




# Technical note: Does scan resolution or downsampling impact the analysis of trabecular bone architecture?

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## Abstract

The “gold standard” for the assessment of trabecular bone structure is high-resolution micro-CT. In this technical note, we test the influence of initial scan resolution and post hoc downsampling on the quantitative and qualitative analysis of trabecular bone in a *Gorilla* tibia. We analyzed trabecular morphology in the right distal tibia of one *Gorilla gorilla* individual to investigate the impact of variation in voxel size on measured trabecular variables. For each version of the micro-CT volume, trabecular bone was segmented using the medical image analysis method. Holistic morphometric analysis was then used to analyze bone volume (BV/TV), anisotropy (DA), trabecular thickness (Tb.Th), spacing (Tb.Sp), and number (Tb.N). Increasing voxel size during initial scanning was found to have a strong impact on DA and Tb.Th measures, while BV/TV, Tb.Sp, and Tb.N were found to be less sensitive to variations in initial scan resolution. All tested parameters were not substantially influenced by downsampling up to 90  $\mu\text{m}$  resolution. Color maps of BV/TV and DA also retained their distribution up to 90  $\mu\text{m}$ . This study is the first to examine the effect of variation in micro-CT voxel size on the analysis of trabecular bone structure using whole epiphysis approaches. Our results indicate that microstructural variables may be measured for most trabecular parameters up to a voxel size of 90  $\mu\text{m}$  for both scan and downsampled resolutions. Moreover, if only BV/TV, Tb.Sp or Tb.N is measured, even larger voxel sizes might be used without substantially affecting the results.

## KEYWORDS

anisotropy, bone volume, resolution, trabecular bone, trabecular number, trabecular spacing, trabecular thickness, voxel size

## 1 | INTRODUCTION

Trabecular bone is a porous tissue found in the epiphyses of long, short, and irregular bones (Keaveny et al., 2001). Although the structure of trabecular bone is partially genetically determined (Loewen et al., 2016; Paternoster et al., 2013; Turner et al., 2000), (re)modeling

is at its peak during growth and gradually declines into adulthood (Glatt et al., 2007; Halloran et al., 2002; Saers et al., 2020; Seeman, 2003; Su et al., 2013). Trabecular bone tissue is thought to respond to biomechanical forces and functionally adapt to its mechanical environment (Ruff et al., 2006). In places where incurred load is lower, there is thought to be a reduction in the amount of trabecular

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bone, resulting in a weaker structure (Schulte et al., 2013). Conversely, in places where stress is higher, there should be an increase in trabecular tissue, resulting in a stronger bone structure (Barak et al., 2011; Pontzer et al., 2006; Schulte et al., 2013; Sinclair et al., 2013). These changes in trabecular bone architecture can include the thickness of trabecular struts, their spacing, and their orientation. Therefore, analysis of trabecular structure can provide insights into the biomechanical loads incurred by bones during life. It can be used to understand the skeletal morphology of living taxa and reconstruct behavior in fossil taxa (Kivell, 2016; Komza, & Skinner, 2019; Ryan & Shaw, 2012; Saers et al., 2020).

The traditional method of analyzing trabecular structure in 3D is to quantify trabecular bone in a volume of interest (VOI). The main advantage of the VOI method is that it allows for the extraction and quantification of a portion of a complex structure from a much larger micro-CT data set. However, defining a homologous VOI, both its size and location, is far from straightforward, especially across taxa and/or an ontogenetic series where there can be substantial differences in both size and morphology (Gross et al., 2014; Kivell et al., 2011; Lazenby et al., 2011). Moreover, the region of trabecular structure that differs most amongst the study sample could be outside of the VOI region when determined a priori. More recently, several studies have placed multiple VOIs throughout an anatomical region, revealing the presence of regional differences in trabecular bone structure (DeSilva & Devlin, 2012; Griffin, 2018; Su et al., 2013). Some studies used geometric morphometrics (GM), where sliding semilandmarks are used to define homologous locations across surfaces in order to place multiple VOIs, to assess trabecular variation beneath the articular surfaces of the talus and distal femur (Sylvester & Terhune, 2017), in the metacarpals (e.g., Dunmore et al., 2019; Dunmore, Bardo, Skinner, & Kivell, 2020) and in the proximal femur (Georgiou et al., 2020). Furthermore, a method originally developed for finite-element material-mapping (Pahr & Zysset, 2009), has been adapted for analyses of high-resolution trabecular bone across primates (Gross et al., 2014; Tsegai et al., 2013). Holistic morphometric analysis (HMA) quantifies trabecular morphology through the entire epiphysis rather than in one or a few sub-surface VOIs. Recently, Bachmann et al. (2022), developed HMA with a canonical holistic approach (cHMA), which allows for statistical comparisons of trabecular patterns between groups, free of a priori subsampling, by calculating mean models that contain homologous spatial units of analysis.

Studies of trabecular bone architecture often analyze scans with different resolutions across the studied species and/or individuals (Cazenave et al., 2019; Georgiou et al., 2018; Lukova et al., 2024; Sylvester & Terhune, 2017). This can be due to collection of micro-CT scans by different researchers with different protocols, due to specimen size limiting resolution on different CT systems, or scans may be downsampled (i.e., process of reducing the resolution or dimensions of a digital image by decreasing the number of pixels in the image) after collection due to the computational limitations of processing large datasets. Previous studies have shown that downsampling can impact the accuracy and precision of measurements of trabecular architecture. For example, trabecular thickness (Tb.Th) (Isaksson

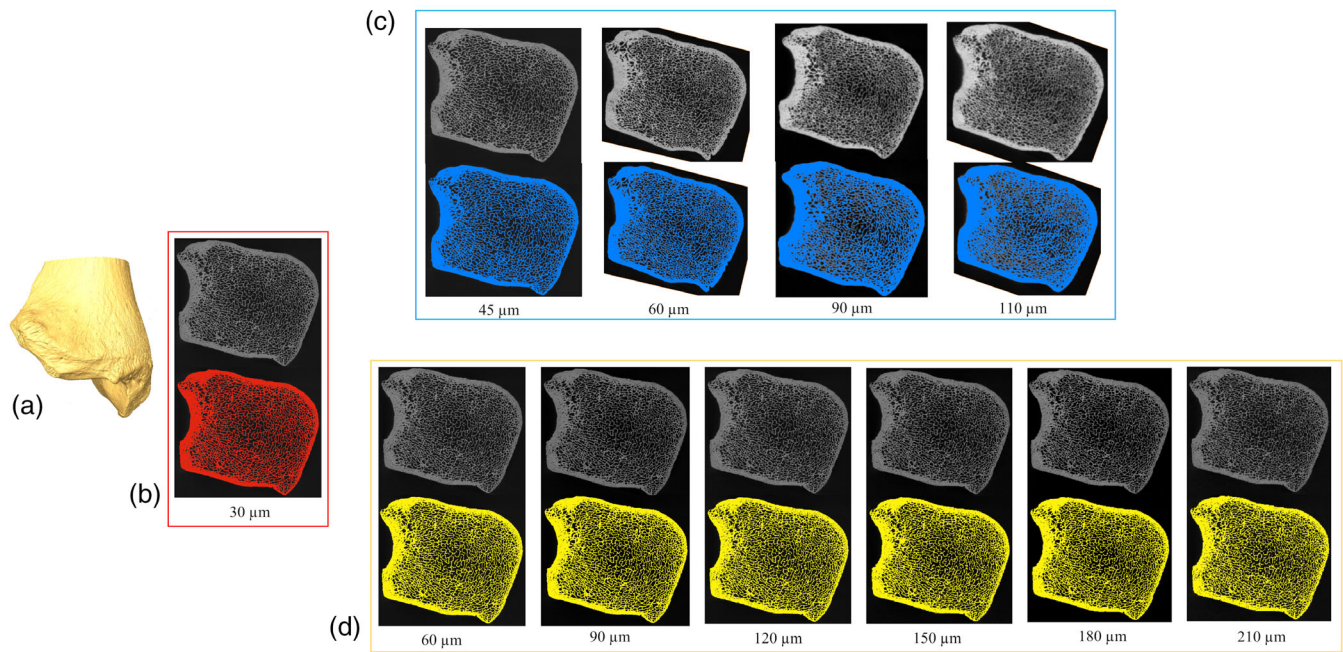
et al., 2011; Kothari et al., 1998; Majumdar et al., 1996; Muller et al., 1996; Sode et al., 2008) or measures of anisotropy can be highly sensitive to voxel size (Isaksson et al., 2011; Kothari et al., 1998; Sode et al., 2008). In general, it is expected that lower resolutions (the lower resolution the larger voxel size) create blur in the scan images making some features hard to segment and may lead to loss of thin trabeculae, that is, if the feature is smaller than the voxel size it may well be averaged out in favor of another phase such as background (partial volume averaging). Majumdar et al. (1996) showed that Tb.Th tends to be increasingly overestimated at lower resolutions when analyzing magnetic resonance (MR) and micro-CT images. Similarly, Müller et al. (1996) found that trabecular spacing and number can be precisely measured at resolutions up to 175  $\mu\text{m}$ , however, Tb.Th required a much higher resolution for accurate assessment. Moreover, Isaksson et al. (2011), using micro-CT scans, found that with decreasing resolution, the originally detected differences between normal and osteoporotic groups diminished. Kim et al. (2004) used three different scanning and voxel sizes a high-resolution voxel size (21  $\mu\text{m}$ ), a commonly used intermediate voxel size (50  $\mu\text{m}$ ), and a voxel size applicable to scans of whole human vertebral bodies (110  $\mu\text{m}$ ) to examine the effect of voxel size on stereological measures of human trabecular bone. They found that the error in stereological parameters ranged from 0.1% to 102% depending on the voxel size analyzed. Peyrin et al. (1998) examined a series of vertebral samples with voxel sizes of 1.4, 6.7, and 14  $\mu\text{m}$ . They concluded that voxel sizes as large as 14  $\mu\text{m}$  provide a reasonably accurate measurement of trabecular architecture. Christiansen (2016) investigated micro-CT scans of mouse trabecular bone measures with voxel sizes at 6–30  $\mu\text{m}$ . They demonstrated that voxel size strongly affects connectivity density and Tb.Th. All these studies suggest that high resolution scans should be used, when possible, to accurately measure trabecular bone microstructure.

In this study, we test the impact of (1) scanning the same specimen at different resolutions and (2) downsampling a high-resolution scan of this specimen to lower resolutions using a whole-epiphysis approach. The trabecular variables tested include bone volume fraction (BV/TV), degree of anisotropy (DA), Tb.Th, trabecular spacing (Tb.Sp), and trabecular number (Tb.N). We also assess the impact of scan resolution and downsampling on material maps of BV/TV and DA, which are some of the most biomechanically informative aspects of trabecular architecture and are widely reported in the literature (Goldstein et al., 1993; Odgaard et al., 1997; Van Rietbergen et al., 1998).

## 2 | MATERIALS AND METHODS

The study sample of micro-CT scans of varying resolutions was created from scans of a complete right distal tibia of a *Gorilla gorilla* individual from Cameroon, curated at the Powell-Cotton Museum in Birchington-on-Sea, UK.

The specimen was scanned using a Diondo D1 scanner at the Imaging Centre for Life Sciences at the University of Kent (Canterbury, UK). The scan parameters included an acceleration voltage of 130 kV, a tube current of 130  $\mu\text{A}$  and a 1.0 mm aluminium filter. Images were reconstructed as 16-bit TIFF stacks.



**FIGURE 1** (a) Surface of the studied distal tibia region (anterior view); (b) unsegmented (raw) and overlapping segmented high-resolution scan (in distal view) with voxel size of 30 μm used as the baseline scan; (c) serial unsegmented and overlapping segmented images of the same distal tibia (in distal view) scanned under the lower resolution with four different voxel sizes of 45, 60, 90, and 110 μm; (d) the baseline scan downsampled to voxel size of 60, 90, 120, 150, 180, and 210 μm.

**TABLE 1** Segmentation parameters.

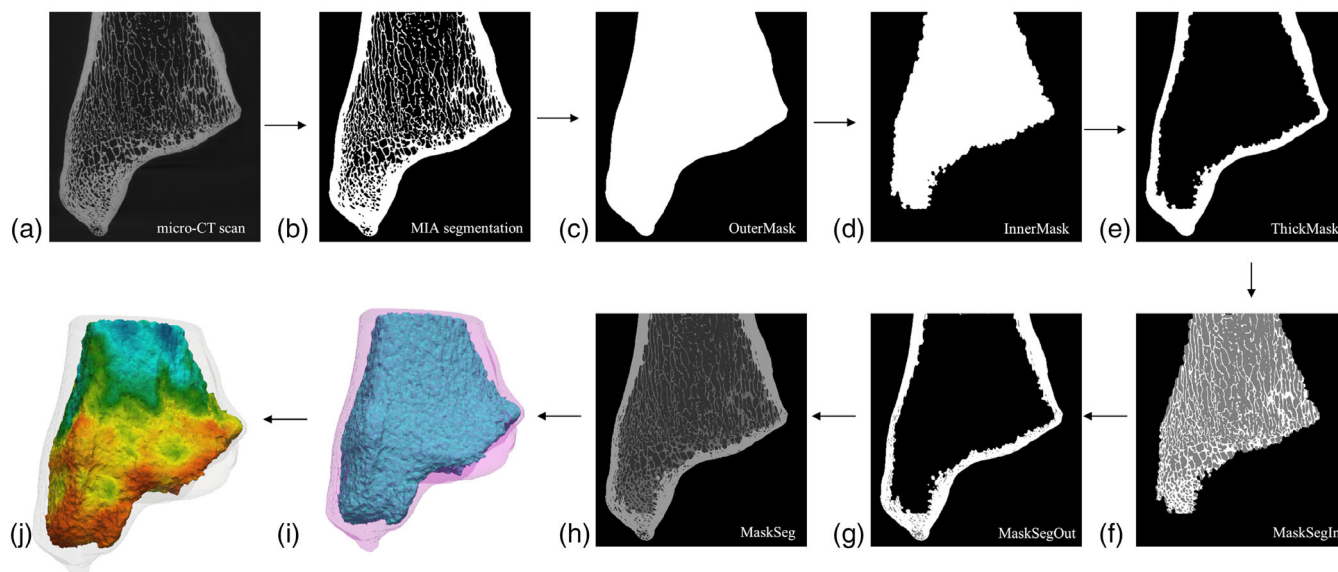
| Method        | Resolution (μm) | Trabecular thickness (mm)* | Trabecular thickness/resolution (mm/μm) | Grid size (px) | Number of classes | Probability filter |
|---------------|-----------------|----------------------------|---|----------------|-------------------|--------------------|
| Baseline scan | 30              | 0.27                       | 9.0                                     | 10             | 2                 | None               |
| Downsampled   | 60              | 0.28                       | 4.7                                     | 5              | 2                 | None               |
| Downsampled   | 90              | 0.31                       | 3.4                                     | 5              | 2                 | None               |
| Downsampled   | 120             | 0.33                       | 2.8                                     | 5              | 2                 | None               |
| Downsampled   | 150             | 0.35                       | 1.9                                     | 5              | 2                 | None               |
| Downsampled   | 180             | 0.37                       | 2.0                                     | 5              | 2                 | None               |
| Downsampled   | 210             | 0.37                       | 1.8                                     | 5              | 2                 | None               |
| Rescanned     | 45              | 0.40                       | 8.9                                     | 10             | 2                 | None               |
| Rescanned     | 60              | 0.32                       | 5.3                                     | 10             | 2                 | None               |
| Rescanned     | 90              | 0.39                       | 4.3                                     | 5              | 2                 | None               |
| Rescanned     | 110             | 0.45                       | 4.1                                     | 5              | 2                 | None               |

\*Measured in a 2D cross-section.

Two samples were created to test the impact of voxel resolution on the measurement and visualization of trabecular architecture. In the first, the tibia was rescanned four additional times to produce volumes with voxel sizes of 45, 60, 90, and 110 μm (Figure 1c). To create the second sample, a scan with a voxel size of 30 μm was downsampled to 60, 90, 120, 150, 180, and 210 μm (Figure 1d). Downsampling was conducted in medtool v4.5 ([www.dr-pahr.at/medtool](http://www.dr-pahr.at/medtool)) using whole-integer factors only to avoid aliasing (for more details on aliasing, see for example, He et al., 2021; Tward & Siewerdsen, 2009; Yen et al., 1999; Zbijewski & Beekman, 2003). For example, when

downsampling 30 to 60 μm eight (2<sup>3</sup>) voxels are averaged and from 30 to 90 μm 27 (3<sup>3</sup>) voxels are averaged.

All images were segmented into a binary phase of background and bone using the MIA-clustering algorithm (Dunmore et al., 2018). This method requires the definition of a grid size, which was selected by measuring the thickness of the thickest trabeculae in a 2D cross-section using Avizo to determine their width in pixels. The grid size was then set a few voxels larger than this measurement to ensure that the local segmentation focused on features within the phase of interest (Table 1) (Dunmore et al., 2018). Two classes were used for all



**FIGURE 2** Workflow of medtool processing steps (posterior view). (a) Original micro-CT scan; (b) results of the MIA binary segmentation process; (c) *OuterMask*; (d) *InnerMask*; (e) *ThickMask*; (f) *MaskSegIn*; (g) *MaskSegOut*; (h) *MaskSeg*; (i) finite element model of the cortical (pink) and trabecular (blue) area; (j) BV/TV representation. BV/TV, bone volume.

scans (Table 1). To assess if the same volume of bone was segmented in each image stack, we measured segmented BV/TV for each scan in Avizo 6.3 (Visualization Science Group, SAS). Each segmented image was then used for further analysis of trabecular parameters (Figure 2).

The external and inner volumes of all images were defined using medtool v4.5 ([www.dr-pahr.at/medtool](http://www.dr-pahr.at/medtool)) and taken from each other to produce the thick cortical bone shell, following published protocols (Gross et al., 2014; Pahr & Zysset, 2009; Tseagai et al., 2013). The binary images (in which bone voxels can be classified as 1 and non-bone voxels as 0) from MIA (Figure 2b) were used as inputs for medtool. The primary structure in the image was identified with a grayscale value of one (white voxels). Subsequently, any floating voxels that were not contiguous with the bone were set to zero or black. Morphological filters in medtool were then applied to fill the bone, thereby isolating the external and internal edges of the cortical bone in 3D. This process resulted in a mask delineating the internal BV/TV and outer cortical bone. During the bone filling process, small pores within the cortical bone were identified and filled based on the size of the kernel radius. This method ensured that the fine porosity of the cortical bone was preserved, while moderate gaps indicative of genuine variations in trabecular shape or separation were maintained. For this, a ray-casting method was used. Subsequently, closing, and opening operations were performed to fill in the gaps in the bone structure, resulting in the creation of the *OuterMask* (Figure 2c). To identify trabecular spaces, the same ray casting process was employed, but with a starting point at the edge of the *OuterMask* instead of the image edge. Rays terminated upon encountering air voxels rather than bone voxels. Closing and opening operations were then applied to fill in areas where rays had traversed directly through trabeculae, thus closing voids in the *InnerMask* (Figure 2d). The *OuterMask* delineated the overall geometry of the entire bone by detecting its outer contour

using rays. Conversely, the *InnerMask* served a similar purpose to the *OuterMask*, but specifically defined the 3D geometric boundaries of the trabecular bone region within the entire bone structure. Once both masks were completed, medtool subtracted the *InnerMask* from the *OuterMask* and created a “*ThickMask*” (Figure 2e), which specifically represented the thickness of the cortical bone. Following the creation of *InnerMask*, *OuterMask*, and *ThickMask*, medtool generated three final volumes for subsequent analysis. *MaskSegIn* (Figure 2f) represented the trabecular bone and internal spaces. It was derived from *OuterMask* with *ThickMask* removed, focusing solely on the trabecular bone and internal spaces. *MaskSegOut* (Figure 2g) represented the cortical bone, including its pores. It was derived from *InnerMask* with *OuterMask* removed, isolating only the cortical bone. *MaskSeg* (Figure 2h) represented all elements including cortical bone, pores, trabeculae, and internal spaces. *MaskSeg* was created by combining *MaskSegIn* and *MaskSegOut*.

The CGAL (Computational Geometry Algorithms Library, <https://www.cgal.org>) 4.9 mesher was then applied to the *InnerMask* and *OuterMask* to create a tetrahedral mesh of both the trabecular volumes (Figure 2i). This mesh was created for each resolution separately and all meshes were later used for data visualization. Each mesh underwent optimization through a series of iterative processes to achieve a smooth boundary, ensuring there were no overlaps or holes between the tetrahedra. Tetrahedra were chosen over hexahedra because their geometry results in a smoother boundary, minimizing the loss of trabecular architectural information (Alberich-Bayarri et al., 2008; Müller, & Rügsegger, 1996; Ulrich et al., 1999). To gather material property data, a 3D grid with 2.5 mm cells was placed as a bounding box over the *MaskSegIn*. Subsequently, a 5 mm sampling sphere moved between the grid nodes across the entire bounding box, iteratively measuring trabecular parameters. By aligning the finite element

mesh with the nodes of the sampling sphere, each of the trabecular parameters was interpolated onto the mesh. When all these steps were taken, HMA was completed, and trabecular parameters were measured within the bone. Trabecular parameters were measured by the mia-multi module in medtool. Medtool outputted quantitative data as well as options for the quantitative visualization of the data. These interpolated meshes are visualized in Paraview 4.8.2 (Ahrens et al., 2006) (Figure 2j).

The measure of BV/TV is the proportion of trabecular bone of the total volume in each region and was calculated as the ratio of bone voxels to non-bone voxels within the masked volume of each sampling sphere (VOI). DA in 3D was calculated using the mean-intercept-length method (Odgaard et al., 1997; Whitehouse, 1974). The value of DA is zero if the minor and major eigenvectors are of equal magnitude (i.e., isotropic), and is one if the minor and major eigenvectors are maximally different (i.e., anisotropic). A value between 0 and 1 is produced via the formula  $1 - (\min. \text{eigenvalue} / \max. \text{eigenvalue})$  (Kivell et al., 2011). To calculate Tb.Th, medtool computed the distance map of the bone voxels of the *MaskSegIn* (Figure 2f) and extracted the distance ridge from which the average distance was calculated. Tb.Sp was calculated in a similar way by inverting bone and background labels. Tb.N was calculated using Tb.Th and Tb.Sp via the formula  $1 / (\text{Tb.Th} + \text{Tb.Sp})$ .

Boxplots and histograms summarizing the data distribution of each variable were generated directly from all VOIs of each respective scan. Shapiro-Wilk tests were used to assess normality and Levene's tests were used to assess equality of variance of each trabecular variable (Tables S1–S5 and Figure S4). Kruskal-Wallis and Dunn's post hoc tests were used to test if the means of a specific parameter differed significantly between datasets. The differences were tested between all combinations of groups within the downsampled images and then separately within the rescanned images. All statistical analyses were conducted in R v3.4.1 and plots were generated using the ggplot2 package (R Core Team, 2017; Wickham, 2016).

### 3 | RESULTS

#### 3.1 | Total bone volume

The total segmented BV/TV for the 30  $\mu\text{m}$  scan is 28,082  $\text{mm}^3$  (Table 2). When downsampling, the segmented BV/TV remains similar until 210  $\mu\text{m}$ , at which point there is a reduction of 0.7% (27,897  $\text{mm}^3$ ) (Table 2). Rescanning the specimen results in a stepped increase at 45 (1.5%) and 60 (2.1%)  $\mu\text{m}$ , with the segmented volume then remaining similar in scans at 90 and 110  $\mu\text{m}$  (Table 2).

#### 3.2 | Bone volume fraction

Distributions of BV/TV values for each VOI of the background grid in the baseline scan, downsampled volumes and rescanned volumes are presented in Figure 3. The variance of BV/TV values remains

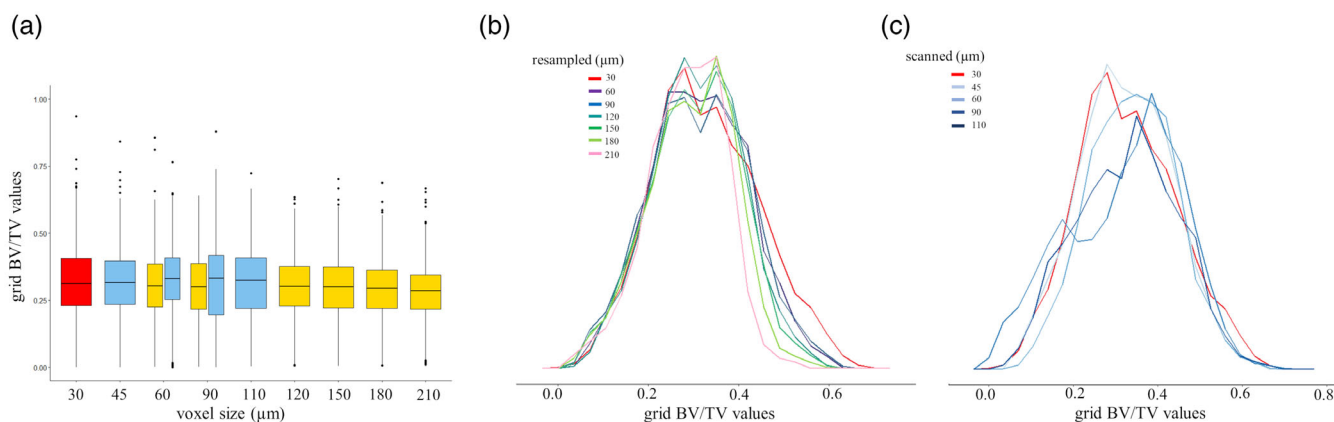
**TABLE 2** Segmented bone volume for all tested CT scans.

| Voxel size ( $\mu\text{m}$ ) | Technique              | Segmented bone volume ( $\text{mm}^3$ ) | Segmented bone volume change (%) |
|------------------------------|------------------------|---|----------------------------------|
| 30                           | Baseline micro-CT scan | 28,082                                  | 0.00                             |
| 60                           | Downsampled            | 28,037                                  | -0.16                            |
| 90                           |                        | 28,058                                  | -0.09                            |
| 120                          |                        | 27,985                                  | -0.35                            |
| 150                          |                        | 28,061                                  | -0.08                            |
| 180                          |                        | 28,118                                  | 0.13                             |
| 210                          |                        | 27,897                                  | -0.66                            |
| 45                           | Rescanned              | 28,505                                  | 1.51                             |
| 60                           |                        | 28,674                                  | 2.11                             |
| 90                           |                        | 28,682                                  | 2.14                             |
| 110                          |                        | 28,700                                  | 2.20                             |

relatively similar for all scans and any outliers represent the elements with both lowest and highest BV/TV values. When downsampling, there appears to be a slight decrease in median BV/TV values compared to the baseline scan (Figure 3a), however, the distributions strongly overlap. When rescanned at 45  $\mu\text{m}$ , the median BV/TV is similar, but then increases slightly at voxel sizes of 60, 90, and 110  $\mu\text{m}$ . Similarly, histograms of BV/TV values from each VOI show that the general data distribution pattern remains stable and not normally distributed across all voxel sizes using both downsampled and rescanned images (Figure 3b,c; Table S1). Table 3 shows that the mean BV/TV values (of the VOI's) gradually decrease with downsampling (reaching 12.1% at 210  $\mu\text{m}$ ). Rescanning at 45  $\mu\text{m}$  results in a mean BV/TV decrease (0.64%), while there are increases in mean BV/TV at 60 (8.06%), 90 (3.87%), and 110  $\mu\text{m}$  (5.81%) compared to the baseline scan (Table 3).

The Kruskal-Wallis test shows a statistically significant difference in BV/TV within the downsampled and (separately) within the scanned images (Table 4). Additionally, a Dunn's post hoc test was performed to further explore these differences. The post hoc tests indicate that there are significant differences in BV/TV within all combinations of downsampled and scanned images (Table S6).

To understand if any of these outliers are spatially organized, and thus potentially affecting functional interpretations, we visualized the BV/TV distribution throughout the distal tibia for the baseline scan and all downsampled and rescanned volumes. Figure 4 shows the colourmaps, that is, interpolations of the values from the VOI's discussed above, of BV/TV distribution. Compared to the baseline scan (Figure 4a), the general pattern of BV/TV distribution is maintained in all downsampled images, up to a voxel size of 210  $\mu\text{m}$  (Figure 4b). In this volume the region of highest BV/TV (in red) extends further above the malleolus and is more concentrated in the malleolar groove and, in the mid-coronal view, the region of highest BV/TV is concentrated more laterally and BV/TV is lower in the malleolar region



**FIGURE 3** (a) Boxplots of the grid BV/TV values for each voxel size for the baseline scan (red), the downsampled data (yellow) and for the specimen scanned at different resolution (blue); (b) histogram of the grid BV/TV values for each voxel size for the baseline scan (red line) and the downsampled data; (c) histogram of the grid BV/TV values for each voxel size for the baseline scan (red line) and for the specimen scanned at different resolution. BV/TV, bone volume.

**TABLE 3** The mean and SD values of all tested trabecular parameters.

| Voxel size ( $\mu\text{m}$ ) | Technique              | Mean BV/TV (SD) | Mean DA (SD)  | Mean Tb. Th (SD) | Mean Tb. Sp (SD) | Mean Tb. N (SD) | N of grid nodes* |
|------------------------------|------------------------|-----------------|---------------|------------------|------------------|-----------------|------------------|
| 30                           | Baseline micro-CT scan | 0.313 (0.105)   | 0.470 (0.112) | 0.272 (0.081)    | 0.759 (0.267)    | 1.001 (0.154)   | 734,423          |
| 60                           | Downsampled            | 0.301 (0.098)   | 0.498 (0.117) | 0.291 (0.078)    | 0.786 (0.786)    | 0.954 (0.136)   | 648,989          |
| 90                           |                        | 0.302 (0.099)   | 0.479 (0.116) | 0.316 (0.080)    | 0.802 (0.252)    | 0.916 (0.124)   | 646,690          |
| 120                          |                        | 0.299 (0.095)   | 0.421 (0.105) | 0.338 (0.076)    | 0.818 (0.247)    | 0.885 (0.118)   | 683,156          |
| 150                          |                        | 0.293 (0.091)   | 0.353 (0.092) | 0.370 (0.072)    | 0.846 (0.244)    | 0.840 (0.108)   | 535,414          |
| 180                          |                        | 0.284 (0.087)   | 0.296 (0.079) | 0.404 (0.061)    | 0.873 (0.242)    | 0.799 (0.101)   | 527,357          |
| 210                          |                        | 0.275 (0.086)   | 0.261 (0.074) | 0.446 (0.048)    | 0.905 (0.240)    | 0.754 (0.093)   | 573,089          |
| 45                           | Rescanned              | 0.311 (0.101)   | 0.488 (0.114) | 0.295 (0.085)    | 0.783 (0.264)    | 0.954 (0.140)   | 699,828          |
| 60                           |                        | 0.335 (0.094)   | 0.481 (0.114) | 0.336 (0.092)    | 0.777 (0.254)    | 0.918 (0.119)   | 668,455          |
| 90                           |                        | 0.322 (0.128)   | 0.420 (0.102) | 0.427 (0.112)    | 0.921 (0.278)    | 0.768 (0.121)   | 682,908          |
| 110                          |                        | 0.328 (0.107)   | 0.391 (0.102) | 0.442 (0.116)    | 0.859 (0.249)    | 0.781 (0.087)   | 583,379          |

\*Number of intrenal grid nodes on which each VOI is centred.

(Figure 4b). The BV/TV concentration on the posterior side of the malleolus, as well as anteriorly and posteriorly on the articular surface, is also higher at the downsampled voxel size of 210  $\mu\text{m}$  (see the distal view Figure 4b). Rescanning at 60  $\mu\text{m}$  presents a broadly similar pattern of BV/TV on each surface and in the mid-coronal cross section (Figure 4c). However, after rescanning at 90 and 110  $\mu\text{m}$  the distribution pattern is less consistent. The high BV/TV concentration along the malleolar region and under the articular surface is lost (see mid-coronal view in Figure 4c).

### 3.3 | Degree of anisotropy

Downsampling from the baseline to 60 and 90  $\mu\text{m}$  does not result in a large change in DA values; however, there is a marked reduction in DA when downsampling between 120 and 210  $\mu\text{m}$  (Figure 5). Similarly, rescanning at 45 and 60  $\mu\text{m}$  does not result in a change in DA,

but DA drops to a greater degree in scans at 90 and 110  $\mu\text{m}$ . The general DA data distribution for the baseline scan is not normally distributed and overlaps across all scan voxel sizes (Figure 5b; Table S3), even in the downsampled voxel size of 90  $\mu\text{m}$  (Figure 5b). However, the data moves towards an apparent positively skewed distribution pattern when downsampled to 120–210  $\mu\text{m}$  (Figure 5b; Table S2). Table 3 shows that mean DA values are closest to the baseline scan at downsampled voxel sizes of 60 and 90  $\mu\text{m}$  and the lowest mean DA values drop 44.5% from the baseline scan at 210  $\mu\text{m}$ . The mean DA values are close to the baseline in rescans at 45 and 60  $\mu\text{m}$ , while there is a 19.9% drop in DA when rescanned at 110  $\mu\text{m}$  (Table 3).

The Kruskal–Wallis test shows a statistically significant difference in DA within the downsampled and scanned images (Table 4). Additionally, the Dunn's post hoc test indicates that there are significant differences in DA within all combinations of downsampled and scanned images (Table S6).

**TABLE 4** The Kruskal-Wallis test for BV/TV, DA, Tb.Th, and Tb.Sp grid values within downsampled and scanned images.

| Technique    | Df | Chi-squared | p-value |
|--------------|----|-------------|---------|
| <b>BV/TV</b> |    |             |         |
| Downsampling | 6  | 11,400      | <0.001  |
| Scanning     | 4  | 6025        | <0.001  |
| <b>DA</b>    |    |             |         |
| Downsampling | 6  | 399,906     | <0.001  |
| Scanning     | 4  | 95,682      | <0.001  |
| <b>Tb.Th</b> |    |             |         |
| Downsampling | 6  | 16,247      | <0.001  |
| Scanning     | 4  | 7770        | <0.001  |
| <b>Tb.Sp</b> |    |             |         |
| Downsampling | 6  | 1907        | <0.001  |
| Scanning     | 4  | 864         | <0.001  |
| <b>Tb.N</b>  |    |             |         |
| Downsampling | 6  | 6100        | <0.001  |
| Scanning     | 4  | 3352        | <0.001  |

Note: Significance bold value represents  $\alpha = 0.05$ .

Figure 6 shows colourmaps of the DA distribution throughout the distal tibia for the baseline scan and all downsampled and rescanned volumes. The DA colourmaps are more impacted by voxel sizes compared to the BV/TV distribution maps. Compared to the baseline scan (Figure 6a), the general pattern of DA distribution is consistent in all downsampled images until the voxel size of 120  $\mu\text{m}$  (Figure 6b). The general DA distribution pattern is visible even at the downsampled voxel size of 150  $\mu\text{m}$ . However, in this volume the low DA (blue color) starts to be concentrated randomly above the articular surface where high DA is found in higher resolution scans (see mid-coronal view in Figure 6c). This is even more apparent in the larger voxel sizes of 180 and 210  $\mu\text{m}$ . The general DA distribution pattern of the baseline scan disappears completely at a voxel size of 210  $\mu\text{m}$  and high DA is inconsistently concentrated throughout the distal tibia (Figure 6b). Rescanning at 60  $\mu\text{m}$  presents a broadly similar pattern of DA on each surface and in the cross-section (Figure 6c). However, after rescanning at 90 and 110  $\mu\text{m}$  the distribution pattern becomes less consistent. The high DA values are lost laterally above the articular surface at a rescanning voxel size of 90  $\mu\text{m}$  and medially above the malleolus at a voxel size of 110  $\mu\text{m}$  (see mid-coronal view in Figure 6c).

### 3.4 | Trabecular thickness, spacing, and number

Distributions of Tb.Th, Tb.Sp, and Tb.N values for each VOI of the background grid for the baseline scan, downsampled, and rescanned volumes are presented in Figure 7. Voxel size changes in both rescanning and downsampling images has the strongest effect on the quantification of Tb.Th and a weaker effect on the quantification of Tb.Sp and Tb.N (Figure 7). The outliers represent the elements with the lowest/highest Tb.Th (Figure 7a), Tb.Sp (Figure 7b), and Tb.N (Figure 7c).

In both downsampled and rescanned images, median values of Tb.Th and Tb.Sp increase gradually, while median values of Tb.N decrease gradually across all voxel sizes compared to baseline scan (Figure 7). When scanning at different resolutions, the Tb.Sp range remains approximately the same up to a voxel size of 60  $\mu\text{m}$  compared to the baseline scan (Figure 7b), however, the distributions overlap across all voxel sizes.

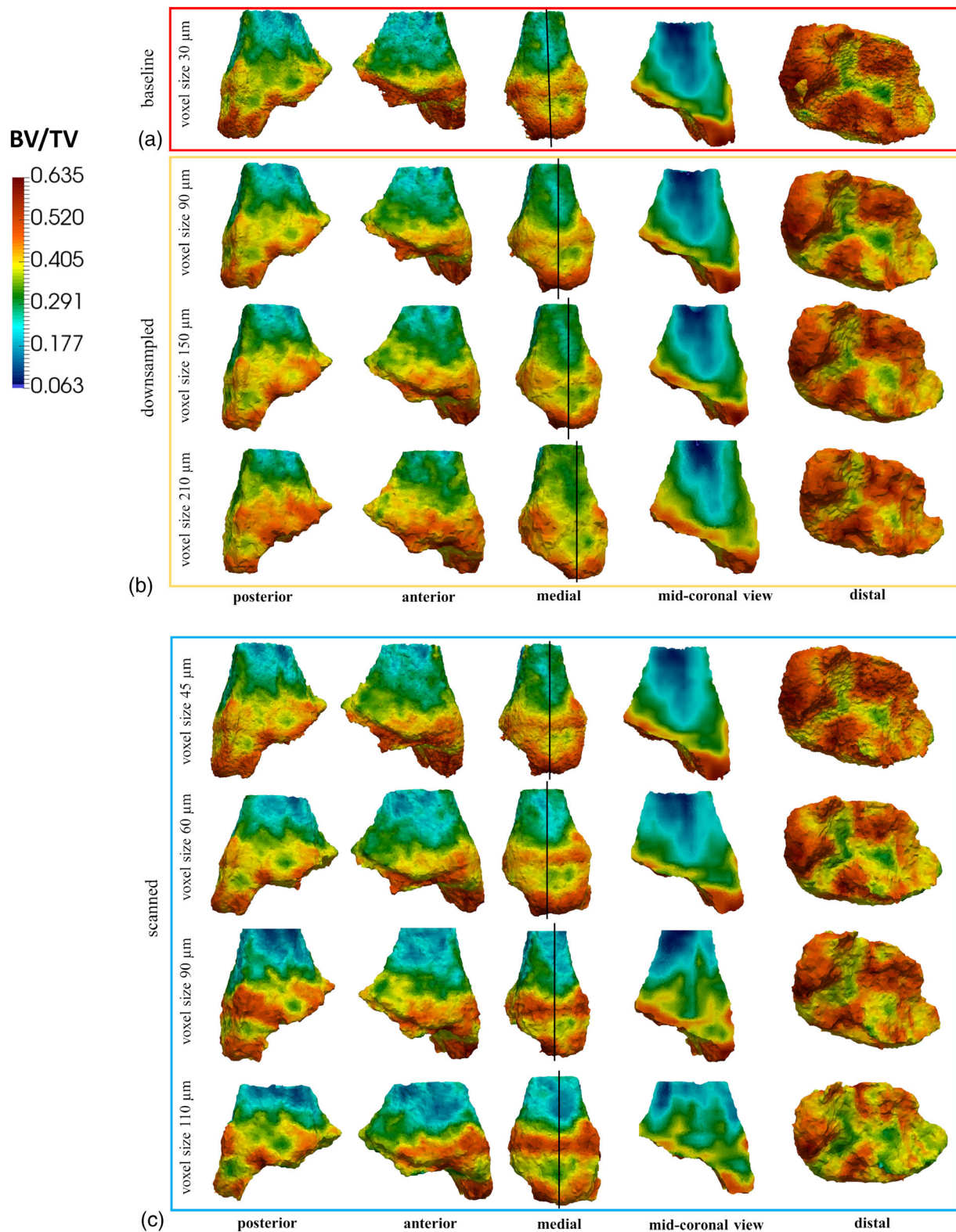
Table 3 shows that mean Tb.Th values gradually increase with increasing voxel size in both downsampled (reaching 64.0% at 210  $\mu\text{m}$ ) and rescanned (reaching 62.5% at 110  $\mu\text{m}$ ) images. The mean Tb.Sp values are unstable with increasing voxel size in both downsampled (reaching highest increase 194.4% at 60  $\mu\text{m}$  and highest decrease 11.1% at 210  $\mu\text{m}$ ) and rescanned (reaching highest increase 4.1% at 90  $\mu\text{m}$  and highest decrease 6.7% at 110  $\mu\text{m}$ ) images compared to the baseline scan (Table 3). The mean Tb.N values gradually decrease with increasing voxel size in downsampled (reaching 24.7% at 210  $\mu\text{m}$ ) images compared to the baseline scan (Table 3). Mean Tb.N drops off 23.3% at a rescanned voxel size of 90  $\mu\text{m}$  compared to the baseline scan and increases again at 110  $\mu\text{m}$  (reaching 1.7%) compared to the 90  $\mu\text{m}$  scan (Table 3).

The Kruskal-Wallis test shows a statistically significant difference in Tb.Th, Tb.Sp, and Tb.N within the downsampled and scanned images (Table 4). Additionally, the Dunn's post hoc test indicates that there are significant differences in Tb.Th, Tb.Sp, and Tb.N within most combinations of downsampled and scanned images (Table S7). There are no significant differences in Tb.Sp between the downsampled 60 and 90  $\mu\text{m}$  datasets or between scanned voxel sizes of 45 and 90  $\mu\text{m}$ . Moreover, there is no significant difference in Tb.N between scanned voxel sizes of 60 and 110  $\mu\text{m}$  (Table S7).

Colourmaps of the Tb.Th, Tb.Sp, and Tb.N distribution are presented as supporting information (Figures S1–S3). Compared to the baseline scan, the general pattern of the Tb.Th distribution is consistent when downsampled to 150  $\mu\text{m}$  and rescanned at 45  $\mu\text{m}$  (Figure S1). Tb.Th values are higher in the malleolus and under the articular surface and lower above the articular surface when downsampled to 210  $\mu\text{m}$  (see the cross-section mid-coronal view in the Figure S1b). Tb.Th values are lower across the entire distal tibia at rescanned voxel sizes of 90 and 110  $\mu\text{m}$  (Figure S1c). The general pattern of the Tb.Sp distribution is consistent for all images up to a voxel size of 60  $\mu\text{m}$  (Figure S2). The Tb.Sp values are lower in the malleolus and under the articular surface when rescanned at 90  $\mu\text{m}$  compared to the baseline scan (Figure S2c). The Tb.Sp values in the malleolus are higher at 110  $\mu\text{m}$  compared to the baseline scan (see the mid-coronal view in Figure S2c). The general pattern of Tb.N distribution is consistent when downsampled to 150  $\mu\text{m}$  and rescanned at 110  $\mu\text{m}$  (Figure S3). However, in both cases, high Tb.N values above the articular surface are spread more broadly across all voxel sizes compared to the baseline scan (see the mid-coronal view in the Figure S3).

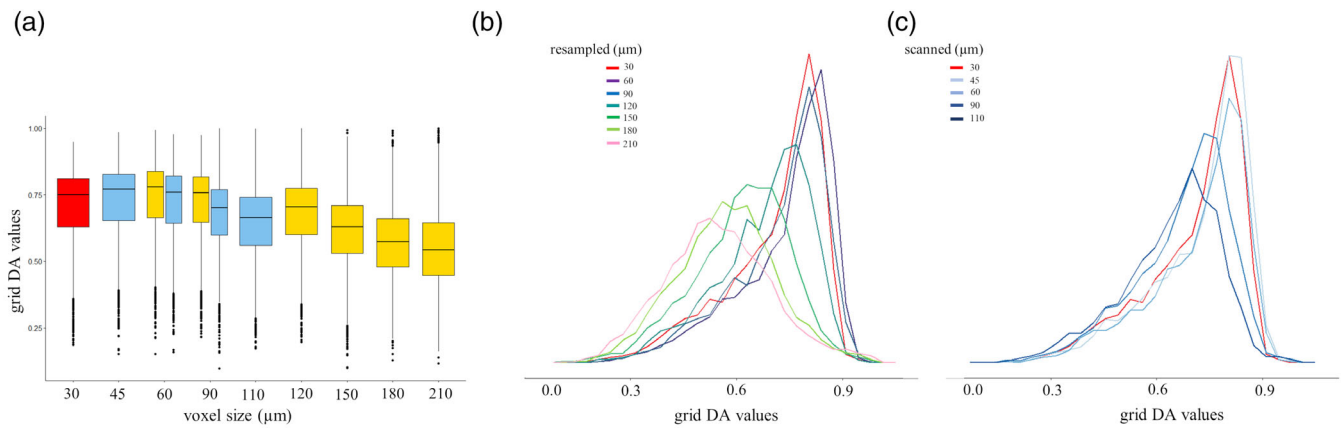
## 4 | DISCUSSION

This study investigated the impact of voxel size (in downsampled and rescanned micro-CT volumes) on the quantification of trabecular bone



**FIGURE 4** Distal tibia model of BV/TV distribution of tested *Gorilla* individual for baseline scan (a), downsampled voxel sizes of 90, 150, and 210  $\mu\text{m}$  (b), and scan voxel sizes of 45–110  $\mu\text{m}$  (c). Vertical lines through the medial view show where the slices are positions for the cross-section mid-coronal view. Dark red represents the highest and dark blue the lowest BV/TV values. All colourmaps were scaled to baseline scan data range. BV/TV, bone volume.





**FIGURE 5** (a) Boxplots of the grid DA values for each voxel size for the baseline scan (red), the downsampled data (yellow) and for the specimen scanned at the different resolution (blue); (b) histogram of the grid DA values for each voxel size for the baseline scan (red line) and the downsampled data; (c) histogram of the grid DA values for each voxel size for the baseline scan (red line) and for the specimen scanned at different resolution. DA, degree of anisotropy.

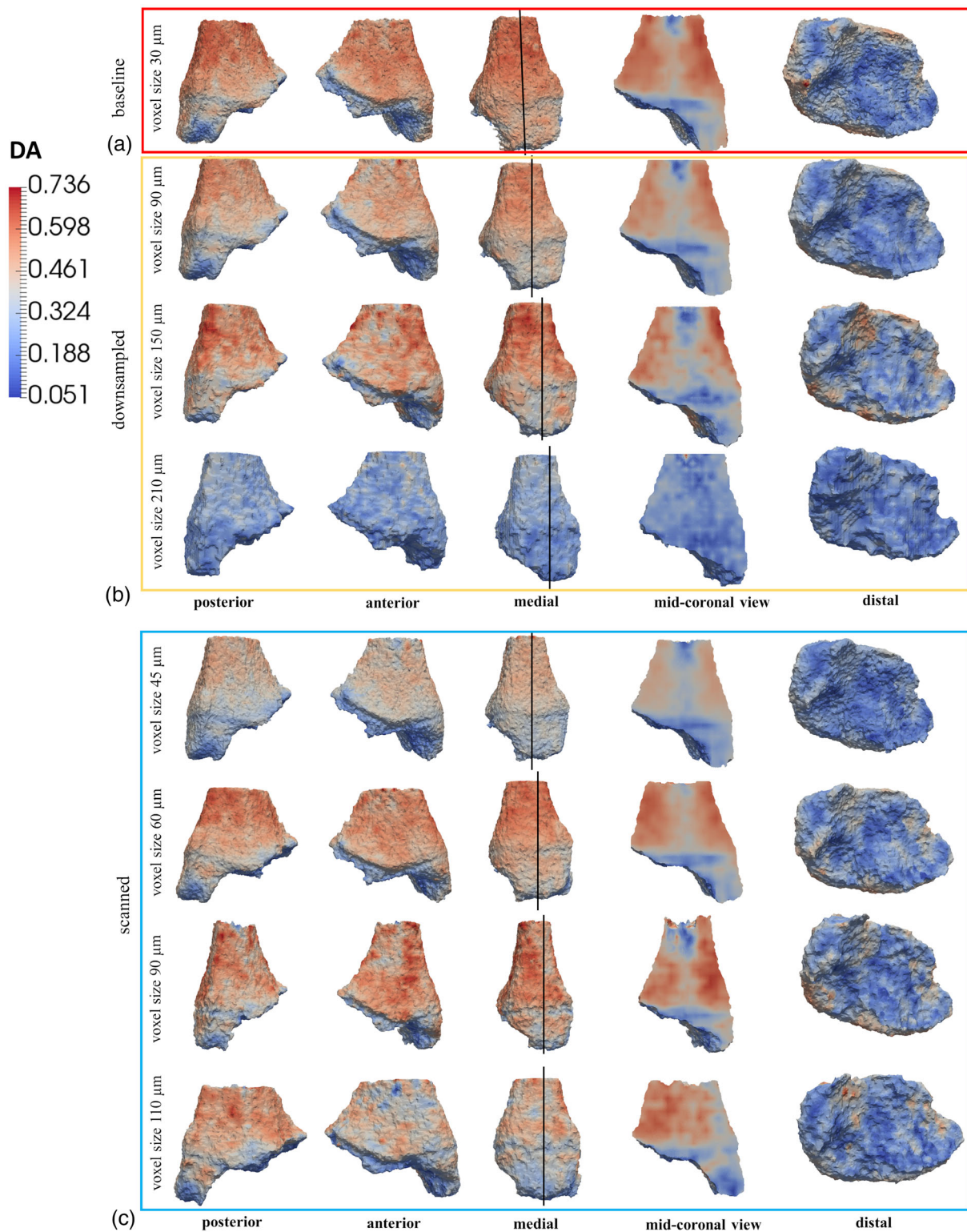
morphology of the distal tibia of a *G. gorilla* individual. Rescanning was found to have a stronger effect on DA and Tb.Th, while BV/TV, Tb.Sp, and Tb.N remained relatively constant across all tested voxel sizes. Downsampling was found to have less of an effect on trabecular parameters compared to rescanning. However, a strong impact on trabecular parameters when downsampling was found in DA and Tb.Th, while BV/TV, Tb.Sp, and Tb.N were less sensitive to increasing voxel sizes.

Quantification of the total BV/TV after segmentation demonstrated differences in the number of bone voxels segmented in each protocol. This BV/TV changed more for rescanned voxel sizes compared to downsampled voxel sizes. However, the differences were below 5% compared to the baseline scan across all scans. When the baseline scan was downsampled to larger voxel sizes, the total segmented BV/TV decreased gradually. However, the opposite pattern was found in rescanned images where the total segmented BV/TV gradually increased with larger voxel sizes. Changes in total segmented BV/TV within the rescanned images often represented fundamental differences that could also be observed on visual inspection of the voxel data. With the lowest scanned resolution, a more substantial difference in volume was found, and the trabecular structure captured is less comparable to that at higher scan resolutions. However, for the results of the downsampled images, where the data captured was based on the voxel set acquired at a higher resolution, there was less divergence in BV/TV from the baseline scan.

Our results for Tb.Th and Tb.Sp imply that while the trabecular spacing remains relatively stable, Tb.Th increases at larger voxel sizes. Because Tb.Sp is higher than Tb.Th, it is less sensitive to scanning/downsampling at tested resolutions. This might suggest that the thickness of the trabeculae is overestimated, that is, trabeculae are segmented as thicker, in very low-resolution scans. Another explanation could be that small trabeculae are lost during the downsampling/rescanning to larger voxels and thus the distribution of the thickness changes more rapidly than it is the case for Tb.Sp. Partial volume averaging occurs when the boundaries of small structures within an image

intersect multiple pixels or voxels. This can lead to a blurring effect, where the intensity values of different tissues or structures are averaged within the pixels or voxels. This can compromise the spatial resolution of the image and make it difficult to accurately delineate the small structures or detect fine details (Chakeres, 1984; Plewes & Dean, 1981). Downsampling/rescanning to larger voxel sizes can exacerbate the effects of partial volume averaging, especially if the original image already contains small structures that are near the limit of resolution. Thus, when an image is downsampled/rescanned, the smaller structures may be spread across even fewer pixels or voxels, increasing the degree of averaging, and further blurring the image, that is, downsampling/rescanning can amplify the problem of partial volume averaging by reducing the number of pixels or voxels available to represent small structures within an image (Chakeres, 1984; Conradi et al., 2010; Plewes & Dean, 1981). Thus, it is possible that in the end only the largest trabeculae persist, giving the impression that the average Tb.Th is as large as the maximum of the initial Tb.Th. Moreover, this partial volume averaging could also explain how BV/TV remains constant despite trabeculae getting thicker (on average). It must be emphasized that the trabecular parameters are measured on the segmented images and thus, the changes in the segmented images are another source of potential error in the measurement of trabecular parameters. As mentioned above, MIA is a voxel-size dependent segmentation method (Dunmore et al., 2018). Although we used the same protocol for each bone segmentation, ultimately any segmentation algorithm is limited by the size of the voxels it is classifying.

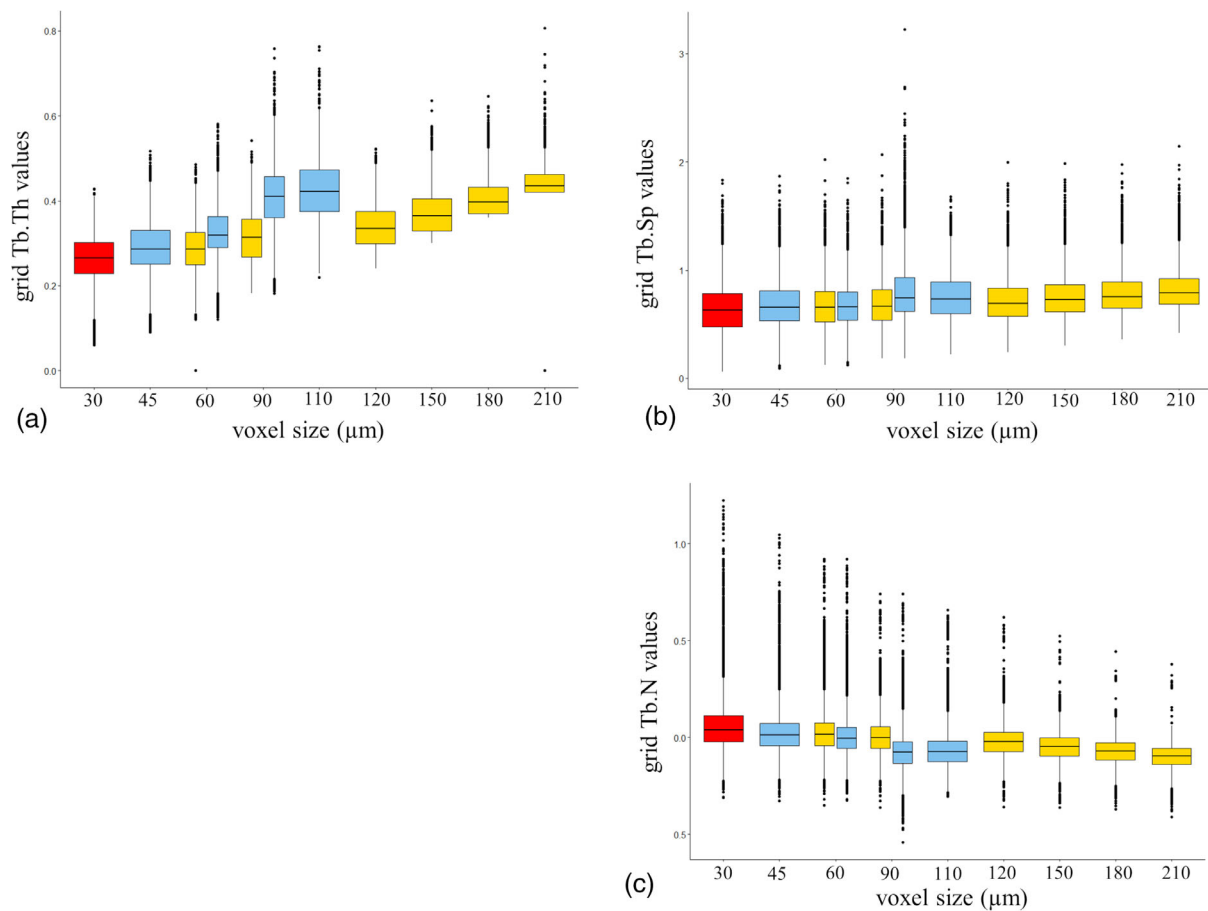
Our result suggests that the BV/TV, Tb.Sp, and Tb.N can be measured with reasonable precision up to 210  $\mu\text{m}$ , as can DA and Tb.Th up to 90  $\mu\text{m}$ , when downsampling. In contrast, the mean of BV/TV, DA, Tb.Sp, and Tb.N increases from 90  $\mu\text{m}$  when rescanning. We found Tb.Th to be the most sensitive to voxel size changes, where the mean increased for scans above 45  $\mu\text{m}$ . This is visible especially when looking at the colourmaps of the distribution patterns of all studied parameters. The discrepancies might be



**FIGURE 6** Distal tibia model of DA distribution of tested *Gorilla* individual for baseline scan (a), downsampled voxel sizes of 90, 150, and 210  $\mu\text{m}$  (b), and scan voxel sizes of 45–110  $\mu\text{m}$  (c). Vertical lines through the medial view show where the slices are positions for the cross-section mid-coronal view. Dark red represents the highest and dark blue the lowest DA values. All colourmaps were scaled to baseline scan data range. DA, degree of anisotropy.

due to the inconsistencies in the definition of the *InnerMask* as medtool uses morphological filters this is influenced by resolution due to kernel size. However, the morphological filter kernel sizes

(in voxels) of the fill algorithm were adjusted for each resolution, so definition of the *OuterMask* and *InnerMask* was kept as consistent as possible.



**FIGURE 7** Boxplots of the grid Tb.Th (a), Tb.Sp (b), and Tb.N (c) values for each voxel size for the baseline scan (red), the downsampled data (yellow) and for the specimen scanned at the different resolution (blue). Tb.Sp, spacing; Tb.Th, trabecular thickness.

Previous studies of the impact of CT and micro-CT resolution on quantification of trabecular structure observed dependence of trabecular bone parameters on voxel size, consistent with our results. Isaksson et al. (2011) found BV/TV to be less dependent on the voxel sizes compared to DA, Tb.Sp, and Tb.N which were more sensitive to changes in voxel sizes. Similarly, Kim et al. (2004) found mean Tb.Th and Tb.Sp to increase and Tb.N to decrease with larger voxel sizes which is again consistent with our results. However, they also found mean BV/TV to increase significantly with larger voxel sizes (Kim et al., 2004), which is not consistent with our results. Nevertheless, as supported by our study, Christiansen (2016) found mean BV/TV to be rather consistent within the voxel sizes and Tb.Th to be strongly affected by changes in voxel size. Overall, other studies that tested all or some of other trabecular parameters such as Tb.Th, Tb.Sp, and Tb.N have reported higher dependency on voxel size in all these parameters especially compared to BV/TV, and also compared to DA if included in the study (Isaksson et al., 2011; Kim et al., 2004; Kothari et al., 1998; Majumdar et al., 1996; Maquer et al., 2015; Müller et al., 1996; Peyrin et al., 1998; Sode et al., 2008; Stauber et al., 2006; Tabor, 2004).

This study is the first to show the effect of micro-CT voxel size using a whole-bone mapping approach to analyze trabecular bone

morphology. Although this study only included a single specimen, and was not extended to other anatomical sites, we recommend using high-resolution if possible. To speed up trabecular analysis, downsampled images rather than low-resolution scans could be used for certain trabecular parameters. This is especially important if DA and Tb.Th are quantified. Our results suggest that trabecular structure may be more precisely measured by quantifying most trabecular parameters up to voxel size of 90 μm (excluding Tb.Th). Moreover, BV/TV, Tb.Sp, and Tb.N are more robust and can be quantified at even larger voxel sizes with a greater degree of certainty than the other parameters, which are more sensitive to voxel size changes.

Though it was beyond the scope of this study, there are additional factors, such as segmentation method and/or the use of multiple micro-CT scanners for sample acquisition that have the potential to impact quantification of trabecular architecture and may warrant future investigation. It is also possible that the effect of voxel size on trabecular bone is different for regions with higher or lower trabecular BV/TV fraction. Thus, including trabecular bone from taxa that differ in mean BV/TV, as well as BV/TV range, is an important future direction. For example, large primates, such as *Gorilla*, tend to have robust trabecular bone network to support their larger body mass. In contrast, small primates generally exhibit relatively less trabecular bone

structures compared to larger primates as their smaller body size results in lower mechanical loads on their bones, reducing the need for extensive trabecular bone networks (Ryan & Shaw, 2013; Saporin et al., 2011). Based on our results, it might be expected that relatively less trabecular bone structure would be more sensitive to the resolution changes. This could potentially lead to less sensitivity to the resolution changes in BV/TV and potentially other parameters as micro-CT scanning is generally more effective at detecting more gracile structures compared to less gracile structures (e.g., Pyka et al., 2014; Vászárhelyi et al., 2020). Overall, this diversity in sample selection would help address potential sensitivity to resolution changes, particularly in smaller/less more gracile structures, which may lead to a reduction in trabecular network visibility and subsequently affect measured trabecular parameters.

## AUTHOR CONTRIBUTIONS

**Andrea Lukova:** Formal analysis (lead); methodology (lead). **Christopher J. Dunmore:** Formal analysis (equal); methodology (equal). **Zewdi J. Tsegai:** Formal analysis (equal); methodology (equal). **Sebastian Bachmann:** Formal analysis (equal); methodology (equal). **Alexander Synek:** Formal analysis (supporting); methodology (supporting). **Matthew M. Skinner:** Formal analysis (supporting); methodology (supporting).

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## DATA AVAILABILITY STATEMENT

Copies of all scans are curated by the relevant curatorial institution that is responsible for the original specimen and access can be requested through their institution. The authors confirm that the data supporting the findings of this study are available from the corresponding author upon reasonable request.

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## SUPPORTING INFORMATION

Additional supporting information can be found online in the Supporting Information section at the end of this article.

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