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## Supplementary Information

### Porosity Percentage Calculation

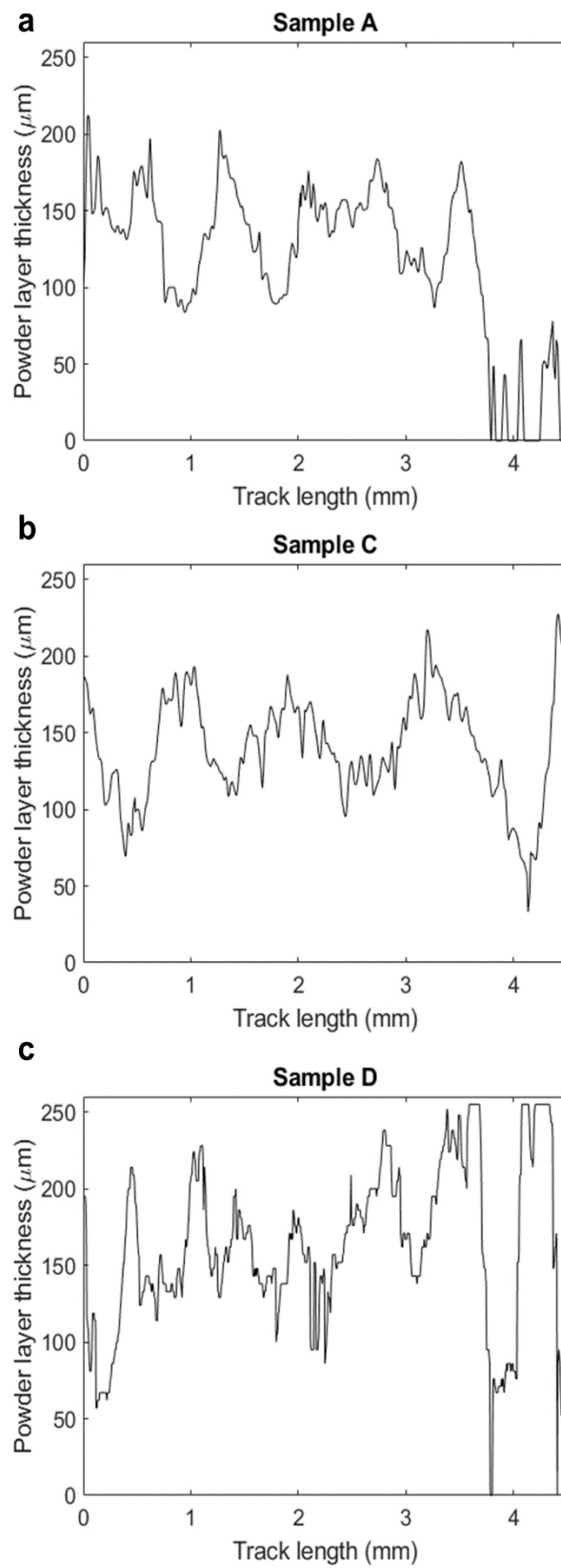
The percentage of porosity in the samples was calculated using the  $\mu$ CT data. The total volume of the track above the substrate, with all pores filled, was measured. It is not possible to determine the volume of remelting into the substrate from the  $\mu$ CT scan, however a basic estimation has been calculated using a boundary box at the widest parts of the track, and a depth into the substrate at the deepest keyhole for each condition. This volume plus the track volume (above the substrate) were used as the estimation for total track volume. The volume porosity was then calculated as a percentage of this. This is a slight overestimation of total track volume, and thus underestimation of porosity percentage. The error was calculated by estimating a triangular section through the substrate, using the width of the boundary box and depth of the keyhole pores. This gave an error of 2 – 6 % for the porosity percentage calculation.

### Supplementary Table 1

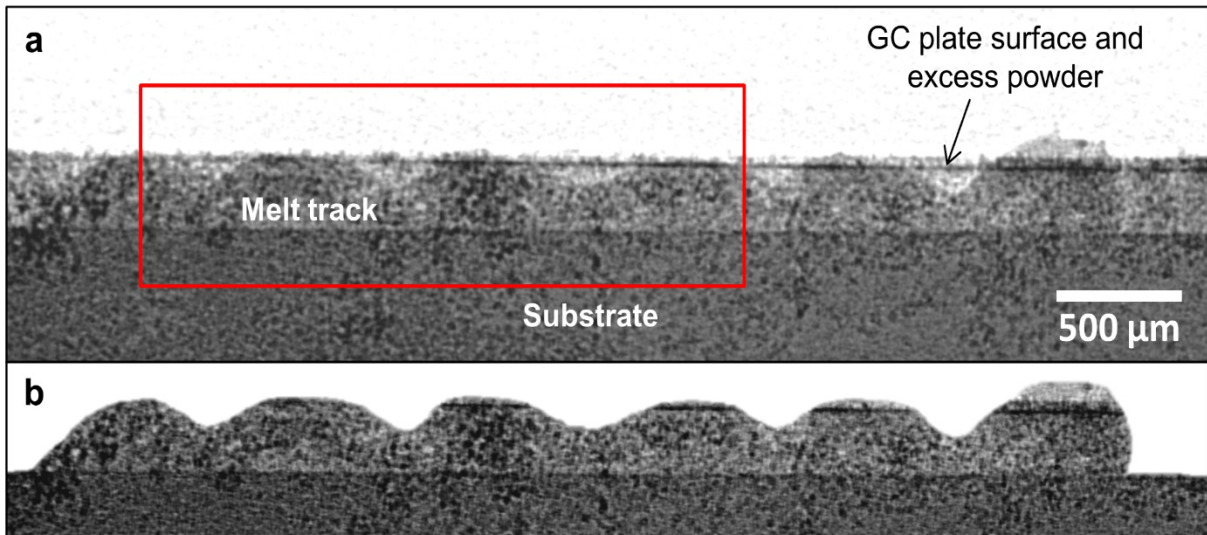
Linear energy density values from previous work and the present study. Hatch spacing has not been included in this calculation ( $LED = P/vt$ ) for direct comparison to the energy densities presented here.

Laser Power, P (W)	Scan Speed, $v$ (mm s <sup>-1</sup> )	Powder layer thickness, $t$ (mm)	LED (J mm <sup>-2</sup> )	Reference
175 – 400	500 – 1100	0.03	12	[1]
275	750	0.05	7.3	[2]
400	50 – 125	0.25	13 - 32	[3]
100	560	0.04	4.5	[4]
100 – 400	400 – 1600	0.05	5 - 10	[5]
42	200	0.03	7	[6]
200	200 – 400	0.1	5 – 10 (nominal) 3 – 9 (adjusted)	<b>Present work</b>

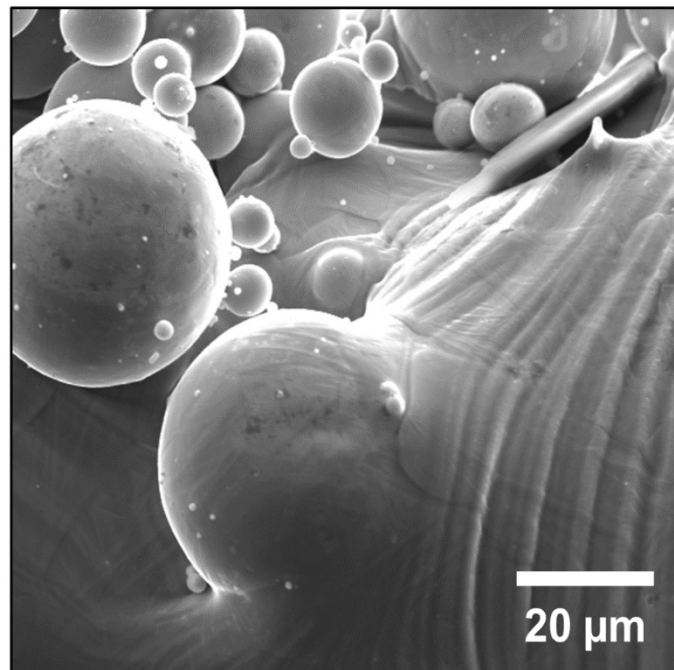
**Supplementary Figure 1:** Graphs showing the change in layer 5 deposited powder thickness in (a) Sample A, (b) Sample C, and (c) Sample D.



**Supplementary Figure 2:** (a) Background corrected but unedited radiograph of Sample A layer 3 final morphology, with red highlighted region correlating to (b – d) in **Figure 3**. (b) Background, GC plate surface, and excess powder removed from the image to highlight surface shape. A section on this image was taken for **Figure 3c**.



**Supplementary Figure 3:** SEM image of Sample D, showing partially melted powder particles adhered to the track surface.



**Supplementary Video 1:** Sample A, Layer 1, showing ca. 50  $\mu\text{m}$  build height, and laser keyhole ca. 150  $\mu\text{m}$  below the powder surface.

**Supplementary Video 2:** Sample A, Layer 5, showing uneven track surface, and a large amount of powder and particle spatter.

**Supplementary Video 3:** Sample C, Layer 5, showing prominent surface undulations.

**Supplementary Video 4:** Sample D, Layer 5, showing uneven track surface and lack of fusion porosity between layers.

**Supplementary Video 5:** Sample B, Layer 5, showing large surface undulations and spatter, with a deep keyhole up to ca. 250  $\mu\text{m}$  below the powder surface.

**Supplementary Video 6:** Sample B, Layer 5, background subtracted image to highlight powder layer thickness (dark grey), keyhole, and track undulations.

**Supplementary Video 7:** Sample C, Layer 1, showing ca. 100  $\mu\text{m}$  track height at the ends of the track, with ca. 30  $\mu\text{m}$  track height in the centre of the track. Powder spatter and porosity formation is visible. The keyhole depth was ca. 215  $\mu\text{m}$  below the powder surface.

**Supplementary Video 8:** Sample C, Layer 1, cropped to ROI for keyhole porosity formation in the substrate.

**Supplementary Video 9:** Sample C, Layer 1, cropped to ROI, and locally averaged to reveal changing keyhole shape and size. Averaging method removes visible pores once they become stationary within the track.

**Supplementary Video 10:** Sample C Layer 2, full track, showing slight variations in track height and deep laser penetration, remelting all of layer 1.

**Supplementary Video 11:** Sample C, Layer 2, cropped to ROI for keyhole porosity formation in the substrate.

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# ***In situ* radiographic and *ex situ* tomographic analysis of pore interactions during multilayer builds in laser powder bed fusion**

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## **Abstract**

Porosity and high surface roughness can be detrimental to the mechanical performance of laser powder bed fusion (LPBF) additive manufactured components, potentially resulting in reduced component life. However, the link between powder layer thickness on pore formation and surface undulations in the LPBF parts remains unclear. In this paper, the influence of processing parameters on Ti-6Al-4V additive manufactured thin-wall components are investigated for multilayer builds, using a custom-built process replicator and *in situ* high-speed synchrotron X-ray imaging. In addition to the formation of initial keyhole pores, the results reveal three pore phenomena in multilayer builds resulting from keyhole melting: (i) healing of the previous layers pores via liquid filling during remelting; (ii) insufficient laser penetration depth to remelt and heal pores; and (iii) pores formed by keyholing which merge with existing pores, increasing the pore size. The results also show that the variation of powder layer thickness influences which pore formation mechanisms take place in multilayer builds. High-resolution X-ray computed tomography images reveal that clusters of pores form at the ends of tracks and when variations in the layer thickness and melt flow cause irregular

29 remelting and track height undulations. Extreme variations in height were found to lead to lack  
30 of fusion pores in the trough regions. It is hypothesised that the end of track pores were  
31 augmented by soluble gas which is partitioned into the melt pool and swept to track ends,  
32 supersaturating during end of track solidification and diffusing into pores increasing their size.

33

34 **Keywords:** Additive manufacturing, laser powder bed fusion, *in situ* X-ray imaging, Ti-6Al-4V,  
35 porosity

36

## 37 **1. Introduction**

38 Laser powder bed fusion (LPBF), also known as selective laser melting (SLM), is a rapidly  
39 evolving area of additive manufacturing (AM) technology using a layer by layer fabrication of  
40 3D components from powder materials [1]. LPBF spreads layers of powder, which are then  
41 locally melted by a focussed laser beam according to a computer-generated programme. This  
42 process repeats until a full 3D part is produced [2]. The process is capable of producing  
43 components with complex geometries that cannot easily be made by conventional processing  
44 routes, *e.g.* casting [3]. The physics behind laser-powder interactions, *e.g.* the laser coupling  
45 to the metal surface and the melt pool dynamics, is very complex [4,5] and is related to both  
46 the material and process parameters.

47 Correlations between LPBF processing parameters and final part quality have been  
48 investigated through experimental [6,7] and modelling methods [8,9]. A number of studies  
49 have also investigated the transition from conduction melting to keyhole melting [10,11] as a  
50 function of process parameters. The volumetric energy density (*VED*) is defined by:  
51  $VED = P/vht$  [12], where *P* is the laser power, *v* is the laser scan speed, *t* is the powder layer  
52 thickness, and *h* is the hatch spacing. It is known that high energy density (*i.e.* high laser  
53 power coupled with low scanning speed) results in deep laser penetration (known as the  
54 keyhole mode) and often an increase in laser-induced features and spatter [13,14]. Very low  
55 energy density has been shown to produce wide, shallow melt pools, leading to discontinuous



56 tracks [15], interlayer porosity [16], and a heterogenous microstructure [17]. The  
57 microstructural evolution [18] and mechanical properties [19] of Ti-alloys produced by LPBF  
58 have also been investigated as a function of process parameters. However, most of the  
59 microstructural studies have been *ex situ* and do not reveal the underlying mechanisms  
60 controlling the development of the observed features.

61 A key area of interest in LPBF is the formation of internal porosity in the solidified  
62 structures. Lack of fusion [20], gas pores [21] and keyhole pores [10] are all known to occur  
63 in LPBF components. The former two pore types are also frequently found in electron beam  
64 melting AM [22,23]. Lack of fusion pores are often flat and elongated, arising from low energy  
65 density conditions where the prior track is not remelted. Gas pores are small and spherical  
66 and, for Ti-based alloys, may be due to the high solubility of hydrogen in the molten metal.  
67 Hydrogen gas can be absorbed from water vapour or contamination associated with the  
68 powder or the environmental chamber [24]. During cooling, the hydrogen solubility rapidly  
69 decreases and gas pores can nucleate in the melt [25,26]. The rapid cooling rates do not allow  
70 for diffusion and pore growth before solidification [27–29] and pores have been observed to  
71 be 10 – 300  $\mu\text{m}$  in diameter. Pre-existing gas pores in the powder particles, arising from the  
72 atomisation manufacturing process, can also be a source of porosity in LPBF tracks. These  
73 pores can be entrained into the melt pool and can coalesce into larger pores [30,31].

74 The keyhole melting regime [32], although producing efficient energy transfer, can lead  
75 to the formation of keyhole pores [33] when a metal vapour/gas-filled bubble becomes trapped  
76 due to melt pool oscillations, unstable keyhole walls [34], or other complex hydrodynamic  
77 behaviour [35]. These bubbles can be composed of trapped inert chamber gas [4], metal  
78 vapour [10], or a combination of both. They are usually located near the bottom of the keyhole  
79 because rapid solidification prevents them from rising to the top of the melt [33,36].

80 A lack of understanding of the complex laser-matter interactions present during LPBF,  
81 including the formation of a dynamic melt pool, spatter (powder and droplet), metal vapour,  
82 plasma, and irregular powder entrainment [37], is hindering a more widespread uptake of  
83 LPBF technologies and thus further investigations are needed to help resolve this. Much of

84 the porosity analysis work has been carried out by *ex situ* studies, supported by computational  
85 models, to investigate formation hypotheses. *In situ* experiments with synchrotron X-ray  
86 radiography can provide critical information to substantiate these models and theories [38] by  
87 observing process phenomena such as spatter [39], melt pool flow [37,40], melt pool size  
88 [34,41], keyhole melting [36,42] and porosity formation [32,43–45].

89 *In situ* laser melting experiments on a solid substrate have determined a relationship  
90 between the laser power and scan velocity, and the transition from conduction to keyhole  
91 mode melting regimes, causing a change in the shape of the melt pool and keyhole [34]. In  
92 the case of LPBF, laser beam spot size and powder layer thickness can also affect the energy  
93 density transition to keyhole melting [10]. Deep, narrow cavities were described as the  
94 unstable keyhole zone, which led to the formation of keyhole pores [34]; the depth of these  
95 pores increased as energy density increased [42]. High-speed X-ray imaging has been used  
96 to observe the formation of these keyhole pores *in situ* during laser scanning [32,42,43,46].

97 Pore movement within the melt pool has also been observed during LPBF [37,47] by *in*  
98 *situ* studies. Pores were shown to be swept with the Marangoni flow of the molten pool [37].  
99 Pore shrinkage [42] and spheroidization [32] during solidification are other phenomena  
100 observed via X-ray imaging. Furthermore, oxidised powder has also been shown to  
101 significantly increase the internal porosity content [40], which is a key concern for reactive  
102 metals such as titanium and aluminium. These *in situ* studies have also been supplemented  
103 with porosity analysis via micro-computed tomography ( $\mu$ CT) [16,30,48–50].

104 However, to date, most *in situ* synchrotron studies of the melt pool and pore formation  
105 in LPBF have involved the melting of a single layer of material. Experiments have been carried  
106 out on: a range of materials in overhang (melting onto powder) conditions [37,40,51]; a bare  
107 substrate without powder [34]; and on a substrate with a single layer of powder [32,36,41–44].  
108 Since LPBF components are formed by many layers deposited on top of one another, an  
109 understanding of the multilayer process is essential. In the present study, we characterise  
110 multilayer builds *in situ* using high-speed synchrotron X-ray radiography, capturing the rapid  
111 dynamics of laser remelting, layer cohesion (or lack thereof), and changes in pore formation.

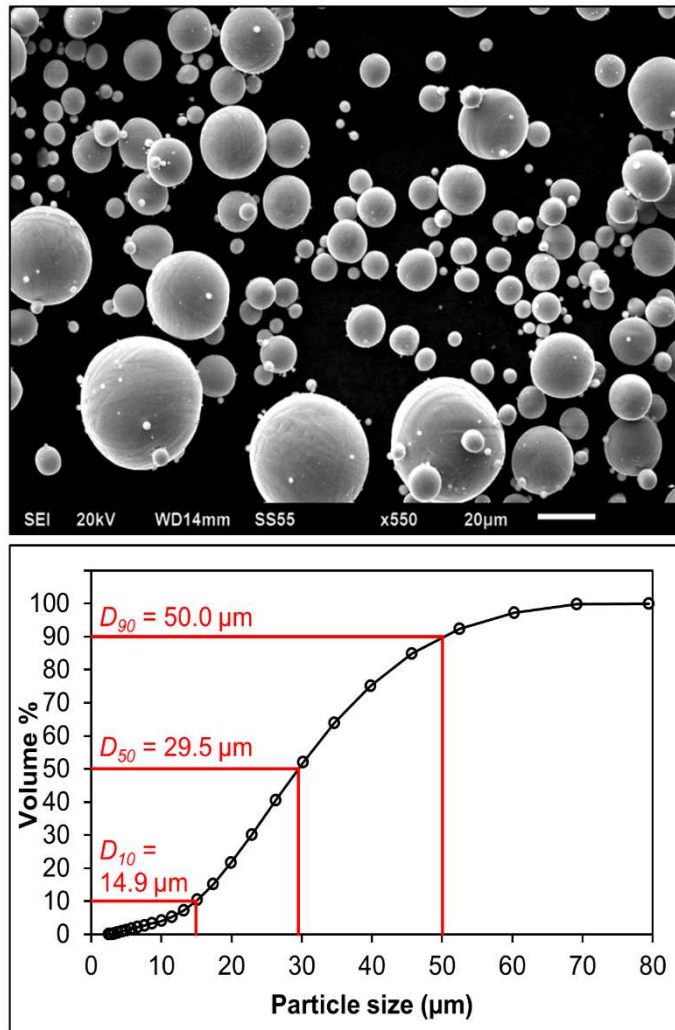
112 To conduct this work, a laser *AM in situ* and *operando* process replicator (ISOPR) [37] was  
113 developed to build multilayer tracks *in situ* during LPBF. The building of multilayer thin walls  
114 on a substrate was observed using four processing conditions (which gave a range of energy  
115 density values), and the influence of the powder layer thickness has also been investigated.  
116 The keyhole operating mode was selected as there is a need for a better understanding of  
117 porosity formation, and whether it can be controlled or minimised in this mode. Additionally,  
118 the track morphology and internal porosity were characterised *ex situ* by  $\mu$ CT, to measure  
119 pore sizes and distributions, and better understand how changing the energy density can  
120 minimise pores and optimise track morphology.

## 121 2. Methods

### 122 2.1 Materials

123 Commercially pure (CP) titanium substrates with dimensions of 46 mm x 17 mm x 0.3 mm  
124 were used throughout this study. 0.3 mm substrate thickness was selected as the best  
125 compromise between realistic build conditions and sufficient X-ray transmission for good  
126 image quality. The melt pool width is less than the substrate thickness, so the influence of the  
127 walls is minimal, and the overall effects of sample dimensions on the powder bed is negligible  
128 [37].

129 Gas atomised (GA) Ti-6Al-4V powder (supplied by Goodfellow, UK) with a particle size  
130 distribution of 15 – 45  $\mu$ m was selected. The powder morphology was examined by scanning  
131 electron microscopy (SEM) in secondary electron imaging mode at 20 kV (JEOL JSM-6610LV,  
132 Tokyo). **Figure 1a** shows an essentially spherical morphology of powder, with few satellite  
133 particles. The particle size distribution was measured using a Mastersizer 2000 laser  
134 diffractometer (Malvern Instruments Ltd., UK). **Figure 1b** displays the cumulative size  
135 distribution plot for the powder where the  $D_{10}$ ,  $D_{50}$ , and  $D_{90}$  symbols represent the particle  
136 diameters for 10 %, 50 %, and 90 % of the cumulative volume (%). The size distribution and  
137 the median ( $D_{50}$ ) particle size are representative of those typically used in LPBF.



138

139 **Figure 1:** (a) SEM image of Ti-6Al-4V gas atomised powder particles used in this study. (b)

140 Cumulative powder particle size distribution with  $D_{10}$ ,  $D_{50}$ , and  $D_{90}$  labelled as determined by

141 laser diffractometry.

142

143

## 144 **2.2 *In situ* and *operando* process replicator**

145 The experimental setup consists of a laser additive manufacturing *in situ* and *operando*  
146 process replicator (ISOPR) [37]; a small scale laser powder bed system, with the ability to  
147 produce multilayer parts. The ISOPR consists of: a continuous wave 200 W Yb-doped fibre  
148 laser, with a wavelength of 1030-1070 nm (SPI Lasers Ltd, UK); an environmental chamber  
149 (**Figure 2a**) containing a powder bed with 40 – 60 % powder packing density; and a series of  
150 laser beam optics, namely a collimator, beam expander, and an X-Y galvanometer scanner to  
151 control the laser line scanning, with an f-theta lens to focus the laser to a *ca.* 50  $\mu\text{m}$  diameter  
152 spot ( $4\sigma_{xy}$ ) [37]. The environmental chamber was evacuated and backfilled with argon gas at  
153 a constant flow rate of 4 l  $\text{min}^{-1}$  during experiments to maintain an inert atmosphere and  
154 prevent oxidation of the powder and molten pool.

155 The powder bed sample holder (**Figure 2b** and **c**) encases the substrate between two  
156 glassy carbon (GC) plates, which are used for their near transparency to X-rays. For each  
157 layer, the substrate is lowered by a pre-set layer thickness of 100  $\mu\text{m}$ , and the cavity between  
158 the GC plates is filled with Ti-6Al-4V powder using a vibrating gravity-fed powder hopper. A  
159 scraper behind the powder hopper ensured an evenly levelled powder surface on the  
160 deposited layer. This process is repeated for each subsequent layer in a build for 5 layers.

## 161 **2.3 Experimental build conditions**

162 Four processing conditions were selected, detailed in **Table 1**, henceforth referred to as  
163 Sample A, B, C, and D. Typical LPBF powder layer thicknesses range from 20 – 100  $\mu\text{m}$  [52],  
164 however recent studies have investigated powder layers up to 250  $\mu\text{m}$  for improved build rate  
165 [53,54]. 100  $\mu\text{m}$  was selected for this study for the best radiography image quality within the  
166 standard operating range. The nominal linear energy density (*LED*) was calculated for each  
167 condition:  $LED = P/vt$  [17], where  $P$  is the laser power,  $v$  is the scan velocity, and  $t$  is the  
168 powder layer thickness. *LED* is an adaptation of the volume energy density (*VED*) equation  
169 [12] where a single track was employed, and thus hatch spacing ( $h$ ) was equal to 1.  
170 **Supplementary Table 1** shows some examples of typical LPBF operating conditions and *LED*

171 values for comparison to the present study. The calculation shows that the energy density of  
172 this work is within the range used in typical industrial LPBF machines. *VED or LED* have been  
173 used in a number of studies [37,55–61] to correlate possible links between processing  
174 parameters, resultant energy densities, and build quality. However, *VED* and *LED* are not  
175 necessarily a reflection of absorbed energy density, due to powder ejection, and laser  
176 reflections within the keyhole [62] for example. The calculation also does not capture complex  
177 physics and is thus limited [55].

178 The ISOPR was employed to build a single line scan per layer for 5 layers onto a CP Ti  
179 substrate using a bi-directional scan strategy, alternating scan direction with each deposition  
180 layer. Layers 1, 2 and 5 were captured by synchrotron X-ray radiography. In the case of  
181 Sample A, a snapshot of the final track morphology was also recorded after layers 3 and 4.

## 182 **2.4 *In situ* synchrotron X-ray radiography**

183 *In situ* X-ray radiography experiments were carried out at the ID19 imaging beamline at the  
184 ESRF - The European Synchrotron, Grenoble, France [63]. The hard X-ray beamline uses a  
185 polychromatic beam, produced by two U32 undulators. The mean energy was ca. 30 keV. The  
186 attenuated X-ray beam was converted into visible light using a 200  $\mu\text{m}$  thick LuAG:Ce  
187 scintillator (Ce-doped Lu<sub>3</sub>Al<sub>5</sub>O<sub>12</sub>, Crytur, Czech Republic) and images were recorded  
188 with a FASTCAM SA-Z 2100K (Photron, USA) 4x magnification, at 40,000 fps, an exposure  
189 time of 12.6  $\mu\text{s}$  and an effective pixel size of 4.76  $\mu\text{m}$ . The field of view was  
190 4.8 mm (width) x 2.4 mm (height).

## 191 **2.5 Micro-computed Tomography ( $\mu\text{CT}$ )**

192 All samples were examined post-build by  $\mu\text{CT}$  using a Nikon XTH225 (Nikon, Japan) to image  
193 and quantify internal porosity, **Figure 2d**; 3175 projections were collected, each with an  
194 exposure time of 1 s. The data was reconstructed using filtered-back projection and beam-  
195 hardening algorithms embedded in CT Pro (Nikon), resulting in a voxel size of 2.7<sup>3</sup>  $\mu\text{m}^3$  [51].  
196 The image analysis was performed using Avizo 9.3 (ThermoFisher Scientific). A kernel of  
197 3 x 3 x 3 median filter was applied to remove noise, and a threshold applied to analyse internal

198 pores [50]. Any pore with a volume of < 27 voxels was discounted from the analysis. Pore  
199 volume was converted from the number of voxels to equivalent diameter ( $D_{eq}$ ) using the  
200 equation:

$$201 \quad D_{eq} = \sqrt[3]{\frac{6V}{\pi}}$$

202 where  $V$  is the volume of the pore [50] and hence 27 voxels is approximately a  $D_{eq}$  of 10  $\mu\text{m}$ .

203 Pore sphericity,  $\psi$ , was calculated using the sphericity equation [64]:

$$204 \quad \psi = \frac{\pi^{\frac{1}{3}}(6V_p)^{\frac{2}{3}}}{A_p}$$

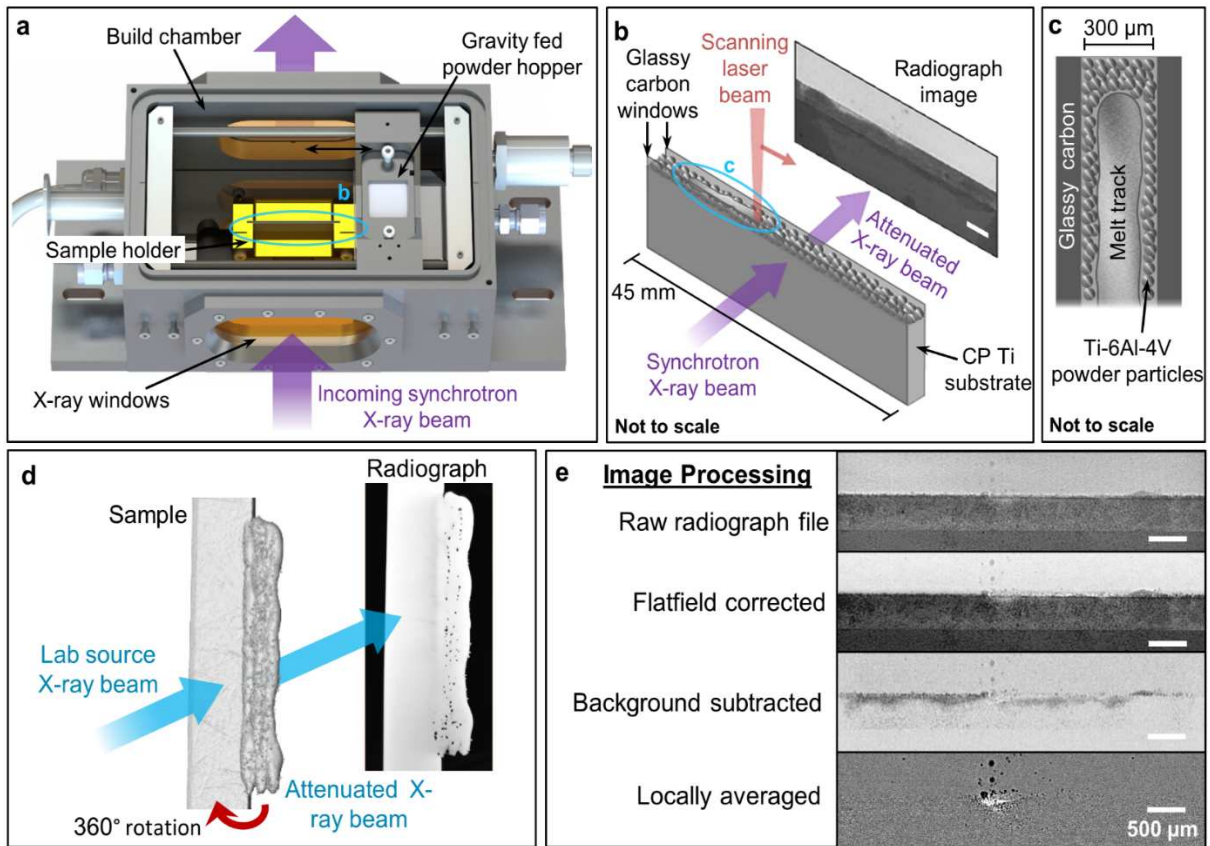
205 where  $V_p$  is the volume of a pore, and  $A_p$  is the surface area of a pore. Sphericity of pores with  
206 very small volume could exceed a value of 1 because the surface area measurements in Avizo  
207 9.3 are based on chordal approximations, whereas volume measurements use the number of  
208 voxels and no approximations; this effect is more prevalent as voxel number reduced [65].

## 209 **2.6 Image analysis**

210 The open-source software Fiji version 1.52i [66] was used to analyse radiographs. 100 flat-  
211 field and 100 dark-field X-ray images were collected. The acquired radiographs were  
212 normalised using the flat-field correction (FFC) equation:  $FFC = \frac{I - Dark_{avg}}{Flat_{avg} - Dark_{avg}}$ , where  $I$  is  
213 the raw image,  $Dark_{avg}$  is the average of 100 dark-field images, and  $Flat_{avg}$  is the average of  
214 100 flat-field images [37]. This removed artefacts and noise variations inherited from the  
215 acquisition process. Local averaging over 50 neighbouring frames, 25 before and 25 after,  
216 was used to increase the contrast to reveal key features such as the laser keyhole, and remove  
217 stationary features; background subtraction using the first 50 static frames highlighted the  
218 deposited powder layer, shown in **Figure 2e**.

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**Figure 2:** (a) Experimental build chamber with key components labelled. (b) Simplified schematic of the sample holder during in situ melting. (c) Schematic of the substrate and powder particles and melt track. (d) Schematic of  $\mu$ CT sample scans. (e) Image processing methods.



**Table 1:** Four target processing conditions selected to give different (*LED*) values.

Sample ID	Laser power, $P$ (W)	Scan velocity, $v$ (mm s <sup>-1</sup> )	Nominal powder layer thickness, $t$ (μm)	Nominal <i>LED</i> (J mm <sup>-2</sup> )	Average powder layer thickness, $t_m$ , of the fifth layer (μm)	Adjusted <i>LED</i> (J mm <sup>-2</sup> )
A	150 ± 1	200 ± 1	100	7.5	119 ± 50	6.3
B	200 ± 1	200 ± 1	100	10	115 ± 45	8.7
C	200 ± 1	300 ± 2	100	6.7	139 ± 35	4.8
D	200 ± 1	400 ± 3	100	5	163 ± 50	3.1

230

### 231 3. Results

232 **Table 1** lists the *LED* values for the target processing conditions. The nominal *LED* was  
 233 calculated using the desired powder layer thickness of 100 μm. The average powder layer  
 234 thickness measured,  $t_m$ , was obtained from the background subtracted radiograph images,  
 235 with a threshold used to separate the powder layer. The powder thickness variation along the  
 236 length of the track (shown later in **Figure 4f** and **Supplementary Figure 1**) was averaged,  
 237 and standard deviation calculated.  $t_m$  was used instead of the nominal value  $t$  to calculate an  
 238 adjusted *LED*, as  $t_m$  was larger than  $t$  for every condition. Previous studies have similarly  
 239 observed thicker than intended powder deposition layers [67], however the disparity was due  
 240 to the powder consolidation ratio rather than variations in track height as seen here. Typical  
 241 *LEDs* used in previous literature are shown in **Supplementary Table 1**. The adjusted *LED*  
 242 was thus lower than the nominal *LED* for every sample. This indicates that for multilayer builds,  
 243 in addition to the aforementioned limitations of the *LED* calculation, the variation in powder  
 244 thickness is another reason why *LED* is not necessarily a reliable method for quantifying  
 245 absorbed laser energy density.

246 Initial observations of the radiographic data showed a large amount of powder spatter,  
 247 as has commonly been seen in LPBF [39], caused by metal vapour jetting [68]. Powder  
 248 entrainment into the jet can locally reduce the powder layer thickness ahead of the laser [69],  
 249 and hence the laser beam can penetrate deeper into the previously deposited material. Due

250 to the nature of the sample holder, some excess powder was visible in the X-ray direction  
251 between the substrate and GC windows, along the entire length of the sample, and also on  
252 top of the GC windows. In some instances, this reduced the visibility of internal features such  
253 as pores. In multilayer builds, the track height was seen to vary along the length of the track,  
254 resulting in the large variation of powder layer thickness measured.

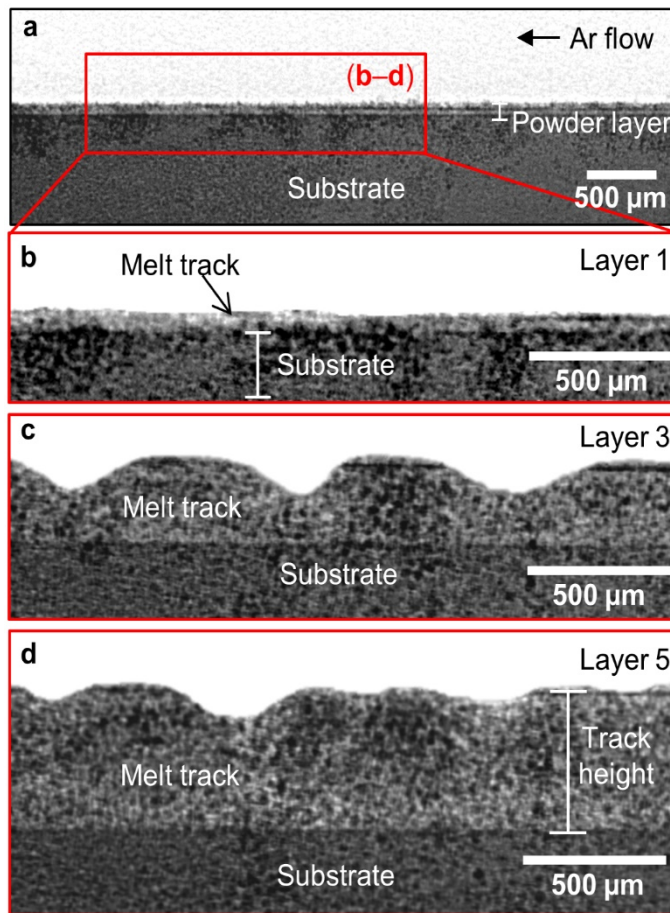
### 255 **3.1 Multilayer track morphology**

256 **Figure 3** shows radiographs of a representative sample (Sample A) at various stages of the  
257 build. Background noise and excess powder has been removed in radiographs (b – d) to  
258 highlight the track shape. Unedited final track radiographs are in **Supplementary Figure 2**  
259 (layer 3), and **Supplementary Videos 1** and **2** (layers 1 and 5 respectively). Layer 1 shows  
260 a uniform build height, largely free from undulations. Layer 3 shows a distinct undulating  
261 surface morphology along the length of the sample. Layer 5 shows an uneven surface but a  
262 reduction in amplitude of the undulations compared to layer 3.

263 The surface undulations significantly changed the thickness of subsequent powder  
264 layers, as the largest peak-to-trough distance was *ca.* 220  $\mu\text{m}$  (Layer 3). Furthermore, local  
265 denudation, caused by recoil pressure and powder entrainment into metal vapor plumes  
266 [36,69], was more extensive where the powder layer was thinnest, (*e.g.* at the undulation peak)  
267 as vapour plumes are likely to eject a larger fraction of the available powder.

268 An uneven track surface also changed the depth of remelting of the previous layer along  
269 the track length. Each new powder layer was spread out with a level surface over the previous  
270 build. As the laser penetration depth was *ca.* 150  $\mu\text{m}$  below the powder surface for Sample A,  
271 the peaks of the surface undulations – with less powder covering them – underwent deeper  
272 remelting than the troughs. Lack of fusion may have occurred when the laser penetration depth  
273 was less than the powder layer thickness.

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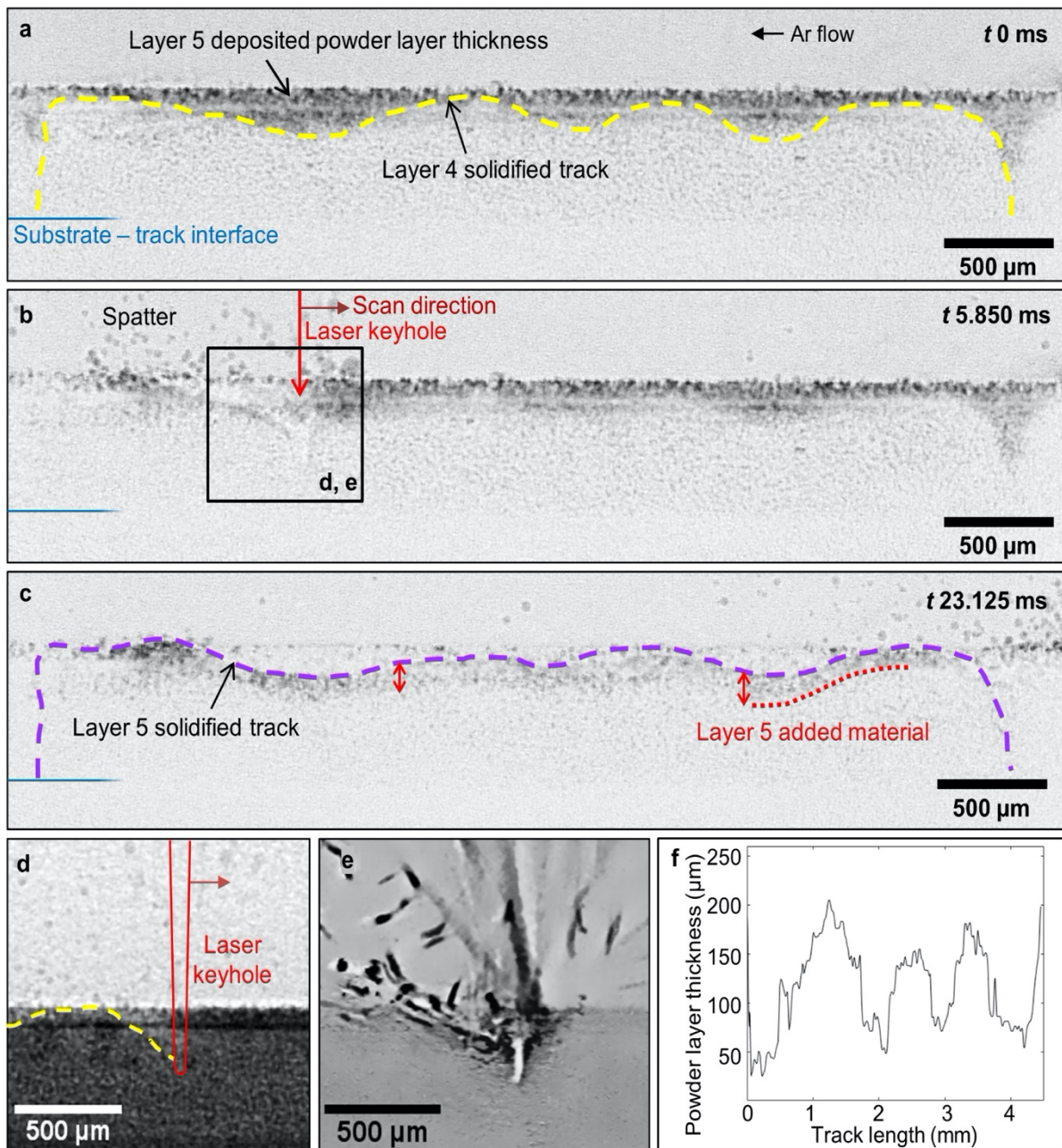
276 **Figure 3:** Radiographs of final multilayer track morphologies in Sample A. (a) Full substrate  
 277 length with added powder layer (100 μm), and highlighted red region of interest for (b), (c) and  
 278 (d) which show final melt track morphology in layers 1,3 and 5 respectively, with prominent  
 279 surface undulations.

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**Figure 4** shows a time-series set of radiographs taken during the deposition of layer 5 in Sample B, with evidence of undulations in track height and powder layer. **Figure 4a** shows the large variation in powder layer thickness spread on top of the previous 4 solidified layers (yellow dotted outline). **Figure 4b** shows evidence of keyholing during the process; ca. 1.2 mm along the substrate, where the powder layer is around its thickest (ca. 200  $\mu\text{m}$ , **Figure 4f**). The purple dashed line in **Figure 4c** outlines the layer 5 track surface. The thickness added by the deposition of layer 5 is revealed by the difference between the dashed (purple) and dotted (red) lines. The keyhole extends ca. 350  $\mu\text{m}$  below the track surface (**Figure 4d** and **e**). It is clear from these images that laser penetration extends well below the added powder layer and that significant laser remelting takes place. A large amount of powder spatter is seen behind the keyhole with a lesser amount in front of it. Dark and streaked features in **Figure 4e** indicate fast-moving spatter particles. The shape and depth of the keyhole are akin to the keyholes observed under similar energy density conditions for laser scanning with [34] and without [41] a powder layer, *i.e.* laser welding.

**Supplementary Videos 3** and **4** show the deposition of layer 5 in Samples C and D respectively, and also reveal prominent surface undulations and powder thickness variations. Notably, the video of Sample D shows significant porosity, characteristic of lack of fusion, at the end of the track.



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303 **Figure 4:** (a)-(c) Background subtracted radiograph time series of Layer 5 melting in Sample  
 304 B: (a) Track shape of prior 4 layers (yellow) with a deposited powder just before layer 5 is  
 305 deposited. (b) ROI showing the formation of a deep keyhole depression during layer 5 melting  
 306 (d-e). (c) Final track morphology of layer 5 (purple outline). (d) FFC radiograph of the laser-  
 307 induced keyhole in layer 5. The red outline denotes the approximate position of the laser  
 308 beam. (e) The keyhole shape is highlighted by locally averaging (d). (f) Graph showing the  
 309 variation in powder layer thickness plot along the track length. Corresponding videos of the  
 310 full track length melting with FFC and background subtraction (a-c) are shown in  
 311 **Supplementary Video 5** and **6** respectively. Powder thickness variation plots of Samples A,  
 312 C and D are shown in **Supplementary Figure 1**.

313

## 314 **3.2 Porosity analysis**

315  $\mu$ CT has been used to analyse pore shapes and sizes throughout all samples, to reveal overall  
316 trends in porosity. Pore formation mechanisms and interactions in multilayer builds are  
317 detailed in **3.3. Figure 5** shows  $\mu$ CT rendered images of the samples. The internal porosity  
318 has been highlighted by three colours, each representing a different  $D_{eq}$  size range. Pores of  
319  $D_{eq} < 25 \mu\text{m}$  are termed small, those with  $25 \leq D_{eq} < 45 \mu\text{m}$  are termed mid-sized, and pores  
320 with  $D_{eq} \geq 45 \mu\text{m}$  are termed large. The surface roughness visible on the sides and top of each  
321 sample was caused by semi-melted powder particles which adhered to the track but were not  
322 fully consolidated into the melt pool before solidification, see example in **Supplementary**  
323 **Figure 3. Table 2** shows the total number of pores of different size fractions and volume  
324 porosity for each condition. The percentage porosity was calculated using volume  
325 measurements from the  $\mu$ CT data; the methodology is in **Supplementary Information**.

326 In Sample A, substrate remelting must have taken place during the first build layer as  
327 the 6 pores observed were in the substrate. The largest volume porosity was measured in  
328 Sample B, in which the majority of large pores were observed at either end of the sample.  
329 **Figure 5** inset (a) illustrates the morphology of large irregularly shaped pores. The overall  
330 pore frequency histogram (below the  $\mu$ CT image for Sample B and C) shows a higher number  
331 of pores at each end of the track, and pore frequencies tend to be higher below the peaks in  
332 the deposition profile.

333 Sample C has about half the total volume porosity compared to Sample B, with reduced  
334 numbers of pores across all size ranges. The large pores are located towards one end of the  
335 track, where the solidified layer thickness is largest. Inset (b) shows a 'peanut' shaped large  
336 pore, in which two smaller pores appear to have coalesced. The pore frequency histogram  
337 reveals a correlation between the track height, and pore distribution, as more pores exist  
338 where the track is highest, which can be seen most clearly in **Figure 5** Sample C. The laser  
339 penetration depth into solidified track is lower than into the powder layer, so track peaks have  
340 a very thin layer of powder and substantial track remelting, whereas trough regions require

341 the laser to penetrate predominantly into powder. This suggests that when the track height is  
 342 higher, the laser penetration depth is not sufficient to remelt pores in the previous layer, and  
 343 could increase the overall pore volume. The variation in laser penetration depth of layer 5  
 344 melting can be seen in Supplementary Videos 2, 3, and 5.

345 The volume porosity in Sample D was measured to be similar to that of Sample A.  
 346 However, there are multiple regions showing poor layer cohesion, predominantly located at  
 347 the end of the track. Inset (c) shows evidence of a lack of fusion pore, which due to the nature  
 348 of single line scan tracks, propagated through the width of the sample. Although sample D has  
 349 around 2 % of the volume porosity compared with Sample B, this porosity analysis excludes  
 350 surface connected pores such as inset (c), and is thus an underestimation of the total volume  
 351 porosity, and care must be taken when comparing samples in this manner.

352

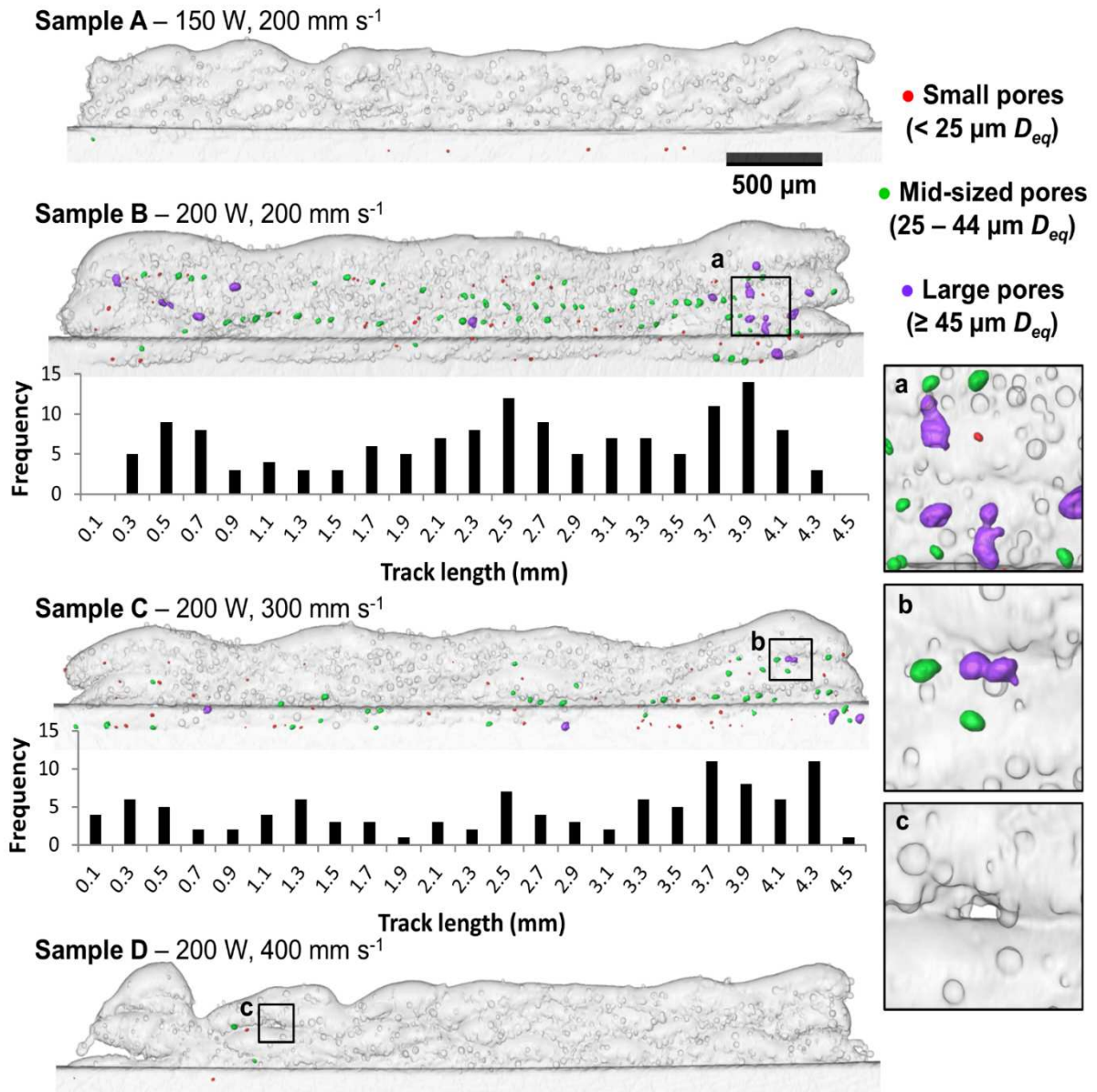
353 **Table 2:** Porosity quantification obtained from  $\mu$ CT data.

Sample ID	Number of small pores	Number of mid-sized pores	Number of large pores	Total number of pores	Pore Volume ( $\mu\text{m}^3$ ) *	Percentage Porosity (%) *
A	5	1	0	6	$26 \times 10^3$	0.0032
B	54	57	13	124	$2322 \times 10^3$	0.22
C	48	36	5	89	$1126 \times 10^3$	0.15
D	4	2	0	6	$41 \times 10^3$	0.0050

354 \* The error range is from 2 – 6 %.

355





356

357 **Figure 5:** 3D rendered volumes from the reconstructed  $\mu$ CT scans highlighting pore size,  
 358 distribution, and pore location. Pore frequency histograms with a bin size of 0.2 mm along the  
 359 track length of Samples B and C. Insets (a) and (b) show large irregular pores. Inset (c) shows  
 360 an interlayer pore. For interpretation of the colours in this figure, the reader is referred to the  
 361 online version of this article.

362

363 **Figure 6** shows porosity measurements from the reconstructed  $\mu$ CT data, with pore  
 364 volumes converted into  $D_{eq}$  values. The number fraction of internal pores measured in each  
 365 sample is given in **Figure 6a**. Sample A has few pores, almost 70 % of which are in the 20 –

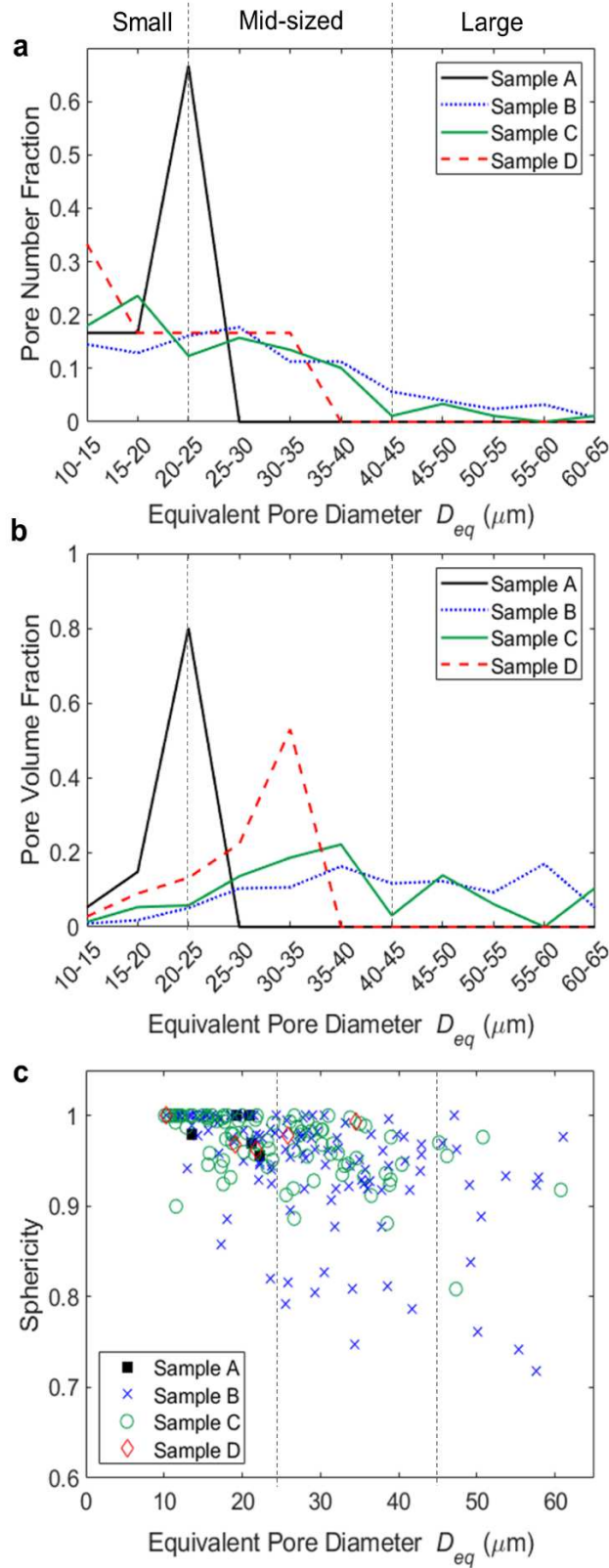


366 25  $\mu\text{m}$  size range. An even range of small and mid-sized pores are evident in Samples B and  
367 C. Sample D has very few pores but a similar number fraction of pores across the small and  
368 mid-size ranges.

369 The pore volume fractions for each  $D_{eq}$  bin size is shown in **Figure 6b**, indicating their  
370 contribution to the total overall volume porosity. Although Sample B and Sample C have a low  
371 number of large pores, the plot shows that these contribute significantly to the overall volume  
372 porosity. The highest number of pores in Sample C was small pores, however, the contribution  
373 to volume porosity is low. The largest individual contribution being mid-sized pores; the  
374 keyhole pores at the base of each melt layer. Sample D had a spike in pore volume from pores  
375 in the range 30 – 35  $\mu\text{m}$  (even though there is no spike in the number of pores) indicating that  
376 fewer larger pores influence the volume porosity considerably more than many smaller sized  
377 pores. Sample D had low overall pore volume because the methodology employed to analyse  
378 the  $\mu\text{CT}$  data did not quantify the surface connected pores, such as that shown in **Figure 5**  
379 inset (c).

380 **Figure 6c** shows the pore sphericity measurements in a scatter plot. The small pores  
381 are typically close to spherical (sphericity value of 1). As the  $D_{eq}$  value increases, the spread  
382 of the data also increases, showing pores to have a less uniform shape, with a minimum  
383 sphericity of ca. 0.7 for large pores. The pores shown in **Figure 5** insets (a) and (b) are  
384 representative of pores with low sphericity values. Sample B had the largest range in sphericity  
385 values for all pore sizes of ca. 0.7 to 1.0. In Sample C, 96 % of pores had values  $\geq 0.9$ , with a  
386 minimum sphericity of 0.8. All pores in Samples A and D had high sphericity  $\geq 0.96$ .

387



388

389 **Figure 6:** Measurements extracted from  $\mu\text{CT}$  analysis. (a) Pore number fraction plot, with  
 390 dividing lines for small, medium and large pore size terms. (b) Volume fraction plot for all pores  
 391 in each sample. (c) Scatter plot of pore sphericity for all measured pores.

### 392 **3.3 Keyhole melting and porosity formation observations**

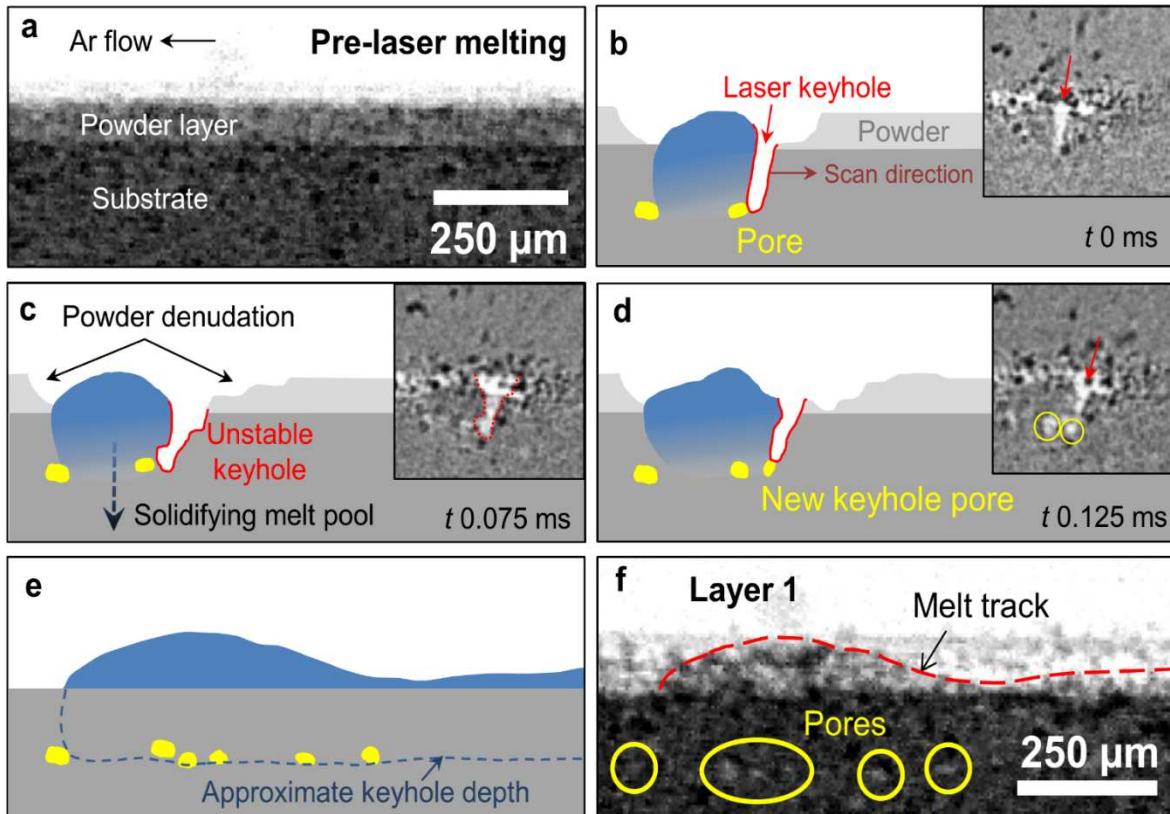
393 In the previous section, *ex situ* pore quantification has been reported. Through *in situ* X-ray  
394 radiography, it is possible to elucidate mechanisms by which the pores could have developed;  
395 described in this section. The melting of layer 1 in Sample C is shown in **Figure 7**, for a small  
396 region at the start of the melt track. **Figure 7a** shows a uniform powder layer of *ca.* 100  $\mu\text{m}$   
397 atop the substrate and **Figure 7b – d** show the evolution of the single layer melt track and  
398 keyhole pores in the substrate. As keyhole walls become unstable and collapse [34], pores  
399 form at the bottom of the keyhole. The insets in these figures (**b – d**) show locally averaged  
400 radiograph images of the keyhole shape and pore formation. **Figure 7e** and **f** show that these  
401 pores are retained inside the melt track, and an uneven track surface is formed upon  
402 solidification of the first layer.

403 Layer 2 melting and pore interactions in Sample C are shown in **Figure 8** for the same  
404 region of interest (ROI) as **Figure 7**. Details are shown in **Supplementary Videos 10** (full  
405 track) and **11** (cropped ROI), for layer 2. **Figure 8a** shows the full track length of layer 2 after  
406 melting, with the ROI highlighted for (**b – k**). **Figure 8b** shows a schematic (traced from  
407 radiographs) of layer 1, with the powder deposited for the next layer, just prior to melting.

408 **Figure 8c – h** show three different pore interactions that are observed to occur during  
409 multilayer laser melting and are described as follows: (i) the laser penetration depth of layer 2  
410 melting is deep enough to interact with the solidified pore from the first layer, and the melt pool  
411 fills the void (**Figure 8c – d**, dotted yellow outline denotes a filled pore). (ii) The laser  
412 penetration depth is insufficient to fill the pre-existing pore with liquid metal (**Figure 8e** and **f**).  
413 This can be due to laser processing parameters, or in the case of Sample C, changes in track  
414 height along the length of the sample affect the depth of remelting, as described in **Figure 3**.  
415 (iii) The laser keyhole is unstable [34] and produces pores, in the same way to those in layer  
416 1, and prior work [42,69]. These new voids may coalesce with existing pores to reduce  
417 interfacial energy in the melt pool, which increases their size. As the solidification rate is high,

418 these pores have not been able to rise to the surface and be removed before solidification  
419 (Figure 8g – h).

420

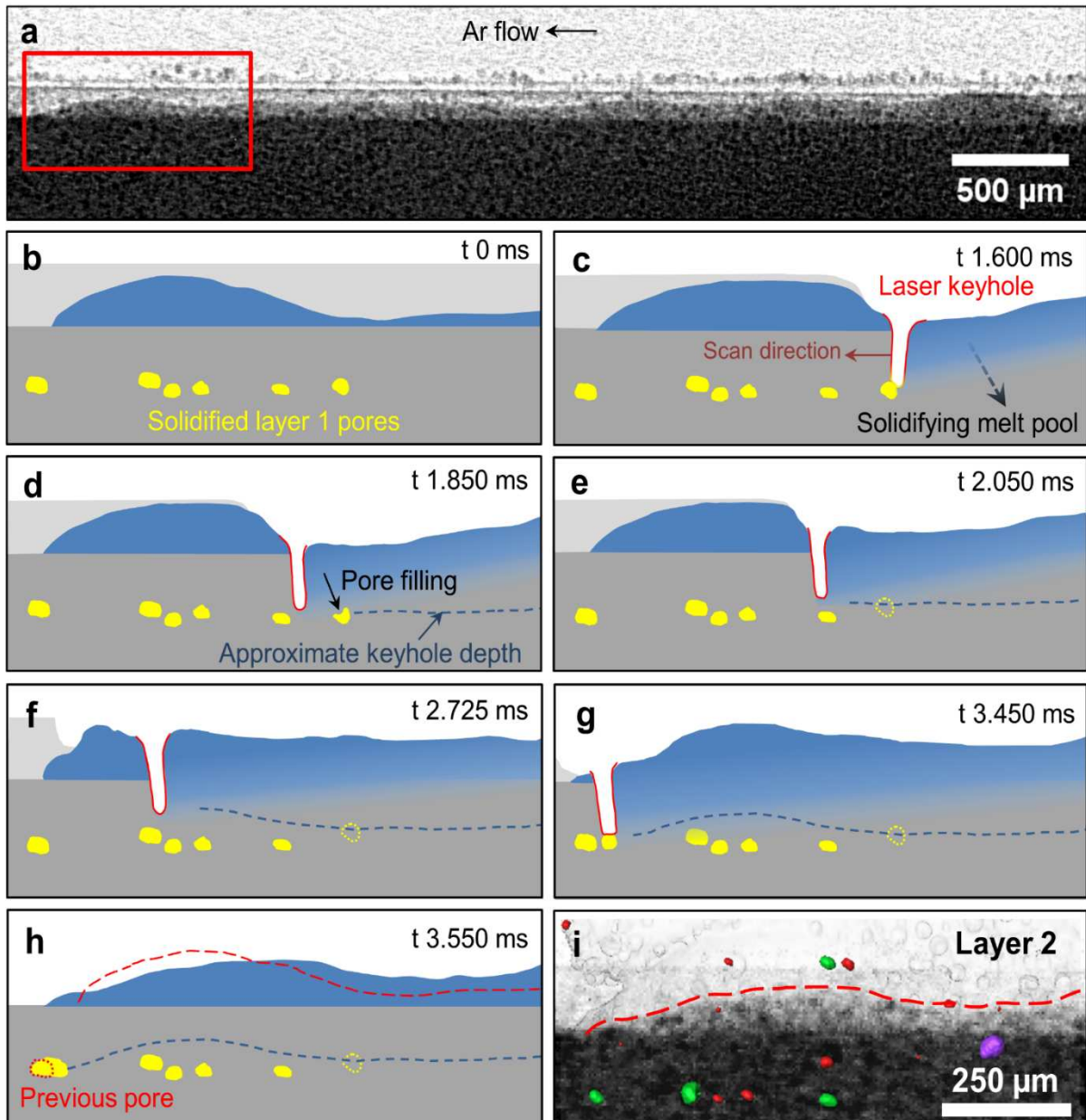


421

422 **Figure 7:** Observation of porosity formation in Sample C, layer 1. (a) Radiograph of substrate  
423 and powder prior to melting. Time series schematics (traced from the radiographs) and  
424 corresponding radiograph insets in (b) to (d). (b) Melt track (blue) with laser keyhole in the  
425 substrate plate (grey). (c) Keyhole walls become unstable. (d) A new pore is formed at the  
426 keyhole. (e) Pore positions after layer 1 melting where the blue dotted line shows the  
427 approximate keyhole depth. (f) Radiograph showing the position of the keyhole pores. See  
428 keyhole pore formation in **Supplementary Videos 7** (full track), **8** (cropped ROI), and **9** (locally  
429 averaged cropped ROI). Insets in (b – d) are made by locally averaged radiograph images to  
430 highlight keyhole shape. **See Supplementary Videos 10 and 11.**

431

432 In **Figure 8h**, the solidified layer 2 track is shown in blue, with solidified layer 1 outlined  
433 in the dashed red line. This shows that track remelting occurs and leads to a redistribution of  
434 material. **Figure 8i** is the final solidified layer 2 radiograph, with the  $\mu$ CT data as an overlay.  
435 It shows that the solidified pores observed remained in the sample. With high-resolution  $\mu$ CT  
436 scans ( $2.7 \mu\text{m} / \text{voxel}$ ) relative to the synchrotron X-ray imaging ( $4.76 \mu\text{m} / \text{pixel}$ ), we reveal  
437 additional pores in the samples which cannot be resolved in the X-ray radiograph. Pores  
438 produced in layers 3 – 5 are also visible in the  $\mu$ CT overlay.  
439



440

441 **Figure 8:** Schematic of porosity formation (traced from the radiographs) during deposition of  
 442 the second layer in Sample C. (a) Radiograph of full track length after layer 2 melting, with the  
 443 highlighted region of interest for (b – k). (b) Initial powder layer (100 μm) on the substrate,  
 444 prior to laser melting. (c – g) Schematic of 3 laser interactions in multilayer melting. (h)  
 445 Solidified layer 2 track; layer 1 outline shown in red. (i) Layer 2 final X-ray radiograph, with an  
 446 overlay showing solidified pores in the sample from the μCT data. For the radiographs from  
 447 which (b – h) are traced, please see **Supplementary Videos 10 and 11**.

448

## 449 4. Discussion

### 450 4.1 Morphological development in multilayer tracks

451 Periodic undulations similar to those found in the present *in situ* study have also been  
452 observed in recent studies of the LPBF process, e.g. in thin-wall structures [70,71], in single  
453 line scan tracks [11,61] and in cubes [72]. They have also been seen in laser welding [73] and  
454 been modelled computationally [59]. The undulations, also referred to as humping [11], have  
455 been attributed to Marangoni flow in the melt pool and surface tension effects [70], mainly the  
456 Plateau-Rayleigh instability, which describes the break-up of fluid into discontinuous elements  
457 [74]. It is denoted as balling [4] when the effects are sufficiently extreme for LPBF tracks to  
458 become discontinuous.

459 A high length-to-width melt pool ratio would be expected to promote the Plateau-  
460 Rayleigh instability [11,61] and it has been reported that this increases the probability of such  
461 undulations developing [70]. It has also been observed that tracks produced under conditions  
462 of high *LED*, which increases melt pool length, produced more undulations [55,59,70].  
463 However, in other studies, it has been found that decreasing the *LED* with a constant laser  
464 power led to a transition from a continuous track to surface undulations and to balling [55].  
465 Evidently, there is a more complicated relationship between *LED* and formation of undulations,  
466 presumably because other process-related factors such as backward fluid flow in the molten  
467 pool [11] and recoil pressure [59] will play a role. In the present study, the range of *LED* values  
468 employed was not sufficiently great to provide further clarification. However, a notable feature  
469 from the *in situ* work is the observation in Sample A that the amplitude of undulations  
470 decreased as the number of layers increased, **Figure 3**. This could be related to the  
471 bidirectional melting strategy, but further research is necessary to confirm this.

472 The largest peak to trough distance observed was ca. 220  $\mu\text{m}$  in Sample C, which has  
473 a substantial effect on layer remelting along the length of the track; as the keyhole depth was  
474 ca. 200  $\mu\text{m}$  for these conditions in layer 5 (see Supplementary Video 5). This results in  
475 significant remelting of the previous layer at the wave peaks with little or none in the troughs.

476 The laser penetration depth itself also varied by 30 - 40  $\mu\text{m}$ , going deeper in the troughs where  
477 it is melting power rather than prior solid track. Despite this deeper penetration at the troughs,  
478 in some areas the prior layer was sufficiently deep that that lack of fusion pores or unmelted  
479 powder between tracks was observed, such as those present in for Sample D, **Figure 5**. The  
480 effect of variable layer remelting is to directly influence the pore populations in multilayer  
481 samples, and this will be explored further in the following sections.

482

## 483 **4.2 Gas Porosity**

484 For GA powders, it is possible that gas trapped within the feedstock powder, typically argon  
485 [75], as a result of the manufacturing route can be entrained into the pool during melting [76],  
486 as well as retained soluble gases such as hydrogen [77]. In LPBF, hydrogen can also come from  
487 several other sources, such as the decomposition of water vapour on the surface of the  
488 powder, or water vapour in the environmental chamber [78]. This is most prevalent in materials  
489 such as aluminium alloys [25] where hydrogen solubility increases with increasing  
490 temperature. Although this is not the case in titanium alloys, hydrogen has still been shown to  
491 cause porosity in welds [79–81], where at the liquidus temperature hydrogen is twice as  
492 soluble in the liquid as the solid (partition coefficient of *ca.* 0.5 [82]). Hence, hydrogen is  
493 rejected into the melt pool by the advancing solid-liquid interface and the melt becomes  
494 supersaturated. Hydrogen and other soluble gases will be swept along in the melt pool until  
495 the end of the track. When the laser is turned off at the end of the track, these soluble gases  
496 can become highly supersaturated as the liquid pool shrinks, and will either nucleate new  
497 pores, or diffuse into pores formed by the keyhole, stabilising or increasing their size. This  
498 may also happen all along the track, but to a lesser extent as the supersaturation will be less.  
499 This mechanism will be discussed later in greater detail. It is also possible that some of the  
500 small spherical pores will contain argon gas which is entrained from the environmental  
501 chamber when the keyhole pores form [4,33].



502 In some literature on the expected diameter of gas pores in additively manufactured  
503 materials, studies have classified any pores lower than 100  $\mu\text{m}$  in diameter [29,83], or even  
504 between 100  $\mu\text{m}$  and 300  $\mu\text{m}$  [28] as gas pores. However, in the present study only those  
505 pores with  $D_{eq}$  approximately  $\leq 30 \mu\text{m}$  had sphericity values close to 1 which is regarded as a  
506 strong indicator of a gas pore. Larger pores tended to have lower sphericity values and those  
507 visible on the radiograph images, measured to be *ca.* 40 – 60  $\mu\text{m}$  in size, clearly formed via a  
508 keyhole mechanism. Therefore, it can be concluded that size alone cannot be used to  
509 determine the mechanism by which pores form and that further *in situ* studies are required to  
510 clarify this.

511

### 512 **4.3 Keyhole pore formation**

513 **Supplementary Video 6** and **Figure 7** show keyhole pore formation over a 0.05 ms period.  
514 A keyhole is created, quickly distorted, and covered over by the unstable liquid metal above,  
515 resulting in a large entrapped pore. The final pore observed from this interaction is *ca.* 40  $\mu\text{m}$ ;  
516 similar to the size found in industrial practice [34,84]. This formation mechanism has also been  
517 explored computationally [4,33]. **Figure 5** shows that most irregular pores were found to be at  
518 the base of each melt track, and in the substrate for the initial layer. This supports their  
519 formation via the keyhole melting mechanism [10] and correlates with the stationary beam *in*  
520 *situ* experiments [34,36] in which the closure of a keyhole was seen to take *ca.* 0.05 ms. The  
521 decrease in sphericity (from 1.0 to 0.7) as the pore size increases implies that keyhole melting  
522 and metal vaporisation effects produced unstable voids [33,34], which were then trapped  
523 during solidification. The pores with low sphericity values may either have become distorted  
524 when trapped between dendrites [85], or when two pores are trapped as they coalesce (see  
525 **Figure 5** inset (b)). Large keyhole pores were most prevalent in Samples B and C and the  
526 number fraction of pores for each  $D_{eq}$  bin size show a similar trend, **Figure 6a**.

#### 527 **4.4 Keyhole-pore interactions in remelted layers**

528 Lack of fusion pores are potentially detrimental features in AM components as they are  
529 generally non-uniform in shape [86], can contain unmelted powder particles [87], and can act  
530 as crack initiation sites. Therefore, based on the observations in this study, sufficient laser  
531 penetration depth, possibly through the keyhole mode of heating, can assist to ensure  
532 adequate fusion to the previous layer. A phase-field model of multilayer scanning [88] supports  
533 this, as a higher percentage of lack of fusion pores were observed when energy density was  
534 decreased. The effects of track balling led to pores, which were not remelted in subsequent  
535 layer addition, however in this work keyhole pores were not studied. In the present study, such  
536 lack of fusion features became more prominent in Samples C and D as the scan velocity was  
537 increased, and the depth of keyhole formation was expected to decrease. In Sample C, the  
538 layers at the ends of the track were insufficiently fused together. In Sample D, there were large  
539 areas of unfused material at the end of the track, as well as a lack of fusion pore mid-track,  
540 **Figure 5 inset (c)**. It can be estimated that the mid-track pore was *ca.* 60  $\mu\text{m}$  long and the lack  
541 of fusion feature at the end of the track was *ca.* 450  $\mu\text{m}$  long.

542 Whilst some remelting a previous layer is desirable, achieving this using keyholing may  
543 introduce keyhole pores at the interface between layers as shown in the *in situ* radiographs,  
544 and in the *ex situ*  $\mu\text{CT}$  reconstructions, **Figure 5**. However, the *in situ* radiographs, **Figure 8**,  
545 show that remelting can also be used advantageously, as large pores were eliminated from  
546 the track by a pore filling mechanism. Partial pore filling has also been observed previously  
547 [40]. Whether these pores were completely removed or redistributed as smaller pores [37] is  
548 unclear, as the spatial resolution of the radiographs is insufficient to confidently resolve pores  
549 with a diameter  $< 40 \mu\text{m}$ . Remelting was also seen to increase the size of one pore, **Figure**  
550 **8h**, similar to that observed in overhang conditions [40], which is undesirable. The likelihood  
551 of this occurring could be related to the solidification rate, and whether pores have time to be  
552 filled by molten metal or rise to the surface of the melt before solidification. Therefore, careful  
553 control of layer remelting is an important factor to consider when selecting process conditions

554 in LPBF, as the multilayer *in situ* study has shown that complex interactions are taking place.  
555 The selection of suitable process parameters is further complicated by the variations in powder  
556 layer thickness, and consequently variable laser penetration to the previous layer. However,  
557 a more in-depth analysis with a larger number of deposited layers would be necessary to  
558 explore this. It must also be noted that this study only explored single melt track deposition,  
559 and that some of the findings may not be applicable to typical depositions used in LPBF  
560 employing multiple hatches and contours. However, this study is relevant to multilayer melting  
561 and can be used to validate models, and hypotheses can be applied to hatched samples.

562

#### 563 **4.5 Inhomogeneous pore distribution**

564 The  $\mu$ CT results, **Figure 5**, clearly reveal that the large pores in Samples B and C form  
565 primarily at the ends of each melt track and that this is also true of mid-size pores in Sample  
566 C. Prior work has also observed a correlation between scan strategies and pore location  
567 [22,23,30,72]. The irregular shapes of such pores are highlighted in the insets to this figure  
568 and the time series radiographs in **Figure 8** provide clear mechanistic information of the role  
569 of layer remelting in developing large irregular pores. Recently *in situ* methods [32] and  
570 computational methods [5] have been used to study point pore formation during turning, *i.e.*  
571 at the end of a track where the direction of travel changed. They concluded that pores form at  
572 laser turn points due to the formation and subsequent collapse of a deep keyhole. However,  
573 their powder-on-plate findings may not provide a full understanding of multilayer builds in  
574 LPBF.

575 Our results suggest that both gas and keyhole pores are combined to form larger pores  
576 during the melting and cooling of the track. The hypothesis is that firstly, the dissolved soluble  
577 gases are swept along in the melt pool concentrating at the end of the track, similar to the  
578 solute concentration that is observed in the Czochralski zone refining process [89]. Hydrogen  
579 is a solute element in the molten alloy, with a partition coefficient  $k$  of ca. 0.5 [82]. During the  
580 transformation from liquid to solid, hydrogen solubility decreases (halving for titanium), and

581 thus partitioning at the interface will concentrate dissolved hydrogen in the melt pool, sweeping  
582 solute elements to the end of the track. Normally, keyhole pores containing superheated metal  
583 vapour and a small amount of argon gas shrink as the melt pool cools. However, at the end of  
584 the track, the soluble gas (hydrogen) is concentrated by the sweeping (or Marangoni  
585 convection), and even further so as the pool solidifies at track end. This super-saturated gas  
586 could diffuse into the keyhole pores, increasing or maintaining their size.

587 The 'peanut' shape formed as two pores joined together in inset (b) indicates that the  
588 solidification process happened so rapidly that the void could not reshape into a sphere to  
589 reduce surface tension and was frozen as an irregular pore [30]. It is also possible that  
590 complex fluid flow could distort pore shapes. In agreement with a prior work [90], porosity  
591 minimisation at the ends of the track or turning points could be achieved via a reduction laser  
592 power in these areas to prevent keyhole porosity forming. The present work supports this as  
593 Sample A and B only differed in laser power (150 W and 200 W, respectively), but Sample A  
594 had 99 % less internal volume porosity. As can be seen from **Supplementary Videos 2** and  
595 **5**, the keyhole in Sample A is *ca.* 150  $\mu\text{m}$  deep, while for Sample B the keyhole is *ca.* 250  $\mu\text{m}$ ,  
596 generating many more keyhole pores. Previous work similarly shows higher porosity  
597 percentage in higher energy conditions [91]. In large LPBF components, directionality, hatch  
598 strategy, and the depth of layer remelting will influence pore location and size, and all need to  
599 be carefully considered.

600

## 601 **5. Conclusions**

602 This study investigates the track formation and internal porosity during laser powder bed fusion  
603 of Ti-6Al-4V single track, multilayer builds using high speed *in situ* synchrotron imaging. The  
604 samples were further examined by *ex situ*  $\mu\text{CT}$  to further support our findings. The following  
605 conclusions have been drawn:

606 1. Undulations in the track surface were observed, which led to different depths of  
607 remelting along the track length in subsequent track, and thus different pore interactions

608 in multilayer builds. The deposited powder layer thickness changes as track height  
609 changes, decreasing the uniformity of multilayer components through this inconsistent  
610 remelting. This is an important factor which needs further investigation and consideration  
611 when selecting processing conditions.

612 2. There interactions were identified to occur during multilayer laser melting: (i) pores are  
613 remelted and the void is filled with molten metal; (ii) the laser penetration depth is not  
614 sufficient to fill the pore and they remain in the track; (iii) the laser keyhole is unstable  
615 and produces new pores, which can join to existing pores, increasing them in size.

616 3. Keyhole pore formation was quantified, illustrating how pore size varies as a function of  
617 build parameters (laser velocity and power), ranging from 10 – 60  $\mu\text{m}$ , with those  
618  $< 40 \mu\text{m}$  being detected *ex situ* with  $\mu\text{CT}$ . *In situ* keyhole pore formation was found to  
619 occur in a process taking under 0.05 ms, forming pores with a size *ca.* 30 – 60  $\mu\text{m}$ ,  
620 correlating well to prior *in situ* studies.

621 4. It is hypothesised that the formation of larger pores at the end of tracks is the result of  
622 the stabilising and growth of keyhole porosity by diffusion of supersaturated soluble  
623 gases (hydrogen) into these pores. This soluble gas is concentrated as the pool sweeps  
624 along the track due to the partition coefficient ( $k$ ) of *ca.* 0.5. for hydrogen in titanium.  
625 Upon cooling at the end of track, the solubility rapidly decreases, and hydrogen diffuses  
626 into nearby pores.

627

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## 638 **7. Author contributions**

639 PDL, LS, CLAL, and GB conceived the project. LS, YC and CLAL designed the experiments.  
640 All authors performed the beamtime, except GB and JG. LS performed  $\mu$ CT, data analysis,  
641 and results interpretation. LS, CLAL, and PDL led the results interpretation and paper writing,  
642 with all authors contributing. JG performed the powder size distribution analysis.

## 643 **8. Data Availability**

644 Representative samples of the research data are given in the figures (and supplementary data  
645 – DOI if available). Due to their large size, other datasets generated and/or analysed during  
646 this study are available from the corresponding author on reasonable request.

## 647 **9. Declaration of interest**

648 The authors declare no competing financial interests.

649

650 **10. References**

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