

X-ray computed tomography evaluations of additive manufactured multi-material composites.

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1	X-ray computed tomography evaluations of additive
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9	Abstract

Additive Manufacturing (AM) often produces complex engineered structures by precisely 10 11 distributing materials in a layer by layer fashion. Multi-material AM is a particularly flexible technique able to combine a range of hard and soft materials to produce designed composites. 12 13 Critically, the design of AM multi-material structures requires the development of precise 14 three-dimensional (3D) computer aided design (CAD) files. While such digital design is highly employed, techniques able to validate the physically manufactured composite against the 15 digital design from which it is generated are lacking for AM, especially as any evaluations 16 must be able to distinguish material variation across the 3D space. In this paper, a non-17 destructive approach using X-ray computed tomography (XCT) is used to fully evaluate the 18 3D distribution of multi-materials from an AM process. Specifically, two diverse hard and soft 19 materials are alternatively produced in the form of a fibre embedded in a matrix. XCT coupled 20 with imaging evaluation were able to distinguish between the differing materials and, 21 importantly, to demonstrate a reduction in the expected fabricated volumes when compared to 22 the respective CAD designs. 23

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34 Introduction

Three-dimensional (3D) additive layer manufacturing (AM), commonly referred to as 35 36 3D printing, has shown significant potential in fabricating complex parts. The attractiveness of AM is based on digital designs, with almost arbitrary shape and complexity being translated to 37 a physical model through additive material deposition. Limits in free form fabrication of 38 classical manufacturing such as mould jetting and CNC machining have been overcome using 39 AM approaches_{2 3 4 5}. The flexibility of AM lies in the development of computed aided design 40 (CAD) that are subsequently translated in standard tessellation language (STL), which controls 41 42 the physical production of either simple mono-material or more organised multi-material parts. For the latter, multi-material AM has attracted the attention of material scientists due to its 43 ability to construct engineered composites. The recent availability of multi-jetting technology 44 is of significant importance and, as a result of this importance, has led to the recognition within 45 ISO and ASTM international standards6 7 8. However, techniques able to validate the digital 46 designs of the AM composite with the ability to evaluate compositional changes across the 3D 47 space are lacking. Common inspection methods, such as optical microscopy (OM) and 48 49 scanning electron microscopy (SEM), are widely used to provide detailed topological and compositional information inspecting the surface of a sample before or after testing. 50 51 Compositional information can be further provided integrating SEM with an energy Dispersive X-ray spectrometry systems (EDS)9 but both SEM and EDS fundamentally allow two-52 dimensional (2D) inspections only. 53

The work herein presented attempts to define a suitable method of evaluating AM 54 multi-material composites. While the approach is flexible for a range of composite structures, 55 consideration of an AM material jetting system is provided. Material jetting systems exploit a 56 piezoelectric ink-jet print head to precisely deposit on demand nano-droplets of photo-curable 57 materials containing a photo initiator. A photo-polymerization system is coupled to the 58 59 piezoelectric printing head to cure the droplets which then form a solid polymer, layer by layer, onto a building platform known as substrate10 11. The light coming from an ultraviolet (UV) 60 lamp activates the curing process of the photopolymer layers, each one sticking to the previous 61 layer until the entire designed part is realised. Typically, these materials are similar in physical 62 characteristics such as density, which makes attempts to differentiate them a challenge using 63 OM and SEM unless variations in surface finish or colour are apparent. 64

In previous studies12 optical and SEM investigations were useful to monitor mechanical testing of multi-material composites, which allowed computational predictions on crack development and related energy dissipation/toughening strategies of biologically inspired

structures¹³ ¹⁴. In another study, two materials of contrasting hard and soft mechanical properties were combined to explore the effects of simple 3D chess patterns, printed in a voxelbased manner with varying dimensional parameters to influence the fracture path. SEM was employed to routinely highlight contours of different regions as well as failure lines predominantly propagating through the rigid material during mechanical testing¹⁵.

73 Despite imaging techniques such as OM and SEM are able to provide topological information on the surface of shaped materials, complementary imaging techniques such as X-74 75 ray computed tomography (XCT) are necessary to reveal volumetric information where the 76 other imaging techniques are not practical. Probed samples, whether they are single objects, hierarchical assemblies of materials, exhibit internal features that are detected and 77 reconstructed using computed image techniques based on the interaction of X-rays with matter. 78 Indeed, XCT generates 3-dimensional representations of objects, typically non-destructively, 79 hence allowing sample monitoring before, during and after a particular testing regime is applied 80 to the sample. As composites are used predominantly in structural applications, mechanical 81 testing is usually applied to evaluate deformation and failure of the various constituent 82 83 materials as well as the resultant structure₁₆₋₁₉. XCT allows mapping of the effective density distribution in the fabricated part, which predominantly defines the attenuation between the 84 85 probe X-ray and material. The generated 3D map consists of voxels that are displayed with a greyscale value related to the X-ray attenuation of the material²⁰ ²¹. If materials identification 86 87 is possible, CAD designed features and triangulated surfaces (meshes) resulting from the image processing after XCT scanning can be compared. So far, the use of XCT combined to AM has 88 89 been primarily oriented to investigate and compare mono-material AM parts against CAD 90 models, thus considering topology primarily. Routine studies have evaluated the porosity of a 91 structure produced from a stereolithography AM process using XCT imaging where the 92 material and porous space provided significant variation in the X-ray probe attenuation with 93 the sample22. XCT investigation of AM multi-material structures have been performed to analyse the location, for example, of active pharmaceutical ingredients compacted within a 3D 94 printed carrier20, evaluate the interfacial density variation between copper and steel and 95 examine alloying of molybdenum particles in titanium parts produced via laser powder bed 96 fusion23. In some cases, synchrotron XCT techniques were used to accurately determine 97 distribution of pores and inclusions in the same sample manufactured with laser metal 98 deposition₂₄. 99

100 Currently the use of XCT to determine composition of AM multi-material structures 101 has been neglected especially when employing multi-jetting technology to facilitate the production of polymeric composite structures where different materials within such structures have similar densities²⁵ ²⁶ ²⁷. Understanding the variation in composition for AM multi-material structures has been shown to be important in determining the fracture development of the structure during mechanical loading. Composite materials incorporating bone, biocalcite and bone-like geometries²⁸ ²⁹ ³⁰ ³¹ were produced using ink-jetting AM and avoiding multistep parts assembly of soft phase and hard-stiff inclusions to reproduce the mechanical interplay between phases and toughening mechanisms inspired by nature.

In the work presented here, XCT is employed to qualitatively and quantitatively analysethe assembly of ink-jet multi-material AM composites made of soft and hard phases.

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Figure 1. XCT-based workflow to approach and inspect AM composite parts.

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A composite structure comprising of a single hard fibre feature embed in a softer matrix 115 material was imaged using XCT. Reconstructed images were analysed in terms of surface area 116 and volume to be compared to the original CAD sources according to the schematic in Figure 117 1. A critical aim of the evaluations is the potential for XCT to distinguish between different 118 UV curable 3D printing materials but similar in density, hence in X-ray attenuation. Hard and 119 soft materials were allocated to both matrix and inclusion to detect any difference in contrast 120 and shape. The proposed XCT-based workflow aims to compare input drawings with the 121 manufactured ones, maximizing contrast between the fibre and matrix. 122 123

124 Material and Methods

125 Design and 3D printing

An interlocking single fibre composite was designed in Rhinoceros 3D 5.0 (Robert McNeel 126 and Associates, USA) in the form of complementary regions defined by precise geometrical 127 boundaries. The interlocking shape was chosen to allow warping of thin walls as a result of the 128 manufacturing process, which will then be highlighted within the geometrical difference 129 between the CAD design and the XCT reconstruction. The resultant CAD model is displayed 130 in Figure 2a, where a rectangular feature is included in a matrix characterised by narrow neck 131 (2 mm) and a wide body (10 mm). The nominal thicknesses of the matrix and fibre are 3 mm 132 and 2 mm, respectively. An inkjet-based 3D printer (ProJet 5500X, 3D Systems, USA) allowed 133 for the simultaneous layered deposition of two base materials, namely a hard-white material 134 (VisiJet® CR-WT 200) and a soft black material (VisiJet® CE-BK) from the same 3D printer 135 manufacturer. These materials are referred to in this paper as WT and BK, respectively. The 136 3D printer resolution was set to an ultra-high definition 13 µm layer thickness (750 x 750 x 137 2000 Dots per Inch (DPI)), which is the highest performance of the 3D printer used in this 138 study. Two sample configurations of black fibres in a white matrix (BK into WT) and white 139 fibres in a black matrix (WT into BK) were designed (Figure 2b). 140

141 XCT evaluation

Evaluations of the 3D printed samples were carried out using an XCT system (Versa 520, Carl 142 Zeiss Microscopy Ltd., USA) operating with a 70 kV/6 W. Polyurethane foam material was 143 used to support and hold in place the parts within a box confining the volume of interest within 144 the XCT system. A 29 µm isotropic voxel size was achieved from imaging samples with a total 145 of 1601 projections over 360°. Each projection was collected at a 2 s exposure time. The 146 reconstruction of image datasets of the two scanned samples was performed using Scout and 147 Scan software (Zeiss) and rendered using XM3DViewer 1.2.8 (Zeiss). Figures 2c and 2d depict 148 the output of the rendering showing the difference between a BK into WT and WT into BK 149 assembly. 150

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Figure 2. Representation of the interlocking fibre composite. a) CAD drawing of the multi-material part. The
matrix is reported in black, the inner fibre in red. All the dimensions are in mm. b) Fabricated parts with
complementary materials allocation. XCT reconstruction of the corresponding composites (c) BK in WT
and (d) WT in BK.

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160 Image post-processing

The resultant XCT images were post-processed using a semi-commercial software (MeVisLab, 161 MeVis Medical Solutions AG, http://www.mevislab.de/). The post-processing was applied to 162 enhance contrast between the WT and BK materials as well as allowing quantitative 163 comparison between the digital composite designs and the resultant AM physical output. The 164 image processing workflow was built connecting components in a cascade fashion (Figure 3a). 165 X-ray tomograms were imported in MeVisLab to define an interactive reconstruction of 166 Volumes of Interest (VOIs). For the purpose of this study, a visual script aimed at recognising 167 greyscale distribution in the samples was generated and then followed by a procedure of 168 segmentation via region growing to discern different phases. Given the similar densities of the 169 materials used, a filtering procedure based on Gauss smoothing was necessary to homogenise 170 the greyscale value of the voxels belonging to the same phase. The GaussSmoothing 171 component provided by MeVisLab, performs an isotropic smoothing to the image dataset in 172

input. A gauss sigma equal to 2 was adopted to set the window of the filter kernel. A calibration 173 step performed on the overall shape of the samples was necessary to verify that the applied 174 Gauss filtering would maintain the same volume of the original geometry. Threshold values to 175 segment VOIs were found analysing the histograms of each data-sets or materials combination. 176 The region growing procedure started with the selection of a *seed* that is a voxel belonging to 177 the considered XCT image dataset. The region was then expanded to neighbouring voxels in 178 which grey values are coincident or fall in an interval defined by the user and named Threshold 179 Interval Size [%]. For this purpose, a seed was placed within the VOI (matrix plus fibre), 180 181 adopting a threshold interval size to be decreased in a multistep procedure.





Figure 2. Schematic showing: (a) the overall workflow and the subsequent steps to (b) place the red region growing pixels cluster (seed) into the core region to be separated from the rest; (c) datasets comparison before and after Gauss smoothing to homogenise the highlands effects within the fibre core; (d) region growing procedure starting from the seed previously introduced and (e) the final post-processed imaging highlighting a discrete fibrous object within a matrix.

The multistep procedure aimed to identify the optimum threshold to segment the sample as 189 multi-material piece. Figure 3b describes how to highlight the VOI decreasing the threshold 190 interval size. Once the VOI has been segmented, the second step of the region growing 191 procedure aimed to separate the fibre from the matrix. The two regions are spatially assembled; 192 therefore, the image dataset was processed applying a Gauss smoothing filtering to homogenise 193 pixel intensity (Figure 3c). The contrast between fibre and matrix was enhanced to facilitate a 194 further region growing segmentation, separating fibre from matrix. The fibre itself represents 195 the new VOI; thus, all the grey values belonging to the matrix were neglected. The starting 196 197 seed was placed in the fibre and multistep procedure used to identify the Threshold Interval Size [%] for both BK fibres into WT matrix and vice versa. The threshold Interval Size [%] in 198 the multistep was decreased to highlight a core volume comparable to the one of the designed 199 200 fibres.

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202 Meshes geometric difference

Quantification of geometrical differences between CAD and XCT datasets was performed 203 using a Hausdorff distance criterion. Specifically, MeshLab v. 1.3.4beta (Visual Computing 204 Lab, ISTI, CNR) applied a sampling filter called Hausdorff distance, based on the Metro digital 205 tooL₃₂. The tool numerically compares two triangulated meshes representing the same surface 206 at different levels of detail. In the current study the two surfaces are represented by the ideal 207 CAD drawing and the resultant reconstructed mesh surface after image processing. The 208 difference between two meshes results in an approximation error that can be defined as the 209 distance between corresponding sections of the meshes. Such differences are evaluated by 210 considering a point p on a surface S, such that a distance to another point can be defined by e 211 (p,S) thus: 212

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 $e(p,S) = \min_{p' \in S} d(p,p')$ Equation (1)

Where d is the Euclidean distance between two points in the space E₃. The distance between two surfaces S₁ and S₂ is then defined as:

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$$E(S1,S2) = \max_{p \in S_1} e(p, s_2)$$
 Equation (2)

This definition of distance is not symmetric such as $E(S_1,S_2) \neq E(S_2,S_1)$. A two-sided distance (Hausdorff distance) may be obtained by taking the maximum of $E(S_1,S_2)$ and $E(S_2,S_1)$. The MeshLab command uses a sampling function that computes the aforementioned formula. A number of points p₁ is defined onto a mesh or surface S₁. The search is carried on for each point p₁ to find the closest point p₂ on the mesh or surface S₂. The software reports numerical results in mesh units with a red through green to blue map reporting a corresponding increasing coincidence between the digital design and AM physical object.

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227 Results

228 Image processing: VOIs thresholding

Figure 4 shows a comparison between the volume segmentation before (RAW dataset) and

after the Gauss smoothing.





y-axis for each iteration step. The black squares represent for the procedure applied to the. RAW datasets.
The triangles draw the trends for the. RAW dataset after Gauss smoothing. The red cross and triangle
represent the best threshold interval sizes for each dataset. Finally, the horizontal line traces the best case for
the segmentation procedure matching the ideal volume of interest from CAD drawings. Trends for best
threshold interval size [%] multistep region growing procedure are depicted for the (c) BK fibre and for the
(d) WT fibre.

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Threshold interval sizes [%] of 17.5% and 13%, around the volume of the original CAD drawings of 600 mm₃, were identified for BK into WT composite RAW data set and Gauss smoothed (Figure 4a), whereas values of 9.4 % and 7.5 % were found for the WT into BK composite (Figure 4b). Variation in the recorded volume during each iteration of the growth are also shown in Figure 4a for BK into WT and Figure 4b WT into BK. The original CAD drawing defined a target fibre volume of 32 mm₃, which was reached in Figure 4c and Figure 4d for optimised threshold interval sizes of 1.2% and 1.4%.

Table 1. Geometrical dimensions from CAD drawings compared to those of the reconstructed meshes after
 XCT scanning of BK into WT and WT into BK materials. Absolute relative changes are reported as
 percentage of the CAD values.

		CAD	BK into WT	WT into BK	Abs. Relative Difference (%)	
		CAD			BK into WT	WT into BK
Matrix Volume	(mm3)	600.0	554.2	542.9	7.6	9.5
Fibre Volume	(mm3)	32.0	31.4	30.8	1.9	3.7
Matrix Surf. Area	(mm2)	669.8	635.6	637.2	5.1	4.9
Fibre Surf. Area	(mm2)	72.0	71.2	70.8	1.1	1.7
Matrix width	(mm)	10.0	9.9	10.1	1.5	1.1
Fibre width	(mm)	2.0	2.6	2.3	30.0	15.0
Matrix length	(mm)	24.0	23.9	24.0	0.4	0.2
Fibre lenght	(mm)	8.0	8.6	8.1	7.5	1.2
Matrix thickness	(mm)	3.0	3.2	3.2	6.6	6.7
Fibre thickness	(mm)	2.0	1.9	2.2	5.0	10.0

Triangulates surfaces comparison

A further investigation was carried out in CAD environment to provide insights into the accuracy of the reconstructed VOIs in terms of linear measurements of width, length and thickness. Table 1 outlines the results of several geometrical comparisons referring to

reconstructed meshes to the original CAD drawing. The analysed parameters were volume, 254 surface area, width, length and thickness for both the reconstructed fibre and matrix. To have 255 comparable measurements, geometries were aligned in x, y and z axis and bounding box 256 volumes retrieved. For consistency, the fibre and matrix lengths, widths and thicknesses 257 measurements were taken from the bounding box. Surface area and volume were evaluated 258 again in the 3D modelling environment Rhinoceros. 259

260 Meshes geometrical differences

Resultant Hausdorff distance maps are shown in Figure 5. Red and blue are the boundary 261 colours representing distances between the meshes (0.00 mm to 0.38 mm) for the matrix and 262 (0.00 mm to 0.49 mm) for the fibre, respectively. The BK fibre into the WT matrix displayed 263 maximum Hausdorff distances of 0.38 mm (Figure 5a) and 0.49 mm (Figure 5 a1) for the matrix 264 and fibre respectively, whereas the WT into BK composite showed smaller distances for matrix 265 (0.38 mm, Figure. 5b) and fibre (0.38 mm, Figure 5 b1). 266



269 Figure 5. Geometrical difference applied to the reconstructed VOIs using the Hausdorff distance in Meshlab 270 for matrix (top) and fibre (bottom). The reconstructed geometries were compared with the respective CAD 271 drawings, BK into WT (a, a1) and WT into BK (b, b1). The distance range is visually reported and 272 represented by a shade of colours that goes from blue to red accompanied by the relative variation.

273 Discussion

Multi-material AM avoids multistep parts assembly typical of composites materials 274 manufacturing. A full exploitation of multi-material AM requires a complete examination of 275 the 3D printed builds for modelling purposes and to eventually rely on composite theories for 276 prediction and tuning of the mechanical interplay between composite phases. Although 3D 277 printing can accurately reproduce specific designed models, the prints can deviate from the 278 designed models. For this reason, volumetric information is needed and XCT is clearly 279 280 advantageous when compared to other imaging techniques that are constrained to 2D investigation. XCT systems have been designed for applications of industrial metrology 281 becoming the only commercially-available, non-destructive method to perform dimensional 282 283 measurements of internal geometrical features33 34. Among all the added benefits of a nondestructive volumetric investigation, XCT 3D representations of objects can be processed and 284 analyzed to be further compared to their original drawings, showing coincidence between 285 manufactured and digital volumes. So far, XCT has been mainly employed to determine 286 287 distribution of random inclusion in the same manufactured sample, evaluate distribution of pores, interfacial density variation between different phases as well as degradation of 288 pharmaceutical 3D printed drug delivery dosage forms22 20 23 24. Although material extrusion 289 such as FDM is commonly used in prototyping composite parts, AM technologies such as ink-290 jet printing, are now capable of producing higher resolution parts with improved densities and 291 mechanical properties33. Particularly, ink-jetting gained attention as a credible industrial 292 method, due to its scalability and multi-material part production₃₅ and a better understanding 293 of geometrical variations in the 3D printed build relative to the different materials used to 294 produce the multi-material composite is of paramount importance. 295

296 The aim of this study is to implement a procedure able to qualitatively and quantitatively analyse the direct assembly of ink-jet 3D printed composites. The proposed workflow was able 297 298 to determine the composition of a single fibre composite that is a simplified version of AM polymeric composites previously proposed 25 26 27. Differentiating the core fibre from the bulk 299 300 within AM composite with XCT resulted challenging mostly due to the presence of phases 301 with similar densities. Most ink-jet print heads work best with inks of low viscosity at/or near 302 room temperature33. This could be impairing XCT ability to discriminate elements with similar attenuation and dimensions, such as ink-jets. To be effective XCT needs to be coupled with 303 304 imaging techniques able to reconstruct and partition regions in an image. To this purpose Gaussian smoothing was used to 'blur' images and remove detail and noise. In this sense it is 305

similar to the mean filter but it uses a different kernel that represents the shape of a Gaussian 306 ('bell-shaped') hump. One of the principal reasons for using a Gauss filter is due to its frequency 307 response able to reduce the high spatial frequency components from an image₃₆. Compared to 308 other linear filters such as the Mean filter, gaussian blurring is a linear operator rather than non-309 linear. Contrary to the mean filters which performs a uniform weighted average, the degree of 310 smoothing of a gaussian filter is determined by the gaussian standard deviation; the output 311 represents a weighted average of each voxel's neighborhood rather than uniform smoothing. 312 Other filters such as the Median are non-linear and are famous to remove details and noise and 313 314 to preserve edges37. In the case of this study edges were reconstructed combining the Gaussian operator to a region growing procedure due to the fact that edges where not defined. Indeed, 315 what appeared as a cluster of islands in the data sets core region, were joined to form a boundary 316 that reflected the fibre shape. This aspect was fundamental for the XCT visualisation of the 317 fibre core region in this study. Moreover, a complementary materials allocation WT into BK 318 and WT into BK was considered to understand how this could affect the manufacturing process 319 hence deviating from the original CAD design according to different materials allocation. The 320 gauss filter successfully smoothed and interconnect the sub-regions in the fibres, enhancing the 321 contrast between matrix and fibre. Finally, a multistep region growing procedure helped in 322 323 defining thresholding values to isolate a continuous fibre from the external matrix.

Further analysis in terms of surface area and volume were performed on the resulting meshes 324 STL and directly compared to files CAD source after both XCT datasets were converted into 325 STL files to perform a geometrical difference with the CAD drawing. Table 1 allows critical 326 considerations of the investigated material assemblies. The volume of the whole sample was 327 coincident to the CAD model in terms of volume and surface area where the largest discrepancy 328 was shown from the BK fibre into the WT matrix. A decrease in volume for both samples BK 329 330 into WT and WT into BK of 7.6% and 9.5 % respectively, can be related to either the XCT voxel size or material behaviour during production. The volume of the embedded fibres was 331 almost replicated with the digital design, showing a 3.7% and 1.9% volume reduction in 332 comparison to the original CAD drawing of the fibre. The surface area of the matrix and fibre 333 for both material combinations slightly differed from the design, showing a maximum of 5.1% 334 surface area loss for BK into WT composite. Width, length and thickness of the parts and the 335 fibre all differed for less than a 10% compared to the CAD drawing, except for the widths of 336 the fibre, which were found to be bigger by 30% and 15% for the BK into WT and WT into 337 BK, respectively. This can be explained by referring to the ink-jet AM process, which uses a 338

roller/planerizer in order to flatten the printed parts and remove bubbles and excess of material

from the printed layer, according to the resolution set for the AM process₃₈. Critically, the fibre

core of the composite, is still partially cured by the UV light when the roller passes onto the

- layer, spreading the core in the XY plane while pushing the fibre to spread at the interface into
- the matrix. This appears to be more effective for the combination BK into WT where the black
- 344 elastomeric material is the fibre.

345 Conclusion

An original metrology tool applied to multi-material AM composites has been investigated 346 within this study. Two different allocation of materials, BK into WT and WT into BK, were 347 considered to investigate manufacturing fidelity when fibre and matrix were mutually produced 348 with rigid WT and flexible BK materials, but complying with the same CAD drawing. XCT 349 helped to produce a virtual model of the 3D printed part, showing regions very similar in 350 density, hence difficult to be distinguished and compared. In order to stabilize the workflow, 351 the procedure considered a region growing calibration step performed on the overall shape of 352 the samples without considering the embedded fibre. This study demonstrates the viability of 353 XCT to quantitatively analyse AM multi-materials prototypes made of soft and hard phases 354 produced via ink-jet AM. This investigation was relevant in defining design boundary 355 conditions below which features are partially reproduced in respect to the original digital 356 drawings, with the potential of affecting the phases mechanically interplay, which is 357 358 fundamental for materials science and engineering composite applications.

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