. For brevity, complementary results on this structure have been moved to supplementary information.

From Figure 3 it can be observed that the O$_b$ site is clearly favored over the Ti$_{5f}$ position for all Ag$_n$ clusters composed by an odd number $n$ of atoms, with energies at the potential minima differing by up to ca. 0.4 eV (see Table 2). The same preferred adsorption site is found at PBE level, with the D3(BJ) dispersion correction making the energy differences smaller. For instance, for the Ag$_3$ cluster, the energies of the O$_b$ and Ti$_{5f}$ isomers are about −0.8 and −1.5 eV at PBE level, with an energy difference (0.7 eV), reduced to ca. 0.4 eV upon inclusion of the D3(BJ) dispersion (see Table 2).

As can be seen in Table 2, the order of stabilities is inverse for the closed-shell Ag$_2$ case, as also found for the closed-shell Xe adatom (see supplementary information). As discussed in previous works of noble gases onto TiO$_2$\textsuperscript{12,32,33,72} and Ag$_2$ on graphene,\textsuperscript{67} the Ag$_2$-TiO$_2$ preferential adsorption is also much influenced by a subtle balance between short-range exchange-repulsion and long-range dispersion contributions: the exchange-repulsion is smaller on top of the Ti$_{5f}$ site, allowing the Ag atoms to benefit from the attractive dispersion interaction with O$_b$ atoms at both sides of the Ti$_{5f}$ atom. The analysis of the projected density of states (PDOS) for the silver dimer (see Figure 5) indicates that there is chemical mixing between Ag(4d) orbitals and O(2p) states of the support but not net charge-transfer. This finding is consistent with a previous work on the Ag$_4$-TiO$_2$ (anatase) interaction.\textsuperscript{68}

Obviously, the outer electrons of open-shell adsorbates are more prone to participate in chemical bonding with the support either by sharing or transferring them. Atomic charges were estimated with the Bader decomposition scheme.\textsuperscript{73} The Bader charge on open-shell silver clusters was positive, having a value of about +0.8 $|e|$ which is twice as large as found for the closed-shell Ag$_2$ cluster (+0.4 $|e|$ only). The TiO$_2$ surface thus attracts more electronic charge from open-shell silver clusters.

In going from a single Ag adatom to Ag$_3$ and Ag$_5$ clusters, it can be observed that the well-depth values increase steeply (see Figure 3 and Table 3), with the preferential adsorption along the row of O$_b$ atoms being also very clear. From the PDOS of the supported open-shell species (see Figure 5), it can be observed the mixing between Ag(4d) and O(2p) orbitals (valence band) and between Ag(5s) and Ti(3d) orbitals (conduction band), indicating the partial covalent nature of the adsorbate-surface interaction. However, the non-covalent vdW-type dispersion interaction...
is essential, contributing to the increase of the binding energy by 40–45% for Ag$_3$ and Ag$_5$ clusters.

As a second step, the geometries of supported Ag$_3$ and Ag$_5$ clusters were relaxed starting with those optimized for the free clusters with the PBE-D3(BJ) approach. As can be seen in Figure 4, both the (triangular) structure and the interaction energy (−2.5 eV) of the most stable Ag$_3$ isomer are kept rather similar to those corresponding to the isolated cluster. Upon adsorption, the triangular Ag$_3$ structure becomes just a little bit tilted towards the Ti$_{5f}$ site, signaling stability of the supported cluster. Also, the structure of the trapezoidal Ag$_5$ isomer is only slightly modified from that of the isolated cluster (see middle panel of Figure 4). The most pronounced change is in the stretching of the Ag–Ag bonds so that three Ag atoms now lie almost aligned with the O$_b$ atoms along the surface normal direction. As found for the supported Ag$_3$ cluster, the diffusion of the Ag$_5$ cluster along the O$_b$ row is rather constrained due to high energy barriers. For instance, when the cluster moves such as its center-of-mass lies in between two O$_b$ atoms, the energy penalty is above 0.8 eV, indicating constrained diffusion and subsequent aggregation. Interestingly, we also found a more stable Ag$_3$ isomer (by ca. 1.3 eV) for which the planar trapezoidal isomer transforms into a (slightly) pyramidal structure with four Ag atoms lying at the corners of a rectangle centered by one Ag atom atop a Ti$_{5f}$ atom (see right-hand panel of Figure 4). Future work will consider the minimum-energy pathway from the trapezoidal to the pyramidal isomer.

### 3.3 Projected electronic density of states and absorption spectra

Using the cluster structures optimized at PBE-D3(BJ) level, Figure 5 shows the electronic density of states (EDOS) of the bare TiO$_2$(110) surface and the PDOS for the Ag$_n$/TiO$_2$(110) systems, as calculated with the hybrid HSE06 density functional, while the absorption spectra are presented in Figure 6. As can be observed in Figure 5 (upper panel), our computational set-up provides an estimation of the band gap (3.3 eV) that agrees well with the experimental value (3.3 ± 0.5 from Ref. 46). From Figure 5, it can be seen that the supported Ag$_n$ clusters add one or two sharp peaks in the band-gap region of TiO$_2$. These sharp peaks corresponds to localized states in the Ag atomic clusters, as attested by the PDOS onto the Ag orbitals shown in Fig. 5. More specifically, these peaks arise from frontier orbitals mainly made of Ag(5s) orbitals but involving also hybridization with Ag(4p) orbitals. Notice also, that the Ag$_n$ atomic clusters add intra-gap states closer to the bottom of the TiO$_2$ conduction band with increasing $n$. In fact, for $n = 3.5$, the conduction band begins to be populated giving an incipient metallic character to the system.

The intra-gap localized states have deep consequences for the light absorption behaviour. As shown in Fig. 6, the photo-absorption spectra develop broad absorption peaks in the visible...
(n = 5) and near-infrared (n = 2) spectra owing to photo-induced electronic transitions from the highest-energy localized orbitals to the conduction Ti(3d) states. The energy position of the frontier and the Ti(3d) orbitals involved in the transition with the largest oscillation strength are indicated by arrows in Figure 5. In the case of the Ag₃ cluster, its only one intra-gap state is far enough from the conduction band edge to contribute mainly to the absorption in the UV region. Within this respect, notice also that the Ag₂ and Ag₅ clusters also enhance UV absorption in part owing to the contribution coming from the second lower energy intra-gap states present in these clusters. However, the observed enhancement of UV absorption comes not only because of the intra-gap peaks but also from the the energy band changes that the atomic cluster produce in the system.

The same electron transfer mechanisms found here for visible/near-infrared absorption has been proposed as responsible of the photocatalytic hydrogen production enhancement observed after deposition of gold clusters onto TiO₂ but instead of photo-transfer from localized orbitals of the adsorbate, the gold clusters are large enough to develop their own conduction band as corroborated by the observation of a localized surface plasmon resonance band in the reflectivity. Notice also, that the localized nature of the Agₙ intra-gap states probably implies long lived hole excitations. Long lived photo-excitations are relevant to extract charge from photovoltaic devices. In this respect, the reduced density matrix treatment provides a pathway to calculate the hole lifetime, as previously shown for the Ag₃ cluster deposited on a Si(111) surface. By the same token, the atomic clusters lack a properly developed populated conduction band so that they cannot sustain localized surface plasmons by themselves. However, since the Agₙ clusters gives an incipient metal character to the system, probably already at room temperature, properly nanostructured Agₙ-TiO₂ may sustain localized surface plasmons, which have a well demonstrated beneficial effect in photovoltaic devices.

Before concluding this section, we note that an interesting future direction of research would be to study the influence of the dispersion on single energy levels and the EDOS. For this purpose, it would be necessary to apply dispersion corrections depending of the electronic density such as the non-local vdW-DF and vdW-DF2 approaches. Work along this line is currently in progress.

4 Conclusions

Motivated by the extraordinary properties of sub-nanometer silver clusters, we have presented a first-principles study of the stability and light absorption response of Agₙ clusters (n ≤ 5) upon deposition on a TiO₂ surface. The vDW-corrected DFT-D3 scheme applied to analyze their stability has been first validated using a local version of the CCSD(T) method as well as the SAPT(DFT) approach, demonstrating an excellent agreement (to within 10%). The DFT-D3 results show that the silver clusters are strongly bound to the support, with binding energies ranging from −0.9 eV for a single adatom to −3.8 eV for one Ag₅ isomer. The adsorbate-surface interaction is of polar-covalent nature, with the support attracting electronic charge from the cluster. The vDW dispersion also plays a crucial role, increasing very significantly the binding energies. The optimized structures of supported clusters differ slightly from those of bare counterparts with the exception of one Ag₅ isomer. High energy penalties are found for the diffusion of the supported clusters so that high temperatures are predicted for their aggregation.

Using hybrid DFT calculations we have studied the influence of the Ag atomic clusters on the electronic density of states. One or two (depending on the number of Ag atoms) localized intra-gap states develop while at the same time the highest occupied level
Fig. 5 EDOS of the TiO$_2$(110) surface and PDOS of the most stable Ag$_n$-TiO$_2$(110) systems obtained from the hybrid HSE06 functional, with Ag$_5$(1) and Ag$_5$(2) standing for the trapezoidal and pyramidal isomers (see Figure 4). The zero of energy corresponds to the Fermi level, defined here as the highest occupied level. The arrows indicate the energies of the most responsible orbitals for the intense secondary peaks in the photo-absorption spectra (see Figure 6).
Absorption Flux Density, W/(cm² eV)

 photon Energy, eV

Bare TiO₂(110)  Ag₂/TiO₂(110)  Ag₃/TiO₂(110)  Ag₅(1)/TiO₂(110)  Ag₅(2)/TiO₂(110)

Fig. 6 Photo-absorption spectra of the TiO₂(110) surface, without adsorbates (shown in blue color) and with adsorbed Ag₅ clusters. The most stable supported Ag₅ clusters were considered, with Ag₅(1) and Ag₅(2) standing for the trapezoidal and pyramidal isomers (see Figure 4). The arrows indicate the positions of the most intense secondary peaks across the near-infrared and visible regions of the solar spectrum.

(at zero temperature) strongly shifts towards the system conduction band so that for n = 3,5 the initial conduction band state becomes populated.

Applying a scheme combining the hybrid DFT calculations with a reduced density matrix treatment, we have analyzed the light absorption response of the Ag₅-TiO₂ system. Besides increasing the intensity of the TiO₂ absorption spectra in the UV region, intense broad absorption peaks are also found in the infrared (Ag₃-TiO₂ system) and the visible region (Ag₅-TiO₂ system): an electron “jumps” from the Ag₅ atomic cluster to the system conduction band leaving a hole in the cluster, when a photon is absorbed. The Ag₅-induced separation of photo-generated electrons and holes is expected to have a pronounced influence in the visible light photocatalytic activity of the modified TiO₂ material since hole-electron recombination is a key factor limiting the photocatalyst efficiency of unmodified TiO₂. Other surface locations for the atomic silver clusters are possible, with similar binding energies, and can be studied with the same methods. It is expected that the general features of light absorbance described here will remain the same for related structures. Also, as a “reporter” of the photocatalytic activity of the modified TiO₂ material, the photoactivity of molecular oxygen adsorbed at the supported clusters will be addressed in future studies, following pioneering first-principles studies of O₂ photodesorption from bare TiO₂ surfaces.78,79

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