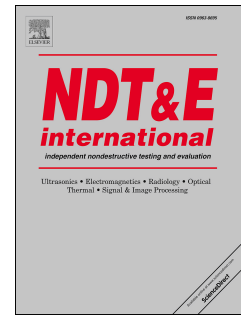


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# Spatial Resolution of a Laboratory Based X-Ray Cone-Beam Laminography Scanning System for Various Trajectories

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## Abstract

Computed laminography (CL), a long established NDT method, is ideal for the non-destructive evaluation of plate-like structures, for which conventional computed tomography (CT) is less well suited. This paper demonstrates the feasibility of implementing raster CL on a Nikon Metrology custom build X-ray CT scanner without the need for specialised equipment. To provide a more principled way to demonstrate the widespread adoption of CL for defect characterization in plate-like structures, a test specimen was designed and manufactured from Polyoxymethylene (Delrin) that allows well defined features of different size and orientation to be characterized. The study highlights the relation between direction-dependent spatial resolution, feature geometry and scan trajectory. It demonstrates that high-resolution and high-speed in situ volume-imaging of plate-like structures with large aspect ratios is viable at levels that would be challenging via CT or alternative three-dimensional NDT methods.

**Key words:** Computed laminography; Resolution.

## 1 Introduction

X-ray computed tomography (CT) is one of the well-established and widely accepted imaging modalities in many different applications such as medical sciences [1, 2], animal imaging [3, 4], material science [5], geoscience [6, 7] as well as many other engineering applications [8-10]. CT is also the gold standard in post-failure analysis for engineered components e.g. air crash investigations [11].

CT provides three-dimensional information with nominally isotropic resolution, from a macroscopic level [12, 13] down to a microscopic level (e.g. to the fibre architecture and porosity distribution in composite materials [14-16]) with a high accuracy. Tomographic information is acquired by taking a finite number of radiographic projection images systematically from equally spaced projection angles while an object is rotated more than  $180^\circ$  with respect to an X-ray source and detector. Volumetric images are estimated by feeding the

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projections into a ‘reconstruction algorithm’, such as the filtered back projection (FBP) algorithm. FBP techniques provide fast reconstruction time [17], and works well if enough, low noise projection images are available. With more challenging data sets, alternative iterative reconstruction techniques can have significant advantages [18-20].

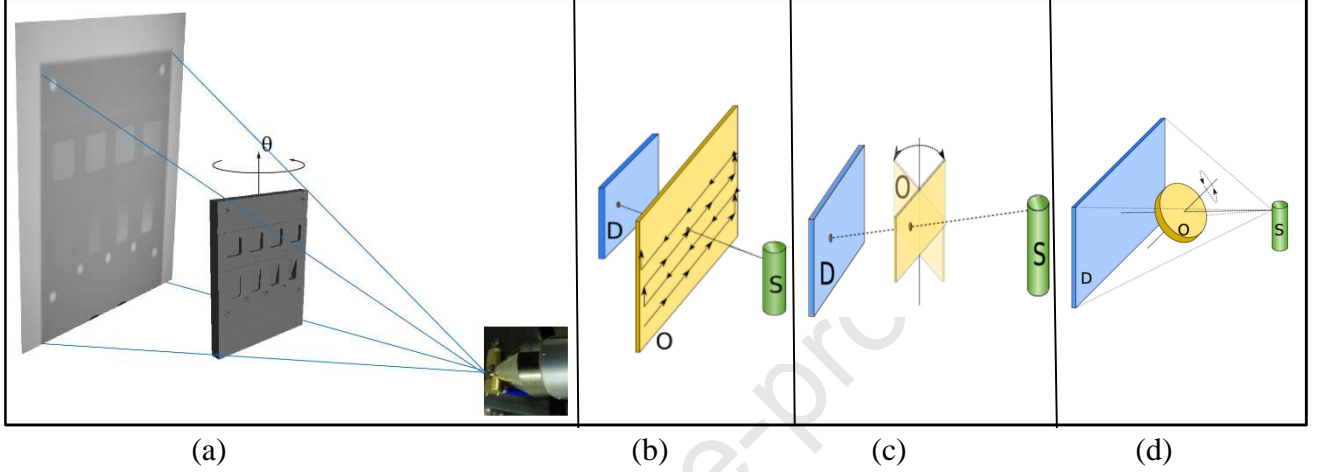
To acquire high resolution scans, CT is limited by the size and geometry of the objects. Traditional CT scanning is best suited to approximately cylindrical objects, but the technique is less well suited to the inspection of plate-like components/structures especially for high resolution imaging with cone-beam systems. There is now an increasing demand for three dimensional inspection of such components/structures including ball grid arrays [21], paintings [22, 23], printing circuit boards [24-26], fossils [27], and composite panels in the aerospace industry [18, 28, 29]. For instance, many aerospace composite panels are potentially very large but extremely flat structures, such as aircraft wings and tails and therefore have extremely high aspect ratios which are extended beyond the field of view of the detector. In such scans, if the path lengths through the scanned object vary dramatically at different angles, or if extreme differences in the object's diameters in longitudinal and transversal direction exist, scanning and reconstruction is challenging. Moreover, these structures may prevent a full rotation due to the risk of collision with the X-ray tube. Therefore, the structure has to be positioned away from the source resulting in decreased magnification and consequently a poorer resolution.

Several solutions to the problem of scanning plate-like objects with high aspect ratios have been explored, including dual-energy scanning [30-33], and region of interest (ROI) scanning [16, 17]. The former requires additional scanning time, and both solutions still require a full rotation of the object, and are thus limited to smaller components or lower resolution scans. An alternative is computed laminography (CL) which has recently received increasing attention [28, 29, 34-38]. In CL, the angular information is obtained by alternative trajectories which do not necessarily require full object rotation, in contrast to conventional CT, where a full rotation is necessary. Research has been reported in the literature demonstrating the efficiency of CL to volumetric inspection of plate-like structures, mostly composite panels with high aspect ratios [39-41]. CL is thus a viable alternative to ultrasonic inspection, when inspecting hybrid materials, such as aluminum bonded to composites which are increasingly used in aerospace applications [42], and which are challenging to inspect with ultrasound due to multiple interfaces, variable and complex geometries and different elastic properties.

In laminographic scanning, relative motion between the source and the test object generates a range of scan trajectories [26, 28, 38, 40, 43-46]. Many of these scan trajectories allow laterally extended samples to be imaged at high-resolutions. Moreover, the technique provides similar

X-ray transmission path lengths for each projection [18, 39, 47], increasing achievable image contrast.

The implementation of certain trajectories requires the relative movement of source and detector [28, 46]. As calibrated motion of X-ray source and/or detector are often challenging, limited angle and rotary laminography are gaining more attention in industrial applications as they can be implemented on standard CT scanners by moving the sample only, Fig. 1.



**Fig. 1.** Schematic diagram showing (a) Laminography set up (b) Raster trajectory [28], (c) Limited angle trajectory [28], (d) Rotary trajectory [28]. Note that  $D$ ,  $O$  and  $S$  represent detector, object and source respectively.

In raster laminography, the sample is moved to positions on a grid of points in the plane orthogonal to the central X-ray beam and hence is well suited to scan relatively large components. Refs. [29, 46] report that raster laminography is able to detect sharp features that lie in the main plane of the motion, but features in the direction perpendicular to this are less well resolved. In limited angle laminography, the object is rotated through a smaller angular range, e.g.  $\pm 25$  degrees, around an axis parallel to the plane of detector, whilst in the rotary laminography the test object is fully rotated but around an axis tilted relative to the plane of the detector. It has been reported in [45] that rotary laminography can produce reconstructions of superior quality in the plane parallel to the object face, when compared to limited-angle CT. The advantage of raster scan trajectories is that they allow inspection of large flat-like components, whilst limited angle and rotation based methods focus on a region of interest at a time. On the other hand, the use of a single rotation axis makes system calibration and post-scan geometric error correction easier.

However, the drawback of all CL methods is that, in contrast to CT, specific trajectory dependent directions within the object are not investigated, resulting in poor feature detectability/loss of information in said directions. It is therefore crucial to tune the trajectory

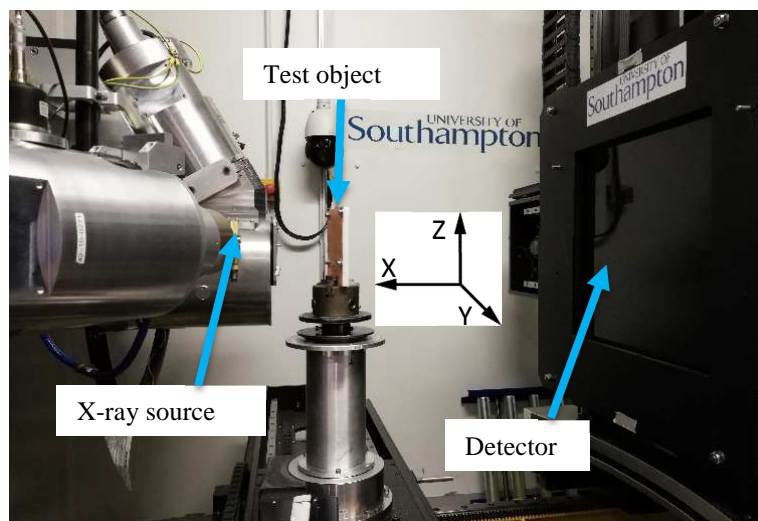
of a CL system to balance the trade-off between the amount of acquired laminographic information against the weight dimension and geometry of the test object. Additionally, iterative reconstruction algorithms e.g. simultaneous iterative reconstruction technique (SIRT) or conjugate gradient least squares (CGLS) [48] generally provide better image quality [49, 50] compared to standard filtered back projection (FBP) methods for reconstruction [26], e.g. Feldkamp-Davis-Kress (FDK). Iterative reconstruction allows the use of additional prior information (e.g. CAD data) to guide the reconstruction [48, 51], however, at the expense of additional computation cost.

Initial experiments demonstrate benefits and drawbacks of different design options and scanning trajectories [29, 38, 44-46]. This paper uses a test specimen manufactured with features with different orientations and scales in order to provide a quantitative evaluation of anisotropy in reconstructed images, focusing particularly on raster and limited angle CL inspection of aerospace flat-like structures. The influence of different reconstruction methods is highlighted.

## 2 Materials and Methods

### 2.1 Custom build X-ray CT scanner

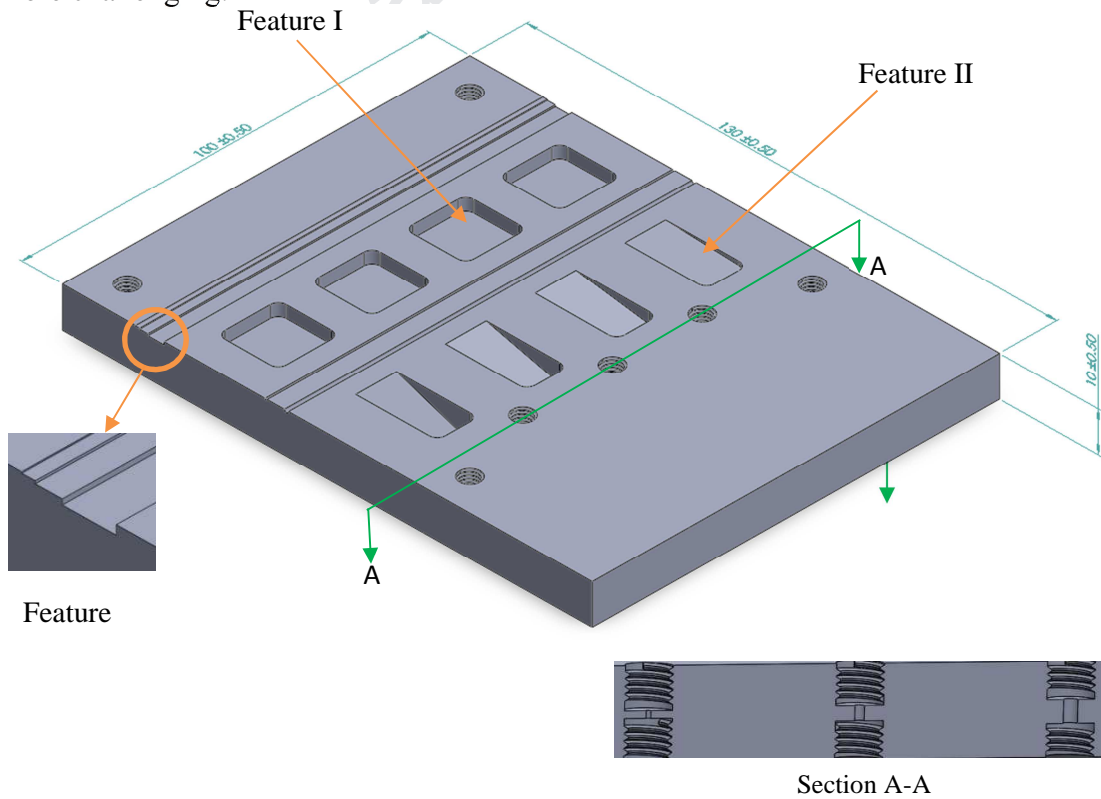
The imaging experiments have been carried out at the  $\mu$ -VIS X-ray Imaging Centre at the University of Southampton. A Nikon Metrology custom X-ray CT scanner that contains a 225kV micro focus X-ray source with a tungsten reflection target, a sample stage that moves in  $x$  and  $y$  direction and a 400 mm by 400 mm (2000 $\times$ 2000 pixel with 0.2 mm pixel pitch) high sensitivity flat panel detector (Perkin Elmer XRD 1621 CN3 EHS) was used to perform the experiments, Fig. 2. Motion in the  $z$ -direction was achieved by translating source and detector. Only the existing scanner motions (such as source, detector and sample stage motions) were used to generate the desired scanning trajectories.



**Fig. 2.** Custom build walk-in bay X-ray CT scanner for laminography of the test specimen.

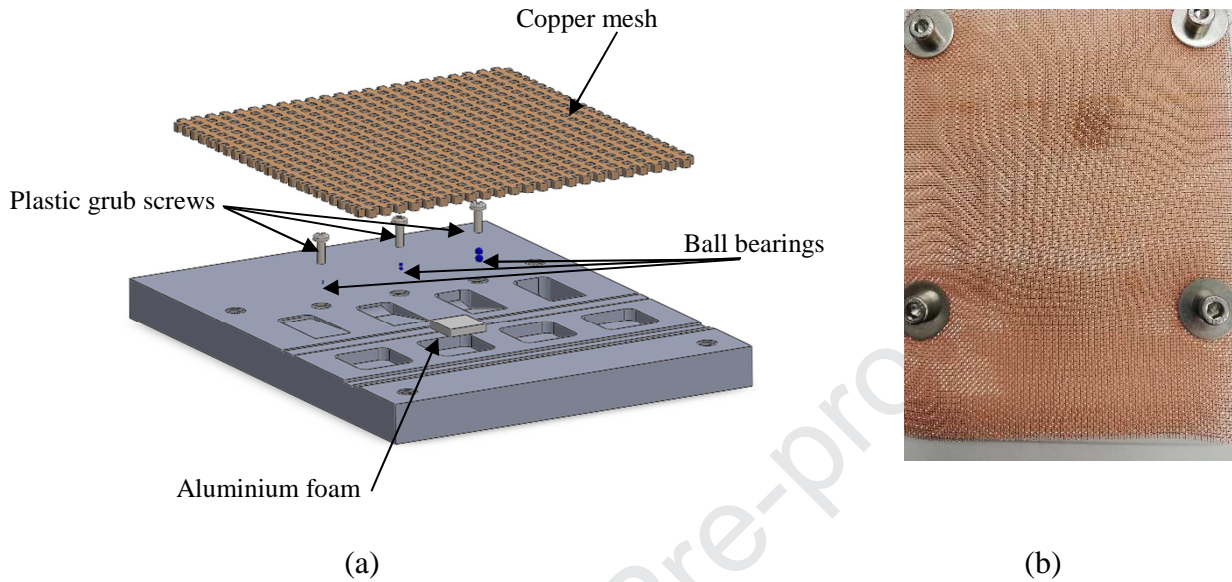
## 2.2 Sample design and manufacture

To simulate aerospace composites, as one of the attractive applications of CL inspection, the test specimen was designed and manufactured from Polyoxymethylene (Delrin) which does not introduce significant scatter, and has a low X-ray attenuation coefficient. This specimen is a flat panel with high aspect ratio and has several features such as steps, wedges of different depth and measures  $130\text{ mm} \times 100\text{ mm} \times 10\text{ mm}$  as detailed in Appendix A. Three specific features, as shown in Fig. 3, are characterised in the remainder of this paper. Three dimensional characterization of the manufactured test specimen is extremely difficult as it has several features in the thickness direction which are potentially less well resolved in subsequent reconstructions. Several inserts of different thicknesses i.e. an aluminum foam and touching pairs of hardened chrome steel ball bearings of different diameter (0.5, 1 and 1.5 mm), Fig. 4, exist to examine the quality of CL reconstruction. Moreover, a copper meshes of A5 size (mesh number 30, 0.28 mm wire thickness) was provided to be mounted on one side of the specimen to simulate lightning strike protection as used on some aerospace composites. It was expected that the copper mesh, would introduce artefacts that would make the interpretation of the results more challenging.





**Fig. 3.** The desired features of the test specimen. Cross-section A-A shows the arrangement for inserting and fixing the pairs of steel ball bearings, which are held in place using plastic grub screws inserted from both sides.



**Fig. 4.** The 3D layout of the test specimen after assembly: (a) Schematic illustration of inserts along with the copper mesh (b) The specimen after assembly.

### 2.3 Laminographic data acquisition

The sample was mounted on the rotation stage parallel to the detector and data was acquired using different laminographic trajectories as detailed in Table. 1. Each trajectory moved the sample linearly along a grid of points in the plane parallel to the detector. This motion was achieved using the scanner's linear axis which move the rotation stage (y-direction) and the source/detector assembly (z-direction). For trajectory A we repeated the same raster motion three times, but in each of these raster scans, we rotated the sample around the z axis to a different rotational offset. For all trajectories, the overall number of projections was 48, apart for trajectory C where it was 49.

In trajectory A, the sample was moved in a line along the y-axis and projections were taken at 16 equidistant points with a step size of 14.25 mm, see Fig. 1(b). This scan was repeated for three angular positions around the rotation axis, using 0 degrees (parallel to the detector) and  $\pm 30$  degrees, see Fig. 1(c). This trajectory samples the largest angular range among the proposed trajectories and can be considered as a combination of raster and limited angle trajectories.

Trajectory B also moved the sample in a line, this time using a step size of 4.75 mm, but without the rotational steps. In Trajectory C, the test object was moved to positions on a regular 7×7 (y and z directions) grid of points in the plane orthogonal to the X-ray beam with grid spacing of 33.25 mm. Trajectory D was similar to trajectory B, but with movement in the z-direction.

In all of the above experiments, the source voltage was set to 120 kV with power adjusted to 23 W and the exposure time per projection was 134 ms. The source to detector distance was set to 802 mm whereas

Trajectory	Number of points in Y direction	Number of points in Z direction	Rotation angle (degrees)	Number of projections
A	16	1	0, $\pm 30$	48
B	48	1	0	48
C	7	7	0	49
D	1	48	0	48

the source to specimen distance was 255 mm, resulting in a geometrical magnification of 3.14, an effective pixel size of 63.7  $\mu\text{m}$ , and field of view of 127.4 mm. The cone angle in the x-y plane covered by the detector was  $\pm 12.25^\circ$ .

Table. 1. The scanned trajectories applied in the experiments

Additionally, a region of interest (ROI) of the specimen containing the ball bearings was scanned with higher resolution. Here, the effective pixel size was 23  $\mu\text{m}$ . The trajectory consisted of a  $800 \times 3$  (y-z) grid of points. Other scan parameters were kept as in the previous scans. A third scan was performed with the copper mesh attached to the specimen using trajectory A (the pixel size was 0.0637 mm). To study the effect of an increased number of projections and finer sampling, the specimen was scanned in a  $24 \times 24$  regular raster grid with step size of 9.5 mm in y and z at three angular positions (i.e.  $0^\circ$  and  $\pm 30^\circ$ ).

Nikon Metrology's Inspect-X version 2 was used to perform scan trajectories. Custom macros were written in Visual Basic for Applications (VBA) that generated the coordinates of each point in the trajectory and request the system manipulator move to that point. After each move, a radiograph was acquired and metadata written (including the requested and reported position of the system manipulators, as well as X-ray beam and imaging system parameters).

## 2.4 Reconstruction

Images were reconstructed using Feldkamp-Davis-Kress (FDK) [52] and CGLS [48, 51] algorithms implemented in the TIGRE toolbox [53, 54]. In FDK, generally a 1D high-pass



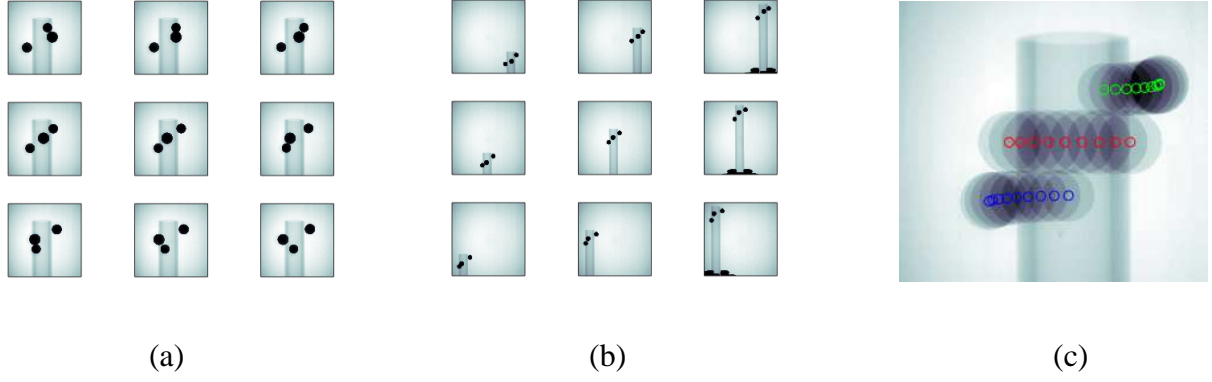
filter in the direction perpendicular to the axis of rotation used. In this work, the data were filtered with a 2D Fourier ramp filter instead to account for the possible virtual rotation around the horizontal axis in trajectories C and D. For consistency and comparability, all datasets were filtered with the same kernel. Prior to filtering, the projections were padded to 2048 pixels by repeating the edge values. This reduced line artefacts common in raster laminographic scans [29]. CGLS was used due to its fast convergence. Vertical line artefacts in CGLS were removed after reconstruction. To this end, we chose a horizontal slice containing no features and subtracted it from all slices in the dataset.

## 2.5 Geometric calibration

Laminographic data reconstruction relies on the precise knowledge of the system and scan geometry. In particular, we need to know the relative positions and orientations of source, object and detector. For our scan trajectories, we thus need to know the exact orientation of the different linear axis in the system as well as the position of the rotation axis relative to these. Whilst these parameters can be estimated from a knowledge of the system geometry and the encoder values provided by the system, we conducted a separate calibration scan to provide better estimates of these geometric parameters.

One approach for geometric calibration of tomosynthesis systems uses a calibrated phantom with markers at known positions [55-57]. This method, however, relies on the availability of a calibrated phantom with markers at known locations. Instead, an approach based on Ref. [58] is used here where one or several markers with unknown relative positions are imaged but with the manipulator in different configurations. These projection images contain sufficient information for an accurate characterization of the system geometry, including test object location, source location, detector location and orientation and the alignment of linear and rotational manipulator axes. The accuracy of this method relies on the manipulator system's accuracy which was found in [58] to allow the geometry to be estimated with sufficient accuracy to guarantee average geometric errors in the projected image to be below pixel size.

To perform geometric calibration, three small high precision chrome steel spheres (6 mm diameter, grade 10 hardened) were glued onto an X-ray transparent plastic tube to form the calibration phantom. The tube then was mounted on the system manipulator. To calibrate the linear axis, nine projections at two different magnifications were acquired in a raster configuration as shown in Fig.5 (a) and (b). For rotational axis calibration, the manipulator was rotated through a range of rotational offsets ( $60^\circ$ ), Fig.5 (c). Geometric information was then extracted as described in [58].



**Fig. 5.** The calibration scans (a) Magnification 3.14 (b) Magnification 2 (c) Rotation at magnification of 3.14.

### 3 Result and discussion

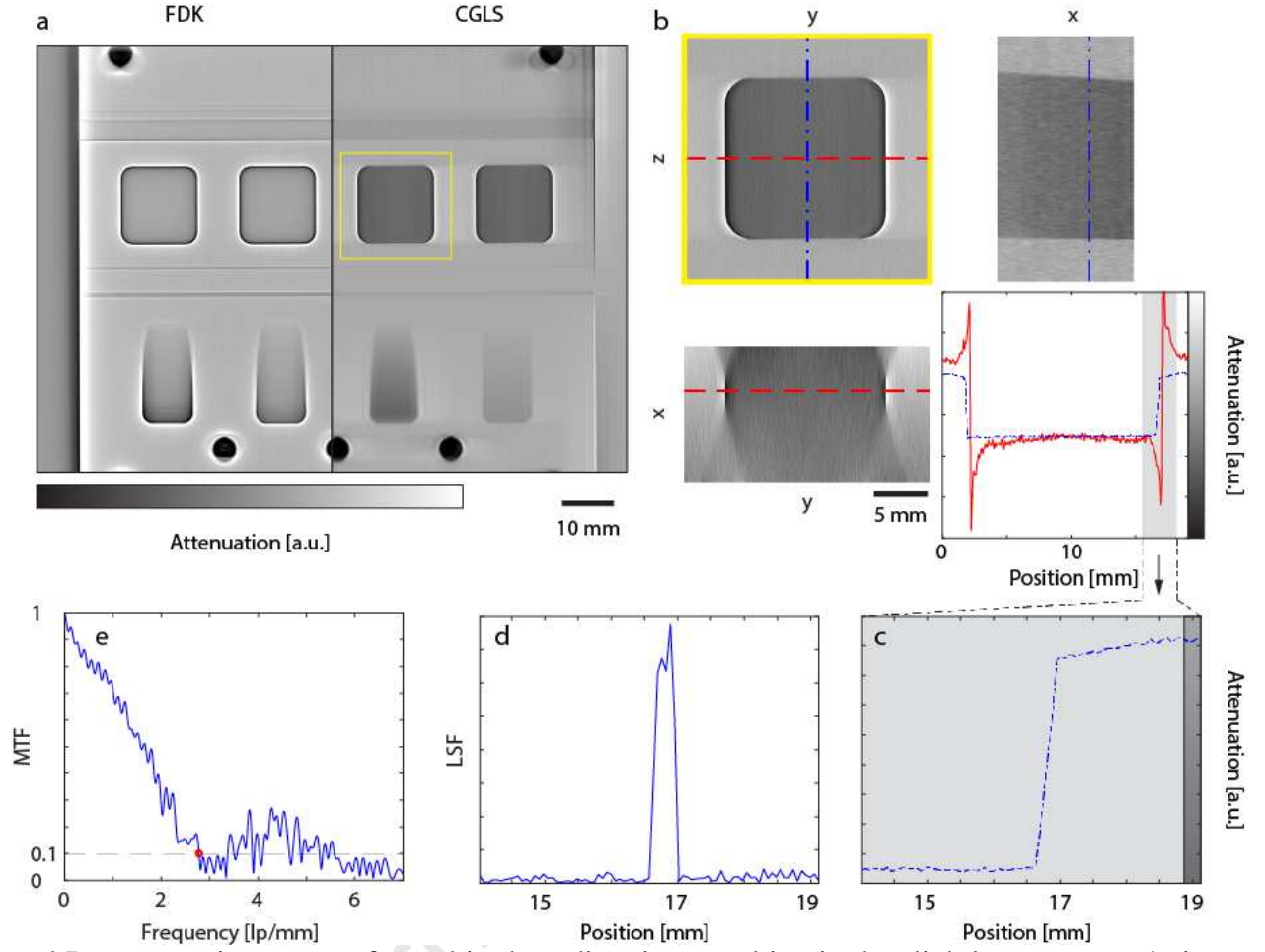
#### 3.1 Edge response as function of trajectory and reconstruction algorithm

##### 3.1.1 Feature I

A vertical slice through the dataset reconstructed with the FDK algorithm (left) and 10 iterations of CGLS (right), using trajectory B, is shown in Fig. 6 (a). The analyzed region of the slice is highlighted by the yellow square. We found that CGLS converged with a good accuracy after 10 iterations. Running more iterations (i.e. 20 and 40) results in no significant improvement in the image quality. Three orthogonal cuts through the region of interest are shown in Fig. 6 (b). Line profiles along the horizontal line (red, dashed) and vertical line (blue, dot-dashed) are shown in the graph. As it is evident, no clear edge can be identified in  $x$ -direction due to the poor spatial resolution along the beam direction. In order to compare the effectiveness of the studied trajectories, the spatial resolution is calculated from the 10% modulation transfer function (MTF) value of straight edges in  $x$ ,  $y$  and  $z$  directions, as shown in Table. 2 for both FDK and CGLS.

In Fig. 6 (d) the line spread function (LSF) was calculated as derivative from the line profile across the edge as shown in Fig. 6 (c). The MTF, shown in Fig. 6 (e) was obtained from the power spectrum of the LSF. The spatial frequency where the MTF drops to 10% of the zero component was chosen as the measure of spatial resolution. Despite the lack of a clear edge in the  $x$ -direction, the method is still valid as long as the spatial resolution is better than a threshold.

Higher sampling in a specific direction leads to improved resolution in the same direction whereas a larger angular range improves the resolution in beam direction. For trajectories A



and B, no scanning was performed in the  $z$  direction, resulting in the slightly poorer resolution in this direction compared to  $y$ , roughly 20% for A and 45% for B. Conversely, the resolution in  $z$  improves in trajectories C and D, at the cost of resolution in  $y$ . This demonstrates that the resolution highly depends on the trajectory chosen.

**Fig. 6.** The calculation of square window, (a) Vertical slice through the dataset reconstructed with the FDK (left half) and CGLS (right half), (b) Three orthogonal cuts through the analyzed region, (c) Line profile across an edge, (d) The line spread function, (e) The modulation transfer function.

Resolution in the beam direction, i.e.  $x$ -direction, is linked to the angular range covered. In trajectories B-D, the angular range is determined by the cone angle of  $24.5^\circ$ , whereas trajectory A, where the specimen was scanned at three different angles, covered an angular range of  $73.5^\circ$  resulting in improved resolution in  $x$  direction. This supports the choice of trajectory depending on the required resolution in any specific direction. The 2D filter kernel used for FDK reconstruction leads to edges along the  $y$  and  $z$  directions being enhanced independent of

trajectory chosen. This can lead to the MTF approach failing, as was the case for the y-direction in trajectory D, see Table. 2. Additionally, the tabulated values obtained for the FDK in beam direction are unreasonably small, indicating the method is unreliable to determine spatial

Trajectory	Resolution in X direction (mm)		Resolution in Y direction (mm)		Resolution in Z direction (mm)	
	CGLS	FDK	CGLS	FDK	CGLS	FDK
A	1.6316	0.3279	0.1026	0.0891	0.1214	0.0999
B	7.2516	0.1925	0.0796	0.0686	0.1155	0.098
C	6.5264	N/A	0.1514	0.0682	0.1225	0.0691
D	6.5264	0.3490	0.0917	N/A	0.0771	0.0783

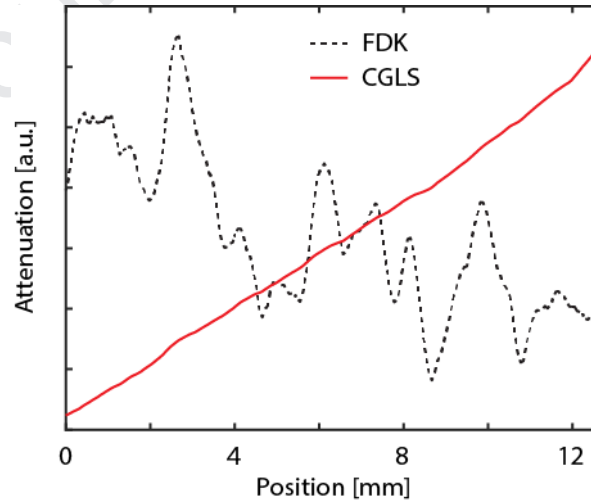
resolution in this case. Fig. 7 shows attenuation line profiles in beam direction across the dataset for both reconstructions. Whereas CGLS yields monotonically increasing attenuation values consistent with a highly out of focus edge, the FDK reconstruction results in a wavy curve not suitable for MTF analysis.

Table. 2. Spatial resolution in three orthogonal direction

**Fig. 7.** Line profiles across the  $x$ -direction for trajectory B

### 3.1.2 Feature II

Another feature of interest is the wedge with the smallest depths, see Feature II in Fig. 3, which

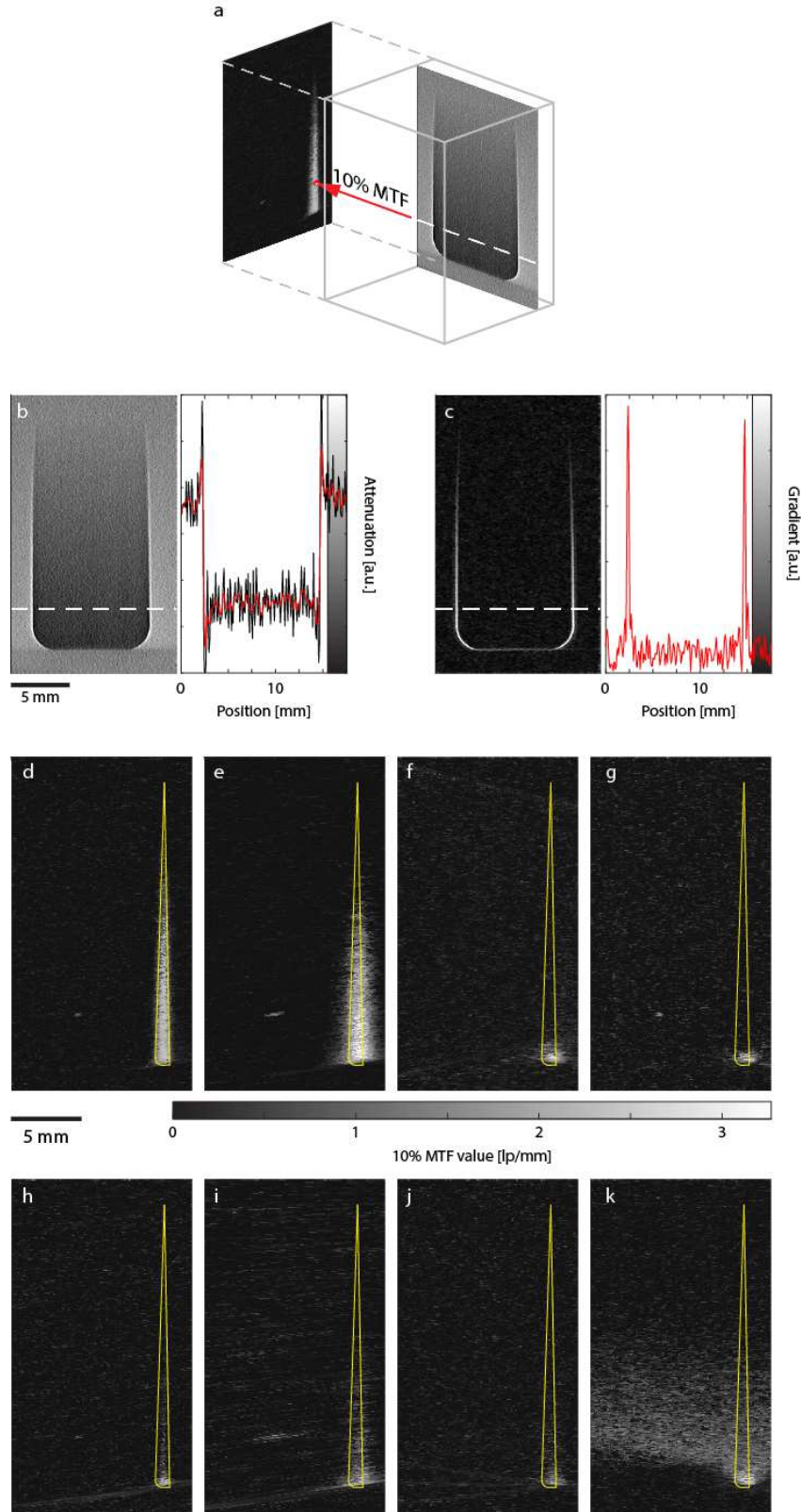


is characterized in Fig. 8 using a similar approach presented in previous section. For each line in the volume of interest (VOI), the 10% MTF in y-direction as exemplified in Fig. 8 (a) is used as an indicative of how well the edges are reproduced.

A vertical slice through the VOI and a line profile along the dashed line are shown in Fig. 8 (b). The red line is a smoothed version of the black line (Gaussian kernel, sigma of 1.5 pixels). The

in-plane gradient of the slice presented in Fig. 8 (b) is shown in Fig. 8 (c), which is equivalent to the LSF. The spatial resolution in line pairs per mm (lp/mm) derived from the 10% MTF value for each line in the dataset is shown for trajectories A through D in Figs. 8 (d-g) for the GCLS and Figs. 8 (h)-(k) for the FDK, indicating how well the location of features perpendicular to the beam direction can be estimated depending on their extension in the beam direction. The cross-section of the feature, obtained from the CAD data, is indicated in yellow.

For CGLS, trajectory A best matches the ground truth, with MTF 10% values well above the background level for an edge depth above  $\sim 0.5$  mm inside the yellow area, and on background level outside. Thus, features with an extension above 0.5 mm in beam direction are faithfully reproduced, indicating that the spatial resolution in beam direction is even better than estimated in Table 2. Trajectory B overestimates the actual depth of the wedge (by a factor of approximately 3). For the other trajectories, the edge is not well reproduced, showing that sampling perpendicular to the edge was insufficient in these cases. In contrast to this, FDK does not work well for any of the trajectories.



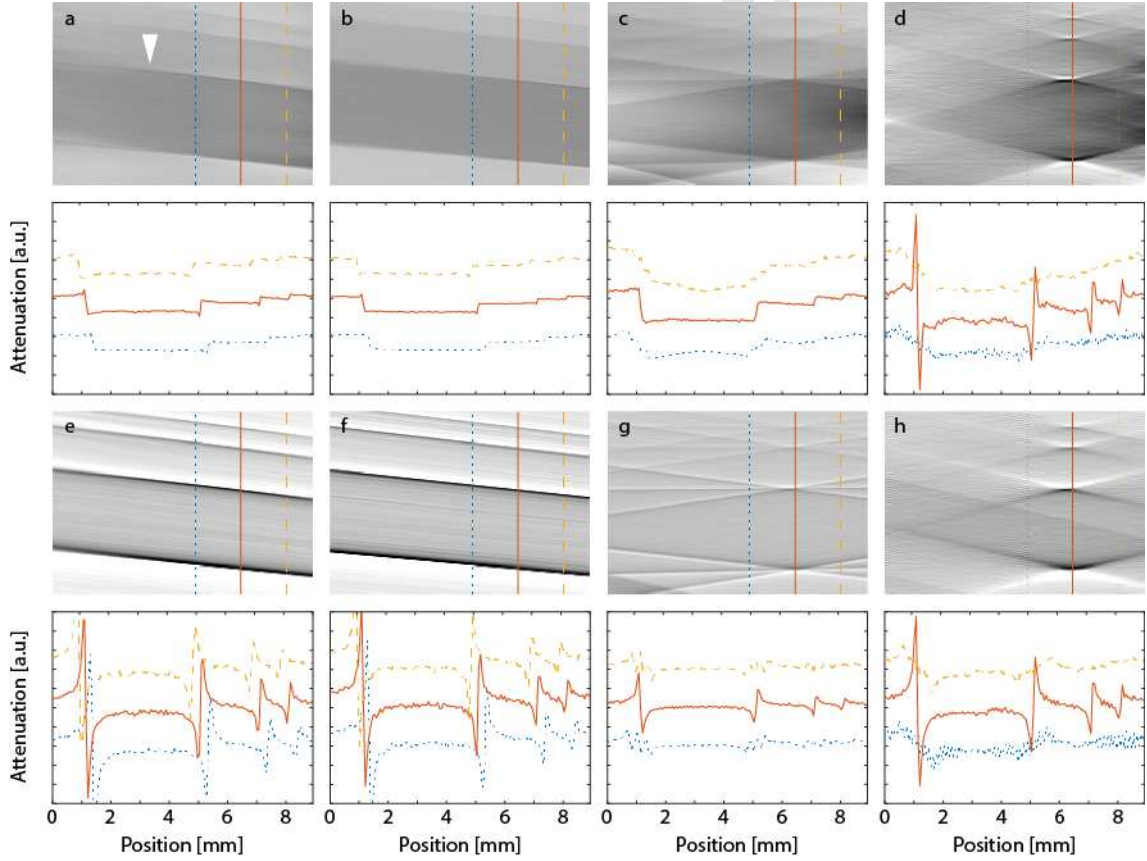
**Fig. 8.** Characterization of the wedges (a) The vertical slice through the volume of interest, (b) the attenuation line profile along the white dashed line (c) In-plane gradient of the line profile (d)-(g) The 10% MTF value derived from the datasets reconstructed with 10 iterations of CGLS, trajectories A through D, (h)-(k) The 10% MTF value derived from the datasets reconstructed with 10 iterations of FDK, trajectories A through D.



## 3.2 Feature detectability in beam direction

### 3.2.1 Feature III

This section characterizes the resolution in beam direction by analyzing the laminographic data acquired for the step feature (Feature III in Fig. 3). As detailed in Appendix A, three steps with 1 mm, 2 mm and 4 mm depth are located in the beam direction. Fig. 9 presents the  $x$ - $z$  cross section through the steps along with related line profiles at varying depths. The brown (solid) line corresponds to a depth where all step walls are in focus, whereas the dashed lines are shifted 2.5 mm in beam direction in positive and negative direction, respectively. Note that in the graphs, they are artificially shifted in the vertical direction for clarity. For trajectories A and B, no clear delimitation of the step walls is visible due to the fact that the scanning direction was parallel to the step extension in  $y$ . Note that in trajectory A, the step wall starts to blur at a distance from the steps as indicated by the arrow in Fig. 9 (a) due to the higher angular range in



this trajectory.

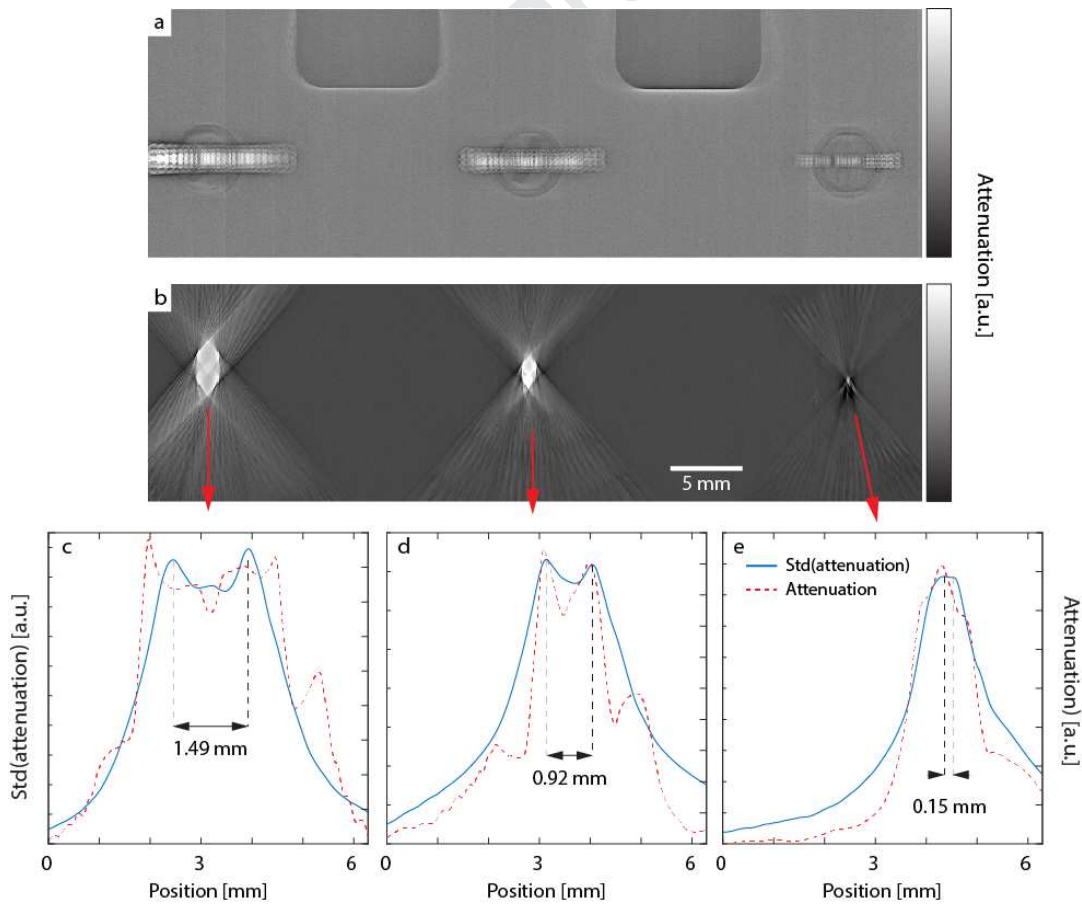
**Fig. 9.** Characterization of the steps (a)-(d) The datasets reconstructed with 10 iterations of CGLS, trajectories A through D, (e)-(h) The datasets reconstructed with FDK, trajectories A through D.

Trajectories C and D reproduce better response to the changes of the step heights, where trajectories were partially and entirely perpendicular to the edge extension, respectively. This is

exemplified by the line profiles, where the step walls become less visible with increasing distance from the feature for trajectories C and D. This insight is consistent with the results shown in Fig 8. Edges are best represented when the trajectory is perpendicular to the edge.

### 3.2.2 Ball bearings

As the balls are touching, the center to center distance is known. Determining the center to center distance in the reconstructed data is, therefore, an additional way of characterizing the resolving power in the beam direction. Figs. 10 (a) and (b) show vertical ( $y$ - $z$ ) and horizontal ( $x$ - $y$ ) slices through the CGLS reconstructed data of the ROI scan. Note the considerable amount of artefacts, due to the slice not passing through the ball bearings. In Figs. 10 (c)-(d), the attenuation line profiles along with the related standard deviation are shown, in order to determine the center-to-center distance. The standard deviation can be considered a measure of sharpness of an image [59]. Thus, it will be highest where the ball bearings come into focus. As shown in Figs. 10 (c)-(d), it is able to characterize the center to center distance for the largest and middle size bearings reasonably well, however, it fails to correctly characterize the center-to-center distance of the 0.5 mm bearings.

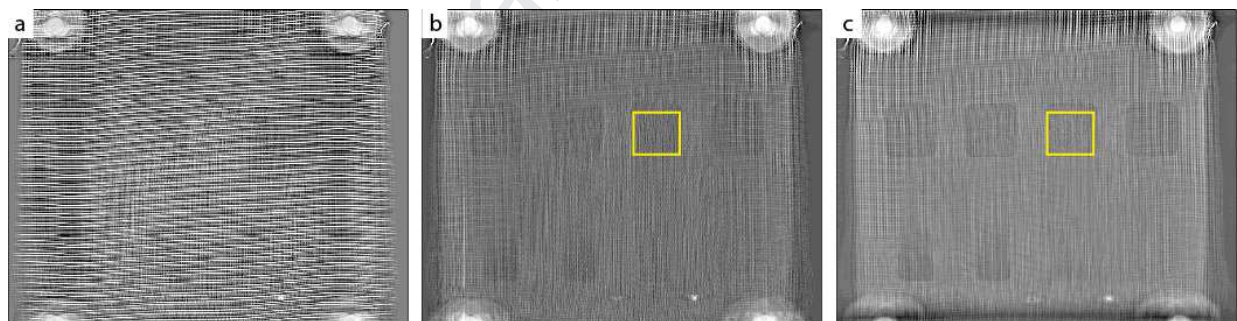


**Fig. 10.** Characterization of the ball bearings. (a) Top view slice (b) Front view slice (c) Attenuation line profile for the 0.5 mm diameter ball (d) Attenuation line profile for the 1.0 mm diameter ball (e) Attenuation line profile for the 1.5 mm diameter ball.

### 3.3 Reconstruction of more challenging datasets

Composites panels in aerospace applications are often covered with a copper mesh lightning strike protection. To examine the effects of this additional component, a copper mesh was added on the specimen and an additional scan performed with the mesh in place as shown in Fig. 4. In X-ray laminographic imaging, this produces visible artefacts throughout the reconstructed volume.

To compare the robustness of FDK and CGLS in reconstructing of more challenging data sets, the whole volume of the test object was reconstructed using trajectory A. At magnification of 2. The scan parameters were kept the same as in Section 2.3. Fig. 11 shows slices that are roughly 5 mm away from the copper mesh, reconstructed with FDK (a) and in CGLS (b and c). Strong artefacts generated by the copper mesh are observed in the FDK reconstruction that do not allow any of the features to come in focus. CGLS reconstruction shows a marked improvement and also allows identifying the aluminum foam, indicated by a yellow square in the Figs. 11 (b) and (c). Increasing the number of projection by a factor 36, Fig. 11 (c), further reduces the severity of the artifacts. However, it comes at the expense of higher scanning time. Due to the artifact introduced by the copper mesh, resolution measurements similar to those discussed



above, were not feasible here.

**Fig. 11.** Comparison of a same slice in FDK and CGLs. (a) Reconstructed by FDK 48 projections (b) Reconstructed by CGLS 10 iterations 48 projections (c) Reconstructed by CGLS 10 iterations 1728 projections.

## 4 Conclusion

A lab-based laminography system that allows the study of a wide range of laminographic scan trajectories was implemented. The exploratory experiment in the present work has shown that the implemented trajectories serve as a reasonable basis from which to proceed and perform relatively short scans, including ROI scans, and subsequent reconstruction for the

characterization of features in the designed test specimen. We here focused on different methods to evaluate anisotropic spatial resolution. The analysis of results produces the following key points:

1. It was demonstrated that enough information can be acquired by computed laminography to characterise certain structural features in plate-like objects with high aspect ratio.
2. The conjugate gradient least squares (CGLS) reconstruction algorithm improved image quality compared to standard filtered back projection (FBP) methods, e.g. Feldkamp-Davis-Kress (FDK). The quality of the data reconstructed with FDK proved insufficient for the reliable characterization of features in the beam direction.
3. The edges of features were well reproduced, however resolution depends on relative orientation of edges and scan trajectory: trajectories perpendicular to edge features improved feature characterization.
4. Higher sampling in a specific direction lead to improved resolution in that same direction whereas a larger angular range improves the resolution in the beam direction. Therefore, a wider angular range coupled with a higher sampling rate is desirable.
5. Adding a copper mesh on the top surface of the specimen to simulate lightning strike protection was extremely detrimental to image quality. CGLS reconstruction, once again, shows a notable improvement.

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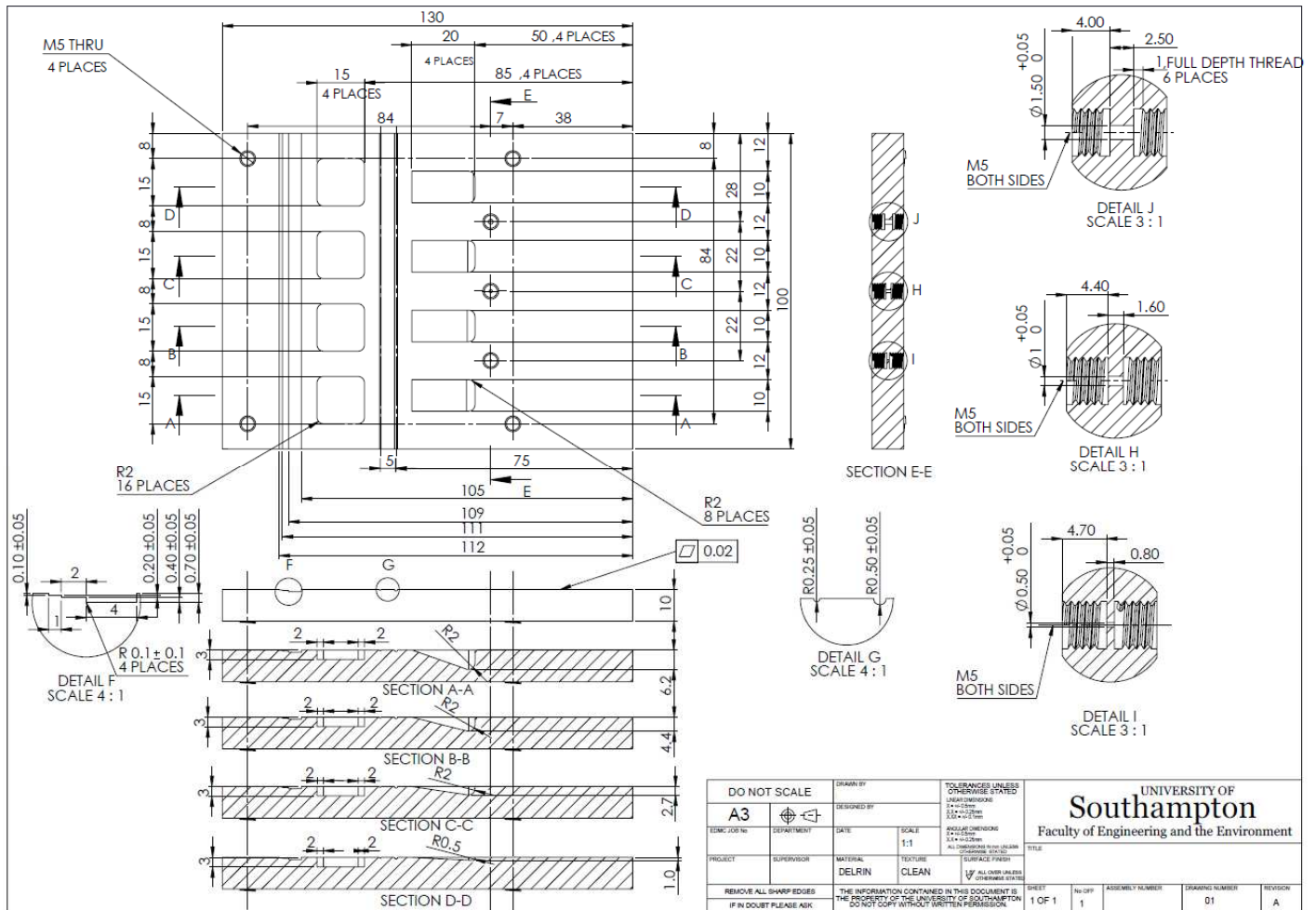


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## Appendix A: Details of sample



**Declaration of interests**

☒ The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

☐ The authors declare the following financial interests/personal relationships which may be considered as potential competing interests: