# A Practical Introduction to Geometric Morphometrics for Archaeological Science

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### Introduction

This guide provides a "hands-on" step-by-step introduction for the application of geometric morphometric (GMM henceforth) methodologies in archaeological science (as conducted the R Environment). Using a published dataset this guide will guide the reader through four key GMM procedures: 1) data importing (and creation), 2) data transformation, 3) data analysis and 4) data visualisation. A Japanese translation of this documentation is also provided.

This practical constitutes the second workshop of the #StayHomeButStudy event, organised by Dr. Atsushi Noguchi, Dr. Christian Steven Hoggard and Prof. Ben Marwick and is tailored for Japanese archaeologists, researchers and enthusiasts.

#### About the Code, Packages and Data

The data used throughout this guide originates from Ivanovaitė et al (2020): "All these Fantastic Cultures? Research History and Regionalization in the Late Palaeolithic Tanged Point Cultures of Eastern Europe", published in the European Journal of Archaeology (https://doi.org/10.1017/eaa.2019.59). The data can be found on GitHub (https://github.com/CSHoggard/-Eastern-Europe-Tanged-Points) and the Open Science Framework (https://osf.io/agrwb/)./

All code, data and markdown document (in HTML and PDF format) for this practical can be found on the workshop repository (https://github.com/CSHoggard/-japanworkshop2020tree/master/workshop 2).

The GMM procedure detailed below is grounded on two-dimensional outline analysis. In conducting outline analysis for this practical the follow packages (including their imported packages) are necessary:

- \* Momocs (Version 1.2.9) https://cran.r-project.org/web/packages/Momocs/index.html
- \* tidyverse (Version 1.3.0) https://cran.r-project.org/web/packages/tidyverse/index.html

For literature pertaining to outline analysis see:

- \* Claude, J. (2008). Morphometrics with R. Springer Publishing.
- \* Bonhomme, V., Picq, S., Gaucherel, C., & Claude, J. (2014). Momocs: Outline analysis using R. *Journal of Statistical Software*, 56: 1–24.
- \* Caple, J., Byrd, J., & Stephan, C. N. (2017). Elliptical Fourier analysis: Fundamentals, applications, and value for forensic anthropology. *International Journal of Legal Medicine*, 131 (6): 1675–1690.
- \* Ferson, S., Rohlf, F. J., & Koehn, R. K. (1985). Measuring shape variation of two-dimensional outlines. Systematic Zoology, 34 (1): 59–68.
- \* Kuhl, F. P., & Giardina, C. R. (1982). Elliptic Fourier features of a closed contour. Computer Graphics and Image Processing, 18 (3): 236–258.
- \* Yoshioka, Y. (2004). Analysis of petal shape variation of Primula sieboldii by elliptic fourier descriptors and principal component analysis. *Annals of Botany*, 94 (5), 657–664.
- \* Zahn, C. T., & Roskies, R. Z. (1972). Fourier descriptors for plane closed curves. *IEEE Transactions on Computers*, C-21 (3): 269–281.

#### **Software Installation**

Following the installation of R or RStudio, we can now install the required packages:

```
if(!require("Momocs")) install.packages('Momocs', repos='http://cran.us.r-project.org')
if(!require("tidyverse")) install.packages('tidyverse', repos='http://cran.us.r-project.org')
if(!require("rio")) install.packages('rio', repos='http://cran.us.r-project.org')
```

To download the data into R/Rstudio we can use the import function from the rio package, and extract the data from the GitHub repository:

```
database <- rio::import("https://github.com/CSHoggard/-workshopjapan2020/raw/master/workshop_2/database
tpsdata <- rio::import("https://github.com/CSHoggard/-workshopjapan2020/raw/master/workshop_2/tpslines.")</pre>
```

The tidyverse and Momocs packages may take time to install given the size of the file, so please be patient. Once installed, the packages can be activated through the library() function:

```
library(Momocs)
library(tidyverse)
```

#### About the Data

This data was composed to assess the robustness of cultural taxonomies in the Final Palaeolithic period of Eastern Europe, as denoted through tanged point variants. It consists of 250 tanged point outlines and produced in the TPS Suite (https://life.bio.sunysb.edu/morph/soft-dataacq.html), using the *outline object* function. As this dataset was produced in the TPS Suite the file format is *.tps.* In their composition these outlines are semilandmarks, an algorithm-produced series of equidistant points are each shape. A database of all examples and their respective cultural assignment is also provided.

# Importing Geometric Morphometric Data: Alternative Approaches

There are a number of ways which landmark and outline morphometric data can be imported into R. Here, for ease and replicability, the data was stored on a GitHub repository and directed into the R environment, utilising the Momocs::import\_tps() function in a .rds file. Other ways to import .tps data (if saved locally) include the geomorph::readland.tps() and rewriting tools in Momocs e.g. Momocs::rw\_rule(). Data from stereomorph can also be imported through the Momocs::import\_StereoMorph\_ldk() and Momocs:import\_StereoMorph\_curve() functions.

Within Momocs, outlines can be extracted from silhouette data through the Momocs::import\_jpg() and Momocs::import\_jpg1() functions. See their helpfiles for more details.

## Examining the Data

We can now preview our database using the head() function, and call our tpsdata through the View functions:

#### head(database)

```
## # A tibble: 6 x 10
        ID Site Context Longitude Latitude Country Archaeological_~ File_Name
##
##
     <dbl> <chr> <chr>
                             <dbl>
                                       <dbl> <chr>
                                                     <chr>>
                                                                      <chr>>
## 1
         1 Balt~ Baltaš~
                              24.0
                                        54.0 Lithua~ Baltic Magdalen~ Bal.1
         2 Baro~ Barouka
                              30.3
                                       53.5 Belarus Grensk
                                                                      Bor.1
## 2
## 3
         3 Baro~ Barouka
                              30.3
                                        53.5 Belarus Grensk
                                                                      Bor.3
                                                                      Bor.4
## 4
         4 Baro~ Barouka
                              30.3
                                       53.5 Belarus Grensk
## 5
         5 Baro~ Barouka
                              30.3
                                        53.5 Belarus Grensk
                                                                      Bor.5
         6 Baro~ Barouka
                              30.3
                                       53.5 Belarus Grensk
                                                                      Bor.6
## 6
## # ... with 2 more variables: Reference <chr>, Notes <chr>
```

We can observe that the group data (Archaeological\_Unit) is of type 'character' and not 'factor', as required for our analysis. This can be corrected through the base::as\_factor()function:

```
database$Archaeological_Unit <- as.factor(database$Archaeological_Unit)
is.factor(database$Archaeological_Unit) # check to see the data is now of type 'character'
## [1] TRUE</pre>
```

We can now inspect the number of different archaeological units within our dataset through the base::summary() function:

summary(database\$Archaeological Unit)

##	Baltic Magdalenian	Bromme (Eastern Europe)	Bromme (Western Europe)
##	36	9	49
##	Grensk	Krasnosillya	Perstunian
##	55	29	4
##	Pitted Ware (Type A)	Podolian	Vyshegorian
##	24	14	8
##	Wolkushian		
##	22		

The base::View() function will highlight the three constituent parts of the tps file: the 1) *Coo* (coordinate data), 2) *cur* (the curve data if present), and 3) *scale* (the scale data if present). It is the Coo data which we will take forward, with the database, to examine shape variation among our tanged points.

#### GMM Procedure 1: Outline file creation

Central to Momocs are a specific suite of shape classes: 1) outlines (OutCoo), open outlines (OpnCoo) or landmarks (LdkCoo). While some operations in Momocs are generic and do not depend on one of these classes, many functions require your data to be one of these S3 objects. In this instance our data is comprised of outlines, and so we wish for our data to be OutCoo to enable efourier (elliptic Fourier), rfourier (radii Fourier) and tfourier (tangent angle Fourier) methodologies. The coordinate data (coo) must therefore be turned into outline data through the Out() function:

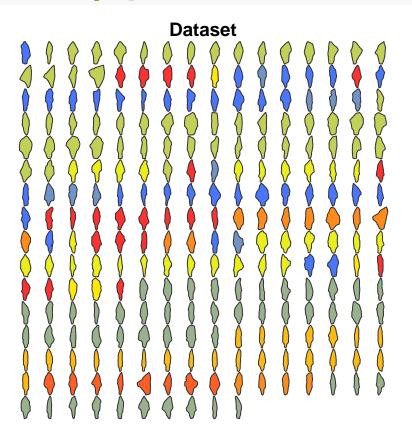
```
shape <- Out(tpsdata$coo, fac = database) # incorporating our database as our factors
shape # call the object</pre>
```

```
## Out (outlines)
     - 250 outlines, 1543 +/- 1370 coords (in $coo)
     - 10 classifiers (in $fac):
##
## # A tibble: 250 x 10
##
        ID Site Context Longitude Latitude Country Archaeological - File_Name
##
     <dbl> <chr> <chr>
                              <dbl>
                                       <dbl> <chr>
                                                     <fct>
                                                                       <chr>
## 1
         1 Balt~ Baltaš~
                               24.0
                                        54.0 Lithua~ Baltic Magdalen~ Bal.1
         2 Baro~ Barouka
                               30.3
                                        53.5 Belarus Grensk
                                                                       Bor.1
## 3
         3 Baro~ Barouka
                                        53.5 Belarus Grensk
                                                                       Bor.3
                               30.3
## 4
         4 Baro~ Barouka
                               30.3
                                        53.5 Belarus Grensk
                                                                       Bor.4
## 5
         5 Baro~ Barouka
                               30.3
                                        53.5 Belarus Grensk
                                                                       Bor.5
         6 Baro~ Barouka
                               30.3
                                        53.5 Belarus Grensk
                                                                       Bor.6
## # ... with 244 more rows, and 2 more variables: Reference <chr>, Notes <chr>
     - also: $1dk
```

## GMM Procedure 2: Outline Visualisation

Now our data is in the R environment, and in the appropriate class, we can examine the outlines. We can first look at all outlines through the Panel() function. Factors can also be coloured in using the fac argument in Panel().

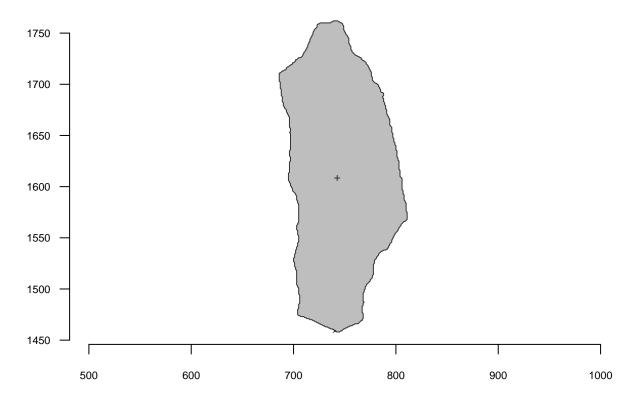
panel(shape, fac = 'Archaeological\_Unit', main = "Dataset")



# 

```
coo_plot(shape[1], col = "grey", main = "Database Artefact #1")
```

# **Database Artefact #1**

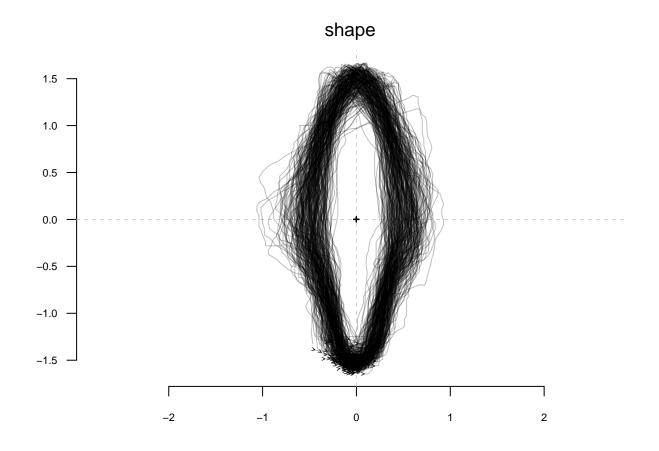


# XXXXXXXXXXXXXXXX

# GMM Procedure 3: Outline Normalisation

```
shape <- coo_center(shape)
shape <- coo_scale(shape)
shape <- coo_close(shape)

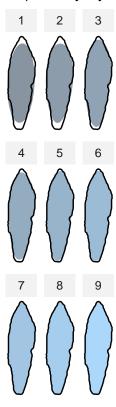
stack(shape, main = "")</pre>
```



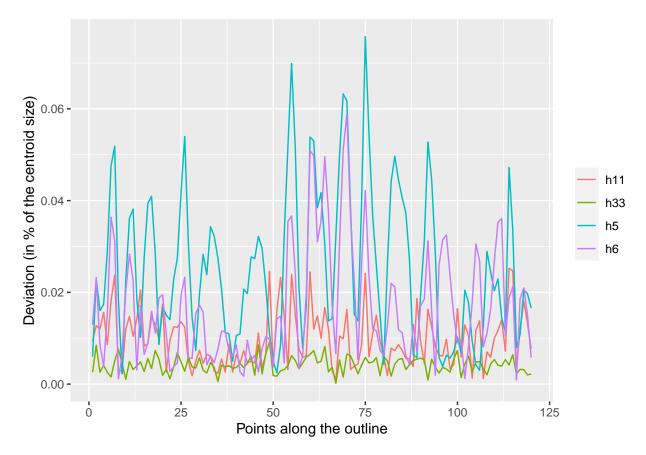
GMM Procedure 4: Elliptic Fourier Transformation

calibrate\_reconstructions\_efourier(shape)

# 50) Chvojnaja



calibrate\_deviations\_efourier(shape)



### XXXXXXXXXXXXXXXXX

```
efashape <- efourier(shape, nb.h = 11, smooth.it = 0, norm = TRUE)
efashape</pre>
```

```
## An OutCoe object [ elliptical Fourier analysis ]
    - $coe: 250 outlines described, 11 harmonics
## # A tibble: 250 x 10
##
        ID Site Context Longitude Latitude Country Archaeological_~ File_Name
     <dbl> <chr> <chr>
                              <dbl>
                                                     <fct>
                                                                       <chr>
##
                                       <dbl> <chr>
## 1
         1 Balt~ Baltaš~
                               24.0
                                        54.0 Lithua~ Baltic Magdalen~ Bal.1
         2 Baro~ Barouka
                               30.3
## 2
                                        53.5 Belarus Grensk
                                                                       Bor.1
                                        53.5 Belarus Grensk
         3 Baro~ Barouka
                               30.3
                                                                       Bor.3
## 4
         4 Baro~ Barouka
                               30.3
                                        53.5 Belarus Grensk
                                                                       Bor.4
                               30.3
## 5
         5 Baro~ Barouka
                                        53.5 Belarus Grensk
                                                                       Bor.5
                               30.3
                                        53.5 Belarus Grensk
                                                                       Bor.6
         6 Baro~ Barouka
## # ... with 244 more rows, and 2 more variables: Reference <chr>, Notes <chr>
```

# GMM Procedure 5: Exploratory Procedure #1: PCA

#### XXXXXXXXXXXXXXXXX

```
pcashape <- PCA(efashape)
PCcontrib(pcashape)</pre>
```

## `prop` not provided. All axes returned

