

Optimising oxygen diffusion in non-cubic, non-dilute perovskite oxides based on BiFeO<sub>3</sub>†Cite this: *J. Mater. Chem. A*, 2019, 7, 25274Haiwu Zhang \* and Roger A. De Souza \*Received 15th August 2019  
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An ion-conducting crystal possessing non-cubic crystal symmetry and a non-dilute composition will in general display a multiplicity of different migration paths and different site energies for the mobile ions. Predicting the macroscopic rate of ion transport, and in particular, identifying substituent cations that optimise this rate, is therefore challenging. In this study, molecular dynamics simulations employing pair potentials were used to calculate the oxygen tracer diffusion coefficient ( $D_{\text{O}}^*$ ) as a function of temperature in various substituted systems based on the rhombohedral perovskite oxide bismuth ferrite, BiFeO<sub>3</sub>. Substituent cations that maximise (or minimise)  $D_{\text{O}}^*$  are identified. The results also reveal the limits of the standard crystal-chemical approach to maximising  $D_{\text{O}}^*$  by matching the size of the substituent cation to that of the host's. The implications for the use of BiFeO<sub>3</sub> as a high-performance oxide-ion conductor or as a multi-ferroic medium are discussed.

Despite their large ionic radius and their formal double charge, oxide ions can migrate at astonishing rates through certain close-packed oxide crystals. Indeed, the oxide-ion conductivity exhibited by various crystalline oxides (at  $T = 1000$  K) is comparable to the ionic conductivity of one-molar aqueous solutions (at  $T = 298$  K).<sup>1,2</sup>

One crystal structure that has attracted much interest in this regard is the ABO<sub>3</sub> perovskite structure. The route to achieving high oxide-ion conductivity in perovskite systems such as (Na,Bi)TiO<sub>3</sub>, LaGaO<sub>3</sub> or LaCoO<sub>3</sub> (ref. 3–5) has been to generate a high concentration of mobile charge carriers (*viz.* oxygen vacancies) by substituting one or both of the host's constituent cations with subvalent species. To date, the choice of subvalent species has been guided by an empirical, crystal-chemical rule: the substituent cation(s) should be close in size to the respective

host cation(s). The rationale behind this rule is that such size matching minimises the trapping of oxygen vacancies by the substituent cations.

It is becoming increasingly clear that this rationale, important though it is, is only part of the story of oxide-ion conduction in oxides.<sup>6</sup> Subvalent cations have been found not only to trap oxygen vacancies, but also to affect the activation barriers for vacancy migration.<sup>7</sup> Furthermore, with increasing vacancy concentration repulsive interactions between vacancies themselves become important. Consequently, the energy landscape through which the vacancies migrate is rather complex, and predicting the macroscopic conductivity of a substituted system is far from straightforward. This necessarily complicates the identification of optimal substituent cations.

A further complication arises in systems that exhibit distorted crystal structures. Many perovskite oxides, for example, do not adopt cubic symmetry at the temperatures of interest but rhombohedral or orthorhombic symmetry. The lowering of the symmetry away from cubic leads to a loss of symmetry equivalence: migration paths and/or crystallographic sites for oxide ions (oxygen vacancies) that are equivalent in the cubic structure are no longer equivalent in the distorted structure. The energy landscape thus becomes even more complex.

In this study, we use molecular dynamics (MD) simulations with empirical pair potentials to examine oxygen diffusion in a non-cubic, non-dilute perovskite. Some molecular static (MS) calculations are performed to illustrate particular points. Our principal aim is to identify the optimal substituents for oxygen diffusion in such a system, and in this way, to expose the limits of relying on size-matching arguments. We take bismuth ferrite (BiFeO<sub>3</sub>) as our model system, since it adopts rhombohedral symmetry both in experiment and in our MD simulations, and we substitute several percent of the host cations of perovskites with other cations, such that we are beyond the limit of a dilute solution (which is why we speak of substituents rather than dopants).

There is a second reason for studying oxide-ion transport in BiFeO<sub>3</sub>. It is a system for which oxide-ion transport should be maximised for certain applications and minimised for others.

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The use of BiFeO<sub>3</sub> as a cathode in a solid oxide fuel cell, for example, requires high rates of oxide-ion transport, in order to minimise electrochemical losses.<sup>8</sup> The use of BiFeO<sub>3</sub> in multi-ferroic devices, however, requires low rates in order to minimise the (ionic) leakage current.<sup>9</sup> Here, the choice of optimal substituent needs to be balanced against the ability to tune the ferroic properties. We examine, therefore, oxygen diffusion, and thus, the optimal substituents, in both positive and negative senses. We expect to gain deeper insights by looking at the whole story rather than at only half of it (*i.e.* only maximising the conductivity).

For both MD and MS simulations, the ions interacted with each other through long-range coulombic interactions and short-range interactions of the Buckingham form:

$$V_{ij} = \frac{Z_i Z_j e^2}{4\pi\epsilon_0 r} + A_{ij} \exp\left(-\frac{r_{ij}}{\rho_{ij}}\right) - \frac{C_{ij}}{r^6} \quad (1)$$

with  $A_{ij}$ ,  $\rho_{ij}$  and  $C_{ij}$  being empirical parameters and  $r_{ij}$ , the interatomic separation. For the MD simulations, all the ions were treated as rigid ions; for MS simulations, ionic polarizability was incorporated into the potential model.<sup>10</sup> The potential parameters are listed in S1 of ESI.†

MD simulations were performed with the LAMMPS code with periodic boundary conditions.<sup>11</sup> The simulation box consisted of  $12 \times 12 \times 15$  rhombohedral unit cells, giving a total of 21 600 ions. Oxygen vacancies were randomly introduced into the cell at a site fraction of 1%. The charge of these vacancies for 'pure' and isovalent cation substituted systems was compensated by lowering the charge of all Fe<sup>3+</sup> cations to Fe<sup>2.9398+</sup>. The site fraction of monovalent, divalent and trivalent cations was 3%, 6% and 6%, respectively. The systems were energy minimised in static calculations before the molecular dynamic simulations. At each temperature, the system was first equilibrated for 600 ps in the NpT ensemble followed by a data collection for 900 ps in the NVT ensemble, with the temperature being controlled by a Nose-Hoover thermostat.<sup>12</sup> Further details are given as ESI (S2†). MS simulations were performed with the Mott-Littleton method,<sup>13</sup> as implemented in the GULP code.<sup>14</sup> More details about the calculation of  $D_0^*$  and  $\Delta E_D$  can be found in our previous work.<sup>15</sup>

In order to emphasise the challenging nature of the problem and thus the need for MD simulations, we first examine the energy barriers for oxygen-vacancy migration in pure, rhombohedral BiFeO<sub>3</sub>. Although the rhombohedral structure has only a single crystallographic site for oxide ions, the distortion from the cubic form means that, rather than just one unique energy barrier, there are three. We used MS calculations to probe the relevant energy hypersurfaces in pure, rhombohedral BiFeO<sub>3</sub>. The resultant energy profiles are plotted in Fig. 1, and they yield activation energies of vacancy migration of 0.58, 0.60 and 0.81 eV, respectively. A simple question, then, is what is the effective activation energy for the long-range diffusion of oxygen? The value will be some weighted mean of the three individual barriers, depending, of course, on the relative values and on how the three paths are connected together in the structure. Determining the exact value requires, for instance, diffusion coefficients to be computed as a function of temperature, and one way of doing this



Fig. 1 Three distinct energy profiles for oxide-ion migration in pure, rhombohedral BiFeO<sub>3</sub>. Key: Bi (purple); Fe (silver); O (red). The traced trajectories reveal that the migrating ion follows a curved pathway through a triangular aperture defined by two A-site cations and one B-site cation, bowing away from the edge of the BO<sub>6</sub> octahedron, as observed previously.<sup>17</sup>

is MD simulations.<sup>16</sup> We have previously shown the benefits of using MD simulations to study quantitatively ion transport in other perovskites [SrTiO<sub>3</sub>, (Na,Bi)TiO<sub>3</sub> and CH<sub>3</sub>NH<sub>3</sub>PbI<sub>3</sub>].<sup>15</sup>

NB: upon substitution of the host's cations, the number of different energy barriers proliferates. There are now additional barriers for jumps around the substituent cation, as well as for jumps away from and towards the substituent cation—and the cation may influence barrier energies up to the third or even the fourth nearest-neighbour position. In addition, substituent cations will affect where the vacancies prefer to sit. MD simulations can capture all these features in a computationally efficient approach.

Let us start by using the standard size-matching rule to identify cations that should maximise the oxygen diffusivity. Examining ionic radii,<sup>12</sup> one sees that the acceptor cations closest in size to Bi<sup>3+</sup> (1.03 Å) are Na<sup>+</sup> (1.02 Å), followed by Ca<sup>2+</sup> (1.00 Å) and then Sr<sup>2+</sup> (1.18 Å); and that the cations closest to high-spin Fe<sup>3+</sup> (0.65 Å) are Ni<sup>2+</sup> (0.69 Å) and Mg<sup>2+</sup> (0.72 Å) (since ionic radii for twelve-fold coordination are not available for all the ions considered, we have used the values for six-fold coordination).<sup>18</sup> According to the standard arguments, one would thus have two expectations for these species: (E1) they should display the lowest binding energies to oxygen vacancies, and consequently, (E2) they should give rise to the highest rates of oxygen diffusion.

If one wants to achieve the opposite goal of minimising the oxygen diffusivity, one would try first to lower the concentration of oxygen vacancies, *e.g.*, through donor doping. If, however, the introduction of acceptor cations is unavoidable, as only they yield the required structural or ferroic properties, one would choose, with the crystal-chemical rule, cations with substantial mismatch, such as Ba<sup>2+</sup> (1.38 Å) or Rb<sup>+</sup> (1.52 Å) as A site substituents, or Mn<sup>2+</sup> (0.83 Å) as a B site substituent. As isovalent species, Gd<sup>3+</sup> (0.94 Å) for the A site or Lu<sup>3+</sup> (0.86 Å) for the B site are possibilities. These species would be expected to bind oxygen vacancies strongly, and hence, to diminish strongly the rate of oxygen diffusion.

Having identified these cations, with the standard rule, as possible substituents, we now use atomistic simulations to examine in turn the two expectations, E1 and E2. Thus, we determine first, using MS calculations, the binding energy of an oxygen vacancy to a substituent cation, at infinite dilution, in

rhombohedral BiFeO<sub>3</sub>. The binding energy ( $\Delta E_{\text{bind}}$ ) is calculated according to the (self-explanatory) expression

$$\Delta E_{\text{bind}} = \Delta E_{\text{associate}} - (\Delta E_{\text{isolated cation}} + \Delta E_{\text{isolated vacancy}}) \quad (2)$$

A negative value indicates that the associate is stable with respect to the component isolated defects. The results are plotted in Fig. 2a and b (for cations that prefer the Bi site or the Fe site, respectively; see Fig. S2†).

Fig. 2 shows that the first expectation is only partly fulfilled: Na<sup>+</sup>, Ca<sup>2+</sup> and Sr<sup>2+</sup> do indeed have small binding energies for oxygen vacancies,  $|\Delta E_{\text{bind}}| < 0.1$  eV, but  $\Delta E_{\text{bind}}$  decreases (from positive to negative, *i.e.*, from unbound to bound) in the order Sr<sup>2+</sup> > Na<sup>+</sup> > Ca<sup>2+</sup>, and not in the order of increasing mismatch. Furthermore, Ni<sup>2+</sup> and Mg<sup>2+</sup> have rather large binding energies,  $|\Delta E_{\text{bind}}| > 0.6$  eV, despite their relatively small mismatch. In the opposite case of trying to maximise the binding energy, Ba<sup>2+</sup> and Rb<sup>+</sup>, despite large degrees of mismatch, show relatively small binding energies. Mn<sup>2+</sup>, in contrast, shows an expected high binding energy, but curiously one that is comparable in magnitude to  $\Delta E_{\text{bind}}$  for Ni<sup>2+</sup> and Mg<sup>2+</sup>.

In general, one sees in Fig. 2a that the dependence on ionic radius gets stronger with increasing substituent cation charge. Trivalent species show the strongest dependence, whereas univalent cations show hardly any dependence. This is interesting because the trivalent species (Gd<sup>3+</sup>, Nd<sup>3+</sup>, Pr<sup>3+</sup> and La<sup>3+</sup>) are isoivalent with the host Bi<sup>3+</sup>, ruling out any electrostatic interactions with oxygen vacancies. Similar behaviour is also seen in Fig. 1b for trivalent cations (Al<sup>3+</sup>, Cr<sup>3+</sup>, Sc<sup>3+</sup>, In<sup>3+</sup> and Lu<sup>3+</sup>) substituting for the host Fe<sup>3+</sup>. Divalent cations on the B site show no discernible dependence on ionic radius.



Fig. 2 Binding energies of a cation substituent-oxygen vacancy associate as a function of ionic radius for cations that prefer (a) the Bi site and (b) the Fe site of rhombohedral BiFeO<sub>3</sub>.

On the basis of these results, one would expect the maximal oxygen diffusion coefficients to decrease in the order Sr<sup>2+</sup> > Na<sup>+</sup> > Ca<sup>2+</sup>  $\gg$  Ni<sup>2+</sup>, Mg<sup>2+</sup>. The minimal oxygen diffusion coefficients should decrease in the order Rb<sup>+</sup> > Ba<sup>2+</sup>  $\gg$  Lu<sup>3+</sup> > Gd<sup>3+</sup> > Mn<sup>2+</sup>. In order to examine this second expectation (E2) we use MD simulations to calculate the oxygen tracer diffusivity in the substituted, rhombohedral BiFeO<sub>3</sub> systems.

Although BiFeO<sub>3</sub> shows rhombohedral (*R3c*) symmetry at room temperature and transforms to an orthorhombic structure (*Pnma*) at the Curie temperature  $T_C = 1093$  K,<sup>19–21</sup> it remains in our simulations rhombohedral over the entire range of temperatures ( $1200 \geq T/K \geq 2400$ ). This inconsistency has, in fact, two benefits for us: all diffusion data obtained refer to one structure (rhombohedral BiFeO<sub>3</sub>), and these data can be extrapolated down to the lower temperatures of experiment. The MD simulations yield the mean-square-displacement of the oxide ions as a function of time. From such data, the tracer diffusion coefficient of oxygen ( $D_O^*$ ) can be extracted (see Fig. 3).

We first consider the diffusion data obtained for the ‘pure’ system, *i.e.* without any substituent species (the vacancies’ charge being compensated by lowering the charge of all Fe cations slightly). The effective activation energy of migration of  $\Delta E_{\text{mig}} = 0.58$  eV obtained from the MD simulations lies close to the two lowest barriers obtained from the MS calculations (see Fig. 1). It thus seems that the highest barrier (of 0.81 eV) is not traversed to a significant degree by the migrating oxide ions.



Fig. 3 Oxygen tracer diffusion coefficients ( $D_O^*$ ) for various substituted, rhombohedral BiFeO<sub>3</sub> compositions obtained from MD simulations against inverse temperature: (a) data for substituent cations that should maximise  $D_O^*$ ; (b) data for substituent cations that should minimise  $D_O^*$ .

We consider this 'pure' system to be equivalent to a system containing *ideal* acceptor cations: such cations only introduce oxygen vacancies but they do not bind them nor do they change their migration barriers. In comparison with this system, all substituted BiFeO<sub>3</sub> compositions show (Fig. 3) lower rates of oxygen diffusion and higher effective activation energies of diffusion. This is a very important result: it indicates that one cannot introduce vacancies into BiFeO<sub>3</sub> through cation substitution and not affect the vacancies' dynamics.

We transformed our tracer diffusion coefficients into oxide-ion conductivities using the Nernst–Einstein equation,  $\sigma_{\text{O}} = 4e^2 c_{\text{O}} D_{\text{O}}^* / (f^* k_{\text{B}} T)$ , with  $f^*$  as the tracer correlation coefficient.<sup>22</sup> Our computed conductivities are compared with data reported in the literature in Fig. S3.† In terms of activation enthalpies, we find for nominally undoped BiFeO<sub>3</sub> very good agreement between our data (0.58 eV) and the data of Jun *et al.*<sup>23</sup> (0.58 eV) and slightly worse agreement with the data from Chen *et al.* (0.5 eV).<sup>24</sup> For Ca-substituted BiFeO<sub>3</sub>, our simulations give 0.74 eV, while experimental data<sup>25</sup> yields 0.82 eV. For other data, the differences are much larger, but this can be attributed to either the complicated composition (the data from Wefring *et al.*<sup>26</sup> refer to a solid solution of BiFeO<sub>3</sub> with 10% (K<sub>0.5</sub>Bi<sub>0.5</sub>)TiO<sub>3</sub>); or to electronic conductivity (for Nb-substituted BiFeO<sub>3</sub>).<sup>23</sup>

Since our interest in oxide-ion transport stems from the possible application of BiFeO<sub>3</sub> as a fuel cell cathode or as a multiferroic medium, we extrapolate our MD data down to  $T = 1000$  K and to  $T = 300$  K, respectively, to reflect the appropriate operation temperatures. These data are shown in Fig. 4a and b, respectively; values of the effective activation energy of diffusion ( $\Delta E_{\text{D}}$ ) are plotted in Fig. 4c.

Let us first look in more detail at Fig. 4a, where the focus is on maximising  $D_{\text{O}}^*$  for SOFC application at  $T = 1000$  K. If we look at the data from the viewpoint of the standard size-mismatch rule, we see that, even though Na<sup>+</sup> has the smallest mismatch with Bi<sup>3+</sup>, the Na<sup>+</sup>-substituted material exhibits an oxygen tracer diffusivity at  $T = 1000$  K that is a factor of 5 lower than that of the Ca<sup>2+</sup>-substituted material and a factor of 10 lower than that of the Sr<sup>2+</sup>-substituted material. Furthermore, we see that substituting Ni<sup>2+</sup> or Mg<sup>2+</sup> for Fe<sup>3+</sup> reduces  $D_{\text{O}}^*$  drastically, despite the low mismatch. In contrast, examining the data from the viewpoint of the binding energies, we find that Sr<sup>2+</sup> is correctly identified as the best substituent, but Na<sup>+</sup> is predicted to be better than Ca<sup>2+</sup>; Ni<sup>2+</sup> and Mg<sup>2+</sup> are correctly identified as inferior substituents because they display high  $\Delta E_{\text{bind}}$ , but again, the order is incorrect.

These problems are due to the two premises of the binding-energy approach, that an oxygen vacancy can escape from the vicinity of the substituent cation and migrate freely through the crystal; and that the barriers for vacancy migration remain unaffected by the presence of substituent cations. Both these premises are invalid for the materials considered here: in a concentrated solid solution, the vacancies are never free; and the migration barriers are altered considerably by the substituent cations. If the approach were correct,  $\Delta E_{\text{D}}$  for the Sr<sup>2+</sup>-substituted material would simply be  $\Delta E_{\text{mig}}$  because the vacancies are not trapped by the substituent Sr<sup>2+</sup> cations (Fig. 2). The value obtained from the MD simulations is  $\Delta E_{\text{D}} = 0.74$  eV,



Fig. 4 Oxygen diffusion in substituted, rhombohedral BiFeO<sub>3</sub>: (a)  $D_{\text{O}}^*$  extrapolated to  $T = 1000$  K; (b)  $D_{\text{O}}^*$  extrapolated to  $T = 300$  K; (c) activation energy of diffusion. The dashed lines correspond to the values for pure BFO (Bi<sup>3+</sup> and Fe<sup>3+</sup> are also plotted for reference). Purple denotes substituents for the A site, whilst silver denotes substituents for the B site.

however, and substantially greater than  $\Delta E_{\text{mig}}$  (0.58 eV). The difference arises from the altered migration barriers and from the deviation from a dilute solution. Thus, Sr<sup>2+</sup> has been identified as the best substituent for the wrong reasons.

In Fig. 4b the emphasis is on minimising  $D_{\text{O}}^*$  at  $T = 300$  K for multiferroic applications. Compared to the pure material, the compositions with Mg<sup>2+</sup>, Ni<sup>2+</sup> or Mn<sup>2+</sup>, can slow down the diffusion of oxygen by over ten orders of magnitude. The most surprising behaviour is perhaps that of the Gd<sup>3+</sup>- and Lu<sup>3+</sup>-substituted systems. Their tracer diffusivities are only slightly diminished, despite the high degrees of size mismatch, or equivalently, despite the large negative binding energies to an oxygen vacancy. Also surprising is Rb<sup>+</sup> and Ba<sup>2+</sup>, in comparison with Na<sup>+</sup>, Sr<sup>2+</sup>, and Ca<sup>2+</sup>, having no strong effect on the tracer diffusivities. On the other hand, Mn<sup>2+</sup> behaves as expected, both from the large mismatch and from the large negative binding energy for oxygen vacancies.

## Conclusions

In summary, we have used MD simulations to identify those substituent cations that minimise or maximise the rate of oxygen

diffusion in a non-cubic, non-dilute perovskite. Through comparisons with the predictions of the crystal-chemical rule we conclude that the rule does identify possible candidate compositions: the maximal oxygen diffusion coefficients are expected to decrease in the order  $\text{Sr}^{2+} > \text{Na}^+ > \text{Ca}^{2+}$ . The minimal oxygen diffusion coefficients should decrease in the order  $\text{Rb}^+ > \text{Ba}^{2+} \gg \text{Ni}^{2+}, \text{Mn}^{2+} > \text{Mg}^{2+}$ . Nevertheless, the identified compositions have to be subjected to detailed (experimental or computational) transport studies. In addition, the crystal-chemical rule evidently works better for maximisation rather than minimisation, although if the rule is valid, there should be no difference. The danger in relying on this crystal-chemical rule (and thus implicitly on the binding-energy argument) is that the reverse may be employed, albeit incorrectly: one could attribute the superior diffusivity of  $(\text{Bi},\text{Sr})\text{FeO}_3$ , for example, to the low cation mismatch (with its low binding energy for vacancies), but this factor, as we have shown, plays no role in determining the oxygen diffusivity.

## Conflicts of interest

There are no conflicts of interest to declare.

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