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Theoretical description of metal/oxide interfacial properties: the case of MgO/Ag(001)

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Abstract:

We compare the performances of different DFT functionals applied to ultra-thin MgO(100) films supported on the Ag(100) surface, a prototypical system of a weakly interacting oxide/metal interface, extensively studied in the past. Beyond semi-local DFT-GGA approximation, we also use the hybrid DFT-HSE approach to improve the description of the oxide electronic structure. Moreover, to better account for the interfacial adhesion, we include the van de Waals interactions by means of either the semi-empirical force fields by Grimme (DFT-D2 and DFT-D2*) or the self-consistent density functional optB88-vdW. We compare and discuss the results on the

structural, electronic, and adhesion characteristics of the interface as obtained for pristine and oxygen-deficient Ag-supported MgO films in the 1-4 ML thickness range.

Keywords: metal/oxide interface, oxide films, interfacial charge transfer, van de Waals interactions, hybrid functionals

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1. Introduction

The interfaces between oxides and metals are relevant in many fields, ranging from microelectronics and oxide-based magnetic devices, to heterogeneous catalysis and photocatalysis.^{1,2,3,4} In all applications, the nature of the interaction at metal/oxide interface is crucial for the properties of the combined system. For instance, the strength of adhesion between the two materials is linked to the interfacial distances and charge transfers, as strong chemical bonds at the interface produce large changes in the electronic distribution and shorter interface distances. The adhesion strength also determines the growth mode, the shape and the morphology in the case of supported nanoparticles or ultra-thin films. The characteristics of the interface also impact various electronic properties of the above-mentioned deposits. As an example, they drive the work function of metal-supported oxide ultra-thin films, which is particularly sensitive to the interfacial distance.^{5,6,7,8} On the other hand, the charge transfer at the interface induces a polarization of the supported oxide film, due to an electrostatic coupling between the film and the interfacial dipole moments.⁸ These combined mechanisms determine the surface properties of metal-supported oxide

films,^{7, 9,10, 11} making their chemical reactivity different from that of bulk oxide surfaces.^{12,13,14,15,16} A striking example is the spontaneous charging of adsorbates, enabled by the oxide-induced work function change, the structural flexibility of oxide films, and the electron reservoir provided by the underlying metal.^{17, 18, 19, 20} Metal/oxide interface properties also determine the position of the Fermi level within the oxide band gap, eventually modifying the charge state of defects, such as oxygen vacancies (F centers), and thus altering the optical and chemical (catalytic) properties of metal-supported oxide films. As an example, while on the surfaces of bulk MgO neutral oxygen defects (F^0) are by far the most stable, charged vacancies (F^+) may be favored in supported oxide films. This stabilization is due to a reduced substrate work function and to strong charge image effects in the thinnest metal-supported MgO films^{21,22}

The above examples elucidate the importance of an accurate description of metal/oxide interfaces for a valid assessment of the delicate balance between electronic and structural effects.^{23,24} Even though standard DFT has been routinely used in studies on interface characteristics,^{7,10,11} the question of the impact of its known drawbacks remains open. Indeed, while satisfactory for metals, (semi-)local exchange-correlation functionals fail to reproduce band gaps and positions of band edges in semiconducting and insulating oxides.²⁵ Conversely, hybrid approaches, including a fraction of exact Hartree-Fock (HF) exchange, improve the description of oxides but are much less suited for metals,²⁶ despite promising improvements brought by the range-separated hybrid functionals.²⁷

Recently we have shown that both DFT+U and hybrid functionals describe satisfactorily the structural and electronic properties of Pt(111)-supported $FeO_x(111)$ films, as well as the effect of the spontaneous charging of Au adatoms.²⁸ Our present

goal is to extend this analysis to the qualitatively different case of MgO/Ag system, prototypical of a weakly interacting interface, extensively studied in the past.^{29,30,31,18,32} Contrary to FeO_x, the electronic structure of MgO cannot be easily improved with the DFT+U method. Moreover, since the interaction between Ag and MgO is weak, the van de Waals interactions, absent in standard and hybrid DFT, may be essential for a correct description of this interface. To this goal we compare and discuss GGA (PBE) and hybrid (HSE06) results on interface structural, electronic, and adhesion characteristics for pristine and oxygen-deficient MgO(100) ultra-thin films (1-4 ML thick) on Ag(100) and confront them with calculations including van der Waals interactions, via both semi-empirical force field by Grimme,³³ and self-consistent vdW functionals.^{34,35}

2. Computational method

Spin-polarized calculations have been performed in the framework of Density Functional Theory (DFT), using a plane-waves basis set as implemented in the VASP code.^{36, 37} We employed semi-local GGA (PBE) and hybrid (PBE0³⁸ and HSE06^{27,39, 40}) functionals. Van der Waals (vdW) interactions were accounted for by either the semi-empirical DFT-D2 method by Grimme (with PBE functional),³³ or the density functional optB88-vdW.^{34,35} For the former we also considered the DFT-D2* modification, more suitable for ionic systems, with the less polarizable Ne used for Mg²⁺.⁴¹

The Ag(100) surface was represented by a slab composed of four atomic layers, with up to 4 monolayers (ML) of MgO(100) adsorbed on one side. A vacuum layer of about 12 Å and dipole corrections were used in order to eliminate the spurious

interactions between periodic replica. The oxide film is compressed (by 2%) to match the Ag lattice parameter, in agreement with the pseudomorphic growth observed up to 5-7 ML MgO.²⁹ We used a (1×1) surface unit cell in the calculations of pristine MgO films (MgO(nML)/Ag), while for films containing oxygen vacancies in the oxide surface layer we employed a (2×2) supercell, which represents a compromise between the computational effort and the strength of the lateral interactions between the vacancies. The positions of all atoms in the MgO film and in the two outmost metal layers were fully relaxed, until forces became smaller than 0.01 eV/Å. The remaining two metal layers were frozen at their optimized bulk positions. The reciprocal space of the (1×1) surface cell was sampled with a (11×11) Monkhorst-Pack mesh, while a (6×6) mesh was used for the (2×2) cell. Atomic charges were estimated within the Bader decomposition scheme.⁴²

3. Results and discussion

3.1 Isolated MgO and Ag

Table 1 summarizes the calculated properties of isolated MgO and Ag to illustrate the strengths and shortcomings of the different methods in describing the two materials. Both structural (lattice parameter) and electronic (bulk band gap, position of surface valence (IP_{surf}) and conduction (AE_{surf}) band edges) characteristics of MgO are clearly better described with hybrid functionals, although PBE0 is required to fully approach the experimental band gap of 7.8 eV.⁴³ DFT-D2 functional predicts lattice parameter close to the experimental value, while optB88 calculation gives an overestimated, PBE-like, value. Both van der Waals functionals do not bring an improvement of the band gap.

While all considered methods overestimate the lattice parameter of Ag by a similar small amount of 1-2%, the work function of the Ag(100) surface strongly depends on the method. The experimental value is best reproduced at the PBE and DFT-D2 level, while it is underestimated at hybrid level, and overestimated by the optB88 functional.

Table 1. Properties of MgO and Ag as a function of the method: lattice parameter (a), MgO bulk band gap (E_g); MgO surface ionization potential (IP_{surf}) and electron affinity (AE_{surf}); Ag(100) surface work function (ϕ).

	MgO				Ag	
	a	E_g	IP_{surf}	AE_{surf}	a	ϕ
	(Å)	(eV)	(eV)	(eV)	(Å)	(eV)
PBE	4.25	4.47	-5.28	-2.05	4.16	4.17
PBE0	4.21	7.23	-	-	4.15	4.05
HSE06	4.21	6.51	-6.19	-1.57	4.15	3.98
DFT-D2	4.20	4.84	-5.31	-1.98	4.15	4.19
optB88	4.24	5.10	-5.50	-2.30	4.14	4.53
Exp.	4.21	7.8	6.7 ⁴⁴	-	4.09	4.2

3.2 Pristine MgO(3ML)/Ag

The structural and electronic characteristics of the MgO(3ML)/Ag film are summarized in Table 2. As expected, the interface adhesion energy (E_{adh}) is very sensitive to the level of theory. In absence of the vdW contribution, both PBE and HSE06 calculations predict a weak E_{adh} of 0.3-0.4 J/m². The adhesion energy obtained from DFT-D2 is nearly three times larger, while both DFT-D2* and optB88 predict intermediate values of 0.7-0.8 J/m². While to our knowledge there is no experimental

estimate of the MgO adhesion energy on Ag(100), the interaction strength of Ag nano-particles with the MgO(100) surface has been studied in the past. From the analysis of cluster shapes observed by HRTEM, the adhesion energy was estimated to be 0.49-0.89 J/m²,⁴⁵ while a value of 0.75-0.85 J/m² was obtained by SDRS and GISAXS analyses for cluster sizes lower than 10 nm.^{46,47} The discussion in Ref. 45 concluded on the value of 0.58 ± 0.1 J/m² as a good reference for the ideal Ag(100)/MgO(100) interface. Although none of the computed values closely reproduces this estimate, the DFT-D2* and optB88 results are in much better agreement. Conversely, DFT-D2 severely overestimates the interfacial adhesion and PBE and HSE06 approximations underestimate it. Similar conclusions have been reported for the related Ag/MgO(100) system.²⁴

Consistently with the calculated adhesion energies, PBE and HSE06 predict similarly large interface distances, while with semi-empirical DFT-D2 and DFT-D2* methods the MgO layer is much closer to the Ag surface. Interestingly, the optB88 functional strengthens the interfacial adhesion with only a little effect on the interfacial distance. We note that the DFT-D2 and DFT-D2* values are the closest to the experimental estimate of 2.4-2.5 Å,^{22,31,29} although other effects, such as the finite size of the islands²³ may also influence the experimental interfacial distance. Other structural properties, such as the oxide film rumpling, are less dependent on the method used, with a somewhat larger rumpling obtained with the Grimme's approach, consistent with the shorter interface distance.⁸

Table 2. Properties of MgO(3ML)/Ag(100) films computed at different level of theory: adhesion energy per surface area (E_{adh}/S); interfacial distance (d_{inter}); MgO rumpling (r_{MgO}),

defined as the average intra-layer separation $z_{\text{O}}-z_{\text{Mg}}$ (a positive value indicates oxygen outwards); charge transfer per interfacial MgO unit ($\text{CT}/\text{MgO}_{\text{int}}$, a positive value indicates electron transfer from MgO to Ag); work function change with respect to the Ag(100) surface ($\Delta\phi$).

	E_{adh}/S	d_{inter}	r_{MgO}	CT	$\Delta\phi$
	(J/m ²)	(Å)	(Å)	(e/ MgO _{int})	(eV)
PBE	0.36	2.70	0.018	0.041	-1.18
HSE06	0.34	2.71	0.014	0.026	-1.17
DFT-D2	1.25	2.49	0.027	0.062	-1.34
DFT-D2*	0.77	2.57	0.024	0.050	-1.28
optB88	0.76	2.65	0.017	0.046	-1.41

The calculated work function changes, $\Delta\phi$, Table 2, confirm the reported reduction of Ag(100) work function induced by MgO films.^{5,6,22} While PBE and HSE06 predict a similar decrease of about 1.1 eV, the inclusion of vdW interactions enhances the effect to 1.3-1.4 eV. The amplitude of $\Delta\phi$ correlates with the interfacial distance, pointing to the compression of the electron density at the interface caused by the insulating film as the main cause of the observed effect.⁵⁻⁶ However, also the dipole moments due to the film rumpling and interfacial charge transfer tend to increase/decrease of the work function, respectively. Indeed, the largest $\Delta\phi$ obtained with optB88 despite a moderate interface distance, is due to a combination of a large interfacial charge transfer and a small film rumpling within this approximation.

The density of states (DOS) of the MgO(3L)/Ag(100) film, Figure 1, highlights the expected sensitivity of the electronic structure of the interface on the exchange-correlation functional. As expected, the HSE06 results differ substantially from the others: the MgO valence band edge and the Ag 3d band are much lower in energy, while the Fermi level is visibly closer to the vacuum level. At the energy scale of Fig. 1, the PBE and both vdW-corrected DOS are very similar, although a small downshift of the top of the MgO O-2p band can be observed in optB88.

Figure 1 – MgO- and Ag-projected density of states of MgO(3ML)/Ag(100) computed with PBE, HSE06, DFT-D2, and optB88 functionals. The zero energy is set to the vacuum level; the Fermi levels are indicated with horizontal lines.

3.3 Pristine MgO(*n*ML)/Ag: dependence on the film thickness

Figure 2 summarizes the behavior of the structural and electronic characteristics in MgO films of thickness $n = 1-4$ ML. We find that all the considered methods predict that the MgO monolayer substantially differs from the thicker films: the interface distance is visibly shorter, the film rumpling is larger, and the reduction of the surface

work function is less pronounced. Beyond 1ML, in the thickness range of $n = 2-4$ ML, the film characteristics vary only slightly and remain similar to those of the MgO(3ML)/Ag(100) case discussed above.

However, we find that the difference between the monolayer and thicker films may strongly depend on the method. This method-specific behavior is best exemplified by the weak dependence of the interfacial distance on the film thickness in methods including the van der Waals interaction, and in particular in the DFT-D2 approach, which predicts essentially a thickness-independent d_{int} . Interestingly, the behavior of the interface distance is not directly coupled to that of the film rumpling, for which all methods predict consistently a substantial (larger than 50%) increase of rumpling at the monolayer thickness, driven by the reduced coordination of the ions and the enhanced flexibility of the single MgO layer. The enhanced rumpling in the monolayer, with anions relaxing strongly outwards, creates a dipole moment which increases the work function, and thus counteracts the reduction of ϕ induced by the MgO film. Indeed, $\Delta\phi$ is systematically smaller in the limit of a monolayer thickness independently of the method. We note that the decrease of $\Delta\phi$ as a function of t_{film} thickness is the largest in DFT-D2 and DFT-D2* approximations, coherent with the small reduction of the interface distance predicted by these approaches.

Changes of the interfacial charge transfer are small and at the limit of the precision of the Bader decomposition method. We note that the charge transfer is the largest in DFT-D2 and DFT-D2*, coherent with the shortest interfacial distances. The other approaches tend to predict an increase of charge transfer at the monolayer thickness, which is linked to the shortening of d_{int} .

Figure 2. Properties of the MgO(nML)/Ag(100) interface as a function on the film thickness ($n=1-4$ ML), computed with the different methods: (a) interface distance; (b) charge transfer; (c) MgO rumpling; (d) work function change with respect to the Ag(100) surface.

3.4 Surface vacancies at MgO(nML)/Ag: properties and dependence on film thickness

Table 3 summarizes the results for the neutral oxygen vacancy on the surface of MgO(3ML)/Ag. At all levels of theory the small charge transfer towards the substrate and the relatively weak structural relaxation around the point defect indicate that the vacancy is neutral, with two electrons trapped in cavity in a singlet state, in agreement with the existing GGA results for this system.²¹ We notice that the somewhat larger charge transfer and structural relaxation of ions around the vacancy predicted by PBE and optB88 do not alter the singlet electronic state of trapped electrons. More interestingly, our results show that either an improved description of the oxide band structure (exact exchange in HSE) or a better atomic structure of the interface (shorter

interface distances in DFT-vdW) do not shift the vacancy electronic state enough to promote an electron transfer towards the Ag substrate.

Similar electronic characteristics result in substantially similar vacancy formation energies (E_{form}) predicted by all the considered approaches. We note that E_{form} reported in Table 3 includes also the contribution due to a different quality of description of the isolated oxygen molecule. In particular, smaller E_{form} predicted by GGA compared to that by HSE is linked to the well known over-binding of the O_2 molecule in the former.

Table 3. Properties of the oxygen vacancy at the surface of MgO(3ML)/Ag(100) film computed at different level of theory: formation energy with respect to gas phase $\frac{1}{2} \text{O}_2$ (E_{form}); relaxation around the defect, computed as the in-plane displacement of the cations around the defect with respect to the pristine film (rel); charge transfer per defect (CT), work function change with respect to the MgO(3ML)/Ag(100) film ($\Delta\phi_{\text{vac}}$).

	E_{form}	rel	CT	$\Delta\phi_{\text{vac}}$
	(eV)	(%)	(e/defect)	(eV)
PBE	6.11	1.9	0.14	+0.32
HSE06	6.50	1.4	0.07	+0.53
DFT-D2	6.35	1.5	0.08	+0.33
optB88	6.75	1.7	0.17	+0.41

It is worth noticing that, while all methods predict a vacancy-induced increase of MgO(3ML)/Ag work function (positive $\Delta\phi_{\text{vac}}$ in Table 3), this effect is considerably larger in HSE than in the other approximations. Since the increase of ϕ is mainly assigned to the spill out of the vacancy electrons density into the vacuum, its strengthening in the case of HSE is on the other hand connected to an enhanced

surface electrostatic field within the hybrid method driven by a larger ionization potential (IP_{surf} in Table 1).

The characteristics of the surface oxygen vacancy as a function of the film thickness are reported in Figure 3. All methods concur in indicating a progressive change of the defect nature with decreasing film thickness, as principally witnessed by the dramatic increase of charge transfer towards the Ag substrate. Indeed, at 1ML thickness one of the two electrons trapped in the vacancy is transferred to the metal, producing a positively charged defect (F^+) in the MgO film. Interestingly, at difference with F^+ in bulk MgO, and despite the inclusion of the exact exchange in HSE, the hybridization between vacancy and metal states causes this defect to be non-magnetic, giving thus support to the existing GGA results.^{21,23,48} Beyond the concurrent description of electron delocalization, all considered approximations give also a fairly similar picture of the vacancy in the monolayer, with an increase of film relaxation, a drop of vacancy formation energy, and a reduction of the work function compared to the 3ML case.

c

d

Figure 3. Properties of the surface oxygen vacancy on MgO(*n*ML)/Ag(100) films as a function on the thickness (*n* = 1-3 ML), computed with the different methods: (a) formation energy (E_{form}); (b) charge transfer per defect; (c) relaxation around the defect, computed as the lateral displacement of the cations around the defect with respect to the pristine film (rel); (d) work function change with respect to the case of vacancy in MgO(1ML)/Ag(100) film ($\Delta\phi_{\text{vac}}$).

Taking into account the different nature of the oxygen vacancy in 3ML and 1ML films, the intermediate MgO(2ML)/Ag case could have been expected to be particularly sensitive to the quality of description of the interface electronic and atomic structure. This, however, is clearly not the case, since all calculations, regardless the level of approximation, predict an ensemble of very similar characteristics. Similarly to the reported results for the FeO_x/Pt system,²⁸ also in the present case the changes in the band alignment at the interface induced by improvements of either electronic or atomic structures are not sufficient to qualitatively alter the nature of the interface and the quantitative changes of its characteristics are very limited.

4. Conclusions

We have used a variety of DFT functionals: GGA, HSE, DFT-D2 and optB88-vdW to study ultra-thin MgO(100) films weakly interacting with the Ag(100) substrate, and compared their performance on the structural, electronic, and adhesion characteristics for pristine and oxygen-deficient MgO films in the thickness range of 1-4 ML.

The large differences in the description of the separate MgO and Ag systems with the various approaches affect the characteristics of the MgO/Ag interface to a different extent. The most method-sensitive properties are the adhesion energy and the

interfacial distance, for which the experimental estimates are satisfactorily approached by functionals including the van der Waals interactions (DFT-D2* and optB88), while PBE and HSE06 tend to underestimate the strength of interfacial interactions. We also notice that the standard DFT-D2 seems to severely overestimate the adhesion energy.

The other properties, including the trends as a function of the film thickness are much less affected by the choice of the computational method. This is particularly striking in the case of surface oxygen vacancies, for which all methods consistently predict a progressive evolution of the vacancy nature from “neutral” in thicker films to “charged” in the limit of a single MgO monolayer.

Similarly to the FeO_x/Pt system,²⁸ the changes in the interface band alignment induced by the more accurate description of the electronic or atomic structure with hybrid or vdW-including functionals do not alter the nature of the interface and produce limited changes of its fine characteristics.

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