High-Throughput Screening of Lead-Free Perovskite-like Materials for Optoelectronic Applications

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ABSTRACT: We use high-throughput density functional theory calculations to screen lead-free perovskite-like materials with compositions A\(_2\)BB’X\(_6\), ABX\(_4\), and A\(_3\)B\(_2\)X\(_9\) for optoelectronic performance. We screen monovalent A and B’ cations from Na, K, Rb, Cs, Cu, and Ag, trivalent B cations from Ga, In, and Sb, and monovalent anions from Cl, Br, and I. Our screening procedure is based on formation energy and hybrid HSE06 functional predicted bandgaps. We screened more than 480 compounds and found 10 compounds that have bandgaps in the 1.5–2.5 eV range. Of these 10 compounds, seven are new, not having been reported before. We further characterize effective masses, density of states, and absorption coefficients of these selected compounds for their suitability in optoelectronic applications. All 10 of these selected compounds are lead-free and are solution processable. These compounds pave a path forward for lead-free photovoltaics and light emission devices.

INTRODUCTION

Halide perovskites have attracted attention in recent years for their application in solar cells\(^1,2\) and light-emitting devices.\(^3,4\) The power conversion efficiency of perovskite-based solar cells is now becoming comparable to that of silicon photovoltaics.\(^5\) Perovskites with bandgaps spanning near-infrared to visible wavelengths have been utilized in efficient light-emitting diodes and lasers.\(^6\) Unfortunately, most of these high-performance perovskite materials are based on metals such as lead that are subject to environmental regulations.\(^7,8\)

Researchers have implemented a partial or full substitution of lead metal with tin or germanium in the perovskite structure. These modified materials, however, have resulted in inferior device performance due to the unstable +2 oxidation state of tin and germanium.\(^9,10\) Earlier predictions of new perovskite materials were based on the simple Goldschmidt tolerance factor to determine the stability of structure.\(^11\) Recently, Travis et al.\(^12\) showed that the Goldschmidt tolerance factor fails to predict the stability of 32 known inorganic iodide perovskites. Filip and Giustino\(^13\) and Korbel et al.\(^14\) performed high-throughput ab initio calculations on hypothetical three-dimensional halide perovskites (ABX\(_3\)) obtained by substitution of lead with other divalent cations from the periodic table. The authors considered hundreds of material combinations and concluded that only Pb, Sn, and Ge based perovskite show promising properties for optoelectronic applications.

Attempts have also been made to find perovskite-like structures via double perovskites, wherein two neighboring divalent lead cations are replaced by monovalent and trivalent ones.\(^15,16\) Many other sister materials (such as Cs\(_3\)Bi\(_2\)I\(_9\),\(^17\) AgBiI\(_4\),\(^18\) and Rb\(_2\)Sb\(_2\)I\(_9\))\(^19\) are already synthesized and have shown promising photovoltaic power conversion efficiencies. These sister perovskite structures offer a broader search space and have only been partially explored for visible bandgap applications.

In this work, we use density functional theory (DFT) to conduct high-throughput screening of perovskite-like structures for their potential performance in photovoltaic and light-emitting devices. We considered four different structure types and more than 480 different materials. We screened the materials based on their stability and bandgaps from HSE06 functional calculations. We identify multiple halide-based materials that can be solution processed and have bandgaps in the visible range.

COMPUTATIONAL DETAILS

We employ a Perdew–Burke–Ernzerhof generalized gradient approximation (GGA) exchange-correlation functional\(^20\) using the projected augmented wave pseudopotentials\(^21,22\) as implemented in the computational package VASP\(^23\) for all of our DFT calculations. Calculations are performed with planewave basis using a kinetic energy cutoff of 400 eV. For structural relaxation and formation energy calculations, the electronic wavevector grid is determined individually for each structure as 30/a, where a is the length of the lattice vector (in Å) in the concerned direction.\(^4\) The grid size is doubled for the calculation of bandgaps from DFT and HSE06 functional calculations.\(^24\) For HSE06 Hartree–Fock/DFT hybrid functional calculations, we evaluate the Hartree–Fock contribution at the Gamma point only by setting the NKRED flag in the VASP INCAR file. We also performed HSE06 calculations with a denser wavevector grid for the final list of materials and found...
no change in the electronic bandgap. We relaxed all structures until the changes in total energies are less than 0.1 meV/atom.

While HSE06 functional results in better agreement with experiments, compared to GGA, it still does not fully describe the many-body effects. These effects can be included using GW or BSE calculations but are not considered in this work due to their high computational cost.

We note that spin–orbit interactions are not included in this work. Among studied materials, these interactions can be significant in Sb compounds. We calculated the effect of spin–orbit coupling on our screened compounds and found changes in the GGA-predicted bandgaps to be less than 11% with the inclusion of spin–orbit interactions.

All the predictions are made using 0 K DFT relaxed structures and do not account for lattice expansion and temperature-induced phase changes due to high computational cost of entropic corrections. Such entropic corrections, however, are relatively small. Dispersion corrections are not expected to be minimal for inorganic compounds considered in this work.

We calculated the density of states and absorption spectrum using HSE06 hybrid functional. For band structure and effective masses, we used GGA DFT calculations. All of the reported effective masses are conductivity effective masses obtained as 

\[ m^* = \frac{3}{(1/m_1^* + 1/m_2^* + 1/m_3^*)}, \]

where \( m_1^* \), \( m_2^* \), and \( m_3^* \) are effective masses in the (001), (010), and (100) directions, respectively.

## SCREENING PROCEDURE

We present our screening procedure for identifying new materials in Figure S1. For a given structure type, we start by generating lattice structure and decorating lattice positions with anions and cations from the list of allowed species. We also generate a set of possible precursors, which a given material could decompose into, for the estimation of material stability. We calculate the electronic energies of the material and the precursors and use them to obtain the formation energy of the material relative to its precursors according to 

\[ \text{FE} = E_{\text{material}} - \sum E_{\text{precursor}}, \]

where \( E_{\text{material}} \) and \( E_{\text{precursor}} \) are the DFT predicted total energies of material and solid precursors. We note that even though this calculation of formation energy could result in false positives, it reliably eliminates all the negatives (i.e., unstable materials).

Having identified the subset of potentially stable materials, we calculate the bandgaps using a GGA functional and eliminate materials with gaps larger than 2.5 eV. Since GGA functional underpredicts the actual experimental bandgaps, we next perform HSE06 functional calculations on selected materials and screen whether they have a direct bandgap in a range between 1.5 and 2.5 eV. Upon successful identification of potentially stable materials with bandgaps in the desired regime, we further calculate their effective masses, density of states, and absorption coefficients.

## STRUCTURES

We start our search with literature investigation on solution processable materials. We find (nonexhaustive list) perovskite, double-perovskite, vacancy-ordered double perovskite, \( \beta \)-GaBr\(_2\)-type structures, and two-dimensional perovskite (and its polymorph) as potential lattice families. Of these, the perovskite family had been investigated in detail by Filip and Giustino and Korbel et al. using high-throughput calculations. Further, most of the literature reported compounds from vacancy-ordered double perovskite family are based on Sn metal, which, similar to lead, has environmental concerns. Therefore, we restricted our search to double perovskite, \( \beta \)-GaBr\(_2\)-type structures, and two-dimensional perovskite (and its polymorph) families.

The crystal structures of considered material families are presented in Figures 1a–d. These structures are discussed elsewhere. These families belong to space groups 87 (\( \text{I}4/\text{m}\)), 161 (\( \text{R}3\text{c} \)), 164 (\( \text{P}3\text{m}1\)), and 194 (\( \text{P}6_3/\text{mmc} \)) and have general chemical formulas \( \text{A}_2\text{BB}_3\text{X}_6\), \( \text{ABX}_4\), \( \text{A}_2\text{B}_2\text{X}_6\), and \( \text{A}_3\text{B}_2\text{X}_6\) respectively, where \( \text{A} \) and \( \text{B} \) are monovalent cations, \( \text{B}^3+ \) is a trivalent cation, and \( \text{X} \) is a monovalent anion. Note that structure types (c) and (d) are polymorphs and structures (a), (b), and (d) are commonly referred to as double, 2-D layered, and 0-D dimer perovskites, respectively. Structures (c) and (d) are polymorphs.

We considered 20, 36, 14, and 28 atom unit cells for structures (a), (b), (c), and (d), respectively, and restricted our search to pure phase materials only. Each of these structure types is composed of monovalent (\( \text{A}^1+, \text{B}^1+ \)) and trivalent (\( \text{B}^3+ \)) cations and monovalent anions (\( \text{X}^- \)). We performed prescreening of ions on the basis of toxicity, solution processability, and feasibility of their large scale use in photovoltaic devices. Further, we restricted ourselves to inorganic ions.

A quick scan of stable favorable oxidation states of elements in the periodic table suggests alkali and coinage metals for monovalent cations. Of these, Au is expensive metal and is in the periodic table suggests alkali and coinage metals for monovalent cations. Of these, Au is expensive metal and is in the periodic table suggests alkali and coinage metals for monovalent ion.

We calculated the density of states and absorption spectrum using HSE06 hybrid functional. For band structure and effective masses, we used GGA DFT calculations. All of the reported effective masses are conductivity effective masses obtained as 

\[ m^* = \frac{3}{(1/m_1^* + 1/m_2^* + 1/m_3^*)}, \]

where \( m_1^* \), \( m_2^* \), and \( m_3^* \) are effective masses in the (001), (010), and (100) directions, respectively.

Figure 1. Different perovskite-like structures considered in this study with space groups (a) 87 (\( \text{I}4/\text{m} \)), (b) 161 (\( \text{R}3\text{c} \)), (c) 164 (\( \text{P}3\text{m}1 \)), and (d) 194 (\( \text{P}6_3/\text{mmc} \)). Structures (a), (c), and (d) are commonly referred to as double, 2-D layered, and 0-D dimer perovskites, respectively. Structures (c) and (d) are polymorphs.
RESULTS AND DISCUSSION

The above-described four crystal structures, along with all possible combinations of atoms, result in more than 480 total pure phase materials (formation energies and bandgaps of all of these compounds are reported in Table S1). Of these, around 3/4 are not stable and decompose into one or more precursors. Among the remaining materials, GGA band structure calculations eliminate around half of the materials with bandgaps larger than 2.5 eV. Finally, out of the remaining 65 compounds, hybrid HSE06 functional calculations predict 10 compounds to have direct bandgaps in the range of 1.5–2.5 eV (listed in Table 1). We note that we found no material with bandgap less than 1.5 eV. We found 30 materials which have GGA-predicted bandgaps less than 2.5 eV and HSE06-predicted direct bandgap less than 2.5 eV and HSE06-predicted direct bandgap in the 2.5–3.5 eV range (see Supporting Information).

We find that with the exception of one compound, all copper based compounds resulted in a positive formation energy. For CuGa3Cl8 with space group 194 (P6/mmc), even though the formation energy is negative, its predicted bandgap from HSE06 is 3.98 eV.

We find that all of the compounds reported in Table 1 have bandgaps at the Γ-point (center) of the Brillouin zone. The smallest predicted bandgap is 1.72 eV for Cs2Ga2I9. We find five compounds with bandgaps between 2.0 and 2.2 eV and four compounds with bandgaps between 2.3 and 2.5 eV. We note that while some of these compounds (such as Rb3Sb2I9 and Cs3Sb2I9) have been studied before, most of these compounds are reported in Figure S2.

Our predicted bandgap for Cs2AgInCl6 is 2.42 eV from DFT and HSE06 hybrid functional calculations. We also calculate conductivity effective masses for these compounds and present the results for one compound from each space group in Figure 3 (total density of states for all compounds are reported in Figure S2).

We find that both B and X atoms contribute toward the valence band maximum (VBM) in Rb2AgInCl6. In the remaining three space group compounds, the VBM states are dominated by X atoms. For all space groups, the conduction band minimum (CBM) includes the contribution from both B and X atoms. Interestingly, the contribution of A atoms toward VBM and CBM is minimal in all compounds and practically does not affect the bandgap (Table 1). Larger organic A cations could potentially provide an additional degree of freedom for tuning the bandgap through changes in the cage bond angles, accommodating for the cation size.

We also calculated the energy-dependent dielectric constants and present the results for one compound from each space group type in Figure 4 (see Figure S3 for dielectric functions of all screened compounds). We report \( \sqrt{\varepsilon_r^* + \varepsilon_i^*} \) (which is directly related to the absorption coefficient of a material), where \( \varepsilon_r \) and \( \varepsilon_i \) are real and imaginary parts of the energy-dependent dielectric constant obtained under the independent

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Table 1. Potentially Stable Compounds with Bandgaps in the 1.5–2.5 eV Range

<table>
<thead>
<tr>
<th>compound</th>
<th>space group</th>
<th>formation energy (meV/atom)</th>
<th>( E_{\text{g}}^{\text{DFT}} ) (eV)</th>
<th>( E_{\text{g}}^{\text{HSE06}} ) (eV)</th>
<th>( m_h^* / m_e^* )</th>
</tr>
</thead>
<tbody>
<tr>
<td>Rb2AgInCl6</td>
<td>87 (14/m)</td>
<td>7</td>
<td>0.89</td>
<td>2.40</td>
<td>0.45/0.27</td>
</tr>
<tr>
<td>Cs2AgInCl6</td>
<td>87 (14/m)</td>
<td>9</td>
<td>0.93</td>
<td>2.42</td>
<td>0.50/0.28</td>
</tr>
<tr>
<td>RbSbI4</td>
<td>161 (R3c)</td>
<td>3</td>
<td>1.75</td>
<td>2.34</td>
<td>1.36/0.99</td>
</tr>
<tr>
<td>CsSbI4</td>
<td>161 (R3c)</td>
<td>5</td>
<td>1.77</td>
<td>2.34</td>
<td>1.45/0.62</td>
</tr>
<tr>
<td>K2SbI4</td>
<td>164 (P63m)</td>
<td>4</td>
<td>1.45</td>
<td>2.04</td>
<td>0.60/0.27</td>
</tr>
<tr>
<td>Rb2SbI4</td>
<td>164 (P63m)</td>
<td>42</td>
<td>1.49</td>
<td>2.07</td>
<td>0.64/0.28</td>
</tr>
<tr>
<td>Cs2SbI4</td>
<td>164 (P63m)</td>
<td>79</td>
<td>1.55</td>
<td>2.13</td>
<td>0.79/0.30</td>
</tr>
<tr>
<td>Rb2InI6</td>
<td>194 (P6/mmc)</td>
<td>42</td>
<td>1.07</td>
<td>2.05</td>
<td>0.88/0.56</td>
</tr>
<tr>
<td>Cs2InI6</td>
<td>194 (P6/mmc)</td>
<td>75</td>
<td>1.15</td>
<td>2.12</td>
<td>0.86/0.64</td>
</tr>
<tr>
<td>Cs2GaI6</td>
<td>194 (P6/mmc)</td>
<td>24</td>
<td>0.77</td>
<td>1.72</td>
<td>0.94/0.66</td>
</tr>
</tbody>
</table>

The stability of compounds is characterized by its formation energy with respect to binary precursors. \( E_{\text{g}}^{\text{DFT}} \) and \( E_{\text{g}}^{\text{HSE06}} \) represent bandgaps from DFT and HSE06 hybrid functional calculations. The conductivity effective masses for holes and electrons \( (m_h^*, m_e^*) \) are normalized by free electron mass \( (m_e) \) and are obtained from plain DFT band structures (see Figure S4 for band structures). We did not include nondispersive band in the calculation of conductivity effective mass for this compound.

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We find that due to a sparse density of conduction band edge states, the absorption coefficients are small in Rb₂AgInCl₆ and Rb₃In₂I₉. The absorption coefficients are highest for K₃Sb₂I₉, thereby suggesting stronger absorption in K₃Sb₂I₉ among considered compounds.

**CONCLUSIONS**

In summary, we used DFT calculations to screen materials from space groups 87 (I4/m), 161 (R3c), 164 (P3m1), and 194 (P6₃/mmc) for visible bandgap applications. We screen materials on the basis of their stability and hybrid HSE06 functional predicted bandgaps. We find 10 compounds which satisfy our screening criteria. The smallest bandgap in the visible range among studied compounds is predicted for Cs₃Ga₂I₉ (bandgap of 1.72 eV). We also present effective masses, density of states, and absorption coefficients for these screened compounds.

Our prediction of stable new materials with 1.5–2.5 eV bandgaps will help in advancing new materials research for optoelectronic devices. Efforts are currently in place to study bismuth structures and organic cation based and alloyed structures derived from the best structures obtained in this work.

**ASSOCIATED CONTENT**

^ Supporting Information

The Supporting Information is available free of charge on the ACS Publications website at DOI: 10.1021/acs.jpcc.7b02221.

Total density of states, dielectric functions, and bandgaps of screened compounds and formation energies and bandgaps of all compounds (PDF)

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**Notes**

The authors declare no competing financial interest.

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**ADDITIONAL NOTES**

^This correspond to wavevector grids of sizes 5 x 5 x 3, 2 x 2, 4 x 4 x 3, and 4 x 4 x 2 for space groups 87, 161, 164, and 194 with 20, 36, 14, and 28 atoms, respectively.

^Some of these compounds are found to have a slightly smaller indirect bandgap (E^ind - E^dir < 0.03, 0.09, 0.03, and 0.00 eV for space groups 87, 161, 164, and 194) but are treated as direct in this study.

^We find that ε_r and ε_i are direction dependent for some compounds, and we report only one direction for such compounds.

**REFERENCES**
