morphomap: An R package for long bone landmarking, cortical thickness, and cross-sectional geometry mapping

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Abstract
Objectives: This study describes and demonstrates the functionalities and application of a new R package, *morphomap*, designed to extract shape information as semilandmarks in multiple sections, build cortical thickness maps, and calculate biomechanical parameters on long bones.

Methods: *morphomap* creates, from a single input (an oriented 3D mesh representing the long bone surface), multiple evenly spaced virtual sections. *morphomap* then directly and rapidly computes morphometric and biomechanical parameters on each of these sections. The R package comprises three modules: (a) to place semilandmarks on the inner and outer outlines of each section, (b) to extract cortical thicknesses for 2D and 3D morphometric mapping, and (c) to compute cross-sectional geometry.

Results: In this article, we apply *morphomap* to femora from *Homo sapiens* and *Pan troglodytes* to demonstrate its utility and show its typical outputs. *morphomap* greatly facilitates rapid analysis and functional interpretation of long bone form and should prove a valuable addition to the osteoarchaeological analysis software toolkit.

Conclusions: Long bone loading history is commonly retrodicted by calculating biomechanical parameters such as area moments of inertia, analyzing external shape and measuring cortical thickness. *morphomap* is a software written in the open source R environment, it integrates the main methodological approaches (geometric morphometrics, cortical morphometric maps, and cross-sectional geometry) used to parameterize long bones.

KEYWORDS
cross-sectional geometry, geometric morphometrics, long bones, morphomap, morphometric maps, R

1 INTRODUCTION

The study of diaphyseal bone form based on landmarks or measurements between them, cortical thickness variations and cross-sectional geometry (CSG) are commonly carried to retrodict long bone behavior and adaptation in response to loading. Such analyses are applicable in studies of the impacts on adult form and developing bones of locomotion, the nature, intensity and repetitiveness of physical activity and
body mass. In the field of specialization of the authors, biological anthropology, many past studies have used parameters of form, cortical thicknesses or CSG, to study past behavior and loading, in primates (Connour, Glander, & Vincent, 2000; Kimura, 2003; Marchi, 2005, 2007, 2010; Marchi, Leischner, Pastor, & Hartstone-Rose, 2018; Patel, Ruff, Simons, & Organ, 2013; Ruff, 2002; Ruff & Runestad, 1992), ancient human populations (Carlson & Marchi, 2014; Holt, 2003; Macintosh, Davies, Pinhasi, & Stock, 2015; Macintosh, Pinhasi, & Stock, 2017; Marchi, Sparacello, Holt, & Formicola, 2006; Niinnimäki et al., 2017; Ruff & Hayes, 1983; Ruff & Larsen, 2014; Shaw & Stock, 2013; Sparacello, Marchi, & Shaw, 2014; Stock & Pfeiffer, 2001), and fossil hominins (Friedl et al., 2019; Jungers & Minns, 1979; Marchi, Harper, Chirichir, & Ruff, 2019; Rodríguez, Carretero, García-González, & Arsuaga, 2018; Ruff, Burgess, Ketcham, & Kappelman, 2016; Ruff, Trinkaus, Walker, & Larsen, 1993; Trinkaus & Ruff, 1989, 2012). While parameters describing bone form, cortical thickness variations and CSG have proven to be very useful for reconstructing bone loading patterns (Endo & Takahashi, 1982; Huiskes, 1982; Piziali, Hight, & Nagel, 1976; Uthhoff & Jaworski, 1978), the effort in calculation has tended to limit studies to a few cross-sections, although some previous studies have shown the value of finer detailed analysis of whole long bone shafts and multiple sections (Lacoste Jeanson, Santos, Dupej, 2018; Lacoste Jeanson, Santos, Villa, et al., 2018; Puymerial et al., 2012).

Computerized tomography (CT) scanning and advances in three dimensional (3D) reconstruction, visualization, parameterization, and analysis of skeletal form have facilitated the collection, sharing (i.e., morphosource, MorphoMuseum, Digital morphology museum available at http://dmm.prelkoyo.u-a.cjp, Kupri and NESPOS) (Boyer, Gunnell, Kaufman, & McGeary, 2016; Bradtmöller, Pastoors, Slizewski, & Weniger, 2010; Lebrun & Orliac, 2016) interpretation of large datasets (Davies et al., 2017). These advances underpin a specific subdiscipline within our field of biological anthropology, virtual anthropology (VA; Weber, Recheis, Scholze, & Seidler, 1998; Weber, 2001; Cunningham, Rahman, Lautenschlager, Rayfield, & Donoghue, 2014). The methods of VA are applicable to skeletal studies in all species.

Increasingly, studies utilize skeletal landmark coordinates to investigate form variation using geometric morphometric (GM) methods. However, while landmarks can readily be identified in the cranium (Cardini & O’Higgins, 2004; Mitteroecker, Gunz, & Bookstein, 2005) and epiphyses (Almécija et al., 2019; Arias-Martorell, & Marchi, 2019; Marchi, Leischner, Pastor, & Hartstone-Rose, 2018; Patel, Ruff, Simons, & Organ, 2013; Ruff, 2002; Ruff & Runestad, 1992), ancient human populations (Carlson & Marchi, 2014; Holt, 2003; Macintosh, Davies, Pinhasi, & Stock, 2015; Macintosh, Pinhasi, & Stock, 2017; Marchi, Sparacello, Holt, & Formicola, 2006; Niinnimäki et al., 2017; Ruff & Hayes, 1983; Ruff & Larsen, 2014; Shaw & Stock, 2013; Sparacello, Marchi, & Shaw, 2014; Stock & Pfeiffer, 2001), and fossil hominins (Friedl et al., 2019; Jungers & Minns, 1979; Marchi, Harper, Chirichir, & Ruff, 2019; Rodríguez, Carretero, García-González, & Arsuaga, 2018; Ruff, Burgess, Ketcham, & Kappelman, 2016; Ruff, Trinkaus, Walker, & Larsen, 1993; Trinkaus & Ruff, 1989, 2012). While parameters describing bone form, cortical thickness variations and CSG have proven to be very useful for reconstructing bone loading patterns (Endo & Takahashi, 1982; Huiskes, 1982; Piziali, Hight, & Nagel, 1976; Uthhoff & Jaworski, 1978), the effort in calculation has tended to limit studies to a few cross-sections, although some previous studies have shown the value of finer detailed analysis of whole long bone shafts and multiple sections (Lacoste Jeanson, Santos, Dupej, 2018; Lacoste Jeanson, Santos, Villa, et al., 2018; Puymerial et al., 2012).

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Here, we present morphomap, an R package specifically designed to extract cross-sections from long bone meshes at specified intervals along the diaphysis and to site semilandmarks on the periosteal and endosteal outlines of each cross-section and to calculate 2D and 3D MM and CSG parameters. We demonstrate the validity of this computational tool by showing that it obtains the same results as those from manual and other computational approaches. We then demonstrate the functionality of morphomap in comparing a human and a chimpanzee femur. The R code and examples are freely distributed in the R-package morphomap (Profico, Bondioli, Raia, O’Higgins, & Marchi, 2019). An R vignette with runnable examples is reported in Supporting Information.

2 | MATERIALS AND METHODS

We tested the functionality of the morphomap R package on a human and a chimpanzee femur. The human femur (OdN 244) is from a Northern Italian Bronze Age necropolis of Olmo di Nogara (Canci, Tafuri, Fornaciari, Cupito, & Salzani, 2011). It was imaged at the hospital of the University of Pisa using a GE LightSpeed RT16 medical CT scanner (slice thickness 0.625 mm, slice increment 0.625 mm, voltage 120 kV, X-ray tube current 300 mA, standard reconstruction algorithm, pixel size 479 μm). The chimpanzee femur (Kupri 1022) was obtained from the Digital Morphology Museum, KUPRI (http://dmm.prelkoyo.u-a.cjp/dmm/WebGallery/index.html). Its acquisition was performed on a Toshiba Asteio medical CT scanner (slice thickness 1.0 mm, slice increment 0.4 mm, voltage 120 kV, X-ray tube current 150 mA, standard reconstruction algorithm, pixel size 399 μm). The external and internal surfaces extracted from these are included in the morphomap R package.
2.1 | The morphomap R package

morphomap is designed to produce by default 61 cross-sections along the diaphysis of the long bone defined at increments of 1% between 20 and 80% of its biomechanical length as it is commonly defined in studies of diaphyseal CSG (Ruff, 2002; Marchi, 2005, 2007; Figure 1a). If required, the number of sections can be changed by the user.

To extract morphometric parameters, the centroid of each cross section is first identified and its coordinates $C_x$ and $C_y$ reported. Next, a set of lines are drawn at equally spaced angles from the centroid of the section. For each line, cortical thickness is calculated as the segment length of the line intersecting the cross-section at the medullary and at the subperiosteal contours. morphomap can output the mean cortical thickness (MeanThick), the minimum cortical thickness (MinThick), the standard deviation of the cortical thickness (SdThick), and the maximum cortical thickness (MaxThick). Alternative calculations of thickness can also be derived with morphomap (e.g., between points on the medullary outline and their nearest points on the cortex). The coordinates of the points of intersection (semilandmarks) are provided as output for morphometric analysis (Figure 1b,c).

At each cross-section, morphomap also calculates the periosteal (ExtP, mm) and endosteal perimeters (MedP), the cortical thickness measured at the four anatomical quadrants (anterior, posterior, medial, and lateral, in mm); the medullary area (MedA, mm$^2$), the cortical area (CA, mm$^2$); the area moments of inertia around the $y$ and $x$ axes, ($I_y$ and $I_x$, mm$^4$); the maximum and minimum area moments of inertia ($I_{\text{max}}$ and $I_{\text{min}}$, mm$^4$), the angle between the major axis and the mediolateral axis of the cross-section, theta ($\theta$, radians), the polar moment of inertia ($J$, mm$^4$), the section moduli ($Z_x$, $Z_y$, $Z_{\text{max}}$, $Z_{\text{min}}$, and $Z_{\text{pol}}$, mm$^4$) and the maximum chord lengths from $y$ and $x$ axes ($d_y$ and $d_x$, mm; see Supporting Information). Table 1 summarizes the main functions of morphomap. The morphomap R package is available for all major platforms (Windows, Linux/Unix and Mac OS X).

2.2 | Automatic segmentation of long bone meshes

morphomap requires an oriented long bone mesh as the input (Figure S1). The orientation of the mesh can be checked using the function morphomapCheck which is described in Supporting Information. It may be necessary to mirror long bones to avoid issues of laterality. This can be achieved using the morphomapMirror function (Table 1). The first step of the measurement procedure is the automatic separation of the periosteal and endosteal surfaces (Figure 2) by applying the CA-LSE R-tool (Computer Assisted Laser Scanner Emulator; Profico, Schlager, et al., 2018). This is carried out by the function morphomapSegm (Table 1).

2.3 | Extraction of cross-sections

Sectioning is carried out using the morphomapCore function. First, the user specifies the biomechanical length of the long mesh. Next, morphomap extracts by default cross-sections at regular increments of 1% (but the user can choose a different increment) along the shaft between 20 (distal) and 80% (proximal) of the biomechanical length of the bone. The user can choose to change the start and end points by defining these parameters in the function morphomapCore. At each level, a transverse plane (perpendicular to the frontal plane) is drawn and the intersection between the transverse plane and the two meshes (periosteal and endosteal) (Figure 2) is used to define the periosteal and endosteal outlines of each cross-section (Figure 1c).

FIGURE 1  (a) Periosteal surface with 21 planes used to obtain the cross-sections; the 24 semilandmarks corresponding to the periosteal contours are reported in blue. (b) Endosteal surface with the 21 planes used to obtain the cross-sections; the 24 semilandmarks corresponding to the endosteal contours are reported in orange. (c) A cross-section at 50% of the bone biomechanical length is shown. Twenty-four lines are drawn at equally spaced angles from the centroid of the cross-section (L, lateral; A, anterior; M, medial, and P, posterior). At each angle, thickness is calculated as the segment length of the intersection of the line with the medullary and subperiosteal contours, and the points of intersection are provided as semilandmarks. In blue are shown the semilandmarks defining the periosteal contour; in orange, the semilandmarks defining the endosteal contour; the centroid of the cross-section is in black.
2.4 | Shape data module: Semilandmarking of cross-sections

By default, a set of 24 equiangular semilandmark pairs is defined by the intersections of the lines originating from the centroid of the cross-section and the endosteal and periosteal contours (Figure 1c). The morphomapShape function is used to output 2D and 3D coordinates of these semilandmarks. For subsequent analyses, the semilandmarks are numbered starting from the most anterior point on both contours, incrementing anticlockwise. The semilandmark configurations can be exported from morphomap in the morphologika format file (O’Higgins & Jones, 1998) using the function morphomapWriteMorphologika.

2.5 | MM module: Drawing of two- and three-dimensional MMs

MMs of cortical thickness facilitate visualization of the distribution of cortical bone in long bone diaphyses. They are calculated by the functions morphomap2Dmap and morphomap3Dmap from the Euclidean distances between each pair of semilandmarks (cortical and the equivalent endosteal one), which is the cortical thickness at each angle. This calculation is carried out between each pair (cortical-endosteal) of semilandmarks in each and every section. In this way, a matrix (by default, 24 distances by 61 slices) of cortical thicknesses is created, which is then converted into 2D and 3D MMs (Figure 3). 2D MMs can be drawn without any interpolation or more smoothly by applying generalized additive modeling (GAM, see Bondioli et al., 2010). 3D MMs are created by allocating to each node of the mesh the weighted (by distance) thickness values associated with its five nearest

**TABLE 1** Description of the main functions of the morphomap R package

| Function                | Description                                                                 | Notes                                                                 |
|------------------------|-----------------------------------------------------------------------------|----------------------------------------------------------------------|
| morphomapCheck         | Check the orientation of the input mesh                                      | Useful to visualize orientation of the mesh axes                      |
| morphomapMirror        | Mirror a long bone mesh along the yz plane                                   | Useful tool to mirror a long bone, for example, from right to left.  |
| morphomapSegm          | Separates a mesh from its visible and not visible components by using CA-LSE method | Creates the periosteal and endosteal long bone meshes               |
| morphomapCore          | Tool to slice long bones. The function creates 2D and 3D sections           | The core of the morphomap R package. Slices the long bone and extracts cross sections |
| morphomapShape         | Calculates equiangular semilandmarks on each cross section outline. For each cross section it extracts the coordinates of both periosteal and endosteal outlines. | Tool for extracting semilandmarks for morphometric analyses. |
| morphomapWriteMorphologika | Saves the semilandmark configuration in the morphologika format file       | Function to export semilandmarks                                     |
| morphomapPlotShape     | Creates 2D and 3D plots of the semilandmark configuration                   | Useful to visualize the semilandmark configuration                    |
| morphomap2Dmap         | Creates and plots a 2D cortical thickness map                                | Tool for the definition of the 2D cortical thickness map              |
| morphomap3Dmap         | Creates and plots a 3D cortical thickness map                                | Plots the cortical thickness dataset on the long bone mesh           |
| morphomapPic           | Saves pictures of the sections with a scale and A, L, P, and M thicknesses   | Function to export cross section                                      |
| morphomapRaster        | Convert a section to a raster image                                          | Useful tool to export a cross-section of actual size                 |
| morphomapCSG           | Calculates for each section the biomechanical parameters commonly used in studies of cross-sectional geometry | Tool for the calculation of the main parameters used in cross-sectional geometry studies |
semilandmarks (this parameter can be changed by the user). The resolution of the 2D and 3D MMs is fully customizable by the user in order to remove outliers, smooth, and scale the matrix of thickness values.

In functions `morphomap2Dmap` or `morphomap3Dmap` (Table 1) the cortical thicknesses are used to draw topographic maps in 2D or 3D. In these, colors represent thickness, standardized by default (but selectable) from 0 (minimum) to 1 (maximum), on a 100-step color (the color palette is fully customizable by the user) scale from dark red (thickest) to dark blue (thinnest). These colors are plotted in 2D with the x axis corresponding to the unfolded cylinder projection of the diaphysis starting and ending at the anterior (A) border passing through the lateral (L), posterior (P), and medial (M) borders. On the y axis is plotted the diaphyseal length expressed as a percentage of the biomechanical length (Figure 3). In 3D, a plot is returned showing the femur in four anatomical views: anterior, lateral, medial, and posterior (Figure 4).

### 2.6 Exporting images of cross-sections

The `morphomapPic` function (Table 1) exports pictures of each cross-section in TIFF image format. By default, the cortical area is represented in black, the medullary canal in white. A scale bar is drawn to the bottom left (Figure 5). Thickness values at the four quadrants (A, L, P, and M) can be added to the exported cross-section (Figure 5a). The background, the legend and the cortical bone colors are fully customizable by the user.

The `morphomapRaster` function (Table 1) allows the pixel/mm ratio to be adjusted (0.1 by default) and exports the resulting bitmap (raster image) in TIFF format. This is useful to prepare images without a scale bar for importing into other morphometric or reconstruction software.

### 2.7 Cross-sectional geometry module and its validation

The `morphomapCSG` function calculates in each section the CSG parameters most commonly used in biomechanical studies: the area, the area moments of inertia ($I_x$, $I_y$; Figure S4), the principal area moments of inertia ($I_{max}$ and $I_{min}$; Figure S5), theta ($\theta$), the polar moment of inertia ($J$) (Figure S6), and the section moduli ($Z_x$, $Z_y$, $Z_{max}$, $Z_{min}$ and $Z_{pol}$). The formulae used to calculate each CSG parameter implemented in `morphomap` are given in Table S1. For the calculation of these parameters `morphomap` converts the cortical area defined by periosteal and endosteal contours into picture elements of adjustable side length (delta) (Figure S2). In this way, all the parameters are calculated without interpolation. By default, delta has length 0.1 mm, this is customizable by the user (Figure S3).

We tested the calculation of CSG parameters embedded in `morphomap` by extracting two cross-sections from two surfaces artificially created for this purpose; a hollow circular cross-section and a hollow rectangular cross-section (Figure 6a,b). Table 2 shows the comparison between the values obtained via `morphomap` and those obtained by applying the formulae reported in Supporting Information.

In addition, we compared the values calculated in `morphomap` with the corresponding figures obtained when using BoneJ (Doube et al., 2010) for diaphyseal cross-sections at 50% of the total biomechanical length of a human femur (OdN 244) and a Pan troglodytes (Kupri 1022) femur (Figure 6). Table 3 shows the parameters calculated via `morphomap` and BoneJ.

### 3 RESULTS

#### 3.1 Case study—The human and chimpanzee femora

In this section, we show the application of the main functions embedded in the `morphomap` R functions to a human and a chimpanzee
FIGURE 4 3D morphometric map of cortical thickness along the diaphysis of OdN 244. The map is shown in anterior (top left), lateral (top right), medial (bottom right) and posterior (bottom left) views. The colors indicate the standardized cortical thickness associated with each vertex of the mesh and range from dark red (thickest) to dark blue (thinnest).

FIGURE 5 Example images of cross-sections exported from morphomap. (a) cross-section with anterior, lateral, posterior and medial thicknesses indicated (A, L, P, and M). (b) cross-section with no mark-up, (suitable for import into other software as BoneJ); The bar at the bottom left of each figure is the scale.

FIGURE 6 Cross-sections used to test the performance of morphomap. The parametric cross-sections consist of a hollow circular section (a) \(r_o = 10\) mm, \(r_i = 9\) mm) and a hollow rectangular cross-section (b) \(B = 24\) mm, \(H = 20\) mm, \(b = 16\) mm, \(h = 15\) mm). In (c) and (d) two cross-sections extracted at 50% of the biomechanical length of the femur of a chimpanzee (Kupri No. 1022) and a human (OdN 244), respectively, are represented. The pictures were exported using the function morphomapRaster.
femur. The detailed functionality of the R code is reported in Supporting Information. The 3D femur meshes were aligned using Avizo 6.3 (Visualization Sciences Group, Mérignac, France) following the protocol explained in Ruff (2002). The biomechanical lengths of the bones are 380.23 mm and 277.13 mm for the human and the chimpanzee, respectively. First, the mesh was uploaded into R by using the `file2mesh` function belonging to the Morpho R package (Schlager, 2017). Second, the `morphomapSegm` function was used to separate the periosteal and endosteal contours. The `morphomapSegm` function was used to produce two suitable surfaces for the extraction of the cross-sections. The `morphomapCore` function extracted sixty-one cross-sections from 20 to 80% of the biomechanical length of the two femora (see Figure 1a,b and Figures S7–S8).

Third, the `morphomapShape` function was used to extract from each cross-section 24 equiangular semi-landmarks on the periosteal and endosteal outlines (see Figure 1c). Fourth, the `morphomap2Dmap` function was used to create 2D MM (Figure S9) and fifth, the `morphomap3Dmap` function was used to create 3D MM (Figure 7).

In agreement with a previous study (Puymerail, 2013) performed on a sample of 12 modern humans and 10 chimpanzees, the human diaphysis shows greater cortical thickness, resisting posterior bending along the linea aspera, while the chimpanzee femur is characterized by medial and lateral bony reinforcements in the proximal portion of the bone. We have reported in Tables S2 and S3 the CSG parameters computed for the human and chimpanzee femora, respectively. These were calculated for 13 cross-sections taken a at 5% increments (for simplicity) from 20 to 80% of the biomechanical length of the femur.

Finally, `morphomap` offers the prospect of rapid processing of large samples. Table 4 shows the CPU time required to process the chimpanzee femur.

### DISCUSSION

Cortical bone topographic thickness variation in long bones reflects biomechanical loading history (Kivell, Davenport, Hublin, Thackeray, &

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**TABLE 2** Cross-sectional geometry of the sections in Figure 6a,b

| Geometric shapes formulae | Morphomap | Difference (%) | BoneJ | Difference (%) |
|---------------------------|-----------|----------------|-------|----------------|
| Hollow cylindric section  |           |                |       |                |
| \( I_x (\text{mm}^4) \)    | 2,700.984 | 0.01           | 2,706.6305 | –0.21          |
| \( I_y (\text{mm}^4) \)    | 2,700.984 | 0.01           | 2,706.6305 | –0.21          |
| CA (mm²)                  | 59.690    | 0.00           | 59.80  | –0.18          |

**Note:** Parameters are calculated with `morphomap` and directly using the formulae reported in Supporting Information.

**TABLE 3** Cross-sectional geometric parameters calculated using `morphomap` and BoneJ on cross sections extracted at the 50% of the biomechanical length of the femur of a human (OdN 244) and of a chimpanzee (Kupri No. 1022)

|                      | Homo sapiens |                       | Pan troglodytes |                       |
|----------------------|--------------|------------------------|-----------------|----------------------|
| Cortical area (mm²)  | 386.06       | 386.17 (–0.03)         | 357.00          | 357.06 (–0.02)       |
| \( I_x (\text{mm}^4) \) | 15,788.98    | 15,795.66 (–0.04)      | 14,093.96       | 14,109.6 (–0.11)     |
| \( I_y (\text{mm}^4) \) | 18,443.6     | 18,444.83 (–0.01)      | 16,881.29       | 16,907.60 (–0.16)    |
| \( Z_x (\text{mm}^3) \) | 1,164.53     | 1,173.55 (–0.77)       | 1,203.09        | 1,213.32 (–0.84)     |
| \( Z_y (\text{mm}^3) \) | 1,358.84     | 1,366.66 (–0.57)       | 1,337.16        | 1,342.81 (–0.42)     |
| \( l_{max} (\text{mm}) \) | 19,525.64    | 19,540.94 (–0.08)      | 17,201.32       | 17,216.36 (–0.09)    |
| \( l_{min} (\text{mm}) \) | 14,668.7     | 14,699.94 (–0.21)      | 13,794.83       | 13,800.50 (–0.04)    |
| \( Z_{max} (\text{mm}^3) \) | 1,484.86    | 1,488.25 (–0.23)       | 1,312.725       | 1,315.87 (–0.24)     |
| \( Z_{min} (\text{mm}^3) \) | 1,208.47     | 1,213.25 (–0.39)       | 1,189.54        | 1,192.35 (–0.24)     |
| Theta (rad)          | 0.50         | 0.50 (0.00)            | 0.31            | 0.31 (0.00)          |

**Note:** Differences in results are expressed as percentages.
The R package, *morphomap*, is designed to semi-automatically: (a) place semilandmarks on the inner and outer outlines of each section, (b) extract cortical thicknesses for 2D and 3D morphometric mapping, and (c) to compute cross-sectional geometry.

In this article, we detail the algorithms and tools incorporated in *morphomap* and show that its calculations are valid. The tests performed concerning the use of *morphomap* to calculate cross-sectional geometric properties are in agreement with both theoretical expectations and the results obtained using the most popular software for such purpose (i.e., BoneJ (Doube et al., 2010). Further, we compare 2D and 3D MMs from human and chimpanzee femora and show they are in agreement with those from previous work on larger samples (Puymerail, 2013).

Thus, *morphomap* is a new tool for the study of cortical variation in long bones. It is written in the open source R environment (R Development Core Team, 2016) and is compatible with other R packages commonly used in mesh manipulation, such as Morpho (Schlager, 2017) and Arothron (Profico, Schlager, et al., 2018), morphological studies (Adams & Otárola-Castillo, 2013) and MMs (Adler, Nenadic, & Zucchini, 2003; Sarkar, 2008). *morphomap* semi-automatically processes the entire bone, beginning with an input mesh that is separated into outer and inner cortical meshes using the CAL-SE method from the Arothron R package (Profico, Veneziano, et al., 2018). The R programming language allows for easy editing of the R code for alternative implementations and debugging. The developmental version of the *morphomap* R package is available on github (https://github.com/AProfico/morphomap) and the stable version is available on CRAN (https://CRAN.R-project.org/package=morphomap). We strongly encourage R developers to propose and code new functionalities to be included in *morphomap*.

**FIGURE 7** Three dimensional morphometric maps calculated on a human (OdN 244) (left) and a chimpanzee (Kupri 1022) (right) femur.

**TABLE 4** Details on the computation times required by *morphomap* to process the chimpanzee femur. Inter(R) Core (TM) i7-7700HQ CPU 2.80 GHz RAM memory 16.0 GB

| Process                          | Function         | Time (s) | Note                                                                 |
|----------------------------------|------------------|----------|----------------------------------------------------------------------|
| Automatic segmentation           | *morphomapSegm*  | 17.65    | 347,840 vertices                                                     |
| Cross sections definition        | *morphomapCore*  | 39.92    | 61 sections and 1,000 points on each cross section                   |
| Definition of equiangular semilandmarks | *morphomapShape* | 22.39    | 48 semilandmarks on each cross section and definition of the centroid |
| Creation of 2D morphometric map  | *morphomapGam*   | 5.94     | Creation and plotting of the 2D morphometric map paired with the application of GAM smoothing algorithm |
|                                   | *morphomap2Dmap* |          |                                                                      |
| Creation of 3D morphometric map  | *morphomap3Dmap* | 7.95     | Creation and plotting of the 3D morphometric map paired with the application of GAM smoothing algorithm |
| Calculation of cross-sectional geometry parameter on the cross section at the 50% of the biomechanical length | *morphomapCSG* | 14.91    | Full calculation of the cross-sectional geometry parameters. The speed of execution mainly depends on the definition of the picture elements side length (delta) (for details see Supporting Information). |
| Entire process                   |                  | 108.76   |                                                                      |
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AUTHOR CONTRIBUTIONS
Antonio Profico: Conceptualization; data curation; formal analysis; funding acquisition; investigation; methodology; project administration; resources; software; validation; visualization; writing-original draft; writing-review and editing. Luca Bondioli: Software; writing-review and editing. Pasquale Raia: Software; writing-review and editing. Paul O’Higgins: Conceptualization; funding acquisition; methodology; project administration; software; supervision; writing-original draft; writing-review and editing. Damiano Marchi: Conceptualization; methodology; resources; software; supervision; validation; writing-original draft; writing-review and editing.

CONFLICT OF INTEREST
The authors declare no conflict of interest.

DATA AVAILABILITY STATEMENT
The data that support the findings of this study are included in the R package morphomap. The R package is available on CRAN at https://CRAN.R-project.org/package= morphomap.

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**SUPPORTING INFORMATION**

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

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