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Band gap and work function tailoring of SnO₂ for improved transparent conducting ability in photovoltaics

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Transparent conducting oxides (TCOs) are an essential component in modern optoelectronic devices, such as solar panels and touch screens. Their ability to combine transparency and conductivity, two properties that are normally mutually exclusive, have made them the subject of intense research over the last 50 years. SnO₂, doped with F or Sb, is a widely used and relatively inexpensive transparent conducting material, however, its electronic structure leaves scope for improving its properties for use in many TCO applications, especially in solar cell devices. Here we show using density functional theory that incorporation of Pb into SnO₂ reduces the band gap through lowering of the conduction band minimum, thereby increasing the electron affinity. The electron effective mass at the conduction band minimum decreases alongside the band gap, indicating improved charge carrier mobilities. Furthermore, the calculated optical absorption properties show the alloys retain their transparency in the visible spectrum. Our results suggest that alloying of PbO₂ with SnO₂ will enable improved electronic properties, including a highly tuneable workfunction, which will open up the material for other applications, such as hole injection layers in organic photovoltaics.

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Introduction

Transparent conducting oxides (TCOs) are a class of materials that simultaneously possess the conflicting properties of optical transparency and conductivity. First documented over half a century ago,¹ TCOs are now an essential component in modern optoelectronic devices, including flat panel displays, touch-screen sensors and solar cells.^{2–5} The industry standard n-type TCO is Sn-doped In₂O₃ (In₂O₃:Sn or ITO), which possesses excellent optical and electronic properties, with carrier densities exceeding 10²¹ cm^{−3}, resistivities below 10^{−5} Ω cm and high optical transparency in the visible spectrum.⁶ However, the low abundance of indium in the earth's crust together with massive demand for ITO has led to increasing concerns over indium supply.^{7,8} As such, the price of indium has fluctuated wildly in recent years and there are concerted efforts to eliminate its use in TCOs.^{9,10} Alternative materials such as ZnO:Al (AZO), SnO₂:Sb (ATO), and SnO₂:F (FTO) have been employed in a range of devices but have so far been unable to replicate the high performance seen in ITO.¹¹

There are several properties necessary for an n-type TCO to achieve optimal performance. The optical band gap, E_g^{opt} , must be greater than 3.1 eV to provide transparency in the visible spectrum. Additionally, conductivity is dependent on the ability of the material to form a degenerate semiconductor upon donor doping, termed the *dopability*. In excellent n-type TCOs, donors will donate electrons directly into the conduction band (CB), leading to filled states at the conduction band minimum (CBM) and Moss–Burstein widening of the optical band gap.^{12–14} The dopability is largely controlled by the position of the CBM relative to the vacuum level, *i.e.* the electron affinity (EA).^{15–18} A large EA indicates that it is easier to get charge carriers into the system, effectively increasing carrier concentrations. To guarantee transparency after doping, a large separation from the first to the second conduction band (CBM to CBM + 1) is necessary to prevent interband excitation of electrons. Finally, a highly disperse CB ensures a small carrier effective mass at the CBM. This generally arises from having a CB composed of metal-s-like orbitals allowing for high carrier mobilities.¹⁹

The TCO deposited in the largest quantity, with regard to area, is F or Sb doped SnO₂, for use in a variety of applications such as low-emissivity windows in buildings, electrochromic mirrors and defrosting windows in supermarkets.²⁰ Undoped SnO₂ is itself a prototypical TCO, with a large fundamental band gap of ~3.6 eV,²¹ up to 97% transparency in the visible spectrum and carrier densities approaching 10²¹ cm^{−3}.²² Importantly, as

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Sn is earth-abundant (~ 30 – 40 times more abundant than In in the Earth's crust²³), the raw materials needed for SnO_2 are less expensive than for ITO.²⁴ Manufacturing is also simplified due to the availability of chemical deposition methods, such as spray pyrolysis and atmospheric pressure chemical vapour deposition.^{25–28} Similar to other TCO materials, a debate exists as to whether intrinsic oxygen vacancies (V_O) and tin interstitials (Sn_i) play a role in conduction.^{29,30} The most recent studies, however, have indicated that they are deep donors or have restrictively high formation energies.^{31,32} Instead, hydrogen acting as an unintentional donor (H_i or H_O) has been identified both theoretically,^{31,33} and experimentally^{34,35} as a suitable defect to explain the conductivity seen in SnO_2 . Regardless, due to the propensity for native defects, hydrogen interstitials, and surface states to all be donor-like, King and Veal have argued that the charge neutrality level in n-type TCOs is likely to be above the CBM.³⁶ Thus, donor defect states remain energetically favourable even when the Fermi level appears inside the conduction band. In SnO_2 , due to the large gap between the Fermi level and the energy level of the first unoccupied states, any such defects do not cause vertical optical transitions in the visible range, enabling high carrier concentrations with little effect on transparency.²⁹

Comparison of the properties of In_2O_3 and SnO_2 reveals many similarities: both are direct wide band gap semiconductors, have a CBM + 1 greater than 3.1 eV above the CBM, and have highly dispersed conduction bands.³⁹ The EA of In_2O_3 , however, is significantly larger than that of SnO_2 and, in fact, of all other TCOs (Fig. 1).⁴⁰ With the fundamental materials physical limits being approached in known TCO materials,⁴¹ the road to higher performance must occur through concomitant increase in carrier mobilities and carrier densities.¹⁹ The large band gap of SnO_2 , ~ 0.5 eV greater than is needed for transparency, provides scope to lower the CBM relative to the vacuum level whilst simultaneously decreasing the electron effective mass.

Band gap modulation in semiconductors can be achieved in a number of ways, including chemical doping,⁴² strain engineering,⁴³ and inducing lattice disorder.^{44,45} Band gap engineering in In_2O_3 was recently demonstrated by alloying with

Ti_2O_3 .⁴⁶ As both compounds crystallise in the same structure, incorporation of Ti resulted in a monotonic decrease of the band gap without otherwise affecting the electronic structure. The desired properties of the material best suited for alloying with SnO_2 are therefore: (i) a smaller band gap, (ii) a highly dispersed conduction band, and (iii) a compound that crystallises in the rutile crystal structure.

Of the group 14 oxides, PbO_2 is isostructural and isoelectronic to SnO_2 and therefore likely to allow for efficient alloying. Furthermore, it was recently identified as a narrow band gap semiconductor, with a conduction band dominated by low-lying Pb s states due to relativistic effects.⁴⁷ The electronic structure of the conduction band of PbO_2 is nearly ideal for a TCO, with a low electron effective mass of $0.18m_\text{e}$ and a very large separation between the CBM and the CBM + 1. The fundamental band gap, however, is too small for transparency when undoped. Oxygen substoichiometry^{48,49} and possibly adventitious hydrogen^{50–52} cause the Fermi level to sit far above the CBM of PbO_2 , leading to high levels of conductivity. Furthermore, it has even been suggested that through tuning of the Fermi level position in the conduction band, PbO_2 could be transformed into a TCO itself.⁵³ Pb is also significantly more abundant and less expensive than Sn,⁵⁴ and as such PbO_2 was considered the ideal compound to incorporate into SnO_2 .

In this Article we propose incorporation of Pb as an efficient method of modulating the band gap of SnO_2 . Using hybrid density functional theory (DFT) we demonstrate that the fundamental band gap of $\text{Sn}_{1-x}\text{Pb}_x\text{O}_2$ ($0 \leq x \leq 0.125$) can be tuned from ~ 3.67 eV to 3.17 eV. The enthalpy of mixing is shown to be favourable at moderately high temperatures, suggesting the system can be achieved experimentally. Crucially, band gap modulation occurs primarily through lowering of the CBM relative to the vacuum level, thereby increasing the electron affinity. The ability to modulate the band gap – and consequently work function – has significant implications in the field of organic photovoltaics, in which the work function alignment of the cathode and hole injection layer is essential to form an Ohmic contact and increase the built-in potential of the interface.

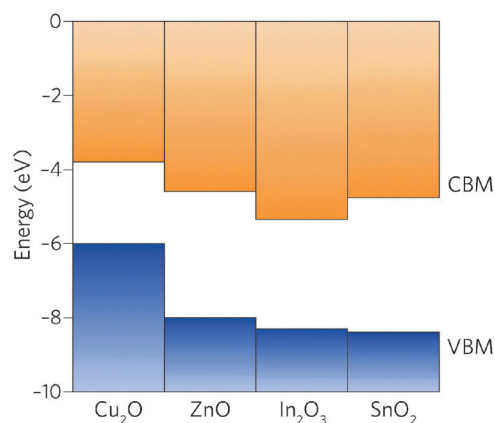


Fig. 1 Valence and conduction band offsets between Cu_2O , ZnO , In_2O_3 and SnO_2 taken from recent experiments³⁷ and calculations.^{32,38} The vacuum level is set to 0 eV.

Methodology

All our DFT calculations were performed using the Vienna *Ab initio* Simulation Package (VASP),^{55–58} with interactions between the core (Sn:[Kr], Pb:[Xe], and O:[He]) and valence electrons described using the Projector Augmented Wave method.⁵⁹ Two different functionals were employed: PBEsol,⁶⁰ a version of the Generalised Gradient Approximation (GGA) PBE⁶¹ functional revised for solids and PBE0, a hybrid density functional proposed by Adamo and Barone.⁶² In the PBE0 approach, 25% exact Hartree–Fock (HF) exchange is combined with 75% exchange and the correlation energies from PBE.⁶¹ PBEsol is known to accurately predict lattice constants for solid state systems, while PBE0 reproduces the band gap and electronic structure of SnO_2 seen in experiment.^{21,63,64} PBE0 also replicates the recently confirmed semiconductor nature of PbO_2 .⁴⁷



Both k -point sampling and the plane wave basis set were checked for convergence, with a cutoff of 450 eV and k -point grid of Γ -centred $4 \times 4 \times 6$, for the 6 atom unit cells of SnO_2 and PbO_2 , found to be sufficient. The structures were geometrically optimized and deemed to be converged when the forces on all the atoms totalled less than $10 \text{ meV } \text{\AA}^{-1}$. Optical absorption spectra were determined using the optical transition matrix elements calculated within the transversal approximation.⁶⁵ This approach sums the absorption spectra over all direct valence to conduction band transitions and, as such, does not account for indirect and intraband absorptions.⁶⁶ Supercell calculations, due to shrinking of the Brillouin zone, result in folded band structures that can be difficult to interpret. To prevent this, primitive cell representations of supercell band structures were obtained using the band unfolding code BandUp,^{67,68} based on the methodology described by Popescu and Zunger.⁶⁹ Electron effective masses at the band edges were calculated according to:

$$\frac{1}{m^*} = \frac{1}{\hbar} \frac{d^2 E}{dk^2} \quad (1)$$

where m^* is the effective mass, $\hbar$ is the reduced Planck constant, and $\frac{d^2 E}{dk^2}$ is the curvature of the band at the CBM.

In this work we investigate the thermodynamics of alloying and select the lowest energy alloy structures at particular compositions. Investigations into configuration effects in solid solutions are complicated by the large number of possible structures that can exist for a particular supercell. To avoid this problem we have followed the procedure implemented in the Site Occupancy Disorder (SOD) program developed by De Leeuw and co-workers.⁷⁰ Here, the complete configurational space for each supercell composition is generated, from which the subspace of symmetrically inequivalent configurations can be extracted. This method is able to reduce the computational complexity by several orders of magnitude, making previously prohibitive problems tractable. The process of calculating the configurational averages and entropies has been explained in more detail elsewhere in the literature,^{71,72} but is based on the assumption that a Boltzmann-like probability can predict the extent of occurrence of a particular configuration. This takes into account both the energy, E_m , of the configuration and its degeneracy, Ω_m , *i.e.* how many times the configuration appears in the complete configurational space:

$$\tilde{P}_m = \frac{1}{Z} \Omega_m \exp(-E_m/k_B T) = \frac{1}{Z} \exp(-\tilde{E}_m/k_B T) \quad (2)$$

where $m = 1, \dots, M$ (M is the number of inequivalent configurations) and k_B is Boltzmann's constant. From this, it can be shown that the average of any observable quantity at each composition, Q , can be estimated from the values of the quantity at each configuration, Q_m , as:

$$Q = \sum_{m=1}^M \tilde{P}_m Q_m \quad (3)$$

Finally, the configurational free energy, G , can be obtained directly from the partition function as:

$$G = -kT \ln Z \quad (4)$$

Results and discussion

SnO_2 and $\beta\text{-PbO}_2$ (mineral names, cassiterite and plattnerite) both crystallise in the rutile crystal structure, containing 6 atoms in a unit cell.⁷³ The cation is coordinated to six oxygen in a distorted octahedron (D_{4h} symmetry), with each oxygen coordinated to three cations by one short and two long bonds. The PBEsol calculated a and c lattice parameters for SnO_2 were $4.772 \text{ \AA}$ and $3.216 \text{ \AA}$ respectively. These are in close agreement (within 0.9%) with neutron diffraction experiments.^{74,75} In order to calculate the electronic properties of SnO_2 , the structure was relaxed using PBE0, after which the electronic structure was calculated, again using PBE0. The fundamental band gap of SnO_2 was found to be 3.67 eV . This is very similar to the experimentally observed fundamental band gap of 3.59 eV .^{76–78} We note that this experimental measurement has not been performed in the traditional way (*i.e.* the ionisation potential – electron affinity, measured, for instance using inverse photoemission spectroscopy) but instead has been measured using two-photon spectroscopy and factors in the known exciton binding energy in SnO_2 of 30 meV .^{79–81} The valence band maximum (VBM) and CBM both occur at the Γ point, resulting in a fundamental band gap that is direct. For PbO_2 the calculated lattice parameters were $4.994 \text{ \AA}$ and $3.416 \text{ \AA}$, for a and c respectively. These again closely matched experimental results (within 1.0%).^{82,83} The semiconductor nature of PbO_2 was reproduced in the PBE0 calculated direct band gap of 0.64 eV , which again was calculated from the PBE0-relaxed structure. However, due to large carrier concentrations and the relative lack of optical measurements in the literature, the exact magnitude of the experimental band gap.^{84,85}

To investigate the effects of alloying, we have considered the substitution of Sn by Pb in a $2 \times 2 \times 2$ (48 atom) supercell of SnO_2 containing 16 cation sites. Table 1 shows the total (N) and symmetrically inequivalent (M) number of configurations as a function of Pb concentration ($\text{Sn}_{16-n}\text{Pb}_n\text{O}_{32}$ where $n = 0, 1, 2, \dots, 16$). The equilibrium geometries and energies of all inequivalent configurations were calculated using PBEsol as described above. An analysis of the results reveals that, for each composition, the difference in energy between the most and least stable configurations is very small, at most 16 meV per atom. As such, a disordered alloy is more likely to form rather than an ordered solid solution.

To study the stability of the alloys against that of the individual components, the enthalpies and free energies of mixing were calculated as a function of composition, across a range of temperatures, as:

$$\Delta H_{\text{mix}} = E(\text{Sn}_{1-x}\text{Pb}_x\text{O}_2) - (1-x)E(\text{SnO}_2) - xE(\text{PbO}_2) \quad (5)$$

and

$$\Delta G_{\text{mix}} = G(\text{Sn}_{1-x}\text{Pb}_x\text{O}_2) - (1-x)E(\text{SnO}_2) - xE(\text{PbO}_2) \quad (6)$$



Table 1 Total number (N) of configurations with N_{Pb} substitutions and the number (M) of inequivalent configurations for $\text{Sn}_{1-x}\text{Pb}_x\text{O}_2$

N_{Pb}	x	N	M
0	0.000	1	1
1	0.062	16	1
2	0.125	120	6
3	0.188	560	13
4	0.250	1820	41
5	0.312	4368	65
6	0.375	8008	120
7	0.438	11 440	145
8	0.500	12 870	180
9	0.562	11 440	145
10	0.625	8008	120
11	0.688	4368	65
12	0.750	1820	41
13	0.812	560	13
14	0.875	120	6
15	0.938	16	1
16	1.000	1	1
Total		65 535	963

respectively, where $E(\text{Sn}_{1-x}\text{Pb}_x\text{O}_2)$ is the average energy calculated according to eqn (3) and $G(\text{Sn}_{1-x}\text{Pb}_x\text{O}_2)$ is the configuration free energy of the composition calculated *via* eqn (4).

Fig. 2a shows the results plotted as a function of composition. The enthalpy of mixing is small but positive, indicating that the mixing is a slightly exothermic process. The free energy of mixing turns negative at temperatures greater than 850 K (580 °C), for compositions where $x = 0.062$ and 0.125 , indicating that the structures formed will be thermodynamically stable. The lines corresponding to 850 K and 1050 K contain two minima, one at Sn-rich and another at Pb-rich compositions, highlighting that any intermediate compositions would separate into two phases if kinetically allowed.^{86,87} At higher temperatures this thermodynamic miscibility gap disappears due to increasing contribution from the entropic term.

The dependence of the calculated lattice parameters on composition is shown in Fig. 2b. Each point represents the average lattice constant across the entire configurational space for that composition, with the assumption of full disorder. This discounts any preference for ordering of the cations, however, as the difference in energy between configurations is small, the change in

the average lattice parameters will be negligible. The lattice constants of the alloy display a linear increase with increasing Pb concentration, as expected due to the increase in atomic radius from Sn to Pb, and following Vegard's law.⁸⁸

In order to find the optimum doping levels, the band gap trend of the alloys was investigated. To calculate the electronic properties of almost 1000 structures accurately would have been prohibitively resource intensive. Instead, the lowest energy configurations at each composition were geometrically relaxed using the PBE0 functional, after which the electronic structures were calculated, again using PBE0. Fig. 2c shows the band gaps of the lowest energy alloy structures at each composition. The alloy band gaps decrease monotonically with increasing Pb concentration, from 3.37 eV at $x = 0.062$ to 0.74 eV at $x = 0.938$. The decrease is not linear, indeed the band gap bowing parameter, defined from:

$$E_g(x) = (1 - x)E_g(\text{SnO}_2) + xE_g(\text{PbO}_2) - bx(1 - x) \quad (7)$$

shows a slight bowing of $b = 0.81$ eV, comparable with other ternary compounds.⁸⁹ This is in agreement with the band gap bowing parameter of 0.79 eV seen in experiment,⁹⁰ however, we note that whilst we provide the *fundamental* band gap bowing parameter, experimentally the *optical* band gap bowing parameter has been measured. The results predict a target region of ~6.25–12.5% Pb concentration, where the band gap is reduced but remains larger than the 3.1 eV needed to maintain transparency. As such, the lowest energy structures at these compositions ($x = 0.062$ and 0.125) were chosen for further analysis.

To see how alloying affects the band structure, we have calculated the “effective” primitive cell band structure using the PBE0 functional and BandUp code, as described above. Fig. 3 shows a comparison between the band structures of undoped SnO_2 and the two doping concentrations, where the direct band gap (Z to Γ to M) is shown. The alloys have maintained the ideal electronic structure needed for an efficient TCO, with the band gap reduction immediately obvious. Furthermore, the dispersion at the band edges remains excellent, indicating high carrier mobilities. The calculated electron effective mass at the CBM decreases with Pb concentration, from $0.27m_e$ to $0.26m_e$, for $\text{Sn}_{0.938}\text{Pb}_{0.062}\text{O}_2$ and $\text{Sn}_{0.875}\text{Pb}_{0.125}\text{O}_2$ respectively. This is an

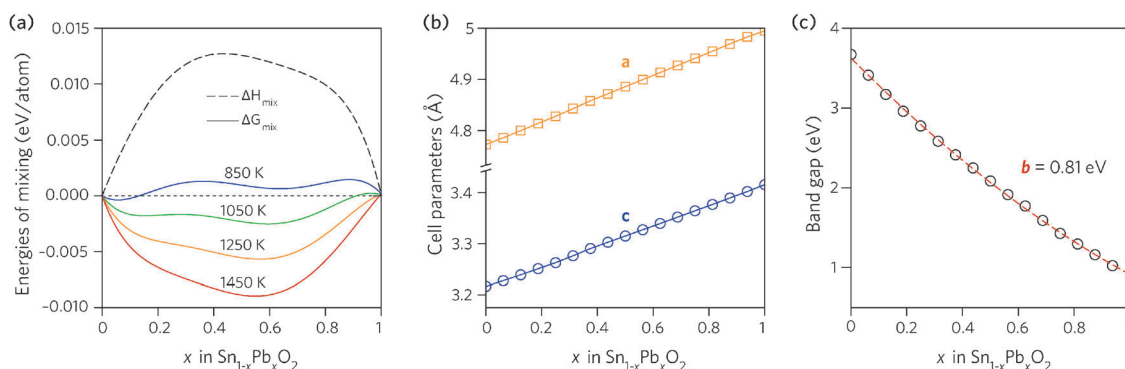


Fig. 2 Trends across the full composition space of $\text{Sn}_{1-x}\text{Pb}_x\text{O}_2$ for: (a) the enthalpy and free energy of mixing, (b) the unit cell lattice parameters, and (c) the direct fundamental band gaps (E_g^{dir}).



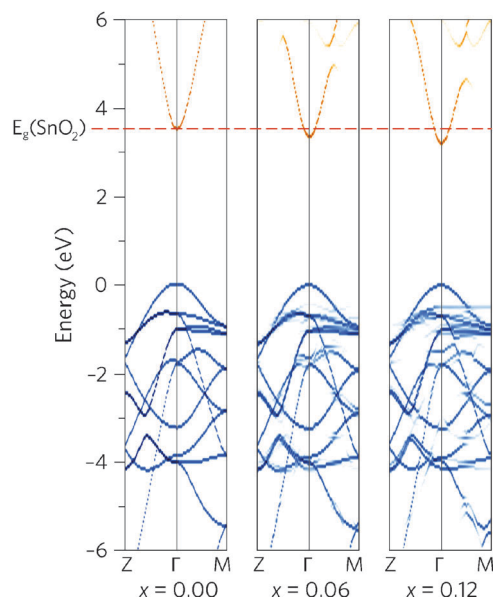


Fig. 3 The calculated effective band structure for $\text{Sn}_{1-x}\text{Pb}_x\text{O}_2$ where $x = 0.00, 0.06$, and 0.12 . The conduction bands are coloured orange whereas the valence bands are shown in blue, with the VBM is set to 0 eV in each case.

improvement on undoped SnO_2 , which has a calculated effective mass of $0.28m_e$, in excellent agreement with experiment ($0.29m_e$).⁹¹

A simple band alignment derived from an O 1s level is displayed in Fig. 4.^{92–95} Band alignments relative to the band positions of SnO_2 provide useful informational about the nature of the band gap changes.^{96–99} It is clear that the reduction in band gap occurs overwhelming through lowering of the CBM relative to the vacuum level, in the case of $\text{Sn}_{0.875}\text{Pb}_{0.125}\text{O}_2$ by 0.592, effectively increasing the EA. This is due to the relativistic contraction of the Pb 6s orbitals, which increases their stability and causes these states appear at lower energies relative to the vacuum level. This indicates that Pb doped SnO_2 should display an increased n-type dopability and, as such, could possess increased carrier concentrations when donor doped. Unexpectedly, the VBM also decreases slightly

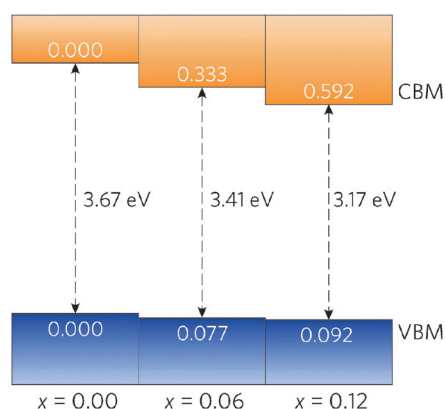


Fig. 4 Band alignment for $\text{Sn}_{1-x}\text{Pb}_x\text{O}_2$, where $x = 0.00, 0.06$, and 0.12 . All energies are given relative to a O 1s state.

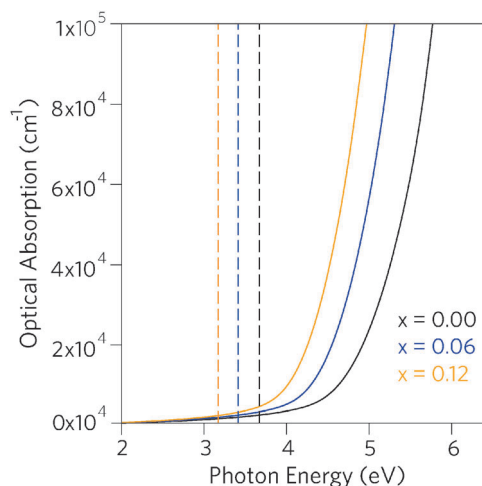


Fig. 5 Calculated optical absorption spectra for $\text{Sn}_{1-x}\text{Pb}_x\text{O}_2$ where $x = 0.00, 0.06$, and 0.12 . Full lines indicate optical absorption and dashed lines indicate fundamental band gap.

with increasing Pb concentration. Based on the increased Pb d-O 2p repulsion in PbO_2 relative to the Sn d-O 2p repulsion in SnO_2 , the VBM of the alloys would generally have been expected to rise. It is possible that this is an artefact of the simplified alignment model, however, the large modulation of the CBM is to be expected.

Having established that Pb incorporation decreases the fundamental band gap of SnO_2 , it is instructive to investigate the effects of the alloying on optical properties. As the inversion symmetry of the lattice results in disallowed transitions at the Γ point, the optical band gaps (E_g^{opt}) of SnO_2 and PbO_2 are considerably widened relative to the fundamental band gaps.^{47,79,81,100} The optical absorption spectra for SnO_2 , $\text{Sn}_{0.938}\text{Pb}_{0.062}\text{O}_2$ and $\text{Sn}_{0.875}\text{Pb}_{0.125}\text{O}_2$, calculated using PBE₀ from the frequency dependent dielectric matrix, are presented in Fig. 5. We can clearly see that incorporation of Pb does not affect the disallowed nature of the optical band gaps, as in all cases the optical band gaps are significantly larger than the fundamental band gaps, indicating that the $\text{Sn}_{1-x}\text{Pb}_x\text{O}_2$ alloys will retain high levels of optical transparency.

Conclusions

In this study we set out to tailor the band gap of SnO_2 in order to improve its performance as a transparent conducting oxide. Our approach was centred around reducing the band gap by decreasing the position of the conduction band minimum, thereby increasing the electron affinity and thus increasing the dopability.^{18,46} To be effective, the fundamental band gap of the improved SnO_2 material must be greater than 3.1 eV whilst no detrimental effects on the effective mass at the conduction band minimum should be seen, in the interest of retaining high electron mobilities.

Through alloying with isoelectronic and isostructural PbO_2 , we have demonstrated that the band gaps of $\text{Sn}_{1-x}\text{Pb}_x\text{O}_2$ alloys can be tuned from 3.67 eV to 0.64 eV with increasing Pb content,

arising from stabilization of the conduction band minimum relative to the vacuum level. We have found that $\text{Sn}_{0.875}\text{Pb}_{0.125}\text{O}_2$ displays a fundamental band gap that is just above 3.1 eV, possesses effective masses that are lower than for pure SnO_2 , and has an electron affinity 0.59 eV larger than SnO_2 . Furthermore, the optical transparency of this alloy remains extremely high. These properties should therefore, in principle, make $\text{SnO}_2\text{:Pb}$ a more efficient n-type transparent material and an ideal candidate for use in TCO applications.¹⁰¹

Additionally, as lowering of the conduction band minimum results in an increase in the work function (provided the Fermi level remains near to the band edges), these results demonstrate the possibility of a single generic system, in which the work function can be finely tuned over a wide range, based only on single parameter. This poses significant advantages for organic solar cells, which require efficient alignment between the work functions of the cathode and hole injection layer in order to produce an Ohmic contact and maximise device efficiency. As such, we stress the pressing need for experimental verification of these results.

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