

# Chapter 14 Three-Dimensional Geometric Morphometrics in Paleoecology

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Abstract Quantification and analysis of shape is an important component of many paleoecological studies. Geometric morphometrics is a powerful shape analysis tool that allows its user to compare entire regions of morphology, visualize shape differences between groups, and create visualizations based on real data. This method is rapidly becoming the standard for data collection and analysis in many fields such as anthropology, biology, ecology, forensics, paleontology, and zoology. Here, the basic procedures of geometric morphometrics are reviewed and a case study on the ecomorphology of the cervid calcaneus is provided to illustrate how geometric morphometrics can be used in paleoecological studies.

Keywords Shapeanalysis • Surface • Outline • Landmark • Ecomorphology • Multivariate analysis • Artiodactyla • Cervidae

## Introduction

Identifying and interpreting differences in morphology is a central theme to many paleoecological studies, including palynology (Mander and Punyasena [2018\)](#page-16-0), phytolith studies (Strömberg et al. [2018](#page-17-0)), macrobotanical analysis (Peppe et al. [2018\)](#page-17-0), dental mesowear and microwear (Green and Croft [2018\)](#page-15-0), functional morphology (Dunn [2018](#page-15-0); Evans and Pineda-Munoz [2018](#page-15-0)), and ecomorphology (Barr [2018\)](#page-14-0). This chapter reviews three-dimensional (3D) geometric morphometrics methods currently being employed in paleoecological contexts.

Geometric morphometrics (GM) is rapidly becoming the standard method in biological and paleontological studies of morphology. It is widely used in ecological studies of masticatory behavior and locomotor behavior (e.g., Aguilar-Medrano [2017](#page-14-0); Fernández et al. [2016;](#page-15-0) Ritzman et al. [2016;](#page-17-0) Taylor et al. [2016](#page-17-0); van Heteran et al. [2016\)](#page-18-0). Operating with a robust definition of shape and resting on a firm statistical foundation, GM methods are appropriate for a wide variety of shape-related questions, many of which had existed as qualitative descriptions previously. GM allows researchers to provide a high-resolution description of shape, analyze the entirety of an anatomical feature as a unit, take into account the 3D structure of shape, visualize shape differences, and even create hypothetical shapes based on actual data. Although not appropriate for every paleoecological study, GM is a powerful tool for shape-related research, especially for contexts wherein the researcher is interested in complex morphology.

It should be noted that there are many more shape analysis methods than are covered by this chapter, such as Elliptical Fourier Analysis (Slater et al. [2010](#page-17-0); Panagiotopoulou [2009\)](#page-17-0), Eigenshape Analysis (MacLeod [1999;](#page-16-0) Sheets et al. [2006\)](#page-17-0), joint-surface angular interfaces (Tocheri et al. [2008,](#page-17-0) [2011](#page-17-0)), dental topographic analysis (Evans and Fortelius [2008](#page-15-0); Eronen et al. [2010](#page-15-0); Smits and Evans [2012\)](#page-17-0), and superquadrics (Sommer et al. [2006\)](#page-17-0). The method covered here (Geometric Morphometrics) was selected due to its ubiquity and flexibility. Although this method can be applied to the morphology of almost any set of specimens that have homologous features, I will focus on biological specimens and specifically skeletal elements (generally referred to as "objects" here) and applications in ecological functional morphology (ecomorphology). A case study on Pleistocene Eurasian Cervidae (deer and relatives) ecomorphology will be used to illustrate how one can use geometric morphometrics in paleoecological research.

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#### Historical and Theorectical Background

What we still refer to as solid geometry was mostly eloquently articulated by Euclid of Alexandria in the third century BCE in the Elements, which are considered some of the most influential mathematical texts of all time (Boyer [1991\)](#page-14-0). Euclidean geometry defines the space in which most of the techniques of quantitative shape analysis work and form the basis of how we think about shape to this day. Quantification of Euclidean dimensions (length, width, depth, etc.) dominate studies of functional morphology. Such measures (referred to as traditional morphometrics) are useful in describing shape variation; however, they are difficult to apply to very complex shapes such as joint surfaces. Analyses using traditional morphometrics are further complicated by the effects of body size differences, which can be great in biological studies. Geometric morphometrics, which is described in detail below, is well-suited for addressing these issues in the analysis of complex shapes.

Although the origins of GM can be traced back to 1977 with David Kendall's work on stone circles (or even conceptually back to D'Arcy Thompson's deformation grids in 1917), the foundational principles set forth by Bookstein [\(1978](#page-14-0)) were worked out in a series of workshops and conferences in the 1980s and 1990s. These meetings resulted in what are referred to as the "color books", for each published proceedings or text has a dominant cover color (Red: Bookstein et al. [1985;](#page-14-0) Blue: Rohlf and Bookstein [1990](#page-17-0); Orange: Bookstein [1991](#page-14-0); Black: Marcus et al. [1993](#page-16-0); White: Marcus et al. [1996;](#page-16-0) and later, Green: Zelditch et al. [2004](#page-18-0); Yellow: Cardini and Loy [2013\)](#page-14-0). Over the past twenty-eight years, GM methodology has evolved from a "revolution" (Rohlf and Marcus [1993\)](#page-17-0), to a "synthesis" (Bookstein [1996](#page-14-0)), to a "paradigm" (Adams et al. [2013\)](#page-14-0).

Geometric morphometrics offers a different way of evaluating the shape of an object than is afforded by traditional morphometric studies (Mitteroecker and Gunz [2009;](#page-16-0) Baab et al. [2012](#page-14-0); Adams et al. [2013;](#page-14-0) Cooke and Terhune [2015](#page-15-0); McNulty and Vinyard [2015\)](#page-16-0). In GM, data are collected as two-dimensional or three-dimensional coordinates across a region of interest that contain all of the information that one would describe qualitatively and/or measure with traditional methods. For example, say we are analyzing the shape of hominin crania when viewed from posterior. We could describe the cranium of Australopithecus as being somewhat bell-shaped, Homo neanderthalensis as 'en bombe' or oval-shaped, and Homo sapiens as being shaped like the end of a loaf of bread. To quantify such shapes with traditional morphometrics, we could take a series of measurements from the posterior cranium, such as cranial height (the distance between osteometric points basion and bregma) or cranial breadth (the distance between left and right euryon) and create ratios from them. However, we would still be missing information about the regions between those measurements including the overall curvature of the cranial vault, which can provide a more detailed understanding of cranial morphology and facilitate comparisons between taxa. With GM, we could analyze the outline of the cranium (from a two-dimensional photograph) or the entire surface of the cranium (from three-dimensional scans). Not only would we maximize retention of information about the overall shape of the cranium throughout the analysis, but we would also be able to visualize the differences found in the collected data since we can apply vector transformations to the original data, which is much more difficult to do with traditional morphometrics. Thus, GM allows morphologists to quantify features that are traditionally described qualitatively. Further, we can even create hypothetical specimens based on the digitized data. For these reasons and others, geometric morphometrics is a powerful tool for the morphologist. In paleoecology, shape analysis is important for studies of both ecological functional morphology (ecomorphology) and taxonomy (used in many ecological methods).

In GM, the shape of an object is digitized as a series of 2D or 3D landmark coordinates that are superimposed in a single coordinate system (described in detail below) for analysis. The resulting coordinates (called Procrustes coordinates) are the raw data that can be analyzed using standard multivariate methods used in the study of shape. However, unlike traditional morphometric data, GM analyses maintain all the interrelationships of the original coordinates are maintained, including interlandmark distance and angles (Slice [2007](#page-17-0)). Thus, the variation in shape can easily be visualized and hypothetical specimens can be created. For example, in a study of variation in cervid femoral head shape as it relates to locomotor behavior in different habitats (Curran et al. [2016\)](#page-15-0), the average femoral head shape for cervids in different habitats or the shape changes along principal components axes can be visualized (Fig. [14.1\)](#page-2-0). Furthermore, one can explore hypothetical femoral head shapes in multivariate space based on the specimens in the space (such as the average specimen in the center of Fig. [14.1\)](#page-2-0) allowing researchers to ask questions about their data that may not have been possible before.

<span id="page-2-0"></span>

Fig. 14.1 Visualizations of cervid femoral head shape (in superior view) differences along PC1 (68% of variation) and PC2 (26% of variation), with the average specimen at the origin. Open-adapted cervids are distributed along the positive sides of PCs 1 and 2, while closed-adapted cervids are along the negative sides of the axes

### Methodology

Geometric morphometrics (GM) analysis begins with the selection and digitization of landmarks, which are points that are homologous, or at least operationally homologous, between specimens. For semilandmark analysis, curves or surfaces of a region are considered homologous when anchored by landmarks (Bookstein [1991,](#page-14-0) [1996/1997](#page-14-0); Gunz et al. [2005](#page-15-0)) and are digitized as a series of coordinates across a region. Selection of landmarks is important because they must be present in all specimens in the analysis and provide sufficient coverage of the anatomical region in question. It should be noted that these landmarks are homologous in a geometrical rather than biological sense (that is, the landmark location, itself, is likely not the unit of selection, but rather a part of the biologically homologous region; Gunz et al. [2005\)](#page-15-0). Further, not all landmarks are considered to be equal. Ideally, landmarks are placed at discrete anatomical loci, such as the intersection of cranial sutures or foramina (Bookstein [1991](#page-14-0)). Such landmarks are called Type I and carry the highest repeatability. For example, a Type I landmark on the human skull, the craniometric point 'nasion' is defined as the intersection of the frontal bone and the two nasal bones. Barring pathology or damage, this landmark is easy to locate and present on all human skulls. Type II landmarks are those placed on anatomical features that include tips of protuberances, bases of pits, and maxima of curved features, such as the

tip of the (unworn) canine (Bookstein [1991\)](#page-14-0). Type III landmarks are commonly used as the end points of conventional (caliper) measurements, such as lengths and widths. The craniometric point 'euryon', for example, is found on each side of the cranium to record its greatest breadth. Type III landmarks are defined in reference to other features are the least repeatable and perhaps the least likely to be equivalent among individuals. In landmark-based GM analyses, it is best to use as many Type I and II landmarks as possible.

If the region of interest is devoid of landmarks, as is the case for joint surfaces and other smooth features such as much of the human cranial vault, then semilandmark analyses may be used (Bookstein [1996/1997\)](#page-14-0). Although the semilandmark coordinates are not necessarily homologous, the region of interest from which the data are collected (curve or surface) is considered homologous (Perez et al. [2006\)](#page-17-0). Semilandmarks can be collected in a variety of ways. For a 2D analysis, points are usually digitized from an image using software (e.g., the tps suite by Rohlf ([2015\)](#page-17-0)). In 3D analyses, points are digitized either directly from a specimen using a MicroScribe (in Excel or visualized in real time using CAD software such as Rhinoceros®), or extracted from models created with a 3D scanning device (laser scanners, structured-light scanners, CT-scanners, etc.) or photogrammetry. With many of the data collection tools, coordinates will need to be extracted from digitized models using software such as Landmark Editor (Wiley et al. [2005\)](#page-18-0) or several R packages (see below). Landmarks are generally selected as a starting and end points (minimally) along the feature and then semilandmarks are digitized from a curve or surface in between those landmarks. As with a landmark-based analysis, the number of landmarks on each specimen must be equal and thus the user either must specify a number of semilandmarks across the region of interest or resample (Curran [2012](#page-15-0); Gunz et al. [2005](#page-15-0); Harcourt-Smith et al. [2008\)](#page-16-0) a surface or outline created from the digitized coordinates. Next, a sliding procedure is conducted on the collected coordinates wherein semilandmarks 'slide' along tangents to the curve or surface from which they are derived until all semilandmarks are in roughly homologous locations (Gunz and Mitteroecker [2013](#page-15-0)). This process starts with a reference or template specimen and is iteratively repeated based on a mean configuration. The resulting semilandmarks then are projected back down on to the original curve or surface of the target specimen (Gunz et al. [2005;](#page-15-0) Gunz and Mitteroecker [2013](#page-15-0)).

Once all landmarks or semilandmarks have been digitized for all specimens, their coordinates are submitted to a Generalized Procrustes Analysis (GPA). Specimens are typically digitized in slightly different orientations and positions, which will introduce differences in the coordinates that are irrelevant to the shape of the specimen. GPA superimposition removes this extraneous information about location, isometric size, and orientation.

To remove information about a specimen's digitized/ scanned location, the centroid of each specimen configuration is moved in space to a common origin. A specimen's centroid is found by calculating the mean  $x$ , mean  $y$ , (and mean  $\zeta$  for 3D analyses) coordinate of every point in its configuration (the "center of gravity" for all the landmarks; McNulty [2003,](#page-16-0) p. 61). Subtracting the specimen's mean  $x$  from all of its x-coordinates, the mean  $y$  from its y-coordinates, and the mean  $z$  from its  $z$ -coordinates translates the specimen to the origin; when applied to all specimens, this eliminates any differences between objects due to their location.

Especially important to the study of biological variation is that isometric size, which is often one of the greatest differences between specimens in traditional morphometric analyses (Falsetti et al. [1993](#page-15-0); Jungers et al. [1995](#page-16-0)), can be removed as a confounding factor in the initial stages of the GPA, however, allometric shape variation still remains in the data (Klingenberg [2016\)](#page-16-0). Landmark configurations are scaled isometrically by removing size differences among specimens by dividing each coordinate of a specimen by that specimen's centroid size, a measure of size that has no correlation to shape, by setting all configurations to a centroid size of one (Zelditch et al. [2004\)](#page-18-0). Centroid size is calculated as the square root of the sum of squared distances of a specimen's landmarks to its centroid (Bookstein [1991](#page-14-0); Dryden and Mardia [1998](#page-15-0); Mitteroeker and Gunz [2009](#page-16-0)). It should be noted that with certain research questions it may be undesirable to remove size from an analysis (Klingenburg [2016\)](#page-16-0) since size, itself, is an ecological variable. In fact, GM methods allow the researcher to parse out size and shape and examine them individually or in concert.

To remove information about a specimen's digitized/ scanned orientation, coordinate configurations are rotated to minimize the distance between each specific landmark across all specimens. This is an iterative least-squares process in which sum-of-squared distances between each landmark are minimized (Slice [2005\)](#page-17-0). In the first iteration, a mean configuration (reference configuration) of translated and scaled specimens is produced on to which all specimen configurations (target configurations) are then superimposed. A new mean configuration is then calculated and the process is repeated until further superimpositions produce negligible differences in distance minimization.

There are several software packages available to conduct a GPA (and other analyses), such as Morphologika (O'Higgins and Jones [2006\)](#page-17-0), Morpheus (Slice [2002](#page-17-0)), MorphoJ (Klingenberg [2011](#page-16-0)), EVAN toolbox (EVAN Society, [http://www.evan-society.org/\)](http://www.evan-society.org/), PAST (Hammer et al. [2001](#page-16-0)), and through R packages such as geomorph (Adams and Otarola-Castrillo [2013\)](#page-14-0) and Morpho (Schlager [2017](#page-17-0)). Many of these are freely available through the Stony Brook morphometric website ([http://life.bio.sunysb.edu/morph/\)](http://life.bio.sunysb.edu/morph/), which is a useful starting point for GM studies in general. Consult Appendix 14.1 for other software packages.

Following a GPA, the objects are aligned to share a common coordinate system, which can be organized in a matrix or 3D array, and can be used as shape variables (Slice [2005\)](#page-17-0), called Procrustes coordinates. These coordinates are the data that are submitted to multivariate analyses. For a 3D analysis, each x, y, z value for each landmark is input as a variable in future analyses (Cardini and Elton [2007](#page-14-0); Cardini et al. [2015\)](#page-14-0), thus (for example) a 3D configuration with 20 landmarks will have 60 variables for multivariate analyses. Here, a word of caution must be extended. Geometric morphometrics is a powerful method for analysis of shape differences; however, there are specific criteria that must be met for its use. In most studies of shape variance, including those based in traditional morphometrics, large sample sizes are desired. In the case of GM, large sample sizes are often necessary due to the large number of variables inherent to its methods This is particularly important if one is considering doing any multivariate analysis that involves matrix inversion, such as canonical variates analysis (described below). Further, the user should have a robust understanding of the assumptions in both geometric morphometrics (beyond the basics covered here-the reader is referred to Slice ([2007\)](#page-17-0) as a good starting point and to the "color" books listed above) and any multivariate analyses (Neff and Marcus [1980](#page-16-0)) they might use in order to avoid violating those assumptions and obtaining false results (the 'garbage in, garbage out' principle).

The following is an overview of some of the multivariate methods available, and it not meant to be exhaustive. GM is a rapidly growing field and these methods continue to be improved upon and new methods appear frequently. If you are interested in exploring the distribution of morphological variation in your sample, then principal components analysis (PCA) is a typical starting point, however, there is recent criticism of the use of this method in GM (Bookstein [2016,](#page-14-0) [2017b](#page-14-0)). Currently, PCA is used in two main applications in GM studies-data reduction and exploration. PCA recombines the original variables by rigidly rotating the data and creating new axes (the principal components, or PCs) that are mathematically uncorrelated (orthogonal) and which summarize sample variance in lower dimensionality. In doing so, the user now has fewer variables (the PCs, along which each specimen is scored), with the first PC summarizing the most variation in the sample, and each subsequent PC summarizing less and less. Typically, the majority of sample variance can be summarized in far fewer PCs than the number of original variables. The PCs are usually plotted against one another and the user then explores the distribution of specimens in the PC morphospace.

There are several methods available to explore the relationship between shape (e.g., Procrustes coordinates) and other variables such as sex, size, time, phylogeny, and ecological variables (e.g., temperature, precipitation, diet, trophic level, etc.). Multivariate regression and multiple multivariate regression can be used to test for correlations between one or more independent variables (such as those listed above) with several dependent variables (shape data; Frost et al. [2003;](#page-15-0) Klingenberg [2011;](#page-16-0) Cáceres et al. [2014](#page-14-0)). Partial Least-Squares (PLS; sometimes called 2-Block partial least-squares, 2B-PLS; Rohlf and Corti [2000\)](#page-17-0) is commonly used to investigate covariance of two sets of data (for example, shape and environmental variables or two different shapes) without the assumption of one data set as a predictor variable (Monteiro et al. [2003;](#page-16-0) Colangelo et al. [2010](#page-14-0); Piras et al. [2012](#page-17-0); Cáceres et al. [2014](#page-14-0); Meloro et al. [2014\)](#page-16-0).

When the research goal is to classify unknown specimens into preselected (a priori) groups (sex, diet type, habitat, etc.) or to evaluate distinctness of a priori groups, linear discriminant analysis (LDA; two groups) or canonical variates analysis (CVA; multiple groups) is frequently used. Like PCA, CVA recombines the variables to create new variables (canonical variates, or CVs) to maximize variability between groups relative to variability within groups (Neff and Marcus [1980\)](#page-16-0). However, unlike PCA, CVA is not a rigid rotation of the original data and distorts the original distribution of specimens by scaling distances between groups by within-group variance (Cooke and Terhune [2015](#page-15-0)). To proceed, the number of cases (specimens) should be greater than the number of variables (Kovarovic et al. [2011](#page-16-0)). In analyses with very high numbers of variables, the CVA will always show group separation, even if there is no biological reality to such a distribution (Mitteroecker and Bookstein [2011\)](#page-16-0). However, group separation can be evaluated by the results of a cross-validation analysis and premutation tests (McNulty et al. [2006;](#page-16-0) Adams and Collyer [2015\)](#page-14-0). Cross-validation removes one specimen or subsets of specimens, re-computes the CVA, and then classified the removed specimen(s) into a group. A likelihood of group membership (posterior probability) is calculated for each reclassified specimen and average correct reclassifications rates can be calculated for the training set (based on specimens of known group membership), which indicates how well the analysis will perform with unknown cases. One can also test the significance of group separation by using a permutation test based on known Mahalanobis squared distance  $(D^2)$ ; the squared distance between centroids, or the

multivariate mean for each group) compared to randomly resampled (permuted) data between groups (Neff and Marcus [1980;](#page-16-0) McNulty et al. [2006](#page-16-0); Curran [2009\)](#page-15-0).

To overcome some of the short-comings of LDA and CVA, one can use a between-groups PCA (bgPCA), wherein group means, rather than individual specimens are used to calculate the PC axes and then all specimens are scored (and plotted) along those axes (Mitteroecker and Bookstein [2011;](#page-16-0) Gunz et al. [2012;](#page-15-0) Renaud et al. [2015](#page-17-0); Cooke and Terhune [2015](#page-15-0)). Like CVA, a cross-validation can then be used to evaluate the correct reclassification rate for the bgPCA (Mitteroecker and Bookstein [2011\)](#page-16-0).

Beyond providing a new way to collect and analyze shape data, GM also allows for visualizations of shape differences in a dataset, which is much more difficult to do with traditional morphometric data. One can visualize difference in landmark positions between specimens using thin-plate splines (TPS; Bookstein [1989](#page-14-0); Zelditch et al. [2004\)](#page-18-0), wire-frame models, and warped surfaces (Wiley et al. [2005;](#page-18-0) Klingenberg [2013\)](#page-16-0). TPS visualizes differences between specimens (or averages of groups of specimens) using deformations on a grid (originally envisioned by Thompson in [1917\)](#page-17-0). These deformations demonstrate regions where a uniform grid with plotted landmarks of a reference coordinate configuration would have to be deformed in order to keep the landmarks of a target configuration in the in the same locations on the grid (Bookstein [1989;](#page-14-0) Klingenberg [2013](#page-16-0)).

One could also visualize specific points in a morphospace that are not sampled by actual specimens, such as a group mean shape, or shape differences along a principal component axis. In the case study below, wire-frame visualizations were created for the extremes of a morphological feature under investigation. Using principal component scores from a PCA on the specimen's Procrustes coordinates, a single discriminant function can be produced to separate two predefined groups, such as comparing the calcanei between open habitat adapted cervids versus closed habitat adapted. The scores of each specimen along the discriminant function are regressed against the Procrustes coordinates for each specimen, which produces a vector of coefficients correlated with a grouping variable, such as habitat type (McNulty et al. [2006\)](#page-16-0). When this vector is added to and subtracted from the consensus configuration (for the entire data set), it produces two new configurations that demonstrate the differences between the two extremes (such as "Open" and "Closed") along the vector (Frost et al. [2003](#page-15-0)). The vector can be multiplied in order to amplify shape differences, which allows for more obvious differentiation between the extremes by increasing the magnitude (but not direction) of the shape change. These changes can be visualized on

wire-frame models for point data (the case for the study here) or across a surface for 3D scanned data. It should be noted that the only real data are the landmarks and semilandmarks; all transformations between them are interpolated (Klingenberg [2013](#page-16-0)).

Geometric morphometrics offers users a method for shape analysis that operates under a specific and clear definition of shape (the geometrical information that remains when the variation due to location, orientation, and scale are removed from an object (Slice [2007](#page-17-0))), which enhances objectivity and replicability. Its basic theoretical principles (as described above) are well-established and the software (if not the hardware) to conduct GM analyses are free and becoming increasingly user-friendly. As such, GM methods are used ubiquitously throughout studies of anthropology, biology, and paleontology. Quantification and analysis of entire regions of shape and the maintenance of the interrelationships within the landmark configuration make geometric morphometrics a very appealing type of shape analysis, however, potential users should always ask if it is the appropriate method for their research question. While 2D analyses require only digital images, 3D analysis requires some type of digitizer (MicroScribe, laser or white-light scanner, CT-scanner, etc.), which can be expensive and processing of collected data can be time intensive. The benefit to the latter, of course, is that many biological features are three-dimensional and analysis in two-dimensions may result in loss of important information. However, with the limitations imposed by the necessity of large sample sizes and expensive equipment, in some cases a study using traditional morphometrics may be more appropriate, depending on one's question. In short, if your question can be answered with a few measurements, then do so. However, if you are interested in complex morphology with differences that can be quite subtle, geometric morphometrics may be a good fit for your research.

#### Case Study: Cervid Ecomorphology

The following case study is intended to give the reader a sense of the entire process of GM from data collection to results. This example is in no way meant to suggest the only manner in which to use this method, but instead to illustrate a specific question for which it is appropriate. Other examples of geometric morphometrics in ecomorphology and paleoecology include studies on reptiles and amphibians (Adams [2011;](#page-14-0) review in Kaliontzopoulou [2011\)](#page-16-0), primates (White [2009](#page-18-0); Cooke [2011](#page-14-0)), felids (Christiansen [2008](#page-14-0); Walmsley et al. [2012](#page-18-0)), canids (Raia [2004\)](#page-17-0), ursids (Figueirido et al. [2005;](#page-15-0) Figueirido and Soibelzon [2010](#page-15-0); van Heteren

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et al. [2016\)](#page-18-0), mustelids (Fabre et al. [2015;](#page-15-0) Bottom-Divet et al. [2017](#page-14-0)), voles (McGuire [2010\)](#page-16-0), rodents (Cano et al. [2013;](#page-14-0) Morgan and Alvarez [2012](#page-16-0)), bovids (Forrest et al. [2018\)](#page-15-0), and deer (Curran [2009,](#page-15-0) [2012](#page-15-0), [2015](#page-15-0)), the latter of which will be illustrated below.

The deer family Cervidae, contains approximately 40 different species in five tribes (Gilbert et al. [2006](#page-15-0)). They live in a wide variety of habitats, including non-sand deserts (e.g., Odocoileus hemionus, mule deer), grasslands (e.g., Ozotoceros bezoarticus, pampas deer), tundra (e.g., Rangifer tarandus, reindeer/caribou), woodlands (e.g., Caproelus caproelus, roe deer), temperate forests (e.g., Alces alces, moose), and tropical forests (e.g., Pudu puda, pudu). In these different habitats, they must be able to escape predators and each habitat has different levels of vegetative complexity, topographic relief, and substrate firmness, which in turn require different forms of locomotion and predator-escape behaviors. For example, the reindeer/caribou inhabits open tundra and uses speed in flight and herding behavior to escape predators. Morphologically, having a stable joint surface with low risk of hip joint dislocation (at the cost of joint mobility) is of primary importance. Alternatively, the pudu occupies tropical forests and must move through complex vegetation and topographical relief when escaping predators. Joint stability is sacrificed for joint mobility in order to change direction quickly while fleeing. Adaptations for different locomotor strategies can be evaluated in joint surface morphology, whole bone shape, and in specific regions of skeletal elements (for further studies using GM on post-crania, see also Arias-Martorell et al. [2015](#page-14-0); Bottom-Divet et al. [2017;](#page-14-0) Muñoz et al. [2017\)](#page-16-0).

Ecomorphological studies have been conducted on the closely related family of Bovidae (antelope and relatives) using traditional morphometric methods. Notably, work by Kappelman [\(1988](#page-16-0), [1991](#page-16-0)) demonstrated that several morphological aspects of the femur, especially femoral head shape and shape of the medial patellar margin correlate to different locomotor (habitat) adaptations. Subsequently, there were several ecomorphological studies of bovid post-crania (Plummer and Bishop [1994](#page-17-0); Scott et al. [1999;](#page-17-0) DeGusta and Vrba [2003](#page-15-0), [2005;](#page-15-0) Weinand [2007;](#page-18-0) Kovarovic and Andrews [2007](#page-16-0); Plummer et al. [2008](#page-17-0), [2015\)](#page-17-0), although few started with explicit functional morphological hypotheses, with the recent exception of Barr's ([2014,](#page-14-0) [2015,](#page-14-0) [2018](#page-14-0)) studies of the astragalus. Cervids have received much less attention than bovids in post-cranial ecomorphology studies, although several species were included by Kovarovic and Andrews ([2007\)](#page-16-0).

To fill this void, I collected three-dimensional landmark and semi-landmark data from across rear-limb skeletal elements in 33 extant and (minimally) five extinct species of deer

<span id="page-6-0"></span>

Fig. 14.2 A, Lateral view of left-side hock joint in articulation with skeletal elements labeled and joint surfaces highlighted: astragaluscalcaneus joint (vertical green and black stripes); os malleolus-calcaneus joint (pink and black stippling); cubonavicular-calcaneus joint (blue and black horizontal stripes). Orientation abbreviations: A, anterior; I, inferior; P, posterior; S, superior. B, Ten landmarks used in this study (numbered) on a right-side calcaneus in medial (top) and supero-anterior (bottom) views; both views are oriented with anterior to left

(many specimens were assigned to only Cervidae (gen. + sp. unknown) and exhibited a wide variety of sizes) to test the hypothesis that rear limb morphology reflects cervid locomotion in different habitats and substrates. Each extant species was assigned to a habitat type: Open (deserts, open grasslands, tundra), Intermediate Open (ecotones, tall grasslands,

swamps), Intermediate Closed (woodlands/shrublands), and Closed (forests) (Curran [2009](#page-15-0), [2012](#page-15-0), [2015\)](#page-15-0). Data were collected for 37 morphological features, but I will limit discussion here to the landmark-based geometric morphometric study of the calcaneus ( $n = 123$  for extant specimens and  $n = 47$  for fossil specimens) for illustrative purposes (Fig. 14.2).

In cervids, the calcaneus acts as a Class 1 lever, with the calcaneal-astragalar joint surface (vertically-striped area in Fig. 14.2A) as the fulcrum, the calcaneal body as the lever arm and the distal limb as the load arm. An increase in calcaneal length (approximated by landmarks 1 and 10 in Fig. 14.2B) increases the lever arm and thus increases the mechanical advantage of the contracting muscle that attaches onto the calcaneal tuber but reduces the speed of movement at the ankle. Conversely, a shorter calcaneus provides less power but a quicker movement. Cervids that utilize saltatorial locomotion (bounding leaps) to escape predators, which is an effective adaptive strategy common in more densely vegetated ecotones and closed habitats have longer calcanei than cervids that are cursorial in open habitats (Hildebrand [1985](#page-16-0)) with cervids that stott (leaping with all four feet contacting the substrate at the same time and mostly found in open mountainous regions) having the longest calcanei. The anterior process of the calcaneus articulates with three bones: anteriorly with the os malleolus (stippled region in Fig. 14.2A and landmark 5 in Fig. 14.2B), inferiorly with the cubonavicular (horizontally-striped region in Fig. 14.2A and between landmarks 1 and 3 in Fig. 14.2B), and at several places with the astragalus (vertically-striped region in Fig. 14.2A), but most especially on the sustentaculum tali (medial border demarked by landmarks 6 and 7 in Fig. 14.2B). Orientation of these joint surfaces affects the rest position of the calcaneus prior to lower limb extension, which, at the hock joint, is almost completely restricted to the parasagittal plane in cervids. The rest position of the calcaneus is hypothesized to determine how far the calcaneus moves along the astragalus when the gastrocnemius muscle is contracted (Fig. [14.3\)](#page-7-0). If the calcaneus sits more vertically on the articulations with the cubonavicular and astragalus, then it moves a shorter distance, which allows for a quick but less powerful force to be generated. This morphology is associated with open-adapted cursors that increase speed by increasing the number of times the same foot strikes the ground per second (the pace cycle). A more horizontal rest position means that the calcaneus travels farther with the contraction of the gastrocnemius, which generates more power, but is slower. This morphology is associated with saltatorial runners that flee predators in a series of leaps that allow for maneuverability in more closed habitats.

<span id="page-7-0"></span>

Fig. 14.3 Comparative rest position of the calcaneus of open-adapted (black wire-frame model) and closed-adapted (gray wire-frame model) cervids with landmarks numbered



Fig. 14.4 Map of Pleistocene European fossil sites in this study

Once the comparative sample of extant cervid morphology is established, it can be used as a training set to classify cervid specimens of unknown locomotor behaviors (i.e., fossils). Here, this will be applied to cervids from three early Pleistocene sites (St. Vallier and Senèze in France and Grăunceanu in Romania; see Fig. 14.4), which contain several very large deer taxa, including Cervalces and Eucladoceros (Table [14.1\)](#page-8-0). The three sites are slightly older (Nomade et al. [2014\)](#page-16-0) than the first appearance of Homo erectus in Eurasia at Dmanisi, Georgia (maximally 1.85 Ma; Ferring et al. [2011](#page-15-0)), and contain some of the same cervid genera, however,

specimens from Dmanisi were not available for this GM analysis. Using multiple habitat proxies (including macromammals (Gabunia et al. [2000](#page-15-0); Palmqvist [2002](#page-17-0); Lordkipanidze et al. [2007](#page-16-0); Tappen et al. [2007;](#page-17-0) Hemmer et al. [2011](#page-16-0)), micromammals (Furió et al. [2010\)](#page-15-0), herpetofauna (Blain et al. [2014\)](#page-14-0), pollen (Gabunia et al. [2000;](#page-15-0) Messager et al. [2010a](#page-16-0)), phytoliths (Messager et al. [2010a,](#page-16-0) [b](#page-16-0)), Dmanisi has been reconstructed as a variable but mostly arid, heterogeneous environment dominated by grasses, with more closed habitats such as woodlands and forests available nearby. The cervid taxa from Dmanisi include Cervus cf. nestii and Eucladoceros aff.

| Country | Site        | Date                                   | Cervids Present                   | n  |
|---------|-------------|--|-----------------------------------|----|
| Romania | Grăunceanu  | Early Pleistocene                      | Eucladoceros sp.                  | 17 |
| France  | St. Vallier | Early Pleistocene<br>$(2.4 - 2.1)$ Ma) | Croizetoceros ramosus medius      |    |
|         |             |  | Eucladoceros ctenoides vireti     |    |
|         |             |  | Cervidae (sp. $+$ gen. unknown)   | 17 |
| France  | Senèze      | Early Pleistocene<br>$(2.2 - 2.0$ Ma)  | Alces sp.                         |    |
|         |             |  | Eucladoceros ctenoides senezensis |    |
|         |             |  | Cervus sp.                        |    |
|         |             |  | Cervidae (sp. $+$ gen. unknown)   | 4  |
|         |             |  | Total                             | 47 |

<span id="page-8-0"></span>Table 14.1 Summary of fossil specimens in this study

Table 14.2 Calcaneus landmarks (Cal LM) used in this study. Note: black dots in Figure [14.2B](#page-6-0) are landmarks that were not homologous and thus eliminated from the analysis

| Landmark | Location description   |
|----------|--|
|          | Anterior point of cubonavicular articular surface            |
|          | Anteroinferior point of lateral astragular articular surface |
|          | Anteroposterior point of cubonavicular articular surface     |
|          | Superomedial point of anterior astragular articular surface  |
|          | Anterosuperior point of os malleous articular surface        |
|          | Inferomedial point of sustentacular tali                     |
|          | Superomedial point of sustentacular tali                     |
|          | Posteroinferior point of gactronemius enthesis               |
|          | Anterosuperior point of calceneal tuber                      |
| 10       | Posterosuperior point of caleanal tuber                      |

tegulensis, both of which are associated with "dense to open forests and shrub landscapes" (Lordkipanidze et al. [2007](#page-16-0), Supplementary Table S2). To compare the reconstructed paleohabitat of Dmanisi to other European sites that do not contain hominins, GM ecomorphological analyses were conducted on cervid post-crania from St. Vallier, Senèze, and Grăunceanu.

Using a MicroScribe® MLX 3D point digitizer [\(http://](http://www.3d-microscribe.com) [www.3d-microscribe.com](http://www.3d-microscribe.com)),  $x$ ,  $y$ , and  $z$  coordinates for ten landmarks (Fig. [14.2B](#page-6-0), Table 14.2) were directly uploaded into a spreadsheet (in this case, Excel). Once all data were collected on extant and extinct specimens, they were submitted to Morphologika (O'Higgins and Jones [2006](#page-17-0)) for Generalized Procrustes Analysis to translate them to the same origin, rotate them into the same orientation, and scale them to the same isometric size (as described above) (Fig. [14.3\)](#page-7-0). The resulting Procrustes coordinates were then used in the following analysis.

The main goal of this study was to provide a new paleoecological proxy using cervid remains, which are often the most frequent taxa in Eurasian fossil assemblages. However, there are two main confounding factors (phylogenetic relatedness and body size) that need to be assessed before proceeding with the ecomorphological proxy analysis. Since cervids belong to the same family, they may share similar morphology due to common ancestry and this may bias the ecomorphological signal. To test for this, a phylogenetic signal was calculated in MorphoJ (Klingenberg [2011](#page-16-0)) by comparing the sum of branch lengths of a phylogenetic tree (=tree length) based on known phylogenetic relationships of the extant taxa (from 10kTrees; Arnold et al. [2012\)](#page-14-0) and Procrustes coordinates (means for each species) to trees generated with randomly permuted tip taxa. The null hypothesis of no phylogenetic signal in the morphological data is rejected if 5% or more of the permuted tree lengths are shorter than the original (known lengths) tree. A significant p-value ( $p \leq 0.05$ ) indicates a relationship between phylogeny and morphology. In this study, the p-value is 0.7105, a non-significant result.

To assess the relationship between allometric size differences (since isometric size has been removed from the data during the GPA) and calcaneal morphology, a multivariate linear regression (Monteiro [1999](#page-16-0)) was performed on body size of extant taxa and the Procrustes coordinates in the geomorph package for R (Adams and Otárola-Castillo

[2013\)](#page-14-0). Cervids vary in body size by two orders of magnitude (4.65 kg in Pudu mephistophiles to 513 kg in Alces alces; Novak [1999](#page-16-0)) and the metric data have to be log-transformed before any comparison can be made. To test for a relationship between size and shape before proceeding with the ecomorphological analysis, the natural log of centroid size (lnCS) was regressed against the natural log of body weight (lnBW) for extant cervids, resulting in  $R^2 = 0.87$  and  $p <$ 0.0001. The lnCS of the Procrustes configurations was used as a proxy for body size in this analysis. Here, the correlation between lnCS and shape (Procrustes coordinates) was non-significant ( $p = 0.3057$ ).

Once phylogeny and allometry are shown to not have a large impact on morphology (or adjustments are made for them if they do have an impact), Procrustes coordinates of the cervid calcaneus can be used as a paleohabitat proxy. Extant cervid specimens with a known habitat preference were used as a training set for canonical variates analysis (CVA) to categorize unknown (fossil) specimens into a habitat type. The habitat types used here are similar to those used in bovid ecomorphological studies, in that the continuum of habitats is broken down into the four categories described above (for details refer to Curran [2012\)](#page-15-0). Since geometric morphometric analyses usually have a high number of variables (three for each Procrustes coordinatethe  $x$ ,  $y$ , and  $z$  values in a 3D analysis) and since CVA requires more cases (specimens) than variables, data (including extant and extinct specimens) were first reduced using PCA. To avoid overfitting (making the analysis too specific to the extant training set and possibly reducing the ability to accurately assign fossil specimens to a habitat

category; Kovarovic et al. [2011\)](#page-16-0), the number of PCs used in further analyses was determined by the lowest number of PCs that returned the highest reclassification rate but retained at least 90% of the original sample variance (Sheets et al. [2006;](#page-17-0) Curran [2015](#page-15-0)). Here, 17 PCs, summarizing 94.56% of the total sample variance, were submitted to CVA.

Specimens in the CVA extant training sample were reclassified into their known habitat type with a mean accuracy rate of 61.7% using the cross-validation method and 79.1% with the resubstitution method (Table 14.3), results that are 2.47 and 3.16 times (respectively) better than by chance alone. To test if the habitat types were significantly different from each other, pair-wise non-parametric permutation tests were conducted on the centroids (group mean Procrustes coordinates) for each habitat type (after McNulty et al. [2006](#page-16-0); see Curran [2015](#page-15-0)). All habitat types were significantly different at (minimally)  $p = 0.0031$  (Table 14.3).

Using the linear combinations calculated for the CVA, fossil deer specimens from three Eurasian paleontological sites were categorized into one of the four habitat types.

The calcaneal data overwhelmingly indicate open and intermediate open habitats were available in both France and Romania during the Early Pleistocene (Fig. [14.5,](#page-10-0) Table [14.4,](#page-10-0) Appendix 14.2). When combined, cervids with open-adapted calcanei make up 57.4% of the assemblages and intermediate open-adapted calcanei comprise a further 34%, for a pooled total of 91.4%. These results are supported by reconstructions from these sites using different proxies (as reviewed in Curran [2015\)](#page-15-0).

There was only one specimen that was classified into the closed habitat category, belonging to Cervalces gallicus from

Table 14.3 Reclassification results (by %) and permutation tests for the extant specimens (training set). InterClosed= Intermediate Closed, InterOpen = Intermediate Open

|                       | Closed                   | InterClosed | InterOpen | Open  |  |
|-----------------------|--------------------------|-------------|-----------|-------|--|
| <b>Resubstitution</b> |                          |             |           |       |  |
| Closed                | 92.86                    | 0.0         | $0.0\,$   | 7.14  |  |
| <b>InterClosed</b>    | 0.0                      | 81.82       | 9.09      | 9.09  |  |
| InterOpen             | 5.56                     | 11.11       | 66.67     | 16.67 |  |
| Open                  | $0.0\,$                  | 9.38        | 15.63     | 75.0  |  |
| Cross-validation      |                          |             |           |       |  |
| Closed                | 71.43                    | 7.14        | 14.29     | 7.14  |  |
| InterClosed           | 27.27                    | 45.45       | 9.09      | 18.18 |  |
| InterOpen             | 5.56                     | 14.81       | 61.11     | 18.52 |  |
| Open                  | 0.0                      | 12.5        | 18.75     | 68.75 |  |
|                       | InterOpen                | InterClosed | Closed    |       |  |
| Permutation tests     |                          |             |           |       |  |
| Open                  | < 0.0001                 | 0.0003      | < 0.0001  |       |  |
| <b>InterOpen</b>      | $\overline{\phantom{m}}$ | 0.0014      | < 0.0001  |       |  |
| InterClosed           | $\overline{\phantom{0}}$ | -           | < 0.0001  |       |  |

Fig. 14.5 Habitat Score analysis box-and-whiskers diagram. Extant comparative specimens are plotted on the left by habitat type, and specimens from the three fossil sites are plotted on the right. Black horizontal line represents the median, the box encloses the  $25<sup>th</sup>$  and  $75<sup>th</sup>$ percentiles, and thin vertical bars (whiskers) include specimens in the range of up to 1.5 times the distance between the quartiles

the French site of Senèze. This species was hypothesized by Breda [\(2008](#page-14-0)) to have occupied similar habitats to the modern moose, Alces alces, although this was considered contentious as Cervalces gallicus had extremely large antlers. The results from this study show that this species had a calcaneus adapted to closed habitats, indicating that there were some forested regions available near the site of Senèze.

A large number of the fossil calcanei in this analysis have not been identified to taxon. While this study is not intended to resolve this, there is an intriguing pattern in the data. When

Table 14.4 Fossil specimen habitat assignments

specimen scores for the first canonical variate were regressed against the natural log of centroid size (lnCS), there was a distinct patterning to the distribution of the fossil specimens in this morphospace. Although the  $R^2$  was low (0.092), the p-value indicated significance  $(p < 0.0001)$ . In Figure [14.6A](#page-11-0), it can be seen that many of the fossil specimens plot to the negative side on the first canonical variate, indicating that their morphology is not closed-adapted. When the fossil specimen distribution is examined without the extant training set, two or three groups of specimens are evident. In Figure [14.6B](#page-11-0), the asterisks are fossil specimens that are assigned only to Cervidae. In this distribution, there is a clear Eucladoceros group and a Croizetoceros group. Near each are several specimens of unknown taxon and then a group of specimens that falls in between the two groups (larger asterisks). It is possible that the larger specimens belong to Eucladoceros, that the smallest specimens belong to Croizetoceros, and possibly that the medium/small-sized group belongs to Cervus philisi, which is known from known from both St. Vallier and Senèze, France (Valli [2004a,](#page-18-0) [b;](#page-18-0) Delson et al. [2006](#page-15-0)). This hypothesis is supported by the habitat assignments for these specimens (see Appendix 14.2): the large specimens were mainly assigned to intermediate open habitat category, which is mainly comprised of Eucladoceros, while the medium/small- and small-sized specimens without taxonomic assignments were only assigned to the open habitat category, as were the Croizetoceros specimens.

It should be noted that the Dmanisi faunal assemblage contains members of the genus Eucladoceros, which were assigned to a more closed habitat (Lordkipanidze et al. [2007,](#page-16-0) Supplementary Information), however, the analysis here and elsewhere (see especially Curran [2015](#page-15-0)) indicate a more open-adapted signal for their post-cranial morphology. Although it is likely that several habitat types were available at Dmanisi, there is a substantial grassland signal from palynological records at the time of hominin occupation (Messager et al. [2010a\)](#page-16-0). Coupled with the reconstructions of relatively



<span id="page-10-0"></span>

<span id="page-11-0"></span>

Fig. 14.6 A, Specimens plotted in a morphospace of canonical variate one (CV1) versus the natural log of centroid size (lnCS). B, Only the fossil specimens in the analysis

open habitats and similarity of taxa between Dmanisi and the three European sites examined here, open to intermediate open paleohabitats were likely available across Eurasia at the time of Homo erectus's first arrival there. It is yet to be seen if hominins with similar dates to Dmanisi will also be found in Europe, for there does not seem to have been an ecological or geographic barrier to European dispersal (Moncel [2010\)](#page-16-0).

#### Future Prospects

In 1993, Rohlf and Marcus declared geometric morphometrics "a revolution in morphometrics" (p. 129). Ten years later, Adams et al. [\(2004](#page-14-0), p. 15) wrote, "We anticipate that over the next few years the geometric morphometric methods that were developed to address shortcomings of what was then the traditional approach to shape analysis will themselves evolve into a standard research protocol … perhaps even becoming the new "traditional" morphometrics". At this point, thirteen years later, in many fields (anthropology, biology, forensics, paleontology, mammalogy, zoology, etc.), geometric morphometrics is nearing the standard method for shape analysis. This is evidenced in the dramatic growth of publications using GM over the last fifteen years (Fig. 14.7, an update to Adams et al. [2004](#page-14-0)), a



Fig. 14.7 Number of publications that appear in the ISI: Web of Science database per year with a "geometric morphometrics" keyword search

large increase in the number of courses and workshops being offered at universities, professional meetings, and as stand-alone entities (see the Stony Brook morphometrics page at <http://life.bio.sunysb.edu/morph/notices.html> for a listing of some of these), and the availability of on-line databases such as MorphoSource (Copes et al. [2016](#page-15-0)), MorphoBrowser (Evans et al. [2007\)](#page-15-0), and others (see Davies et al. [2017](#page-15-0)). These databases are of special importance, as they make data widely available, storable, and in some cases, reduce issues of inter-observer error (von Cramon-Taubadel et al. [2007;](#page-18-0) Robinson and Terhune [2017](#page-17-0); Shearer et al. [2017](#page-17-0)).

Greater accessibility to GM data and instruction coupled with open access software, the availability of photogrammetry (Evin et al. [2016](#page-15-0)), and the decreasing cost of 3D digitizers is partially responsible for the proliferation of GM studies. Equally responsible for the rise in GM's usage are the practitioners of the methods itself. Although GM can be considered a "mature" (Slice [2007](#page-17-0), p. 273) method, its base assumptions and applications are constantly being revised (Adams et al. [2013;](#page-14-0) Bookstein [2017a,](#page-14-0) [b\)](#page-14-0). Recently, methods have been presented for the integration of GM with functional morphology (Bookstein [2015](#page-14-0)), finite elements analysis (Parr et al. [2012](#page-17-0); O'Higgins and Milne [2013](#page-17-0); Smith et al. [2015\)](#page-17-0), and genetics (Sherwood and McNulty [2011;](#page-17-0) Bo et al. [2014;](#page-14-0) Geiger et al. [2016;](#page-15-0) Martinez-Abadias et al. [2016\)](#page-16-0). Great strides are also being made in the virtual reconstruction and corrections to deformation of fossil specimens (Gunz et al. [2009;](#page-15-0) Tallman et al. [2014](#page-17-0); Bauer and Harvati [2015](#page-14-0); Millella et al. [2015\)](#page-16-0), visualization of shape differences (Klingenberg [2013\)](#page-16-0), and the automation of data collection (Boyer et al. [2011,](#page-14-0) [2015;](#page-14-0) Gonzalez et al. [2016\)](#page-15-0). There is no doubt that GM

methods will continue to be improved and be integrated further into studies of shape.

In the end, it can be said that GM has great intuitive appeal to researchers interested in shape analysis. There is a certain romantic quality to its mathematics and analysis technique. Thin-plate splines and wire-frame models elegantly display differences in shapes that can be described qualitatively, yet GM data allow for statistical analyses that are not possible with qualitative descriptors. With GM, we can not only quantify shape differences that hitherto may have been described only qualitatively, we can go beyond that and virtually create shapes in a manner that was not previously possible. It is no wonder then that GM has become a standard in the tool kit of morphologists.

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## Appendix 14.1

#### Software Packages

Edgewarp: <http://brainmap.stat.washington.edu/edgewarp//> EVAN Toolbox: <http://evan-society.org/node/42> geomorph (R package): <https://cran.r-project.org/web/packages/geomorph/index.html> Landmark editor: <http://graphics.idav.ucdavis.edu/research/EvoMorph> MorphoJ: http://www.fl[ywings.org.uk/MorphoJ\\_page.htm](http://www.flywings.org.uk/MorphoJ_page.htm) Morpho (R package): <https://cran.r-project.org/web/packages/Morpho/index.html> Morphologika2: <https://sites.google.com/site/hymsfme/downloadmorphologica> PAST: <http://folk.uio.no/ohammer/past/> R: <http://www.r-project.org/>

On-line Resources

MorphoBrowser: [http://pantodon.science.helsinki.](http://pantodon.science.helsinki.fi/morphobrowser/)fi/mor phobrowser/ MorphoSource: <http://morphosource.org/> Stony Brook Morphometrics page: <http://life.bio.sunysb.edu/morph/>

## Appendix 14.2



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