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**Development of methodology using ATR-FTIR with PCA to determine groups which reflect species used in the making of historical Pacific barkcloth.**

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1 Development of non-destructive methodology using ATR-FTIR with PCA to differentiate between  
2 historical Pacific barkcloth.

### 3 **Abstract**

4 Barkcloths, non-woven textiles originating from the Pacific Islands, form part of many museum  
5 collections and date back to the 18th and 19th centuries. The ability to determine different plant  
6 species which have been used for producing barkcloth is required by art historians to help  
7 understand the origin and use of the cloths and by conservators for whom the species type may  
8 have an impact on textile durability, deterioration and hence conservation. However, to date the  
9 development of a **non-destructive**, robust analytical technique has been elusive. This article  
10 describes the use of Fourier transform infrared spectroscopy with attenuated total reflection (ATR -  
11 FTIR) and principal component analysis (PCA) to-differentiation between historic barkcloths. Three  
12 distinct groups of historic cloths were identified using PCA of the FTIR region between 1200 and  
13 1600 cm<sup>-1</sup> where molecular vibrations associated with tannins and lignins are dominant. Analysis of  
14 contemporary cloths only identified *Pipturus albidus* cloth as different and highlighted the difficulties  
15 around producing a representative textile sample to mimic the historic cloths. While the  
16 methodology does not itself identify species, the use of historically well-provenanced samples allows  
17 cloths showing similarities to group together and is a significant aid to identification.

18 Keywords: Pacific barkcloth; ATR-FTIR; Multivariate analysis; Principal component analysis; species  
19 differentiation; microscopy.

### 20 **1. Research aims**

21 This research aimed to carry out a preliminary trial to determine if a new and reliable method  
22 combining spectroscopy and chemometrics could be developed to differentiate between historic  
23 Pacific Island barkcloth samples. The motivation for this work was driven by a lack of analytical  
24 methods within the heritage science literature on species identification for barkcloth samples, a  
25 preliminary requirement in preservation method development. To achieve this ATR-FTIR was  
26 employed along with multivariate analysis (MVA), specifically principal component analysis (PCA)  
27 and Hierarchical Cluster Analysis (HCA) to distinguish between historic barkcloth samples where the  
28 species used in their manufacture is unknown or where they have been labelled but the date or  
29 validity of the labelling may be in doubt. The innovation lies within the use of MVA to quantify the  
30 relationship between the historic barkcloth samples which ultimately would possibly allow art  
31 historians and conservators to identify selected characteristics, such as species which would lead to  
32 a better understanding of the origins of these barkcloth samples and hence their preservation.

33 Initially contemporary barkcloth samples of known species were investigated to ascertain if a model  
34 for historic cloths could be developed.

### 35 **2. Introduction**

36 Barkcloths, both plain and decorated, from the Pacific Islands form part of many museum collections  
37 worldwide and date back to the 18th and 19th centuries. Western explorers such as Captain James  
38 Cook and botanist Joseph Banks admired the beauty of barkcloth worn by the indigenous peoples  
39 they encountered in their travels [1] and brought examples of these cloths back from their voyages.  
40 Barkcloth is a non-woven cloth which is prepared by stripping the inner bark from young branches,

41 soaking the fibres in either freshwater or saltwater and then beating the bark to form cloths. These  
42 cloths are decorated with differing patterns associated with Pacific Island groups. Until the 19th  
43 century barkcloth was used as a textile for everyday clothing, bedding and soft furnishing as well as  
44 for ceremonial events. The practice in some islands disappeared with the introduction of imported  
45 woven textiles.

46 There are numerous historical and contemporary descriptions of making the cloths, often  
47 stating that they are made from *Broussonetia papyrifera* (BP), commonly called paper mulberry. In  
48 fact a number of species are used but BP is certainly the most prevalent, it has been known for  
49 almost 1,500 years as a plant whose bark can be used to make textiles [2]. Levetin and McMahon [1]  
50 describe the making in Polynesia, explaining the general term for such cloth is tapa (kapa in the  
51 Hawaiian Islands) and, typically, it is made from the inner bark of the paper mulberry. First, the bark  
52 is stripped from the tree in one piece. Next, the outer bark is scraped off. The inner bark of phloem,  
53 or bast fibres, is soaked to soften the fibres and remove impurities. For the finest cloth,  
54 fermentations alternate with soakings to further soften the fibres. The soaking in fresh or seawater  
55 is a process that is usually termed 'retting' and is a commonly used process in industry to remove  
56 the pectin, lignin and hemicellulose from bast fibres [4,5]. The barkcloth makers place strips of  
57 sodden inner bark on a hollowed log or anvil. Strips are overlapped so that, when beaten, they felt  
58 together to form a single large piece of cloth [1]. On some islands wooden beaters are marked with  
59 grooves which impress a pattern on the cloth. A comprehensive account of the making, materials  
60 and geographical origin of Polynesian barkcloth can be found in Larsen [3] where seventy-one  
61 ethnographic sources were reviewed to find cross-cultural variation in Polynesian bark cloth  
62 production. The data is compiled and the processes detailed through each production stage. Larson  
63 [3] reports that in Uvea, Futuna and Ponape the initial preparation of leaching of secondary  
64 compounds and colour through soaking of the bark is not recorded to have been carried out. In the  
65 Cook Islands, Austral Islands, Hawaii Islands and Rapa Nui the inner bark is removed from the outer  
66 bark and left in a stream or the ocean to allow the water to percolate through the fibres. In  
67 Mangareva, Samoan Islands, Tonga and Fiji and Viti Levu the outer bark is removed prior to soaking.  
68 The majority of historical collections record the cloths as being BP [3], though little or no analysis has  
69 been carried out on these cloths to confirm this. However accession records may not have taken  
70 into account the transfer of cloths between islands or indeed errors in recording origin due to lack of  
71 historical documentation and lack of specialist curatorial advice. There is some visual as well as  
72 morphological evidence [6] that cloths may be composed of two fibres.

73 Fig.1A and 1B show examples of contemporary samples from the Smithsonian Institution,  
74 Washington, DC and historic cloths from the Hunterian Museum, University of Glasgow, Glasgow,  
75 and from the Economic Botany Collection, Royal Botanic Gardens Kew, London.

76 To date there has been no straightforward, reliable method to identify the species used to  
77 make the cloths. Those methods used to date have primarily focused on morphology using  
78 microscopy, both light and scanning electron [7], and depend on comparisons of similar and  
79 dissimilar features. While these are often useful methods when executed by experts their weakness  
80 lies in the diagnostic features being robust enough for the analysis to be useful to a wider user  
81 group. The extreme action of the beating process often removes diagnostic features that would  
82 normally be present in more conventionally processed bast fibres. Scharff [6] reported that  
83 misidentification may occur if mixed fibres had been used in the cloth manufacture. DNA analysis  
84 has been used successfully to determine the species used in barkcloth making and also to determine  
85 provenance and authenticity [2,8]. The methodology reported uses around 1cm<sup>2</sup> of material which

86 may not be possible to obtain from museum objects where sampling opportunities are controlled by  
87 the condition of the cloth or the museum policies. Additionally access to such analysis may not be  
88 either financially or logistically feasible.

89 Inner bark, like wood, is composed of holocellulose which includes cellulose and  
90 hemicellulose together termed the carbohydrate fractions, lignin, pectin and a large number of  
91 extractives such as flavonoids and waxes. For the last few decades, wood scientists have used  
92 vibrational spectroscopy, especially Fourier transform infrared spectroscopy (FTIR) with attenuated  
93 total reflection (ATR-FTIR) to characterise the chemistry of wood components, their behaviour and  
94 ageing in various environments [9,10]. The combination of chemical analysis and statistics,  
95 chemometrics, is used to analyse the FTIR spectra in order to determine differences between hard  
96 and soft woods, to differentiate between species and to determine ageing. The variations in the  
97 spectrum where these changes can be detected mainly occur in the fingerprint region 1800-600cm<sup>-1</sup>.  
98 Here small changes, not always visible from spectrum inspection can be teased out by the use of  
99 second derivatives and/or multivariate analysis [11, 12, 13, 14]. Hobro et al. [14] used ATR-FTIR to  
100 determine differences between walnut species and also the effects of steam on the wood. The  
101 spectra were subjected to partial least squares discriminant analysis. The validity of this type of  
102 spectroscopic analysis, especially in its application to qualitative analysis, has been confirmed by a  
103 number of studies. Poletto et al. [15] reported on the structural differences between four wood  
104 species using FTIR and comparing their findings to wet chemistry and thermogravimetric analysis to  
105 determine Klason lignin. FTIR has been employed to distinguish between hard and soft wood by  
106 comparing the differing proportions of cellulose, hemicellulose, lignin and extractives in the two  
107 wood types [16, 17, 18, 19]. It is also used to distinguish between species of new (fresh) wood. Rana  
108 et al. [20] used FTIR, chemical and histochemical methods to characterise differences between wood  
109 and lignin in five wood species from the family Dipterocarpaceae. Wang et al. [21] used FTIR, 2nd  
110 derivative IR and 2D-IR spectroscopy to determine between four species of *Dalbergia* which belong  
111 to the *Fabaceae* family. There have also been a number of studies which employed FTIR to  
112 determine the condition of historic and archaeological woods [9,10,22,23,24]. Pizzo et al. [10] used  
113 ATR-FTIR multivariate PLS analysis to determine differences in how wood had been preserved in  
114 waterlogged conditions and Traoré et al. [9] reported on the use of ATR-FTIR with PCA to highlight  
115 the differences in chemical composition between two archaeological woods.

116 Whilst the methodology was primarily developed for contemporary wood and its  
117 applications [10, 25] the small sample size and minimal sample preparation makes it an excellent  
118 choice for examination of wood based historic objects. Indeed ATR-FTIR allows for non-invasive  
119 analysis of flat objects such as textiles. To date there has been no straightforward, reliable method  
120 to identify the species used to make the cloths.

121

### 122 3. Material and methods

123

#### 124 3.1 Information on the preparation of contemporary samples

125 The analysis focused on the four species: *Broussonetia papyrifera* (BP) (paper mulberry), *Artocarpus*  
126 *altilis* (AA) (breadfruit), *Ficus prolixa* (FP) (banyan) and *Pipturus albidus* (PA) (mamaki) sometimes  
127 called *Pipturus kauaiensis* (PK). Fig. 1A shows examples of contemporary samples from the  
128 Smithsonian Institution, Washington, DC. On visual inspection of the contemporary samples (2012-  
129 2015) it can be noted that samples made from BP and AA appear cream/light brown in colour while  
130 the FP and PA samples appear a much darker brown. The samples of contemporary barkcloth came

131 from the Pacific Islands and were prepared by community scholars who participated in a national  
132 history Research Experiences programme (2012-2015) at the National Museum of Natural History,  
133 Smithsonian Institution, Washington, DC (26). The number of samples was indicative of the number  
134 of cloths made from each species and so the largest number of samples were BP. The first three, BP,  
135 AA and FP all come from the family Moraceae and PA from the family Urticaceae. Table 1 lists the  
136 22 contemporary barkcloth samples used in the study. The differing preparation methods of these  
137 samples reflect the practice of the island or area in which they were made and so samples of the  
138 same species may appear slightly different due to the amount of retting, beating and finishing  
139 (polishing with shells or stones).

140 The conservators and contemporary makers of barkcloth have noted that it is extremely  
141 difficult to produce a good quality sample of PA cloth using commonly used methodology i.e.  
142 stripping, soaking and beating [8,27].

143

### 144 3.2 Information on the historic cloths

145 The 15 historic cloths analysed came from three collections **which are** detailed in table 2. The dates  
146 shown appear on the collections' documentation and their accuracy has not been verified. **The**  
147 **ABDU A4001 and A4006 were labelled at source as mamaki (sometimes labelled mamake) and the**  
148 **Economic Botany Collection (EBC) 42760 (AA) and 42760 (FP), breadfruit and banyan respectively. A**  
149 **number of the other cloths have been labelled retrospectively by curatorial staff and art historians.**

150 **In the main the cloths that were chosen for analysis** were not painted or dyed as the  
151 methodology was dependant on measuring the molecular vibrations of the wood species only and  
152 not those present in the colorants used to decorate the cloths as these may affect the results.  
153 However, where it was clear **based on light microscopy**, that there was no dyeing and only surface  
154 painted decoration had been used samples from the underside of cloths were included. Fig. 1B  
155 shows examples of historic cloths from the Hunterian Museum, University of Glasgow, Glasgow, and  
156 from the EBC, Royal Botanic Gardens Kew, London.

157

### 158 3.3 Experimental Instrumentation

159 Stereomicroscopy was carried out on cloths to examine the fibres and the beaters marks of  
160 the cloths in detail. This was done using a Zeiss stereo-microscope (Stemi SV 11). The images shown  
161 here were not subjected to any further image processing.

162 Fourier transform infrared spectroscopy with attenuated total reflection (FTIR-ATR) was  
163 carried out using Perkin Elmer Spectrum One FTIR Spectrometer with Spectrum software version  
164 5.0.1 and fitted with a Universal ATR Sampling Accessory. The ATR crystal used was a  
165 diamond/thallium-bromiodide (C/KRS-5) with a penetration depth up to 2  $\mu\text{m}$  ATR-FTIR is primarily  
166 a surface technique and the exposed diameter of the crystal was 1.33 mm resulting in a sample area  
167 of around 1.39  $\text{mm}^2$ . 32 scan accumulations were used at a resolution of 4  $\text{cm}^{-1}$ . **Three** replicates  
168 were measured **from unsoiled regions of** each cloth and the average spectrum calculated for use in  
169 subsequent analysis. The spectra were baseline corrected using a linear correction. All subsequent  
170 spectral processing and statistical analysis was carried out using the UnScrambler<sup>®</sup> X Version 10.5  
171 software package. The averaged spectra were smoothed using the Savitzky-Golay polynomial with  
172 order 3 with the smoothed spectra examined to ensure that no important information was lost.

173 Principal Component Analysis (PCA) is a statistical method which reduces large data sets to a  
174 smaller number of components which describe the major differences between the samples. The  
175 region of the FT-IR spectra selected for analysis was 1200  $\text{cm}^{-1}$  to 1800  $\text{cm}^{-1}$  as this is the region

176 where the molecular vibrations associated with the tannins and flavones are predominant and  
177 excludes the large cellulose peak at  $\sim 1000\text{ cm}^{-1}$  which is common to all samples. Prior to PCA analysis  
178 the smoothed spectral data were corrected using the detrend method on Unscrambler<sup>®</sup> with a 2<sup>nd</sup>  
179 order polynomial. The detrend function removes any nonlinear trends from the data and corrects  
180 for any residual baseline curvature. The number of components for the PCA was evaluated by  
181 examining the total variance plot to determine the optimum number of components for each data  
182 set. Plots of the PC scores can reveal clustering of samples which have common features in their  
183 spectra. Interpretation of the scores plots is achieved by examination of the loadings plots in  
184 association with the second derivative spectra alongside the FTIR spectra of the samples.

185 Hierarchical clustering analysis (HCA) was performed to classify the cloths into clusters with  
186 the aim of understanding the closeness of the relationships between cloths by measuring the  
187 distance between samples. Here this was achieved by partitioning the data into three groups using  
188 complete linkage clustering and measuring the Euclidean squared distance between the groups. The  
189 results of this analysis are presented visually in a dendrogram.

#### 190 **4. Results and discussion**

191

192 Stereomicroscopy alone can give a good indication of the fibres and their characteristics. Fig.  
193 2 shows images of two cloths from the Hunterian collection E380-1 and E596-3 and the detail of  
194 these at two magnifications. There is some anecdotal evidence that cloths may be composed of two  
195 fibres [6] and this is also the conclusion drawn by these visual examinations. It is clear that E380-1 is  
196 composed of mixed fibres with the darker fibre presumably incorporated into the lighter wood  
197 during the beating process. However, E596-3 is a typical cream/white cloth made from only one  
198 species and in this case the striped effect is a slight variation in colour due to the beater's marks. But  
199 this is the limit of the information that stereomicroscopy can give when used to view a cloth.

200 From the contemporary barkcloth spectra (Fig.3A) it is clear that the spectrum for the  
201 mamaki cloth (PA T73) is different with clear peaks shown at  $1603$ ,  $1315$  and at  $779\text{ cm}^{-1}$ . The peaks  
202 can be attributed to a combination of the C=C stretching of the aromatic ring [28, 29], C-O vibration  
203 in syringyl derivatives [30,31] and  $\text{CH}_2$  bending and stretching [32] of the associated polysaccharides  
204 [25,3,34] respectively. Falcão and Araújo [34], stated that the intense band at  $1325\text{ cm}^{-1}$  (O-H  
205 deformation vibration) that can overlap with a C-O-C stretching vibration around  $1310\text{ cm}^{-1}$ , and the  
206 band at  $762\text{ cm}^{-1}$  (sugar ring, breathing vibration) is consistent with the presence of hydrolysable  
207 tannins. Many of the differences observed for this spectrum may be attributed to mamaki cloth  
208 being more highly coloured than the other cloths suggesting a higher concentration of aromatic  
209 groups. This is confirmed by the high intensity of the peaks associated with C=C stretching of the  
210 aromatic ring at  $1600$  and  $1450\text{ cm}^{-1}$ . Table 3 assigns the peaks identified.

211 Various attempts were made to try and find a suitable region within the ATR-FTIR spectra  
212 with which to perform PCA with each attempt failing to separate the contemporary cloths into  
213 distinct groups. The exceptions to this were the mamaki samples which were very different to the  
214 others and indeed were identified as outliers by the statistical analysis. Removing these points did  
215 not elucidate any distinct groupings for the other cloths. One of the reasons for this may be the  
216 difficulty in reproducing the retting process of the barkcloth which can be followed by the  
217 disappearance of the carbonyl (C=O) peak at around  $1735\text{ cm}^{-1}$  which is associated with pectin and  
218 hemicellulose [4]. For the historical cloths there is little evidence of this stretch in the spectra  
219 (Fig.3B) [26,32] confirming that these cloths have been subjected to a retting process. This is in

220 contrast to that observed for the contemporary barkcloth samples (Fig. 3A) indicating that perhaps  
221 the manufacture of these reconstructions varied greatly and some methods did not fully remove  
222 these components. In addition, the age of the historic cloths may have also contributed to this  
223 decrease. The clear spectral differences between contemporary and historic cloth of the same  
224 species and the difficulty in recreating aged barkcloth have led to the conclusion that no useful  
225 information can be obtained by further statistical evaluation of the contemporary barkcloth  
226 samples.

227 Fig. 3B shows the ATR-FTIR spectra of the historic cloths. The main visual difference between  
228 the spectra is observed in the position of the spectral band between  $1600\text{ cm}^{-1}$  and  $1650\text{ cm}^{-1}$ . The  
229 changing spectral position is most likely due to changing intensities of spectral bands underneath the  
230 broad spectral peak at this position. Peaks in this region are associated with the C=O stretching of  
231 the flavones, O-H stretching and C=C stretching of the aromatic rings [28, 29, 32, 36, 37, 38, 39]. In  
232 all cloths the broad peak observed at  $\sim 1000\text{ cm}^{-1}$  is mainly due to cellulose and hemicellulose [32,  
233 40]. Overall visual inspection of the ATR-FTIR spectra is insufficient to elucidate any appreciable  
234 differences between the barkcloth samples. Although changes to the peak positions in the  $1800 -$   
235  $1450\text{ cm}^{-1}$  spectral region are observed it was difficult to obtain any clear and consistent definition  
236 between the samples (Fig. 3B). Principal component analysis (PCA) was then employed to  
237 determine if differences between the samples could be highlighted within a statistical model [11, 37,  
238 40].

239 Initially the number of principal components required to fit the data was determined from  
240 evaluation of the explained variance plot which suggested that 4 PCs were required to explain 97%  
241 of the variance in the data set. In fact 81% of the overall variance can be explained by the first 2  
242 components. Fig. 4 shows the scores plot for the first two principal components obtained for PCA  
243 analysis of the historic cloths with 56% of the data described by PC1 and 25% by PC2 and no outliers  
244 identified. Inspection of the scores plot clearly shows that the data splits into 3 well identified  
245 groups where in each grouping we have an indication of the species of some cloths based on art  
246 historical and curatorial documentation. The group circled in blue are cloths containing mamaki fibre  
247 and the group circled in red are composed of either breadfruit or banyan based on our confidence in  
248 the labelling of these cloths at source. The final group outlined in green contains cloths which are  
249 thought to be paper mulberry based on curatorial labelling which we are confident is correct but  
250 has not been verified as having been labelled at source. Examination of the spectral loading line (Fig.  
251 5) for PC1 and PC2 allows interpretation of the data when viewed along with the FTIR and the  
252 second order derivative spectra (Fig. 6). Fig. 6A shows the spectra for two cloths which separate  
253 along the PC1 score axis while Fig. 6B gives the spectra for two cloths which separate along the PC2  
254 axis. The PC1 loadings plot (Fig. 5) has a maximum positive value at  $1606\text{ cm}^{-1}$  which aligns with the  
255 broad peak in the FTIR spectra (Fig. 6Ai) which shows a clear difference for the spectra plotted  
256 suggesting that PC1 is separating cloths based on C=C stretching of the aromatic ring and the C=O  
257 stretching of polyphenol compounds both of which are observed in this region. The C=C stretching  
258 can be assigned to the tannins in the wood [41] and the C=O to the lignin and tannins which are  
259 composed of highly branched polyphenolic macromolecules. This can make determination of  
260 changes in lignin over time difficult to detect using FTIR alone. However, the differences in tannin  
261 content may be very useful in determining differences between the species as it is clear from visual  
262 examination that the amount of 'colour' present in the species of interest varies. It is likely that  
263 shifting of the peak position here is due to the changing intensities of the molecular vibrations  
264 identified in this region. The broad negative peak for the PC1 loading centred at  $1482\text{ cm}^{-1}$  does not



265 identify with a peak in the FTIR spectrum. However, close examination of the 2nd derivative (ringed  
266 in Fig. 6Aii) clearly shows differences in this region. In fact E591-4, which has positive score for PC1  
267 has a positive peak in this region whereas 73329 has a negative peak and the negative score (Fig. 4).  
268 This spectral observation is as a result of subtle peak shifts in this region of the spectrum which the  
269 2nd derivative is clearly sensitive to and does not correspond to an actual peak in the FTIR spectrum.  
270 However, there is clear evidence from Fig. 5 that the PCA analysis is sensitive to changes in this  
271 region.

272 From the loadings plot for PC2, an increase in the peak at  $1518\text{ cm}^{-1}$  is correlated with a  
273 decrease in the peak observed at  $1426\text{ cm}^{-1}$ . Given the positive value for the blue group this would  
274 suggest that this component is strongly influenced by the aromatic stretching in  $1518\text{ cm}^{-1}$  region  
275 between the C=C of the benzene ring (table 3). This is also observed in the 2nd derivative spectra  
276 (Fig. 6Bii) where a negative peak is noted for E380-1 along with a positive score for PC2 (Fig. 4) and a  
277 positive peak in the 2nd derivative spectra alongside a negative score for E417-1. This may be  
278 consistent with the concentration of coloured aromatic components associated with cloths made  
279 from specific species. Overall score plots containing higher principal components did not reveal any  
280 further clear grouping for the historic cloths.

281 Therefore, by examination of the PC loadings plots alongside the 2nd derivative spectra it is  
282 possible to identify the differences in the FTIR spectra which are responsible for the groups  
283 identified in the PCA score plots in Fig. 4.

284 In order to further analyse the results obtained from PCA, HCA was performed with the  
285 dendrogram obtained given in Fig.7. The three clusters identified align perfectly with the groupings  
286 obtained in the PCA analysis. Interesting the cloths, E380-1 ABU4001, ABU4006 form a close linkage  
287 which also connects into the large group of cloths which are thought from historical records to be  
288 paper mulberry. This association could be due to the use of two species, including paper mulberry,  
289 in the preparation of these cloths and perhaps strengthens the visual evidence which suggested that  
290 these cloths form a striped pattern of two different coloured barks.

291

## 292 **6. Conclusions**

293

294 In this preliminary study of contemporary and historic bark cloth multivariate analysis of FTIR spectra  
295 in the  $1200\text{-}1600\text{ cm}^{-1}$  region has been shown to be useful in grouping historical barkcloths  
296 originating from different species. PCA analysis identified three groups for the historical cloth with  
297 the loading plots highlighting where the differences between the FTIR spectra are predominant for  
298 each PC. In addition, employing HCA to analyse the data identified the cloths which have a close  
299 relationship to each other and showed a clear link between the cloths which are thought to be  
300 composed of mixed fibres. This shows the usefulness of this statistical technique to historic bark  
301 cloth analysis. This knowledge would add significant information to museum collection records both  
302 in terms of curatorial as well as conservation practice. An additional advantage of this technique is  
303 that a scientist with FTIR experience could reliably determine different grouping of barkcloth species  
304 using this methodology, it is not dependant on specialist knowledge of plant anatomy.

305 However, no useful information was obtained from the contemporary barkcloth samples to  
306 inform the model.

307 It should be noted that the presence of added colourants may affect the ability of FTIR, a  
308 vibrational spectroscopy technique, to differentiate between species' differences and cloths where  
309 pigments have been added need more careful analysis. Light microscopy of the cloths helps to

310 determine if and how colourants have been applied and is therefore a useful preliminary step before  
311 undertaking FTIR.

312

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321

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## Figure titles

Fig. 1A.

Contemporary barkcloth samples A) *Broussonetia papyrifera*, (B) *Artocarpus altilis*, (C) *Ficus prolixa* and D) *Pipturus albidus* .

Fig. 1B.

Historic cloths A) Hunterian Collection E417/1 (size 1010mm x 684mm), B) Royal Botanic Gardens Kew Economic Botany Collection 42760 labelled banyan and breadfruit (60mm x 55mm, 65mm x 45mm) C) Hunterian Collection E380-1 (size 185mm x 200mm)

Fig. 2.

Images and stereomicroscopy at two magnifications of E380/1-A, B and C and E596/3-D, E and F.

Fig. 3.

A.ATR-FTIR spectra of contemporary barkcloth samples 2071958 *Broussonetia papyrifera*, 2071958 *Artocarpus altilis*, 2071958 *Ficus prolixa* and T73 *Pipturus albidus* .

B. ATR-FTIR spectra of historic clothes Hunterian Collection E417/1, Royal Botanic Gardens Kew Economic Botany Collection AA 42760 and FP42760 and Hunterian Collection E380/1.

Fig.4.

PCA of historic barkcloths from four collections, PC1 v PC2 showing 3 groupings

Fig.5.

Loadings of PC1 and PC2.

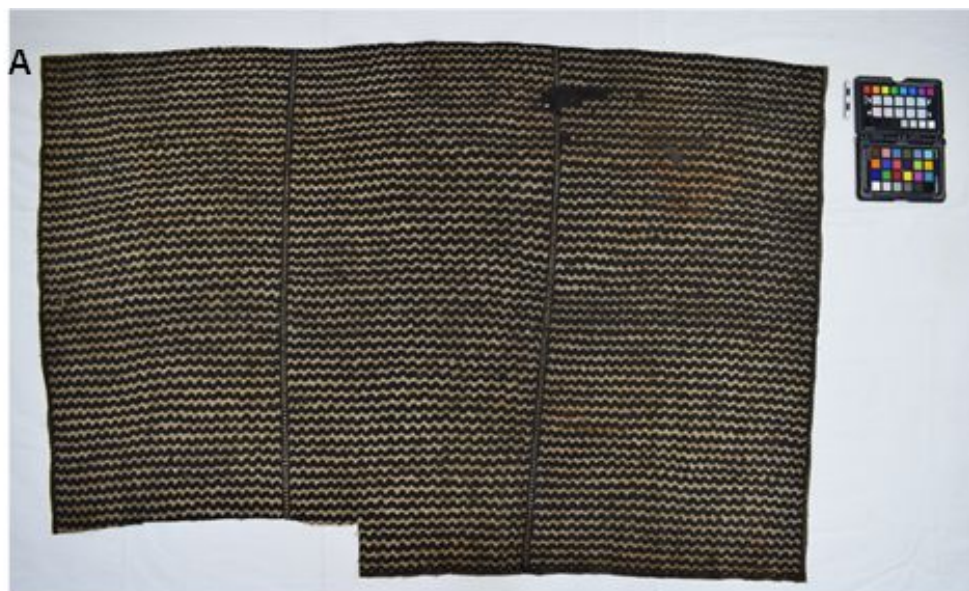
Fig.6.

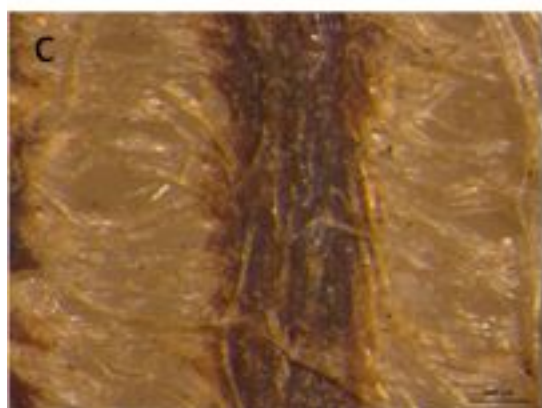
Spectra (i) and 2<sup>nd</sup> derivative (ii) 1800-1500cm<sup>-1</sup>A. 73329 and E591/4 differentiated along PC1. B. E380/1 and E417/1 differentiated along PC2.

Fig.7.

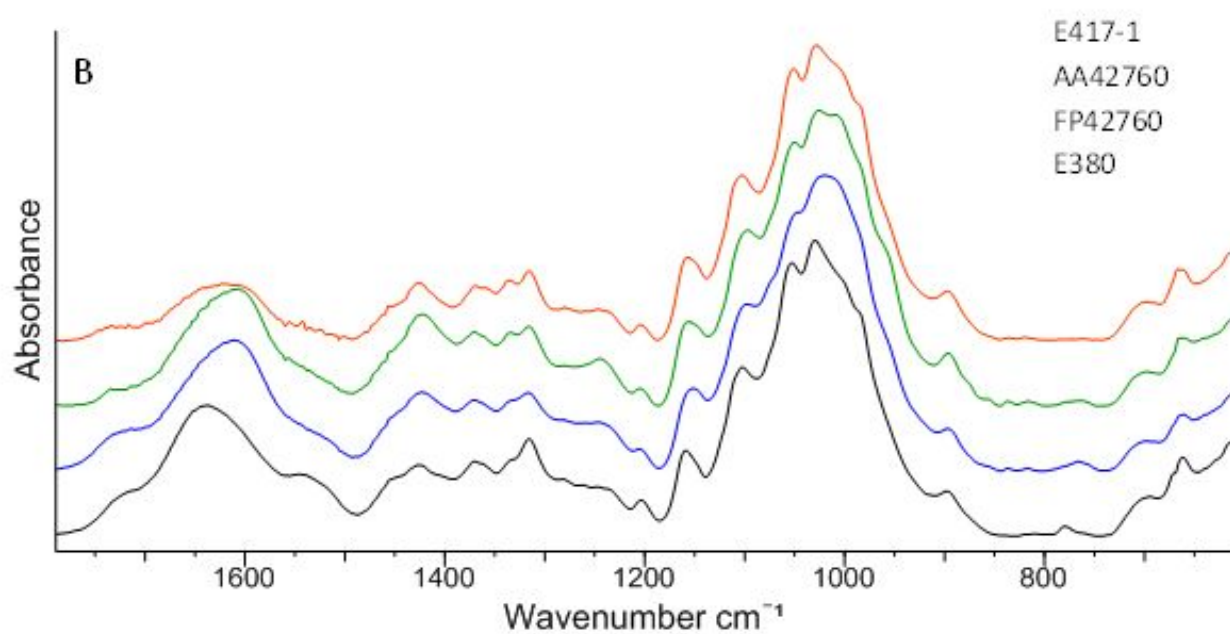
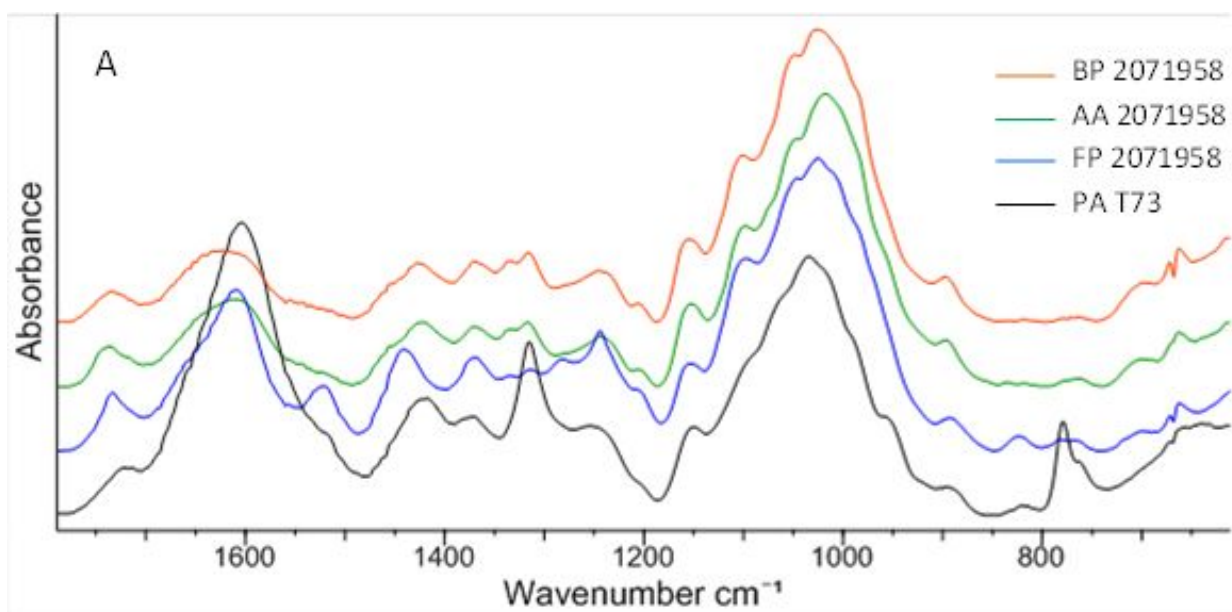
Dendrogram showing three clusters identified.



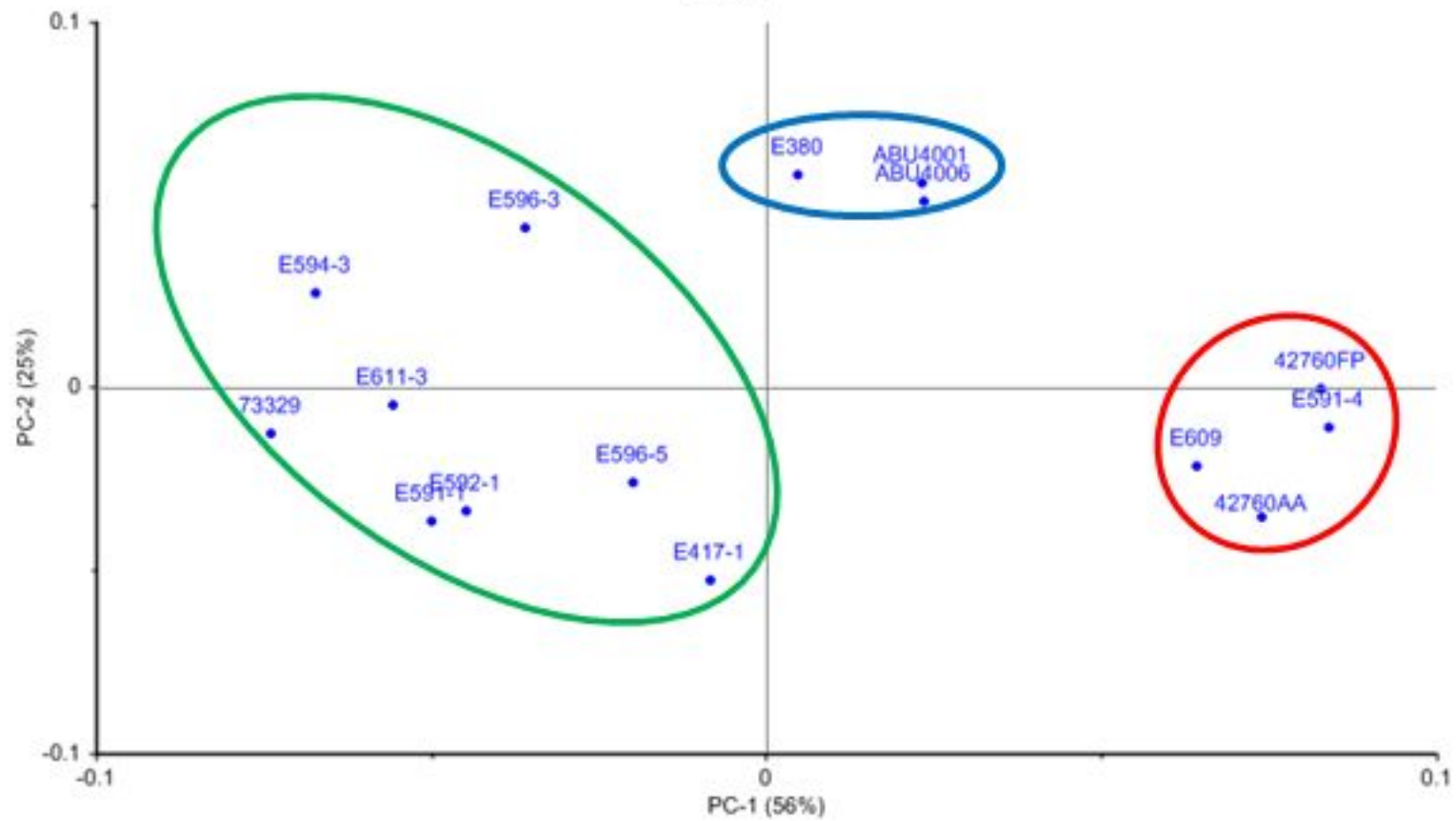




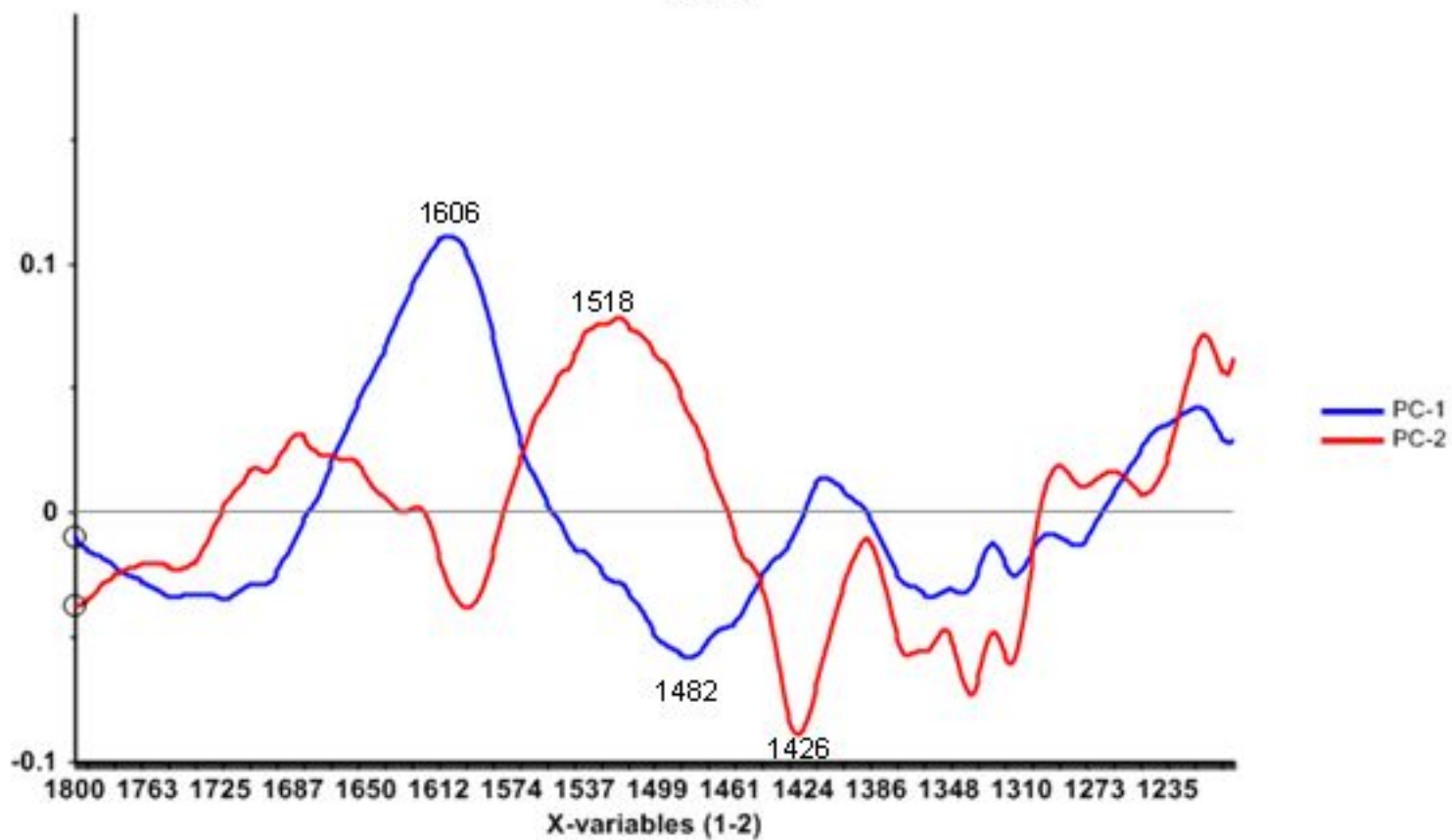


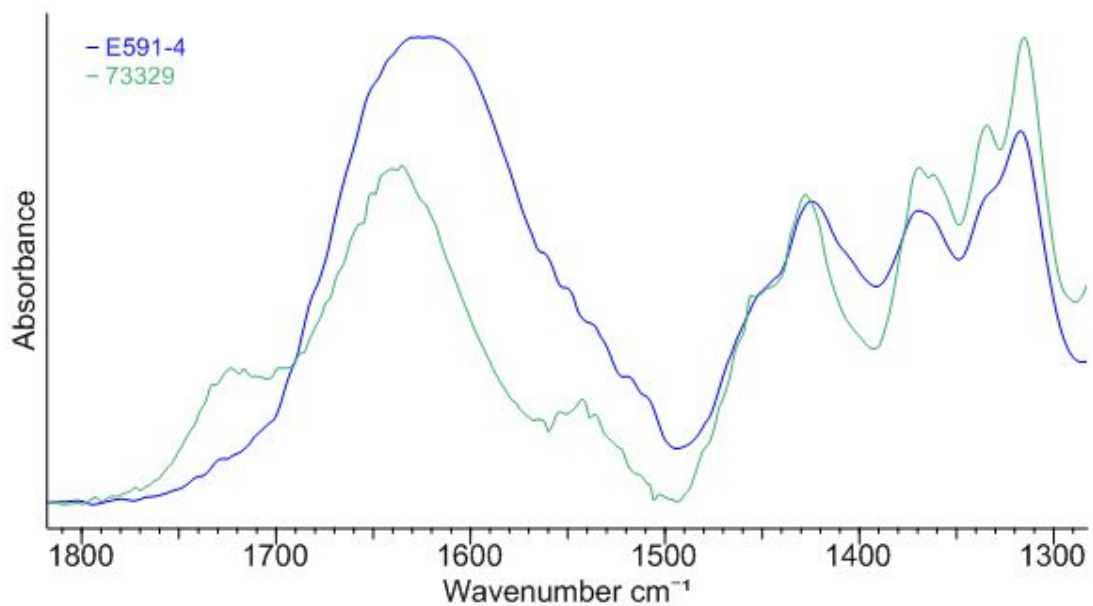
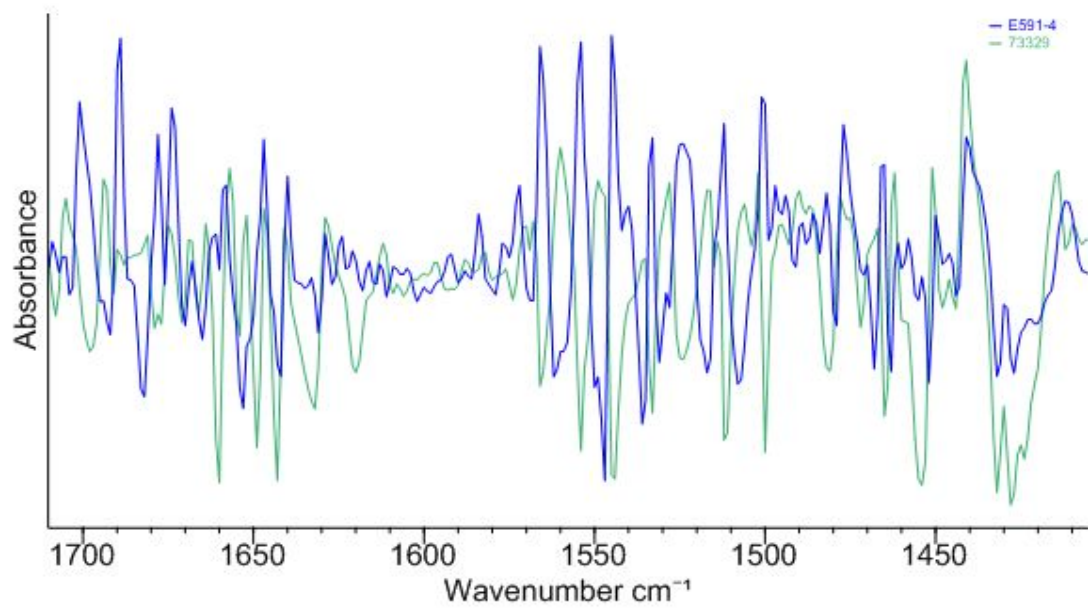


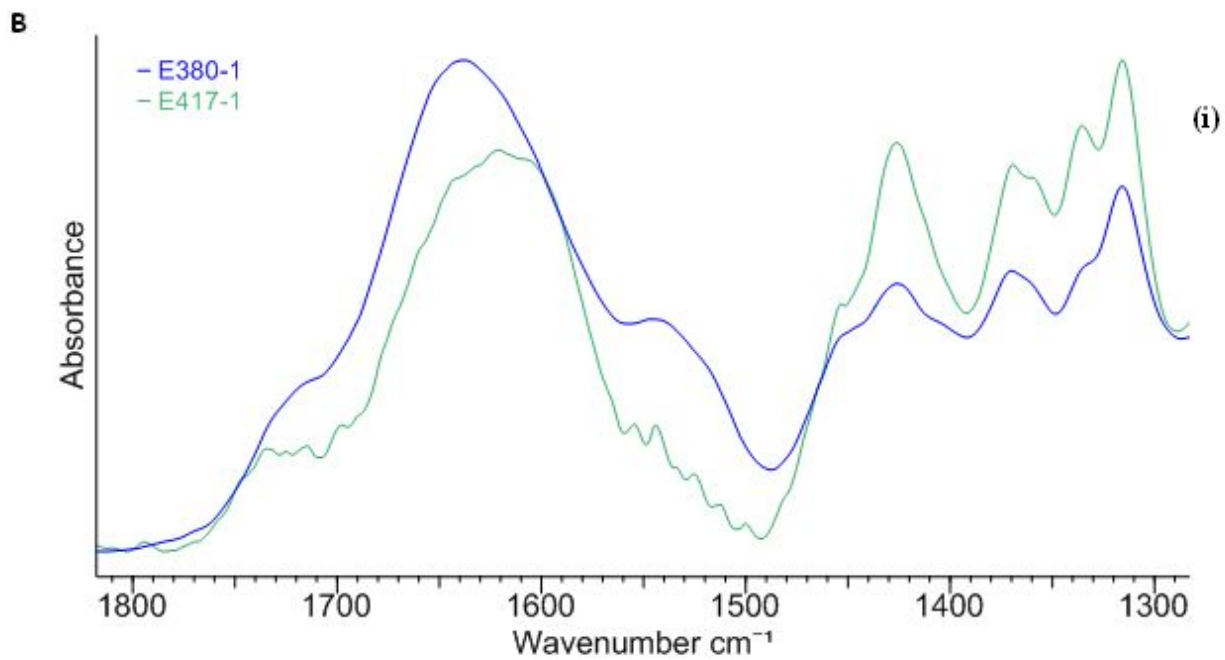
Scores



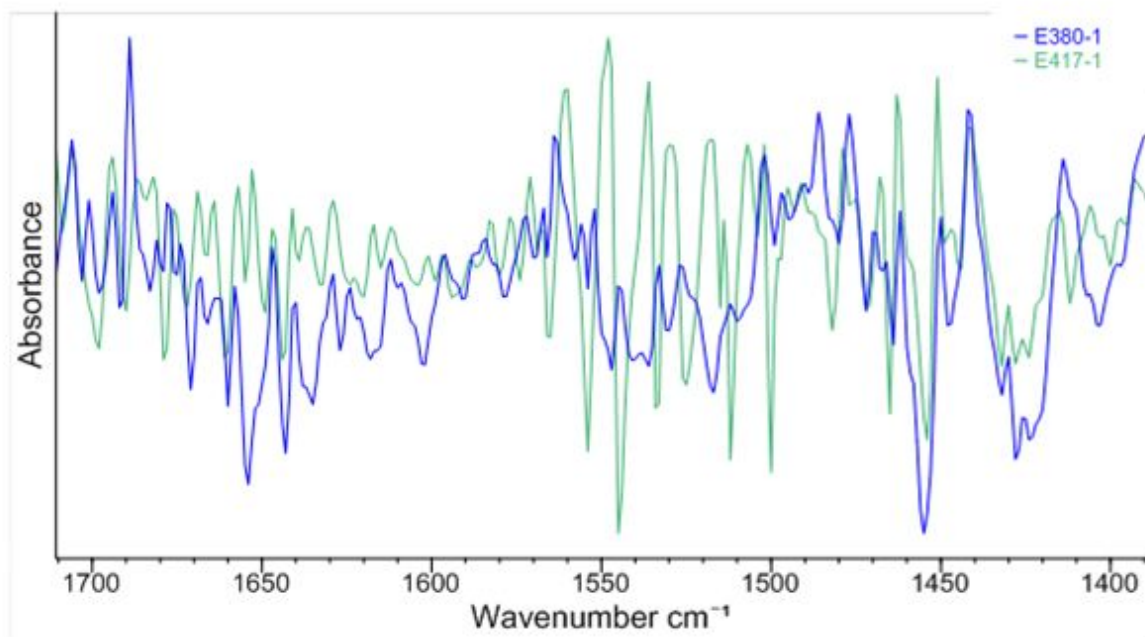
Loadings



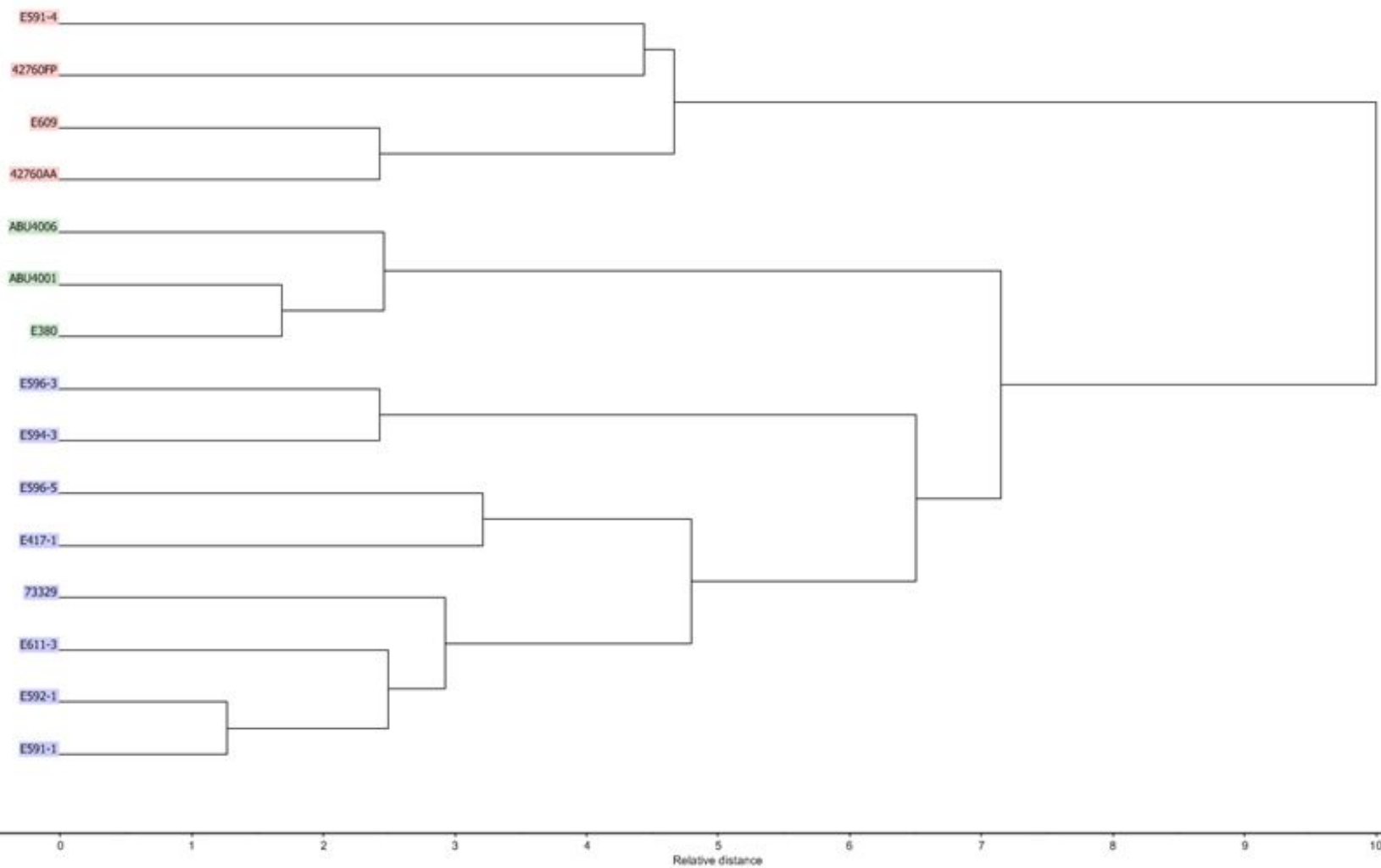
**A****(i)****(ii)**



(ii)



Complete linkage clustering using Euclidean distance



Contemporary barkcloth samples	Accession number	Origin	Donation/ accession date
BP	2069806	American Samoa	2013
BP	2071953	Kingdom of Tonga	2015
BP	2071958	Marquesas Island	2014
BP	T15	Suitland, MD	2013
BP	T16	Suitland, MD	2013
BP	T74	Tonga	
BP	T75	Tonga	
BP	T77	Tonga	
BP	T80	Easter Island	2014
BP	T82	Easter Island	2014
BP	T83	Easter Island	2014
AA	2071958	Marquesas Island	2014
AA	T14	Hawaii	2012
AA	T19	Hawaii	2012
AA	T76		
AA	2069812	Cook Islands	2014
FP	2071958	Marquesas Island	2014
FP	2069812	Cook Islands	2014
PA	T21	Hawaii	2012
PA	T23	Hawaii	2012
PA	T73 (beaten)	Hawaii	
PA	T73 (more beaten)	Hawaii	

Table 1 Contemporary barkcloth samples supplied by Smithsonian National Museum of Natural History, Washington, DC, *Broussonetia papyrifera* BP; *Artocarpus altilis* AA; *Ficus prolixa*; *Pipturus albidus* PA.

<b>Collection</b>	<b>Accession number</b>	<b>Origin (tentative)</b>	<b>Donation date</b>
Hunterian Museum	E380-1	Hawaii	1826
	E417-1	Samoa	1783
	E591-1	Tahiti (attribution)	1809
	E591-4	Polynesia	1809
	E592-1	Samoa (attribution)	1689
	E594-3	Tahiti (attribution)	NA
	E596-5	Tahiti (attribution)	NA
	E596-3	Tahiti (attribution)	NA
	E609	Tahiti (attribution)	NA
	E611-3	Hawaii (attribution)	NA
Economic Botany Collection	42760 (AA)	Solomon Islands	1929
	42760 (FP)	Solomon Islands	1929
	73329	Tahiti	1874
University of Aberdeen Museums	ABDUA4001	Hawaii	NA
	ABDUA4006	Hawaii	NA

Table 2 Historic barkcloths (Not available NA)



Wavenumber Range (cm <sup>-1</sup> )	Band and Assignment	References
1740 - 1720	Xylan C=O and hemicellulose C=O stretch unconjugated ketones, carbonyls and in ester groups (frequently of carbohydrate origin) and aliphatic groups (xylan)	[28, 30, 39, 35]
1650 - 1635	Water associated with lignin or cellulose and conjugated C-O C=O stretching in flavones	[28, 29, 32, 36]
1630 - 1610	Assigned to tannins C=C associated with aromatic bond of condensed tannins C=O stretching in flavones C=O stretching flavonoids (extractives)	[4, 37, 38, 39, 41]
1610 - 1590	C=C stretching of aromatic ring	[28, 29]
1520 - 1500	Aromatic skeletal vibration plus C=O stretch Aromatic skeletal vibration C=C characteristic of lignin C-C stretch bands within ring skeleton	[15, 20]
1450	C=C associated with aromatic bond of condensed tannins	[38]
1420 - 1430	Aromatic skeletal vibrations, C-H plane deformation of cellulose C-H deformation in lignin and carbohydrates CH <sub>2</sub> scissoring in lignin and carbohydrates	[32, 43, 44]
1375	C-H in plane deformations for polysaccharides	[40]
1330 - 1310	C-O vibration in syringyl derivatives Condensation of guaicyl unit, syringyl unit and CH <sub>2</sub> bending, stretching	[30, 31] [32]
1270 - 1260	Guaicyl ring and C-O stretch lignin and xylan	[38]
1230 - 1220	C-O-C stretching in phenol-ether bonds of lignin Syringyl ring and C-O stretch in lignin and xylan	[32] [39]
1175 - 1155	C-O-C antisymmetric bridge stretching vibration in cellulose and hemicellulose C-O-C stretching in pyranose rings, C=O stretching in aliphatic groups	[32, 40]
1140	Aromatic C-H in-plane deformation; typical for G units,	[28, 29]
1030	C-O deforming in secondary alcohols and aliphatic ethers	[32]
900 - 895	Cellulose , C-H stretching out of plane of aromatic rings	[32]
850 - 835	Aromatic C-H out-of-plane deformation (extractives and lignin)	[39]
820 - 775	Vibrations of the C-H bonds in benzene rings Vibrations of galactans	[27, 33, 34]

Table 3 Characteristic infrared bands for wood.

Table 1 Contemporary barkcloth samples supplied by Smithsonian National Museum of Natural History, Washington, DC, *Broussonetia papyrifera* BP; *Artocarpus altilis* AA; *Ficus prolixa*; *Pipturus albidus* PA.

Table 2 Historic barkcloths (Not available NA)

Table 3 Characteristic infrared bands for wood