# A multiscale X-ray phase-contrast tomography dataset of whole human left lung

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# <sup>25</sup> ABSTRACT

Technological advancements in X-ray imaging using bright and coherent synchrotron sources now allows to decouple sample size and resolution, while maintaining high sensitivity to the microstructure of soft, partially dehydrated tissues. The recently developed imaging technique, hierarchical phase-contrast tomography, is a comprehensive approach to address the challenge of organ-scale (up to tens of centimeters) soft tissue imaging with resolution and sensitivity down to the cellular level. Using

<sup>26</sup> this technique, we imaged *ex vivo* an entire human left lung at an isotropic voxel size of 25.08 µm along with local zooms down to 6.05 - 6.5 µm and 2.45 - 2.5 µm in voxel size. The high tissue contrast offered by the fourth-generation synchrotron source at the European Synchrotron Radiation Facility reveals complex multiscale anatomical constitution of the human lung from the macroscopic (centimeter) down to the microscopic (micrometer) scale. The dataset provides complete organ-scale 3D information of the secondary pulmonary lobules and delineates the microstructure of lung nodules with unprecedented detail.

# 27 Background & Summary

The human lung is among the largest solid organs in the human body. Traditionally, studies of lung microanatomy at the organ

- scale require lengthy operations in targeted sampling, tissue preparation, histological staining and sectioning<sup>1,2</sup>. Nowadays, ex
- vivo clinical evaluations of whole lung microstructures are carried out without sectioning using absorption-contrast micro-CT at
- around 100  $\mu$ m voxel size, then a limited area may be selected to image at higher resolution using histology<sup>3-5</sup>. X-ray phase-
- $_{32}$  contrast imaging<sup>6</sup> provides higher sensitivity and contrast than laboratory micro-CT<sup>7</sup>. Compared with optical virtual histology<sup>8</sup>,
- <sup>33</sup> X-ray phase contrast from free-space propagation requires no imaging optics and, at the same time, removes the need for
- laborious tissue clearing and staining that are essential for optical imaging. The compatibility of X-ray phase-contrast imaging
- with existing X-ray sources facilitates its gradual adoption and transition from preclinical research to clinical diagnostics<sup>9,10</sup>.
   At synchrotron facilities, systematic upgrades<sup>11,12</sup> in the X-ray source and imaging techniques over the past decades provide
- At synchrotron facilities, systematic upgrades<sup>11,12</sup> in the X-ray source and imaging techniques over the past decades provide the means to tackle biological questions on meaningful scales and resolution<sup>13–19</sup>. Although synchrotron-based X-ray imaging
- $_{38}$  can access finer anatomical detail than laboratory micro-CT<sup>18,20–22</sup>, many bioimaging scenarios require further upscaling

- <sup>39</sup> of the imaging throughput and accommodation of large sample size while maintaining microscopic resolution<sup>23,24</sup>. Thanks
- to the high X-ray photon flux and coherence achieved at modern fourth-generation synchrotron sources and careful design
- of the imaging protocol, it is now possible to image complete, large, partially dehydrated human organs in their entirety at minimum temperature matching and the matching and the second seco
- micrometer resolution using hierarchical phase-contrast tomography (HiP-CT)<sup>25</sup>. It is a single-modality, multiscale imaging
   technique that employs propagation phase contrast from high-energy, polychromatic X-rays, flat-field correction, attenuation
- scanning protocol, along with efficient tomographic sampling and stitching pipeline to cover large, soft-tissue organs entirely.
- The imaging protocol of HiP-CT starts with a two-step tomographic sampling of the whole organ (full-field tomography),
- followed by progressive zooming in to selective features of the microanatomy through local tomographies at various resolutions
- 47 compatible with the relevant anatomical context. The imaging technique takes reference from a separate container (reference
- <sup>48</sup> jar) for flat-field correction to enhance the soft tissue contrast. The organ in the sample jar is embedded in 70% ethanol solution
- <sup>49</sup> in water and immobilized with agar blocks throughout imaging (see Fig. 1). We provide here the human left lung dataset
- imaged by HiP-CT at 25.08  $\mu$ m voxel size (full organ) and at 6.05 6.5  $\mu$ m and 2.45 2.5  $\mu$ m voxel size for various local
- volumes of interests (VOIs) accomplished by different post-scintillator coupling optics before the detector. The X-ray imaging
- <sup>52</sup> experiments were carried out at the European Synchrotron Radiation Facility (ESRF) BM05 beamline using the recently
- <sup>53</sup> upgraded fourth-generation extremely brilliant X-ray source (ESRF-EBS)<sup>26,27</sup>.

## 54 Methods

#### **Lung preparation and mounting**

<sup>56</sup> The entire left lung (see Fig. 1a) was harvested from an organ donor, a 94-year-old woman who succumbed to natural causes.

57 Body donation was based on free consent by the donor antemortem. The relevant postmortem medical procedures were carried

<sup>58</sup> out at Laboratoire d'Anatomie des Alpes Françaises (LADAF) according to the Quality Appraisal for Cadaveric Studies scale

<sup>59</sup> recommendations<sup>28</sup>. All dissections respected the memory of the deceased. The protocols for transport and imaging were

<sup>60</sup> approved by the French legislation for body donation. The body of the deceased donor was embalmed and the lung preparations

were carried out at  $\sim$  36 hours postmortem. The lung was instilled through the trachea with a 4% formalin solution using 30

<sup>62</sup> cm of water column positive pressure. The trachea was then ligatured to maintain the inflated configuration in order to fix the

 $^{63}$  lungs in a non-collapsed state. The body was then kept at 4 °C for 3 days before the dissection. Once removed, the lungs

<sup>64</sup> were immersed in 4% formalin solution for 3 more days. Afterwards, it was successively immersed in ethanol solutions with <sup>65</sup> increasing concentration up to 70% (volume fraction). The lung was kept inflated during ethanol dehydration by repeatedly

<sup>65</sup> increasing concentration up to 70% (volume fraction). The lung was kept inflated during ethanol dehydration by repeatedly <sup>66</sup> pushing the solution through its main bronchus with a syringe. The significantly lower density of ethanol (789 kg/m<sup>3</sup>) compared

<sup>67</sup> with water (1000 kg/m<sup>3</sup>) provides a high soft tissue base contrast<sup>29,30</sup>.

We used a PET (polyethylene terephthalate) jar of comparable size to the lung for X-ray imaging due to its commercial 68 availability (Medline Scientific, 3600 mL), high radiation tolerance<sup>31</sup> and optical transparency in assisting sample alignment 69 and assessment of sample condition during imaging. To secure the lung tightly in place and prevent it from touching the 70 container edges on all sides, we prepared agar blocks ( $\sim 1 \text{ cm}^3$ -sized cubes) and stacked them at the bottom of the jar and 71 around the organ to surround and firmly embed the lung. The gaps between the small agar blocks provide the escape routes for 72 residual gas removal. The sample mounting procedure involves alternated filling of the agar-ethanol mixture and gentle vacuum 73 degassing to minimize the existing microbubbles from dissolved air in the solution environment and within the organ, thereby 74 eliminating their interference with imaging. The degassing procedure used a membrane pump to directly pump<sup>32</sup> above the 75 PET sample jar with the lid open in a sealed vacuum glass dryer. Prior to imaging, the PET jar containing the lung, ethanol 76 solution and agar embedding was placed in a custom-made sample holder to connect to the rotation stage at the synchrotron 77

<sup>78</sup> beamline<sup>25</sup>.

## 79 Synchrotron X-ray imaging and reconstruction

<sup>80</sup> The implementation and capabilities of HiP-CT have been described in detail in a separate publication<sup>25</sup>. Here, we describe the

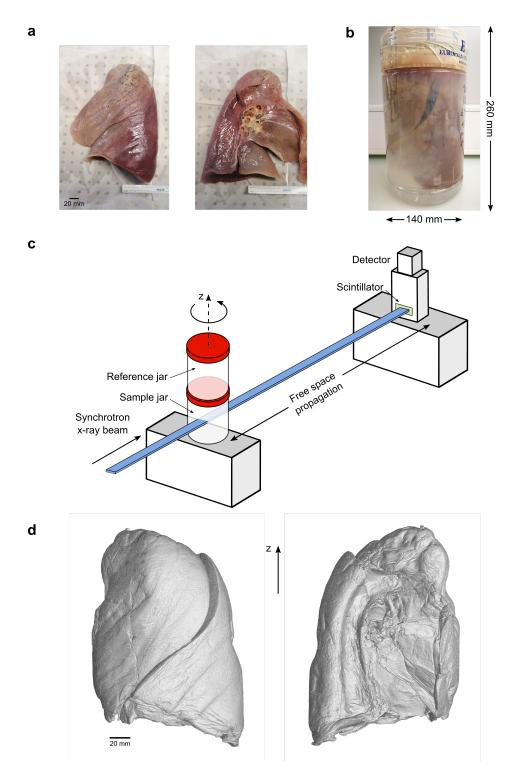
settings used for lung imaging. All X-ray imaging experiments were carried out at the ESRF bending magnet beamline BM05<sup>33</sup>.

<sup>82</sup> The polychromatic synchrotron beam produced at the beamline was passed through a set of filters and then directly used for

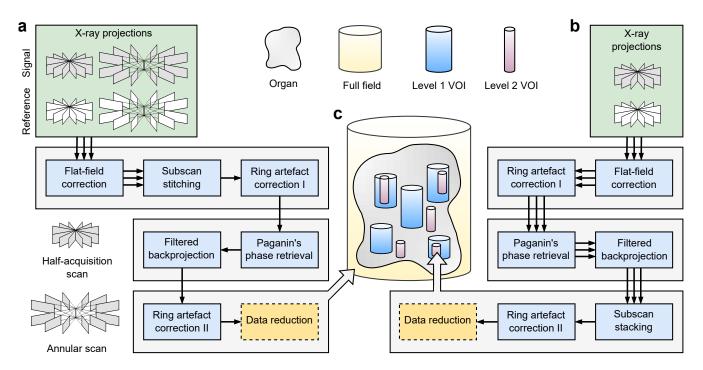
imaging without additional X-ray optics. The voxel size is effectively controlled by the adjustable visible-light imaging optics

situated after the LuAG:Ce X-ray scintillator and before the sCMOS light sensor (PCO edge 4.2 CLHS, PCO AG, Germany).

- <sup>85</sup> Specifically, the imaging optics include the dzoom ("demagnifying zoom") and zoom lenses, which cover the ranges of 6.5 -
- $25.5 \ \mu\text{m}$  and  $1.3 6.3 \ \mu\text{m}$ , respectively. Because the synchrotron beam size (with usable area 50 mm  $\times$  4 mm at BM05) is
- considerably smaller than the size of the human left lung (container size 260 mm height, up to 140 mm width at the widest),
- imaging an entire lung at 25.08  $\mu$ m voxel size requires stitching together multiple subscans. We used the half-acquisition (or
- <sup>89</sup> half-object acquisition)<sup>34</sup> method developed at ESRF for imaging the VOIs at 6.5  $\mu$ m and 2.5  $\mu$ m in voxel size. For the entire
- 100 lung, we developed a quarter-acquisition method<sup>25</sup> that includes the half-acquisition in combination with an annular scan to
- <sup>91</sup> cover its complete horizontal extent (see Fig. 2).



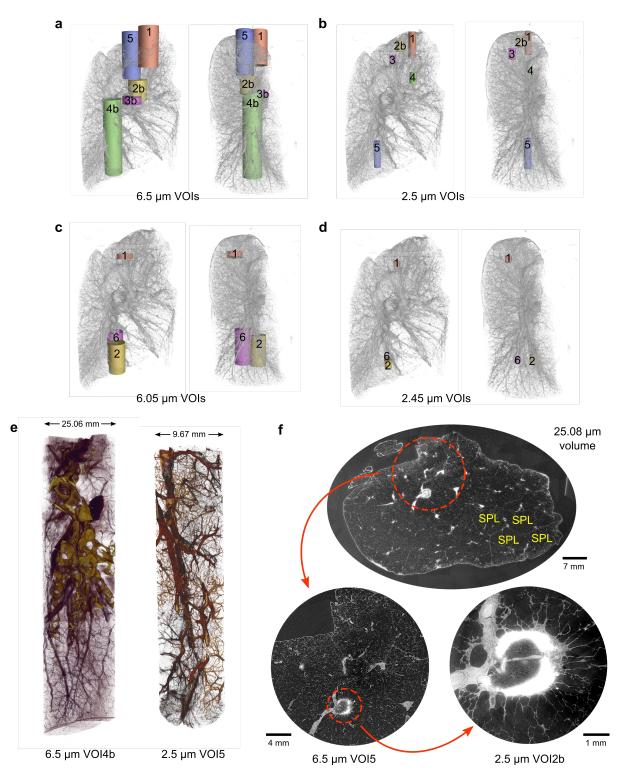
**Figure 1.** (a) A human left lung in lateral (left) and medial (right) view. (b) The whole lung is mounted in a sealed, plastic cylindrical jar (140 mm in diameter, 260 mm in height) filled with 70% ethanol solution and agar blocks. (c) Sketch of the imaging setup for propagation phase-contrast X-ray tomography at ESRF BM05 beamline. The reference jar contains the same embedding medium as the sample jar. The incident X-ray energy is adjusted to between 70 - 85 keV through filters depending on the resolution requirement. (d) Volumetric rendering of the whole left lung imaged at 25.08  $\mu$ m voxel size using HiP-CT in lateral (left) and medial (right) view.



**Figure 2.** Synchrotron-based hierarchical phase-contrast tomography (HiP-CT) at multiple lengthscales and their associated data acquisition and image reconstruction pipelines. The full-field tomography data at 25.08  $\mu$ m voxel size are processed with pipeline (**a**). The local tomography data for volumes of interests (VOIs) at 6.05-6.5  $\mu$ m (level 1) and 2.45 - 2.5  $\mu$ m (level 2) voxel size are processed with pipeline (**b**). (**c**) A cartoon illustrating the relationships of the various cylindrical volumes imaged with HiP-CT. The triple arrows in the pipeline before merging of the subscans indicate that the same procedure is carried out on each subscan.

VOI reference	Height (mm)	Diameter (mm)	Displacement (mm)	Z rotation	Anatomical reference
6.5 μm, VOI1	48.79	25.06	(23.3, -9.4, -81.2)	24.6°	upper lobe, apical region
6.5 μm, VOI2b	26.74	25.05	(5.8, -15.0, -26.5)	24.6°	upper lobe, medial region
6.5 μm, VOI3b	9.11	25.04	(5.5, 0.8, -15.2)	24.6°	interlobar fissure
6.5 μm, VOI4b	106.07	25.06	(-20.6, 8.1, 37.1)	24.6°	lower lobe, basal to medial region
6.5 μm, VOI5	59.81	25.04	(-3.3, -15.1, -71.0)	24.6°	upper lobe, apical region
6.05 μm, VOI1	7.61	23.12	(-12.5, -23.5, -67.9)	2°	upper lobe, apical region
6.05 μm, VOI2	42.17	23.10	(-7.0, 11.4, 65.5)	0°	lower lobe, basal region
6.05 μm, VOI6	48.85	23.09	(-19.3, -4.9, 59.7)	0°	lower lobe, basal region
2.5 µm, VOI1	32.00	9.69	(18.4, -19.5, -84.5)	24.6°	upper lobe, apical region
2.5 μm, VOI2b	14.00	9.70	(0.3, -20.7, -83.6)	24.6°	upper lobe, apical region
2.5 μm, VOI3	14.00	9.69	(-12.6, -24.6, -65.7)	24.6°	upper lobe, apical region
2.5 µm, VOI4	14.00	9.69	(20.5, -19.0, -43.0)	24.6°	upper lobe, medial region
2.5 μm, VOI5	38.25	9.67	(-22.1, 6.4, 63.5)	24.6°	lower lobe, basal region
2.45 µm, VOI1	8.52	9.33	(-12.6, -23.7, -67.5)	4.8°	upper lobe, apical region
2.45 µm, VOI2	11.93	9.33	(-7.7, 12.0, 63.0)	2°	lower lobe, basal region
2.45 µm, VOI6	4.90	9.33	(-19.3, -4.9, 65.1)	0°	lower lobe, basal region

Table 1. Volumes of interests and their anatomical references to the human left lung sample.



**Figure 3.** Exploration of the HiP-CT dataset of the human left lung. (**a**-**d**) Spatial correspondences of the measured cylindrical VOIs at different resolutions within the entire left lung. For each set of VOIs, both the medial (left) and sagittal (right) views are shown. The VOI label corresponds to the assignment in Table 1. (**e**) Renderings of two imaged VOIs with 6.5  $\mu$ m and 2.5  $\mu$ m voxel sizes, respectively. (**f**) From the whole lung and local zoom data, we visualize the anatomical detail of a spiculated lung nodule in the apical region of the lung on multiple lengthscales. The interlobular septa and perilobular vasculature of the secondary pulmonary lobules (SPLs) are clearly visible.

Folder name (.zip)	Binning	Image size	Voxel size ( $\mu$ m <sup>3</sup> )
25.08um_LADAF_2020-27_lung-left_pag-0.11_0.25_jp2_	1	$5984 \times 5984 \times 8720$	25.08 <sup>3</sup>
50.16um_LADAF_2020-27_lung-left_pag-0.11_0.25_jp2_	2	$2992 \times 2992 \times 4360$	50.16 <sup>3</sup>
100.32um_LADAF_2020-27_lung-left_pag-0.11_0.25_jp2_	4	$1496 \times 1496 \times 2180$	100.32 <sup>3</sup>
6.5um_LADAF-2020-27_lung-left_VOI-01_pag-0.07_0.43_jp2_	1	3856 × 3856 × 7506	6.5 <sup>3</sup>
13um_LADAF-2020-27_lung-left_VOI-01_pag-0.07_0.43_jp2_	2	$1928 \times 1928 \times 3753$	13.0 <sup>3</sup>
6.5um_LADAF-2020-27_lung-left_VOI-02b_pag-0.12_0.45_jp2_	1	$3854 \times 3854 \times 4114$	6.5 <sup>3</sup>
13um_LADAF-2020-27_lung-left_VOI-02b_pag-0.12_0.45_jp2_	2	$1928 \times 1928 \times 3753$	13.0 <sup>3</sup>
6.5um_LADAF-2020-27_lung-left_VOI-03b_pag-0.12_0.46_jp2_	1	$3852 \times 3852 \times 1402$	6.5 <sup>3</sup>
13um_LADAF-2020-27_lung-left_VOI-03b_pag-0.12_0.46_jp2_	2	$1926 \times 1926 \times 701$	13.0 <sup>3</sup>
6.5um_LADAF-2020-27_lung-left_VOI-04b_pag-0.12_0.46_jp2_	1	3856 × 3856 × 16318	6.5 <sup>3</sup>
13um_LADAF-2020-27_lung-left_VOI-04b_pag-0.12_0.46_jp2_	2	$1928 \times 1928 \times 8159$	13.0 <sup>3</sup>
6.5um_LADAF-2020-27_lung-left_VOI-05_pag-0.08_0.43_jp2_	1	$3852 \times 3852 \times 9202$	6.5 <sup>3</sup>
13um_LADAF-2020-27_lung-left_VOI-05_pag-0.08_0.43_jp2_	2	$1926 \times 1926 \times 4601$	13.0 <sup>3</sup>
6.05um_LADAF-2020-27_lung-left_VOI-01_pag-0.01_0.03_jp2_	1	3822 × 3822 × 1258	6.05 <sup>3</sup>
12.1um_LADAF-2020-27_lung-left_VOI-01_pag-0.01_0.03_jp2_	2	$1911 \times 1911 \times 629$	12.1 <sup>3</sup>
6.05um_LADAF-2020-27_lung-left_VOI-02_pag-0.01_0.19_jp2_	1	$3818 \times 3818 \times 6970$	6.05 <sup>3</sup>
12.1um_LADAF-2020-27_lung-left_VOI-02_pag-0.01_0.19_jp2_	2	$1909 \times 1909 \times 3485$	12.1 <sup>3</sup>
6.05um_LADAF-2020-27_lung-left_VOI-06_pag-0.02_0.25_jp2_	1	$3816 \times 3816 \times 8074$	6.05 <sup>3</sup>
12.1um_LADAF-2020-27_lung-left_VOI-06_pag-0.02_0.25_jp2_	2	$1908 \times 1908 \times 4037$	12.1 <sup>3</sup>
2.5um_LADAF-2020-27_lung-left_ROI-01_pag-0.02_0.25_jp2_	1	3878 × 3878 × 12802	2.5 <sup>3</sup>
5um_LADAF-2020-27_lung-left_ROI-01_pag-0.02_0.25_jp2_	2	$1939 \times 1939 \times 6401$	5.0 <sup>3</sup>
2.5um_LADAF-2020-27_lung-left_VOI-02b_pag-0.04_0.34_jp2_	1	$3880 \times 3880 \times 5600$	2.5 <sup>3</sup>
5um_LADAF-2020-27_lung-left_VOI-02b_pag-0.04_0.34_jp2_	2	$1940 \times 1940 \times 2800$	5.0 <sup>3</sup>
2.5um_LADAF-2020-27_lung-left_VOI-03_pag-0.02_0.04_jp2_	1	$3878 \times 3878 \times 5600$	2.5 <sup>3</sup>
5um_LADAF-2020-27_lung-left_VOI-03_pag-0.02_0.04_jp2_	2	$1939 \times 1939 \times 2800$	5.0 <sup>3</sup>
2.5um_LADAF-2020-27_lung-left_VOI-04_pag-0.02_0.29_jp2_	1	$3876 \times 3876 \times 5600$	2.5 <sup>3</sup>
5um_LADAF-2020-27_lung-left_VOI-04_pag-0.02_0.29_jp2_	2	$1938 \times 1938 \times 2800$	5.0 <sup>3</sup>
2.5um_LADAF-2020-27_lung-left_VOI-05_pag-0.02_0.24_jp2_	1	3868 × 3868 × 15300	2.5 <sup>3</sup>
5um_LADAF-2020-27_lung-left_VOI-05_pag-0.02_0.24_jp2_	2	$1934 \times 1934 \times 7650$	5.0 <sup>3</sup>
2.45um_LADAF-2020-27_lung-left_01_pag-0.03_0.05_jp2_	1	$3816 \times 3816 \times 3478$	2.45 <sup>3</sup>
4.9um_LADAF-2020-27_lung-left_01_pag-0.03_0.05_jp2_	2	$1908 \times 1908 \times 1739$	4.9 <sup>3</sup>
2.45um_LADAF-2020-27_lung-left_02_pag-0.02_0.06_jp2_	1	$3810\times 3810\times 4868$	2.45 <sup>3</sup>
4.9um_LADAF-2020-27_lung-left_02_pag-0.02_0.06_jp2_	2	$1905 \times 1905 \times 999$	4.9 <sup>3</sup>
2.45um_LADAF-2020-27_lung-left_06_pag-0.02_0.04_jp2_	1	3810 × 3810 × 1998	2.45 <sup>3</sup>
4.9um_LADAF-2020-27_lung-left_06_pag-0.02_0.04_jp2_	2	$1905 \times 1905 \times 999$	4.9 <sup>3</sup>

**Table 2.** Details of the hierarchical X-ray phase-contrast tomography data for human left lung.

Data processing of the measured X-ray projections consists of three stages, pre-reconstruction, reconstruction and postreconstruction, which are illustrated in separate rows in Fig. 2. Ring artefacts from the detectors are corrected in two steps: (1) Before reconstruction, the mean of the projections is subtracted from the projections to remove the rings with constant intensity rings; (2) After reconstruction, the residual inhomogeneous intensity rings were removed using the polar transform combined with linear motion blurring filter<sup>35</sup>. Tomographic reconstruction employs the phase and amplitude estimates obtained from Paganin's method<sup>36</sup>, followed by a 2D unsharp mask of the retrieved phase maps as input for the filtered backprojection algorithm. These reconstruction steps are implemented in PyHST2<sup>37</sup>. Eventually, the processed volumes are converted to 16 bit and binned further to produce the datasets described in Tables 1-2. The reconstruction and postprocessing steps are illustrated for the three types of imaged volumes, respectively, in Fig. 2. We summarize below the imaging and reconstruction protocols for the human lung at each imaged resolution including the key parameters.

• Full-field tomography (whole organ at 25.08  $\mu$ m voxel size, see Fig. 2a,c): The incident X-ray energy averaged at ~ 85 keV after filters, the propagation distance is 3475 mm. In total, two sets of 9990 projections were measured by the quarter-acquisition method<sup>25</sup> with an offset of 800 pixels for the half-acquisition. A step size of 2.2 mm in the vertical (z) direction is used to cover the height of the sample jar with a total of 98 quarter-acquisition subscans. Radiograph stitching is carried out to recover a half-acquisition scan<sup>34</sup> before the reconstruction.

• Local tomography of level 1 VOI (6.5  $\mu$ m and 6.05  $\mu$ m voxel size, see Fig. 2b,c): The incident X-ray energy averaged at ~ 88 keV (~ 89 keV) after filters, the propagation distance is 3500 mm (3475 mm) for the VOIs with 6.5  $\mu$ m (6.05  $\mu$ m) voxel size. In total, 6000 projections were measured by the half-acquisition method with an offset of 900 pixels. A step size of 2.2 mm in the vertical direction is used to cover the height of the VOIs.

• Local tomography of level 2 VOI (2.5  $\mu$ m and 2.45  $\mu$ m voxel size, see Fig. 2b,c): The incident X-ray energy averaged at ~ 77 keV (~79 keV), the propagation distance is 1440 mm (1500 mm) for the VOIs with 2.5  $\mu$ m (2.45  $\mu$ m) voxel size. In total, 6000 projections were measured by the half-acquisition method with an offset of 900 pixels. A step size of 1.5 mm in

the vertical direction is used to cover the height of the VOIs.

#### 115 Volume selection and anatomical reference

Besides the full-field tomography of the entire lung, subsequent smaller VOIs were selected with representative features and 116 imaged with local tomography at higher resolution, including 6.5  $\mu$ m (5 locations) and 6.05  $\mu$ m (3 locations) for level 1 and 117  $2.5 \,\mu m$  (5 locations) and  $2.45 \,\mu m$  (3 locations) for level 2 VOIs, respectively. All VOIs have a cylindrical field of view about 118 the rotation axis after removing the boundary artefacts from local tomographic reconstruction. To obtain the displacements and 119 rotations, the VOIs are spatially registered to the whole lung data by hand in VGStudio Max (version 3.4) and the procedure to 120 apply them is described in Usage Notes. The sizes of the VOIs, their displacements and rotations with respect to the center of 121 the whole lung data are listed in Table 1 and illustrated in Fig. 3a-d. In addition, we provide brief anatomical references to the 122 VOI spatial locations in Table 1 with respect to the whole lung data at 25.08  $\mu$ m. To retain traceable data provenance, we keep 123 the same alphanumeric label of the VOIs as used in the original experiments. Fig. 3e visualizes two selected VOIs in the lower 124

125 lobe of the lung.

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# 126 Data Records

We provide the volumetric data after reconstruction and post-processing as greyscale (16 bit) 2D image slices in JPEG2000 127 format stored in zipped folders. The compression level of JPEG2000 is carefully chosen to ensure minimal difference from 128 the original TIFF-formatted data when they are used for feature quantification or image segmentation. We list the details of 129 the deposited data is in Table 2. All data have been deposited at an ESRF data repository (https://human-organ-atlas.esrf.eu/) 130 with digital object identifiers (DOIs) assigned to each scanned volume as listed in Table 3. Each DOI refers to a volume at full 131 resolution and its binned versions. For all volumes of interests measured by local tomography, both the full resolution data 132 (Binning = 1) and the  $2 \times$  binned version (Binning = 2) are provided, while for the whole lung data, the  $4 \times$  binned version 133 (Binning = 4) is also provided. The metadata information in Table 1 is also provided in the corresponding text file contained in 134 each data deposit. 135

# **Technical Validation**

Although the radiation dose during tomographic scans is well below the tissue damage threshold<sup>25</sup>, due to radiation-induced

<sup>138</sup> bubble formation, the sample went through re-degassing before further measurements are made. A consequence is that not all

<sup>139</sup> of the VOIs have been imaged consecutively during the same beamtime. In the course of re-degassing, the sample was kept in

the container to maintain its position. The jar is then placed into the synchrotron X-ray beamline for further imaging. Care

Data description		DOI
Full-field tomography data at 25.08 $\mu$ m voxel size and binned versions (50.16 $\mu$ m, 100.32 $\mu$ m voxel sizes)		10.15151/ESRF-DC-572196058
	VOI1	10.15151/ESRF-DC-572235698
Local tomography data at 6.5 µm yoyal siza	VOI2b	10.15151/ESRF-DC-572236926
Local tomography data at 6.5 $\mu$ m voxel size and binned version (13.0 $\mu$ m voxel size)	VOI3b	10.15151/ESRF-DC-572237999
and binned version (15.0 $\mu$ m voxer size)	VOI4b	10.15151/ESRF-DC-572240585
	VOI5	10.15151/ESRF-DC-572242236
Local tomography data at 6.05 µm yoyal ciza	VOI1	10.15151/ESRF-DC-572230985
Local tomography data at 6.05 $\mu$ m voxel size and binned version (12.1 $\mu$ m versel size)	VOI2	10.15151/ESRF-DC-572231249
and binned version (12.1 $\mu$ m voxel size)	VOI6	10.15151/ESRF-DC-572232527
	VOI1	10.15151/ESRF-DC-572221364
Local tomography data at 2.5 $\mu$ m voxel size	VOI2b	10.15151/ESRF-DC-572222783
	VOI3	10.15151/ESRF-DC-572222987
and binned version (5.0 $\mu$ m voxel size)	VOI4	10.15151/ESRF-DC-572229061
	VOI5	10.15151/ESRF-DC-572229315
Local tomography data at 2.45 µm yoyal ciza	VOI1	10.15151/ESRF-DC-572191396
Local tomography data at 2.45 $\mu$ m voxel size and binned version (4.0, $\mu$ m voxel size)	VOI2	10.15151/ESRF-DC-572191782
and binned version (4.9 $\mu$ m voxel size)	VOI6	10.15151/ESRF-DC-572194514

Table 3. Information about the data records.

is exercised in the process such that the VOIs scanned before and after re-degassing can be registered to the whole volume
 without large deformation.

In the imaged volumes, contrast is produced by the local density differences between the lung tissue constituents and the hollow structures (e.g. airway, alveoli, blood vessels) filled with ethanol solution (see Fig. 3e-f). Within the whole lung data at a voxel size of 25.08  $\mu$ m, the interlobular septa, the boundaries of the secondary pulmonary lobules<sup>38,39</sup> and the perilobular vasculature, are clearly visible (see Fig. 3f). At high spatial resolution, the local density difference increasingly becomes the dominant contributor to image contrast for VOIs<sup>25</sup>. The consistent contrast across lengthscales provides unprecedentedly detailed information for the study of lung morphology in health and disease.

## 149 Usage Notes

The multiscale healthy human lung data presented here have been used as clinical control data in studies comparing damage within the lung microstructure due to Covid-19 infection<sup>25</sup>. The datasets are deposited as 2D image slices perpendicular to the rotation axis (z in Fig. 1) in tomography geometry. These images may be directly loaded into any typical image processing software for viewing or further quantification. To align the VOIs to the whole lung data, the following transform should be applied to the VOI,

$$I'(x,y,z) = T(dx,dy,dz)R_z(\theta_z)I(x,y,z).$$
(1)

Here I and I' are intensity-valued volumetric data, T is the 3D translation operator, and  $R_z$  the 3D rotation operator around z

axis (see Fig. 1b-c). The displacement vector (dx, dy, dz) and z rotation angle  $\theta_z$  for each VOI is listed in Table 1. The greyscale

ranges of the images are selected with an intensity margin to avoid saturation. Viewing directly by eye may require threshold
 adjustment.

## 154 Code availability

<sup>155</sup> The code used for the preprocessing, tomographic reconstruction and postprocessing is available on GitHub

156 (https://github.com/HiPCTProject/Tomo\_Recon).

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# **Author contributions statement**

P.D.L. and P.T. conceived the experiment. P.D.L., C.L.W. and P.T. coordinated the collaboration. A.B. harvested the lung from
the organ donor and prepared the lung for imaging along with P.T.. S.M. designed the sample holder for organ imaging. P.T.
conducted the imaging experiment at ESRF BM05 beamline and reconstructed the volumetric data. R.P.X. analyzed the data
with help and instructions from P.T., S.V., W.L.W., J.J., M.A. and D.D.J.. R.P.X. wrote the first version of the manuscript. All
authors reviewed and discussed the manuscript to bring it to the final form.

# 256 Competing interests

<sup>257</sup> The authors declare no competing interest in the content of the article.