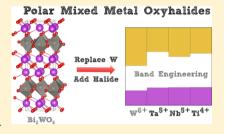
Crystal Engineering of Bi₂WO₆ to Polar Aurivillius-Phase Oxyhalides

Kazuki Morita,*,†,‡® Ji-Sang Park,^{§®} Sunghyun Kim,^{‡®} Kenji Yasuoka,[†] and Aron Walsh*,‡,||®

Supporting Information

ABSTRACT: The Aurivillius phases of complex bismuth oxides have attracted considerable attention because of their lattice polarization (ferroelectricity) and photocatalytic activity. We report a first-principles exploration of Bi₂WO₆ and the crystal engineering through replacing W6+ by pentavalent (Nb5+ and Ta5+) and tetravalent (Ti4+ and Sn4+) ions, with charge neutrality maintained by the formation of a mixed anion oxyhalide sublattice. We find that Bi₂SnO₄F₂ is thermodynamically unstable, in contrast to Bi₂TaO₅F, Bi₂NbO₅F, and Bi₂TiO₄F₂. The electric dipoles introduced by chemical substitutions in the parent compound are found to suppress the spontaneous polarization from 61.55 μ C/cm² to below 15.50 μ C/cm². Analysis of



the trends in electronic structure, surface structure, and ionization potentials is reported. This family of materials can be further extended with control of layer thicknesses and choice of compensating halide species.

INTRODUCTION

Metal oxides have been studied intensively for applications such as photoelectrochemistry, photocatalysis, and transparent electronics. 1-4 These studies are motivated by their low cost, high stability, and a wide range of physical properties.^{3,5,6} For photochemical and optoelectronic applications, specific band gaps and band alignments are required to optimize the device performance. Many metal oxides have a valence band maximum (VBM) composed of O 2p orbitals, resulting in similar valence band energies.7 Therefore, metal oxides often fail to meet the band alignment requirements. The most prominent example is when metal oxides are used as photoanodes for water splitting, where the valence band energy is too deep to efficiently support oxygen evolution reactions.^{5,8} For the reaction to occur efficiently, the valence band edge must be higher in energy (closer to vacuum) so that holes can be effectively transferred to water. The valence band energy is relevant to other application areas including p-type transparent electrodes.4,9

Efforts to modulate the valence band energy of metal oxides include the use of ns² post-transitional metal cations and mixed anions. 10-13 There are few examples where these approaches are used in tandem, and there have been some notable successes.¹² The combination of high-throughput materials screening and experimental synthesis reported a p-type transparent conducting oxide Ba₂BiTaO₆, where high hole mobility was attributed to the hybridization of Bi 6s and O 2p levels.¹⁴ Other experimental works have demonstrated that compounds in Sillen-Aurivillius phase, Bi₄NbO₈X (where X = Cl, Br, and I), exhibit an elevated valence band. 15-1 ability of halide anions to change the strength of an O-cation bond and hybridization of Bi with O 2p levels combine to raise the VBM compared to conventional metal oxides. 12,13 These studies suggest effectiveness of adopting mixed anion ternary and quaternary bismuth oxides to obtain elevated valence band energies. In particular, the chemical flexibility of Aurivilliusphase compounds is expected to be suitable for this approach.18

The general formula of the Aurivillius family is $(Bi_2O_2)^{2+}(A_{m-1}B_mO_{3m+1})^{2-18-21}$ Much effort has been put into studying russellite Bi_2WO_6 (m = 1), a naturally occurring mineral, which exhibits high catalytic performance and ion conductivity.²²⁻²⁴ However, because of its chemical and structural complexity, even in the simplest case of Bi₂WO₆, there is still much to be explored. Early in the research of this compound, several crystal structure models were proposed. 25,26 However, it is now generally accepted that Bi₂WO₆ adopts a polar P21ab space group at low and intermediate temperatures. 27-29 Above 700 °C, the structure transforms into an orthorhombic Aba2 space group through a second-order phase transition. 27,30,31 Further heating to about 950 °C transforms the crystal to the A2/m symmetry through a first-order phase transition, where the spontaneous polarization disappears ($T_{\rm C}$ $= 950 \, ^{\circ}\text{C}).^{27,31,32}$

Along with experiments, density functional theory (DFT) calculations have been used to probe the mechanism behind the structural phase transition of Bi₂WO₆. ^{31,33} Recently, researchers have expanded the scope to quaternary mixed anion compounds such as Bi₂TaO₅F, Bi₂NbO₅F, and Bi₂TiO₄F₂, and the photocatalytic performance of these

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[†]Department of Mechanical Engineering, Keio University, Yokohama 223-8522, Japan

[‡]Department of Materials, Imperial College London, London SW7 2AZ, United Kingdom

[§]Department of Physics, Kyungpook National University, Daegu 41566, Korea

Department of Materials Science and Engineering, Yonsei University, Seoul 03722, Korea

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Figure 1. Crystal structures of Bi_2WO_6 , Bi_2TaO_5F , Bi_2NbO_5F , $Bi_2TiO_4F_2$, and $Bi_2SnO_4F_2$. Oxygen sites are distinguished as O_{Bi-1} , O_{Bi-2} , O_W , $O_{Tav}O_{Nb}$, O_{Tiv} and O_{Sn} .

compounds were measured.^{34–36} These studies have shown the effectiveness of crystal engineering, realized through the B-site cation replacement and F addition, to make a mixed anion compound. Although the application potential of quaternary compounds was demonstrated,^{34–41} less is known about their physical properties and electronic characteristics.

In this study, we systematically expand the crystal system by replacing W6+ in Bi₂WO₆ with pentavalent Ta⁵⁺ and Nb⁵⁺ and with tetravalent Ti4+ and Sn4+. F- were also incorporated to the O²⁻ site resulting in the charge neutrality to be maintained. Therefore, we have explored properties of a ternary compound Bi₂WO₆ and quaternary compounds Bi₂TaO₅F, Bi₂NbO₅F, Bi₂TiO₄F₂, and Bi₂SnO₄F₂ in detail using first-principles material modeling. We report that substitution of O with F resulted in a modified perovskite-like (BO₄)²⁻ layer, which suppressed the magnitude of the spontaneous electric polarization. Furthermore, the quaternary compounds exhibited higher valence band energy compared to Bi₂WO₆, and each of the conduction band minimum levels differed largely, suggesting high tunability of the band edge energy. Together, these results demonstrate the diverse material properties of Bi₂WO₆-based compounds and open up a path toward developing new Bi-based mixed anion compounds.

METHODS

Atomic Structure Models. A crystal structure model of Bi₂WO₆ was obtained by optimizing the initial (room temperature) structure determined from X-ray diffraction.⁴²

B-site cations, W, in Bi₂WO₆ were replaced by Nb, Ta, Ti, and Sn, together with F, to maintain the same valence electron count, resulting in Bi₂TaO₅F, Bi₂NbO₅F, Bi₂TiO₄F₂, and Bi₂SnO₄F₂, respectively (Figure 1). Because there are degrees of freedom for the F distribution among the anion sites, 20 different F configurations were considered for each compound. Within the 20 configurations, 5 were chosen so that F atoms are aligned in a certain crystal plane and the rest were randomly selected using the site-occupancy disorder code.⁴³ To validate the dependence of F configurations, four most stable F configurations were calculated for each quaternary oxide. However, F configurations had little effect on the properties of interest; therefore, only the results of the most stable structures are presented.

To assess the thermodynamic stability of the Aurivilliusphase compounds, a number of decomposition reactions were considered. When the product (secondary phases) has lower energy, the reaction is exothermic, thus suggesting the quaternary compound to be unstable over any chemical potential range.

DFT Calculations. DFT calculations were performed within the projector-augmented wave scheme as implemented in VASP. The VESTA package was used to visualize the

atomic structures. Both HSE06⁴⁸ and PBEsol⁴⁹ were used for the exchange correlation functional as described below. Scalar relativistic corrections are included in all cases. Because the valence band edges were composed of Bi 6s and O 2p orbitals, the spin—orbit coupling (SOC) effect is expected to be small and would only affect the empty Bi 6p band. ^{50,51}

The structure relaxations were performed using PBEsol, while further electronic structure and total energy analysis was performed with HSE06. A plane wave cutoff of 550 eV, a k-point sampling of at least $5 \times 5 \times 2$ for the primitive unit cell of 36 atoms, and an electronic convergence criteria of 10^{-8} eV were employed. The lattice constants and the internal coordinates were optimized until the residual force became less than 1.0 meV/Å for each atom in the unit cell.

Spontaneous Lattice Polarization. Lattice polarization was calculated with the PBEsol functional within the Berry phase formalism. 52,53 In modern theory of polarization, the spontaneous polarization Δp is defined as follows

$$\Delta p = P_{\text{polar}} - P_{\text{non-polar}} + n\Delta P_{\text{Q}} \tag{1}$$

Here, $P_{\rm polar}$ is the *formal* polarization of the polar phase, $P_{\rm non\text{-}polar}$ is the *formal* polarization of the nonpolar phase, n is an integer, and $\Delta P_{\rm Q}$ is a polarization quanta. The two *formal* polarizations are the raw results of the Berry phase calculations and the spontaneous polarization Δp is defined as their difference. 52,53

This definition leaves an ambiguity in the value of spontaneous polarization Δp with respect to modulo $\Delta P_{\rm Q}$, which is not a problem when $\Delta P_{\rm Q}$ is larger than Δp . However, the polarization quanta $\Delta P_{\rm Q}$ in Aurivillius-phase compounds was smaller than the spontaneous polarization Δp (Table 1),

Table 1. Structure, Polarization Quanta (ΔP_Q), and Spontaneous Polarization (Δp) of Aurivillius-Phase Oxides

compound	a (Å)	b (Å)	c (Å)	volume (ų)	$\frac{\Delta P_{\rm Q}}{(\mu { m C/cm}^2)}$	$\Delta p \over (\mu \text{C/cm}^2)$
Bi_2WO_6	5.44	5.44	16.55	489.66	17.79	61.55
Bi_2TaO_5F	5.40	5.41	16.58	484.26	17.87	10.68
Bi_2NbO_5F	5.39	5.40	16.58	482.08	17.90	15.50
$Bi_2TiO_4F_2$	5.36	5.38	16.30	470.15	18.26	15.15
$Bi_2SnO_4F_2$	5.53	5.53	16.83	515.02		

making it difficult to determine the exact value of spontaneous polarization Δp from only $P_{\rm polar}$ and $P_{\rm non-polar}$. Therefore, formal polarization of the intermediate structures between the ideal (fictitious) nonpolar centrosymmetric structure and the polar $P2_1ab$ structure were calculated. Because spontaneous polarization has some dependence on F configurations in the oxyhalide systems, the four most stable F configurations were calculated for each of the quaternary compounds.

Surface Structure and Stability. To find the favored crystal terminations, the atomic chemical potentials were used to obtain the surface formation energies. First, the set of chemical potentials which stabilize Bi₂WO₆ were obtained by comparing the formation enthalpy with the competing binary oxides, WO₂, WO₃, and Bi₂O₃. The formation enthalpy was calculated as follows

$$\Delta H_{\rm f}^{\rm Bi_2WO_6} = E_{\rm Bi_2WO_6} - 2E_{\rm Bi} - E_{\rm W} - 6E_{\rm O} \tag{2}$$

where $E_{\rm Bi}$, $E_{\rm W}$, and $E_{\rm O}$ are the energies per atom for the standard state of elements such as Bi metal, W metal, and molecular O_2 , respectively. To stabilize the material, the chemical potential with respect to the standard states of Bi, W, and O should satisfy the following inequality

$$\Delta H_{\rm f}^{\rm Bi_2WO_6} = \Delta \mu_{\rm Bi,WO_6} - 2\Delta \mu_{\rm Bi} - \Delta \mu_{\rm W} - 6\Delta \mu_{\rm O} \tag{3}$$

$$\Delta \mu_{\rm Bi} \le 0, \ \Delta \mu_{\rm W} \le 0, \ \Delta \mu_{\rm O} \le 0$$
 (4)

Second, surface formation energies $\Delta E_{\rm surf}^{\rm f}$ for given chemical potentials were calculated. Accounting for the fact that Bi₂WO₆ is likely to exhibit surfaces on the [001] direction, ^{54,55} five different models with (001) surface terminations were considered.

Surfaces were described using symmetric slab models with a thickness of at least 32 Å and a vacuum thickness of about 20 Å. The atomic structures were relaxed with the PBEsol functional and their energies were calculated with the HSE06 functional. Then, the following equation was used to calculate the surface formation energies

$$\Delta E_{\text{surf}}^{\text{f}} = (E_{\text{surf}} - n_{\text{Bi}}\mu_{\text{Bi}} - n_{\text{W}}\mu_{\text{W}} - n_{\text{O}}\mu_{\text{O}})/2 \tag{5}$$

where $E_{\rm surf}$ is the energy of slab model calculated and n_i is the number of the chemical species i in the slab model. Finally, from the most stable surface structure of ${\rm Bi_2WO_6}$, surfaces for the quaternary oxides were made, and the band edges of bulk were aligned by using the vacuum level as a reference using the MacroDensity package. ⁵⁶

RESULTS

Crystal Structure. Bi₂WO₆ consists of fluorite-like $(Bi_2O_2)^{2+}$ layers and perovskite-like $(WO_4)^{2-}$ layers as shown in Figure 1. Early studies of Bi₂WO₆ reported a range of structure types including I4/mmm, 25 B2cb, 26 and $P2_1ab$ (referred as $Pca2_1$). 24,42 There is growing consensus that this material exhibits the $P2_1ab$ structure around room temperature. $^{27,30-32}$ Our optimized structural parameters, listed in Table 1, are in good agreement with experimental results, which have reported the lattice constants of Bi₂WO₆ to be 5.45, 5.43, and 16.40 Å (converted from $Pca2_1$ setting). 27

For quaternary compounds, the most stable F ion configurations within 20 calculated structures are presented in Figure 1. All of the structures were orthorhombic with the lattice constants shown in Table 1. With the exception of Bi₂SnO₄F₂, the volume of the unit cell decreased as the B-site cation decreased its valence (Table 1). The length of each axis depends on the F configurations and the trends can be explained by the B-site cation and F (B-F) bond length. The B-F bond length is longer than B-O, which causes the octahedra to be elongated in the F direction. This elongation decreases the volume of the octahedra and moves the B-ion closer to the center of the octahedra. Overall, in quaternary

compounds, substitution of O by F ions largely changed the local structure of the perovskite-like $(BO_4)^{2-}$ layer.

Stability is an important criterion when considering photochemical or optoelectronic applications. However, it is known that ternary and quaternary compounds are more likely to be unstable compared to binary compounds because there are more competing phases. Therefore, the thermodynamic stability of the compounds were assessed by whether a material will decompose to its competitive phases. All compounds were found to be stable (see the Supporting Information) with the exception of Bi₂SnO₄F₂. The following decomposition reaction of Bi₂SnO₄F₂ is exothermic

$$\Delta H = (E_{\text{Sn}_2\text{Bi}_2\text{O}_7} + E_{\text{BiOF}} + E_{\text{BiF}_3}) - 2E_{\text{Bi}_2\text{SnO}_4\text{F}_2}$$

$$= -1.11 \text{ eV}$$
(6)

In this process, the enthalpy change ΔH was -1.11 eV, suggesting a trio of $\mathrm{Sn_2Bi_2O_7}$, BiOF , and $\mathrm{BiF_3}$ to be preferred over $\mathrm{Bi_2SnO_4F_2}$ at any chemical potential range. Furthermore, using the phonopy code, ⁵⁸ the first-principles phonon density of states were calculated and the absence of imaginary modes were confirmed. Because $\mathrm{Bi_2SnO_4F_2}$ was unstable, hereafter, we will focus on four compounds, $\mathrm{Bi_2WO_6}$, $\mathrm{Bi_2TaO_5F}$, $\mathrm{Bi_2NbO_5F}$, and $\mathrm{Bi_2TiO_4F_2}$.

Electronic Structure. The atom-projected electronic density of states was used to investigate the contribution of each element to upper valence band and lower conduction band, as shown in Figure 2. Six inequivalent O-sites in this crystal structure were grouped according to the nearest cation. For example, in Bi_2WO_6 , 16 O atoms were labeled O_{Bi} and eight of them were labeled O_{W} as shown in Figure 2. It should be noted that for quaternary compounds, the number of O atoms near Bi and O atoms near B-site cation varies according to the F configurations.

All four compounds, Bi_2WO_6 , Bi_2TaO_5F , Bi_2NbO_5F , and $Bi_2TiO_4F_2$, are insulators with band gaps of 2.88, 4.16, 3.56, and 3.93 eV, respectively. Experimental studies reported that Bi_2WO_6 has a band gap of 2.8 eV, which is in good agreement with our calculation. ^{22,54,59} Judging from the small lattice constant differences, the slight overestimate of the band gap is likely to originate from the choice of the HSE06 exchange correlation functional and the absence of SOC. For the quaternary compounds, experimental studies have reported the band gaps of Bi_2TaO_5F , Bi_2NbO_5F , and $Bi_2TiO_4F_2$ to be 2.86, 2.95, and ~3.06 eV, respectively. ^{34,36,41}

In addition to the band gap overestimation arising from the HSE06 functional, the smaller measured band gaps are likely to be influenced by point and extended defects. Both experimental and theoretical works reported that in $\rm Bi_2WO_6$, oxygen vacancies are easily formed and contribute to band gap narrowing. Si,60–62 Similar characteristics are expected for quaternary compounds. Because the experimental measurements of $\rm Bi_2TaO_5F$, $\rm Bi_2NbO_5F$, and $\rm Bi_2TiO_4F_2$ were performed for porous structures, abundance of defects are likely to be the reason for the smaller band gaps to be experimentally observed.

In each of the compounds studied, the upper valence band is mainly composed of the antibonding state of the O p orbitals with hybridization of the Bi s orbitals (-1.0 to 0.0 eV in Figure 2). The narrow bandwidth indicates the localized nature of these states. The density of states for Bi_2WO_6 is in good agreement with the previous studies. In the quaternary compounds, the F levels fall deeper into the valence band

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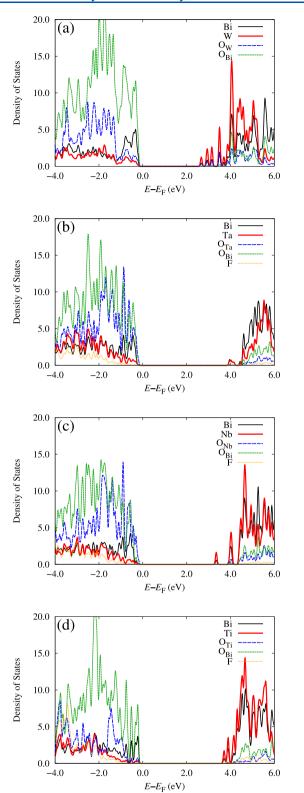


Figure 2. Electronic density of states projected for (a) Bi_2WO_6 , (b) Bi_2TaO_5F , (c) Bi_2NbO_5F , and (d) $Bi_2TiO_4F_2$. O_{Bi} , O_{W} , O_{Ta} , O_{Nb} , and O_{Ti} are oxygen atoms near Bi, W, Ta, Nb, and Ti, respectively.

(\sim -1.0 eV in Figure 2). This is in contrast in the case of PbBiO₂I, where the upper VB is mainly composed of I 5p levels. This energy level resulted in the oxidation of I to be favored over water, causing the ratio of I to decrease during oxidation reactions.¹³ Therefore, having F 2p deeper in the

valence band is a favorable property for avoiding photocatalyst degradation.

The lower conduction band of Bi_2WO_6 , Bi_2TaO_5F , Bi_2NbO_5F , and $Bi_2TiO_4F_2$ is mainly composed of the d^0 orbitals of the B-site cations, with small contribution from Bi 6p. The metal d-peaks have a large bandwidth, suggesting spatial delocalization. This has been reported in the previous study and likely to contribute to the faster electron transport. 61

Lattice Polarization. Bi₂WO₆ adopts a noncentrosymmetric crystal structure with results in macroscopic polarization. Within the Berry phase formalism, the polarization quanta along a was calculated to be 17.79–18.26 μ C/cm² (Table 1), which are smaller than the spontaneous polarization, making it necessary to include intermediate structures for reliable predictions. The change in polarization accompanied by the lattice distortion from the reference nonpolar structure to the polar $P2_1ab$ phase of Bi₂WO₆ is shown in Figure 3. The resulting spontaneous polarization was 61.55 μ C/cm². Similarly, the spontaneous polarization of quaternary compounds was calculated and is summarized in Table 1.

All of the quaternary compounds exhibit weaker polarization than $\mathrm{Bi}_2\mathrm{WO}_6$. As mentioned above, substitution of O by F in the perovskite-like $(\mathrm{BO}_4)^{2^-}$ layers results in a structural modification that includes a shift of the B-site cations closer to the center of their octahedra. Because the perovskite-like $(\mathrm{BO}_4)^{2^-}$ layer is largely responsible for the spontaneous polarization, this effect is the origin of the suppression. Three additional F configurations were calculated for each compounds; however, the values of the spontaneous polarization were consistently smaller than that of $\mathrm{Bi}_2\mathrm{WO}_6$.

Surfaces and Band Energies. Although analysis of the electronic structure through the bulk density of states can give us insight into the material properties, knowledge of the surface structures and band alignment is necessary to consider specific chemical reactions and device applications. Therefore, we searched for stable surface structures and analyzed the absolute band energies.

First, the chemical potentials meeting the stability condition of $\rm Bi_2WO_6$ were obtained. Formation of $\rm Bi_2WO_6$ was limited by the formation of $\rm WO_3$ and $\rm Bi_2O_3$. The possible range of $\Delta\mu_{\rm Bi}$ was -3.7 to 0 eV, the possible range of $\Delta\mu_{\rm W}$ was -9.7 to -1.5 eV, and the possible range of $\Delta\mu_{\rm O}$ was -2.4 to 0 eV, as shown in Figure 4a. This phase diagram is in good agreement with previous studies. ^{61,64}

It has been reported that $\mathrm{Bi}_2\mathrm{WO}_6$ exhibits heterogeneous growth with the a and b axes showing faster growth rate, resulting in a preference for the (001) surface. Therefore, five different (001) surfaces of $\mathrm{Bi}_2\mathrm{WO}_6$ were considered (Figure S5). The most stable surface for given chemical potentials was calculated and presented in Figure 4a. Within the stable region of $\mathrm{Bi}_2\mathrm{WO}_6$, Bi -O termination was dominant followed by Bi and W termination. The stability of Bi -O termination was also suggested in a previous computational study. Furthermore, monolayer $\mathrm{Bi}_2\mathrm{WO}_6$ was recently synthesized and suggested to exhibit Bi -O termination.

Employing the favored Bi–O terminations, the absolute electron energies were calculated and are shown in Figure 4b. The band alignment of $\rm Bi_2WO_6$ is consistent with the behavior of experimentally measured water oxidation reactions. The VBM of the quaternary compounds had similar levels (-6.98 to -6.93 eV). The higher VBMs of quaternary compounds compared to $\rm Bi_2WO_6$ suggest that the effect of F is to strengthen the hybridization between Bi s and O p compared

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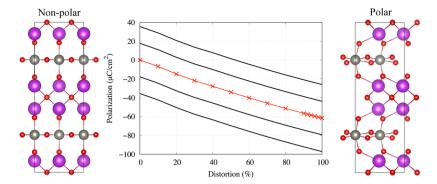
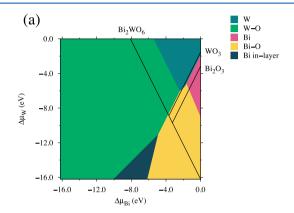


Figure 3. Change in electric polarization accompanied with the distortion of WO₆ octahedra from the reference nonpolar structure to $P2_1ab$ space group symmetry.



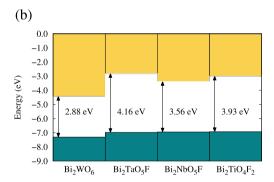


Figure 4. (a) Surface phase diagram drawn as a function of the chemical potentials of Bi and W. The stable area for Bi_2WO_6 is shown as an area surrounded by the black line labeled Bi_2WO_6 , WO_3 , and Bi_2O_3 . (b) Electronic band alignment for four compounds.

to Bi₂WO₆. In contrast, the CBM level differed largely in each compound. Together with the result of the electronic band structures (Figure 2), the absolute position of CBM is largely dependent on the B-site cation, which suggests tunability of CBM level with substitution of B-site cations.

CONCLUSIONS

In summary, first-principles calculations were performed to characterize Bi_2WO_6 , Bi_2TaO_5F , Bi_2NbO_5F , $Bi_2TiO_4F_2$, and $Bi_2SnO_4F_2$. Out of four quaternary oxides, $Bi_2SnO_4F_2$ was found to be unstable, while Bi_2TaO_5F , Bi_2NbO_5F , and $Bi_2TiO_4F_2$ were stable against the decomposition reactions. Substitution of O by F ions in quaternary oxides resulted in a less polar octahedra structure, resulting in a suppressed spontaneous electric polarization. The quaternary compounds exhibit higher VBM, while the conduction band minima

showed a large variation. This result suggests that the valence band can be raised by adding F and that the conduction band can be tuned by replacing the B-site cation. We demonstrated that substitution of cations and anions is effective to tune the atomic and electronic structures of Bi₂WO₆. The approach employed in this work is likely to contribute to understand other Bi-based mixed anion compounds.

ASSOCIATED CONTENT

S Supporting Information

The Supporting Information is available free of charge at https://pubs.acs.org/doi/10.1021/acs.jpcc.9b09806.

Phonon density of states, decomposition reaction enthalpies, and details of surface structures (PDF)

AUTHOR INFORMATION

Corresponding Authors

*E-mail: k.morita18@imperial.ac.uk (K.M.). *E-mail: a.walsh@imperial.ac.uk (A.W.).

ORCID ®

Kazuki Morita: 0000-0002-2558-6963 Ji-Sang Park: 0000-0002-1374-8793 Sunghyun Kim: 0000-0001-5072-6801 Aron Walsh: 0000-0001-5460-7033

Notes

The authors declare no competing financial interest.

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