


Stability of upper face sexual dimorphism in central European populations (Czech Republic) during the modern age

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Abstract One of the most fundamental issues in forensic anthropology is the determination of sex and population affinity based on various skeletal elements. Therefore, we compared the sexual dimorphism of the upper facial skeleton from a recent Czech population (twenty-first century) with that of a population from Early Modern Age Bohemia (sixteenth to eighteenth centuries). Methods of geometric morphometrics were applied. According to the results, sexual dimorphism in terms of size, shape, and form was statistically significant in both populations. The best results of sex estimation originated from analyses of form. Thus, both size and shape differences should be taken into account for determination of the sex. The accuracy of prediction achieved 91.1% for individuals in the recent population and 87.5% for individuals from the early modern population. Only minor differences were found between sexual dimorphism in the studied populations. We conclude that sexual dimorphism of the upper facial skeleton is stable during the relatively short time period.

Keywords Sex estimation · Upper facial skeleton · Central Europe · Modern age population · Geometric morphometrics · Support vector machine

Introduction

The diagnosis of sex and population affinity of various skeletal elements is a crucial subject in forensic anthropology. Forensic anthropologists need to develop methods for estimating sex that are applicable to different skeletal elements in either complete or fragmentary states. A visual analysis of the pelvis is typically the preferred indicator of sex [1–3]. However, not all forensic cases provide a complete skeleton. If an individual is left exposed in an outdoor setting, taphonomic processes can impede the recovery of all elements [4]. Pubic preservation, for instance, rarely exceeds 30% in archeological samples [5]. Furthermore, the accuracy level obtained from pelvic analyses can vary among populations. For example, the accuracy level of the method of Phenice [2] ranges from 59% [6] to 96% [7]. In cases where the pelvis is unavailable, the skull is the second most used part of the human skeleton for sex estimation [8, 9], because it is generally better preserved compared with other parts of the skeleton [10].

Sex estimation by visual assessment of nonmetric traits is usually based on scoring each feature of the skull and then sorting these scores into categories previously defined based on shape and size differences [11–15]. This approach has been criticized for being highly subjective [11, 16]. Linear measurements can be used to separate sexes with a satisfying degree of accuracy [17, 18]. However, classic linear morphometry is not able to represent the shape differences of some complex structures, such as orbit shape [19]. Given these difficulties, methods of geometric morphometrics have begun to be used. They offer an alternative for identifying the sex of unknown

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skeletal remains [20, 21] because they allow the evaluation of size and shape differences between the sexes with a low rate of subjectivity [22–25].

Traits that distinguish sex in one population might not necessarily be sexually dimorphic in other populations. Sexual dimorphism can vary across different geographical regions as well as within populations from different historical periods [26–31]. Given population variability, there are disadvantages to using visual methods [15, 16, 29, 32] and methods of traditional linear morphometry of sex estimation [33–35], because these methods generally use skeletal material from a past population of known sex. Therefore, they are not suitable for forensic applications used to investigate the sexual dimorphism of recent populations [36], especially because of changes caused by secular trends [37–39].

The 3D methods of geometric morphometrics are as accurate and reliable as traditional noncomputed methods using whole skulls [40–43]. Previous research using multivariate cranial shape data yielded a degree of classification accuracy of approximately 80% (e.g., Portuguese, 77.86% [19]; American Afro-Caribbeans and Caucasians, 89.65 and 86.65%, respectively [20]; and a South African population, 87% [18]).

Results of the study by Bigoni et al. [44] on a Czech population from the first half of the twentieth century demonstrated that it is better to analyze apportionable parts of the cranium rather than the cranium as a whole. The greatest accuracy in determining sex was found in the region of the upper face (100% of study subjects correctly classified) [44]. However, these authors used discriminant analysis without cross-validation. Cross-validation (i.e., leave-one-out) reduces the high dimensionality bias from discrimination results, and is an approach with lower, but more realistic, success rates. A cross-validated success rate that is lower than the original result of a discriminant analysis suggests that the discriminant functions from those samples are “too good to be true,” and unlikely to be valid for accurate predictions of the group affiliation of unknown samples [45].

Changes in the morphology of the skull caused by the secular trend during the Modern Age are one of the topics most discussed by anthropologists [28, 46, 47]. This secular trend was associated with the industrial revolution, beginning during the eighteenth century and continuing to the present day. Populations respond to new genetic and environmental factors to which they are exposed [46, 48]. Interpopulation differences exist in the manifestation of secular trends on skulls [37, 49]. The development of secular changes significantly depends on, for example, the degree of industrialization in a country (or in a part of a country). There could also be differences among inhabitants of the same country, but who live under different socioeconomic conditions [49].

Sexual dimorphism is more pronounced when individuals live in more favorable living conditions and with better medical care [50]. The craniofacial skeleton is a part of the body

that is affected by malnutrition, and the accuracy of sex estimation decreases mainly in malnourished males [51]. This could be because of the effect of malnutrition on the male pubertal growth spurt [52]. The development of the facial skeleton in males during this pubertal growth spurt is more influenced by the effect of exogenous factors than in females [52, 53]. Therefore, males are more sensitive to changes in the living environment than are females and diet could greatly impact the degree of size sexual dimorphism [51, 52].

The aim of this study was to create accurate and robust sex estimations based on the morphology of the upper facial skeleton using geometric morphometric methods. Sexual dimorphism of the size, shape, and form of this part of the skull was studied in two Czech populations, the current Czech population and the early modern population (sixteenth to eighteenth centuries). We evaluated whether sexual dimorphism of this part of the skull is influenced by secular trend. It was hypothesized that there would be a lower degree of sexual dimorphism within early modern populations compared with contemporary population, because of less favorable living conditions during the Early Modern Age. These results could be beneficial for forensic purposes, specifically for sex estimation of individuals from different regions of the world living under different socioeconomic conditions.

Materials and methods

Materials

The study was based on cranial computed tomography (CT) images of 154 adult individuals from central Europe (Czech Republic) from two time periods, a current Czech population and a population from the Early Modern Age, which is dated to the interval from the sixteenth century to the eighteenth century. The numbers of individuals in each group are shown in Table 1. The individuals were aged from 20 to 60 years, without older individuals (over 60 years). The criteria for selecting individuals were a lack of skeletal pathologies or atrophy of the upper face in the case of both populations and a good state of preservation of the upper face in the skeletal remains from the Early Modern Age.

The current sample comprised the upper faces of 90 living Czech individuals without pathologies that would influence morphology of the skull who had been treated at the Department of Radiology in Na Homolce Hospital, Prague, from 2010 to 2011. These individuals gave informed consent for their CT images and data to be used in this study. Their data were anonymized.

The comparative sample from the Early Modern Age comprised 64 skeletons of the upper face of individuals from one burial area in Opava (Czech Silesia, sixteenth to eighteenth centuries). The site was the burial ground for the urban

Table 1 The samples used in this study

| Population | Specimens | | | Specimens with extrapolated landmarks (%) | Extrapolated landmarks (%) |
|------------------------------------|-----------|-------|---------|---|----------------------------|
| | Total | Males | Females | | |
| Early Modern Age (EM) ^a | 64 | 35 | 29 | 75.0 | 14.5 |
| Recent population (RE) | 90 | 47 | 43 | 0.0 | 0.0 |

^a Sex estimated using Bruzek's [3] method

population of Opava, as well for individuals from villages near Opava. Based on the type of cemetery and its location in the suburbs of the historical center of Opava, it was assumed that these individuals came from middle and lower social classes [54–56]. Sexual classification of each sample was estimated using Bruzek's visual method [3], which is known to yield an accuracy rate close to 98% when the whole hip bone is used [3].

Methods

We used geometric morphometry (GMM) on extracted 3D landmark data to analyze the materials because this type of data provides better visualization of changes in cranial morphology compared with morphometry based on linear dimensions [46]. First, we extracted 3D surface models from the volumetric CT images using Avizo (version 6.1) software from the Visualization Sciences Group (Burlington, USA; Merignac, France) and vPACS DS (version 6.0) software with a custom-made extension from Audioscan (Prague, Czech Republic).

Second, 32 landmarks were placed on the models of the skeleton of the upper face. Two landmarks were located on the midsagittal plane, whereas the remaining 15 pairs of homologous points were located on the left and right sides of the plane. The landmarks were selected to represent the overall shape of the eye sockets, nasal aperture, and cheekbones (Table 2 and Fig. 1).

Measurement error [57] was evaluated on five specimens of the sample individuals. These specimens were digitized ten times to assess the accuracy and reproducibility with respect to the software used and the visualization and input methods. The average landmark measurement error in all five cases was below 1.2 mm, which is less than 1% relative to the dimensions.

Finally, the extracted landmarks were processed by GMM methods. Some landmarks were impossible to place because of minor damage to the material from the Early Modern Age population. A novel method for extrapolating missing landmarks from trends observed in a subset with complete landmark information was used to recover the shape of damaged specimens. This method is based on the construction of a linear model from a subset of complete specimens using principal component analysis (PCA) and subsequently fitting the

model that approximates landmark coordinates in specimens with incomplete configuration in a least squares sense. The model was constructed on a pooled sample of complete males and females because of the limited sample size. In most cases (80.4%), we only had to compute no more than 4 landmarks out of 32 (Table 1). Complete landmark information was important for the statistical procedures that followed. This extrapolation was conducted using a custom-built script in Python (version 2.7) and Octave (version 3.2.4).

As a preliminary step for a particular GMM analysis, we aligned all the specimens in the analysis using a generalized Procrustes analysis (GPA). GPA removes shape-unrelated variations arising from the positions, sizes, and rotations of the specimens [58]. Given the presence of bilateral symmetry in the skull, shape variation can be broken down into symmetric and asymmetric components. Failure to account for the symmetric nature of the crania can cause statistical problems, resulting in ill-conditioned covariance matrices. By explicitly accounting for symmetry using the methods outlined by Klingenberg et al. [59], this issue can be addressed. Using only the symmetric component, statistical problems were avoided and interindividual variations were separated from intraindividual asymmetric variations. In this study, we were interested in interindividual variations; therefore, only the symmetric component of shape variation was considered [31, 46, 59, 60].

Shape variables should be treated to remove the effects of allometry. To focus on the relationship of sexual dimorphism with shape only, the allometric effect was removed using residuals of the linear regression between centroid size and shape variables. These residuals represent actual deviations in the shape from the expected average specimen of arbitrary size [61].

To determine the degree of sexual dimorphism, we attempted sex classification based on shape (form) variables. For this, we used support vector machines (SVMs) [62]. Optimal parameters for the classifier (kernel type, γ , cost, and variable count) were determined with a grid search to maximize the leave-one-out cross-validation (CV) success rate. We used this CV accuracy to express the level of sexual dimorphism present in a particular sample.

The distances between mean shapes of both sexes were evaluated pairwise using the Procrustes distance measure.

Table 2 Definitions of landmarks used in the study

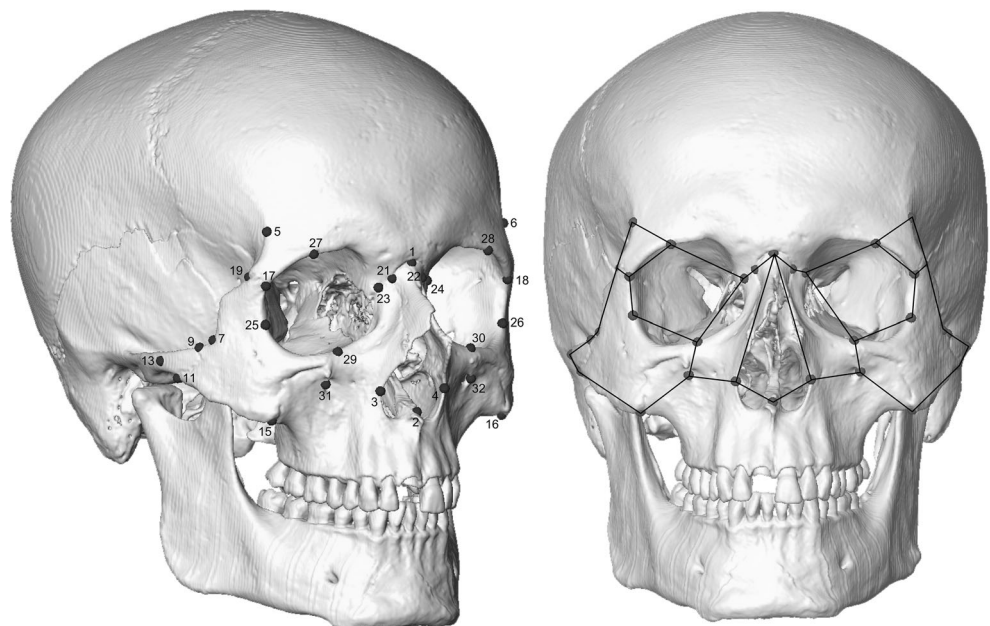
| No. ^a | Landmark | Description |
|------------------|-------------------------------|---|
| 1 | <i>Nasion</i> | The middle of the <i>sut. Nasofrontalis</i> in the midsagittal plane |
| 2 | <i>Nasospinale</i> | The point at which a horizontal line tangential to inferior margins of the nasal aperture is intersected by the medial plane |
| 3 and 4 | <i>Apertion</i> | The most lateral point of the nasal aperture |
| 5 and 6 | <i>Frontotemporale</i> | The point located generally forward and inward on the superior temporal line directly above the zygomatic process of the frontal bone |
| 7 and 8 | <i>Jugale</i> | The point corresponding to the angle between the vertical border and the margin of the zygomatic process of the malar bone |
| 9 and 10 | <i>Zygotemporale superior</i> | The most superior point on the <i>sut. Zygomaticotemporalis</i> |
| 11 and 12 | <i>Zygotemporale inferior</i> | The most inferior point on the <i>sut. Zygomaticotemporalis</i> |
| 13 and 14 | <i>Zygion</i> | The most laterally positioned point on the zygomatic arches |
| 15 and 16 | <i>Zygomaxillare</i> | The most inferior point on the zygomaxillary suture |
| 17 and 18 | <i>Frontomalare orbitale</i> | Intersection of the <i>sut. Frontozygomatica</i> and the lateral margin of the orbit |
| 19 and 20 | <i>Frontomalare temporale</i> | The most posterior/lateral point on the <i>sut. Frontozygomatica</i> |
| 21 and 22 | <i>Maxillonasofrontale</i> | The point at the intersection of the sutures between the frontal, nasal, and maxillary bones |
| 23 and 24 | <i>Maxillofrontale</i> | The point at the intersection of the anterior lacrimal crest (on the frontal process of the maxilla) and the frontomaxillary suture |
| 25 and 26 | <i>Ectoconchion</i> | The intersection of the most anterior surface of the lateral border of the orbit and a line bisecting the orbit along its long axis |
| 27 and 28 | <i>Supraconchion</i> | Intersection of the superior margin of the orbit and the normal to the line between <i>maxillofrontale</i> and <i>ectoconchion</i> |
| 29 and 30 | <i>Subconchion</i> | Intersection of the inferior margin of the orbit and the normal to the line between <i>maxillofrontale</i> and <i>ectoconchion</i> |
| 31 and 32 | <i>Infraorbitale</i> | The most lateral point on the margin of the <i>foramen infraorbitale</i> |

^aLandmarks with two numbers were landmarked right and left sides

Procrustes distances were obtained separately for shape and form, using mean shapes normalized to unity CS or mean shapes with CS left intact, respectively. The measured

distances provided a summary of the population in which males and females were closer to each other and in which population the sexes were further apart. The significance of

Fig. 1 Landmarks defined on the original 3D model of the upper face. The numbers of the landmarks are the same as in Table 2



the measured differences was also tested using a nonparametric test with 10,000 permutations.

Local information about groupwise shape differences was expressed as the magnitude of the difference between group means and was visualized as projections with arrows instead of landmarks, the size of arrows reflecting the magnitude of the differences. The direction of local shape differences, specifically the landmark shift from one group mean to the other, was demonstrated by the direction of the arrows (Fig. 2).

Differences in form and shape sexual dimorphism between the populations were tested as interaction between the factors sex and population in a multivariate analysis of variance (MANOVA).

Size differences between males and females were assessed by measuring the centroid size [58]. First, normality was tested using the Shapiro-Wilk normality test and was confirmed in all samples. The statistical significance of differences between male and female centroid sizes was tested with an unpaired two-sample *t* test. Differences in size sexual dimorphism between the populations were tested as interaction between the factors sex and population in a two-way analysis of variance (ANOVA).

All statistical processing and visualization, except landmark extrapolation, were performed in R (version 2.13.1) and PAST (version 2.17c).

Results

Sexual dimorphism of form

We analyzed the sexual dimorphism of facial form by measuring a combination of the size and shape variables of the upper

facial skeleton. Permutation tests for Procrustes distances in upper face form between males and females showed statistically significant pairwise differences in the population from the Early Modern Age and contemporary population. SVM with CV in upper face forms showed that the contemporary population had a higher degree of sexual dimorphism. SVM with CV correctly classified the sex of 91.1% of the individuals. There was a success rate of 87.5%, also after CV, for the population from the Early Modern Age (Table 3). Interaction between sex and population, in terms of form, was tested using the MANOVA and it was not significant ($P = 0.7878$).

Sexual dimorphism of shape

Second, we investigated the differences between males and females in terms of the shape of the upper face. Permutation tests for Procrustes distances of shape differences between males and females showed statistically significant pairwise differences in both populations. SVMs of shape sexual dimorphism again showed that the population from the Early Modern Age had a lower degree of sexual dimorphism. The proportion of individuals with correctly classified sex after CV was 70.3%, reaching 83.3% in the contemporary population (Table 4).

Figure 2, which gives the degree of sexual dimorphism in the shape of particular parts of the upper face, shows several signs that were specific to males or females in both populations. Eye sockets were placed deeper and more medially in males compared with females. Male orbits were relatively shorter than female orbits. The medial edge of the eye sockets (i.e., the location of the inner corner of the eye) was placed more superiorly and posteriorly in males than in females. The female orbits were relatively larger compared with the male orbits.

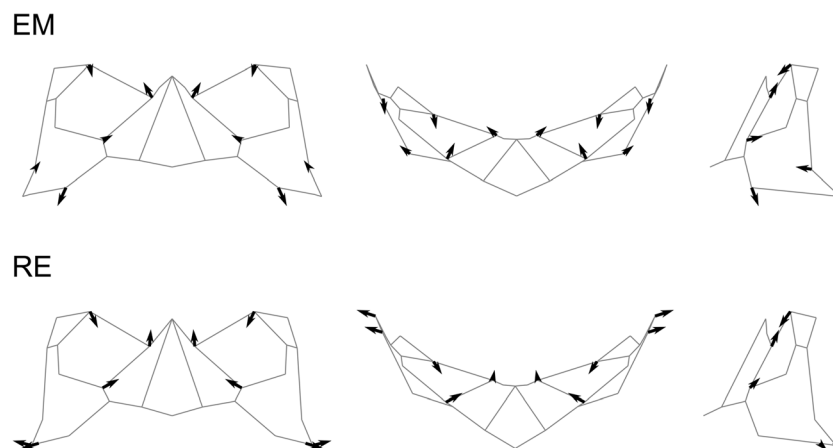


Fig. 2 Shape differences in particular samples with respect to sexual dimorphism. Anterior, superior, and lateral views of the mean shape of the female upper face. The *arrows* show the landmarks with the highest degree of sexual dimorphism and the morphological changes from the mean female upper face towards the mean male upper face. The *length of*

the arrows shows the degree of sexual dimorphism. The *arrows* are six times greater than the dimorphism value to highlight the degree of dimorphism. *EM* early modern population, *RE* recent population; other abbreviations as in Table 1

Table 3 Results of sex classification of the upper face form using support vector machine learning with leave-one-out cross-validation

| Population | Correctly classified specimens (%) | Procrustes distance between <i>m</i> and <i>f</i> | <i>P</i> value ^a |
|------------|------------------------------------|---|-----------------------------|
| EM | 87.5 | 16.5 | <0.0001* |
| RE | 91.1 | 18.2 | <0.0001* |

Abbreviations as in Table 1

*Statistically significant at the 0.001 level

^a *P*- values for permutation tests for Procrustes distances

Shape sexual dimorphism in the areas apart from the orbits was different in the early modern and recent populations. The main differences occurred in the area of the zygomatic arches. The upper face of contemporary males compared with females was markedly wider in this area (Fig. 2). However, the MANOVA showed no statistically significant interaction between sex and population in the shape component ($P = 0.8335$).

Sexual dimorphism of size

Finally, we focused on size differences between males and females. Using two-sample *t* tests, we found highly statistically significant differences in the centroid size of the upper face between males and females in both populations ($P < 0.0001$). Male upper faces were, on average, larger than female upper faces. The contemporary population exhibited a greater difference between males and females (6.4%) than the Early Modern Age population (5.9%) (Table 5 and Fig. 3). However, the two-way ANOVA showed no statistically significant interaction between sex and population, in terms of centroid size ($P = 0.4011$).

Discussion

In this study, we evaluated the suitability of the morphology of the upper face recorded by landmark data for sex estimation using geometric morphometrics. Our results suggest that the upper face is undoubtedly a dimorphic skeletal element. SVM was able to classify the sexes with a reasonable degree of accuracy and was at least as accurate as noncomputed methods [41]. The accuracy of our sex estimation was lower compared with a study by Bigoni et al. [44], who achieved 100%

accuracy in sex estimation using the upper face. Nevertheless, CV was not used by Bigoni et al. [44]. The absence of CV leads to an increase in the number of variables and classification accuracy. Therefore, statistical models without CV are biased and the high success rate of classification is misleading [45, 63, 64]. Other recent studies using geometric morphometry focused on the sex estimation of the whole skull. The accuracy of these studies ranged from 72.2% [19] to 90.0% [20] using the discriminant analysis of form with CV. Our results showed slightly better accuracy of sex estimation for the recent population (91.1%) and only slightly lower accuracy (87.5%) for the early modern population using the form of the upper face and the SVM method. Therefore, it is not necessary to analyze the whole skull to attain a high accuracy of sex estimation. Thus, skeletons of the upper face combined with SVM and CV would be suitable for sex estimation in forensic anthropology, for example, when skeletal remains are fragmentary.

Furthermore, SVM using the form of upper face significantly improved the discrimination between males and females compared with SVM of the upper facial shape. This confirms the result found by analyzing the whole skull (e.g., in studies by Green and Curnoe [65], Gonzalez et al. [19], and Kimmerle et al. [20]).

In both populations in our study, the shape sexual dimorphism of the upper face was statistically significant, although only 70.3 and 83.3% of individuals in the older population and current population, respectively, were correctly classified. Similar shape sexual dimorphism occurred in the area around the eye sockets in both investigated populations. Orbits show significant sexual dimorphism in the skull, and this occurs across populations [66, 67]. In our study, male orbits were relatively smaller and placed deeper and more medially

Table 4 Results of sex classification of the upper face shape using support vector machine learning with leave-one-out cross-validation

| Population | Correctly classified specimens (%) | Procrustes distance between <i>m</i> and <i>f</i> | <i>P</i> value ^a |
|------------|------------------------------------|---|-----------------------------|
| EM | 70.3 | 0.01974 | 0.0010* |
| RE | 83.3 | 0.02571 | <0.0001* |

Abbreviations as in Table 1

*Statistically significant at the 0.001 level

^a *P* values for permutation tests for Procrustes distances

Table 5 Average centroid size (avg. CS) by sex and population, and their relative differences

| | EM | RE |
|-------------------------|-------------|--------------|
| Female avg. CS | 273.5 (7.3) | 274.9 (10.1) |
| Male avg. CS | 289.7 (9.1) | 292.4 (9.4) |
| Relative difference (%) | 5.9 | 6.4 |

Standard deviations are given in parentheses. Abbreviations as in Table 1

compared with females. Deeper eye sockets in males are caused by, among other factors, the presence of more prominent superciliary arches. Similar results were described in previous studies, such as that by Gonzalez et al. [19], where the area of greatest sexual dimorphism was located in the supraorbital region. Slightly different results were reported by Bigoni et al. [44], in that female orbits were more rounded and male orbits were relatively wider and lower. These differences in sexual dimorphism occur when different populations are compared and show that sexual dimorphism of the skull is population specific [30, 31].

Centroid size was used to compare the size sexual dimorphism of the skeleton of the upper face, and we confirmed the results of significant size sexual dimorphism published in studies based on classic morphometry [17, 68, 69] and in studies that used methods of geometric morphometrics and centroid size to investigate size sexual dimorphism [19, 20]. The study by Bejdová et al. [70], which investigated sexual dimorphism of the mandible in the same populations as in this study (from Early Modern Age and present), also showed significant size sexual dimorphism. The size difference between males and females in terms of the upper face (around 6%) falls within the interval of size differences of the mandible between the sexes (5–8%) [70].

When we compared sexual dimorphism of the whole morphology of the upper face (form, shape, size) in the early

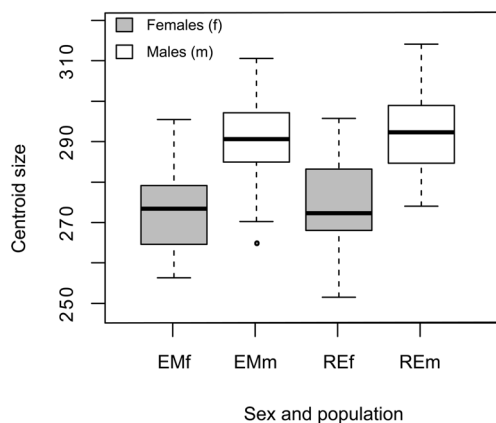


Fig. 3 Box plots of the centroid sizes of males and females from each population. *EM* early modern population, *f* female, *m* male, *RE* recent population; other abbreviations as in Table 1

modern population and the current population, significant differences between the populations were not found. The same pattern of the shape sexual dimorphism was mainly localized to the area of the orbits. Sexual dimorphism of the upper face is stable across these populations, and the same methods of sex estimation could be used for both populations in general. Significantly different sexual dimorphism is known mainly among geographically or historically more distant populations [29, 71]. Our study compared changes of sexual dimorphism within populations living in the same region of central Europe during this relatively short time period.

When we focus on the finer population variability in sexual dimorphism, SVM classification showed a different success rate. The current Czech population showed greater form, shape, and size sexual dimorphism compared with the early modern population. Similar results were reported by Proença et al. [36], who compared the craniofacial morphology of Portuguese populations from the eighteenth century with those of the present day. In that study, the most statistically significant difference in means between sexes was observed in the twenty-first century population. Furthermore, we found a population-specific pattern of the shape sexual dimorphism mainly localized in the area of the zygomatic arches. It shows that methods of geometric morphometrics are suitable for the evaluation of interpopulation differences of sexual dimorphism. They make it possible to easily locate areas with the greatest degree of sexual dimorphism and show the specific pattern of that dimorphism [46].

To understand the observed differences better, we need to highlight that the degree and pattern of sexual dimorphism is influenced by diverse factors ranging from environmental influences to temporal changes in diet and, thus, differ for each population [67, 72, 73]. Our findings are related to substantial changes in living conditions that occurred across all populations in Europe after the industrial revolution [74–76]. Populations react to new environmental factors [46, 48] that result in various secular trend changes in human morphology, including the changes in sexual dimorphism reported here and elsewhere [37]. The degree of sexual dimorphism reflects the favorability of the external environment and the quantity and quality of food [50, 51]. The recent Czech population is unlikely to be malnourished compared with the early modern population, and are also likely to live in more favorable socio-economic conditions with higher living standards [46, 48, 77]. Quality and sufficiency of food is also linked to climate, which is also more favorable now than during the Early Modern Age [76, 78–80]. These facts could lead to slightly greater sexual dimorphism of the contemporary population compared with the early modern population. The evolution of population-specific sexual dimorphism could also affect sexual selection, which could significantly affect shape variability and sexual dimorphism and could reflect cultural influences on the perception of attractiveness of the face [81–83]. Different

preferences in sexual selection can lead to differences in the gene pool of a particular population [84].

A limitation of the present study is the unknown sex of individuals from the early modern population. We used hip bones and Bruzek's visual method to determine the sex. [3]. This method has a high accuracy rate close to 98% [3]. The reliability of this method was tested on modern Americans. For all analyses, individuals scored as "indeterminate" were classified as "incorrect" for sex classification. This method correctly classified sex in 90–92% of the total sample and 89% of the random sample [85]. In our study, only individuals with typical male or female morphology of hip bones were used, so as to minimize the influence of sex estimation on the results.

Conclusions

This study confirmed the high accuracy of sex estimation of the upper face based on landmark data using geometric morphometric methods. The highest success rate achieved (91.1%) correctly classified individuals from the recent period using form analysis. In the shape analysis, 83.3% accuracy was achieved in the same population. Analysis of the form significantly improved the discrimination between males and females compared with the analysis of the shape. Comparison of the sexual dimorphism of the recent population and the early modern population showed no significant differences. Similar-shaped sexual dimorphism occurred only in the area around the eye sockets. Male orbits were relatively smaller and placed more deeply and more medially compared with those of females in both investigated populations. The degree of shape, size, and form sexual dimorphism was lightly greater in the recent population. Our study showed that geometric morphometrics is suitable for the evaluation of interpopulation differences of sexual dimorphism, and sexual dimorphism of the upper face is relatively stable during the Modern Age in the area of central Europe.

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Compliance with ethical standards All procedures performed in studies involving human participants were in accordance with the ethical standards of the institutional and/or national research committee and with the 1964 Helsinki declaration and its later amendments or comparable ethical standards.

Informed consent was obtained from all individual participants from the current Czech population included in the study. In the case of individuals from the Early Modern Age population (retrospective data), formal consent is not required.

This article does not contain any studies with animals performed by any of the authors.

Conflict of interest The authors declare that they have no conflict of interest.

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