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# Native Defects and their Doping Response in the Lithium Solid Electrolyte Li<sub>7</sub>La<sub>3</sub>Zr<sub>2</sub>O<sub>12</sub>

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#### Abstract

The Li-stuffed garnets  $\text{Li}_x M_2 M'_3 O_{12}$  are promising Li-ion solid electrolytes with potential use in solid-state batteries. One strategy for optimising ionic conductivities in these materials is to tune lithium stoichiometries through aliovalent doping, which is often assumed to produce proportionate numbers of charge-compensating Li vacancies. The native defect chemistry of the Li-stuffed garnets, and their response to doping, however, are not well understood, and it is unknown to what degree a simple vacancycompensation model is valid. Here, we report hybrid density-functional-theory calculations of a broad range of native defects in the prototypical Li-garnet Li<sub>7</sub>La<sub>3</sub>Zr<sub>2</sub>O<sub>12</sub>. We calculate equilibrium defect concentrations as a function of synthesis conditions, and model the response of these defect populations to extrinsic doping. We predict a rich defect chemistry that includes Li and O vacancies and interstitials, and significant numbers of cation-antisite defects. Under reducing conditions, O vacancies act as colour-centres by trapping electrons. We find that supervalent (donor) doping does not produce charge compensating Li vacancies under all synthesis conditions; under Li-rich / Zr-poor conditions the dominant compensating defects are  $Li_{Zr}$  antisites, and Li stoichiometries strongly deviate from those predicted by simple "vacancy compensation" models.

## Introduction

A global transition to low-carbon primary energy sources, such as solar and wind, requires complementary advances in effective secondary–energy-storage technologies. Lithium-ion batteries are a hugely successful energy-storage technology, but the performance of commercial batteries is limited by the use of conventional liquid electrolytes. These contain flammable organic solvents with narrow electrochemical stability windows, which presents a safety risk and precludes the use of energy-dense high-voltage electrodes.<sup>1</sup> One proposal to address these issues is to replace conventional liquid electrolytes with electrochemically stable, non-flammable ceramics, to allow the development of all-solid-state batteries with higher energy densities and improved safety characteristics.<sup>2–7</sup> An ideal lithium-ion solid electrolyte should have a wide electrochemical stability window, a negligible electronic conductivity, and a high ionic conductivity.<sup>8</sup> While a number of families of promising solid lithium-ion conductors are known,<sup>2</sup> it is generally unknown to what extent these target properties, such as high ionic conductivities, can be achieved by chemical tuning: for example, by doping with chemical substituents or by varying synthesis conditions.

One promising family of solid lithium-ion electrolytes are the lithium-stuffed garnets,  $\text{Li}_x M_3 M'_2 \text{O}_{12}$ .<sup>3,9</sup> These materials have ionic conductivities reportedly as high as  $\sim 1 \times 10^{-3} \text{ S/cm}^{10}$  and wide electrochemical stability windows,<sup>11</sup> allowing their incorporation in battery systems.<sup>12–15</sup> By varying the cations M and M', many different compositions can be synthesised, with a broad range of ionic conductivities.<sup>3</sup> Identifying chemical compositions with optimal conductivities, however, remains a challenge, and requires understanding both lattice-cation substitution and lithium stoichiometry, and how these compositional parameters together affect lithium transport.<sup>16–21</sup>

One strategy for optimising the ionic conductivity of the lithium-conducting garnets is aliovalent doping, which is often assumed to allow control of lithium stoichiometry through the formation of charge-compensating lithium defects.<sup>22</sup> Aliovalent doping of garnets gained interest following the inadvertent Al-doping of  $\text{Li}_7\text{La}_3\text{Zr}_2O_{12}$  (LLZO), which produced a dramatic increase in room-temperature ionic conductivity by stabilising the highly conducting cubic phase<sup>23,24</sup>—normally only observed at temperatures above 600 K for stoichiometric LLZO—with respect to the poorly conducting tetragonal phase.<sup>25,26</sup> This effect was explained by aluminium substituting for lithium,<sup>27</sup> causing charge-compensating lithium vacancies to form, with this change in lithium stoichiometry stabilising the cubic phase.<sup>19,28</sup> Subsequent efforts to optimise the ionic conductivity of doped LLZO have seen a number of supervalent (donor) dopants proposed.<sup>29</sup> These include other small cations, such as gallium, that directly substitute lithium;<sup>30–32</sup> larger cations, such as tantalum or niobium, that substitute zirconium or lanthanum on the M or M' sites;<sup>10</sup> and donor anions, such as fluorine, that substitute oxygen.<sup>33</sup>

Donor doping is usually assumed to affect lithium stoichiometry by causing the formation of charge-compenstating lithium vacancies, e.g. for a trivalent cation such as Al<sup>3+</sup> substituting for monovalent Li<sup>+</sup>, charge neutrality considerations suggest that<sup>31,32</sup>

$$[\mathrm{Al}_{\mathrm{Li}}^{\bullet\bullet}] = 2[V_{\mathrm{Li}}'] \tag{1}$$

(using Kröger-Vink notation, where  $A_B^q$  represents species A at site B, with relative charge

q).<sup>34</sup> Although this direct-charge-compensation model has an attractive conceptual simplicity, it ignores other defect species that may form under specific synthesis conditions or in response to doping. A number of studies have suggested that oxygen vacancies may play a significant role in the defect chemistry of LLZO,<sup>18,35-37</sup> and Kubicek *et al.* have confirmed the presence of oxygen vacancies in a range of nominal "LLZO" compositions, using isotopeexchange techniques, with estimated O-vacancy concentrations as high as 2.5%.<sup>36</sup> Because oxygen vacancies can act as electronic donors, their presence has been proposed to affect lithium stoichiometries through a charge-compensating "Schottky pair" mechanism:

$$2\mathrm{Li}_{\mathrm{Li}}^{\times} + \mathrm{O}_{\mathrm{O}}^{\times} \rightleftharpoons 2V_{\mathrm{Li}}' + V_{\mathrm{O}}^{\bullet\bullet}.$$
 (2)

This defect equilibrium suggests that synthesis conditions that promote oxygen vacancy formation; e.g. high temperatures or low oxygen–partial-pressures; may produce samples with reduced lithium stoichiometries. Furthermore, the appearance of  $V'_{\rm Li}$  in both Eqns. 1 and 2 raises the possibility of coupling between the intrinsic defect chemistry of lithium-stuffed garnets and their response to donor doping.<sup>38</sup>

The example above considers only three defect species, yet illustrates the difficulty in using simple charge-compensation models to understand how defect concentrations are related. In practice, other native defects may also be present in significant numbers, and these should also be included in any thermodynamic model of defect populations. In materials such as LLZO, cationic lattice defects, such as La and Zr vacancies, are often assumed to be negligible;<sup>37</sup> but this is not *a priori* guaranteed under all synthesis conditions. In addition, simple defect–charge-compensation models usually assume defects exist in only one formal charge state—e.g. -1 for Li vacancies, or +2 for O vacancies—<sup>39</sup> when in reality defects may adopt a range of charge states as a function of Fermi energy.<sup>40–43</sup> A more complete thermodynamic defect model should therefore consider a broad range of native defects in all accessible charge states. The defect chemistry and doping response are now not described

by a single defect–charge-compensation equation, such as Eqns. 1 or 2, but instead by a set of equations that describe the defect populations, to be solved self-consistently under the constraint of thermodynamic equilibrium.<sup>40,44–46</sup>

To better understand the native defect chemistry and doping response of lithium-garnet solid-electrolytes, we have performed a computational study of a broad range of defects in the prototypical system LLZO. We have used hybrid density functional theory (DFT) to calculate formation energies for a range of intrinsic defects, including lithium and oxygen vacancies and interstitials, lanthanum and zirconium vacancies, and cation anti-sites. These defect formation energies are used to construct a self-consistent thermodynamic model of defect concentrations as a function of synthesis conditions. We find a rich defect chemistry that includes not just lithium and oxygen defects, but also significant numbers of cationantisite defects. Oxygen vacancies exhibit 0, +1, and +2 charge states, and under reducing conditions act as colour-centres by trapping electrons. We have also modelled the response to supervalent (donor) doping, and find that lithium vacancies are not the dominant compensating acceptor defects under all synthesis conditions; under Li-rich / Zr-poor conditions donor doping is primarily compensated by  $Li_{Zr}$  antisites, and lithium stoichiometries can strongly deviate from the values predicted by the simple "vacancy compensation" model (Eqn. 1).

## Methods

At thermodynamic equilibrium, the concentration of a defect X in charge-state q is given by

$$[X^q] = N_X g_{X,q} \exp\left(\frac{-\Delta E_{\rm f}^{X^q}}{{\rm k}T}\right),\tag{3}$$

where  $N_X$  is the density of sites available to form X,  $g_{X,q}$  is the degeneracy of the defect state (e.g. spin degeneracy), k is the Boltzmann constant, and T is the temperature.  $\Delta E_{\rm f}^{X^q}$  is the free energy of formation of defect X in charge-state q. For defects with  $q \neq 0$ , the formation energy depends on the Fermi energy, i.e. the electron chemical potential. Because the energy to add or remove electrons depends on the defects present, calculating equilibrium defect concentrations consists of finding a self-consistent solution to Eqn. 3 for all defect species, under the constraint of overall charge neutrality. The net charge density at a given Fermi energy,  $\rho(E_{\rm F})$ , is given by a sum over all charged defects, plus contributions from electrons and holes occupying conduction and valence bands respectively:

$$\rho(E_{\rm F}) = \sum_{X^q} q[X^q] + p_0 - n_0.$$
(4)

Electron and hole concentrations  $(n_0 \text{ and } p_0 \text{ respectively})$  are given by

$$n_0 = \int_0^\infty \frac{1}{e^{(E - E_F)/kT} + 1} g(E) \, dE,$$
(5)

$$p_0 = \int_0^\infty 1 - \frac{1}{\mathrm{e}^{(E-E_{\rm F})/\mathrm{k}T} + 1} g(E) \,\mathrm{d}E,\tag{6}$$

where g(E) is the density of states (DOS) for the system under consideration.

Thermodynamic defect concentrations under *extrinsic* doping can be calculated by including fixed concentrations of each dopant species and similarly solving to find the Fermi energy that gives overall charge neutrality. Introducing an aliovalent dopant adds, or removes, electrons from the system, depending on the effective relative charge of the resulting defect. For the case of a dopant defect M, with relative charge r and fixed concentration  $[M^r]$ , the net charge density,  $\rho$ , is given by

$$\rho(E_{\rm F}, r[M^r]) = \sum_{X^q} q[X^q] + p_0 - n_0 + r[M^r].$$
(7)

To restore charge neutrality, the native defect concentrations necessarily change from those in the undoped system. This doping response does not depend explicitly on the dopant species and insertion site, but only on the product  $r[M^r]$ . The response predicted for an effective +2 dopant, e.g.  $Al_{Li}^{\bullet\bullet}$ , is therefore equivalent to that for an effective +1 dopant, e.g.  $Ta_{Zr}^{\bullet}$  or  $F_{O}^{\bullet}$ , with a concentration scaling of  $\times 2$ .

This approach assumes that direct defect-dopant interactions are negligible when compared to the response to the Fermi-level shift arising from aliovalent doping. There is some evidence for explicit dopant-defect interactions in LLZO that vary with the identity of the dopant species. Molecular dynamics simulations by Mottet *et al.* have revealed changes in the average distribution of Li ions at sites adjacent to  $Mo_{2r}^{\bullet}$  dopants,<sup>21</sup> while DFT calculations by Rettenwander *et al.* have predicted that introducing Al<sup>3+</sup> versus Ga<sup>3+</sup> at tetrahedral lithium sites increases the site-occupation energy for Li at the nearest tetrahedral sites by 2 meV and 12 meV respectively. Daza *et al.* performed simulations of Al- and Ga-doped LLZO at low temperature (233 K) and observed distinct differences in Li distributions for Al- versus Ga-doping,<sup>47</sup> although this effect decreased at higher temperature (313 K). While these effects are potentially significant when considering Li diffusion behaviour in doped systems at typical operating temperatures, under high-temperature synthesis conditions we expect direct dopant-defect interactions to only have a small effect on equilibrium defect populations in as-formed garnets.

We have calculated defect formation energies using periodic hybrid density-functionaltheory (DFT), within the Zhang and Northrup formalism,<sup>40</sup> where the formation energy of defect X in charge state q is given by

$$\Delta E_{\rm f}^{X^q} = E_{\rm tot}^{X^q} - E_{\rm tot}^{\rm bulk} - \sum_i n_i (\mu_i + \Delta \mu_i)$$
$$+ q(E_{\rm F} + E_{\rm vbm} + \Delta V_{\rm pot}) + E_{\rm corr}^q.$$
(8)

 $E_{\text{tot}}^{X^q}$  is the total energy of the defective supercell in charge state q, and  $E_{\text{tot}}^{\text{bulk}}$  is the total energy of the host supercell.  $\Delta \mu_i$  are chemical potentials of neutral atomic species i that are added to  $(n_i > 0)$  or removed from  $(n_i < 0)$  the supercell when forming each defect, and  $\mu_i$ is the elemental reference energy, calculated for each element in its standard state.  $E_{\text{F}}$  is the Fermi energy (electron chemical potential) relative to the valence-band maximum (VBM), and accounts for electrons added to (q < 0) or removed from (q > 0) the supercell.  $E_{\rm vbm}$ is the DFT-calculated energy of the valence-band maximum of the host system.  $\Delta V_{\rm pot}$  is a potential alignment term to account for differences in background electrostatic potentials between the host and defective supercells, which we calculate as a difference in spatially averaged electrostatic potentials.  $E_{\rm corr}^q$  is a correction term accounting for the finite size of the supercell, arising from the electrostatic interaction between defects and their periodic images. For this study, we have used the correction scheme of Lany and Zunger,<sup>48</sup> adapted for anisotropic systems by Murphy and Hine.<sup>49</sup>

For our defect calculations, we have considered lithium vacancies and interstitials,  $V_{\rm Li}$ and Li<sub>i</sub>; oxygen vacancies and interstitials,  $V_{\rm O}$  and O<sub>i</sub>; lanthanum and zirconium vacancies,  $V_{\rm La}$  and  $V_{\rm Zr}$ ; zirconium interstitials. Zr<sub>i</sub>; and a range of cation anti-sites: La<sub>Zr</sub>, Zr<sub>Li</sub><sup>oct</sup>, Zr<sub>Li</sub><sup>tet</sup>, Zr<sub>La</sub>, Li<sub>La</sub>, La<sub>Li</sub><sup>oct</sup> and Li<sub>Zr</sub>. A superscript oct or tet denotes a defect located at an octahedral or tetrahedral Li site, respectively. Preliminary calculations using the PBEsol functional<sup>50</sup> gave a difference in formation energy for  $V_{\rm Li}^{\rm oct}$  and  $V_{\rm Li}^{\rm tet}$  of <0.05 eV, and we therefore considered these Li vacancies to be energetically equivalent for our subsequent HSE06 calculations. Structural relaxations for all defects were calculated with cell parameters fixed to the optimised values for stoichiometric LLZO.

Defect formation energies depend on the chemical potentials of the atomic species added to or removed from the system when forming the defect (Eqn. 8). To restrict the available chemical potential space to values that are, in principle, experimentally accessible, we consider only chemical potentials for which LLZO is thermodynamically stable with respect to competing phases. We have considered the set of competing phases identified by Canepa *et* al.<sup>51</sup> (see the SI, section S2), and have calculated the thermodynamic stability regime using the code CPLAP.<sup>52</sup>

Density functional theory (DFT) calculations were performed using the plane-wave code VASP,<sup>53–56</sup> with valence electrons described by a plane-wave basis set with a cutoff of 520 eV. Interactions between core and valence electrons were described using the projector-

augmented wave (PAW) method,<sup>57</sup> with cores of [H] for Li, [Xe] for La, [Kr] for Zr and [He] for O. Optimised lattice parameters for LLZO, competing phases, and elemental references were obtained by performing a series of constant-volume geometry optimisation calculations, and fitting the resulting energy–volume data to the Murnaghan equation of state.<sup>58</sup>

All calculations used the screened hybrid functional HSE06.<sup>59</sup> HSE06 gives optimised lattice parameters for tetragonal LLZO (a, b = 13.00 Å, c = 12.50 Å,  $\alpha = 90^{\circ}$ ) that are in good agreement with experimental values (a, b = 13.13 Å, c = 12.66 Å,  $\alpha = 90^{\circ}$ ).<sup>60,61</sup> The HSE06 calculated band gap of 5.9 eV is also in good agreement with experimental values of ~ 6.0 eV.<sup>11</sup> HSE06 has also been shown to give accurate descriptions of defects in a range of oxides,<sup>62–65</sup> in contrast to standard GGA functionals, which often give qualitatively incorrect descriptions of defect states in wide-gap oxides<sup>66–68</sup> (the specific example of the  $V_{\rm Li}^{\times}$  defect in LLZO is discussed in more detail in section S1 of the SI).

All calculations of LLZO were performed on the 96 atom primitive cell of the lowtemperature tetragonal phase. Although donor-doped LLZO typically adopts a cubic lattice geometry, the tetragonal—cubic transition is associated with onset of lithium disorder,<sup>28</sup> making defect formation energies poorly defined within the formalism of Eqn. 8.<sup>69</sup> k-point sampling was selected to ensure energies converged to <1 meV/atom: all LLZO calculations used a  $2 \times 2 \times 2$  Monkhorst-Pack k-point mesh. k-point sampling for competing phases and elemental reference calculations is described in the supporting dataset.<sup>70</sup>

A dataset containing inputs and outputs for all DFT calculations supporting this study is available under the CC-BY-4.0 licence from the University of Bath Research Data Archive.<sup>70</sup> Python codes for calculating defect formation energies and defect concentrations as functions of elemental chemical potentials, and Jupyter notebooks used to generate Figs. 1, 2, 4, 5, and 6 are available under the MIT licence.<sup>71</sup> Our analysis codes use the MATPLOTLIB,<sup>72</sup> NUMPY,<sup>73</sup> PANDAS,<sup>74</sup> PYMATGEN,<sup>75</sup> SCIPY,<sup>76</sup> TQDM,<sup>77</sup> and VASPPY<sup>78</sup> Python packages, and SC-FERMI and FROZEN SC-FERMI<sup>45,46</sup> for calculating self-consistent defect concentrations.

## Results

#### Intrinsic Defect Chemistry

The predicted region of thermodynamic stability of LLZO spans a range of values that can be broadly characterised along an oxygen-rich/metal-poor to oxygen-poor/metal-rich axis (full details are given in section S2 of the SI). Fig. 1 shows calculated defect concentrations at three illustrative sets of chemical potentials, spanning from oxygen-rich/metal-poor to oxygen-poor/metal-rich conditions. In each case, we also show a defect transition-level diagram (bottom panels), which shows defect formation energies as a function of Fermi energy, and the self-consistent Fermi energy. Defect concentrations are calculated at a representative synthesis temperature of 1500 K.<sup>3</sup> We assume that defect populations at synthesis are "frozen in" when the system is cooled to operating temperatures. This is justified on the grounds that, with the exception of the lithium interstitials and vacancies, kinetic barriers for defect reorganisation are large, preventing the system from re-equilibrating at low temperatures. Lithium ions are mobile at operating temperatures, and we can therefore expect some "recombination" of lithium interstitials and vacancies, reducing the populations of these defects. Unless Li can exchange with an external source, however, the net lithium stoichiometry, and the equilibrium Fermi energy, are both fixed at their high temperature values.

At each set of chemical potential conditions we predict high concentrations of a broad range of defects, including lithium vacancies and interstitials, oxygen vacancies and interstitials, and a range of cation-antisites. Under O-rich conditions the defects with the highest concentrations are  $V_{\rm Li}$ ,  ${\rm Li}_{\rm La}$ ,  ${\rm La}_{\rm Zr}$ ,  ${\rm Li}_{\rm Zr}$ , and  ${\rm Zr}_{\rm Li}$ . Intermediate chemical potentials give similar defect concentrations, with Li vacancies and metal anti-sites dominating. Under Opoor/metal-rich conditions the concentration of  $V_{\rm O}$  increases, becoming the dominant defect species. Li vacancy and metal anti-site concentrations, however, remain high.

The analysis above considers a two-dimensional projection of the four-dimensional {O,



Figure 1: Equilibrium defect concentrations (middle panels) and defect formation-energies as a function of Fermi energy (bottom panels) at three sets of elemental chemical potentials within the LLZO thermodynamic stability region (top panel). Defect concentrations are calculated at T = 1500 K. In each case, the bottom panel also shows the corresponding self-consistent Fermi energy (vertical dotted line).  $[V_{\text{Li}}^*]$  denotes the net lithium vacancy concentration, i.e.  $[V_{\text{Li}}^*] = [V_{\text{Li}}] - [\text{Li}_i]$ . Source: The data and code used to generate this figure, and the figure file, are available under the MIT license as part of Ref. 71.

Li, La, Zr} chemical potential space. At a fixed value of  $\Delta \mu_{\rm O}$ , varying the metal chemical potentials can cause a change in the dominant cation defect. For example (SI section 3), moving from Li-rich/Zr-poor to La-poor/Zr-rich conditions at constant  $\Delta \mu_{\rm O}$  causes the dominant antisite defects to change from Li<sub>Zr</sub> and Li<sub>La</sub> to Zr<sub>Li</sub> and Zr<sub>La</sub>.

#### Variation in Lithium Stoichiometry

Tuning the lithium stoichiometry in lithium-stuffed garnets is a popular synthesis strategy to improve their ionic conductivities.<sup>10,18,32,79</sup> A key question concerning the defect chemistry of these materials, therefore, is to what extent might their lithium stoichiometries differ from formal values as a function of synthesis conditions, due to native defect formation.<sup>18</sup> As described above, the range of chemical potentials under which LLZO is predicted to be thermodynamically stable can be characterised as lying between oxygen-rich/metal-poor and oxygen-poor/metal-rich limits. Of the component elements, the chemical potential of oxygen is perhaps most sensitive to synthesis conditions, and most easily controlled by varying temperature or oxygen partial-pressure during synthesis. Because oxygen vacancies act as donors, it has been suggested that increasing the concentration of O vacancies could cause a corresponding increase in acceptor defects, e.g.  $V_{\rm Li}$ , potentially reducing lithium stoichiometries below their nominal values<sup>18,36</sup> (e.g. Eqn. 2).

Previous quantitative analyses of the relationship between oxygen vacancies and lithium vacancies have used simple defect models that include only oxygen and lithium defect species<sup>18,36,37</sup> or only fully charged and neutral defects.<sup>39</sup> In the previous section, however, we have shown that considering a broad range of defects in LLZO, in all charge states, reveals a more complex defect chemistry (Fig. 1). In particular, cation anti-sites—which include both donor and acceptor species—are formed in high concentrations under all thermodynamically accessible synthesis conditions. The presence of these additional defects means the relationship between oxygen and lithium stoichiometries is likely to be more complex than is predicted by simple charge-compensation schemes.

To illustrate the effect of including a "full" set of defects and charge states in our thermodynamic model, we have calculated the lithium vacancy concentration as a function of oxygen chemical potential using two models. The first is a "lithium–oxygen" model, where we include only oxygen vacancies, lithium vacancies, and lithium interstitials. The second is an "all-defects" model that includes all the defects discussed in the previous section. For each model, we have performed a series of self-consistent defect calculations along a line in chemical potential space from O-rich to O-poor conditions (full details are provided in the SI, section S2). The predicted oxygen vacancy and lithium vacancy concentrations in each case are shown in Fig. 2.

The simpler lithium-oxygen model predicts two regimes: at high  $\Delta \mu_{\rm O}$ , the concentrations of lithium vacancies and of oxygen vacancies are both approximately independent of  $\Delta \mu_{\rm O}$ , and the ratio of  $[V_{\text{Li}}]:[V_{\text{O}}]$  is ~ 2 : 1, as expected from simple charge neutrality arguments (Eqn. 2). The observation that the vacancy concentrations in this regime are independent of  $\Delta \mu_0$  can be understood by considering the corresponding changes in the defect transition level diagrams (e.g. Figs. 1a & 1b). Being constrained by the region of thermodynamic stability for LLZO means a decrease in  $\Delta \mu_{\rm O}$  is coupled to an increase in  $\Delta \mu_{\rm Li}$ . As  $\Delta \mu_{\rm O}$ decreases, the Fermi energy increases (pinned by the  $V_{\rm Li}/{\rm Li}_{\rm i}$  crossing point). The formation energies of  $V_{\rm Li}$ , Li, and  $V_{\rm O}$  (the latter in the +2 charge state) remain unchanged from their values at high  $\Delta \mu_0$ , and these defect concentrations are therefore also unchanged. At even lower values of  $\Delta \mu_{\rm O}$ , a second regime is predicted, in which decreasing  $\Delta \mu_{\rm O}$  causes both  $V_{\rm Li}$ and  $V_{\rm O}$  concentrations to increase. This change in behaviour occurs when the Fermi energy becomes sufficiently high that the lowest energy  $V_{\rm O}$  charge state changes from +2 to +1. Further decreases in  $\Delta \mu_{\rm O}$  are no longer fully compensated by increases in the Fermi energy, and the  $V_{\rm O}$  energy starts to decrease. Because the dominant  $V_{\rm O}$  charge state in this regime is +1 the  $[V_{\text{Li}}]$ :  $[V_{\text{O}}]$  ratio decreases towards 1 : 1.

The "full" model has a similar overall shape, showing two general regimes of behaviour. The  $\Delta \mu_{\rm O}$ -independent regime is broader, however, than for the lithium–oxygen model, and lithium vacancy concentrations are higher, i.e. somewhat decoupled from the  $V_{\rm O}$  concentrations. This is because the model now includes additional donor defects, such as  $\mathrm{Zr}_{\mathrm{Li}}^{\bullet\bullet}$  and  $\mathrm{Zr}_{\mathrm{La}}^{\bullet}$ , with low formation energies. The transition to the  $\Delta\mu_{\mathrm{O}}$ -dependent regime occurs at a lower value of  $\Delta\mu_{\mathrm{O}}$  than in the lithium–oxygen model, and oxygen and lithium vacancy concentration are less tightly coupled. This, again, is due to the presence of other defects, particularity cation antisite defects, which buffer the response of system to changing  $\Delta\mu_{\mathrm{O}}$ . Strong coupling between  $V_{\mathrm{O}}$  and  $V_{\mathrm{Li}}$  concentrations now happens only when  $\Delta\mu_{\mathrm{O}}$  is sufficiently low that  $V_{\mathrm{O}}$  is the lowest-energy donor defect.



Figure 2: Predicted  $V_{\rm Li}$  and  $V_{\rm O}$  concentrations as a function of  $\Delta \mu_{\rm O}$ , from two comparative models: "lithium-oxygen" model, which only considers  $V_{\rm O}$ ,  $V_{\rm Li}$ , and  ${\rm Li}_{\rm i}$  (all charge states) and "full" model including all defects considered in this paper. *Source:* The data and code used to generate this figure, and the figure file, are available under the MIT license as part of Ref. 71.

By performing this analysis across the full four-dimensional thermodynamic stability region of LLZO, we can calculate the full range of variation in lithium stoichiometry under all thermodynamically accessible synthesis conditions.<sup>71</sup> Although the concentrations of individual defects vary with changing thermodynamic conditions, the net variation in lithium stoichiometry is small. We predict the minimum and maximum lithium stoichiometries of "LLZO" under thermodynamic equilibrium to be  $x_{\text{Li}} = 6.9975$  and  $x_{\text{Li}} = 7.00125$ .

Lithium stoichiometry is often assumed to directly describe the number of mobile charge-

carrying Li<sup>+</sup>-ions. A simple sum over all lithium-defects does not, however, account for possible differences in mobility for lithium present as different defect species. For example, under Li-rich/Zr-poor conditions we predict high concentrations of Li<sub>Zr</sub> antisites. The binding energy of lithium at a zirconium site can be estimated from the "Frenkel-pair" formation energy for Li<sub>Zr</sub>  $\rightarrow$  Li<sub>i</sub> +  $V_{Zr}$ , which we calculate as  $\Delta E = +3.42 \text{ eV}$ . For comparison the Frenkel-pair formation energy for Li<sub>Li</sub>  $\rightarrow$  Li<sub>i</sub> +  $V_{Li}$  is  $\Delta E = +1.02 \text{ eV}$ . The much larger energy cost to remove Li from a Zr site, than from a Li site, suggests that lithium present as Li<sub>Zr</sub> (and analogously Li<sub>La</sub>) is strongly bound to the lattice-cation site, and is therefore not available as a mobile charge-carrier. This effect is not, however, expected to significantly affect lithium-ion conductivities, as within the regime of thermodynamic stability the maximum number of Li ions trapped as Li<sub>Zr</sub> antisites remains a small proportion of the total Li ( $\leq 0.002\%$ ).

A second factor that might effect lithium-ion mobilities is possible clustering of  $V'_{\rm Li}$  and Li<sup>•</sup><sub>1</sub> to form associated defect pairs.<sup>38,39</sup> Charged lithium vacancies and interstitials are expected to exhibit a mutual Coulombic attraction, giving a favourable negative defect association energy. Formation of a defect complex, however, decreases the number of independent defects in a system, and therefore decreases configurational entropy. Whether an equilibrium population of defects consists predominantly of bound complexes or of independent defects depends on the balance of these energetic and entropic contributions. These thermodynamic considerations give the approximate condition that for defect pairs to be predominantly associated at equilibrium, the defect-pair binding energy,  $E_{\rm b}$ , defined as the energy to separate a "bound" defect pair, should be greater than the formation energy,  $E_{\rm f}^X$  of the individual defect species.<sup>80</sup> If the inverse is true, and  $E_{\rm f}^X > E_{\rm b}$ , these defects will be predominantly dissociated at equilibrium. To assess this behaviour in LLZO, we have calculated formation energies for  $V_{\rm Li}$ -Li<sub>i</sub> defect pairs separated by 4.16 Å and by 6.13 Å. 4.16 Å corresponds to the shortest  $V_{\rm Li}$ -Li<sub>i</sub> distance at which these defects do not simply recombine during geometry optimisation, while 6.13 Å is the largest possible separation in the 96 atom primitive cell.<sup>1</sup> These calculations give a defect-pair association energy of  $0.09 \,\mathrm{eV}$ . Comparing the energy of the "associated" defect pair directly with the separate  $V'_{\mathrm{Li}}$  and  $\mathrm{Li}_{i}^{\bullet}$  formation energies gives a defect-pair association energy of  $0.19 \,\mathrm{eV}$ .<sup>2</sup> Both calculated association energies are much smaller than the  $V'_{\mathrm{Li}}$  and  $\mathrm{Li}_{i}^{\bullet}$  equilibrium formation energies of ~ 0.51 \,\mathrm{eV}, suggesting that  $V_{\mathrm{Li}}$  and  $\mathrm{Li}_{i}$  defects adopt entropy-dominated disordered configurations.

#### $V_{\rm O}$ Charge States and Oxygen Diffusion

Although the oxygen-vacancy concentration is not predicted to directly affect the lithiumvacancy concentration, except under extreme O-poor conditions, we do predict a wide range of equilibrium concentrations for oxygen vacancies, varying from a slightly oxygen-rich material ( $[O_i] = 2.56 \times 10^{13} / \text{cm}^3$ ) to an oxygen-poor material ( $[V_O] = 6.53 \times 10^{17} / \text{cm}^3$  across the LLZO thermodynamic stability region. O vacancies have previously been suggested to affect the electronic, optical, and ion-conduction properties of lithium-garnets.<sup>35,36</sup> In this section, we first examine the electronic properties of oxygen vacancies, and then consider their capacity to diffuse through the garnet lattice, thereby potentially contributing to net ionic conductivities.

The simple "Schottky-pair" charge-compensation model of oxygen vacancy formation (Eqn. 2) considers oxygen vacancies to have a formal charge of +2. Our calculations predict that at low  $\Delta \mu_0$  the favoured oxygen-vacancy charge state is +1, or even 0; oxygen vacancy formation leaves behind one, or two, electrons to be accommodated within the host lattice. In oxides containing reducible cations, such as TiO<sub>2</sub>, excess electrons from donor defects, such as  $V_0$ , are typically accommodated by reducing these cations (e.g. for TiO<sub>2</sub> this formally corresponds to reduction from Ti<sup>4+</sup> to Ti<sup>3+66,81</sup>). LLZO does not contain any cations normally considered to have alternate accessible oxidation states, which would normally be associted

<sup>&</sup>lt;sup>1</sup>Calculations performed using PBEsol in a 192 atom conventional cell indicate that  $V_{\text{Li}}$ -Li<sub>i</sub> pairs separated by more than 4.2 Å give a converged "well-separated" energy.

<sup>&</sup>lt;sup>2</sup>The calculated formation energy of a  $V_{\text{Li}}$ -Li<sub>i</sub> pair at 4.16 Å is 0.83 eV, and at 6.13 Å is 0.92 eV.

with undesirable electronic conduction. We find that excess electrons from  $V_{\rm O}$  formation can be trapped at the vacant oxygen site (Fig. 3) to form occupied defect states lying deep in the band gap (Fig. 4), i.e. oxygen vacancies act as F-centers under reducing, or n-type, conditions. This behaviour is consistent with the experimental observations of Wolfenstein *et al.* who observed colouration of LLZO samples heated in (highly reducing) molten Li, associated with the appearance of a characteristic EPR signal proposed to correspond to unpaired electrons trapped at color centres.<sup>35</sup>

Kubicek *et al.* have proposed that diffusion of oxygen vacancies in LLZO may contribute to net ionic conductivities.<sup>36</sup> To evaluate the capacity for diffusion by  $V_0$ , we have performed climbing-image nudged-elastic-band (cNEB) calculations<sup>82</sup> on the six symmetry inequivalent  $V_0$  diffusion pathways between nearest-neighbour O-site pairs (full details are in the SI, section S4). We find the lowest diffusion barrier is 0.73 eV, which is similar to the barriers in high-temperature oxide-ion conductors.<sup>83,84</sup> This suggests oxygen conduction does not make a significant contribution to net ionic conductivities under typical battery operating conditions, in agreement with the experimental analysis of Kubicek *et al.*<sup>36</sup> Oxygen vacancies may, however, diffuse through the host structure during high-temperature sintering.



Figure 3: Partial charge density associated with the F-centre defect states for (a)  $V_{\rm O}^{\bullet}$  and (b)  $V_{\rm O}^{\times}$  (B). Oxygen ions are shown in orange, lithium ions in blue, zirconium in yellow, and lanthanum in light blue. The partial charge density is shown in green. *Source:* The geometry and charge density data used to generate this figure are available under the CC-BY-4.0 licence as part of Ref. 70.



Figure 4: Projected density of states for oxygen vacancies in 0, +1, and +2 charge states. The valence-band maximum is aligned to 0 eV. The grey line indicates the position of the Fermi level. *Source:* The data and code used to generate this figure, and the figure file, are available under the MIT licence as part of Ref. 71.

## **Response to Supervalent Doping**

Having evaluated the native defect chemistry of LLZO as a function of synthesis conditions, we now consider the response to extrinsic doping by supervalent species. The doping-response can be calculated within the self-consistent defect formalism by calculating the equilibrium concentrations of all native defects, in the presence of a fixed concentration of the relevant extrinsic dopant.<sup>46</sup> The calculated response to supervalent doping is independent of the choice of dopant species and insertion site, within a concentration scaling factor, as discussed in the Methods section above. Here, we scale the predicted doping response using a generic "2+" dopant, such as a trivalent cation at a lithium site,  $M_{\text{Li}}^{\bullet}$ . Within a simple charge compensation model (Eqn. 1) each dopant is expected to produce two charge-compensating



Figure 5: (a) Increase in lithium vacancy concentration as the amount of dopant  $M_{\rm Li}^{\bullet\bullet}$  per formula unit is increased for two different sets of chemical potentials. (b) and (c) Transition level diagrams for the two cases in (a). In each diagram we show the Fermi level position before, and after supervalent doping (0.15  $M_{\rm Li}^{\bullet\bullet}$  per formula unit). For clarity, here we only show the  $V_{\rm Li}$ , Li, and Li<sub>Zr</sub> formation energies. Full transition level diagrams showing the formation energies of all native defects are provided in the SI, Fig. S7. *Source:* The data and code used to generate this figure, and the figure file, are available under the MIT licence as part of Ref. 71.

lithium vacancies. Fig. 5(a) shows the calculated *excess* lithium vacancy concentration, relative to the corresponding undoped system, under two sets of chemical potentials. In the first example ( $\Delta \mu_{\rm Li} = -1.8 \,\mathrm{eV}$ ,  $\Delta \mu_{\rm Zr} = -6.2 \,\mathrm{eV}$ ,  $\Delta \mu_{\rm La} = -5.2 \,\mathrm{eV}$ ,  $\Delta \mu_{\rm O} = -1.6 \,\mathrm{eV}$ ). the doping response exactly follows the prediction of the simple charge-compensation model. Additional lithium vacancies are introduced in a 2:1 ratio to the number of  $M_{\rm Li}$  dopants. In the second example, however, ( $\Delta \mu_{\rm Li} = -2.1 \,\mathrm{eV}$ ,  $\Delta \mu_{\rm Zr} = -8.4 \,\mathrm{eV}$ ,  $\Delta \mu_{\rm La} = -6.5 \,\mathrm{eV}$ ,  $\Delta \mu_{\rm O} = -0.7 \,\mathrm{eV}$ ), the number of excess lithium-vacancies is significantly lower than expected, with a negative deviation from the previous 2:1 ratio that becomes larger with dopant concentration.

These contrasting behaviours can be understood by examining the transition level diagrams in each case, and considering the effects of changing the Fermi level when introducing dopants. Figs. 5b and 5c, respectively, show the two transition level diagrams for each set of chemical potentials. For clarity we only show the relevant lowest formation-energy defects:  $V_{\rm Li}$ , Li, and Li<sub>Zr</sub>. These two figures also show the self-consistent Fermi level calculated for the undoped system ( $[M_{\rm Li}] = 0$ ) and for  $[M_{\rm Li}] = 0.15$ /formula unit. In both cases, when un-

doped, the Fermi energy is pinned slightly below the  $V_{\rm Li}$  / Li<sub>i</sub> crossing point. Adding donor dopants to the system increases the Fermi energy. In the absence of low-energy competing defects (Fig. 5b) this decreases the  $V_{\rm Li}$  energy, and increases the Li<sub>i</sub> energy, resulting in an increased concentration of lithium vacancies. In the second case, the  $\Delta \mu_{\rm Li}$  chemical potential is relatively high compared to  $\Delta \mu_{\rm Zr}$ , and increasing the Fermi level through doping causes the  $\operatorname{Li}_{\operatorname{Zr}}^{\prime\prime\prime}$  formation energy to fall below that of  $V'_{\operatorname{Li}}$ . For sufficiently high dopant concentrations, therefore, the Fermi energy is shifted high enough that  $Li_{Zr}$  becomes the dominant acceptor defect. Further donor doping will now *increase* the amount of Li in the system, as the concentration of  $\text{Li}_{\text{Zr}}$  increases more rapidly than that of  $V_{\text{Li}}$ . The significance of the relative values  $\Delta \mu_{\rm Li}$  and  $\Delta \mu_{\rm Zr}$  can be seen in Fig. 6, which shows the deviation from simple charge-compensating behaviour by  $V_{\rm Li}$  as a function of  $\Delta \mu_{\rm Li}$  and  $\Delta \mu_{\rm Zr}$ , calculated for a grid of points across the full region of thermodynamic stability for LLZO. The degree to which lithium vacancy formation is suppressed is broadly described by  $\Delta \mu_{\rm Zr} - 4\Delta \mu_{\rm Li}$ , where the factor of 4 accounts for the difference in charge states between the  $\text{Li}_{\text{Zr}}^{\prime\prime\prime}$  and  $V'_{\text{Li}}$  defects (a derivation of this approximate relation is given in the SI, section S6). The low formation energy of the  $Li_{Zr}$  defect can be partly ascribed to the similar ionic radii of six-coordinate Li<sup>+</sup> (0.76 Å) and six-coordinate  $Zr^{4+}$  (0.72 Å).<sup>85</sup>

## Summary and Discussion

One strategy for optimising the ionic conductivities of lithium-ion solid electrolytes is to tune the concentration of mobile lithium ions through supervalent doping.  $^{10,86-89}$  For quantitative control of lithium stoichiometry to be possible, it is necessary to understand the native defect chemistry of the target material, and how this varies with synthesis conditions, as well as the defect-response to extrinsic doping. In this study, we have considered these questions for the prototypical lithium-stuffed garnet Li<sub>7</sub>La<sub>3</sub>Zr<sub>2</sub>O<sub>12</sub> (LLZO), by performing hybrid densityfunctional theory calculations on a broad range of defects, and calculating self-consistent



Figure 6: Negative deviation of  $[V'_{\text{Li}}]$  concentration for doping at  $[M_{\text{Li}}^{\bullet\bullet}] = 0.15$  per formula unit, relative to full charge compensation by  $V_{\text{Li}}$  (Eqn. 1), calculated at all points within the LLZO region of thermodynamic stability. *Source:* The data and code used to generate this figure, and the figure file, are available under the MIT licence as part of Ref. 71.

defect concentrations as a function of synthesis conditions (component chemical potentials) and dopant concentrations.

For the native defects, we find a rich family of defect species, including lithium and oxygen vacancies and interstitials, which have been discussed previously,<sup>36–39</sup> and cation anti-sites; such as Li<sub>La</sub>, La<sub>Zr</sub>, Li<sub>Zr</sub>, and Zr<sub>Li</sub>; which are often neglected when considering the defect chemistry of lithium-garnets. Under all conditions except extremely O-poor (reducing) conditions, cation anti-site defects are the highest concentration defect species after  $V_{\text{Li}}$ . The existence of multiple native donor and acceptor defect species means the net lithium stoichiometry is somewhat insensitive to synthesis conditions. We predict that in undoped LLZO under equilibrium conditions the lithium stoichiometry deviates from its nominal value of  $x_{\text{Li}} = 7$  by only +0.00125/-0.0025. Not all this lithium is expected to equally contribute to lithium conduction, however. Under Li-rich conditions we predict high concentrations of Li<sub>Zr</sub> and Li<sub>La</sub> antisites, which are expected to contain strongly bound, immobile, lithium.

Under strongly reducing conditions, O vacancies are stable in +1 or neutral (0) charge states, and act as colour-centres by trapping electrons. We predict the lowest barrier for oxygen vacancy diffusion is  $0.73 \,\text{eV}$ , which suggests that vacancy-mediated oxygen conduction is not significant at typical battery-operating temperatures, in agreement with previous experimental analysis;<sup>36</sup> although oxygen vacancies may readily diffuse during high-temperature sintering of samples.

We also find that the response to supervalent (donor) doping depends on thermodynamic conditions, and broadly depends on a balance between Li and Zr chemical potentials. Under relatively low  $\Delta \mu_{\text{Li}}$  / high  $\Delta \mu_{\text{Zr}}$  conditions, supervalent doping produces proportionate numbers of charge-compensating Li vacancies, as is often commonly assumed (e.g. Eqn. 4). Under relatively high  $\Delta \mu_{\text{Li}}$  / low  $\Delta \mu_{\text{Zr}}$  conditions, however, donor doping is chiefly compensated by Li<sub>Zr</sub> anitsites, and Li stoichiometries strongly deviate from those predicted by simple "vacancy compensation" models. This result means that synthetic recipes that use doping to tune the Li stoichiometry in LLZO may not be able to assume direct compensation by Li vacancies, as the dominant compensating acceptor defect can vary with synthesis conditions. For this reason, we therefore recommend that experimental studies on the relationship between lithium stoichiometry and ionic conductivity directly measure lithium stoichiometries of as-synthesised materials, to obtain reliable values.

More broadly, this study illustrates how combining first-principles defect calculations with a grand-canonical thermodynamic model can provide a broad range of information on the stoichiometry, defect chemistry, and doping response of solid electrolytes. Accurate and quantitative calculations of defect chemistry have proven invaluable in understanding and optimising materials for a range of other applications, such as microelectronics, optoelectronics, and photovoltaics.<sup>84,90-93</sup> We believe similarly detailed computational studies of the defect chemistry of battery materials may prove equally valuable, for example, in helping to develop rational synthetic schemes for optimising the properties of materials such as solid electrolytes.

A key challenge in developing accurate computational models of defect chemistry in solid lithium-ion electrolytes, however, is the question of how to treat the inherent Li-ion disorder that characterises many highly conducting electrolyte families. The defect formalism used

here is formally valid only in systems with an ordered ground state. Eqn. 3, which relates defect concentrations to their formation energies, is derived by assuming the entropic contribution to defect chemical potentials is that of an ideal lattice-gas; i.e. the zero entropy reference state is a perfect ordered lattice. In an inherently disordered system, the entropy change when adding or removing a lithium ion will deviate from this ideal value, changing the relationship between defect concentration and formation energy. In addition, in a system with inherent lithium disorder, the energy change (formally enthalpy change) upon adding or removing a lithium ion is no longer given by the energy difference between single host and defect configurations (as in Eqn. 8). Instead, the energies of the host and defective systems should be computed as ensemble averages over all thermally accessible microstates.<sup>69,94,95</sup> The development of quantitatively accurate models of defect equilibria in inherently disordered solid lithium-ion electrolytes is therefore expected to require advances in both the thermodynamic formalism used in constructing models and in the computational approaches used for calculating defect energies. Meeting these goals, however, brings the promise of a more precise understanding of defect chemistry of a broad range of solid electrolytes, and the potential for more accurate and practical tuning of their material properties through doping and controlled synthetic conditions.

# Supporting Information

The Supporting Information is available free of charge via the internet at http://pubs.acs.org. This contains a justification for the use of the hybrid functional HSE06; a list of competing phases used to construct the phase diagram; variations in defect chemistry with lithium chemical potential; details of oxygen vacancy nudged elastic band calculations; full transition level diagrams for supervalent doping under varied chemical potential regimes, and a discussion of the relationship between zirconium and lithium chemical potentials with regards to Li<sub>Zr</sub> antisite formation.

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