1	Phase segregation and nanoconfined fluid O <sub>2</sub>
2 3 4	in a lithium-rich oxide cathode
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15	Abstract
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Lithium-rich oxide cathodes lose energy density during cycling due to atomic disordering and nanoscale 16 17 structural rearrangements, both of which are challenging to characterise. Here we use a combined approach 18 of ab initio molecular dynamics and cluster-expansion-based Monte Carlo simulations to resolve the kinetics 19 and thermodynamics of these processes in an exemplar layered Li-rich cathode, Li<sub>1.2-x</sub>Mn<sub>0.8</sub>O<sub>2</sub>. We identify a 20 kinetically accessible and thermodynamically favoured mechanism to form O<sub>2</sub> molecules in the bulk, involving 21 Mn migration and driven by interlayer oxygen dimerisation. At the top of charge the bulk structure locally phase-22 segregates into MnO<sub>2</sub>-rich regions and Mn-deficient nanovoids, which contain O<sub>2</sub> molecules as a nanoconfined 23 fluid. These nanovoids are connected in a percolating network, potentially allowing long-ranged oxygen 24 transport, and linking bulk O<sub>2</sub> formation to surface O<sub>2</sub> loss. These insights highlight the importance of future 25 strategies to kinetically stabilise the bulk structure of Li-rich O-redox cathodes to maintain their high energy 26 densities.

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#### 1. Introduction

29 Lithium-ion batteries using conventional cathodes based upon layered LiCoO<sub>2</sub> have revolutionised portable 30 electronics and electric vehicles. Yet the continuing demand for improved battery performance means further 31 increases in energy density are needed. Lithium-rich oxide cathodes offer higher energy densities than 32 conventional cathodes because they utilize capacity from both transition metal and oxygen redox when 33 cycled<sup>1-3</sup>. Oxygen-redox is typically accompanied by bulk structural changes that are associated with a large 34 loss of energy density<sup>4,5</sup>. Understanding these structural changes and their relationship to O-redox behaviour 35 is one of the major challenges for improving Li-rich cathodes. While some aspects of these O-redox driven 36 structural changes are understood, such as that they involve transition metal migration<sup>6,7</sup> and oxygen 37 dimerisation<sup>8,9</sup>, the atomic- to nano-scale picture remains incomplete, in part due to the challenges for 38 experiment and modelling to characterise Li-rich cathodes and their O-redox behaviour during operation<sup>10</sup>.

39 Electronic structure modelling is a powerful tool for understanding atomic-level structures and predicting redox 40 behaviour<sup>11,12</sup>. Modelling O-redox, however, is non-trivial<sup>10,13</sup>. Computational predictions of O-redox behaviour 41 depend on the choice of structures used in these models. Because O-redox cathodes undergo atomic 42 rearrangements during cycling, cathode structures after the early stages of the first charge are not known a 43 priori and must be solved in silico. For computational modelling studies to make credible predictions of O-44 redox behaviour, both the kinetics and thermodynamics of structural rearrangements must be considered. 45 Firstly, structural rearrangements must proceed via kinetically accessible paths. Secondly, any kinetically 46 accessible structures should themselves be stable with respect to further rearrangement on relevant 47 experimental timescales. Modelling schemes that predict behaviour from structures that form only via 48 kinetically inaccessible pathways or from structures that are kinetically unstable can produce unrealistic

49 descriptions of O-redox. Finally, when modelling cathode behaviour after multiple cycles, thermodynamic 50 considerations become more important. O-redox cathodes cycled towards a thermodynamic ground state 51 exhibit crystallographic site disorder<sup>14,15</sup> and nanoscale structural changes, such as the formation of 52 nanovoids<sup>16–19</sup>. To model disorder and nanoscale structural features, computational studies must search a 53 vast configurational space to identify stable low-energy configurations and must use large enough cell sizes 54 to capture the relevant structural features. Many models proposed to explain O-redox are based upon 55 computational studies that have assessed structures using density functional theory (DFT)<sup>20–30</sup>. DFT, however, 56 is too computationally expensive to directly investigate disorder and nanoscale structures, meaning that 57 additional modelling methods are required to provide a complete picture of O-redox behaviour.

58 Here, we use a computational strategy that directly addresses these kinetic and thermodynamic factors in O-59 redox modelling. To identify kinetically viable atomic-scale rearrangements during the first charge, we have 60 used long-timescale ab initio molecular dynamics (AIMD). In parallel, to account for disorder and nanoscale 61 structural changes produced after many cycles, we have developed a DFT-derived cluster-expansion model 62 of oxygen-redox, which we have used to perform large-scale Monte Carlo simulations. This approach allows 63 us to efficiently search the vast configurational space for thermodynamically low-energy structures at the top 64 of charge, and to conduct this search in structures containing ~50,000 atoms, so that nanoscale structural 65 rearrangements can be examined.

66 We have applied this combined strategy to high-capacity O2-layered Li<sub>1.2-x</sub>Mn<sub>0.8</sub>O<sub>2</sub>, which is an exemplar 67 system for understanding Li-rich oxide cathodes. We identify a kinetically viable O-redox mechanism, in which 68 the formation of transient interlayer superoxide and peroxide intermediates drives out-of-plane Mn migration. 69 resulting in O<sub>2</sub> molecules forming within the bulk structure. The thermodynamic ground-state structure at the 70 top of charge exhibits phase segregation into a two-phase mixture of MnO<sub>2</sub> and O<sub>2</sub>. Bulk O<sub>2</sub> molecules are 71 confined within nanometre-sized Mn-deficient voids that form a connected, percolating network. These O<sub>2</sub> 72 molecules have a nanoconfined supercritical fluid character and can potentially diffuse through the network of 73 voids, providing a mechanistic link between bulk O<sub>2</sub> formation and surface O<sub>2</sub> loss.

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#### 2. Results and discussion.

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## 2.1 Kinetics of structural changes in charged O2–Li<sub>x</sub>[Li<sub>0.2</sub>Mn<sub>0.8</sub>]O<sub>2</sub>

The crystal structure of lithium-rich O2–Li<sub>1.2</sub>Mn<sub>0.8</sub>O<sub>2</sub> (Figure 1a) features O2-stacked<sup>31</sup> layers of octahedrally coordinated Li and Mn<sup>32,33</sup>. In the Mn-layers, a regular pattern of Li sites give a characteristic 'ribbon' superstructure<sup>34</sup>. Oxygen-ions are coordinated to either three (O–Mn<sub>3</sub>) or two (O–Mn<sub>2</sub>) Mn atoms; the O–Mn<sub>2</sub> atoms coordinate to the Li ions in the Mn-rich layers. These O–Mn<sub>2</sub> atoms have a single O 2p orbital at the top of the valence band that is unhybridised with any Mn 3d orbitals and is susceptible to oxidation upon charge<sup>22,35</sup>.

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To understand the first-cycle behaviour of O2–Li<sub>1.2</sub>Mn<sub>0.8</sub>O<sub>2</sub> in the oxygen-redox regime we modelled charging the pristine cathode structure past the conventional transition-metal redox limit (*i.e.*, Mn<sup>4+</sup>) by removing one lithium ion per formula unit, giving a composition of Li<sub>0.2</sub>Mn<sub>0.8</sub>O<sub>2</sub>. When relaxed using DFT, this delithiated structure appears stable with respect to structural rearrangement, with no observed Mn rearrangement or oxygen dimerisation (Figure 1b). The absence of rearrangements is an artefact of these DFT relaxations, with the structure trapped in a local minimum. The resulting delithiated structure, however, is unstable against structural rearrangement over experimental timescales<sup>36,37</sup>.



Figure 1. Structures of pristine O2–Li<sub>1.2</sub>Mn<sub>0.8</sub>O<sub>2</sub> and metastable O2–Li<sub>0.2</sub>Mn<sub>0.8</sub>O<sub>2</sub>. (a) Pristine O2–Li<sub>1.2</sub>Mn<sub>0.8</sub>O<sub>2</sub> showing
 the octahedral interlayer Li sites, 'ribbon' superstructure arrangement of lithium ions in the Mn layer, and two different types
 of oxygen coordination: O–Mn<sub>2</sub> and O–Mn<sub>3</sub>. (b) Metastable O2–Li<sub>0.2</sub>Mn<sub>0.8</sub>O<sub>2</sub> with the ribbon structure preserved, obtained
 without permitting host-framework rearrangements, showing octahedral lithium ions remaining in the Li layer only, in sites
 directly above and below the vacancies in the Mn-layers.

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To identify kinetically accessible structural rearrangements, we replicated a thermal decomposition experiment using AIMD, by heating metastable Li<sub>0.2</sub>Mn<sub>0.8</sub>O<sub>2</sub> to 900 K and holding it at that temperature for 400 ps (Methods)<sup>38,39</sup>. For resulting structures displaying oxygen-dimerisation or transition metal ion migration, we performed full relaxations (quenching) with higher-accuracy hybrid DFT calculations to evaluate whether these rearrangements are thermodynamically favoured.

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107 Applying this procedure to delithiated O2-Li<sub>0.2</sub>Mn<sub>0.8</sub>O<sub>2</sub> (Figure 2a) reveals a previously unreported O-redox 108 mechanism. First, interlayer peroxide (O2<sup>2-</sup>) and superoxide (O2<sup>-</sup>) species form from O-Mn2 atoms in adjacent 109 transition-metal layers (Figure 2b&c, structure II). This drives Mn migration into the interlayer space, away from 110 the O–O dimers, and results in de-coordination of the O–O dimers from the Mn to form a pair of O<sub>2</sub> molecules 111 (structure III). Over longer timescales (~400 ps), more Mn ions migrate to the interlayer space, and more  $O_2$ 112 molecules form, which group together in the Mn-vacancy cluster (structure IV). This process is kinetically viable 113 and causes an overall thermodynamic stabilisation of the system with structure IV approximately 11 eV/cell 114 more stable than the starting structure I (Figure 2d).

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Figure 2. Mechanism of O–O dimerisation and Mn migration in Li<sub>0.2</sub>Mn<sub>0.8</sub>O<sub>2</sub> (a) Change in total energy from 400 ps DFT+U AIMD simulations at 900K, with indicated positions where some of the structures were extracted for further analysis. The shaded region shows the range of the fluctuations of total energy, and the red line indicates the energy averaged with a 1ps time window. (b) and (c) Optimised HSE06 equilibrium geometry of the extracted structures from (a) in both a/c and a/b planes. Some lithium ions have been removed for clarity. (d) Change in total energy for HSE06 geometry relaxations of structures I – IV plotted as a function of AIMD simulation time. Red circles correspond to the structures in (b) and (c), with grey circles indicating additional relaxed structures (Supplementary Information).

Previous studies have proposed an alternative pathway to forming O<sub>2</sub> in Li-rich layered cathodes, in which Mn migration occurs before oxygen dimerisation<sup>24,29</sup>. Our simulations show no evidence of this mechanism in Li<sub>0.2</sub>Mn<sub>0.8</sub>O<sub>2</sub>. Indeed, our AIMD simulations always display interlayer O–O dimerisation before Mn migration (Figure S2). Mn migration to interlayer sites without accompanying oxygen dimerisation gives structures that are higher in energy than structures that contain interlayer superoxide and peroxide species (Figure S3). These results therefore indicate that the kinetically-favoured first step in the O-redox mechanism is interlayer O–O dimerisation, rather than Mn migration.

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Transition metal migration and structural degradation in Li- and Mn-rich cathodes have previously been attributed to lattice strain between  $Li_2MnO_3$  and  $LiTMO_2$  domains<sup>40</sup> (where TM = Ni, Co). Our results, described here for the single-phase ribbon structured  $Li_{1.2-x}Mn_{0.8}O_2$ , suggest that there is a driving force for both transition metal migration into the Li layer and for structural degradation, irrespective of whether nanodomains are present. Structural degradation is initiated by oxidised framework O atoms and proceeds if the transition metal interlayer separation can contract to permit interlayer O–O dimerisation. Consequently, preventing interlayer rearrangement. This might be achieved by increasing the spacing between layers with "pillaring" cations or
 large interlayer ions, such as for Na-ion cathodes<sup>41</sup>.

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#### 2.2 Mn-deficient nanovoids and O2 confinement

148 The AIMD simulations investigate kinetically viable structural rearrangements during the first charge. To 149 identify thermodynamically stable structures at the top-of-charge (Mn<sub>0.8</sub>O<sub>2</sub>), that are representative of the 150 cathode after many cycles, while accounting for disorder and nanoscale structural changes, we developed a 151 cluster expansion model of oxygen redox. For this cluster-expansion, we computed energies of structures 152 along the along the O<sub>2</sub>–MnO<sub>2</sub>–MnO tie line using hybrid DFT. We considered two situations for the O<sub>2</sub> end-153 member: free gaseous O<sub>2</sub>, which corresponds to oxygen lost from the cathode; and O<sub>2</sub> molecules confined in 154 the bulk (Supplementary Notes 1,2). A convex-hull of formation energies, which defines the ground-state 155 structures at a given composition, can be constructed for each of these two situations (Figure 3a). Structures 156 at the top of charge ( $Mn_{0.8}O_2$ ) are all above the ground-state hull connecting the  $O_2$  states and  $MnO_2$ , indicating 157 that  $Mn_{0.8}O_2$  is metastable with respect to decomposition into a two-phase mixture of  $MnO_2$  and  $O_2$ . The 158 gaseous  $O_2$  state is below the confined  $O_2$  state, indicating that the lowest energy product is for  $O_2$  to be lost 159 from the system.  $Mn_{0.8}O_2$  is also above the ground-state hull for the  $O_2$  molecules confined in the bulk. This 160 indicates that Mn<sub>0.8</sub>O<sub>2</sub> is thermodynamically susceptible to decompose into MnO<sub>2</sub> and O<sub>2</sub> within the bulk, even 161 if these O<sub>2</sub> molecules cannot be lost from the system.

To ensure accurate representation of the bulk structure, we fitted our cluster expansion using the energy of confined O<sub>2</sub>. To systematically search for low-energy structures and examine nanoscale features, we used this cluster expansion model to run lattice Monte Carlo annealing simulations of structures containing 48,000 atoms, several orders of magnitude larger than is possible using pure DFT (Figure 3b). These simulations predict local phase-segregation type behaviour with the formation of MnO<sub>2</sub>-rich regions and of Mn-deficient nanovoids containing confined O<sub>2</sub> molecules (Figure 3c). The phase-segregation also results in disorder, (Figure 3d), and a complete loss of the layered structure.

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The O<sub>2</sub>-filled voids vary in size with lengths from ~0.5 nm, to >1.5 nm. These voids form a 3D percolating network that connects 90 % to 95 % of O<sub>2</sub> molecules, which potentially permits O<sub>2</sub> transport through the cathode. The percolating network is highly tortuous, however, with a mean microscopic tortuosity factor (*r*) of ~24, compared to *r* = 1 in the pristine structure<sup>42</sup>. The structure can be characterised as multiple large voids, filled with many O<sub>2</sub> molecules, often connected by narrow passages, that are likely to act as bottlenecks for any potential oxygen transport (Figure 3e&f).



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178 Figure 3. Local phase-segregation and formation of Mn-deficient, O<sub>2</sub>-filled nanovoids at the top of charge. (a) DFT-179 calculated convex hull of formation energies used to fit the cluster expansion along the O2-MnO2-MnO tie line, showing 180 the position of structures with the delithiated cathode composition (Mn<sub>0.8</sub>O<sub>2</sub>) above the ground-state hull. (b) Supercell of 181 48,000 atoms obtained from canonical Monte Carlo simulated annealing of Mn<sub>0.8</sub>O<sub>2</sub>. (c) Detailed structure of a section of 182 the O<sub>2</sub>-filled void network from (b). (d) Analysis of the O coordination environments in pristine Li<sub>1.2</sub>Mn<sub>0.8</sub>O<sub>2</sub> and delithiated 183 Mn<sub>0.8</sub>O<sub>2</sub> after charge. Approximately 25% of O atoms after cycling are those represented by O<sub>2</sub> molecules (*i.e.*, O–MnX<sub>5</sub> 184 or  $O-X_6$ , where X is a vacancy) (Supplementary Note S1). (e) 3D representation of the void network, showing the O atoms 185 in O<sub>2</sub> molecules only. (f) A 2D slide of the percolating void network, highlighting the bottlenecks between voids.

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## 2.3 Dynamics of nanoconfined O2 molecules

190 Having established that the cathode bulk structures at the top of charge feature nanovoids containing O<sub>2</sub> 191 molecules, we performed additional molecular dynamics simulations at 300 K to characterise the dynamics of 192 these O<sub>2</sub> molecules. The resulting radial distribution function (RDF) for Mn and lattice O<sup>2-</sup> pairs shows sharp 193 peaks, indicative of an ordered crystalline solid (Figure 4a). In contrast, the Mn–O<sub>2</sub> RDF shows broader peaks, 194 with non-zero values inter-peak values, indicating that the molecular  $O_2$  is mobile. A similar effect is seen in 195 the RDF for the O atoms of only the  $O_2$  molecules (Figure 4b). The second neighbour peak describes the  $O_2$ 196 inter-molecular distance. Instead of a sharp peak, as would be expected for solid crystalline O2, the second 197 peak is broad, indicating these O<sub>2</sub> molecules exhibit rotational and translational degrees of freedom.

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199 The RDF for O<sub>2</sub> in the cathode bulk is compared to a simulated RDF of liquid O<sub>2</sub> (Fig. 4b). The cathode bulk 200 O<sub>2</sub> has a second-neighbour peak maximum at a much smaller separation than for liquid O<sub>2</sub>, and has a density 201 of approximately 1.45 g cm<sup>-3</sup>. This density is higher than that of liquid O<sub>2</sub> (1.141 g cm<sup>-3</sup> at T = 88 K and ambient 202 pressure), but lower than the density of solid  $\beta$ -O<sub>2</sub> (2.21 g cm<sup>-3</sup> at T = 299 K and 5.5 GPa)<sup>43</sup>. The critical point 203 for O<sub>2</sub> is at 154.6 K and 5.05 MPa, meaning that O<sub>2</sub> in the cathode bulk is predicted to be in the supercritical 204 regime.

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The mobile character of O<sub>2</sub> and presence of a percolating void network mean that the O<sub>2</sub> might diffuse through the structure. To probe possible O<sub>2</sub> transport, we ran AIMD on a Li<sub>0.2</sub>Mn<sub>0.8</sub>O<sub>2</sub> system with percolating Mn-void

208 pathways and containing six O<sub>2</sub> molecules (Figure 4d-f). Figure 4c shows the mean squared displacements (MSDs) for the O<sub>2</sub> molecules, lattice O<sup>2-</sup> ions, and Li<sup>+</sup> ions in the system. The MSD for the lattice O<sup>2-</sup> ions 209 shows little change from the initial value of zero (Figure 4c), indicating that O2- ions are not diffusing, as 210 211 expected. In contrast, the MSDs for the O<sub>2</sub> molecules and Li<sup>+</sup> ions increase with time, indicating substantial 212 diffusion of both species. The calculated diffusion coefficients for O<sub>2</sub> molecules and Li<sup>+</sup> ions are 1×10<sup>-7</sup> cm<sup>2</sup> s<sup>-</sup> 213 <sup>1</sup> and  $\sim 7 \times 10^{-8}$  cm<sup>2</sup> s<sup>-1</sup> respectively, indicating that the oxygen molecules are highly mobile over this short 214 length-scale. The non-crystalline diffusive character of this bulk  $O_2$  indicates that these  $O_2$  molecules can be 215 considered a high-density nanoconfined fluid. Figures 4d-f show the positions of the O atoms from a single O<sub>2</sub> 216 molecule over the course of the AIMD simulation. The molecule crosses the interlayer space and moves from 217 one layer to beyond the layer above, demonstrating the potential for long-range O<sub>2</sub> diffusion give suitable void 218 connectivity.

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Figure 4. Transport and structural properties of  $O_2$  molecules in nanovoids. (a) Radial distribution function (RDF) of Mn···O<sup>2-</sup> and Mn···O<sub>2</sub> species in Li<sub>0.2</sub>Mn<sub>0.8</sub>O<sub>2</sub> from AIMD simulations showing solid character for the O<sup>2-</sup> lattice, and fluidlike character for the O<sub>2</sub>. (b) RDF of O···O species showing the compressed character of the O<sub>2</sub> in the cathode, relative to liquid O<sub>2</sub> at ambient pressure. (c) Mean squared displacement (MSD) of O<sub>2</sub> molecules show long-range diffusion. (d–f) Trajectory of a single O<sub>2</sub> molecule over 60ps, indicating that oxygen diffusion is possible through stacked voids in the layers. Red spheres show the position of the O atoms in the O<sub>2</sub> molecule every 200 fs.

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## 2.4 Discussion and Outlook

The structural rearrangements that occur during cycling of Li-rich oxide cathodes introduce challenges for experimental characterisation and atomistic modelling of their O-redox behaviour. The previous absence of suitable modelling strategies to account for the kinetics and thermodynamics of these structural rearrangements<sup>10</sup> has resulted in uncertainty about the mechanisms of O-redox. Here, we have shown how a combination of AIMD and cluster expansion Monte Carlo can resolve these structural changes over the atomic and nanoscale, while accounting for both kinetics and thermodynamics.

- Our results show that  $O_2$  molecules can form in the bulk through kinetically accessible pathways. Peroxide and superoxide species form only as transient reaction intermediates along these pathways and are not the final O-redox product at the top of charge. This result is consistent with high-resolution resonant inelastic X-ray scattering (RIXS), neutron pair distribution function (PDF) and SQUID magnetometry measurements of several lithium-rich cathodes, which provide evidence for molecular  $O_2$  confined in the bulk at the top of charge, and the absence of peroxide or superoxide species<sup>34,41,44–48</sup>.
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The convex hull of formation energies for  $Mn_xO_2$  (Figure 3a) shows that there is a thermodynamic driving force at the top of charge for  $Mn_{0.8}O_2$  to phase segregate into  $O_2$  and  $MnO_2$ , regardless of whether the  $O_2$  is lost from the system or confined in the bulk.  $O_2$  loss and bulk  $O_2$  formation therefore can be considered as different outcomes of the same thermodynamically-driven process whereby  $O^{2-}$  ions are oxidised to molecular  $O_2$  [Ref <sup>41</sup>].  $O_2$  formed at the surface will be immediately lost.  $O_2$  in the bulk is unstable with respect to outgassing and could contribute to net  $O_2$  loss, but this is dependent upon diffusion of  $O_2$  through the bulk material, and the permeability of the surface to  $O_2$  molecules. On discharge, the bulk confined  $O_2$  can be reduced to  $O^{2-}$ .

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253 The idea that bulk  $O_2$  formation and  $O_2$  loss are outcomes of the same thermodynamically favoured process 254 is likely to not be limited to Li<sub>x</sub>Mn<sub>0.8</sub>O<sub>2</sub>. If a material demonstrates oxygen loss as gas-phase O<sub>2</sub> this indicates 255 a thermodynamic instability of the parent phase with respect to a two-phase mixture of O-deficient phase and 256 molecular O<sub>2</sub>. Providing the stabilisation energy to phase separate into this mixture is sufficiently large, 257 molecular O<sub>2</sub> formation is likely to be thermodynamically favoured whether the resulting O<sub>2</sub> is confined in the 258 bulk or released as a gas. This suggests that O<sub>2</sub> loss, which is widely observed in other Li-rich<sup>14,49</sup> and 259 conventional layered oxides<sup>50,51</sup>, may be an indication that these materials are also susceptible to bulk O<sub>2</sub> 260 formation.



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262 Figure 5. Schematic summary of the combined modelling strategies to probe structural rearrangements in 263 delithiated O2-Li<sub>1.2-x</sub>Mn<sub>0.8</sub>O<sub>2</sub>. At the top of charge, ribbon-superstructure Li<sub>0.2</sub>Mn<sub>0.8</sub>O<sub>2</sub> is predicted to be metastable by 264 DFT structural relaxation but rearranges during experimental timescales. The kinetics and thermodynamics of these 265 structural rearrangements can be modelled using ab initio molecular dynamics (AIMD) and cluster expansion Monte Carlo 266 respectively. Modelling kinetic processes with AIMD and hybrid DFT relaxations identifies O-redox mechanism initiated by 267 interlayer O–O dimerisation, forming stable O<sub>2</sub> molecules. Thermodynamic modelling using a cluster expansion model and 268 Monte Carlo simulations identifies the formation of nano-scale voids containing O2. AIMD characterises O2 in the nanovoids 269 as a high-density nanoconfined fluid.

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Our study also explains experimentally observed disordering and nanostructuring driven by O-redox. Bulk confined O<sub>2</sub> cannot easily be directly imaged. Nevertheless, the phase segregation in our Monte Carlo simulations reveals that Mn-deficient nanovoids are a signature of bulk O<sub>2</sub> formation. This structural description

274 is consistent with observations of nanovoids in cycled cathodes from X-ray and neutron pair distribution 275 function (PDF), small-angle X-ray and neutron scattering (SAXS, SANS), and electron microscopy 276 experiments<sup>16–19,52</sup>. Some studies have attributed the formation of voids to the presence of oxygen vacancies, 277 often in the context of oxygen loss<sup>17</sup>. Our results indicate voids can form even in the absence oxygen loss; 278 oxygen atoms can instead dimerise to form molecular O<sub>2</sub> species near the vacated O sites. Our results also 279 indicate that these voids can form throughout the  $Li_{1,2-x}Mn_{0,8}O_2$  material; it is not necessary for them to first 280 form at the surface and then penetrate into the bulk. Hence, design strategies to stabilise the bulk, as well as 281 the surface, against the formation of nanovoids are expected to be important to prevent structural degradation 282 and a loss of energy density.

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Our large-scale models shine new light upon the properties of the confined O<sub>2</sub> molecules. Previous studies using <sup>17</sup>O NMR and AIMD have suggested that small numbers of O<sub>2</sub> molecules are rigidly caged within their local environment<sup>44,53</sup>, with no long-range diffusion. Our results show a thermodynamic drive to form large voids that contain large numbers of O<sub>2</sub> molecules. Within the voids, these O<sub>2</sub> molecules are mobile, and collectively can be considered as a high-density supercritical nanoconfined fluid. Individual O<sub>2</sub> molecules in Mn-vacancy clusters may have a more solid-like character, but as the Mn-deficient voids increase in size, we predict that O<sub>2</sub> within these voids will display an increasingly fluid behaviour.

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292 The fluid character of O<sub>2</sub> highlights important links between bulk O<sub>2</sub> formation, the cathode nanostructure, O<sub>2</sub> 293 loss and voltage fade. Voltage fade has been associated with gradual O<sub>2</sub> loss from the bulk in oxide cathodes 294 such as the lithium-rich nickel-manganese-cobalt (NMC) system at high states of charge, through a mechanism 295 of oxygen vacancy transport from bulk to surface<sup>54</sup>. Our results suggest an alternative oxygen transport 296 mechanism, in which fluid nanoconfined O<sub>2</sub> diffuses through a percolating network of voids. We calculate a 297 local diffusion coefficient for nanoconfined  $O_2$  of  $\sim 10^{-7}$  cm<sup>2</sup> s<sup>-1</sup>. This calculated value is much higher than the 298 macroscopic oxygen diffusion coefficient reported for Li-rich NMC (~10<sup>-17</sup> cm<sup>2</sup> s<sup>-1</sup>)<sup>54</sup> from X-ray absorption and 299 ptychography measurements. Long-range diffusion rates are therefore likely to be limited by other factors such 300 as residual lithium in the structure, the high tortuosity and slow formation kinetics of the void network, and 301 influenced by the variation in structure and composition of different Li-rich cathodes (Supplementary Note S3). 302 Coatings and surface structures that prevent O<sub>2</sub> release from the bulk of cathode materials are potentially 303 important to preserve long-term cycling stability, although these alone will not be able to inhibit structural 304 rearrangements in the bulk where most of the  $O_2$  is formed. Designing bulk structures with void networks that 305 do not interconnect is also a possible strategy to inhibit oxygen transport and hence minimise oxygen loss 306 from the surface.

307 In conclusion, the combination of ab initio molecular dynamics and cluster expansion allows the detailed 308 atomic-scale exploration of a lithium-rich O-redox cathode, by resolving structures that are realistic 309 representations of the charged cathode material. Using this approach, we have identified а 310 thermodynamically-favoured and kinetically viable O-redox mechanism to form confined O<sub>2</sub> molecules in the 311 bulk structure with Mn migration. Long-term cycling of the cathode results in local phase-segregation into 312 MnO<sub>2</sub>-rich regions and Mn-deficient nanovoids that contain O<sub>2</sub> molecules as a nanoconfined fluid. These 313 nanovoids are connected in a percolating network, potentially allowing oxygen diffusion, which provides a link 314 between bulk  $O_2$  formation and  $O_2$  loss through the surface. The combined methodology presented here 315 answers longstanding questions about the atomic-to-nanoscale mechanisms of O-redox in Li-rich Mn-based 316 cathodes, and highlights directions for improving the performance of other high energy density cathodes that 317 display structural rearrangements during cycling.

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2. Author contributions

- 331 3. Data availability
- 333 4. Conflicts of Interest
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# 3355. References336

- Zuo, W. *et al.* Li-rich cathodes for rechargeable Li-based batteries: reaction mechanisms and advanced characterization techniques. *Energy Env. Sci* 13, 4450–4497 (2020).
- Koga, H. *et al.* Reversible Oxygen Participation to the Redox Processes Revealed for Li<sub>1.20</sub>Mn<sub>0.54</sub>Co<sub>0.13</sub>Ni<sub>0.13</sub>O<sub>2</sub>. *J. Electrochem. Soc.* **160**, A786–A792 (2013).
- 341 3. Sathiya, M. *et al.* Reversible anionic redox chemistry in high-capacity layered-oxide electrodes. *Nat. Mater.* 12, 827–835 (2013).
- 343
  4. Croy, J. R. *et al.* Examining Hysteresis in Composite *x*Li<sub>2</sub>MnO<sub>3</sub>·(1-*x*)LiMO<sub>2</sub> Cathode Structures. *J. Phys. Chem. C* 344
  347, 6525–6536 (2013).
- 345
   5. Gallagher, K. G. *et al.* Correlating hysteresis and voltage fade in lithium- and manganese-rich layered transitionmetal oxide electrodes. *Electrochem. Commun.* 33, 96–98 (2013).
- Li, B. *et al.* Correlating ligand-to-metal charge transfer with voltage hysteresis in a Li-rich rock-salt compound exhibiting anionic redox. *Nat. Chem.* (2021) doi:10.1038/s41557-021-00775-2.
- 349
   350
   7. Gent, W. E. *et al.* Coupling between oxygen redox and cation migration explains unusual electrochemistry in lithiumrich layered oxides. *Nat. Commun.* 8, 2091 (2017).
- Hong, J. *et al.* Metal–oxygen decoordination stabilizes anion redox in Li-rich oxides. *Nat. Mater.* 18, 256–265 (2019).
- Gent, W. E., Abate, I. I., Yang, W., Nazar, L. F. & Chueh, W. C. Design Rules for High-Valent Redox in Intercalation Electrodes. *Joule* 4, 1369–1397 (2020).
- 355
   10. Zhang, M. *et al.* Pushing the limit of 3d transition metal-based layered oxides that use both cation and anion redox for energy storage. *Nat. Rev. Mater.* (2022) doi:10.1038/s41578-022-00416-1.
- 357 11. Urban, A., Seo, D.-H. & Ceder, G. Computational understanding of Li-ion batteries. *Npj Comput. Mater.* 2, 16002 (2016).
- 359
   12. Van der Ven, A., Deng, Z., Banerjee, S. & Ong, S. P. Rechargeable Alkali-Ion Battery Materials: Theory and Computation. *Chem. Rev.* 120, 6977–7019 (2020).
- Tygesen, A. S., Chang, J. H., Vegge, T. & García-Lastra, J. M. Computational framework for a systematic investigation of anionic redox process in Li-rich compounds. *Npj Comput. Mater.* 6, 65 (2020).
- 363
   14. Armstrong, A. R. *et al.* Demonstrating Oxygen Loss and Associated Structural Reorganization in the Lithium Battery Cathode Li[Ni<sub>0.2</sub>Li<sub>0.2</sub>Mn<sub>0.6</sub>]O<sub>2</sub>. *J. Am. Chem. Soc.* **128**, 8694–8698 (2006).
- 365
   15. Zheng, J. *et al.* Structural and Chemical Evolution of Li- and Mn-Rich Layered Cathode Material. *Chem. Mater.* 27, 1381–1390 (2015).
- Hu, E. *et al.* Evolution of redox couples in Li- and Mn-rich cathode materials and mitigation of voltage fade by reducing oxygen release. *Nat. Energy* 3, 690–698 (2018).
- 369 17. Yan, P. *et al.* Injection of oxygen vacancies in the bulk lattice of layered cathodes. *Nat. Nanotechnol.* 14, 602–608 (2019).

- 371 18. Grenier, A. *et al.* Nanostructure Transformation as a Signature of Oxygen Redox in Li-Rich 3d and 4d Cathodes. *J. Am. Chem. Soc.* 143, 5763–5770 (2021).
- 373
   19. Zhao, E. *et al.* Quantifying the Anomalous Local and Nanostructure Evolutions Induced by Lattice Oxygen Redox in Lithium-Rich Cathodes. *Small Methods* 6, 2200740 (2022).
- 375
   20. Xie, Y., Saubanère, M. & Doublet, M.-L. Requirements for reversible extra-capacity in Li-rich layered oxides for Liion batteries. *Energy Env. Sci* 10, 266–274 (2017).
- Ben Yahia, M., Vergnet, J., Saubanère, M. & Doublet, M.-L. Unified picture of anionic redox in Li/Na-ion batteries.
   *Nat. Mater.* 18, 496–502 (2019).
- 379 22. Seo, D.-H. *et al.* The structural and chemical origin of the oxygen redox activity in layered and cation-disordered Liexcess cathode materials. *Nat. Chem.* 8, 692–697 (2016).
- 381 23. Okubo, M. & Yamada, A. Molecular Orbital Principles of Oxygen-Redox Battery Electrodes. ACS Appl. Mater.
   382 Interfaces 9, 36463–36472 (2017).
- Radin, M. D., Vinckeviciute, J., Seshadri, R. & Van der Ven, A. Manganese oxidation as the origin of the anomalous capacity of Mn-containing Li-excess cathode materials. *Nat. Energy* 4, 639–646 (2019).
- Saubanère, M., McCalla, E., Tarascon, J.-M. & Doublet, M.-L. The intriguing question of anionic redox in highenergy density cathodes for Li-ion batteries. *Energy Environ. Sci.* 9, 984–991 (2016).
- 26. Chen, H. & Islam, M. S. Lithium Extraction Mechanism in Li-Rich Li<sub>2</sub>MnO<sub>3</sub> Involving Oxygen Hole Formation and Dimerization. *Chem. Mater.* 28, 6656–6663 (2016).
- 27. Lee, E. & Persson, K. A. Structural and Chemical Evolution of the Layered Li-Excess Li<sub>x</sub>MnO<sub>3</sub> as a Function of Li
   Content from First-Principles Calculations. *Adv. Energy Mater.* 4, 1400498 (2014).
- 391 28. Kim, B. *et al.* A theoretical framework for oxygen redox chemistry for sustainable batteries. *Nat. Sustain.* (2022) doi:10.1038/s41893-022-00890-z.
- 393
   29. Vinckeviciute, J., Kitchaev, D. A. & Van der Ven, A. A Two-Step Oxidation Mechanism Controlled by Mn Migration Explains the First-Cycle Activation Behavior of Li<sub>2</sub>MnO<sub>3</sub>-Based Li-Excess Materials. *Chem. Mater.* 0, null (0).
- 30. Kitchaev, D. A., Vinckeviciute, J. & Van der Ven, A. Delocalized Metal–Oxygen π-Redox Is the Origin of Anomalous
   Nonhysteretic Capacity in Li-Ion and Na-Ion Cathode Materials. *J. Am. Chem. Soc.* 143, 1908–1916 (2021).
- 397 31. Delmas, C., Fouassier, C. & Hagenmuller, P. Structural classification and properties of the layered oxides. *Phys. BC* 99, 81–85 (1980).
- 399 32. Eum, D. *et al.* Voltage decay and redox asymmetry mitigation by reversible cation migration in lithium-rich layered oxide electrodes. *Nat. Mater.* 19, 419–427 (2020).
- 401 33. Cao, X. *et al.* Achieving stable anionic redox chemistry in Li-excess O2-type layered oxide cathode via chemical ion-exchange strategy. *Energy Storage Mater.* 38, 1–8 (2021).
- 403 34. House, R. A. *et al.* Superstructure control of first-cycle voltage hysteresis in oxygen-redox cathodes. *Nature* 577, 502–508 (2020).
- 405
   35. Luo, K. *et al.* Charge-compensation in 3d-transition-metal-oxide intercalation cathodes through the generation of localized electron holes on oxygen. *Nat. Chem.* **8**, 684–691 (2016).
- 407 36. Eum, D. *et al.* Coupling structural evolution and oxygen-redox electrochemistry in layered transition metal oxides.
   408 *Nat. Mater.* 21, 664–672 (2022).
- 409 37. House, R. A. *et al.* Delocalized electron holes on oxygen in a battery cathode. *Nat. Energy* (2023) doi:10.1038/s41560-023-01211-0.
- 38. Benedek, R. First-Cycle Simulation for Li-Rich Layered Oxide Cathode Material *x*Li<sub>2</sub>MnO<sub>3</sub>·(1-*x*)LiMO<sub>2</sub>(*x*= 0.4). *J. Electrochem. Soc.* 165, A2667–A2674 (2018).
- 39. Zhang, Z., Zhao, S., Wang, B. & Yu, H. Local Redox Reaction of High Valence Manganese in Li<sub>2</sub>MnO<sub>3</sub>-Based
  Lithium Battery Cathodes. *Cell Rep. Phys. Sci.* 1, 100061 (2020).
- 415 40. Liu, T. *et al.* Origin of structural degradation in Li-rich layered oxide cathode. *Nature* **606**, 305–312 (2022).
- 41. House, R. A. *et al.* The role of O<sub>2</sub> in O-redox cathodes for Li-ion batteries. *Nat. Energy* (2021) doi:10.1038/s41560-021-00780-2.
- 418 42. O'Rourke, C. & Morgan, B. J. crystal-torture: A crystal tortuosity module. J. Open Source Softw. 4, 1306 (2019).
- 419 43. Freiman, Yu. A. & Jodl, H. J. Solid oxygen. *Phys. Rep.* 401, 1–228 (2004).
- 42. House, R. A. *et al.* First-cycle voltage hysteresis in Li-rich 3d cathodes associated with molecular O<sub>2</sub> trapped in the bulk. *Nat. Energy* **5**, 777–785 (2020).

- 422
   45. House, R. A. *et al.* Covalency does not suppress O<sub>2</sub> formation in 4d and 5d Li-rich O-redox cathodes. *Nat. Commun.* 423
   45. House, R. A. *et al.* Covalency does not suppress O<sub>2</sub> formation in 4d and 5d Li-rich O-redox cathodes. *Nat. Commun.* 423
- 46. House, R. A. *et al.* Detection of trapped molecular O<sub>2</sub> in a charged Li-rich cathode by Neutron PDF. *Energy Environ.* 425 Sci. (2022) doi:10.1039/D1EE02237G.
- 426
   47. McColl, K. *et al.* Transition metal migration and O<sub>2</sub> formation underpin voltage hysteresis in oxygen-redox disordered rocksalt cathodes. *Nat. Commun.* 13, 5275 (2022).
- 428 48. Boivin, E. *et al.* Bulk O<sub>2</sub> formation and Mg displacement explain O-redox in Na<sub>0.67</sub>Mn<sub>0.72</sub>Mg<sub>0.28</sub>O<sub>2</sub>. *Joule* **5**, 1267–1280 (2021).
- 430
   49. Lee, J. *et al.* Mitigating oxygen loss to improve the cycling performance of high capacity cation-disordered cathode materials. *Nat. Commun.* 8, 981 (2017).
- 432 50. Jung, R., Metzger, M., Maglia, F., Stinner, C. & Gasteiger, H. A. Oxygen Release and Its Effect on the Cycling
   433 Stability of LiNixMnyCozO2 (NMC) Cathode Materials for Li-Ion Batteries. *J. Electrochem. Soc.* 164, A1361 (2017).
- 434 51. Sharifi-Asl, S., Lu, J., Amine, K. & Shahbazian-Yassar, R. Oxygen Release Degradation in Li-Ion Battery Cathode
   435 Materials: Mechanisms and Mitigating Approaches. *Adv. Energy Mater.* 9, 1900551 (2019).
- 436
   52. Sun, C. *et al.* High-Voltage Cycling Induced Thermal Vulnerability in LiCoO<sub>2</sub> Cathode: Cation Loss and Oxygen 437
   52. Sun, C. *et al.* High-Voltage Cycling Induced Thermal Vulnerability in LiCoO<sub>2</sub> Cathode: Cation Loss and Oxygen 437
- 438
  53. Sharpe, R. *et al.* Redox Chemistry and the Role of Trapped Molecular O<sub>2</sub> in Li-Rich Disordered Rocksalt Oxyfluoride Cathodes. *J. Am. Chem. Soc.* 142, 21799–21809 (2020).
- 440 54. Csernica, P. M. *et al.* Persistent and partially mobile oxygen vacancies in Li-rich layered oxides. *Nat. Energy* **6**, 642–652 (2021).
- 442