# ORIGINAL RESEARCH



# A novel nitrogen dioxide gas sensor based on TiO<sub>2</sub>-supported Au nanoparticles: a van der Waals corrected DFT study

Amirali Abbasi<sup>1,2,3</sup> · Jaber Jahanbin Sardroodi<sup>1,2,3</sup>

Received: 18 February 2017/Accepted: 6 May 2017/Published online: 15 May 2017 © The Author(s) 2017. This article is an open access publication

**Abstract** The interactions of nitrogen dioxide molecule with TiO<sub>2</sub>-supported Au nanoparticles were investigated using density functional theory. Surface Au atoms on the TiO<sub>2</sub>-supported Au overlayer were found to be the most favorable binding sites, thus making the adsorption process very strong. Both oxygen and nitrogen atoms of the NO<sub>2</sub> molecule can bind to the Au surface by forming strong chemical bonds. The adsorption of NO<sub>2</sub> molecule on the considered structures gives rise to significant changes in the bond lengths, bond angles, and adsorption energies of the complex systems. The results indicate that NO2 adsorption on the TiO<sub>2</sub>-supported Au nanoparticle by its oxygen atoms is energetically more favorable than the NO<sub>2</sub> adsorption by its nitrogen atom, indicating the strong binding of NO<sub>2</sub> to the TiO<sub>2</sub>-supported Au through its oxygen atoms. Thus, the bridge configuration of TiO<sub>2</sub>/  $Au + NO_2$  is found to be the most stable configuration. Both oxygen and nitrogen atoms of NO<sub>2</sub> move favorably towards the Au surface, as confirmed by significant overlaps in the PDOSs of the atoms that forming chemical bonds. This study not only suggests a theoretical basis for gas-sensing properties of the TiO<sub>2</sub>-supported Au

**Electronic supplementary material** The online version of this article (doi:10.1007/s40097-017-0226-5) contains supplementary material, which is available to authorized users.

- Molecular Simulation Laboratory (MSL), Azarbaijan Shahid Madani University, Tabriz, Iran
- Department of Chemistry, Faculty of Basic Sciences, Azarbaijan Shahid Madani University, Tabriz, Iran
- Computational Nanomaterials Research Group (CNRG), Azarbaijan Shahid Madani University, Tabriz, Iran

nanoparticles, but also offers a rational approach to develop nanostructure-based chemical sensors with improved performance.

**Keywords** Density functional theory  $\cdot$  NO<sub>2</sub>  $\cdot$  TiO<sub>2</sub>-supported Au nanoparticle  $\cdot$  PDOS

#### Introduction

TiO<sub>2</sub> is one of the most broadly studied transition metal semiconductors with outstanding properties, such as nontoxicity, high catalytic efficiency, and extensive bandgap [1]. Until now, various kinds of well-known applications have been proposed for TiO2, such as photo-catalysis, gas sensor devices, organic dye-sensitized solar cells, water splitting, and air pollution control [2–5]. Anatase, rutile, and brookite are the most important polymorphs of TiO<sub>2</sub> [6]. Of the three polymorphs of TiO<sub>2</sub>, the rutile form is found to be the most stable phase. There is not any detailed theoretical investigation on the physical and chemical properties of brookite because of its metastable property. This meta-stability results in some troubles during the synthesis of brookite [7]. The improved reactivity of anatase is comparable with that of rutile and brookite phases [8–14]. Anatase has been extensively studied due to its enhanced activity in some photo-catalysis reactions, such as TiO<sub>2</sub>-supported metal particle reactions, compared to the rutile and brookite phases [15–17]. Unfortunately, as a most promising material, the widely application of TiO<sub>2</sub>based gas sensors is influenced by its wide bandgap (3-3.2 eV). This results in the absorption of a small percentage of the incoming solar light (3-5%). An enormous amount of effort has been invested in enhancing the optical response of TiO<sub>2</sub> by nitrogen doping [8].



Recently, gold was considered as an inactive metal. which possesses less activity than the other metals in many reactions. Haruta and co-workers showed that gold particles can increase the combustion of CO molecule and promote different catalytic reactions [18]. The gold particles supported by metal oxides (oxide-supported gold particles) have gained more attention due to their higher activities in the surface processes [19–22]. This leads to the structures with enhanced catalytic activity and higher stability [23, 24]. There are a large number of important reactions, in which the oxide-supported Au overlayers play a key role, including the epoxidation of C<sub>3</sub>H<sub>6</sub> [25], reduction of NO<sub>x</sub> molecules [26], and dissociation of SO<sub>2</sub> molecule [27]. TiO<sub>2</sub> has been considered as one of the most appropriate support materials for gold particles [28, 29]. The interactions of gold nanoparticles with TiO<sub>2</sub> (rutile and anatase) have been widely studied in the last few years. Vittadini et al. considered the adsorption behaviors of gold clusters on the TiO<sub>2</sub> anatase (101) surfaces [30]. Metiu and co-workers investigated the adsorption site and electronic structures of the TiO<sub>2</sub> rutile-supported Au nanoparticles [31].

The adsorption of the  $O_2$  and  $CO_2$  on gold nanoparticles supported by TiO<sub>2</sub> has been investigated by DFT calculations [32]. The main source of nitrogen dioxide emission is internal combustion engines, burning fossil fuels. It also results from cigarette smoke, kerosene heaters, and vehicle engines and stoves. Thus, finding an efficient sensor for the removal of this toxic molecule is an important issue to public health and environmental protection [33]. An ideal semiconductor oxide-based gas sensor should have properties, such as high sensitivity to the expected toxic material, low price fabrication, and compatibility with modern electronic devises. Among different gas sensors, the oxide-supported gold nanoparticles have been characterized as efficient sensor materials because of their higher activities. Therefore, establishing multi-component structures in sensor materials has long been regarded as the best strategy for improving the sensing performance of TiO<sub>2</sub> particles. The mechanism of gas sensing for the removal of toxic NO<sub>2</sub> molecules by metal oxide-based sensors is represented in Fig. 1. We have decided to perform a DFT study of the interaction of NO<sub>2</sub> molecule with the TiO<sub>2</sub>supported Au overlayers to fully exploit the gas-sensing capabilities of these nanocomposites.

The consecutive adsorption of  $NO_2$  molecules on the  $TiO_2$ -supported Au overlayers probably produces  $N_2$  molecule formed from the central nitrogen atoms of the two adsorbed  $NO_2$  molecules. This is a consequence of the formation of weak chemical bonds between oxygen atoms of  $NO_2$  molecule and Ti sites of the adsorbent. This leads to weakening of the bond between central nitrogen and the side oxygen atoms of the adsorbed  $NO_2$  molecules. Based

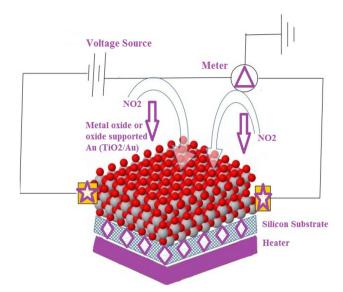


Fig. 1 Schematic drawing of a typical metal oxide-based gas sensor

on this fact, we can conclude desorption of  $NO_2$  molecule from the surface of the  $TiO_2$ -supported Au overlayer. The next  $NO_2$  molecule then can be adsorbed on the considered nanocomposite, and this consecutive process was repeated over and over again to obtain the enhanced sensing performance of the adsorbent material. Figure 1 shows a schematic structure of a metal oxide-based gas sensor. We have also commented on the charge analysis of the complex system according to the Mulliken population analysis. In this study, the main objective is to perform a systematic investigation on the adsorption behaviors of the  $TiO_2$ -supported Au nanoparticles as potentially efficient gas sensors for  $NO_2$  detection.

# **Computational methods**

# **Details of computation**

All of DFT calculations [34, 35] were carried out using the Open source Package for Material eXplorer (OPENMX3.8) [36]. OPENMX is an efficient software package for nanoscale materials simulations based on norm-conserving pseudo-potentials and pseudo-atomic localized basis functions [37, 38]. To optimize the structures, the pseudoatomic orbitals (PAOs) centered on atomic sites were used as basis sets. The calculations were done with a considered energy cutoff of 150 Ry. Pseudo-atomic orbitals were constructed by minimal basis sets (three *s*-state, three *p*-state, and one *d*-state radial functions) for the Ti, (three *s*-state, three *p*-state, two *d*-state, and one *f*-state radial functions) for the Au, and (two *s*-state, two *p*-state radial functions) for O and N atoms, within cut-off radii of basis functions set to the





values of seven for Ti, nine for Au, and five for O and N (all in Bohrs). The total energy of the system was computed within the Perdew–Burke–Ernzerhof (PBE) form of the generalized gradient approximation (GGA) exchange–correlation potential [39]. Mulliken population analysis was also conducted to fully analyze the charge transfer between NO<sub>2</sub> and nanocomposite. To optimize the adsorption configurations of the TiO<sub>2</sub>-supported Au overlayers with adsorbed NO<sub>2</sub> molecules, all atoms of the system are entirely relaxed until the force on each atom is less than 0.01 eV/Å. The size of the simulation box containing pristine TiO<sub>2</sub>-supported Au nanoparticles is  $20~{\rm \AA} \times 20~{\rm \AA} \times 30~{\rm \AA}$ , being larger than the realistic size of the composite system.

Three possible orientations of NO<sub>2</sub> towards the TiO<sub>2</sub>-supported Au nanoparticles are studied in this work. XCrysDen program was used for visualization of the figures presented in this study [40]. The total number of atoms of the nanocomposite in the considered box is 88 atoms (16 Au, 48 O, and 24 Ti atoms) of undoped TiO<sub>2</sub>-supported Au overlayer. The effects of vdW interactions were also taken into account in this study. Both LDA and GGA methods cannot describe the vdW interactions in the systems, such as NO<sub>2</sub> adsorption, on the TiO<sub>2</sub>-supported Au nanoparticles. Thus, an inclusion of additional functional into standard DFT methods would be required, which correctly describes the effects of vdW interactions. Grimme's DFT-D2 [41] and DFT-D3 methods [42, 43] were used in this study to correct the adsorption energies for dispersion

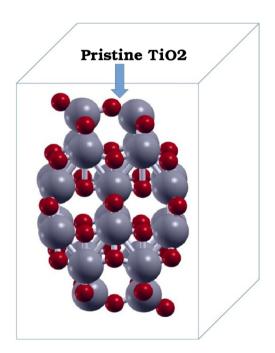


Fig. 2 Representation of a pristine  ${\rm TiO_2}$  anatase nanoparticle, two dangling oxygen atoms were used to set a 1:2 atomic charge ratio between the oxygen and titanium atoms

energy. The adsorption energy,  $E_{\rm ad}$ , is estimated as the following equation:

$$E_{\rm ad} = E_{\rm (composite+adsorbate)} - E_{\rm composite} - E_{\rm adsorbate} \tag{1}$$

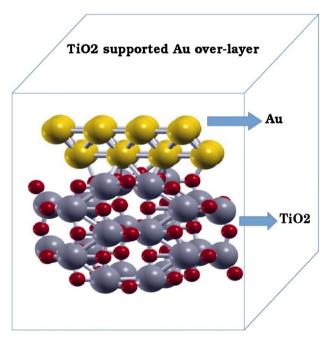
where  $E_{(\text{composite} + \text{adsorbate})}$  is the total energy of the TiO<sub>2</sub>-supported Au overlayers with adsorbed NO<sub>2</sub>,  $E_{\text{composite}}$  is the energy of bare TiO<sub>2</sub>-supported Au overlayer, and  $E_{\text{adsorbate}}$  represents the energy of a free gas-phase NO<sub>2</sub> molecule. As distinct from this equation, the adsorption energies of energy favorable configurations are negative.

# Modeling TiO<sub>2</sub>-supported Au nanoparticles

We have constructed  $TiO_2$  anatase nanoparticle using a  $3 \times 2 \times 1$  supercell of  $TiO_2$  anatase. The considered unit cell is available at "American Mineralogists Database" webpage [44] and reported by Wyckoff [45]. The size of the studied nanoparticles was chosen following Lei et al. [46] and Liu et al. [47]. The results published by Lei et al. [46] show that the smaller the particle is, the higher the

**Table 1** Calculated surface energies (in  $J/m^2$ ) for the anatase (0 0 1) and (1 0 1) surfaces, calculated based on GGA pseudo-potential

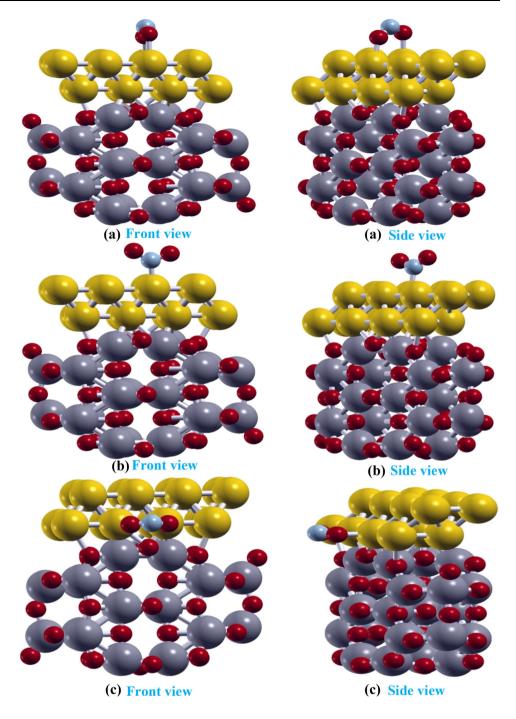
Surface	(0 0 1)	(1 0 1)	
Calculated	0.96	0.49	
Literature	0.98	0.49	



**Fig. 3** Optimized geometry of undoped TiO<sub>2</sub>-supported Au overlayer. The *yellow*, *gray*, and *red balls* denote gold, titanium, and oxygen atoms, respectively. TiO<sub>2</sub> was demonstrated to an appropriate support material for gold particles



Fig. 4 Optimized geometry configurations of the NO<sub>2</sub> molecule adsorbed on the undoped TiO<sub>2</sub>-supported Au overlayers in different orientations, **a** NO<sub>2</sub> adsorption on the *top*-Au sites by its oxygen atoms (configuration A), **b** NO<sub>2</sub> adsorption on the *top*-Au site by its nitrogen atom (configuration B), and **c** NO<sub>2</sub> adsorption on the *side*-Au sites by its oxygen atoms (configuration C)



average energy is. They have explained that the nanoparticles containing 72 atoms have the lowest energy (the highest stability among the different types of nanoparticles. The optimized structure of the pristine  ${\rm TiO_2}$  nanoparticle is shown in Fig. 2. The constructed structure of pristine  ${\rm TiO_2}$  nanoparticle was geometrically optimized and then coupled with Au nanoparticle to model a metal oxide-supported Au overlayer. The calculated structural parameters for the chosen Au nanoparticle are listed in Table S1. The atomic number ratio between titanium and oxygen atoms should

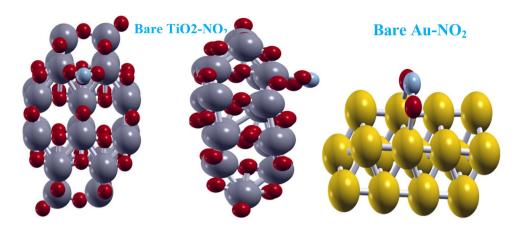
**Table 2** Bond lengths (in Å) and angles (in degrees) of NO<sub>2</sub> molecule adsorbed on the TiO<sub>2</sub>-supported Au nanoparticles

Complex type	Au-O <sub>1</sub>	Au-O <sub>2</sub>	Au-N	N-O <sub>1</sub>	N-O <sub>2</sub>	O-N-O
Undoped						
A	2.23	2.36	_	1.32	1.34	120.4
В	_	_	2.19	1.30	1.31	122.8
C	2.34	2.36	_	1.32	1.32	120.7
Non-adsorbed	-	-	-	1.20	1.20	134.3





Fig. 5 Optimized geometry configurations of the NO<sub>2</sub> molecule adsorbed on the bare TiO<sub>2</sub> and Au nanoparticles



**Table 3** Adsorption energies (in eV) and Mulliken charge values (in e) for NO<sub>2</sub> molecule adsorbed on bare TiO<sub>2</sub>, bare Au, and TiO<sub>2</sub>-supported Au overlayers

Type of complex	Adsorption e	energy (eV)		Mulliken charge (normal basis sets)	Mulliken charge (large basis sets)
	PBE	DFT-D2	DFT-D3		
Undoped					
A	-2.18	-4.12	-8.04	0.15	0.37
В	-1.41	-2.70	-2.08	0.25	0.47
C	-1.87	-3.60	-7.06	0.16	0.38
Bare TiO <sub>2</sub>	-0.72	-1.44	-2.86	+0.05	0.27
Bare Au	-1.23	-2.24	-4.06	+0.04	0.26

be set as 1:2, which was obtained by setting two dangling oxygen atoms in  $TiO_2$ . Spin polarization is not used for the optimization of pristine  $TiO_2$  particles due to the even electron number of pure particles. During the optimization process, "Cluster" method was used as efficient eigenvalue solver. For electronic structure calculations, the convergence criterion of  $1.0 \times 10^{-6}$  Hartree was used, whereas the criterion for geometry optimization was set at  $1.0 \times 10^{-4}$  Hartree/bohr. In addition, "Opt" was used as geometry optimizer, which presents a robust scheme for optimization of solid-state structures based on cluster method.

The surface energies for  ${\rm TiO_2}$  anatase were computed and summarized in Table 1. The calculated data from GGA are in reasonable agreement with the experimentally reported data or other computational works [48]. It indicates that GGA pseudo-potential possesses a reasonable accuracy for calculating the properties of anatase particles. The energy calculations were carried out at the  $\Gamma$  point. The considered simulation box has the dimension of  $20~{\rm \mathring{A}}\times15~{\rm \mathring{A}}\times30~{\rm \mathring{A}}.$  To reduce the additional interactions between neighbor particles, a 11.5  ${\rm \mathring{A}}$  distance in three directions was considered.

 $TiO_2$  includes two types of titanium atoms, namely, fivefold coordinated (5f-Ti) and six-fold coordinated (6f-Ti), as well as two types of oxygen atoms, indicated by three-fold coordinated (3f-O) and two-fold coordinated (2f-O) atoms [49, 50]. For the bent geometry of the  $NO_2$  molecule, the calculated N–O bond length and O–N–O bond angle are about 1.20 Å and 134.3°, respectively, which agree reasonably with the previous gas-phase data [51]. Au nanoparticle was supported by  $TiO_2$  anatase to model a  $TiO_2$ -supported Au overlayer. Figure 3 displays the equilibrium structure of the undoped  $TiO_2$ -supported Au nanoparticle.

#### Results and discussion

# Structural parameters and adsorption energies

Three possible orientations of the NO<sub>2</sub> molecule towards the TiO<sub>2</sub>-supported Au overlayers were considered, in which the NO<sub>2</sub> molecule can bind to the surface of Au atoms either by its nitrogen or by oxygen atoms. The relevant configurations of NO<sub>2</sub> adsorption on the TiO<sub>2</sub>-supported Au nanoparticles are shown in Fig. 4, as indicated by adsorption types A–C. We found that the NO<sub>2</sub> interaction with Au atoms is stronger than the interaction with TiO<sub>2</sub> nanoparticle. Thus, the surfaces of Au atoms are strongly favored during the adsorption process. Over the TiO<sub>2</sub>-supported Au nanoparticle, the NO<sub>2</sub> molecule



preferentially interacts with the Au nanoparticle. The interaction by oxygen atoms leads to a bridge configuration of NO<sub>2</sub> on the nanocomposite. As a closer comparison, it is of eminent importance to describe the adsorption configurations and relative orientations in detail. Configuration A shows the adsorption of NO<sub>2</sub> on the top-site Au atoms of the TiO<sub>2</sub>-supported Au, while configuration C represents the interaction of NO<sub>2</sub> with the lateral-site Au atoms. In configuration B, we can see that NO<sub>2</sub> molecule interacts with the top-site Au atoms by its nitrogen atom, providing a single contacting point between NO<sub>2</sub> and nanocomposite. Configurations A and C indicate a double contacting point between NO<sub>2</sub> and TiO<sub>2</sub>-supported Au. Figure S1 also displays the top views of NO<sub>2</sub> molecule adsorbed on the TiO<sub>2</sub>-supported Au overlayers.

Table 2 summarizes the lengths and distances for the newly formed Au–O bonds, N–O bonds of the adsorbed NO<sub>2</sub> molecule, and O–N–O bond angles of NO<sub>2</sub> after the adsorption process. Based on the obtained results, we found that the N–O bonds of the adsorbed NO<sub>2</sub> molecule were elongated due to the considerable electronic density shifts

from the Au-Au bonds of Au nanoparticle and N-O bonds of the NO<sub>2</sub> molecule to the newly formed Au-O and Au-N bonds between the nanocomposite and NO<sub>2</sub>. Thus, the adsorption process results in weakening the N-O bonds of the NO<sub>2</sub> molecule. The O-N-O bond angles of NO<sub>2</sub> were increased compared to those of non-adsorbed NO2 molecule. This increase in the bond angles could be mostly attributed to the elongation of the N-O bonds of the adsorbed NO<sub>2</sub> molecule. In configuration B, the bond angle increase and geometry changing could be ascribed to the formation of new Au-N bond. The formation of new bond is a key reason, which is responsible for changing the sp hybridization of the nitrogen atom in the NO<sub>2</sub> molecule to hybridization with higher p contribution (near-sp<sup>2</sup>). Consequently, the p characteristics of bonding molecular orbitals of the nitrogen atom in the adsorbed NO<sub>2</sub> molecule become higher.

For clear comparison, the adsorption configurations of NO<sub>2</sub> molecule on pristine Au and TiO<sub>2</sub> nanoparticles are also represented in Fig. 5, indicating less stable adsorption of NO<sub>2</sub> on the considered bare nanoparticles. Table 3

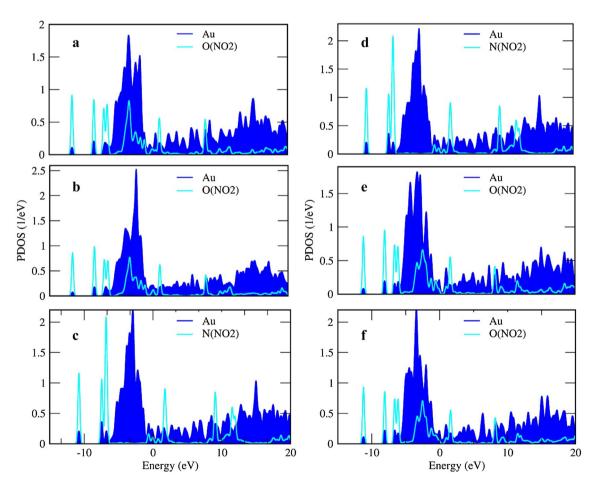


Fig. 6 PDOSs for the adsorption complexes of the undoped  $TiO_2$ -supported Au nanoparticles with adsorbed  $NO_2$  molecules. (a, b) complex A; (c, d) complex B; (e, f) complex C





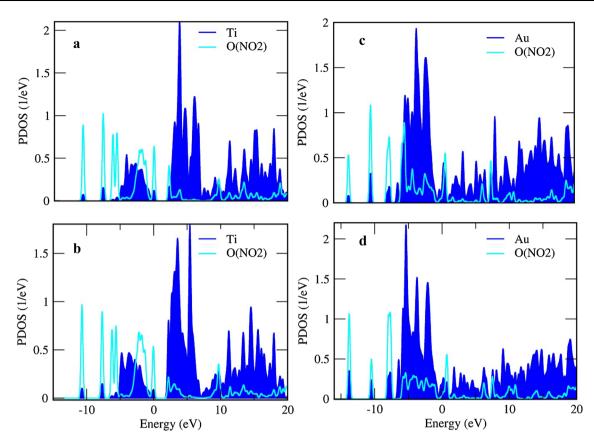


Fig. 7 PDOSs for the adsorption complexes of bare  $TiO_2$  and Au nanoparticles with adsorbed  $NO_2$  molecules. (a, b) Bare  $TiO_2$ – $NO_2$ ; (c, d) Bare Au– $NO_2$ 

summarizes the adsorption energies of  $NO_2$  molecules adsorbed on the pristine  $TiO_2$ -supported Au nanoparticles. Of the three configurations, configuration A has the highest value of adsorption energy, thus making it the most favorable adsorption configuration and, consequently, the most likely binding site to be located on the  $TiO_2$ -supported Au.

Therefore, the adsorption of NO<sub>2</sub> on the TiO<sub>2</sub>-supported Au nanoparticle (configuration A) is more favorable in energy than the adsorptions in configurations B and C. For both adsorption types A and C, the adsorption energy is higher (more negative) than the adsorption energy of adsorption type B. The reason is that the configurations A and C provide a double contacting point between the NO<sub>2</sub> and TiO<sub>2</sub>-supported Au, whereas configuration B shows a single contacting point. NO2 molecule was strongly coordinated to the TiO<sub>2</sub>-supported Au by its two oxygen atoms. In other words, two oxygen atoms of the NO<sub>2</sub> molecule can interact with the TiO2-supported Au overlayer more efficiently. The adsorption energies calculated from DFT-D2 and DFT-D3 methods are significantly larger than those obtained from the standard DFT calculations. Tamijani et al. [52] reported the results of the adsorption of noblegas atoms on the TiO<sub>2</sub> (110) surface-based van der Waals corrected DFT approach and clearly demonstrated the increase in the adsorption energies caused by vdW interactions.

The adsorption energies are considerably increased when the adsorption energies are corrected for dispersion energy, as shown in Table 3. We have calculated the adsorption energies for NO2 molecule on the bare Au and TiO<sub>2</sub> nanoparticles. As can be seen from Table 3, the adsorption energy of NO<sub>2</sub> molecule on the Au nanoparticle is about -1.23 eV and that of pristine  $TiO_2$  is -0.72 eV, and NO<sub>2</sub> adsorption on the TiO<sub>2</sub>-supported Au nanocomposite is found to be -1.48 eV. The higher adsorption energy gives rise to a strong interaction between the adsorbent and adsorbed molecules, and its more negative sign also represents an energy favorable process. Thus, NO<sub>2</sub> adsorption on the TiO<sub>2</sub>-supported Au nanocomposite is more energetically favorable than the adsorption on the bare Au and TiO<sub>2</sub> nanoparticles. In the TiO<sub>2</sub>-supported Au overlayers, the interactions of NO<sub>2</sub> and TiO<sub>2</sub> are stronger than those between NO2 and bare TiO2 nanoparticles, indicating that Au nanoparticle is conducive to the interaction of NO<sub>2</sub> molecule with TiO<sub>2</sub> nanoparticles. In other words, Au nanoparticle enhances NO<sub>2</sub> detection by means of the TiO<sub>2</sub>-supported Au nanocomposite-based sensors.



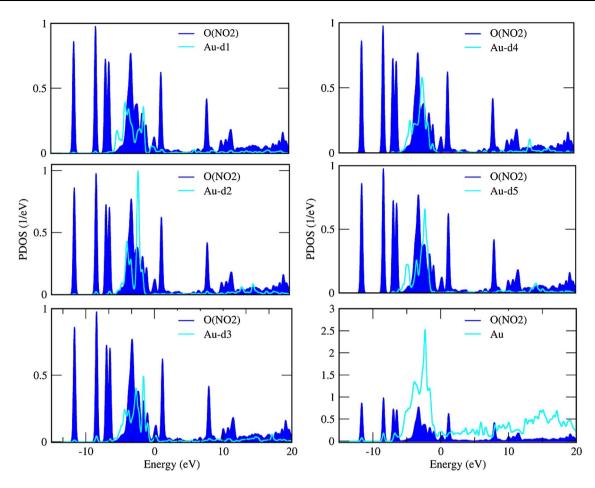


Fig. 8 PDOSs of the oxygen atom of NO<sub>2</sub> molecule and five *d* orbitals of the Au atom for the TiO<sub>2</sub>-supported Au overlayers with adsorbed NO<sub>2</sub> molecules (configuration A)

Therefore, the results of adsorption energies suggest that the  $TiO_2$ -supported Au nanoparticle is a good candidate to be utilized in sensing of toxic  $NO_2$  molecules in the environment.

#### **Electronic structures**

Figure 6 displays the projected density of states (PDOSs) for NO<sub>2</sub> adsorbed on the pristine TiO<sub>2</sub>-supported Au overlayers. Panels (a, b) in this figure show the PDOSs of the Au atom of gold nanoparticle and oxygen atoms of the NO<sub>2</sub> molecule (configuration A). The great overlaps between the PDOSs of these two atoms indicate that the Au atoms form chemical bonds with the oxygen atoms of NO<sub>2</sub>. In panels (c, d), we can see also the PDOSs of the Au atom of gold nanoparticle and the nitrogen atoms (configuration B), indicating substantial overlaps and thus formation of chemical Au–N bond. For configuration C, the pertinent PDOSs of the oxygen atoms of NO<sub>2</sub> molecule and the Au atoms are displayed in panels (e, f). As distinct from these PDOSs, the large overlaps show that both oxygen atoms of NO<sub>2</sub> molecule

form chemical bonds with the Au atoms of the gold nanoparticle. This delivers a double interaction point between the NO<sub>2</sub> and TiO<sub>2</sub>-supported Au. The interaction of NO<sub>2</sub> molecule with bare Au and TiO<sub>2</sub> nanoparticles was also examined, and the relevant PDOSs are shown in Fig. 7, representing noticeable overlaps between the PDOSs of the interacting atoms. This implies that the gold and titanium atoms form chemical bonds with the oxygen atoms of NO<sub>2</sub>.

We also presented the PDOSs of five d orbitals of the Au atom and the oxygen atoms of the  $NO_2$  molecule (configuration A). Figures 8, 9 show the PDOSs of the oxygen atom of  $NO_2$  and different d orbitals of the Au atom, representing higher overlaps between the PDOSs of the oxygen with  $d^3$  orbital of the Au atom. This indicates that the oxygen atom has a substantial mutual interaction with the  $d^3$  orbital of the Au atom. Similarly, Fig. 10 displays the PDOSs of the nitrogen atom of the  $NO_2$  and d orbitals of the Au atom, demonstrating noticeable overlaps between the nitrogen atom and  $d^2$  orbital. For configuration C, the calculated PDOSs of the atom and different orbitals of Au atom are represented in Fig. S2.





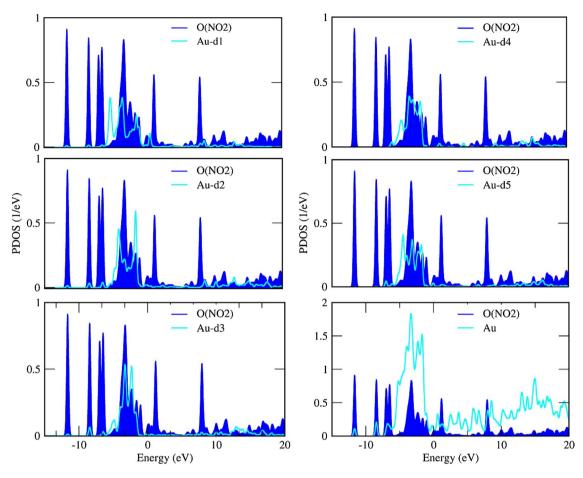


Fig. 9 PDOSs of the oxygen atom of NO<sub>2</sub> molecule and five *d* orbitals of the Au atom for the TiO<sub>2</sub>-supported Au overlayers with adsorbed NO<sub>2</sub> molecules (configuration A)

We geometrically optimized the structure of TiO<sub>2</sub> anatase, and then calculated its band structure. The energy band structure of pristine anatase system is shown in Fig. 11. This figure represents that the calculated band structure of the valence band maximum (VBM) and the conduction band minimum (CBM) was both positioned at the G point. It also represents that pristine TiO<sub>2</sub> was a direct-gap semiconductor material. The calculated bandgap (BG) energy was 2.16 eV for TiO<sub>2</sub> anatase, which was slightly lower than the experimental result of 3.2 eV. Important to note is that, the electronic structure calculation using GGA pseudo-potential usually underestimates energy bandgaps [53, 54]. This band-gap underestimation is mostly ascribed to the well-known limitation of the exchange-correlation functional in describing excited states. Here, valance band corresponds to the O 2p orbitals and the conduction band arises from Ti 3d orbitals.

# Mulliken charge analysis

The Mulliken population analysis was also conducted in this work to fully describe the charge exchange between the  $\mathrm{NO}_2$  molecule and  $\mathrm{TiO}_2$ -supported Au overlayer. This method of charge analysis provides a means of estimating partial atomic charges from calculations implemented by computational chemistry packages. The calculated Mulliken charge values are listed in Table 3. This method assigns an electronic charge to a given atom in the considered system, that is, the gross atom population (GAP). The charge difference,  $\Delta Q_{\mathrm{A}}$ , is a measure of the difference between the number of electrons on the isolated free atom ( $Z_{\mathrm{A}}$ ) and the gross atom population:

$$\Delta Q_{\rm A} = Z_{\rm A} - {\rm GAP_A}. \tag{2}$$

For instance, configuration A represents a sizeable charge transfer of about  $0.15 \ |e|$  (e, the electron charge) from the  $TiO_2$ -supported Au nanoparticle to the  $NO_2$  molecule, implying that  $NO_2$  plays an important role as a charge acceptor. It is worth mentioning that the charge exchange between adsorbent and adsorbed molecule affects the conductivity of the system, being a great strategy to design more efficient and more appropriate sensor devices for the detection of  $NO_2$  in the environment.



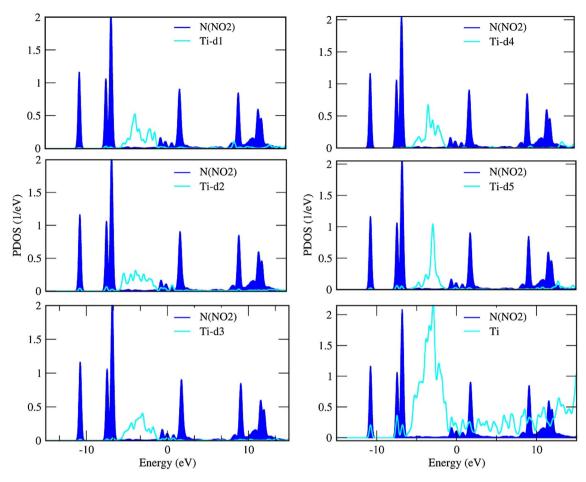
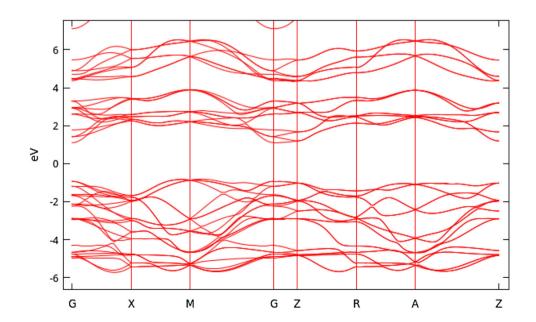


Fig. 10 PDOS of the nitrogen atom of  $NO_2$  molecule and five d orbitals of the Au atom for the  $TiO_2$ -supported Au overlayers with adsorbed  $NO_2$  molecules (configuration B)

**Fig. 11** Electronic band structure of pristine (undoped) TiO<sub>2</sub> anatase







One of the most important problems in Mulliken charge analysis is the intense sensitivity of Mulliken charges to the basis set choice. Fundamentally, a comprehensive basis set for a molecule can be covered by placing a large set of functions on a single atom. In the Mulliken scheme, all the electrons would then be assigned to the single atom. Therefore, it is well known that the Mulliken charge approach has no complete basis set limit, as the precise value which strongly depends on the way the limit is approached. Consequently, an efficient convergence for charges does not exist, and different basis set families may produce extremely different results. To overcome this problem, many modern approaches can be tried for estimating net atomic charges, such as electrostatic potential and natural population methods [55]. We have also calculated the Mulliken charges with the large basis sets of higher accuracy and then found that increasing basis set can simply modify Mulliken charges by approximately 0.22 e. The obtained results are summarized in Table 3. This table shows that the strong basis sets give rise to an increase in the Mulliken charge values.

# **Conclusions**

DFT calculations were carried out to investigate the sensing performance of undoped TiO<sub>2</sub>-supported Au nanoparticles for the detection of NO<sub>2</sub> molecules. The adsorption behaviors of NO<sub>2</sub> on the TiO<sub>2</sub>-supported Au nanoparticles were investigated in detail. The results show that the N-O bonds of the adsorbed NO2 molecule were elongated after the adsorption process, which indicates the weakening N-O bonds of the NO<sub>2</sub> molecule. The results also suggest that the interaction of the NO<sub>2</sub> molecule with the TiO<sub>2</sub>-supported Au overlayer through its oxygen atoms is energetically more favorable than the interaction of NO<sub>2</sub> through its nitrogen atom. This interaction provides a double interacting point between the NO<sub>2</sub> and TiO<sub>2</sub>-supported Au, suggesting the strong adsorption of NO<sub>2</sub> over the substrate. The current results suggest that Au nanoparticle in the TiO<sub>2</sub>-supported Au nanocomposites affects the final configuration of TiO<sub>2</sub> nanoparticles with adsorbed NO<sub>2</sub> molecules and, therefore, strengthens the interaction between NO<sub>2</sub> and TiO<sub>2</sub>. The substantial overlaps between the PDOSs of the Au and oxygen atoms, as well as, Au and nitrogen atoms indicate the formation of chemical bonds between them. Mulliken population analysis reveals a noticeable charge transfer from the TiO2-supported Au to the NO<sub>2</sub> molecule, indicating the acceptor characteristic of the NO<sub>2</sub> molecule. Based on the inclusion of vdW interactions, we found that the adsorption energies become larger. However, our findings thus suggest that the TiO<sub>2</sub>-

supported Au nanoparticles can be utilized as potentially efficient gas sensors for NO<sub>2</sub> recognition.

**Acknowledgements** This work was supported by Azarbaijan Shahid Madani University.

**Open Access** This article is distributed under the terms of the Creative Commons Attribution 4.0 International License (http://creativecommons.org/licenses/by/4.0/), which permits unrestricted use, distribution, and reproduction in any medium, provided you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made.

#### References

- Fujishima, A., Honda, K.: Electrochemical photolysis of water at a semiconductor electrode. Nature 238, 37–38 (1972)
- Fujishima, A., Hashimoto, K., Watanabe, T.: TiO<sub>2</sub> photocatalysis: fundamentals and applications. Bkc, Tokyo (1999)
- Abbasi, A., Sardroodi, J.J.: N-doped TiO<sub>2</sub> anatase nanoparticles as a highly sensitive gas sensor for NO<sub>2</sub> detection: insights from DFT computations. J. Environ. Sci. Nano. 3, 1153–1164 (2016)
- 4. Abbasi, A., Sardroodi, J.J.: Modified N-doped  $TiO_2$  anatase nanoparticle as an ideal  $O_3$  gas sensor: insights from density functional theory calculations. J. Comp. Theor. Chem. **600**, 2457–2469 (2016)
- Fujishima, A., Zhang, X., Tryk, D.A.: TiO<sub>2</sub> photocatalysis and related surface phenomena. J. Surf. Sci. Rep. 63, 515–582 (1992)
- Batzilla, M., Morales, E.H., Diebold, U.: Surface studies of nitrogen implanted TiO<sub>2</sub>. J. Chem. Phys. 339, 36–43 (2007)
- Isley, S.L., Penn, R.L.: Relative brookite and anatase content in sol-gel synthesized titanium dioxide nanoparticles. J. Phys. Chem. B 110, 15134 (2006)
- Rumaiz, A.K., Woicik, J.C., Cockayne, E., Lin, H.Y., Jaffari, G.H., Shah, S.I.: Oxygen vacancies in N doped anatase TiO<sub>2</sub>: experiment and first-principles calculations. J. Appl. Phys. Lett. 95, 262111 (2009)
- Buonsanti, R., Grillo, V., Carlino, E., Giannini, C., Kipp, T., Cingolani, R., Cozzoli, P.D.: Nonhydrolytic synthesis of highquality anisotropically shaped brookite TiO<sub>2</sub> nanocrystals. J. Am. Chem. Soc. 130, 11223–11233 (2008)
- Cassaignon, S., Koelsch, M., Jolivet, J.P.: Selective synthesis of brookite, anatase and rutile nanoparticles: thermolysis of TiCl<sub>4</sub> in aqueous nitric acid. J. Mater. Sci. 42, 6689–6695 (2007)
- Di Paola, A., Addamo, M., Bellardita, M., Cazzanelli, E., Palmisano, L.: Preparation of photocatalytic brookite thin films. Thin Solid Films 515(7), 3527–3529 (2007)
- 12. Djaoued, Y., Bruning, R., Bersani, D., Lottici, P.P., Badilescu, S.: Sol–gel nanocrystalline brookite-rich titania films. Mater. Lett. **58**(21), 2618–2622 (2004)
- 13. Iskandar, F., Nandiyanto, A.B.D., Yun, K.M., Hogan, C.J., Okuyama, K., Biswas, P.: Enhanced photocatalytic performance of brookite TiO<sub>2</sub> macroporous particles prepared by spray drying with colloidal templatings. Adv. Mater. 19, 1408–1412 (2007)
- Kobayashi, M., Petrykin, V.V., Kakihana, M.: One-step synthesis of TiO2 (B) nanoparticles from a water-soluble titanium complex. Chem. Mater. 19, 5373–5376 (2007)
- Li, J.G., Ishigaki, T., Sun, X.D.: Anatase, brookite, and rutile nanocrystals via redox reactions under mild hydrothermal conditions: phase-selective synthesis and physicochemical properties. J. Phys. Chem. C 111, 4969–4976 (2007)



- Reddy, M.A., Kishore, M.S., Pralong, V., Caignaert, V., Varadaraju, U.V.: Room temperature synthesis and Li insertion into nanocrystalline rutile TiO<sub>2</sub>. Electrochem. Commun. 8(8), 1299–1303 (2006)
- Shibata, Y., Irie, H., Ohmori, M., Nakajima, A., Watanabe, T., Hashimoto, K.: Comparison of photochemical properties of brookite and anatase TiO<sub>2</sub> films. Phys. Chem. Chem. Phys. 6, 1359–1362 (2007)
- Haruta, M., Kobayashi, T., Sano, H., Yamada, N.: Novel gold catalysts for the oxidation of carbon monoxide at a temperature far below 0 & #xB0;C. J. Chem. Lett. 16(2), 405–408 (1987)
- Landon, P., Collier, P.J., Papworth, A.J., Kiely, C.J., Hutchings, G.J.: Direct formation of hydrogen peroxide from H<sub>2</sub>/O<sub>2</sub> using gold catalysts. Chem. Commun. 18, 2058 (2002)
- Molina, L.M., Hammer, B.: Some recent theoretical advances in the understanding of the catalytic activity of Au. Appl. Catal. A Gen. 291, 21–31 (2005)
- Okumura, M., Tsubota, S., Haruta, M.: Preparation of supported gold catalysts by gas-phase grafting of gold acethylacetonate for low-temperature oxidation of CO and of H<sub>2</sub>. J. Mol. Catal. A: Chem. 199, 73–84 (2003)
- Lopez, N., Norskov, J.K.: Catalytic CO oxidation by a gold nanoparticle: a density functional study. J. Am. Chem. Soc. 124, 11262–11263 (2002)
- 23. Chen, M.S., Goodman, D.W.: Structure-activity relationships in supported Au catalysts. Catal. Today. 111, 22–33 (2006)
- Kung, H.H., Kung, M.C., Costello, C.K.: Supported Au catalysts for low temperature CO oxidation. J. Catal. 216, 425–432 (2003)
- Hayashi, T.M., Tanaka, K., Haruta, M.: Selective vapor-phase epoxidation of propylene over Au/TiO<sub>2</sub> catalysts in the presence of oxygen and hydrogen. J. Catal. 178, 566–575 (1998)
- Salama, T., Ohnishi, R., Shido, T., Ichikawa, M.: Highly selective catalytic reduction of NO by H<sub>2</sub> over Au 0 and Au(I) impregnated in NaY zeolite catalysts. J. Catal. 162(2), 169–178 (1996)
- Rodriguez, J.A., Liu, G., Jirsak, T., Hrbek, J., Chang, Z.P., Dvorak, J., Maiti, A.: Activation of gold on titania: adsorption and reaction of SO<sub>2</sub> on Au/TiO2 (110). J. Am. Chem. Soc. 124, 5242–5250 (2002)
- 28. Chen, M.S., Goodman, D.W.: The structure of catalytically active gold on titania. Science **306**(5694), 252–255 (2004)
- Cosandey, F., Madey, T.E.: Growth, morphology, interfacial effects and catalytic properties of au on TiO<sub>2</sub>. Surf. Rev. Lett. 8, 73 (2001)
- Vittadini, A., Selloni, A.: Small gold clusters on stoichiometric and defected TiO<sub>2</sub> anatase (101) and their interaction with CO: a density functional study. J. Chem. Phys. 117, 353–361 (2002)
- Chrétien, S., Metiu, H.: O<sub>2</sub> evolution on a clean partially reduced rutile TiO<sub>2</sub> (110) surface and on the same surface precovered with Au<sub>1</sub> and Au<sub>2</sub>: the importance of spin conservation. J. Chem. Phys. 127, 084704 (2007)
- Molina, L.M., Rasmussen, M.D., Hammer, B.: Adsorption of O<sub>2</sub> and oxidation of CO at Au nanoparticles supported by TiO<sub>2</sub> (110).
  J. Chem. Phys. 120(16), 7673 (2004)
- Lin, C., Wen, G., Liang, A., Jiang, Z.: A new resonance Rayleigh scattering method for the determination of trace O<sub>3</sub> in air using rhodamine 6G as probe. J. RSC. Adv. 3, 6627–6630 (2013)
- Hohenberg, P.M., Kohn, W.: Inhomogeneous electron gas.
  J. Phys. Rev. 16, B864–B868 (1964)
- Kohn, W., Sham, L.: Self-consistent equations including exchange and correlation effects. J. Phys. Rev. 140, A1133– A1138 (1965)

- Ozaki, T., Kino, H., Yu, J., Han, M.J., Kobayashi, N., Ohfuti, M., Ishii, F., et al.: The code OpenMX, pseudoatomic basis functions, and pseudopotentials are available on a web site 'http://www. openmxsquare.org' (2017). Accessed 2 Mar 2017
- 37. Ozaki, T.: Variationally optimized atomic orbitals for large-scale electronic structures. J. Phys. Rev. B 67, 155108 (2003)
- 38. Ozaki, T., Kino, H.: Numerical atomic basis orbitals from H to Kr. J. Phys. Rev. B **69**, 195113 (2004)
- Perdew, J.P., Burke, K., Ernzerhof, M.: Generalized gradient approximation made simple. J. Phys. Rev. Lett. 78, 1396 (1981)
- Koklj, A.: Computer graphics and graphical user interfaces as tools in simulations of matter at the atomic scale. J. Comput. Mater. Sci. 28, 155–168 (2003)
- Grimme, S.: Semiempirical GGA-type density functional constructed with a long-range dispersion correction. J. Comput. Chem. 27, 1787–1799 (2006)
- Grimme, S., Antony, J., Ehrlich, S., Krieg, H.: A consistent and accurate ab initio parametrization of density functional dispersion correction (DFT-D) for the 94 elements H–Pu. J. Chem. Phys. 132, 154104 (2010)
- Grimme, S., Ehrlich, S., Goerigk, L.: Effect of the damping function in dispersion corrected density functional theory.
   J. Comput. Chem. 32, 1456–1465 (2011)
- 44. Downs, R.T.: Web page at: http://rruff.geo.arizona.edu/AMS/amcsd.php (2014). Accessed 9 May 2014
- 45. Wyckoff, R.W.G.: Crystal structures, 2nd edn. Interscience Publishers, New York (1963)
- 46. Lei, Y., Liu, H., Xiao, W.: First principles study of the size effect of TiO<sub>2</sub> anatase nanoparticles in dye-sensitized solar cell. Modelling Simul. Mater. Sci. Eng. 18, 025004 (2010)
- Liu, J., Dong, L., Guo, W., Liang, T., Lai, W.: CO adsorption and oxidation on N-doped TiO<sub>2</sub> nanoparticles. J. Phys. Chem. C 117, 13037–13044 (2013)
- Lazzeri, M., Vittadini, A., Selloni, A.: Structure and energetics of stoichiometric TiO<sub>2</sub> anatase surfaces. Phys. Rev. B. 63, 155409 (2001)
- Wu, C., Chen, M., Skelton, A.A., Cummings, P.T., Zheng, T.: Adsorption of arginine–glycine–aspartate tripeptide onto negatively charged rutile (110) mediated by cations: the effect of surface hydroxylation. ACS Appl. Mat. Interfaces 5, 2567–2579 (2013)
- Liu, J., Liu, Q., Fang, P., Pan, C., Xiao, W.: First principles study of the adsorption of a NO molecule on N-doped anatase nanoparticles. J. Appl. Surf. Sci. 258, 8312–8318 (2012)
- Breedon, M., Spence, R.M., Yarovsky, I.: Adsorption of NO<sub>2</sub> on oxygen deficient ZnO (2110) for gas Sensing applications: a DFT study. J. Phys. Chem. C 14(39), 16603–16610 (2010)
- Tamijani, A.A., Salam, A., de-Lara-Castells, P.: Adsorption of noble-gas atoms on the TiO2 (110) surface: an ab initio assisted study with van der Waals corrected DFT. J. Phys. Chem. C 120(32), 18126–18139 (2016)
- Longa, M., Cai, W., Wang, Z., Liu, G.: Correlation of electronic structures and crystal structures with photocatalytic properties of undoped, N-doped and I-doped, TiO<sub>2</sub>. Chem. Phys. Lett. 420, 71–76 (2006)
- 54. Gao, H., Zhou, J., Dai, D., Qu, Y.: Photocatalytic activity and electronic structure analysis of N-doped anatase TiO<sub>2</sub>: a combined experimental and theoretical study. Chem. Eng. Technol. **32**(9), 867–872 (2009)
- Reed, A.E., Weinstock, R.B., Weinhold, F.: Natural population analysis. J. Chem. Phys. 83(2), 735–746 (1985)



