

1 **Beyond Size: the potential of a geometric morphometric analysis of shape and form for**  
2 **the determination of sex in hand stencils in rock art**

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22

23 **Abstract**

24 Hand stencils are some of the most enduring images in Upper Palaeolithic rock art sites  
25 across the world; the earliest have been dated to over 40 Kya in Sulawesi and 37 Kya in Europe.  
26 The analysis of these marks may permit us to know more about who was involved in the making  
27 the prehistoric images as well as expanding the literature on the evolution of human behaviour.  
28 A number of researchers have previously attempted to identify the sex of the makers of Upper  
29 Palaeolithic hand stencils using methods based on hand size and digit length ratios obtained  
30 from digital or photo-based images of modern reference samples. Most recent analyses report  
31 that it was probably mostly females that produced the majority of prehistoric hand stencils.  
32 Taken together, however, these studies generate contrasting and probably incompatible  
33 interpretations. In this study we critically review where we currently stand with methods of  
34 sexing the makers of hand stencils and the problems for the interpretation of hand markings of  
35 Palaeolithic age. We then present the results of a new method of predicting the sex of  
36 individuals from their hand stencils using a geometric morphometric approach that detects  
37 sexual differences in hand shape and hand form (size and shape). The method has the additional  
38 advantage of being able to detect these differences in both complete, as well as partial hand  
39 stencils. Finally we urge researchers to test this method on other ethnic groups and populations  
40 and consider ways of combining efforts towards a common goal of developing a robust,  
41 predictive methodology based on diverse modern samples before it is applied to Upper  
42 Palaeolithic hand stencils.

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44 Key words: Palaeolithic, cave art, sex identification

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47 **Highlights**

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49 • A method is presented using geometric morphometrics to identify the sex of the makers  
50 of hand stencils using a modern sample

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52 • Using the form of the stencil, we were able to correctly predict sex in over 90% of our  
53 sample

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55 • The most sexually dimorphic area of the hand was the palm, which potentially allows for  
56 the prediction of sex from hand stencils with digits missing.

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58 • We advocate collaboration between research groups in developing methods to assess  
59 the sex of the makers of hand stencils in contemporary populations before applying  
60 methods to Palaeolithic images

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## 63 **1. Introduction**

64 Images of the human hand provide us with some of the earliest, most abundant and most  
65 enduring images in rock art (Pettitt et al., 2014, 2015; García-Diez et al., 2015). They have been  
66 recorded at sites across the Americas, Africa, Arabia, Australia, East and South Asia and Europe  
67 (e.g., Aubert et al., 2014; Clottes, 2010; Chazine, 2005). In some cases hand images are pecked  
68 into the rock (see Clottes, 2010), but the most common forms require the use of paints to create  
69 prints or stencils. Hand prints are made when a hand coated with paint or pigment is pressed  
70 against a surface, leaving a direct image; a stencil occurs when a clean hand is placed directly  
71 against a surface and paint or pigment is applied over the top, such that when the hand is  
72 removed a negative impression of its presence remains (Pettitt et al., 2015). In contrast to  
73 pecked hand images, hand prints and hand stencils necessarily preserve a record of the original  
74 size and shape of a real hand and these images, therefore, can be directly related to an/the  
75 individual actively involved in the prehistoric image-making process.

76

77 Hand images from sites around the world are likely to span many thousands of years in age, with  
78 some examples of images having been produced relatively recently (in Australia, Africa) and  
79 others much longer ago (Aubert et al., 2014; Pettitt et al. 2015). Possibly the oldest surviving  
80 corpus of images comes from Europe, where most hand images are likely to date before 20,000  
81 years ago (Snow, 2013). In Western Europe, there are thirty-eight sites of accepted Palaeolithic  
82 age with preserved images of human hands on their walls; nearly 1000 images in total (Groenen,  
83 2011; Snow, 2006). The number of images varies greatly between sites. Most sites have a small  
84 number of images, a few have tens of such images (e.g., El Castillo, Maltraveiso, Rouffignac), and  
85 a very few have hundreds of hand images (e.g., Gargas, Chauvet and Cosquer) (Pettitt et al.  
86 2015). In caves with the largest number of hand images, many of these images are partial, with  
87 missing digits or digits that are considerably shorter than they must have been (Leroi-Gouran  
88 and Michelson, 1986).

89

90 There is no generally accepted explanation for the making of these images in Palaeolithic times.  
91 Early ideas have included enjoyment, hunting magic, accidental marking, and some form of  
92 visual plea to the heavens (see Ucko and Rosenfeld, 1967), whilst more recently they have been  
93 linked to shamanistic practices (Lewis-Williams, 2002; Clottes and Lewis-Williams, 1996) or  
94 markings made by adolescent males perhaps during rites of passage (Guthrie, 2005). Images of  
95 partial hands have been interpreted as evidence of disease or mutilation (Janssens, 1957, though  
96 see Hooper, 1980; Wildgoose et al., 1982 for a re-assessment) or as forms of sign language  
97 (Leroi-Gourhan, 1967; Pradel, 1975, though see Rouillon, 2006 for a counter argument). Finally,  
98 a recent study has shown that hand images appear to have been deliberately placed in

99 association with specific characteristics of the walls or geological features indicating that the  
100 topography of the cave walls may have been important in making these images meaningful to  
101 contemporary populations (Pettitt et al., 2014).

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103 Ethnographic accounts, however, suggest that hand images were produced within hunter-  
104 gatherer societies in the context of a range of different activities. Using the Australian Aboriginal  
105 literature, Moore (1979) notes that hand images were made for the purposes of memorialisation  
106 of a person or a visit, to mark the number and direction of persons passing a place, as the  
107 signature of an artist, as a form of message to spirit ancestors and so on. Gunn (2006), also  
108 reviewing the Australian literature, adds that hand images might be made to mark a visit to a  
109 place, or to make a claim to an area of land. From literature describing groups in the South-  
110 western Cape of Southern Africa, Manhire (1998) suggests that hand stencils might have been  
111 made during curing ceremonies, whilst the smaller sub-adult-size hand stencils might have been  
112 made as part of initiation ceremonies. It is clear from the ethnographic literature, therefore, that  
113 we should expect hand images in mobile societies to have been made by both men and women,  
114 and by individuals of all ages according to the different places and activities that formed the  
115 context for image-making. Importantly, although the ethnographic literature highlights many  
116 different potential meanings and purposes for these images, knowledge of who was present  
117 might allow different interpretations to be advanced or excluded. The correct identification of  
118 the sex and age of hand images, therefore, is a necessary first step to understanding this most  
119 common of Palaeolithic image forms.

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## 121 **2. The identification of sex in hand images using size data**

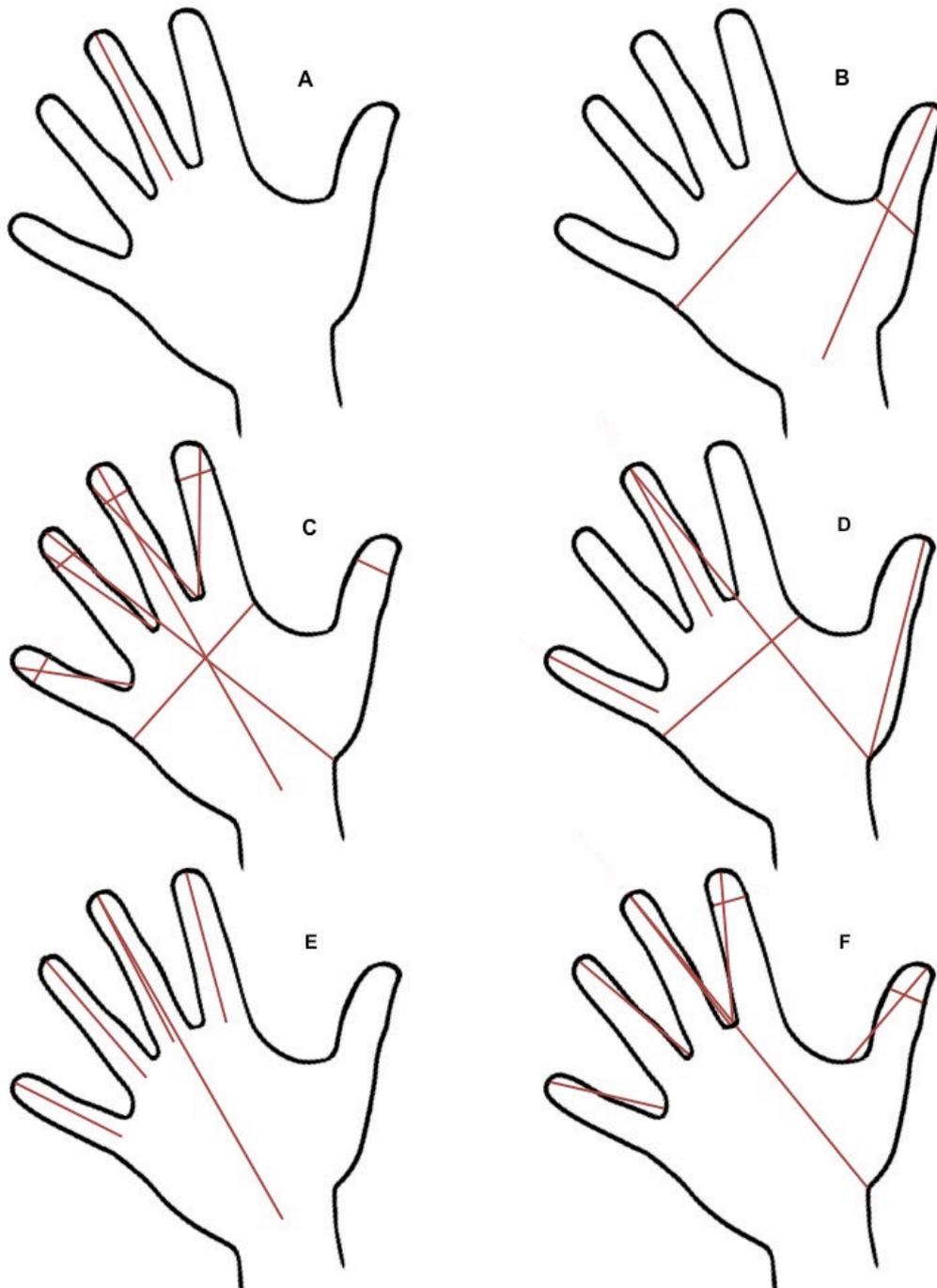
122 In recent years there have been several studies that have attempted to identify the sex, and  
123 sometimes age, of hands preserved as stencils in caves or open rock art sites by comparing size  
124 data extracted from the images (e.g., Groenen, 1988; Gunn, 2006; Guthrie, 2005; Mackie, 2015;  
125 Snow, 2006, 2013; see Fig 1; Table 1). Some of these studies have also used digit ratios that have  
126 been shown to be a predictor of sex in some circumstances (Kanchan et al., 2008, but see  
127 Voracek, 2009). Researchers have then made comparisons between the dimensions from  
128 prehistoric images and the data collected for the same measures from a series of contemporary  
129 populations (Table 1). Some of these attempts have, however, produced quite contradictory  
130 results that necessarily lead to different possible interpretations of the meaning or purpose of  
131 the original images. For example, in his examination of hand stencil images from a number of  
132 European cave art sites Guthrie (2005) argues that most hand images are those of males with  
133 adolescents in the majority; however, Snow (2006, 2013), examining stencils from some of the  
134 very same sites as Guthrie, primarily identifies females. Both these studies base their analyses

135 on robust comparisons with a large reference sample of modern hand data taken from different  
136 populations that they argue are good analogues (on the basis of genetic continuity) for  
137 populations living in Western Europe at the time when hand images were made.

138

139 Figure 1. Size dimensions used in previous studies (also see Table 1); A) Flood, 1987; B)  
140 Groenen, 1988; C) Guthrie, 2005; D) Gunn, 2006; E) Snow, 2006, 2013; F) Mackie, 2015.

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142

143 Table 1. Summary of previous studies that have attempted to sex the makers of ancient hand stencils.

144

Authors	Prehistoric site	Reference sample (RS)	Method	Interpretation of prehistoric hand stencils	
<b>Flood 1987</b>	Koolburra Plateau, Cape York, Australia	Modern Aboriginal sample (Abbie, 1975).	Flood used middle finger length from prehistoric stencils to devise 5 size classes of hand size. These measurements were then compared to the RS.	It was concluded that it is not possible to use this method to assign sex or age to the makers of hand stencils. However, she proposed that very large hand stencils were likely to be male.	Large stencils = ?♂
<b>Groenen 1988</b>	Gargas and de Tibiran Cave, Hautes-Pyrenees, France	The hands of 152 males and females aged from 19-13 from Brussels, Belgium.	4 measures of hand size for 55 Palaeolithic hand stencils were compared to the RS	Clear visual overlap in size dimensions between the modern sample and the prehistoric hands indicated individuals of both sexes and of broad range of ages took part in creating hand stencils in Gargas and de Tibiran Caves.	♂♀
<b>McDonald 1995</b>	Great Makeral and Yengo 1, Sydney Basin, Australia	Modern Aboriginal sample (Abbie, 1975).	McDonald compared hand size of prehistoric stencils (measurements were not described in the article) and compared the RS.	It was concluded that discerning gender (sex) from hand stencils would be difficult as male and female hands overlapped in size by 1 cm. However, McDonald proposed that large hand stencils were likely to be male, especially if these were stencilled with male-related tools such as boomerangs She speculated that hands with amputated 5th digits were likely to be female as this mutilation is a cultural indicator restricted to females in some local Aboriginal groups.	?♂♀, using other features
<b>Guthrie 2005</b>	Unspecified set of Palaeolithic cave sites in Europe	700 hands of males and females of west European descent sampled at yearly intervals from 5 through to 19.	Guthrie analysed 201 prehistoric hand stencils using univariate analyses based upon 12 linear measurements of the RS.	Guthrie was able to assess that 169 of the prehistoric hand stencils were male hands and 32 were female. Guthrie argues that the majority of these were the stencils of adolescent males.	♂♀, mostly adolescent males

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147 Table 1 continued.

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Authors	Prehistoric site	Reference sample (RS)	Method	Interpretation of prehistoric hand stencils	
Gunn 2006	Kulpi Mara, Central Australia and Reedy's Rockhole and Poona shelter, Murchison region of south-west Western Australia	Modern Aboriginal sample	Gunn carried out an experimental study on a modern sample of hand stencils and the hands that had produced them (sample size unknown). All the measurements taken from the hand stencils were larger than the real hands; except middle finger length, which tended to be smaller due to bleeding of the pigment. Nevertheless he advocated using middle finger length from stencils when interpreting data in relation to sex.	Gunn attempted to apply the measurements to hand stencils from two rock art sites in Australia (Kulpi Mara = 53 stencils; Reedy's Rockhole and Poona shelter = 92 stencils). However, he concluded that he was unable to assess sex or age from hand stencils with any degree of certainty.	?♂♀
Snow 2006, 2013	Snow 2006; 3 Palaeolithic hand stencils each from 3 different French cave sites (Abri du Poisson, Les Combarelles, Font de Gaume), plus 3 stencils from a replica of Pech-Merle Cave. Snow 2013; 32 hand stencils from 8 caves in France and Spain, including the caves from the 2006 study.	222 scanned hands from 111 males (n=54) and females (n=57) of Northern European descent.	Snow's analysis is based on five hand measures from individuals in the RS. He combined two approaches, firstly predictive formulae based on hand length and digit lengths (digits 2 and 5) were taken from 4 repeated scans from modern-day individuals' left and right hands. This enabled statistical constants to be established which were placed within an algorithm to predict sex from hand/digit measurements of males and females (79% accuracy). Comparisons of digit ratios (2D:4D) between the Palaeolithic stencils and modern scanned hands served as an additional discriminator. However, the accuracy for digit ratio was only 59%.	In the 2006 study, 4 stencils were identified as female and 2 as male. In the 2013 analysis of the expanded sample, 23 of the stencils were identified as female and 9 as male. In his studies, Snow found that sexual dimorphism in hands appeared to have been greater in the Palaeolithic.	♂♀, mostly females

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151 Table 2 continued.

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Authors	Prehistoric site	Reference sample (RS)	Method	Interpretation of prehistoric hand stencils	
<b>Chazine &amp; Noury 2006</b>	Gua Masri II Cave, East Kalimantan, Borneo	The RS and the hand measurements upon which the software algorithms are based, are not described in the article. Values for digit ratios (2D:4D) are based upon a sample from Liverpool, UK (Manning, 1998).	A digital imaging software called Kalimain© (Noury, 2005) was used to sex the makers of prehistoric hand stencils. The method appears to use software that analyses both hand size and digit ratio to differentiate sex.	Out of 140 hands, only a quarter were deemed suitable for the application of the sexing software; 16 were identified as female, 17 as male. 2 were unable to be assessed using hand size, although 2D:4D (Liverpool RS) suggested the hands were male.	♂♀
<b>Wang et al. 2010</b>	Snow 2006; 3 Palaeolithic hand stencils each from 3 different French cave sites (Abri du Poisson, Les Combarelles, Font de Gaume), plus 3 stencils from a replica of Pech-Merle Cave.	Scanned hand images (17 males; 17 females; Snow, 2006) and 107 photographs (51 male and 56 female) of handprints in concrete of famous people taken from the Chinese Theatre in Hollywood, Los Angeles, USA	Wang and co-workers applied recognition software to a set of hand scans from contemporary people. The software used a size-invariant technique to analyse the images of known sex to create an outline of the hand and segments. 125 hand scans were used in 10 rounds of cross validation to train the software after 50 were randomly selected and kept as the validation dataset. Support Vector Machine was then trained to recognize sex differences in the hands. Accuracy of 75% was achieved.	When the method was applied to images of Palaeolithic hand stencils (n=6; Snow, 2006), two of the cave hand stencils previously identified as female by Snow (2006) were identified as male. Their results (based on the sample from Snow 2006) also confirmed Snow's proposal that hand sexual dimorphism was more pronounced in the past, based on the tendency for the Palaeolithic hand stencil data to cluster around the extremes of the scale-continuum based on modern hand scans.	♂♀
<b>Pettitt et al. 2014</b>	6 hand stencils from El Castillio and La Garma Caves, Cantabria, Spain	Snow 2006	Snow 2006	Snow's (2006) method was applied to 6 hand stencils; 4 were identified as female and 2 as male.	♂♀

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155 Table 1 continued.

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Authors	Prehistoric site	Reference sample (RS)	Method	Interpretation of prehistoric hand stencils	
<b>Mackie 2015</b>	3 prehistoric Indian rock art sites(48J03; 48J04; 48J06) located in Johnson County, Wyoming, USA	271 hand stencils of modern males (n=93) and females (n=178). Nearly half (46%) were aged 18 or younger.	18 points were mapped on to each digitally scanned stencil, which helped to guide linear measurements of the hand. Based upon these measurements a series of equations were formulated. A 75% level of accuracy was reported for the sexing equations. Using close range photogrammetry, measurements from 78 prehistoric hand stencils were analysed, but only 25 were complete enough to be sexed.	7 prehistoric stencils were identified as female, 13 as male and 5 were indeterminate. It was concluded that individuals of both sexes and a broad range of ages took part in creating hand stencils at these locations. 2D:4D data did not suggest there were higher levels of sexual dimorphism in this prehistoric population.	♂♀

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170 A major problem with these studies is the reliance on size data to identify sex. The use of size  
171 data alone is made much more difficult by the fact that even though the average size of adult  
172 male hands is greater than female hands, within any population there is a varying degree of  
173 overlap in size between the two (Galeta et al., 2014; Gunn, 2006; Králík et al., 2014).  
174 Furthermore this overlap exists, not only in the comparison of adult hands, but also between age  
175 cohorts of different sexes due to the different timings of male and female growth spurts (Guthrie,  
176 2005). This general problem of hand size overlap between sexes has already been recognised for  
177 the use of size data alone to sex hand images (Flood, 1987; Galeta et al., 2014; Gunn, 2006;  
178 McDonald, 1995), as well as between sexes and across populations in the use of digit ratios for  
179 the same purpose (Nelson et al., 2006).

180

181 The use of size data is not the only problem with published archaeological studies. Whilst noting  
182 that Guthrie and Snow came to strikingly different conclusions about the sex most commonly  
183 represented in images in samples from the same prehistoric sites, we remain unable to evaluate  
184 their interpretations since both Snow and Guthrie, and most other analysts, use slightly different  
185 measurements (Fig. 1). Only Snow has identified the specific stencils that he examined so that in  
186 future we might be able to evaluate different methods when applied to the same original image.  
187 As noted above, many hand images, especially from caves with the largest collections, are partial  
188 representations, some with missing digits and many with missing basal features of the palm, and  
189 these images cannot be used in some approaches. A further difficulty has been highlighted by  
190 Gunn (2006) who has shown that different stencil images made using the same hand can differ  
191 in their size measures by up to 5mm due to the localised variations in the way the paint covered  
192 the hand.

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194 Such archaeological approaches have to be understood in the context of biological variation in  
195 the human hand. Elsewhere hand outlines have been utilised in biometric studies for purposes  
196 of individuation and sex estimation in a forensic setting. In particular, shape variation in the  
197 hand has been classified using the length and width of the fingers, their curvatures, the relative  
198 location of these features, or the relative placement of the palm in relation to the digits; some of  
199 these classifiers have relied solely on geometric features based on linear chord distances, while  
200 others use hand silhouettes with or without geometric features, in an attempt to attribute a  
201 specific hand pattern or outline to an individual. Most methods require the capture and analysis  
202 of a significant number of chord distances or morphological features, ranging from a minimum  
203 of 16 basic descriptors to as many as 160 features often comprised of many tens of thousands of  
204 individual points. Whilst such methods are required in order to individuate a hand pattern as  
205 part of biometric security systems, such data-heavy methods are not required in order to

206 attribute hand shape to biological sex, but a robust biologically-relevant statistical method must  
207 be applied which allows for both size and shape of hand morphology to be assessed.

208

### 209 **3. A new approach to the identification of sex from hand images**

210 It is clear that hand images potentially offer great opportunities for the assessment of the sex  
211 and age of individuals present at sites during moments of artistic creation. In order to realise the  
212 full potential of these images, however, we need to be able to assess the sex of the individual  
213 using methods that are not reliant on size data alone. Methods that can attribute sex in cases of  
214 partial images would also be desirable, and finally we need to use a set of data collected against a  
215 clearly defined set of landmark points on a hand image so that conflicting interpretations can be  
216 independently evaluated. If it proves possible to assess sex without reliance on size alone, it may  
217 then be possible to use relative size within a defined sex grouping to assess age and this will  
218 make it more possible to offer interpretations for activities that led to creation of these images.

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220 The research presented here is the first attempt to utilise geometric morphometric techniques  
221 to quantify shape variation in the human hand, and consequently addresses the potential of this  
222 anatomical region for sex estimation. We evaluate the success of shape analysis in a large  
223 comparative collection of hand stencils based on data for the position of 19 landmark points on  
224 the hand. Geometric morphometrics (hereafter GMM) is the statistical analysis of form based on  
225 Cartesian landmark coordinates (Mitteroecker and Gunz 2009). Whilst the fundamental  
226 underpinnings of the discipline date back to the early 20th Century, it is only recently that  
227 modern computational and technological advances have allowed for the acquisition, processing,  
228 and analysis of shape variables that retain all of the geometric information contained within  
229 biological data. GMM techniques generally involve the capture of homologous landmarks, which  
230 can be defined as precise locations on biological specimens that hold some functional, structural,  
231 developmental, or evolutionary significance and are directly comparable between specimens.  
232 The locations of homologues can be recorded as two- or three-dimensional co-ordinates, which  
233 result in a spatial framework of the relative positions of the chosen landmarks in Euclidean  
234 shape space. However, whilst coordinate data retain the full geometry of the landmarks (and  
235 hence shape), they have proved more difficult to compare statistically than conventional linear  
236 dimensions, primarily for reasons of registration between configurations. To overcome this,  
237 GMM analyses allow for the extraction of shape differences between configurations with  
238 residual shape being defined as the geometric properties of an object invariant to orientation,  
239 location, and scale. Our analysis is based on a study of more than 130 hand stencil images  
240 collected from a population of both male and female adults. The stencil images were produced  
241 and recorded in a standard manner to minimise error that might relate to the technology of

242 image-making. The landmark points used include points on the digits as well as the palm that  
243 can be located clearly in terms of the anatomy of the human hand. In our analysis we have also  
244 examined whether it is possible to differentiate sex in cases where digit data is missing by using  
245 the palmar surface only in sex estimation.

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247 The aim of this biometric study was to develop a methodologically and statistically robust  
248 means for investigating the sex-based form of the human hand by studying the extent of  
249 morphological variation using true hand geometry within a sample population using a small  
250 suite of retained geometric landmarks. We suggest that this approach may have similar or  
251 greater discriminating power compared to other published methods whilst requiring fewer  
252 captured features in order to identify or verify sex from hand shape. Results indicate that shape,  
253 or shape and size, effectively enables the attribution of sex to a statistically significant degree,  
254 avoiding some of the problems within modern studies that rely on size data alone to identify  
255 sex. Furthermore, this study enables us to utilise shape analysis for sexing individuals even in  
256 cases where the images of hands are partial (i.e., with partial or missing digits), opening up the  
257 possibility of using a much bigger corpus of hand images from the largest sites.

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## 259 **4. Materials and methods**

### 260 **4.1. Permission and protocol**

261 The research protocol was reviewed and the University of Liverpool's Committee on Research  
262 Ethics granted permission for the study. Potential participants were given an information sheet  
263 about the aims of the study, what they had to do and their rights to withdraw their information  
264 at any point in the data collection period. The information sheet clearly stated that people with  
265 injuries to the hands or fingers or disfigurements to the hands or fingers were excluded from  
266 the study. People known to have had allergic or skin reactions to water-based poster paints  
267 were also excluded.

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### 269 **4.2. Sample**

270 Participants were recruited at the University of Liverpool (UK) and filled out a questions sheet  
271 asking their sex, age, height and ethnic group (Ethnic groups was ascertained using the standard  
272 classification of ethnicity used by the University of Liverpool's Human Resources Department).  
273 As the majority of the sample was Caucasian (94.7%); we classified individuals as Caucasian or  
274 non-Caucasian.

275

### 276 **4.3. Data collection**

#### 277 **4.3.1. Stencils**

278 Stencils were collected from 132 individuals (the left and right hands of 53 males; 79 females).  
279 One hundred and twenty four participants were Caucasian and 7 were non-Caucasian (Asian);  
280 one individual did not reveal their ethnic origin. An A4 sheet of 80gsm cartridge paper was  
281 taped to the laboratory wall and participants placed their hands flat against the paper. Hands  
282 were sprayed with a diluted solution of poster paint (one part paint to three parts water) using  
283 a Wolf Powerplus electric spray gun. The spray gun was maintained at the distance of about 0.5  
284 metres from the hand/wall; positioned posterior and lateral to just the participant's elbow.  
285 Hands were stencilled with the fingers open and both the left and the right hands of each  
286 participant were stencilled (one after the other) using the same process. Stencils were left to air  
287 dry.

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#### 289 **4.3.2. Landmarks**

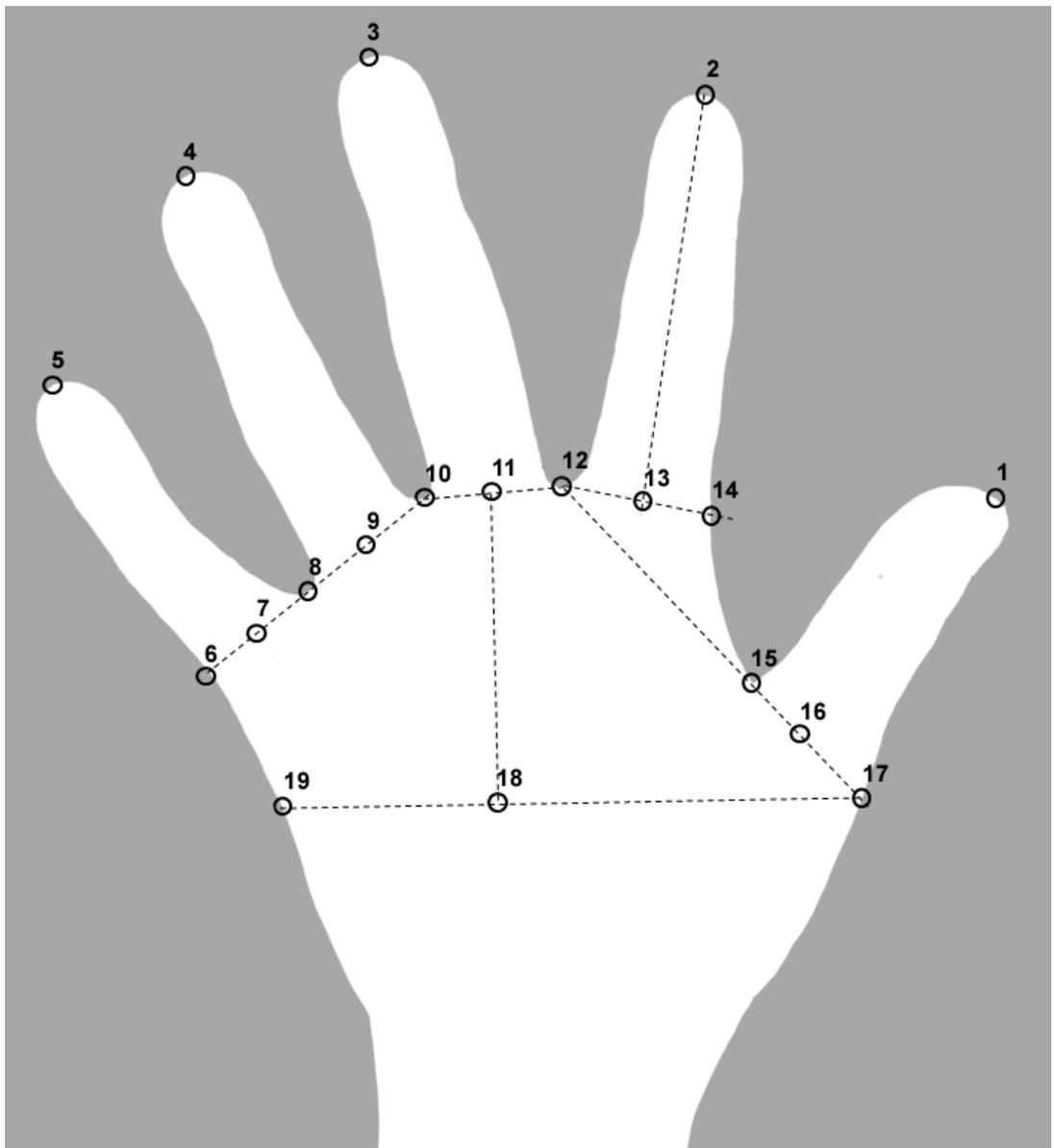
290 Standardised digital images were captured of both left and right hands by scanning the paper-  
291 imaged stencils using a Packard Bell Diamond 1200 scanner and were saved in a jpeg format  
292 (300 dpi). A 10 cm scale was placed on the scanner. Nineteen two-dimensional landmarks were  
293 recovered from digital image capture followed by landmark acquisition. Each scan was loaded  
294 into TPSDig2 (Rolf, 2008) and 19 type II and III landmarks (following the definitions of  
295 Bookstein, 1991) were applied to each stencil (digital) images (see Fig. 2; Table 2) using an  
296 adaptation of an existing biometric protocol (Randolph-Quinney et al., 2010). The landmarks  
297 were chosen to reflect the position and proportions of the phalangeal rays with respect to the  
298 metacarpus and palmar base. Landmarks were also selected due to their repeatability,  
299 permanence, and ability to describe the proportions and overall morphology of the hand, and  
300 included the tips of, and webbing between, the five phalangeal rays. Landmarks (X-Y  
301 coordinates) were plotted and saved in the same order for each stencil (1-19; Fig. 2). Type II  
302 landmarks are mathematical points whose claimed homology is supported only by geometric  
303 evidence i.e., the sharpest curvature of a tooth or the tip of a digit. Type III landmarks have at  
304 least one deficient coordinate, for instance the geometric minima or maxima, such as either end  
305 of the longest diameter, or the bottom or a concavity (i.e., between the web space of the digits).  
306 Both types, though less geometrically efficient than Type I landmarks, carry significant  
307 information regarding homology, and are thus biologically highly-relevant as recognised in  
308 published studies.

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311 **Figure 2.** Landmarks for each stencil (see Table 2).

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325 **Table 2.** Description of the anatomical positions of the 19 Type II and Type II landmarks

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Landmark	Type	Anatomical position
1	II	Most distal point of the tip of digit 1 (thumb)
2	II	Most distal point of the tip of digit 2 (index finger)
3	II	Most distal point of the tip of digit 3 (middle finger)
4	II	Most distal point of the tip of digit 4 (ring finger)
5	II	Most distal point of the tip of digit 5 (little finger)
6	III	The proximo-medial point of digit 5 on the medial edge of the hand at the intersection with the palmer digital crease. Established by a line straight line passing between the lowest point of the curve at the base of the fingers (between digits 3 and 4 and 4 and 5) out to medial edge of the hand
7	III	A point on the palmer digital crease at the base of digit 5 (little finger) that is centrally placed, in the midline, directly opposite to landmark 5
8	III	The most superior point of the curvature (webbing) between digits 4 and 5.
9	III	A point on the palmer digital crease at the base of digit 4 (ring finger) that is centrally placed, in the midline, directly opposite to landmark 4
10	III	The most superior point of the curvature (webbing) between digits 3 and 4
11	III	A point on the palmer digital crease at the base of digit 3 (middle finger) that is centrally placed, in the midline, directly opposite to landmark 3
12	III	The most superior point of the curvature (webbing) between digits 2 and 3
13	III	A point on the palmer digital crease at the base of digit 2 (index finger) that is centrally placed, in the midline, directly opposite to landmark 2
14	III	The most proximal point of digit 2 on the lateral edge of the hand at the intersection with the palmer digital crease. Established by a line straight line passing between the lowest point of the curve at the base of the fingers (between digits 3 and 2) out to medial edge of the hand which is perpendicular to midline passing between landmark 2 and 13
15	III	The most superior point of the curvature (webbing) between digits 1 and 2
16	III	A point at the base of digit 1 (thumb) that is centrally placed, in the midline, directly opposite to landmark 1. The landmark is situated on a straight line passing from landmark 12, through landmark 15 out to the lateral edge of the hand.
17	III	The point where a straight line passing from landmark 12, through landmark 15 exits the lateral edge of the hand
18	III	A point on the central palm, directly opposite landmark 11, in the midline of the hand. Perpendicular to a line passing across the palm from landmark 17 to the medial edge of the hand
19	III	A point on the medial edge of the hand directly opposite landmark 17 in the transverse plane

327

#### 328 4.4. Geometric Morphometric Analysis

329 The resulting two-dimensional coordinate configurations ( $n = 264$ ) were subjected to a  
330 generalised Procrustes analysis (GPA) with full-tangent space projection; this was undertaken  
331 using the *MorphoJ* package, with additional statistical analyses undertaken using *IBM SPSS v20*.  
332 Procrustes superimposition (GPA) ensures that sized-based effects are removed and only  
333 shaped-based differences remain; the influence of size on shape can subsequently be  
334 investigated by analysing the correlation between the extracted size residual (configuration  
335 centroid size) and the remaining shape residuals (in this study we use principal component  
336 loadings, although Procrustes coordinates can equally be applied). The following post-hoc tests  
337 were applied:

338 (i) Following GPA the configurations were subjected to a series of principal component  
339 analyses (PCA) to explore the relationships between patterns of sexual dimorphism  
340 between male and female hands. In this study the shape differences revealed by PCA  
341 are visualised by using outline plots between male and female mean shape  
342 configurations.

343 (ii) The utility of the resulting shape variables as an aid in the assessment of biological sex  
344 was undertaken using Fisher's linear discriminant analysis based on the residual  
345 shape variables. Shape variables were converted into principal component scores,  
346 which helps reduce the dimensionality of the data by analysing a limited number of  
347 PC scores from the cases instead of the original data; thus only relatively large group  
348 mean differences will be represented by the retained lower order PCs, leaving a  
349 proportion of the variance unaccounted for. Classification using Fisher's linear  
350 discriminant analysis (LDA) based on  $p$  PC scores (where  $p$  is the number of PCs  
351 retained following step-wise entry); Leave-one-out cross validation was applied to  
352 assess performance of the classification. Significance of sexual dimorphism in shape  
353 was assessed by Procrustes ANOVA on group means (Klingenberg et al., 2002).

354 (iii) The following GPA classifications were based on three iterations to separate the effects  
355 of size from shape: (1) size-only using log of configuration centroid (centroid size  
356 can be used as a biologically meaningful expression of the overall scale of the  
357 landmark configuration, and thus of the relative sizes of individual configurations);  
358 (2) size-free using  $p$  PC scores with PC1 excluded (the first principal component is  
359 generally considered to carry a residual size-based component); and (3) analysis of  
360 form using centroid size, and  $p$  PC scores including PC1.

361 (iv) Partial Least Squares analysis (PLS) was performed in *MorphoJ* (Klingenberg, 2008)  
362 within a single configuration to test for structural modularity (Klingenberg and  
363 Zaklan, 2000). PLS examines covariation between two or more sets of variables, and

364 identifies features of shape that most strongly covary between blocks; this technique  
365 is increasingly being used for studying patterns of integration of parts within single  
366 configurations of landmarks thus allowing for an assessment of anatomical or  
367 structural modularity. In the present study we use an assessment of modularity to  
368 investigate whether anatomical regions (specifically the digital rays and the palmar  
369 surface) provide better assessment of biological sex if treated as isolated structural  
370 units, or if they improve sex assessment when combined into a single anatomical  
371 module.

372 (v) Stepwise re-sampling and re-analysis of dataset was applied following PLS to optimise  
373 shape classification criteria, with size-based, size-free and form-based analyses  
374 reapplied to anatomical modular blocks.

375 (vi) Measurement error in landmark acquisition was assessed by digitising five individual  
376 configurations five times on five separate occasions, and then subjecting them to  
377 GPA and PCA. Measurement error was assessed visually using the method of  
378 O'Higgins and Jones (1998) by comparing variation within the repeat runs against  
379 the total configuration sample. Procrustes ANOVA based on Procrustes distance was  
380 subsequently used to assess the relative magnitude of error from repeat  
381 measurements.

382

## 383 **5. Results**

384

### 385 **5.1. Sample**

386 Participant ages ranged between 17 and 70 years (SD=11.86). There were no significant  
387 differences between male age (mean age=33.11, SD=12.07) and female age (mean age=28.92,  
388 SD=11.52); ( $F_{1,130}=4.04$ ,  $p=0.05$ ). Height ranged between 152 and 195cm (SD=9.48). Males were  
389 significantly taller (mean height=176.84 cm; SD=8.53) than females (mean height=165.52;  
390 SD=7.13);  $F_{1,130}=68.53$ ,  $p<0.001$ .

391

### 392 **5.2. Stencil analysis – shape and form**

#### 393 **5.2.1. Assessment of measurement error**

394 Error testing of repeated runs indicated no significant difference ( $p=0.884$ ) and therefore low  
395 measurement error. The repeat specimens clustered closely together on the principal axes  
396 relative to the variation between individuals, suggesting measurement error was small and the  
397 dispersal isotropic in nature.

398

#### 399 **5.2.2. Principal Components Analysis (PCA)**

400 Principal components analysis of the total sample yielded 34 principal components with non-  
 401 zero variability ( $2k-4$  shape variables, where  $k$  is the number of landmarks). The first three  
 402 principal components together accounted for 66.98% of variation, with the first ten factors  
 403 accounting for around 95% of shape variation in the sample (Table 3). Procrustes ANOVA of  
 404 shape residuals indicated significant size and shape difference between the sexes (centroid only  
 405  $F=165$ ,  $p < 0.0001$ ; shape  $F=5.27$ ,  $p < 0.0001$ ). Global shape variation is expressed in Fig. 3 by the  
 406 visualisation of principal components 1 and 2; the wire-frames indicate sex-based differences.  
 407 Shape variation within PC1 (which explains 29.75% of total variation) was dominated by  
 408 relatively shorter palms in females, in conjunction with medial displacement of the root and tip  
 409 of the thumb (Landmarks[LM] 1, 15 and 17), and lateral displacement of the fifth phalanx (LM 5  
 410 and 6) – the residual size component of PC1 confirming that males have relatively larger and  
 411 broader palms than females are expected. PC2 on the other hand (24.28% of variation) was  
 412 dominated by relative narrowing and lengthening of the palm in females when corrected for  
 413 size, and with concomitant narrowing of the phalangeal rays, compared to the male mean shape,  
 414 the overall shape being more slender.

415

416 **Table 3.** First ten principal component loadings showing eigenvalues and percentage of  
 417 variation expressed

418

PC	Eigenvalue	% Variance	Cum. % Variance
1	0.0018435	29.75	29.75
2	0.00150459	24.28	54.03
3	0.00080262	12.95	66.98
4	0.00045589	7.36	74.34
5	0.00034764	5.61	79.95
6	0.00025635	4.14	84.08
7	0.00022347	3.61	87.69
8	0.00017236	2.78	90.47
9	0.00014614	2.36	92.83
10	0.00009352	1.51	94.34

419

420

### 421 5.2.3. Classification of overall hand morphology based on size, shape and then form

422 The utility of the resulting shape variables as an aid in assessment of sex was undertaken using  
 423 Fisher's linear discrimination (DFA) based on PC scores (analyses undertaken with and without

424 size included), with reliability of classification based on leave-one-out validation with  
 425 permutation test for significance. Three iterations were undertaken: DFA using centroid only,  
 426 DFA using *p* PC scores (PCs 3, 5 and 7 were retained following step-wise inclusion) to assess  
 427 using shape, and DFA using size and shape variables (Log of configuration centroids, and *p* PC  
 428 scores [PCs 1, 2, 3, 5, 7 and 8]). The results are displayed in Table 4, including the accuracy of  
 429 classification divided by sex.

430

431 **Table 4.** Cross-validation results based on complete and re-sampled landmark sets indicating  
 432 classification based on (centroid) size only, shape only and shape plus size (PC scores and log of  
 433 centroid size). Table indicates optimal re-sampling results only.

434

	Predictions utilising size			Predictions utilising shape			Predictions utilising form (size & shape)		
	♂	♀	♂♀	♂	♀	♂♀	♂	♀	♂♀
All 19 - landmarks	76.4	86.1	82.6%	58.5	81.0	72.0%	87.7	91.8	90.2%
Digits 10 - landmarks	76.4	86.1	82.2%	55.7	77.2	68.6%	80.2	90.5	88.4%
Palm - 9 landmarks	76.4	86.1	82.2%	53.8	82.3	70.8%	87.7	93.7	91.3%

435

436

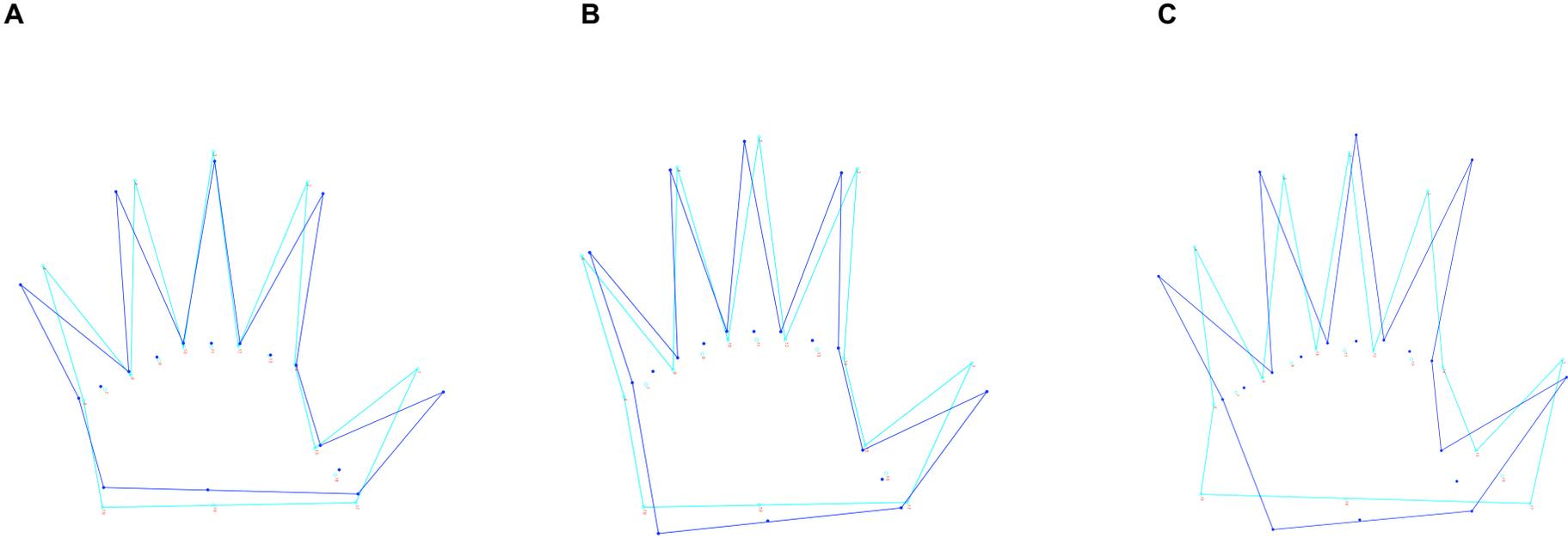
437 Cross-validation of the results indicated that 82.6% of hand shape cases were correctly  
 438 classified with respect to sex using size alone, with a reduced accuracy when size-based proxies  
 439 were removed from the discrimination (72.0%). Greatest accuracy was achieved using analysis  
 440 of form (size and shape) with 90.2% of cases correctly classified. In general females were  
 441 correctly classified in more cases than males across all three DFA iterations, achieving a  
 442 maximum accuracy of 91.8% in DFA based on form. A purely shape-based DFA was notably  
 443 unsuccessful at predicting males based on shape alone, with a classification accuracy of 58.5%  
 444 being little better than random. The principal discriminating axis of male and female variation  
 445 displays a similar pattern of shape variation as the first Principal Component (PC1) from the  
 446 global (total population) sample (see Fig. 3c), with the specific pattern of dimorphism primarily  
 447 expressed through lower order shape variables; in particular male hands are differentiated  
 448 from female hands through palm width relative to finger length. This is expressed as relative  
 449 disto-lateral displacement of the tip of the thumb (Landmark [LM] 1), with supero-lateral  
 450 placement of the base, and relatively narrower and longer, more slender palms in females.

451 **Figure 3.** Visualisation of shape variation for principal components 1 (Fig 3A) and 2 (Fig 3B) for full landmark set (k 19). The wire frames represent  
452 the consensus (mean) shape for each sex, with females in dark blue, and males in cyan. Fig 3C shows the sex-based differences between the two  
453 consensus shapes following discrimination function analysis.

454

455

456



### 457 **5.2.5. Partial Least Squares (PLS) analysis to test for structural modularity**

458 Following DFA a 2-block PLS was applied. PLS examines covariation between two or more sets  
459 of variables, and identifies features of shape that most strongly covary between blocks allowing  
460 for an assessment of modularity. Landmarks were sub-divided between digital (LM 1-5, 7, 9, 11,  
461 13 & 16) and palmar landmarks (LM 6, 8, 10, 12, 14, 15, 17-19). PLS produced an RV coefficient  
462 (the measure of covariance) of 0.361; an RV of 1 implies that one set of variables can be  
463 obtained from the other set by rigid rotation and/or reflection. An RV of 0.361 indicates a poor  
464 degree of association between blocks (implying the variables are largely uncorrelated), and  
465 hence a low degree of modularity and morphological integration between the morphology of the  
466 digits and the palm.

467

### 468 **5.2.6. Stepwise re-sampling and re-analysis of dataset to optimise classification using** 469 **shape then form**

470 To investigate this further, we performed a series of stepwise exclusion tests removing 10% of  
471 landmarks at each stage. Reanalysed data was based on iterations of dependent (both blocks)  
472 and independent units (single blocks). This produced an optimum classification based on  $k = 10$   
473 landmarks of the digits and  $k = 9$  landmarks of the palm. Reanalysis (PCA and DFA) of palm and  
474 digits showed that the digital landmarks performed poorly based on shape (68.6%), while the  
475 palmer landmarks performed almost as well as the original 19 landmarks (Table 4).

476 Incorporating size – to capture form - improved these scores, and enabled 91.3% of our sample  
477 to be assigned to the correct sex category (Table 4). Stepwise permutation tests and analyses of  
478 regional covariation indicate a lack of functional integration in the structure of the hand, with a  
479 low degree of anatomical modularity between the digital rays and the palm suggesting that  
480 functional ties between the units do not necessarily covary in influencing sex-based  
481 morphological expression. Consequently such units can be studied either together or  
482 independently; the latter is important as it allows for relatively accurate assessment of sex  
483 based purely on the palm alone – thus allowing sex assessment in cases where digits are either  
484 missing, or imprecisely rendered.

485

## 486 **6. Discussion**

487 We have argued above that, in the first instance, it makes more sense to attempt to describe the  
488 context in which particular hand image sets were made by identifying the age and sex of the  
489 individuals present through their hand images. This is essential, since, despite the common  
490 occurrence of hand images dated to the Palaeolithic across many parts of the world, the  
491 considerable diversity of meanings assigned to these images in ethnographic accounts, and the  
492 variety of contexts in which such images were made, renders it impossible to offer any type of

493 meaning based on the nature of the images themselves. Of these two attributes - age and sex -  
494 the determination of sex must be primary, since determination of age often involves a judgement  
495 based on relative size amongst prints of the same sex. For studies of prehistoric cave art, the  
496 importance of a correct determination of sex to an understanding of the human context of hand  
497 image making is considerable. We must therefore persist in examining new methods for the  
498 determination of the sex of these images and not simply give up the challenge as a lost cause.  
499

500 As noted above, previous attempts to identify the sex of the individuals whose hands were  
501 stenciled in the Palaeolithic have mainly use variation in hand size (eg. Guthrie, 2005; Snow,  
502 2006, 2013) and/or digit length ratios of contemporary samples (eg. Snow, 2006, 2013; Table  
503 1). Using hand size data, however, is highly problematic because there is such a large degree of  
504 overlap within any single population between the sizes of male and female adult hands and  
505 between the sizes of male and female sub-adults and adult hands. As a consequence of this  
506 overlap in size, authors have argued that it is impossible to effectively distinguish the sex of  
507 Palaeolithic hand prints or stencils except for those limited number of the smallest or largest  
508 hands (Guthrie, 2005; Galeta et al., 2014). In actuality, it is only the very largest adult hands that  
509 a sex judgment can be made with any confidence, because the smallest adult hands overlap in  
510 size with adolescent individuals (Guthrie, 2005). Similar problems exist when using digit length  
511 data (i.e.2D:4D), where there is known to be both a considerable overlap in digit ratios between  
512 males and females within a population (~60%; McIntyre, 2006), and between ethnically  
513 different populations leading some authors to suggest that digit ratios should only be used  
514 where the parameters of the population under study are known (Nelson et al., 2006).  
515

516 In this paper we have presented a new method of predicting the sex of makers of hand stencils  
517 that is not based on hand size alone, but also uses shape, which can then be qualified by size if  
518 required. In particular, we have aimed to present a methodologically and statistically robust  
519 means of comparing sex-based hand shape using geometric morphometric methods. This study  
520 has demonstrated that geometric classifier variables have utility in assessing biological sex from  
521 hand shape; our results show that this method results in a successful assessment of the sex of  
522 our reference sample of hand stencils of between 68.6 and 93.7% depending on which  
523 anatomical region is sampled (Table 4). It is clear that different signals are presented indicating  
524 this dimorphism is either shape-based or sized-base, and a combination of the two (form-based).  
525 Patterns of sexual dimorphism elsewhere in the human body are often expressed through size-  
526 based differences between males and females. On the basis of this study the hand appears to  
527 follow this format, with sized-based dimorphism clearly present in the current sample as  
528 expressed by centroid size; mean male centroid size for the hand overall was 3282.3 and the

529 female mean 3013.3 and these provided a biologically meaningful expression of the overall scale  
530 of landmark configuration. As such, the differences between male and female centroid size was  
531 found to be highly significant (ANOVA  $F=165.8$ ,  $p<0.0001$ ), with males having generally larger  
532 hands than females; clearly size plays an important part in assessment of biological sex from the  
533 hand, though as the summary of results in table 4 indicate, the degree of classification accuracy  
534 is generally less effective using centroid as a size-proxy alone, than when it is combined with  
535 shape variables.

536

537 Whilst multivariate regressions of the retained shape variables from discriminant analysis  
538 against sex indicated a significant degree of sexual dimorphism in the total sample with respect  
539 to shape, shape variables and centroid size were found to be largely uncorrelated in the global  
540 sample. The correlation coefficient for both sexes regressed to centroid size was only 0.446 ( $R^2 =$   
541  $0.199$ ,  $F=6.294$ ,  $p<0.0001$ ), with the separated  $R^2$  coefficients for males and females of 0.353 and  
542 0.397 respectively. Thus, regression of shape variables against centroid size indicated that male  
543 and female hands present significant shape-based and size-based independent effects, but that  
544 these differences are not correlated with any observable allometric trajectory. Only limited  
545 correlation was observed between extracted size and residual shape variables suggesting that  
546 size does not play a significant part in influencing hand shape between the sexes; thus, males  
547 have 'male shaped' hands and females have 'female shaped' hands regardless of the overall size  
548 of the individual, but that taken together with the significant differences between male and  
549 female centroid size, a sex-based interplay between the two is recognised. The recognition of a  
550 sex-specific shape pattern is broadly in keeping with current understandings of the effect of high  
551 prenatal levels of testosterone upon the ratio between the second and fourth digits, where a low  
552 2D:4D ratio is generally seen in males. It is now understood that prenatal sex hormones regulate  
553 the plethora of genes that control the proliferation of chondrocytes that lead to sexual  
554 differences in the growth of the digits (Zheng and Cohn, 2011). It is apparent that the fourth digit  
555 is particularly sensitive to the process of prenatal androgen effects (PAE) leading to longer  
556 lengths in the fourth digit of those individuals' subject to a high PAE, with sex-specific 2D:4D  
557 ratios evident from as early as nine weeks intrauterine suggesting that the human hand  
558 represents a recognisably sexually-dimorphic region from a very early age (Nelson et al. 2006).

559

560 Our results closely mirror those of Sanfilippo et al., (2013), who, using GMM analysis of hand  
561 shape based on digital scans, showed that females were correctly classified to the same extent  
562 using either shape or size (81.4%), while centroid size was an even more effective predictor for  
563 males (80.7%). Importantly, we have shown that this rate of successful sex determination can be  
564 achieved using (indirect hand) data derived from an analysis of stencilled images with all their

565 attendant variation in size, lack of many soft-tissue anatomical landmarks (e.g., finger creases)  
566 and potential distortions due to the direction of paint spray, for example.

567

568 In addition to the high success rate of our method for sex determination, our method also  
569 significantly advances this field of study because it addresses one of the key problems  
570 encountered in the examination of Palaeolithic-age hand images: the completeness, or lack of, of  
571 many of the stencilled images. This is an important step forward because, in reality, most hand  
572 stencils are incomplete; the finger tips in particular are the region in which the image is lost or  
573 resolution is poor (Flood, 1987; Snow, 2013). Chazine and Noury (2006), for example, could only  
574 apply their method to 34 hands from Gua Masri II, part of the Kalimantan Caves in Borneo that  
575 contain many hand stencils (Chazine, 2005). Snow, in his most recent and considerably  
576 expanded study (Snow, 2013), was only able to use 32 hand stencils after close scrutiny of  
577 hundreds from the caves of Spain and France. Furthermore, in some of the Palaeolithic sites with  
578 the largest numbers of hand images, such as Gargas, Chauvet or Cosquer, digit data is entirely  
579 missing possibly due to a deliberate manipulation of the hand in stencilling or printing, and the  
580 base of the palm often appears unclear probably due to the difficulties of making an effective  
581 image of the hand in this area when stencilling.

582

583 The most significant advantage in the use of GMM analysis based on the suite of landmarks we  
584 have described above is that the number of Palaeolithic images that can be examined increases  
585 without major detriment to the quality of the results. In our study, the analysis of shape based on  
586 palm landmarks performed better than the digit landmarks in all analyses (Table 4). This  
587 concurs with other studies that have indicated that the shape of the palm is more sexually  
588 dimorphic than other regions of the hand when examining scans (Ishak et al., 2012; Kanchan and  
589 Rastogi, 2009; Sanfilipo et al., 2013). Our results confirm that, for the analysis of data from hand  
590 stencils, the palm is a more suitable region when compared to the fingers for the determination  
591 of sex. We can suggest, therefore, that as long as the palm-area on hand stencils is complete, the  
592 accuracy of predicting sex correctly should be high. The suitability of data derived from palm  
593 images for sexing the makers of hand stencils should enable a significant increase in numbers of  
594 hand stencils that can be analysed.

595

596 It is important to emphasise, however, that whilst the results presented here indicate that there  
597 might be an effective way to assess the sex of hand images based on shape, this method still  
598 needs to be tested on hand images collected from a range of human populations. Like other  
599 earlier studies we have based our examination on a reference sample of stencils made using the  
600 hands of adults from an almost exclusively northern European background, as was the case in

601 earlier studies by Snow (2006, 2013) and Guthrie (2005). But in cases in which Palaeolithic  
602 images are analysed, the use of an appropriate reference sample is essential since both hand size  
603 and digit ratio (2D:4D) vary between different ethnic populations (Galeta et al., 2014; Manning,  
604 2002; Manning et al., 2007). The need for an appropriate reference sample has been effectively  
605 demonstrated by Snow (2013) who tested his algorithm (based on a sample of North American  
606 individuals each with northern European-ancestry) on a sample of handprints of Native  
607 Americans of known sex, with disappointing results. In another test, Galeta and co-workers  
608 (Galeta et al., 2014) applied Snow's algorithm to data derived from hand scans from a  
609 contemporary French reference sample, and found that contemporary French males were more  
610 likely to be identified as female using Snow's method.

611

612 The earlier studies by Snow (2006, 2013), Guthrie (2005) and Groenen (1988) have either  
613 explicitly argued, or assumed, that methods derived from hand scans of individuals of northern  
614 European ancestry are an appropriate reference sample (for European Palaeolithic-age hand  
615 stencillers) because northern Europeans are the descendant population of those individuals  
616 whose hands were imaged at Palaeolithic sites in Western Europe. In support of this judgement,  
617 Snow (2013) cites the conserved nature of the Y chromosome in European populations  
618 suggesting continuity since the Upper Palaeolithic (Semino et al., 2000). Other studies based on  
619 contemporary human DNA have also suggested that northern Europeans can primarily trace  
620 their ancestry to the human populations that recolonised Europe from a southwestern refuge  
621 following the Last Glacial Maximum (Pereira et al., 2005; Torroni et al., 2001).

622

623 Unfortunately, this assumption cannot be so easily retained in the light of the more recent  
624 studies that benefit from the addition of data on ancient DNA extracted from skeletal material of  
625 Palaeolithic and Neolithic age and new techniques for gene sequencing and modelling the  
626 genetic history of hominin populations (see Barbujani, 2012; Bramanti et al., 2009; Brandt et al.,  
627 2015; Lacan et al., 2013; Lazaridis et al., 2014; Pala et al., 2012; Pinhasi et al., 2012; de-la-Rua et  
628 al., 2015; Soares et al., 2010; amongst others). Specifically, these studies now raise potential  
629 problems in the earlier use of genetic data to argue that a contemporary European sample is the  
630 best analogue for those pre-Last Glacial Maximum populations that produced hand stencils on  
631 the basis of an assumption that there is a simple, direct and complete continuity between human  
632 populations living in Europe before the Last Glacial Maximum to modern European populations.  
633 The first problem relates to the potential addition of new lineages to the surviving Last Glacial  
634 Maximum populations of Europe through the influx and admixture of new people from  
635 populations that survived in diverse refuge areas during the Last Glacial Maximum, and later  
636 again from new populations arriving into Europe alongside the spread of agriculture into the

637 continent. The second problem relates to the potential loss of certain European lineages during  
638 the extreme environmental conditions that occurred in Europe during the Last Glacial Maximum.  
639 Since the large majority of Palaeolithic age hand stencils and prints in Europe predate the Last  
640 Glacial Maximum it is the continuity, or not, of these populations through to the modern  
641 European population that is at issue, and not the homogeneity of modern European populations.

642

643 For example, research by Soares and others has suggested that modern European populations  
644 are not simply the outcome of a major hominin recolonization of Europe from a Franco-  
645 Cantabrian refuge area; there is also evidence for admixture from groups expanding out of other  
646 refugia located in Italy, the Balkans and possibly Eastern Europe (Soares et al., 2010), and this  
647 has since been expanded to include the influx of new populations from the Near East (Pala et al.,  
648 2012). Even within modern Franco-Cantabria there appears to be evidence for genetic  
649 variability (de-la-Rua et al., 2015) resulting from different patterns of hominin expansion after  
650 the Last Glacial Maximum. Bramanti et al., (2009) and Skoglund et al., (2012), amongst others,  
651 have indicated that there was a genetic discontinuity between the first incoming agricultural  
652 populations into Europe and pre-existing local indigenous populations, and that this was  
653 followed by a process of replacement and/or admixture between the two. Ancient DNA  
654 extracted from two Upper Palaeolithic humans dating from before the Last Glacial Maximum  
655 reveals a much greater variability in their genetic make up when compared to Mesolithic age  
656 humans (Raghavan et al., 2014; Seguin-Orlando et al., 2014). Whilst this data comes from burial  
657 sites geographically located in the Ukraine (Kostenki) and central Siberia (Mal'ta), these  
658 individuals are genetically related to Western Eurasian populations.

659

660 Furthermore, changes in social structure associated with agriculture might have altered the  
661 hormonal profiles of these populations leading to changes in hand morphology (Cieri et al.,  
662 2014), and this is particularly pertinent for methodologies that incorporate finger lengths and  
663 digit ratios (e.g., Snow, 2006, 2013), because the difference between digit lengths as measured  
664 by 2D:4D analyses relies upon such differences being the result of variation in prenatal  
665 hormonal differences (Manning et al., 1998; Nelson et al., 2006). The high degree of sexual  
666 dimorphism in hand size between males and females recognized by Snow (2013) also suggests  
667 that there may be significant differences in social structure, and hence prenatal hormones,  
668 between modern Europeans and the Palaeolithic human populations that made the hand images.

669

## 670 **7. Conclusion**

671 In conclusion, we have presented here a new method for recording and determining the sex of  
672 individuals from their hand stencils. This method employs a GMM analysis of shape based on a

673 suite of clearly identifiable landmark points on the hand. Results suggest that there is a  
674 significant difference between the shape of male and female hands that permits a high degree of  
675 accuracy in determining their sex. Furthermore, our method also allows us to assess the sex of  
676 hand images where digits may be missing or shortened because of the importance of palmar  
677 region in determining a difference in shape between male and female hands. This method  
678 represents a significant improvement on previous studies that have relied primarily on  
679 differences in hand size and digit ratios that are known to overlap greatly between males and  
680 females, and also offers the potential for application to a much greater number of images than  
681 currently examined. The method still needs to be tested on different reference samples from  
682 contemporary populations that are not of northern European descent, and this will be the focus  
683 of future work by this research team.

684

685 Finally, in our review of the previous studies of Palaeolithic hand images we noted that it was  
686 impossible to compare across studies because the dimensions taken from hands were not  
687 consistent across studies and the size data were unavailable for re-analysis. We therefore  
688 encourage other researches to use the protocol and landmarks outlined in this study to begin to  
689 analyse hand stencils from other ethnic groups. For this field of research to progress, we must  
690 begin to standardise methods and collaborate across research groups with the aim of developing  
691 a robust, predictive methodology based on diverse modern samples before it is applied to Upper  
692 Palaeolithic hand stencils.

693

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702 **References**

- 703 Aubert, M., Brumm, A., Ramli, M., Sutikna, T., Saptomo, E.W., Hakim, B., Morwood, M.J., van den  
704 Bergh, G.D., Kinsley, L., Dosseto, A., 2014. Pleistocene cave art from Sulawesi, Indonesia.  
705 Nature 514, 223-227.
- 706 Barbujani, G., 2012. Human genetics: message from the Mesolithic. *Curr. Biol.* 22, R631-633.
- 707 Bramanti, B., Thomas, M.G. Haak, W., Underlaender, M., Jores, P., Tambets, K., Antanaitis-Jacobs,  
708 I., Haidle, M.N., Jankauskas, R., Kind, C-J., Lueth, F., Terberger, T., Hiller, J., Matsumura, S.,  
709 Forster, P., Burger, J., 2009. Genetic discontinuity between local hunter-gathers and  
710 Central Europe's first farmers. *Science* 326, 137-140.
- 711 Bookstein, F.L., 1991. *Morphometric Tools for Landmark Data: Geometry and Biology.*  
712 Cambridge University Press, Cambridge.
- 713 Brandt, G., Scacsényi-Nagy, A., Roth, C., Alt, K.W., & Haak, W., 2015. Human Palaeogenetics of  
714 Europe – the known knowns and the known unknowns. *Journal of Human Evolution* 79:  
715 73-92.
- 716 Chazine, M-J. 2005. Rock art, burials, and habitations: caves in East Kalimantan. *Asian*  
717 *Perspectives*, 44, 219-230.
- 718 Chazine, J-M., Noury, A., 2006. Sexual Determination of hand stencils on the main panel of the  
719 Gua Masri II cave (East-Kalimantan/Borneo – Indonesia). *INORA*. 44, 21–26.
- 720 Cieri, R.L., Churchill, S.E., Franciscus, R.G., Tan, J., Hare, B., 2014. Craniofacial Feminization, Social  
721 Tolerance, and the Origins of Behavioral Modernity. *Curr. Anthropol.* 55, 419-443.
- 722 Clottes, J., 2010. *Cave Art.* Phaidon Press, London.
- 723 Clottes, J., Lewis\_Williams, D., 1996. Upper Palaeolithic cave art: French and South African  
724 Collaboration. *Camb. Archaeol. J.* 6, 137-163.
- 725 de-la-Rua, C., Izagirre, N., Alonso, S., & Hervella, M., 2015. Ancient DNA in the Cantabrian fringe  
726 populations: a mtDNA study from prehistory to late antiquity. *Quatern. Int.* 364, 306-  
727 311.
- 728 Flood, J., 1987. Rock art of the Koolburra plateau. *Rock Art Research*, 4, 91–126.
- 729 Galeta, P., Bruzek, J., Lázníčková-Galetová, M., 2014. Is sex estimation from handprints in  
730 prehistoric cave art reliable? A view from biological and forensic anthropology. *J.*  
731 *Archaeol. Sci.* 45, 141-149.
- 732 García-Diez, M., Garrido, D., Hoffmann, D.L., Pettitt, P.B., Pike, A.W.G., Zilhão, J., 2015. The  
733 chronology of hand stencils in European Palaeolithic rock art: implications of new U-  
734 series results from El Castillo Cave (Cantabria, Spain). *J. Anthropol. Sci.* 93, 135-152.
- 735 Groenen, M., 1988. Les représentations de mains négatives dans les grottes de Gargas et de  
736 Tibiran (Hautes- Pyrénées). *Approche méthodologique. Bulletin de la Société royale*  
737 *belge d'Anthropologie et de Préhistoire*, 99, 81- 113.

738 Groenen, M., 2011. Images de mains dans la préhistoire. La part de l'oeil, Dossier. L'art et la  
739 fonction symbolique, 25-26, 124-137.

740 Gunn, R.G., 2006. Hand sizes in rock art: interpreting the measurements of hand stencils and  
741 prints. *Rock Art Research*, 23, 97-112.

742 Guthrie, D. R. 2005. *The Nature of Paleolithic Art*. University of Chicago Press, Chicago.

743 Hooper, A., 1980. Further information on the prehistoric representations of human hands in the  
744 cave of Gargas. *Med. Hist.* 24, 214-216.

745 Ishak, N-I., Hemy, N., Franklin, D., 2012. Estimation of sex from hand and handprint dimensions  
746 in a Western Australian population. *Forensic. Sci. Int.* 221, 154.e1–154.e6.

747 Janssens, P.A., 1957. Medical views on prehistoric representations of human hands. *Med. Hist.* 1,  
748 318-322.

749 Kanchan, T., Kumar, G.P., Menezes, R.G., 2008. Index and ring finger ratio: a new sex determinant  
750 in south Indian population, *Forensic Sci. Int.* 181, 53.e1–53.e4.

751 Kanchan T, Rastogi P., 2009. Sex determination from hand dimensions of North and South  
752 Indians. *J. Forensic Sci.* 54, 546e50.

753 Klingenberg, C. P., Zaklan, S.D., 2000. Morphological integration between developmental  
754 compartments in the *Drosophila* wing. *Evolution*, 54, 1273–128.

755 Klingenberg, C.P., Barluenga, M., Meyer, A., 2002. Shape analysis of symmetric structures:  
756 quantifying variation among individuals and asymmetry. *Evolution*, 56, 1909-1920.

757 Klingenberg, C.P. (2008). *MorphoJ*. Faculty of Life Sciences, University of Manchester, UK.

758 Králík, M., Katina, S., Urbanová, P. 2014. Distal part of the human hand: Study of form variability  
759 and sexual dimorphism using geometric morphometrics. *Anthropologica Integra*, 5 (2),  
760 7-23.

761 Lacan, M., Keyser, C., Crubezy, E., Ludes, B., 2013. Ancestry of modern Europeans: contributions  
762 of Ancient DNA. *Cel. Mol. Life Sci.* 70, 2473-2487.

763 Lazaridis, I., Patterson, N., Mitnik, A., Renaud, G., Mallick, S., Kirsanow, K., et al., 2014. Ancient  
764 human genomes suggest three ancestral populations for present day Europeans. *Nature*,  
765 513, 409-416.

766 Leroi-Gourhan, A, 1967. *Treasures of Prehistoric Art*. Abrams, New York.

767 Leroi-Gourhan, A., Michelson, A., 1986. The Hands of Gargas: Towards a general study. October,  
768 37, 18-34.

769 Lewis-Williams, D., 2002. *The Mind in the Cave*. Thames and Hudson, London.

770 Mackie, M., 2015. Estimating age and sex: Paleodemographic identification using rock art hand  
771 sprays, an application in Johnson County, Wyoming. *J. Archaeol. Sci. Rep.* 3, 333-341.

772 Manhire, A., 1998. The Role of hand prints in the Rock art of the South-Western Cape. *S. Afr.*  
773 *Archaeol. Bull.* 53 (168), 98–108.

774 Manning, J.T., 2002. Digit ratio: a pointer to fertility, behavior and health. Rutgers University  
775 Press, New Brunswick.

776 Manning, J.T., Churchill, A.J.G., Peters, M., 2007. The effects of sex, ethnicity, and sexual  
777 orientation on self-measured digit ratio (2D:4D). *Arch. Sex. Behav.* 36, 223-  
778 233.

779 Manning, J.T., Scutt, D., Lewis-Jones, I.D., 1998. The ratio of 2nd to 4th digit length: a predictor  
780 of  
781 sperm numbers and concentrations of testosterone, luteinizing hormone and oestrogen.  
782 *Hum Reprod.* 13, 3000-3004.

783 McDonald, J., 1995. Looking for a woman's touch: indications of gender in shelter sites in the  
784 Sydney Basin, in: Balme, J. Beck, W. (Eds), *Gendered archaeology: the second*  
785 *Australian Women in Archaeology Conference*. ANH Publications, Australian  
786 National University, Canberra, pp. 92-96.

787 McIntyre, M.H., 2006. The use of digit ratios as markers for perinatal androgen action.  
788 *Reprod Biol Endocrinol.* 26, 4-10.

789 Moore, D., 1979. The hand stencil as symbol, in: Ucko, P.J. (Ed.), *Form in indigenous art*.  
790 Australian Institute for Aboriginal Studies, Canberra, pp. 318-324.

791 Nelson, E., Manning, J.T., Sinclair, A.G.M., 2006. Using the 2nd to 4th digit ratio (2D:4D) to sex  
792 cave art hand stencils: factors to consider. *Before Farming* (on-line version), 2006/1.  
793 Article 6, 1-7.

794 Pala, M., Olivieri, A., Achilli, A., Accetturo, M., Metspalu, E., et al., 2012. Mitochondrial DNA signals  
795 of late glacial recolonization of Europe from Near Eastern refugia. *Am. J. Hum. Genet.* 90,  
796 915-924.

797 Pettitt, P., Castillejo, A. M., Arias, P., Pedro, R.O., Harrison, R., 2014. New views on old hands: the  
798 context of stencils in El Castillo and La Garma caves (Cantabria, Spain). *Antiquity*, 88, 47-  
799 63.

800 Pettitt, P., Arias, P., García-Diez, M., Hoffmann, D., Castillejo, A.M., Ontañón-Peredo, R., Pike, A.,  
801 Zilhão, J. 2015. Are hand stencils in European cave art older than we think? An  
802 evaluation of the existing data and their potential implications, in: Bueno-Remírez, P,  
803 Bahn, P.G. (Eds.), *Prehistoric Art as Prehistoric Culture*. Archaeopress Archaeology:  
804 Oxford, pp 31-43.

805 Pereira, L., Richards, M., Goios, A., Alonso, A., Albarrán, C., Garcia, O., et al., 2005. High-resolution  
806 mtDNA evidence for the late-glacial resettlement of Europe from an Iberian refugium.  
807 *Genome Res.* 15: 19-24.

808 Pinhasi, R., Thomas, M.G., Hofreiter, M., Currat, M., Burger, J., 2012. The genetic history of  
809 Europeans. *Trends Genet.* 28, 496-505

810 Pradel, L., 1975. Les mains incomplètes de Gargas, Tibiran et Maltravieso. *Quartär* 26, 159-166.

811 Raghavan, M., Skoglund, P., Graf, K.E., Metspalu, M., Albrechtsen, A., Moltke, I., Rasmussen, S., et  
812 al., 2014. Upper Palaeolithic Siberian genome reveals dual ancestry of Native Americans.  
813 *Nature* 505, 87- 91.

814 Randolph-Quinney, P.S., Berry, R., Rynn, C., Black, S., 2010. Forensic characteristics of hand  
815 shape: analysis of individuating potential and sexual dimorphism using geometric  
816 morphometrics. *Proceedings of the American Academy of Forensic Sciences, Annual  
817 Scientific Meeting Seattle WA. Colorado Springs. Am. Acad. Forensic Sci.* 407-408.

818 Rolf, F.J., 2008. TPS Digit Program. Ecology and Evolution, State University of New York, New  
819 York.

820 Rouillon, A., 2006. Au Gravettien, dans la grotte Cosquer (Marseille, Bouches-du-Rhône),  
821 l'Homme a-t-il compté sur ses doigts? *L'anthropologie*, 110, 500-509.

822 Sanfilippo, P.G., Hewitt, A.W., Mountain, J.A., Mackey, D.A., 2013. A Geometric Morphometric  
823 Assessment of Hand Shape and Comparison to the 2D:4D Digit Ratio as a Marker of  
824 Sexual Dimorphism. *Twin Res. Hum. Genet.* 1, 590-600.

825 Semino, O., G. Passarino, P.J. Oefner, A.A. Lin, S. Arbuzova, L.E. Beckman, G. De Benedictis, P.  
826 Francalacci, A. Kouvatsi, S. Limborska, M. Marcikiae, A. Mika, B. Mika, D. Primorac, A.S.  
827 Santachiara-Benerecetti, L.L. Cavalli-Sforza, P.A. Underhill., 2000. The Genetic Legacy of  
828 Paleolithic *Homo sapiens sapiens* in Extant Europeans: A Y Chromosome Perspective.  
829 *Science*, 290, 1155-9.

830 Seguin-Orlando, A., Korneliusen, T.S., Sikora, M., Malaspinas, A-S., Manica, A., Moltke, I., et al.,  
831 2014. Genomic structure in Europeans dating back at least 36,200 years. *Nature* 346,  
832 1113-1118.

833 Skoglund, P., Malmstrom, M., Raghavan, M., Stora, J., Hall, P., Willerslev, E., Gilbert, MTP,  
834 Gotherstrom, A., Jakobsen, M., 2012. Origins and genetic legacy of Neolithic farmers and  
835 hunter-gatherers in Europe. *Science*, 336, 466-469.

836 Snow, R., 2006., Sexual dimorphism in Upper Palaeolithic hand stencils. *Antiquity*, 80, 390-404.

837 Snow, D.R., 2013. Sexual dimorphism in European Upper Paleolithic cave art. *Am.*  
838 *Antiquity*. 78, 746-761.

839 Soares, P., Achilli, A., Semino, O., Davies, W., Macaulay, V., Bandelt, H-J., Torroni, A., & Richards,  
840 MP., 2010. The archaeogenetics of Europe. *Curr. Biol.* 20, R174-183.

841 Torroni, A., Bandelt, H.J., Macaulay, V., Richards, M., Cruciani, F., 2001. A signal, from human  
842 mtDNA, of postglacial recolonization in Europe. *Am. J. Hum. Genet.* 69, 844-852.

843 Ucko, P.J., Rosenfeld, A., 1967. *Palaeolithic Cave Art*. McGraw-Hill, New York. \_

844 Voracek, M., 2009. Why digit ratio (2D:4D) is inappropriate for sex determination in  
845 medicolegal investigations. *Forensic Sci Int*, 185, 29-30.

- 846 Wildgoose, M., Hadingham, E. and Hooper, A. ,1982. The prehistoric hand pictures at Gargas:  
847 attempts at simulation. *Med. Hist.* 26, 205-207.
- 848 Wang, J.Z., Ge, W., Snow, D.R., Mitra, P., Giles, C.L., 2010. Determining the sexual identities of  
849 prehistoric cave artists using digitized handprints: a machine learning approach. *MM* 10,  
850 Proceedings of the International Conference on Multimedia, ACM, New York, 1325-1332.
- 851 Zheng, Z., Cohn, M.J., 2011. Developmental basis of sexually dimorphic digit ratios. *Proc. Nat.*  
852 *Acad. Sci. USA.* 108, 16289-16294.