

Comparison of image acquisition techniques and morphometric methods to distinguish between Vitis vinifera subspecies and cultivars

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Comparison of image acquisition techniques

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3 between Vitis vinifera subspecies and

4 cultivars

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- 11
- 12 Abstract For decades, it has been known that the morphology of wild *Vitis vinifera*
- 13 (grape) pips differ from domesticated ones. Based on these differences, computerised
- 14 image analysis and morphometrics allow us to obtain excellent results to identify the
- 15 domestication status of archaeological grape pips. However, various image analysis
- 16 methodologies and morphometric methods have been applied in previous studies for this
- 17 purpose. Our study has examined, for the first time, the different techniques of digital
- 18 image acquisition (digital camera vs scanner) of grape pips, with the aim of testing the
- 19 identification performance using both traditional and geometric morphometric features to
- 20 distinguish wild from domestic grape pips. The performance of different morphometric
- 21 methods established that all image acquisition techniques and morphometric methods
- 22 correctly distinguished between wild and domestic grapes. The use of the combined
- 23 geometric morphometric features of both dorsal and lateral views of the pips provided the
- 24 best accuracy in distinguishing individual cultivars.
- 25 **Keywords** Geometric morphometrics · Seed image analyses · Grape pip 26 mombalacy. Traditional mombametric features
- $26 morphology \cdot Traditional morphometric features$

27 Introduction

- 28 Vitis vinifera ssp. sativa (DC) Hegi (grapevine) is currently one of the most
- 29 cultivated perennial fruit plants in the world, with eight million ha grown, mostly
- 30 for wine production (Myles et al. 2011; Wen et al. 2018). The currently cultivated
- 31 grape varieties are the result of long-term selection that began with the
- 32 domestication process of their wild ancestor, *Vitis vinifera* ssp. sylvestris (C.C.

33 Gmel.) Hegi. One of the most distinctive differences between the two subspecies 34 is hermaphroditism, which allows the domestic grape to self-pollinate and be 35 more productive (This et al. 2006). Genetic studies on modern cultivated and wild 36 grapes support the hypotheses of a single, or two main domestication events which occurred in western Asia (Arroyo-García et al. 2006; Myles et al. 2011; 37 38 Dong et al. 2023). 39 Archaeobotanical studies indicate that the first domestication probably took place 40 in southwest Asia in the period between the 6th and 3rd millennia BCE. Thanks to 41 the widespread presence of wild grapes there, some researchers have indicated 42 that the southern Caucasus area is the most probable place where this event could 43 have occurred (Zohary et al. 1995, 2012; De Lorenzis et al. 2015). 44 The morphological characters of ancient grape pips found in archaeological 45 contexts can provide valuable information about their status, wild or 46 domesticated, to explain the beginning of grape domestication. The process of 47 domestication caused phenotypic changes in their wild relatives such as the shape 48 of the pips (seeds), so that domesticated grapes generally have elongated pips with 49 a long beak, while wild grapes have smaller, roundish pips with a short beak. 50 Several studies have focused on the development of methods to discriminate 51 between them through the measurement of morphometric parameters. The simple 52 breadth/length ratio proposed long ago by Stummer (1911) proved to be quite 53 inefficient in correctly distinguishing wild from domestic grape pips, particularly 54 with charred specimens (Logothetis 1970, 1974; Smith and Jones 1990; 55 Bonhomme et al. 2022). Subsequently, Mangafa and Kotsakis (1996) did several 56 carbonisation experiments on modern wild and domestic grape pips with the aim 57 of distinguishing them. Based on various distance measurements computed using 58 discriminant analysis, their work led to the proposal of four mathematical 59 formulae regarded as the most efficient for distinguishing domestic from wild 60 Vitis. Unfortunately, when this method was applied to French domestic grape 61 varieties, it proved not entirely accurate, as the proposed formulae needed to be 62 recalibrated for the larger number of grape varieties in France (Bouby and 63 Marinval 2001). 64 In recent years, further studies have used analysis of the outlines of the pips to 65 distinguish wild from domestic grapes (Terral et al. 2010). This method uses

66 elliptic Fourier transforms (EFT), which converts the outline of an object into

67 shape descriptors (Fourier coefficients = EFDs) (Kuhl and Giardina 1982). 68 Subsequently, EFT results have been used as geometric morphometric features in 69 multivariate analyses to distinguish the different morphological types (Terral et al. 70 2010). This approach has been highly effective in distinguishing wild grape pips from domestic ones (Pagnoux et al. 2015, 2021; Bouby et al. 2021). A recent 71 72 study compared different methodologies for this separation, EFT, Stummer 73 indices and length variables derived from the formulae proposed by Mangafa and 74 Kotsakis (Bonhomme et al. 2022). The authors concluded that, except for 75 Stummer's indices, length variables and EFT were able to correctly identify wild 76 from domestic grape pips and the best performance was obtained from EFT. 77 At the same time, other studies have used traditional morphometric features 78 (TMf), such as area, perimeter, width and height, and shape parameters, such as 79 roundness, circularity and convexity, to separate wild grapes from domestic ones 80 in both modern and archaeological material (Orrù et al. 2013; Ucchesu et al. 2015, 81 2016; Sarigu et al. 2022; Coradeschi et al. 2023). 82 Some of the methods mentioned above have also been used to go beyond species 83 identification, attempting to recognise groups of domestic grape varieties or 84 particular wild grape populations (Terral et al. 2010; Orrù et al. 2012, 2013; 85 Pagnoux et al. 2015, 2021; Ucchesu et al. 2015, 2016; Bouby et al. 2021). 86 Morphometric approaches usually rely on image analysis. In some of the cited 87 works, images were obtained with a stereomicroscope fitted with a digital camera 88 (Terral et al. 2010; Bouby et al. 2013, 2021; Pagnoux et al. 2015, 2021; 89 Bonhomme et al. 2022), while in other works, a flatbed scanner was used (Orrù et 90 al. 2013; Ucchesu et al. 2015, 2016). In both cases, the original images were 91 digitally processed to separate the objects (pips) from the background of the 92 image, so as to isolate the objects of interest from everything else. 93 The final stage of the process is the creation of binary images of the objects that 94 are ready to be measured so that grey scale or colour images are converted into 95 binary line images with only two pixel values, either black, usually the 96 background, or white. This phase of the digital image processing may require 97 different amounts of time, depending on the acquisition method and the 98 experience of the operator. It is not known how the method of obtaining images 99 may influence the results of morphometric analyses for accuracy or 100 reproducibility and the identification of the samples. Furthermore, the different

methods of image acquisition in combination with a traditional morphometric
approach and outline analysis have not yet been compared to discover which of
the two methodologies has the best performance in characterising grape pip
morphology.
Therefore, in this work, our objective was twofold. First, we compared the

106 reproducibility and performance of both image acquisition techniques using the

107 same samples of modern grape pips, both wild and domestic, and the same

108 morphometric methods (EFT and TMf). Second, we tested the performances of

109 both morphometric methods to discriminate between Vitis vinifera subspecies and

110 cultivars using the same grape pip samples and images from them.

111 Material and methods

112 Vitis accessions

113 Assessment and comparison of the errors of image acquisition techniques were

114 made using a set of three grape cultivars (Girò scuro, Monica and Trebbiano

115 Romagnolo) and one wild accession (Sos Forrighesos) with five pips for each of

116 the four accessions (Evin et al. 2020).

117 Further comparisons of morphometric methods and image acquisition techniques

118 were done using modern grape pips from 15 cultivars of V. vinifera ssp. sativa and

119 11 individuals of V. vinifera ssp. sylvestris (ESM Table S1). Domestic grape

120 samples were collected from the Institut national de la recherche agronomique

121 (INRAE), Vassal-Montpellier Grapevine Biological Resource Centre,

122 Ampelographic collection of Vassal-Montpellier (Marseillan-Plage, France) and

123 from the Agenzia per la Ricerca in Agricoltura della Regione Sardegna (AGRIS)

124 germplasm collection in Ussana (Sardinia, Italy).

125 Wild material came from the collection of the Institut des Sciences de l'Évolution

126 de Montpellier (ISEM-CNRS), University of Montpellier (ESM Table S1).

127 Following previous work (Terral et al. 2010), 30 pips were randomly selected

128 from each domestic and wild accession, in total, 780.

129 Image acquisition techniques

130 All pips were photographed in dorsal and lateral views using a stereomicroscope

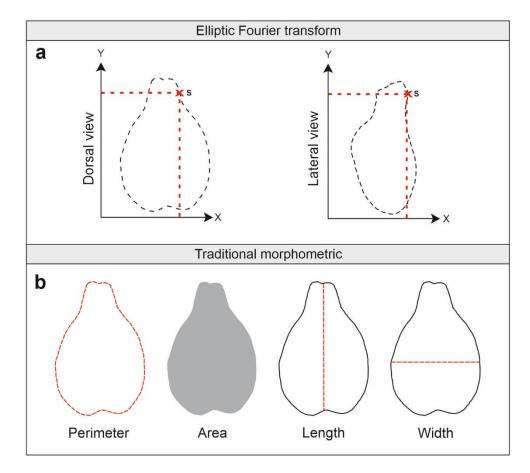
131 (Olympus SZ-ET) with a digital camera (Olympus DP21).

- 132 In parallel, the images of the same grape pips were also acquired following the
- 133 method described in Orrù et al. (2012), using a flatbed scanner (Epson Perfection
- 134 V550), with a digital resolution of 600 dpi for a scanning area not exceeding
- 135 5,100×7,019 pixels. Due to the impossibility of placing the pips on the scanner
- 136 glass on their lateral side, only an images of the dorsal side were scanned.
- 137 To minimise errors during the acquisition of the grape pip images, only two
- trained people did this work, one using the digital camera and the other used the
- 139 scanner.
- 140 The digital processing, which included creation of binary images, both from the
- 141 digital camera photos and the scans, was done by a single person.
- 142 Moreover, the time taken for the image acquisition and processing of 30 pips was
- also measured.

144 Morphometric methods

145 Elliptic Fourier transforms

146 All grape pip images were converted to black silhouettes, the binary images. Pip 147 outline analyses were done of these images using the elliptical Fourier transforms 148 (EFT) method (Terral et al. 2010; Bonhomme et al. 2014, 2021). This method 149 converts the contour geometry into Fourier coefficients, for which outline 150 coordinates (x, y) of 160 equidistant points were sampled on the outline of each 151 grape pip. The outlines were normalised before calculating the EFTs using their 152 centroid size and considering the position of the first point above the centroid 153 (Fig. 1a). 154 Based on previous work (Terral et al. 2010; Bonhomme et al. 2021), we used only 155 the coefficients from the six first harmonics to describe each view (24 156 coefficients). Six harmonics allowed a good compromise between shape 157 description accuracy (more than 95% of the total harmonic power) and 158 measurement errors, which increased with harmonic rank. The flatbed scanner 159 could only obtain dorsal views of the pips. The microscope and digital camera 160 also photographed the lateral (side) view of the pips. In this case, each one was 161 then described by 24 coefficients for the dorsal view and another 24 for the lateral 162 view. All EFT analyses used Momocs v. 1.4.0 (Bonhomme et al. 2014). 163



164

Fig. 1 a, diagram of elliptic Fourier transform (EFT) measurement of 160 reference points; b,
 principal traditional morphometric features (TMf) measurement of length, width, perimeter and
 area

168 Traditional morphometrics

The same images used for EFT were measured for 20 morphometric parameters (nine of size and 11 of shape) using Image J 1.53k image processing and analysis software (Abràmoff et al. 2004). Of the 20 morphometric parameters, only those that were least correlated with each other (R<0.85) were selected for a total of nine parameters (Fig. 1b; ESM Table S2).

174 **Repeatability tests**

175 Image acquisition was repeated three times for each pip, on different days with the

- 176 flatbed scanner and digital camera. The variability between repeated image
- 177 acquisitions was studied using principal component analysis (PCA). The
- 178 percentage of measurement errors was assessed using an analysis of variance
- 179 (ANOVA) (Claude 2008 Evin et al. 2020). Mean squares were used to estimate
- 180 the proportion of variance associated with the replication measurements. The error

- 181 percentage was calculated as the ratio of the variance between replicates (within
- 182 variance) and the total sum of the variance between replicates and specimens (sum
- 183 of within and among variance).

184 Exploring morphological variation

185 To explore the overall morphological variations, we used principle components

- 186 analysis (PCA) for the traditional morphometric parameters, as well as for the
- 187 Fourier coefficients. To evaluate the respective performances of morphometric
- 188 methods and image acquisition techniques in identifying subspecies and cultivars,
- 189 we performed linear discriminant analysis (LDA) mainly on PCA scores, which
- 190 are not correlated. In parallel, we also performed LDA directly on the raw
- 191 traditional morphometric parameters and Fourier coefficients.
- 192 We used a balanced reference material for the LDA in which an identical number
- 193 (N=2430) of pips of cultivated and wild grapes were randomly selected.
- 194 Statistical analyses were done using the MASS package (Venables and Ripley
- 195 2002) in the R environment (v. 4.0.0) (R Development Core Team 2020).

196 **Results**

197 Working times

198 In the examination of working times for obtaining images of 30 pips, the scanner

- required 5 min to acquire only the dorsal view and the digital camera took a total
- 200 of 30 min for both dorsal and lateral views. Subsequently, the total image
- 201 processing time was 1 min for 30 scanned images and 20 min for 60 photographed
- 202 images (Table 1).
- 203

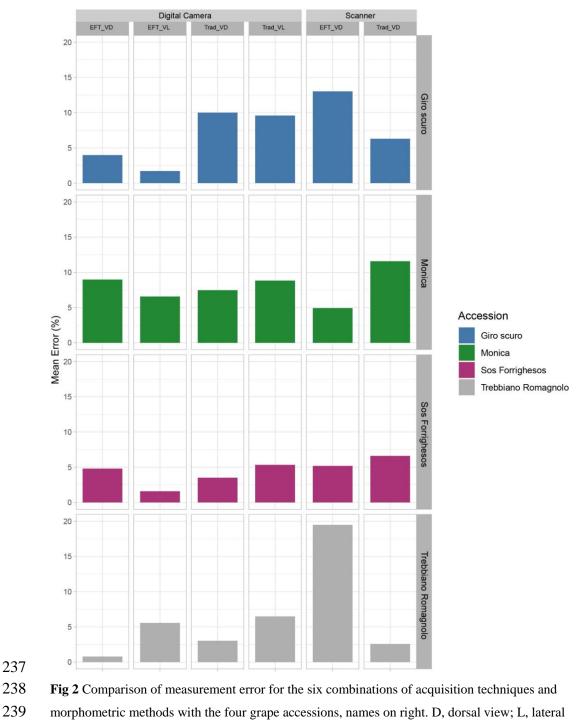
204

| Method | Time image acquisition (min) | Time image segmentation (min) | Total time (min) |
|-------------------------------|------------------------------|-------------------------------|---------------------|
| Scanner (dorsal view) | 5 | 1 | 6 |
| Digital camera (dorsal view) | 15 | 10 | 25 |
| Digital camera (lateral view) | 15 | 10 | 25 |

205 **Table 1** Time taken for processing 30 pips

206 **Repeatability tests**

207 The first biplot of the PCA (81.44% of the total variance) on traditional 208 morphometric features (TMf) scanned in dorsal views of four cultivated and one 209 wild grape pips showed that the differences between the accessions and pips were 210 more marked than between the three repeated image acquisitions of single pips 211 (ESM Fig. S1). 212 Similarly, the PCAs of the TMf measured on the dorsal and lateral views of the 213 pips when photographed showed larger differences between accessions and 214 between pips within accessions than between the three repetitions of 215 photographing single pips (ESM Figs. S2a and b). 216 The same approach was repeated using the Elliptic Fourier Transform (EFT) 217 parameters on images from both the scanner and digital camera. As with the TMf 218 results, the PCAs on shape descriptors of scanned dorsal views (ESM Fig. S3) and 219 when photographed (ESM Fig. S4) showed that the differences between 220 accessions and pips were generally greater than the three repeated image 221 acquisitions from both scanning and photography. The discrimination between 222 pips was, in some cases, less marked from the scanned images. 223 Using Elliptic Fourier Transform (EFT) parameters measured in lateral view with 224 a digital camera, PCA again showed that the differences between the various 225 accessions and pips were more marked than between the three repeated image 226 acquisitions (ESM Fig. S5). 227 In addition, we calculated the percentage of measurement error according to the 228 six combinations of acquisition techniques and morphometric methods for the 229 four grape accessions. The error associated with each image acquisition technique 230 and morphometric method varied noticeably, according to the particular grape 231 accessions (Fig. 2). However, it was usually less than 10% (ESM Table S3). The 232 measurement error was slightly lower for photos than with scans. For the photos, 233 the measurement error was slightly lower for the lateral than for the dorsal view. 234 However, the observed differences between morphological techniques and 235 methods were small and varied from one cultivar to another (ESM Table S3). 236



240 view

241 Comparison of morphometric methods (TMf vs EFT) using

a scanner

243 We then carried out principle components analyses (PCA) on the measurements

244 obtained from both methods, traditional morphometric features (TMf and elliptic

245 Fourier transform (EFT), of the 15 cultivars and 11 wild varieties in dorsal view.

- 246 Both PCAs showed a clear distinction between domestic and wild accessions,
- 247 except for the cultivar Roussanne (Fig. 3a, b).

Comparison of morphometric methods (TMf vs EFT) using the digital camera

- 250 Further PCAs were done on the measurements with TMf and EFT in dorsal,
- 251 lateral and both views, obtained with a digital camera (Fig. 4a–f). All analyses
- showed a clear differentiation between domestic and wild accessions, with the
- 253 exception of the cultivar Roussanne (RoussB, Fig. 4).
- 254

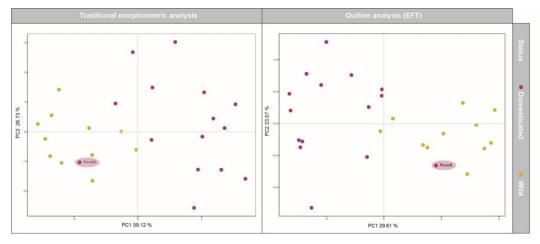


Fig. 3 Principal component analysis of morphological variation between grape pip accessions
using a scan of the dorsal view, and using a, TMf; b, EFT. RoussB, cultivar Roussanne; purple
dots, cultivated grape; yellow dots, wild

259

255

LDA analyses of traditional morphometric parameters and

261 elliptic Fourier coefficients using a scanner and digital

262 camera

- 263 Finally, linear discriminant analyses (LDAs) were used to compare the
- 264 performance of image acquisition techniques (scans vs photos) using TMf and
- 265 EFT for status (domesticated/wild)and cultivar identification.
- Figure 5 shows that classification according to domesticated or wild status using
- both TMf and EFT from both acquisition techniques is at least 83% correct.
- 268 Overall, the percentages of correct identification are similar for both technical
- acquisition and morphometric methods (Fig. 5). The photos provided

270 measurements in both lateral and dorsal views, which increased the accuracy of 271 identification of wild and domestic grape pips by a few percentage points when 272 using traditional measurements and EFT coefficients (Fig. 5a-d). LDAs of the 273 raw shape descriptors (Fig. 5b, d, f, h) generally gave slightly higher percentages 274 of identification than LDAs based on principal components. 275 All image acquisition techniques and morphometric methods also vielded good 276 results for identification of the cultivars (Fig. 5e-h). However, in this case, there 277 were greater differences between the different combinations; higher correct 278 identifications were obtained using EFT coefficients from photos than from the 279 scans. Moreover, the highest identification percentages were achieved when both 280 dorsal and lateral views of the pips were combined, especially when the LDA was 281 done on the raw EFT coefficients (Fig. 5h). 282 Overall, the accuracy of cultivar identification was clearly increased when using 283 EFT and the combination of dorsal and lateral views or lateral views rather than 284 when using traditional morphometrics on dorsal views only.

285 **Discussion**

286 The use of different morphometric methods and image analysis techniques on 287 both modern and archaeological samples raises the question of which is the best 288 option for an accurate description of pip morphology and, more especially, to 289 accurately distinguish wild from domestic grape pips. Bonhomme et al. (2022) 290 showed how the choice of morphometric methods could influence the results of 291 distinguishing between wild and domestic accessions, and so could provide 292 different identifications of archaeological pips. 293 Our study examined, for the first time, the different techniques of digital image 294 acquisition (digital camera vs scanner) in combination with a traditional 295 morphometric approach (TMf) and outline analysis (EFT), with the aim of testing 296 their performances in distinguishing wild from domestic grape pips and to make 297 further progress in the identification of grape varieties. We measured the errors 298 from the repeated image acquisitions of the same samples both with photos and 299 scans. The results for both image acquisition techniques and morphometric 300 methods showed that the differences between the various accessions and pips 301 were more marked than the errors in the repeated image acquisitions. It was also 302 found that the measurement error was slightly lower for photos than with scans.

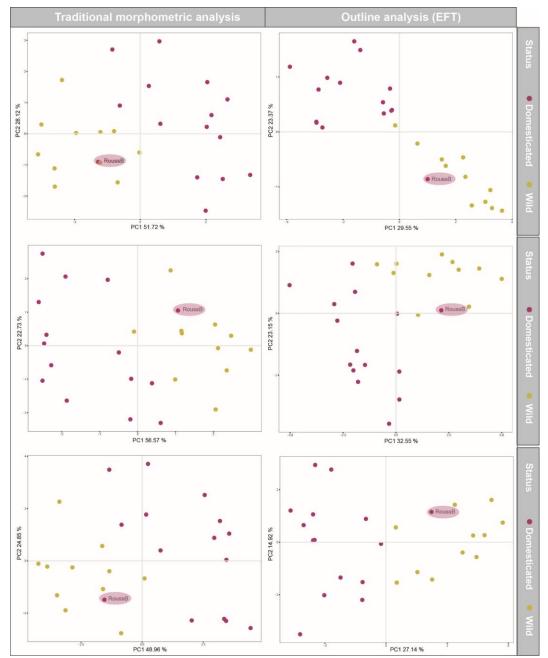




Fig. 4 Principal component analyses of morphological variation between grape pip accessions
using a digital camera and TMf and EFT of dorsal (D, a, d), lateral (L, b, e) and both views (D+L,
c, d). RoussB, cultivar Roussanne

308

309 This slight difference could be due to the difficulty of arranging irregularly shaped

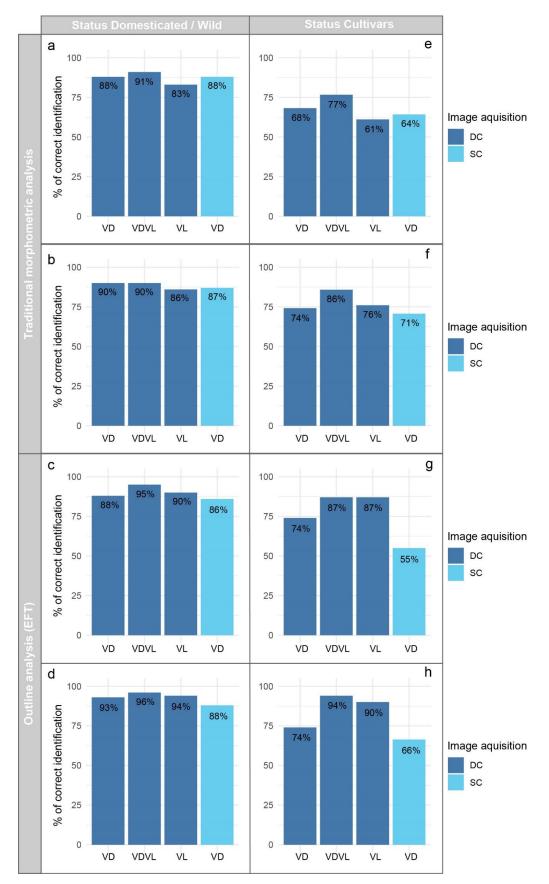
310 pips in exactly the same position on the rigid surface of the scanner glass. In

311 contrast, when using a digital camera, each pip was placed on a soft surface,

312 which allowed the operator to adjust it to the best position. However, the error rate

313 was always less than 10% and did not prevent the use of any method.

314



315

Fig. 5 Bar plot of linear discriminant analysis (LDA) results comparing the performance of image
acquisition techniques (SC, scanner vs DC, digital camera) using either Elliptic Fourier transform
outline analysis or traditional morphometric features for identification; a-d, domesticatd; e-h,

319 cultivars

320 321 The performance of the identifications with LDA allowed us to establish that both 322 image acquisition techniques and morphometric methods were able to separate 323 wild from domestic grape pips with similar accuracies, always close to 90%. 324 This is similar to the results of previous works where both traditional 325 morphometric parameters and outline analysis correctly distinguished wild from 326 domestic pips (Bouby et al. 2013; Bonhomme et al. 2022). In the future, we 327 should seek to further improve the statistical procedure of identification by 328 repeating the LDA thousands of times on a random sample of balanced reference 329 datasets, in order to assess the variability and accuracy of the result. 330 The digital camera provided a somewhat higher accuracy due to the possibility of 331 using pip measurements in both dorsal and lateral views. 332 It can be concluded that the use of a scans to obtain only dorsal view of the pips is 333 enough to be able to distinguish between wild and domestic pips, especially when 334 processing many archaeological samples. 335 However, to further investigate the morphological variation among domestic 336 grape varieties, our results showed that it is preferable to use photos and the EFT 337 method. 338 The use of TMf and EFT measurements of photographic images proved more 339 accurate in identifying individual cultivars than with scans. 340 More significantly, the combination of dorsal and lateral views of the pips was 341 shown to give better identifications, especially when using EFT parameters rather 342 than traditional measurements, and it gave the best performance in distinguishing 343 cultivars. This shows that the lateral view adds important morphological 344 characteristics that help to distinguish between each cultivar. Using EFT 345 parameters on data from both dorsal and lateral views is therefore the most 346 suitable approach when aiming to explore morphological variability of domestic 347 shapes from archaeological remains. 348 The analysis of times taken for capturing images of 30 pips using either a scanner 349 or a digital camera has provided additional insights into the efficiency of these 350 two methods, showing some significant differences for both image acquisition 351 methods and subsequent processing times. 352 Obtaining dorsal views of the pips is much faster when using a scanner, requiring 353 only 5 min per 30 pips. However, the digital camera, which provided a more 354 comprehensive dataset from both dorsal and lateral views, and more detailed and

14

355 repeatable images, required a substantially longer time of 30 min. This is mostly 356 due to the time taken to position each individual pip under the microscope. 357 Similarly, the processing phase, involving the formation of outline images of the 358 pips, took differing amounts of time. The scanner images were quickly processed, 359 taking only 1 min per pip. In contrast, the photos took longer to process, 20 min. 360 This extra time is due to the handling of 30 images individually, corresponding to 361 the number of pips to be analysed. 362 These results suggest that the scanner is especially well suited for quickly 363 including many pips in a single image to discriminate between wild and 364 domesticated morphotypes. The significant increase in acquisition time with a 365 digital camera and its ability to record both dorsal and lateral views of the pips is 366 especially worthwhile if the aim is for a more precise description of seed shape, 367 which is needed to analyse diversity within species or between cultivated 368 varieties. 369 Consideration should be given to the fact that these results obtained for grape pips

370 may be different when dealing with other species and different seed shapes.

371 Consequently, similar tests should be done for each newly investigated taxon.

372 **Conclusions**

373 The correct identification of archaeological grape pips allows us to investigate the 374 long history of grapevine domestication. It is known that the morphology of wild 375 grape pips differs from those of cultivated grapes due to the domestication 376 process. Based on these differences, computerised image analysis has obtained 377 excellent results for identifying archaeological grape pips. This study compares 378 different image analysis methodologies, starting with imaging techniques and 379 morphological methods used for the separation of wild from domestic pips and for 380 the identification of individual cultivars. The results have shown that the 381 acquisition method by scan or photo did not affect the good separation of wild 382 from domestic pips. The morphometric data, both traditional and geometric, 383 measured on images obtained from both photos and scans, were able to correctly 384 distinguish between the wild and domestic grapes, achieving very similar overall 385 percentages of correct identification. However, the photos also provided the 386 lateral view of the pips, which in combination with the dorsal view, gave the best

- performance for exploring the morphological variability of cultivated grapevarieties.
- 389 Supplementary Information The online version contains supplementary390 material.
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- 397 germplasm collection which provided pips from modern cultivated varieties used in this
- 398 study.

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485

486 Figure and Table legends

| 487 | Fig. 1 a, diagram of elliptic Fourier transform (EFT), measurement of 160 reference points, (s) |
|-------------------|--|
| 488 | starting point of the outline; b , principal traditional morphometric features (TMf), measurement of |
| 489 | length, width, perimeter and area |
| 490 | |
| 491 | Fig. 2 Comparison of measurement error for the six combinations of acquisition techniques and |
| 492 | morphometric methods with the four grape accessions, names on right. D, dorsal view; L, lateral |
| 493 | view |
| 494 | |
| 495 | Fig. 3 Principal component analysis of morphological variation between grape pip accessions |
| 496 | using a scan of the dorsal view, and using a , TMf; b , EFT. RoussB, cultivar Roussanne; purple |
| 497 | dots, cultivated grape; yellow dots, wild |
| 498 | |
| 499 | Fig. 4 Principal component analyses of morphological variation between grape pip accessions |
| 500 | using a digital camera and TMf and EFT of dorsal (D, a, d), lateral (L, b, e) and both views (D+L, |
| 501 | c, d). RoussB, cultivar Roussanne |
| 502 | |
| 503 | Fig. 5 Bar plot of linear discriminant analysis (LDA) results comparing the performance of image |
| 504 | acquisition techniques (SC, scanner vs DC, digital camera) using either Elliptic Fourier transform |
| 505 | outline analysis or traditional morphometric features for identification; a-d, domesticatd; e-h, |
| 506 | cultivars |
| 507 | |
| 508 | Table 1 Time taken for processing 30 pips |
| 509 | |
| 510 | |
| 511 512 513 | Conflicts of interest The authors have no competing interests to declare that are relevant to the content of this article. |