Engineering the Electronic Structure in Titanium Dioxide via Scandium Doping Based on the Density Functional Theory Approach for the Photocatalysis and Photovoltaic Applications

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ABSTRACT: Titanium dioxide (TiO₂) has received much attention, owing to applications in various areas including photocatalysis and photovoltaics. It is a wide band gap n-type semiconductor. Production of p-type TiO₂ is challenging and interesting research work for its utilization in wider areas of applications. In this study, band structures and corresponding density of states of undoped and scandium (Sc)-doped TiO₂ with different concentrations of Sc doping are calculated using Density Functional Theory (DFT). Sc doping in TiO₂ converts intrinsically n-type TiO₂ into p-type TiO₂. An increase in doping concentration generates shallow acceptor levels ranging from 10 meV to 25 meV above the Fermi level. The study has the potential to improve the conductivity of TiO₂ via different concentrations of Sc dopants and produce p-type TiO₂ for applications in photocatalytic watersplitting technology in low-cost and eco-friendly hydrogen production and solar cell technology to support future energy demand.

KEYWORDS: *Density functional theory; p-type doping; Electronic properties; Hydrogen energy; Fuel cell.*

INTRODUCTION

The catalytic process is vital in the field of materials chemistry because the outcome of a chemical reaction is controlled by the application of a suitable catalyst. Usually, at the nanoscale, the catalyst can provide a more

* To whom correspondence should be addressed. + E-mail: singh915@gmail.com 1021-9986/2023/3/731-739 9/\$/5.09 powerful strategy in a given environment to achieve the goal due to quantum confinement [1]. Different nanoscale materials have been utilized for potential applications in various sectors [2-6]. In particular, metal oxide nanoparticles such as TiO₂, ZnO, WO₃ have been extensively used for photocatalytic, catalytic, and photovoltaic applications due to the easier synthesis process, nontoxicity, high chemical stability, and abundance nature [7]. TiO₂ has mainly three polymorphs as anatase, rutile, and brookite, out of those anatase and rutile are the most common in nature [8]. At the nanoscale, the stability of the anatase is higher than another polymorph therefore, it is the most interesting phase that has received much more attention from scientists and engineers due to its intriguing widespread applications in many fields that include photocatalysis and photovoltaic devices [9-13].

The anatase TiO_2 is a wide band gap semiconductor material with a band gap of 3.23 eV [14]. Therefore, for its more efficient application, tuning of electronic and magnetic properties is certainly needed. Usually, the electronic properties are getting tuned by the controlled introduction of the dopants and the defects in the TiO_2 matrix that are associated with the trapping or the selftrapping phenomenon. Subsequently, the doped TiO_2 produced would have more peculiar properties than the parent TiO_2 system. For this reason, doped TiO_2 is one of the most widely studied materials both theoretically and experimentally. The combined outcome of the theoretical and computation work would lead to a clear idea of the complex doped system for their future advancement and better understanding [15].

A literature review suggested that the doped TiO₂ has good photocatalytic activity. For instance, Livraghi et al. [16] have reported nitrogen-doped TiO₂ nanoparticles that have paramagnetic centers (neutral NO radicals and NO₂-type radicals) were capable of decomposing the organic pollutant using visible light. In another attempt, Wei et al. [15] synthesized TiO2 nanoparticles codoped with nitrogen and lanthanum (La3+) ions. The doping of nitrogen resulted in narrowing the band gap of TiO₂ which enhanced the absorption between 350 nm to 450 nm due to the superior catalytic activity while the doping of La³⁺ ions increases the surface area of the sample further increasing the absorption below 350 nm. The electrical conductivity of TiO₂ thin film is improved via Sc-doping [17].

The use of machine learning in material science, physics, and chemistry is increasing [18-25]. It uses techniques and algorithms to solve various complex problems which are difficult to solve using traditional programming methods. Various high-performance organic solar cells have been demonstrated using machine learning. In the context of TiO₂, several experimental as well as theoretical studies have been reported to alter the electronic property of TiO₂ [26-33]. Cavalheiro et al. [28] experimentally observed that the photocatalytic property of TiO₂ is improved due to Sc-doping. However, most of the previous reports lack details of Sc-doping into TiO₂ to get more insight into the observed phenomena. Details about the effect of an increase in dopant concentration on the electronic structure, whether the doping is n-type or p-type, calculation of impurity ionization energy, and localization of a charge carrier and their applications in solar cells are yet to be explored. Hence, a detailed theoretical study on the influence of varying Sc doping concentration into TiO₂ on its electronic property is needed.

In this article, a systematic study on the influence of Sc-doping on the electronic properties of anatase TiO₂ is carried out using first-principle calculations based on density functional theory (DFT). The calculated results show the p-type doping of TiO₂, and the density of states (DOS) in the valence band and the vicinity of Fermi level increases with an increase in dopant concentration. Furthermore, with an increase in Sc concentration, acceptor levels are generated above the Fermi level at the most symmetric G-point. Positions of acceptor energy levels, doping concentrations, and carrier localization are calculated and discussion on their importance for photocatalytic and solar cell applications is also well explored. The research findings, presented in this paper, underscore the impact of Sc doping concentration on the alteration of electronic structures of anatase TiO₂. The study may be utilized further in various experimental work and applications such as using it as photocatalysts of hydrogen production and as active materials in solar cells.

EXPERIMENTAL SECTION

The anatase phase of TiO₂ has a tetragonal structure with space group 141/AMD. Lattice constants are a = b = 0.3785 nm, c = 0.9514 nm; $\alpha = \beta = \gamma = 90^{\circ}$ [14]. The electronic structures of undoped and Sc-doped TiO₂ were studied using the first principles of calculation based on density functional theory. DFT calculations were performed using the Cambridge Sequential Total Energy Package (CASTEP) in Materials Studio 7. The method comprised of geometry optimization of anatase TiO₂ structures with and without



Fig. 1. 2×2×1 supercell models of undoped anatase TiO2 and Sc doped TiO2.(a) Undoped TiO2, (b) TiO2 doped with 8.33 at.% of Sc (Ti12Sc4O32), (c) TiO2 doped with 10.43 at.% of Sc (Ti11Sc5O32), and (d) TiO2 doped with 14.58 at.% of Sc (Ti9Sc7O32). Sc atoms are indicated with a violet color.

Sc doping. All geometry optimizations were performed in a uniform $3 \times 3 \times 1$ k-point mesh in the Brillouin zone using plane-wave ultrasoft pseudopotential with a cut-off energy of 240 eV until the force on each atom is less than 0.05 eV/Å.

The exchange-correlation is described by generalized gradient approximation (GGA) [34]. The lattice constants of the optimized TiO₂ unit cell are found to be a = b = 0.381 nm, c = 0.958 nm which are matching with the lattice constants reported in the literature [14].

RESULTS AND DISCUSSION

In the presented results, to realize the doping of Sc in different concentrations, a $2 \times 2 \times 1$ supercell model was designed as shown in Fig. 1. The tetragonal structure of TiO₂ consists of 4 Ti atoms and 8 O atoms in a unit cell. The supercell $2 \times 2 \times 1$ designed in this study has stacks off our unit cells which consist of 16 Ti and 32 O atoms with a total of 48 atoms as shown in Fig. 1a. For different dopant concentrations, the different nnumbers of c atoms were substituted at Ti sites. The number of Sc atoms (say N_{Sc}) for substitution was chosen as N_{Sc}= 4 (Fig. 1b), N_{Sc} = 5 (Fig. 1c), and N_{Sc} = 7 (Fig. 1d). The concentration of Sc dopants in atomic percentage was calculated as

atoms in the $2 \times 2 \times 1$ supercell. Thus, substitutions of 4, 5, and 7 atoms of Sc correspond to concentrations of 8.33%, 10.43%, and 14.58% respectively. Stabilities of the undoped and Sc-doped TiO₂ were studied by performing total energy (ground state energy) calculations in fully relaxed geometries (Fig. 1) with fixed parameters. The total energy is found to be -40622.84 eV for undoped TiO₂, -41332.18 eV for 8.33% Sc-doped TiO₂, -41743.55 eV for 10.43% Sc-doped TiO₂ and -41880.27 eV for 14.58% Sc-doped TiO₂. It is noticed that ground state energies of Sc-doped TiO₂ are higher than that of undoped TiO₂, indicating that the stability of the TiO₂ increases due to Sc-doping.

 $(N_{Sc}/N_T) \times 100$, where N_T (= 48) is the total number of

To study the electronic properties, calculations for band structures of undoped TiO₂ and TiO₂ doped with different concentrations of 8.33 % (Sc/TiO₂ 8.33%), 10.43% (Sc/TiO₂ 10.43%), and 14.58 % (Sc/TiO₂ 14.58 %) were performed by optimizing the structures using appropriate parameters detailed in the Experimental Section. The calculated results of band structures are presented in Fig. 2. The G, F, Q, and Z in band structures of Fig. 2 are different k-points in the Brillouin zone. From Fig. 2a, the band gap of undoped TiO₂ which is the energy



Fig. 2: Band structures of (a) undoped TiO₂, (b) Sc/TiO₂ 8.33 at.%, (c) Sc/TiO₂ 10.43 at.%, (d) Sc/TiO₂ 14.58 at.%. The Fermi level is set to zero and indicated by the dotted red line.

between Valence Band Maximum (VBM) and Conduction Band Minimum (CBM) was calculated to be 2.24 eV. The VBM is located between F and Q while CBM is located at G. This indicates that TiO₂ has an indirect band gap. The band gap of undoped TiO₂ calculated in this study is well agreed with theoretical results by another group [35]. However, the calculated band gap is much smaller than the experimental band gap of 3.23 eV. The underestimation of this band gap is attributed to the intrinsic feature of the Generalized Gradient Approximation (GGA) adopted in our calculation. Fig. 2b-d shows the band structures of Sc-doped TiO₂ with the three different concentrations (8.33%, 10.43%, and 14.58%) of Sc. In Figs. 2b-d, we see that the Valence Band (VB) is relatively flat as compared to the conduction band. A flat band of VB indicates the localization of particles (holes) due to the incorporation of Sc impurity. Quantum destructive interference of carrier wave function on the lattice can cause this carrier localization (effective mass of carrier tends to be infinite), resulting in flattening of bands in VB. Another noticeable feature is the increase in the number of energy levels in VB which makes the band denser (see Figs. 2b-d). The increased number of energy levels in VB due to the Sc-doping is an indication of p-type doping of TiO₂. Doping Sc at the Ti site can result in p-type doping that can be understood as follows. The atomic number of Sc is 21 while the atomic number of Ti is 22. Thus, Sc has 3 valence electrons $4s^2$, $3d^1$ while Ti has 4 valence electrons $4s^2$, $3d^2$ considering the participation of 3d electrons. If we replace the Sc atom at the Ti site, 3 electrons of Ti will be involved in making a covalent bond by sharing 3 electron from Sc. However, the 4^{th} electron of Ti lacks one electron (absence of an electron that is called a hole) from Sc to share and hence to form a covalent bond. Thus, substituting one Sc atom into the TiO₂ crystal at the Ti site leaves one hole or absence of an electron in the crystal.

To get more insight into the electronic structure, the data in Fig. 2 is enlarged near the Fermi level (shown by a dotted red line) at G which is presented in Fig. 3. For TiO₂ doped with 8.33 % of Sc (see Fig. 3b), it is found that an electronic state of VB crosses the Fermi level near the



Fig. 3: Enlarged view of band structures shown in Fig. 2 near Fermi level for (a) undoped TiO₂, (b) Sc/TiO₂ 8.33 at.%, (c) Sc/TiO₂ 10.43 at.%, (d) Sc/TiO₂ 14.58 at.%. The Fermi level is set to zero and indicated by the dotted red line.

most symmetric G point and this state has an energy of 10 meV above the Fermi level at G point. Fig. 3d shows that for Sc concentration of 14.58% there are five states of VB near the G point which cross the Fermi Level. These energy levels are shallow acceptor energy levels lying in the range from 10 meV to 25 meV above the Fermi level.

Thus, calculated acceptor ionization energy lies in the range of 10-25 meV which is of the order of thermal energy at room temperature. It is noticed that carrier (hole) concentration increases in TiO_2 due to Sc doping. An increase in carrier concentration is one of the most important routes for improving the catalytic activity of semiconductor photocatalysts and efficiency of photovoltaic devices.

The Density Of States (DOS) of undoped TiO₂ and TiO₂ doped with different concentrations of Sc were also calculated. The results of DOS are presented in Fig. 4. In comparison with undoped TiO₂ (see Fig. 4a), TiO₂ doped with 8.33 % of Sc (see Fig. 4b) exhibits an increase of density of states (DOS) in VB, indicating p-type doping.

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This result of DOS supports the calculations of band structures in Fig. 2 and Fig. 3. Similarly, by increasing the Sc concentration to 10.43% and 14.58%, DOS continued to increase further in VB as shown in Fig. 4c and Fig. 4d, respectively. This increase in DOS is also seen in the vicinity of the Fermi level (see the enlarged view on the right panel), indicating the generation of new impurity states due to the Sc doping which again supports the results of band structures presented in Fig. 2 and Fig. 3. An increase of carriers (holes) due to Sc doping dramatically increases the electrical conductivity of TiO2 and also photocatalytic property as evidenced experimentally [17, 28]. Furthermore, we also find that the shape of DOS (considering DOS as Gaussian shape) changes after Sc doping as seen in the enlarged view on the right panels in Fig. 4. DOS shape of Sc-doped TiO₂ becomes narrower than that of undoped TiO₂. This narrowing of DOS peaks of VB near Fermi level is more obvious for 14.58 at.% doping of Sc as shown in the right panel of Fig. 4(d). This indicates that the electronic nonlocality is less obvious, owing to the increase of crystal symmetry [36] and localization of holes,



Fig. 4: Density of states (DOS) of (a) undoped TiO₂ (b) Sc/TiO₂ 8.33 at.%, (c) Sc/TiO₂ 10.43 at.%, (d) Sc/TiO₂ 14.58 at.%. Fermi level is set to zero and presented by a dotted line. Where at.% stands for atomic%. The enlarged view of DOS near the Fermi level is shown on the right panel.

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which is also supported by the flattening of energy levels in VB as shown by band structures (see Fig. 2(b-d)). Charge carrier localization has a significant impact on solar cell devices. Localization of holes as compared to the electron leads to the separation of electron-hole pairs, which dramatically improves the efficiency of a solar cell. Thus, our study here may further be employed to fabricate new and efficient solar cells in the future.

CONCLUSIONS

In summary, the electronic properties of Sc-doped anatase TiO₂ have been studied systematically using firstprinciple calculations based on density functional theory. Energy band structures and density of states of undoped TiO₂ and Sc-doped TiO₂ with varying concentrations of dopants are calculated. The results exhibit that Sc doping into TiO₂ causes p-type doping, which generates shallow acceptor levels lying in the range of 10 meV-25 meV above the Fermi level. It is also noticed that, with an increase in dopant concentration, the density of states in the valance band and the vicinity of the Fermi level increases, and the localization of holes occurs. The study is important because it highlights the influence of different concentrations of Sc doping into TiO₂, and it may further be applied to explore the dopant concentration-dependent alteration of electronic properties of TiO₂ for photocatalytic and photovoltaic applications.

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