

## Three-dimensional *operando* optical imaging of particle and electrolyte heterogeneities inside Li-ion batteries

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## Abstract

**Understanding (de)lithiation heterogeneities in battery materials is key to ensuring optimal electrochemical performance and developing better energy storage devices. However, this remains challenging due to the complex three-dimensional morphology of microscopic electrode particles, the involvement of both solid and liquid phase reactants, and range of relevant timescales (seconds to hours). Here, we overcome this problem and demonstrate the use of bench-top laser scanning confocal microscopy for simultaneous three-dimensional *operando* measurement of lithium ion dynamics in individual agglomerate particles, and the electrolyte, in batteries. We examine two technologically important cathode materials that are known to suffer from intercalation heterogeneities:  $\text{Li}_x\text{CoO}_2$  and  $\text{Li}_x\text{Ni}_{0.8}\text{Mn}_{0.1}\text{Co}_{0.1}\text{O}_2$ . The surface-to-core transport velocity of Li-phase fronts, and volume changes – as well as their inter-particle heterogeneity – are captured as a function of C-rate, and benchmarked to previous ensemble measurements. Additionally, we visualise heterogeneities in the bulk and at the surface of agglomerates during cycling, and image the formation of spatially non-uniform concentration gradients within the liquid electrolyte. Importantly, the conditions under which optical imaging can be performed inside absorbing and multiply scattering materials such as battery intercalation compounds are outlined.**

## Introduction

A key factor in enhancing the performance of Li-ion batteries is the development of high energy density cathode materials such as Ni-rich Lithium Nickel Manganese Cobalt Oxides (NMCs). A long debate still remains into the nature of ion (de)intercalation in such materials<sup>1-4</sup> with heterogeneities and irreversibilities in intercalation driving degradation and capacity fade<sup>5-8</sup>. Until such effects are thoroughly understood the necessary advances in battery performance are unlikely to be realised. However, one of the difficulties in probing ion (de)intercalation in battery electrodes, is the complex 3D morphology of constituent particles, with the particles microscopic surface, bulk and electrolyte environment all playing a role in (de)intercalation rates over seconds to hours<sup>9-12</sup>.

In the life-sciences, optical reflection microscopies are a ubiquitous tool for low-cost, non-invasive, microscale characterisation of evolving systems<sup>13,14</sup>. Typically, microscopic reflection is performed at visible wavelengths (400 to 800 nm) either in the wide-field (WF) – where the entire sample is illuminated – or with confocal laser scanning (LSCRM), where a focussed laser beam is rapidly scanned across a given sample plane and the reflected light is used to build an image. A key difference between WF and LSCRM is that in the latter, specified depths of a material can be individually probed

(sectioning). Over the last decade optical reflection microscopies, predominantly with WF or single plane illumination, have emerged as in-expensive tool for also tracking battery electrode dynamics<sup>15–21</sup>. This is because the reflectivity of many micron sized features on the electrode surface can dramatically increase, decrease or spectrally shift on (de)lithiation<sup>22,23</sup>. High numerical aperture (N.A.) microscope objectives have recently been used with the WF technique to extend its resolution and track changes in phase<sup>24</sup>, state-of-charge<sup>25</sup> and structure<sup>26</sup> at the single-particle level in high energy density and fast charging battery materials. Despite this, little framework still exists for physically understanding the reflectivity signals from such (WF) experiments, with conflicting results emerging<sup>24,27</sup>. Furthermore, neither the limitations nor best-practices for optical reflection imaging of battery materials have been elucidated. Understanding how to apply the technique is particularly pertinent as the (real) refractive index (RI;  $n$ ) of many battery electrode materials ( $n = 2$  to  $3$ )<sup>28</sup> is strongly mismatched from that which high N.A. optical microscopies are designed for ( $n \sim 1.4$  to  $1.6$ ). The RI mismatch can result in severe aberrations and artifacts<sup>29</sup>, which will be further accentuated by the high absorption and multiple scattering<sup>30</sup> of electrodes. In batteries specifically, high-resolution reflection microscopy studies have thus far been primarily limited to studying surface topography changes<sup>19,20</sup> or lithiation in ‘flat’ single crystalline particles in 2D<sup>24–26</sup>. Such constraints not only fundamentally limit applications but also skews our understanding as objects and processes are inherently three-dimensional (3D) with both a surface and bulk. Most importantly, as is the case with other *operando* methods such as X-ray imaging, optical reflection methods have been unable to directly visualise the liquid electrolyte and its interaction with particles or agglomerates, making it challenging to completely resolve the origins of (de)intercalation heterogeneities.

Here, we overcome these limitations by first understanding, how, and under what conditions, optical imaging can be performed in batteries whilst avoiding false conclusions from optical artifacts. In contrast to other high-resolution optical microscopy studies, which have used 2D WF imaging, we focus on LSCRM, where sectioning allows individual agglomerates of particles (*i.e.* secondary particles comprised of many primary smaller particles) in 3D to be studied. We apply LSCRM to examine Li-intercalation in Ni-rich NMC811 ( $\text{Li}_x\text{Ni}_{0.8}\text{Mn}_{0.1}\text{Co}_{0.1}\text{O}_2$ ) and LCO ( $\text{Li}_x\text{CoO}_2$ ), both known to experience heterogeneities in Li occupancy during cycling, as characterised by other *operando* imaging techniques<sup>10,31</sup>. To benchmark the methods, agglomerate particle volume changes and surface-to-core phase front velocities during cycling are measured, with the inter-particle heterogeneity quantified and compared with results of ensemble studies. We further push the LSCRM technique to distinguish intercalation heterogeneities that occur in the bulk of agglomerates from those limited to the surface, as well as visualise the formation of concentration gradients in the surrounding electrolyte, which we show can be simultaneously tracked from its intrinsic fluorescence. Our results highlight LSCRM as one of the only ways of microscopically imaging both the solid and liquid phases of batteries in 3D and *operando*.

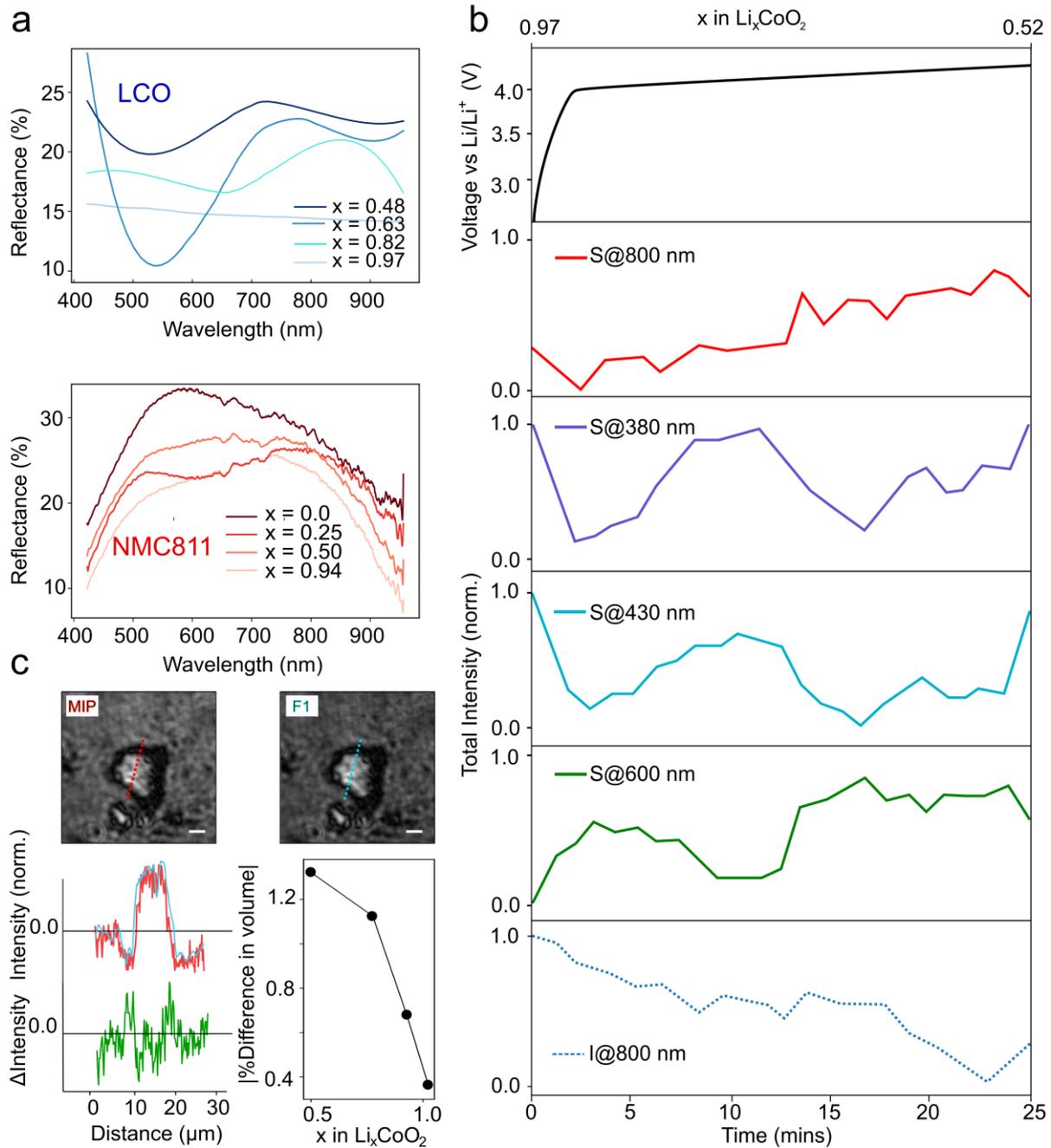
## Main

### Microscopic high-resolution optical imaging of metal oxide battery particles

For many metal oxides, including LCO and NMC811, their reflectivity (and thus refractive index)<sup>22,23,32</sup> at visible wavelengths changes during injection of a charge. To investigate the relationship between charge state and reflectivity, *ex-situ* microscopic reflection spectra of individual LCO and NMC811 agglomerate particles are shown in Figure 1a as a function of lithiation ( $x = 0$  corresponds to the fully delithiated particles). In both LCO and NMC811, the (surface) reflectivity increases with decreasing  $x$  in the near-infrared between 680 and 900 nm for LCO and 800 and 900 nm for NMC811, with changes of up to 20% between  $x \approx 0$  (0.5 for LCO) and  $x \approx 1$ . Hence, in this wavelength range the magnitude of the particle reflectivity can be used as a proxy of the state-of-charge. However, between 400-680 nm for LCO and 400-800 nm for NMC811, the changes in reflectivity with  $x$  are non-monotonic, with spectral shifts consistent with bulk reflectivity measurements of other materials<sup>28,33,34</sup>. This region should consequently be avoided for microscopic measurements where reflectivity is used to track the lithiation state of particles in an electrode. Our above observations also agree with theoretical calculations<sup>33,35,36</sup> which show the underlying electronic transitions involved in the visible and near-infrared (400 – 1200 nm) reflectivity of LCO and NMCs are not expected to change identically as a function of lithiation, with chromatic aberrations<sup>37</sup> in the imaging system also needing to be considered when comparing data between wavelengths (see **supplementary information 1** for further discussion). Furthermore, in some common electrode materials, *e.g.*  $\text{Li}_x\text{FePO}_4$ , the reflectivity change (400 to 900 nm) at different lithiation stages is <1%, suggesting that microscopic reflectivity may not be a universal tool for tracking particle charge state (**supplementary information 1**) as recently proposed<sup>24</sup>. Fitting the reflection spectra in Figure 1a with the Kramers-Kronig relations<sup>38</sup> (see **supplementary information 2**) allows extraction of the state-of-charge dependent refractive index (RI). The real part of the refractive indices ( $n$ ) for LCO and NMC811 is found to be between 2 – 2.5. This is larger than the RI (1.5 to 1.6) high numerical aperture (N.A.) microscope objective lenses are designed for, hence aberration corrections should be applied to account for the index mismatch (see discussion below).

To understand how *ex-situ* observations relate to changes in reflectivity during cycling, we perform *operando* reflection (confocal) microscopy measurements at several wavelengths on an individual polycrystalline LCO particle (see methods and below), plotting the total reflected intensity and voltage during charging in Figure 1b. At 800 nm (red curve), when light is focussed on/collected from the surface (S) of the agglomerate, the reflectivity decreases linearly as  $x$  is increased. Whereas between 380 nm and 600 nm a non-monotonic ‘W’ shaped curve is observed (green, light blue, and purple curves) in line with Figure 1a. Interestingly, when focussing/collecting light from *inside* (I) the agglomerate – an advantage offered by confocal sectioning – the reflectivity at 800 nm decreases linearly with  $x$  (Figure 1b, blue dashed line). The difference between the ‘S’ and ‘I’ response at 800 nm

can be reconciled by noting that the reflectivity at the interface of two media of RI  $n_1$  and  $n_2$  will be proportional to the difference,  $(n_1-n_2)^2$  under normal incidence<sup>39</sup>. At the surface of agglomerates,  $n_1$  is equal to that of the electrolyte ( $\sim 1.4$  to  $1.6$ )<sup>40,41</sup> and  $n_2$  that of the agglomerate  $1.8$ - $2.5$ <sup>42</sup>. However, inside the agglomerate  $n_1$  and  $n_2$  will both vary between  $1.8$  and  $2.5$ . Consequently, depending on the focus, different interfacial refractive indices, *i.e.* electrolyte/particle *versus* particle/particle (intra-particle), will be resolved. We note that absorption of the agglomerate top surface impacting layers below only results in attenuation of the ‘I’ response and cannot explain the opposing direction of trends between ‘S’ and ‘I’. Indeed, the variation in the imaginary ( $k$ ; absorptive) part of the refractive index is relatively small with lithiation state at  $800$  nm. Hence, the different extent to which  $k$  (and its changes) contribute to the ‘S’ and ‘I’ signals during (de)lithiation are expected to be less significant than that of  $n$  (see **supplementary information 2**). Our observations potentially explain the contrasting reports of Merryweather *et al.*<sup>24</sup> and Jiang *et al.*<sup>27</sup> with the former reporting brightening of LCO on delithiation and the latter dimming.



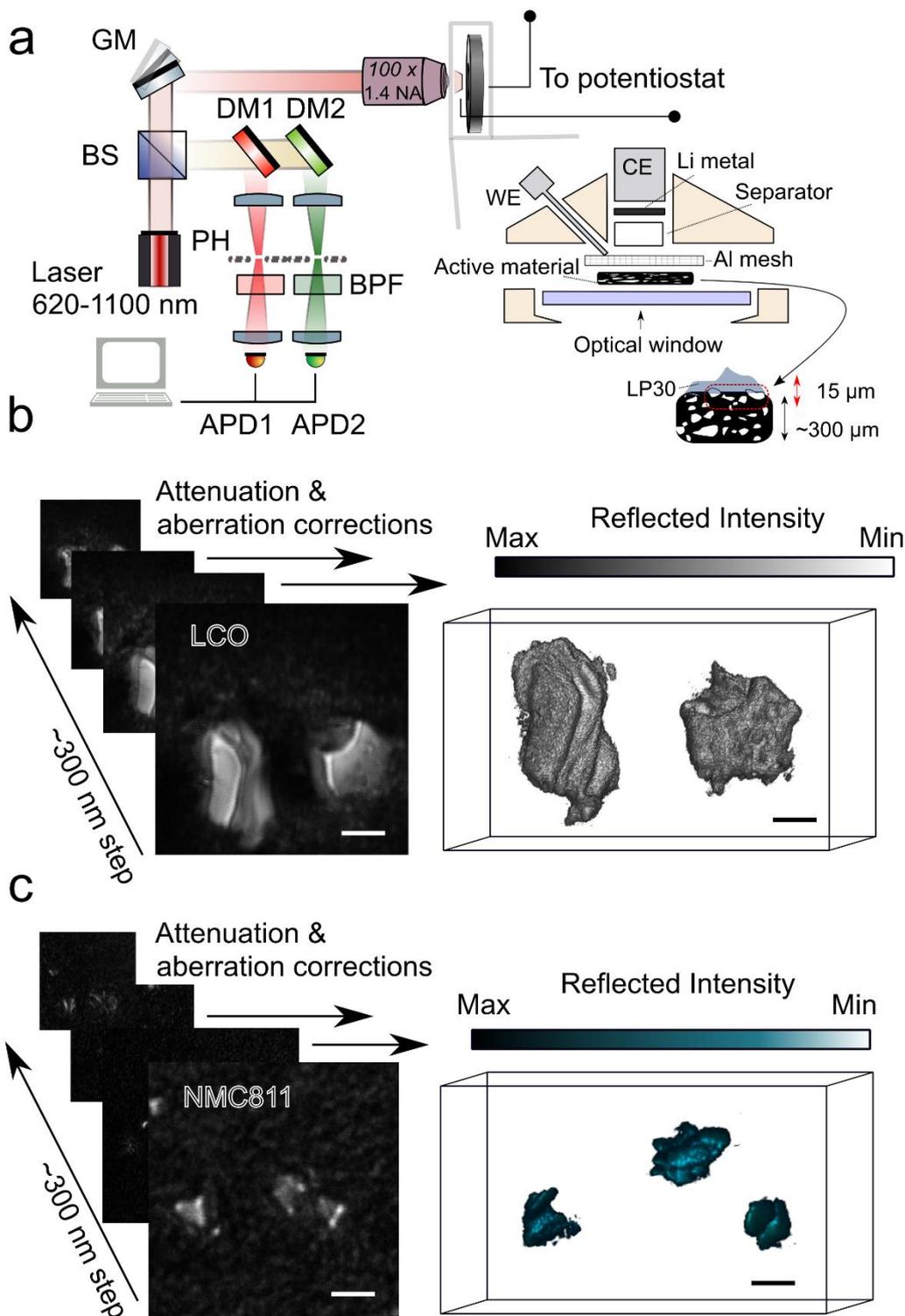
**Figure 1: Tracking charge state with optical reflection microscopy.** **a.** Reflectivity spectra of  $\text{Li}_x\text{CoO}_2$  (LCO; blue; top) and  $\text{Li}_x\text{Ni}_{0.8}\text{Mn}_{0.1}\text{Co}_{0.1}\text{O}_2$  (NMC811; red; bottom) as a function of lithiation state ( $x$ ). **b.** (Top) Spectral reflectivity as a function of time/state-of-charge ( $x$ ) for a polycrystalline LCO particle during galvanostatic charge (dark blue curve below). S – focussing on agglomerate surface (solid lines) and I – focussing inside agglomerate (dashed line). Reflectivity measured from same agglomerate at: 800 nm (surface - red, inside dotted blue), 380 nm (purple), 430 nm (light blue) and 600 nm (green). **c.** (Top) Maximum intensity projection (MIP) image of  $\text{Li}_{0.05}\text{CoO}_2$  agglomerate obtained from a defocus stack and image taken from a single focus position (F1). Scale bar is 10  $\mu\text{m}$ . (Left) Normalised line-cut of reflection intensity through an agglomerate (dashed red and blue lines in image) for MIP (red) and F1 (blue) images. Green line shows difference between two line-cuts. (Right) Absolute percentage difference in estimated agglomerate volume between MIP and F1 as a function of state-of-charge ( $x$ ) in  $\text{Li}_x\text{CoO}_2$ .

The results above suggest that the choice of the imaging plane plays a critical role when imaging such electrolyte/particle systems. Different combinations of the red and dotted blue curves in Figure 1b might be observed for different agglomerates irrespective of any battery dynamics simply due to defocus or electrode roughness, *i.e.* inter-agglomerate heterogeneities cannot be established from measurements at a single focal plane (WF). Additionally, interference between different reflection planes on the agglomerate surface will influence the *spatial* distribution of intensity imaged. In **supplementary information 3 and supplementary video 1** we demonstrate (in wide-field measurements) that even in the absence of any cycling, different intensity patterns – closely resembling patterns that might be ascribed to the motion of phase fronts or arise from morphology inhomogeneities<sup>19,20,43,44</sup> – can be observed across the surface of agglomerates simply by small (20 nm) adjustments in the focus<sup>45</sup>. The large RI of the battery agglomerates means only a small defocus, which may not be captured, or may even be created by, an auto-focus feedback system, can give rise to such effects. Hence, measuring at a range of focal planes, *i.e.* in 3D, is key to distinguish spatial intensity patterns modulated by small (high N.A amplified) focal shifts throughout a cycle, and true electrochemical dynamics.

The refractive index,  $n$ , also plays a role on the imaged size of an object *via* the optical path length, (OPL)  $OPL = n \cdot s$ , where  $s$  is the geometric path length. Hence, before using optical microscopy to also investigate agglomerate particle size changes during cycling<sup>26</sup>, the impact of a varying  $n$  on the OPL must first be accounted for<sup>27</sup>. In Figure 1c, we compare the lateral width of a polycrystalline LCO particle extracted from a reflection image at a single focus position (F1) and the lateral width of the same agglomerate calculated from the maximum intensity projection<sup>46–48</sup> (MIP) where the influence of OPL on the object size is accounted for (see methods). By comparing the MIP and F1 images we can estimate an error in sizing introduced. For  $x = 1$  (in  $\text{Li}_x\text{CoO}_2$ ),  $L_{F1}$  and  $L_{MIP}$  ( $L$  is the agglomerate particle length; dashed red and blue lines in Figure 1c) deviate by 0.12%. This deviation increases monotonically with decreasing  $x$ , reaching 0.43% at  $x = 0.48$ . From error propagations (see **supplementary information 4**) this will correspond to a deviation in volume of the imaged object (as compared to its ‘true’ size) of ~0.36% to 1.3% as  $x$  decreases from 1 to 0.48 (right panel graph in Figure 1c and **supplementary information 5**). The deviation will be more pronounced for smaller curved agglomerates, with larger  $n$ , but generally our results suggest that changes in volume below ~1 to 1.5% are challenging to unambiguously detect with optical microscopy.

Having understood the limitations and conditions under which optical reflection imaging can be performed, we turn to applying these methods. We first benchmark LSCRM against other tools and extract parameters such as the volume change of individual agglomerates during cycling. We then further apply our method to obtain information not accessible by other techniques such as surface-to-core phase front velocities and sub-micron electrolyte concentration polarisation gradients. LSCRM, as

schematically depicted in Figure 2a, is performed on polycrystalline LCO (average particle diameter,  $\langle d_{particle} \rangle \sim 2.5$  to  $7.5 \mu\text{m}$ ) and NMC811 ( $\langle d_{particle} \rangle \sim 5 \mu\text{m}$ ). A laser beam at 820 nm, where absorption and scattering are minimised and changes in reflectivity with lithiation state are monotonic for LCO and NMC811, is scanned across the sample. Adjusting the focus of the beam in the sample, whilst using a pinhole (0.7 AU) to gate out-of-focus light, allows probing of different 2D planes up to the optical penetration length, which is  $<15 \mu\text{m}$  in both materials (see **supplementary information 6**). Stacking the 2D images and correcting for laser attenuation and defocus aberration (**supplementary information 6**) allows for sub-micrometre 3D information to be obtained on individual agglomerates of particles, as illustrated in Figure 2b,c. A customised battery half-cell with optical access (right side of Figure 2a) allows for galvanostatic cycling during the recording of confocal image stacks of electrodes ( $\sim 120$  s per stack). All data presented herein, is taken from the first 2 to 9 cycles of an electrode and on self-standing electrodes with a low loading of 20wt% of LCO or NMC811. However, as we show in **supplementary information 6**, our method can be readily applied to electrodes with higher active material loadings (up to 92wt% with  $\approx 40\%$  porosity) with little change in the ability to resolve agglomerates in 3D and extract information during cycling such as agglomerate volume changes, the velocity of phase fronts through agglomerates and electrolyte heterogeneities (see below).

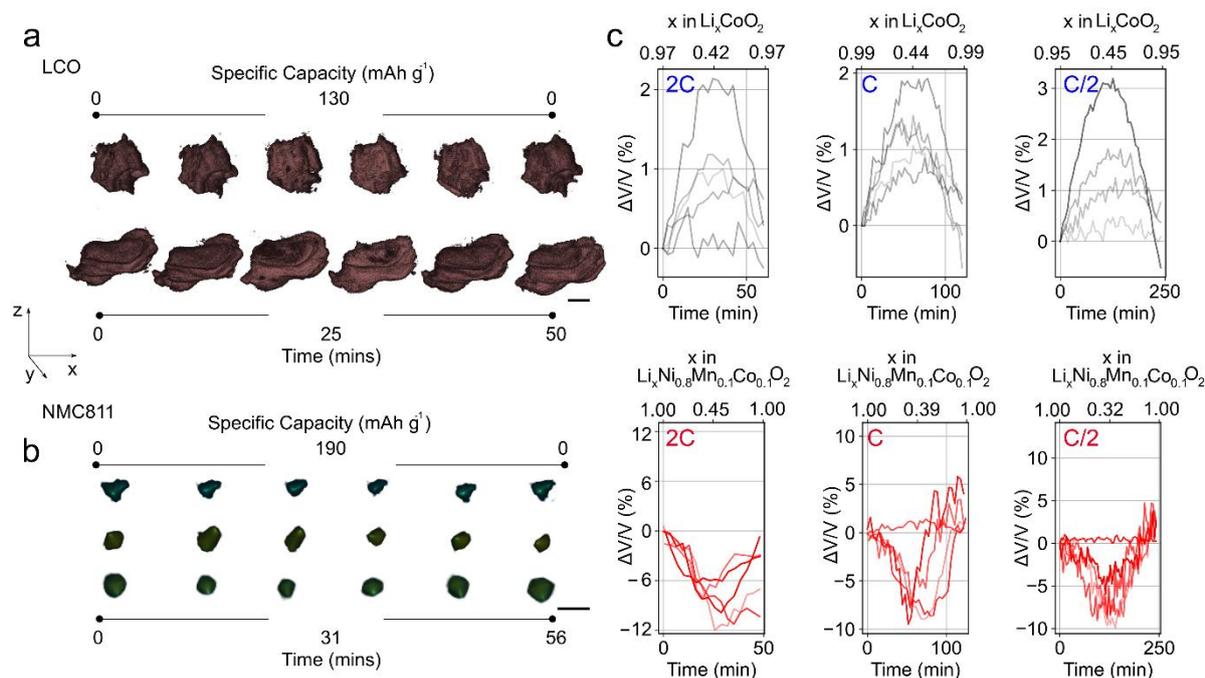


**Figure 2: Three-dimensional imaging in polycrystalline battery electrodes.** **a.** Cartoon schematic of laser scanning confocal microscopy (LSCRM) setup (left) and *operando* battery cell (right). A tunable laser source is directed to microscope body *via* a beam-splitter (BS) with reflection signal and fluorescence passed through pinholes (PH) before being collected onto two separate avalanche photodiodes (APDs). Long pass dichroic mirrors (DM) and band pass filters (BPF), control the spectral selectivity; APD1: 700-1100 nm and APD2: 550-680 nm. z-sampling is performed by movement of an objective piezo. Self-standing LCO and NMC811 electrodes are placed in an optical microscopy half-cell (WE, working electrode; CE, counter electrode). A lithium metal counter is used

along with a glass fibre separator with the cell filled with a carbonate liquid electrolyte (LP30 (see methods); blue shading); depth resolution (red arrow) is limited to  $\sim 15 \mu\text{m}$ . **b-c**. Confocal z-stacks of LCO and NMC811. Scale bar  $5 \mu\text{m}$ . Following attenuation correction<sup>49,50</sup>, aberration correction<sup>29</sup> and thresholding (see **supplementary information 6**) a 3D reconstruction of the agglomerate particle can be obtained. z-sampling size is pre-determined as  $\sim 300 \text{ nm}$ .

### **Operando tracking of agglomerate particle volume changes**

To first benchmark our LSCRM methodology, we monitor volume changes of individual agglomerates during a cycle. By calculating the number of voxels occupied by agglomerate containing regions within the reconstructed volumes, volumes at the individual agglomerate level can be obtained. In Figure 3a-c, the normalised change in single agglomerate particle volumes ( $\Delta V/V$ ) of LCO and NMC811 are shown as a function of time/charge state and C-rate. The volume of LCO agglomerates in all cases increases during charging and decreases during discharging (standard deviation in maximum volume change ( $\sigma_{\Delta V/V}$ ) is 0.42), with a maximum volume change of  $\sim 3\% \pm 1\%$  (see **supplementary information 6** for error bar estimation). For NMC811,  $\sigma_{\Delta V/V}$  is 0.63 with the volume decreasing during the charge ( $|\Delta V/V_{\text{max}}| \sim 12\% \pm 2\%$ ), as shown by the graph in Figure 3c. In NMC811 we observe significant changes in volume only between lithium fractions of  $x = 0.3$  and  $x = 0.7$  and as for LCO there are also inactive agglomerates which show a  $\Delta V/V \sim 0$  throughout the cycle. In NMC811 there is a greater scattering of results with a hysteresis in  $\Delta V/V$ , suggesting irreversible changes, *e.g.* primary particle cracking or movement within the secondary particle microstructure. Interestingly, the changes in volume correlate well with the degree of reflectivity change at the agglomerate particle centre (see **supplementary information 6**), *i.e.* change in state of charge and reaction extent, suggesting that this latter quantity is responsible for the inter-particle heterogeneity in volume changes. However, for polycrystalline secondary particles (NMC811) and polycrystalline particles (LCO) as studied here, the insertion of lithium into the lattice, cracking and rearrangement may also contribute<sup>51</sup>. Indeed, for a small fraction ( $\sim 15\%$ ) of NMC811 agglomerates measured, positive changes in  $\Delta V/V$  are observed (see **supplementary information 6**). Nevertheless, the results in Figure 3b,c are consistent both in terms of magnitude, direction and state-of-charge onset, for volume changes obtained by previous ensemble X-ray diffraction and pressure dependent open circuit voltage measurements of LCO ( $\Delta V/V_{x=1 \rightarrow x=0.5} \sim +2\%$ ) and NMC811 ( $\Delta V/V_{x=1 \rightarrow x=0.2} \sim -8\%$ )<sup>51-54</sup>. Furthermore, the results corroborate well with *ex-situ* X-ray nano-computed tomography and scanning electron microscopy measurements, where we correlate changes in agglomerate volume and shape before and after charging, for the same agglomerates, with LSCRM (see **supplementary information 7**).



**Figure 3: Tracking agglomerate particle volume changes during cycling a-b.** Tomographic reconstruction of LCO and NMC811 throughout a 2C charge/discharge with specific capacities and times above and below. Rows are different agglomerates. Scale bar is 5  $\mu\text{m}$ . **c.** Percentage change in agglomerate volume as compared to that at the open circuit potential (OCP; black LCO and red NMC811) as a function of time during a 2C, C and C/2 charge-discharge sequence;  $x$  in  $\text{Li}_x\text{CoO}_2$  and  $\text{Li}_x\text{Ni}_{0.8}\text{Mn}_{0.1}\text{Co}_{0.1}\text{O}_2$  plotted above. Different grey and red curves represent volumes changes of different agglomerates to highlight the large degree of heterogeneity in volume changes. Data across different C-rates are not necessarily on identical agglomerates.

### Surface-to-core transport

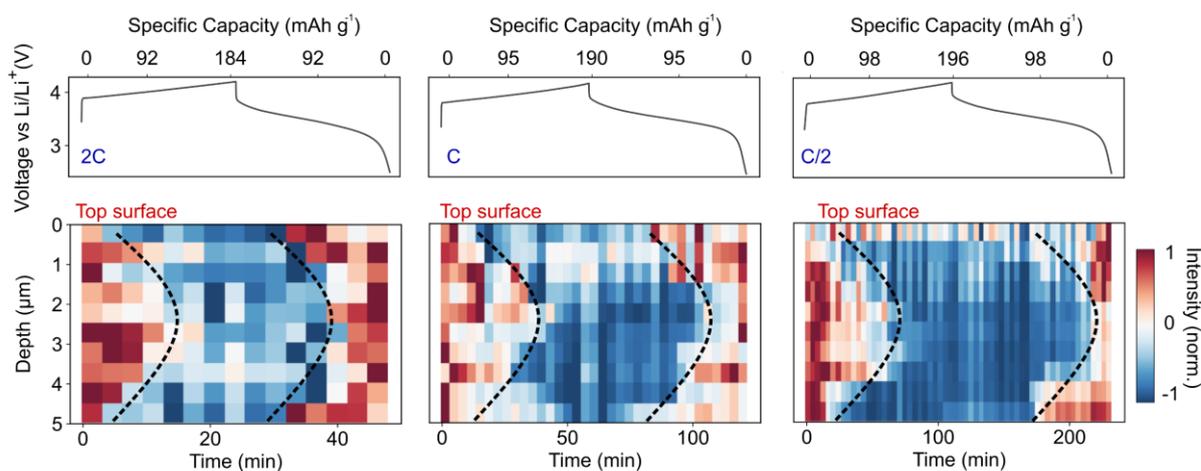
To further understand how structural inhomogeneities might be related to (de)lithiation asymmetries, we examine the transport velocities of Li-ion containing phase fronts from the exterior to the centre of agglomerate particles. The surface-to-core transport velocity is indeed a parameter of fundamental interest as local inter- and intra-particle heterogeneities in ion transport can limit the overall (dis)charging rate and potentially cause irreversible material changes<sup>55–57</sup>. To track the motion of phase fronts through polycrystalline NMC811 or LCO during the cycle, the normalised time varying reflectivity, a proxy for the state-of-charge, is extracted for each z-plane across the central area of an agglomerate particle. From this, the depth-dependence of the time-varying reflectivity can be extracted, as shown in Figure 4a, b as a function of cycling rate. For each z-plane, the point at which the reflectivity crosses zero is then determined (dashed line in Figure 4a, b); from the variation of this reference point with depth, a transport velocity for ion containing fronts can be estimated (see **supplementary information 8**).

For NMC811, in Figure 4a, the delithiation and lithiation both occur from the surface to the core, in an approximately symmetric manner across the agglomerate particle z-span, with qualitatively similar behaviours from C/2 to 2C. In LCO, delithiation occurs from the surface to the core, as for NMC811. However, lithiation occurs approximately uniformly across the agglomerate volume, with all depths changing reflectivity simultaneously (flat dashed line in Figure 4b). The agglomerate nature of the NMC811 and LCO studied here means it is not appropriate to ascribe a single overall mechanism, *e.g.* shrinking-core or intercalation wave, to the (de)lithiation. One must instead consider interfacial reaction-limited processes, bulk solid-state diffusion and the multi-particle nature of agglomerates which together control the intra- and inter-agglomerate (de)lithiation heterogeneities<sup>10</sup> and the overall timescale for ion transport from the exterior to the core in Figure 4. As we show in **supplementary information 8** for large ( $> 5\mu\text{m}$ ) agglomerates, where sub-particles can be resolved, the onset of the reflectivity change and surface-to-core transport velocity is slightly different for each sub-particle within an agglomerate. In addition, there is significant compositional heterogeneity on the surface of agglomerates particularly during fast delithiation (see discussion below and Figure 5). Combined, these observations suggest, as initially highlighted by Park *et al.*<sup>10</sup> for multiply separated particles, that surface kinetics and the multi-particle nature control the precise (de)lithiation pattern and timescale also in agglomerates. However, by the end of the charge/discharge there will be a drive to having similar composition profiles in agglomerate sub-particles<sup>10,31</sup> as evidenced by the qualitatively similar shape for reflection profiles of sub-particles (**supplementary information 8**). We note for LCO specifically, phase-field modelling<sup>58</sup> and several experimental studies<sup>1,59,60</sup> have reported drastically different intercalation behaviours between charging and discharging. These differing processes of ion transport may explain the uniform surface-to-core lithiation profile for our LCO.

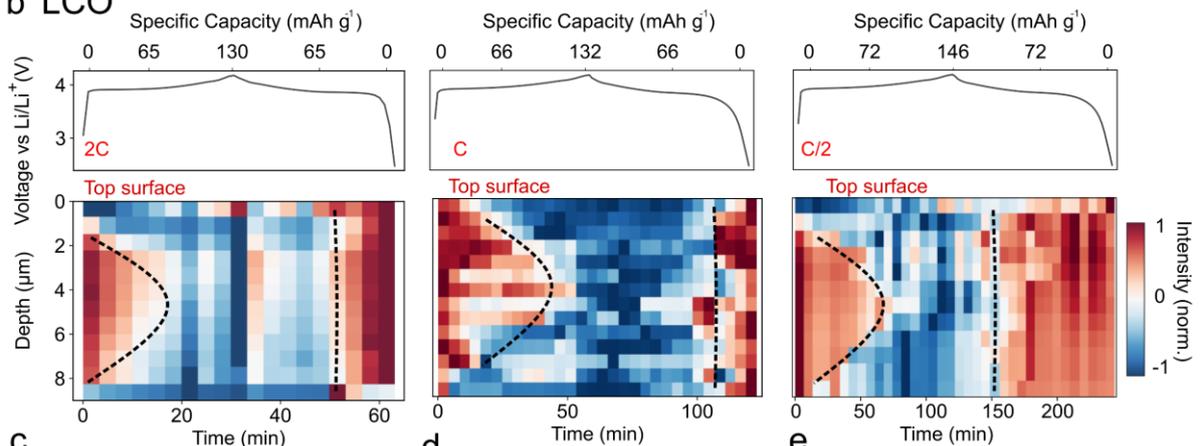
Because the velocity of phase fronts ( $v_p$ ) will depend on the state-of-charge, values extracted in Figure 4c-e represent an average across lithiation/delithiation. Furthermore, because in the majority of agglomerates the sub-particle ( $< 500\text{ nm}$ ) structure cannot be fully resolved, the velocities we report are also an average over all particles that make up an agglomerate. In NMC811 and LCO,  $v_p$  increases with C-rate, but remains of the same order of magnitude of 2-6  $\text{nm s}^{-1}$  across C-rates for delithiation and lithiation. Note that for LCO, velocities cannot be extracted during lithiation as it is beyond our time resolution (60 to 100 s). These values sit at the lower end of those reported previously in the literature ( $1\text{ nm s}^{-1}$  to  $50\text{ nm s}^{-1}$ )<sup>24,61-66</sup>. However, in this work, the transport velocities reported are *through* individual polycrystalline particles, *i.e.* from the surface to the core. This is something that cannot be obtained with other methods such as the galvanostatic intermittent titration technique (GITT) or 2D imaging which operate at the ensemble level and/or do not have 3D directional resolution on transport. We note that anisotropy in the transport is not expected due to the random orientation of primary particles and their polycrystalline nature (see **supplementary information 8**). Finally, the linear scaling

of  $v_p$  with C-rate in both NMC811 and LCO suggests that the motion of phase fronts is kinetically rather than thermodynamically limited for both layered oxides<sup>10,31</sup>.

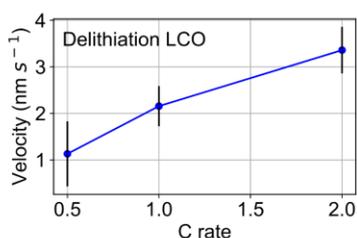
### a NMC811



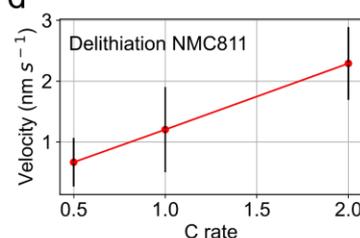
### b LCO



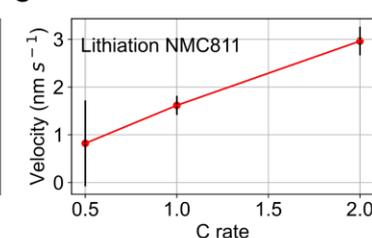
### c



### d



### e



**Figure 4: Measurement of phase front velocities through agglomerate particles. a-b.** Reflectivity as a function of z-plane and charge state/time through a NMC811 and LCO agglomerate, respectively. The top of the agglomerate ( $0 \mu\text{m}$ ) is taken as the first plane inside the agglomerate. Galvanostatic charge-discharge is performed at C rates from 2C to C/2 (top panels); all data is taken after first cycle. The dashed line is a guide to the eye at which the normalised ( $[-1,1]$ ) reflected intensity changes sign. From the time/depth dependence of this point a phase front velocity through the agglomerate can be estimated (see **supplementary information 8**). **c-e.** Phase front velocity for delithiation and lithiation (only NMC811) as a function of C-rate; spread obtained from measurement on 9 NMC811 and 7 LCO agglomerates. Data across different C-rates represent measurements of identical agglomerates.

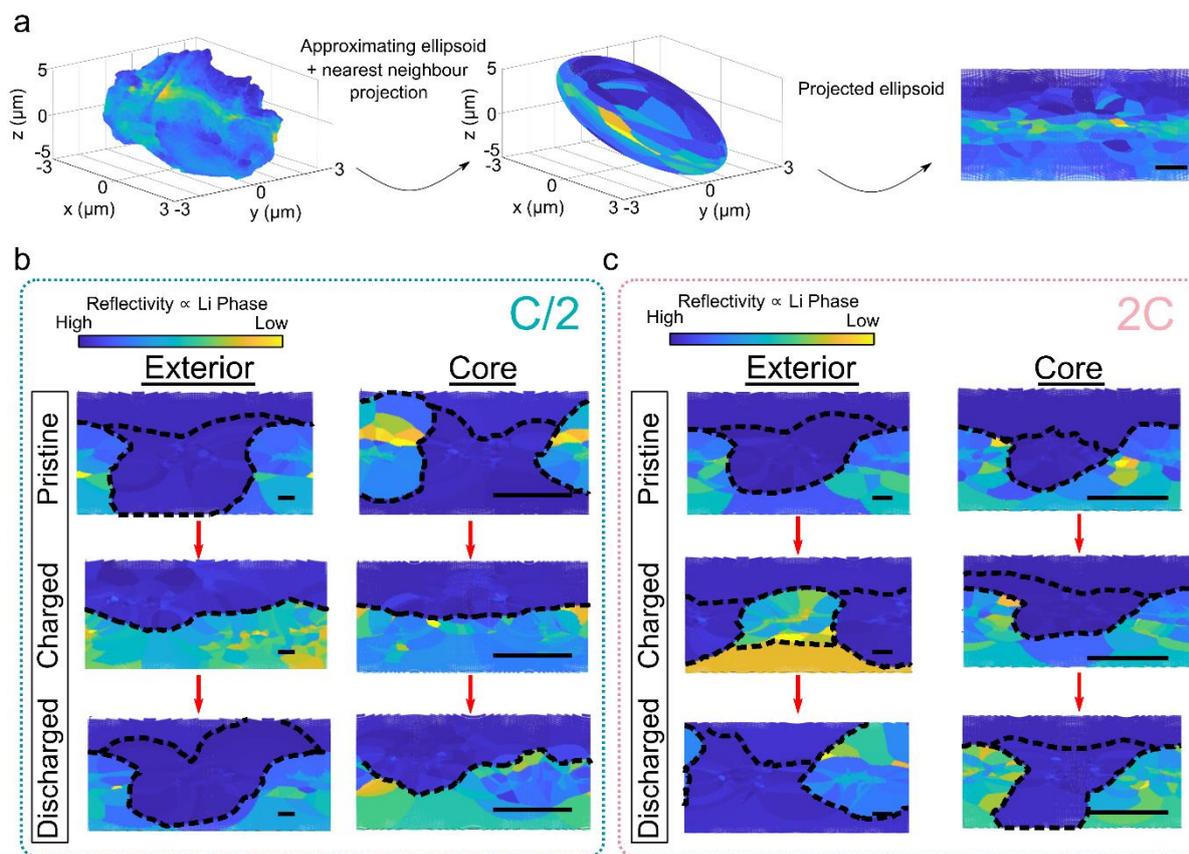
## Imaging phase front dynamics on different surfaces

Having shown that the velocity of phase fronts from the surface to the core of agglomerates can be tracked using LSCRM, we push further the technique to spatially separate (de)lithiation inhomogeneities between the surface and bulk of individual agglomerates. For that, we compare using mathematical reconstructions, at different points during a charge-discharge cycle, the spatial distribution of reflected intensity (lithiation state) between the agglomerate exterior, and core for LCO agglomerates cycled at different C-rates ( $C/2$  and  $2C$ ). For both the exterior and core the reflection contrast is derived from refractive index changes within the material (see **supplementary information 9**). LCO agglomerates are first computationally ‘unwrapped’ into shells ( $\sim 25$ ) of thickness  $\sim 500$  nm for each time point in the cycle. The minimum volume ellipsoid – a close approximation of the agglomerate shape – enclosing points of the shells is then calculated<sup>67,68</sup>. The surface of the ellipsoid is projected onto a 2D plane using the Mercator projection<sup>69</sup>, as show in Figure 5a (see **supplementary information 9**), and colours correspond to different phases or domains with different lithiation states. In Figure 5b,c, 2D projections of the outer (exterior) and inner (core) most shells are shown for pristine, charged and discharged states during galvanostatic cycles at  $C/2$  and  $2C$ . At  $C/2$ , for the agglomerate exterior, the contrast in reflectivity both within and between domains remains small throughout the cycle indicating large area, uniform (de)lithiation. Furthermore, for the pristine and discharged states the distribution of different lithiation domains is near-identical, demonstrating a reversible cycling process. At the agglomerate centre, a spatial rearrangement of lithium phases is observed from the pristine to charged states. This rearrangement remains on discharging, but the differences in lithiation degree between domains, for a given overall state-of-charge, are small. The observation of changes at both the exterior and core however indicate that (de)lithiation occurs throughout the entire agglomerate.

For  $2C$ , at the agglomerate exterior, the pristine and discharged states do not show a similar spatial distribution of lithiation phases. For the core, no rearrangement of lithium domains at the end of charge is observed, unlike at  $C/2$ . Only minimal changes in both the contrast and spatial distribution of lithium domains occur between the pristine, charged and discharged states. This observation suggests that (de)lithiation does not occur throughout the entire agglomerate particle volume, in agreement with the limited cycling capacity measured at  $2C$  when compared to  $C/2$  (see Figure 3b for instance). For the exterior, regions of contrastingly high (dark blue) and low (yellow) Li-content appear on going from the pristine to charged state, and persist to the discharged state. This indicates non-uniform lithiation on the surface of LCO agglomerates at high C-rate, consistent with several previous observations in layered oxide materials<sup>11,70–73</sup>.

Our results do suggest that LSCRM, combined with mathematical/computational treatments, can spatially distinguish phase inhomogeneities simultaneously at different surfaces within individual cycling agglomerates. However, for such a non-trivial technique relying heavily on data treatment more

remains to understand the implication of these observation, with for instance NMC811 showing a much more complex behaviour (see **supplementary information 10**).



**Figure 5: Unwrapping of particle surfaces** **a.** Cartoon schematic demonstrating enclosing of agglomerate particle ‘shells’ onto the surface of an ellipsoid followed by projection onto the 2D plane. **b-c.** 2D projections from shells at exterior and centre of a LCO agglomerate in pristine ( $x = 0.96$  at C/2 and  $x = 0.95$  at 2C in  $\text{Li}_x\text{CoO}_2$ ), charged ( $x = 0.44$  at C/2 and  $x = 0.52$  at 2C) and discharged ( $x = 0.95$  at C/2 and  $x = 0.94$  at 2C) states for C/2 (b) and 2C (c) charge-discharge cycle. Dashed lines act as a guide to show regions of different Li-containing phases (colour scale). Scale bar in each image is  $5 \mu\text{m}$ . The ellipsoidal shell that encloses the exterior surface has semi-major axis radii of  $6.5$ ,  $6.5$  and  $7.3 \mu\text{m}$  whereas for the core it is  $1$ ,  $1$  and  $1.8 \mu\text{m}$ . Data across the two C-rates are measurements of identical agglomerates.

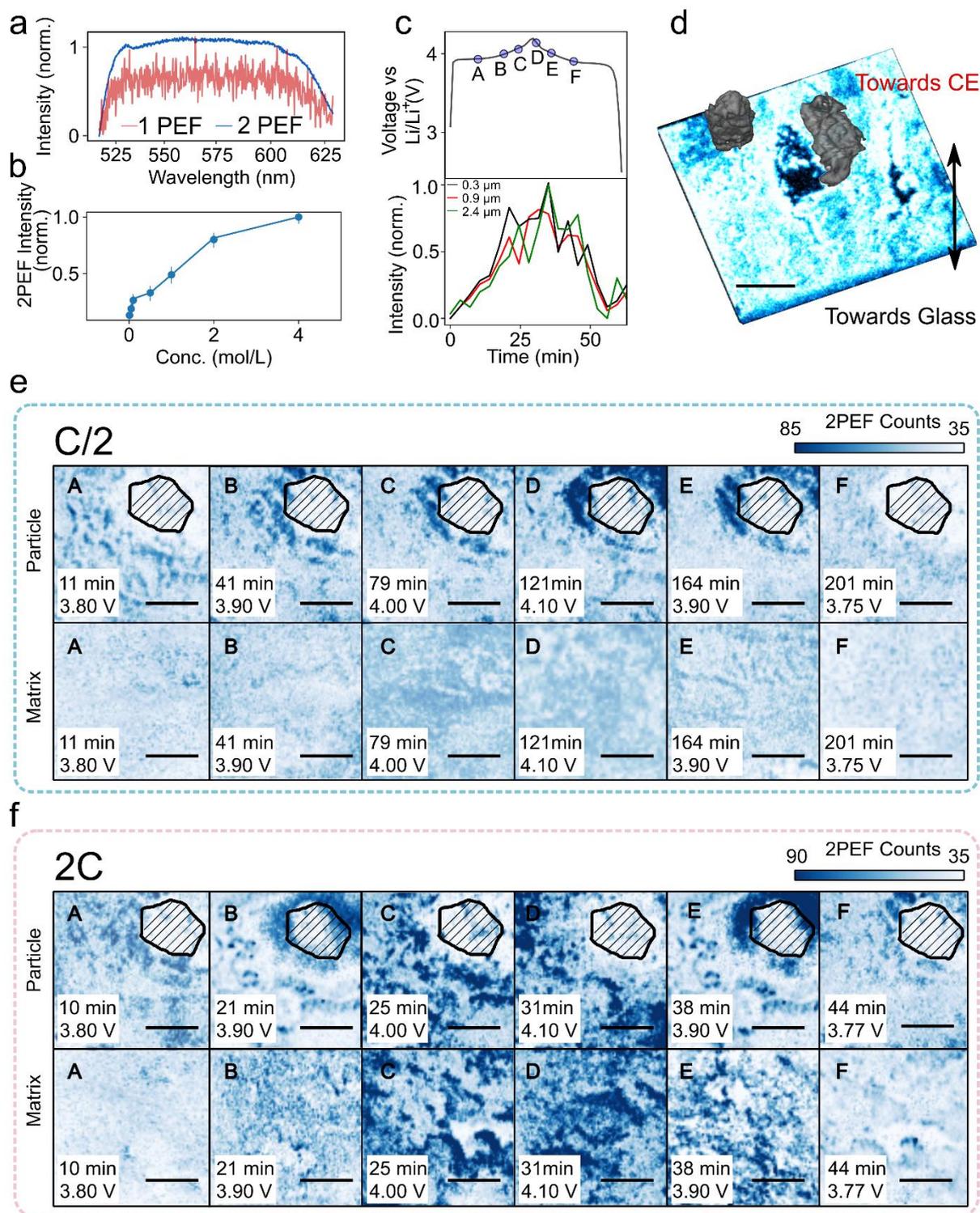
### Visualisation of electrolyte dynamics

Thus far, optical and other *operando* imaging methods such X-ray microscopy have been limited to visualising particles of active material. However, we can show that LSCRM offers the opportunity to image both lithium transport in solids, as demonstrated above, simultaneously with concentration gradients forming in the liquid electrolyte upon polarisation. Indeed,  $\text{LiPF}_6$ , the Li-conducting salt in the electrolyte used, has previously been observed to be a source of fluorescence at visible wavelengths,

with the exact origin albeit debated (see discussion in Laurence *et al.*<sup>74</sup>). Following these past observations, we find that under two-photon excitation (2PEF), the fluorescence of LiPF<sub>6</sub> salt (solid) is significantly more efficient than with one photon (1PEF), particularly above an excitation wavelength of 900 nm (Figure 6a). In Figure 6b we perform *ex-situ* 2PEF experiments on LiPF<sub>6</sub> solutions (in 1:1 vol.% ethylene carbonate/dimethyl carbonate) at different concentrations (ranging from 0.01 to 4.0 mol/L) and find a strong monotonous brightening with concentration. Figure 6c shows the evolution of the electrolyte 2PEF intensity, at different focal planes above a self-standing LCO electrode, during a charge-discharge cycle at 2C. In all cases the electrolyte 2PEF increases near linearly on charging to 4.2 V, *i.e.* on the release of Li-ions to the electrolyte, with a slight plateauing in the rate of brightening between 4.1 V – 4.2 V. Discharging, *i.e.* depletion of lithium from the electrolyte, results in dimming of the electrolyte 2PEF. The response is repeatable and of a similar magnitude over 8 cycles (see **supplementary information 11**). Together the *ex-situ* and *operando* measurements show the electrolyte 2PEF to be highly sensitive to the Li-ion concentration and indicate that the 2PEF must indeed derive from the LiPF<sub>6</sub> salt or a compound bound to it<sup>74</sup>. Furthermore, the measurements indicate that the 2PEF response is unrelated to cycling induced electrolyte degradation<sup>75–79</sup> or light induced degradation as we show in **supplementary information 11** where we monitor the visible and infra-red absorptions of LiPF<sub>6</sub> under prolonged exposure to different laser fluences and wavelengths. Consequently, it is suggested that the intensity of the 2PEF can be used to qualitatively track the Li-ion concentration in the electrolyte.

Our attention is then turned to examining the spatial distribution of salt concentration upon cycling. To do so, LSCRM experiments are repeated with an excitation of 1020 nm with two separate detectors, one for collecting particle reflectance and another for 2PEF (see Figure 2a; ~250 s per confocal stack). This allows for simultaneous volumetric imaging of the electrolyte and LCO agglomerates, as illustrated in Figure 6d. In Figure 6e, the 2PEF signal of the electrolyte in the plane ~300 nm above the top surface of the electrodes is plotted at selected time points (labelled A to F which correspond to points marked in the charge/discharge curves in Figure 6c) and spatial locations during a C/2 cycle (dashed black lines indicate regions of similar 2PEF intensity). Upon charge, the 2PEF intensity increases due to delithiation and an increase in the LiPF<sub>6</sub> concentration. A gradient in the 2PEF intensity also becomes present above potentials of 4.0 V around LCO agglomerates. This 2PEF/electrolyte concentration gradient, which decays relatively homogeneously away from agglomerates, originates from the difference between the rate of delithiation at the LCO surface and the rate at which PF<sub>6</sub><sup>-</sup> anions diffuse towards the LCO agglomerates<sup>80–83</sup> to balance Li<sup>+</sup> ions released and maintain electroneutrality<sup>76,84,85</sup>. Furthermore, at all potentials the 2PEF is relatively uniform in regions not containing LCO (bottom row) and upon discharge the concentration gradient around agglomerates disappears. Altogether, our results indicate a reversible process, as would indeed be expected for the formation of a concentration gradient around the active material upon cycling. The concentration gradient we observe extends as far

as  $\sim 1.5 \mu\text{m}$ . This is in agreement with previous theoretical and experimental studies which have shown electrolyte concentration gradients around electrode interfaces extending between  $500 \text{ nm}$ <sup>86</sup> and  $10\text{s}$  of microns<sup>76,81,87</sup> depending on the electrode, electrolyte composition (mass to volume ratio) and cycling conditions<sup>88,89</sup>. We note that on charging the electrode and then allowing it to relax to OCP the polarisation gradient rapidly disappears (see **supplementary information 11**). Switching to a greater C-rate, *i.e.* 2C, during the initial charge up to  $3.9 \text{ V}$  (A panels) the 2PEF of the electrolyte is brightest around LCO agglomerates with the intensity decaying approximately homogeneously away from the agglomerates. Increasing the potential to  $4.2 \text{ V}$  (B, C, D and E) results in a drastic increase in 2PEF intensity but the distribution of electrolyte 2PEF also becomes heterogeneous around both agglomerates and in regions of the electrode  $\sim 20 - 50 \mu\text{m}$  away from LCO agglomerates (bottom row of Figure 6f). The latter observation suggests inhomogeneous electrolyte diffusion within the self-standing electrode, as a result of the geometry and distribution of pores within the agglomerate-carbon/binder matrix<sup>90</sup>. This influence of the matrix can be expected at higher C-rates where the rate of (de)lithiation at the LCO surface and ionic diffusion rate in the electrolyte are more significantly mismatched<sup>91</sup>. Finally, on discharging to  $3.9 \text{ V}$  (panel F) the 2PEF distribution returns to its initial state, confirming that our observations do not stem from electrolyte degradation but are from (de)lithiation and local changes in salt concentration and concentration gradients within the electrolyte. Calibrating the 2PEF response (see **supplementary information 11** for method and limitations) allows us to approximately quantify the locally increased salt concentration,  $\Delta C_{\text{salt}}$ . At C/2 we find a  $\Delta C_{\text{salt}}$  of  $\sim +0.25 \text{ M}$  and at 2C a  $\Delta C_{\text{salt}}$  of  $\sim +0.3 \text{ M}$  on reaching the maximally charged state (panels C, D and E in Figure 6). The magnitude of these changes and their scaling with C-rate are in-line with previous spatially resolved studies<sup>83,85,92-96</sup> using similar electrolytes (albeit mostly around metal anodes<sup>76,97</sup> with lower spatial resolution<sup>81</sup>) as well as our own Raman measurements monitoring the concentration of  $\text{PF}_6^-$  anions (see **supporting information 11**). However, we note that the relatively thick electrodes used here ( $\sim 300 \mu\text{m}$ ) and the fact that our measurements are made from the far-side of the separator may result in slightly exaggerated salt concentration profiles. In NMC811, similar behaviour is observed as for LCO but with subtle differences requiring further in-depth analysis (see **supplementary information 11**).



**Figure 6: Two photon excited fluorescence from battery electrolytes. a.** Two-photon excited (2PEF; 1020 nm excitation; black) and one-photon excited (1PEF; 532 nm; red) fluorescence spectra of  $\text{LiPF}_6$  solid; a laser filter at 532 nm prevents resolution of the spectrum below this wavelength. We find the 2PEF to be significantly brighter than the 1PEF in  $\text{LiPF}_6$ , but this is challenging to quantify. **b.** Normalised maximum 2PEF intensity as function of  $\text{LiPF}_6$  concentration in 1:1 vol.% ethylene carbonate/dimethyl carbonate. Error bars are derived from 20 repeat measurements. **c.** Charge-discharge curve of electrode at 2C plotted as a function of charge state (top). Corresponding change in electrolyte 2PEF as a function of time/charge-state (bottom) at planes 0.3, 0.9 and 2.4  $\mu\text{m}$  above the ‘surface’ of

agglomerates. **d.** 3D volumetric reconstruction of electrolyte (blue, 2PEF) sitting above an electrode with agglomerate particle embedded in the electrolyte (grey, reflectance). We only image electrolyte surrounding/above the top plane agglomerates *i.e.* towards the glass observation window. Scale bar is 5  $\mu\text{m}$ . **e-f.** 2PEF from plane directly above agglomerates (marked in black with fill lines) for electrode cycled at  $C/2$  (d) and  $2C$  (e). 2 regions of interest are shown: surrounding an agglomerate and a region containing only the host matrix. Scale bar is 4  $\mu\text{m}$ . Data across the two C-rates are measurements of identical agglomerates.

## Conclusion and Outlook

This paper demonstrates that high-resolution LSCRM is a powerful tool for 3D microscopic tracking of particle structural transformations, Li-ion intercalation and electrolyte dynamics in operating batteries. Applying LSCRM to LCO and NMC811 important functional parameters, such as the velocity of Li-containing phase fronts from the surface to the core of agglomerates and the individual agglomerate volume change during a cycle, are obtained. These parameters are shown to agree well with classical *ex-situ* characterisation tools such as X-ray computed tomography and Raman microspectroscopy and ensemble measurements, but also display a large degree of heterogeneity due to the differing extent of reaction progression for agglomerates, an effect not captured by ensemble techniques. A unique advantage of LSCRM is the ability *in-operando* to simultaneously visualise electrolyte concentration gradients and lithiation heterogeneities at the agglomerate surface and agglomerate bulk in 3D, setting it aside from not only other optical methods, but also X-ray and electron microscopies. This solid/liquid sensitivity combined with the ability to: operate at high-acquisition speeds (key for studying fast charging materials), perform frequent sampling with no sample damage (essential in the case of delicate systems), examine aqueous and light and heavy element based systems (*i.e.* ones where X-rays are often drastically attenuated), measure across a range of particle loadings and probe low energy electronic transitions (which are directly related to carrier conduction and localisation), means the information content that can be obtained from LSCRM is also different to other imaging methods currently used in battery research (see **supplementary information 12**).

Further work measuring even more particles of different size<sup>98</sup> and crystallinity<sup>99</sup> is needed to place our material specific observations, such as the rapid lithiation observed in our LCO, on firmer footing. Although  $\text{LiPF}_6$  is the source of intrinsic electrolyte fluorescence, particular attention is needed to unravel the exact compound responsible, with both trace organic molecules bound to  $\text{LiPF}_6$  and halophosphates derivatives suggested to be responsible<sup>74,79</sup>. The influence of multiple coordinated Li-species on the 2PEF intensity must also be taken into account such that an even more quantitative assessment can be performed<sup>100</sup>, as well as methods to separate salt and solvent transport. Correlating the electrolyte distribution more precisely with the activity of agglomerate particle surfaces is crucial to further disentangle the contribution of both to (de)intercalation asymmetries. Understanding this interplay between particles and electrolyte is even more critical for reaction mechanisms encompassing

conversion<sup>101</sup> or alloying<sup>102</sup> for which particle cracking and/or volume expansion lead to electrolyte decomposition upon cycling. Although LSCRM can probe the entire volume of most materials used in secondary batteries some limitations remain in-terms of depth as well as speed and chemical specificity of the optical methods. However, using mid-infrared photo-thermal techniques<sup>103,104</sup>, wavefront shaping, and/or fibre optics to achieve imaging at greater depths (and in full-cells)<sup>105,106</sup>; wide-field schemes such as full field optical-coherence tomography<sup>107</sup> or spinning-disk confocal<sup>14</sup> to improve the speed; and combining LSCRM with chemically sensitive probes such as the Raman effect<sup>108,109</sup> will further push the utility of the technique and complement existing synchrotron imaging methods as a higher-throughput, more accessible and sustainable, (pre-) screening tool. Nonetheless, the label-free nature of LSCRM, outlined application framework and limited need to develop specialised equipment<sup>13</sup> means beyond batteries such methods will find use in the study of 3D solid and liquid phase dynamics in a range of functional materials and devices ranging from electrocatalysts<sup>110</sup> to bioelectronics<sup>111</sup>.

### **Data Availability**

All data is made freely available at [url to be added in proof].

### **Author Contributions**

R.P conceived the idea, performed optical experiments, analysed and interpreted the data and wrote the manuscript. L.V developed the ellipsoid projection code and along with F.X. developed, analysed and interpreted the optical tomography experiments. F.D. prepared *operando* cells and interpreted the data. J.M supervised all confocal microscopy measurements. T.G.P performed *ex-situ* reflection microscopy experiments. A.M., J.H.T and M.D.V provided experimental advice and interpreted the data. J.M.T. interpreted the data. L.G. performed SEM and wavelength resolved imaging experiments under the supervision of F.K.. K.M. performed and analysed X-ray computed tomography under the supervision of T.S.M.. S.G. and H.B.A supervised the project and interpreted the optical data. A.G. supervised the project, interpreted the data and wrote the manuscript. All authors contributed to preparation of the manuscript.

### **Acknowledgements**

R.P acknowledges financial support from Clare College, University of Cambridge and thanks (all Cambridge): Arjun Ashoka for insightful discussions on optical microscopy, Scott Keene for critical reading of the manuscript, Christoph Schnedermann and Alice J. Merryweather for advice on preparation of *operando* cells, Valentin Meunier and Jacques Louis (Collège de France) for assistance with *ex-situ* diffraction experiments and Prof. Ulrich F. Keyser for loan of a potentiostat and spectrometer. L.V. acknowledges funding from the Swiss National Science Foundation (grant P400P2\_199329). F.D acknowledges the École normale supérieure Paris-Saclay for his PhD scholarship. T.G.P. acknowledges the ESPRC NanoDTC (EP/L015978/1). The authors thank Prof. Nathalie Rouach (Collège de France) and Prof. Silvia Vignolini (Cambridge) for access and use of experimental resources. T.S.M. acknowledges support from the Faraday Institution (EP/S003053/1) LiSTAR project (FIRG014). K.M acknowledges support from the UCL H. Walter Stern Scholarship.

### **Methods**

### **Reagents**

Carbon black Super P Conductive (99+% metals basis, Alfa Aesar), ethylene carbonate/dimethyl carbonate 1:1 vol.% (Dodochem), LiCoO<sub>2</sub> (99.8% trace metals basis, Sigma Aldrich), LiFePO<sub>4</sub> carbon coated ( $\geq 99.5\%$ , battery grade, Sigma-Aldrich), LiPF<sub>6</sub> (under argon, 99.9%, Solvionic), 1M LiPF<sub>6</sub> in 1:1 vol.% ethylene carbonate/dimethyl carbonate (LP30, Dodochem), 60 wt % polytetrafluoroethylene dispersion in water (Sigma-Aldrich) and LiPF<sub>6</sub> solid (99.9%, battery grade, Sigma-Aldrich) were purchased and used without additional treatment. The synthesis of polycrystalline NMC811 particles was adapted from literature<sup>112</sup> to yield  $\sim 5 \mu\text{m}$  agglomerates with Ni, Mn and Co content ratios of 0.8, 0.1 and 0.1 respectively.

### **Preparation of LCO self-standing electrodes**

50.0, 112.5 and 145.8 mg of polycrystalline LCO, carbon black Super P conductive and 60wt% polytetrafluoroethylene (PTFE) dispersion in water were carefully mixed and grinded in a mortar with a pestle for 15 minutes. Ethanol was added from time to time in order to help the different components bind together and structure the mixture. When the mixture became thick it was taken out of the mortar and rolled on a clean surface for 15min in order to make a smooth and thick ( $\sim 300 \mu\text{m}$ ) electrode film with LCO, carbon and PTFE mass ratios of 20, 45 and 35% respectively. The as-prepared film was dried overnight in an 80°C oven under vacuum. For the preparation of electrodes with 60, 80 and 92wt% of LCO the same procedure as above was applied with the following masses used: 60wt%: LCO: 150 mg, Carbon: 50 mg, PTFE dispersion: 83 mg; 80wt%: LCO: 200 mg, Carbon: 25 mg, PTFE dispersion: 42 mg; 92wt%: LCO: 230 mg, Carbon: 10 mg, PTFE dispersion: 17 mg.

### **Preparation of NMC811 self-standing electrodes**

50.0, 112.5 and 87.5 mg of polycrystalline NMC811, carbon black Super P conductive and dry PTFE were carefully mixed and grinded in a mortar with a pestle for 15 minutes in an argon-filled glovebox. A few drops of acetonitrile were added from time to time in order to help the different components bind together and structure the mixture. When the mixture became thick it was taken out of the mortar and rolled on a clean surface inside the glovebox for 15min in order to make a smooth and thick ( $\sim 300 \mu\text{m}$ ) electrode film with NMC811, carbon and PTFE mass ratios of 20, 45 and 35% respectively.

### **Preparation of materials for *ex-situ* studies**

#### Lithium Cobalt Oxide, Lithium Nickel Manganese Cobalt Oxide and Lithium Iron Phosphate (LFP)

LCO, NMC811 and LFP powder synthesized or purchased as previously described above were ball-milled for 20 minutes with 10% in weight of carbon Super P. Swagelok cells were assembled in Ar-filled glovebox with approximately 10 mg of powder, using two whattman separators filled with LP30 electrolyte and with metallic lithium as counter electrode. Cells were cycled with fixed capacity, before powder was recovered and washed two times with DMC, and then centrifuged and dried for 1 hour under vacuum. This allowed for the preparation of LCO, NMC811 and LFP powders with different states of charge/lithium fraction for *ex-situ* experiments.

#### Lithium hexafluorophosphate solutions in 1:1 vol.% ethylene carbonate/dimethyl carbonate

In an argon-filled glovebox, 3.1, 15.2, 30.4, 151.9, 303.8, 607.6 and 1215.2 mg of LiPF<sub>6</sub> were dissolved in 2.0 mL of 1:1 vol.% ethylene carbonate/dimethyl carbonate (EC/DMC) mixture to respectively yield 0.01, 0.05, 0.1, 0.5, 1.0, 2.0 and 4.0 mol.L<sup>-1</sup> LiPF<sub>6</sub> solutions in EC/DMC.

### ***Ex-situ* reflection microspectroscopy**

Reflection microspectroscopy of individual battery agglomerates was performed on a customised Zeiss Axio microscope. Illumination was provided using a halogen lamp (Zeiss HAL100) focussed by a 50 $\times$ /0.4 N.A. objective (Nikon, T Plan SLWD). Reflected light was spatially filtered (collection spot diameter  $< 5 \mu\text{m}$ ) using a 100  $\mu\text{m}$ -diameter optical fibre (Avantes FC-UV100-2-SR) mounted in confocal configuration and connected to a spectrometer (Avantes AvaSpec-HS2048). Agglomerates

were pressed onto glass microscope slides before measurement and encapsulated with a second cover glass inside any Ar glovebox to avoid aerial oxidation/hydrolysis. A minimum of 20 individual agglomerates (well separated from any carbon) were used to obtain spectra.

### **Agglomerate size error estimation using time-domain optical coherence tomography**

Time-domain optical coherence tomography (TD-OCT) was used to generate the MIP and F1 images discussed in the main text. F1 was taken from the position in the time-gate position where there was maximum electric field. For the TD-OCT setup, a beam delivered from a Ti:sapphire laser (MaiTai HP, Spectra-Physics) was divided into two paths by a polarizing beam splitter. On one path the light was focused onto the back focal plane of a 0.8 N.A. objective (Olympus) which delivers collimated light on the sample. The reflected light from the sample is collected by a beam splitter and recombined with the second path on another beam splitter. Light on this second (reference) arm does not pass onto the sample but onto a delay stage (Newport) which controls temporal overlap between reference and signal arms. The combined signal and reference light are imaged onto a charged coupled device camera (Manta G-046B, Allied Vision). A polarizer in front of the camera ensures that only light with a selected polarization is measured. The reference arm is scanned to measure the electric field amplitude as a function of time-delay (focal position) within the sample. From this trace and the MIP and F1 images can be generated.

### **X-ray computed tomography**

High-resolution, X-ray nano-computed tomography (CT) was performed on a triangular tip of the electrode using a ZEISS Xradia 810, 5.4 keV Ultra nano-CT instrument (Carl Zeiss Inc.) in a large field of view mode. Sequential tomography sequences using absorption contrast and Zernike phase contrast were collected and later stitched together in the Dual Scan Contrast Visualizer (DSCoVer) software. A pixel binning of 2 was used for each scan resulting in a pixel size of ca. 128 nm. The sample was rotated through 180° with radiographs collected at discrete angular intervals amounting to 1601 projections for each of the absorption contrast and phase contrast scans. Scans were reconstructed using XMReconstructor software (Carl Zeiss Inc.) and the resulting images had a 50% contribution from the phase mode and 50% contribution from the absorption mode. Data was then processed using the Avizo 3D visualization software package (Avizo, version 2020.2 FEIO, VSG). The initial image was cropped to 502 × 503 × 286 voxels at a size of 128.0 × 128.0 × 128.0 nm per voxel. Segmentation was carried out *via* a simple thresholding algorithm. The "Separate Objects" module was applied to detect and subtract out surfaces that separate agglomerate particles. The "Opening" module was then used to reduce unnecessary artifacts and excess noise by removing small objects and smoothing object boundaries. Finally, "Label Analysis" was applied to collect statistical data of each particle in the sample.

### **Raman Microspectroscopy**

Raman spectroscopy of the samples was performed using a home-built 532 nm based Raman microscope previously described in Donaldson *et al.*<sup>113</sup> (see also for analysis methods). A high numerical aperture (NA) oil-immersion objective (Nikon 60×/1.4NA oil) was used to ensure high-resolution imaging and increase collection efficiency. The maximum pump power before the objective was ~20 mW, a power level that ensured no degradation of samples.

### **Scanning electron microscopy**

Scanning electron microscopy (SEM) images were acquired on a Gemini SEM 360 microscope from Zeiss, using an acceleration voltage of 5 kV. Details about the 3D reconstruction based on images acquired at different tilt angles can be found in **supplementary information 7**.

### **Wavelength resolved reflection imaging**

The wavelength-resolved reflection imaging of a LCO electrode was performed on an Axio Observer 7 inverted microscope from Zeiss. The sample was illuminated from the backside by means of an unpolarised white light source through a 63× oil immersion objective with a numerical aperture of 1.4

(Plan Apochromat, Zeiss). The light reflected by the sample was then collected by a CMOS colour camera (Axiocam 705 color, Zeiss) through the same objective, which allows probing three wavelength regions at once. Cycling was performed using a CHI 760e potentiostat (CH Instruments), in the same cell as the one used for the LSCRM experiments.

### **Ex-situ one and two-photon excited fluorescence spectroscopy**

For liquid measurements 1 mm path length glass cuvettes were filled with Lithium hexafluorophosphate solutions in 1:1 vol.% ethylene carbonate/dimethyl carbonate of a predefined concentration. Cuvettes were sealed in an Argon containing glove box before measurement. For measuring the solid LiPF<sub>6</sub>, powder was sandwiched between two microscope coverslips. The coverslips were sealed together with epoxy resin inside an Argon glove box before measurement. For one photon excitation light from a 532 nm laser (Laser Quantum Gem, CW, 532 nm, 100 mW) was focussed on to the sample with a 50 mm focal length lens (Thorlabs). The fluorescence was collected collimated and focussed onto the fibre port of a spectrometer (Ocean Optics, Ventanna 532 nm). The exciting laser light was separated from the fluorescence using a dichroic mirror (Semrock 532 nm RazorEdge). For two photon excited fluorescence experiments the same configuration was used except the exciting light was the 1020 nm output of a Ti:sapphire laser (MaiTai HP, Spectra-Physics) and an additional 1000 nm short pass filter (Thorlabs) was placed in front of the spectrometer to remove any of the exciting beam. We note that the 2PEF efficiency dramatically decreased with wavelength and when exciting below 900 nm (450 nm one photon excited fluorescence) very little emission was observed. For 1PEF the laser power at the sample was ~10 mW (continuous wave laser) and for 2PEF the fluence at the sample was ~15 μJ cm<sup>-2</sup> (pulsed laser).

### **Operando Laser Scanning Confocal Microscopy**

Laser scanning confocal microscopy was performed using a custom-built microscope. The output of a Chameleon Ultra II Ti:Sapphire laser (Coherent), was directed to a laser (galvo-) scanning microscope body (Scientifica), with x-y-z piezo control. The reflected light from the sample was collected and focussed through a 0.7 A.U pinhole for spatial filtering. Dichroic mirrors (500-620 nm and >650 nm) spectrally filtered the light which was focussed onto two silicon avalanche photodiodes (APDs). Recording was performed using the Abberior Instruments Inspector 16 software. Depending on the exact experiment and signal magnitude the pixel dwell time was varied between 10 and 20 μs, with regions of between 300 × 300 and 600 × 600 pixels scanned again depending on the agglomerates of interest. Pixels ranged between 40 and 80 nm in size. Overall this resulted in z-stack acquisition times of between 100 and 220s, although for small agglomerates acquisition times down to 60s could be achieved. The coherence length of the laser used here is <2 μm such that reflection interference contrast effects can be minimised. In all experiments a laser fluence at the sample of <10 μJ cm<sup>-2</sup> was used. For experiments shown in shown in Figure 1b LEDs at the appropriate excitation wavelength were used as the source.

The *operando* half-cell (ECC-Opto-Std; El-Cell GmbH) was modified to accommodate a 1.4 N.A objective and 0.15 – 0.17 μm thickness coverslips (see **supplementary information 13**). To prevent the build-up of artificial regions of higher/lower salt concentration when preparing our cells, we fill the cell with electrolyte (*i.e.* not just wetting of the separator). All cycling was performed using a Gamry Reference 600 potentiostat, with homebuilt software to control synchronisation between the potentiostat and microscope. Throughout the manuscript a C-rate of 1 C corresponds to a charge in 1 h.

### **Image processing**

Image processing was performed with custom Python, Matlab and ImageJ<sup>114</sup> scripts (see **supplementary information 2 to 7** for further details of algorithms). Before performing any analysis or image correction, xyz image registration was performed using the ImageJ registration plugin<sup>115</sup>.

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