1 **Title:** Arabica-like flavour in a heat tolerant wild coffee species

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14 Abstract

There are numerous factors to consider when developing climate resilient coffee crops, 15 16 including the ability to tolerate altered climatic conditions, meet agronomic and value chain criteria, and satisfy consumer preferences for flavour (aroma and taste). We evaluated the 17 18 sensory characteristics and key environmental requirements for the enigmatic narrow-leaved coffee (*Coffea stenophylla*), a wild species from Upper West Africa<sup>1</sup>. We confirm historical 19 reports of a superior flavour<sup>1-3</sup>, and uniquely and remarkably, reveal a sensory profile 20 analogous to high quality Arabica coffee. We demonstrate that this species grows and crops 21 22 under the same range of key climatic conditions as (sensorially inferior) robusta and Liberica coffee<sup>4-9</sup>, and has a mean annual temperature 6.2–6.8°C higher than Arabica coffee, even 23 under equivalent rainfall conditions. This species substantially broadens the climate envelope 24

for high quality coffee, and could provide an important resource for the development ofclimate resilient coffee crop plants.

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28 Main

Coffee is a ubiquitous beverage that drives a multibillion dollar global coffee industry<sup>10</sup>, 29 supports the economy of several tropical countries, and provides livelihoods for more than 30 100 million coffee farmers<sup>11</sup>. Despite its global success, the coffee supply chain is beset with 31 challenges, including cyclic price volatility, extreme weather events, increases in the 32 33 prevalence and severity of pests and diseases, and even modern-day slavery. In addition to these constraints and issues, and compounding them, are the negative influences of 34 accelerated climate change<sup>12</sup>. Successful coffee farming occurs within a relatively narrow 35 climatic envelope and is susceptible to weather perturbations throughout its growth and life 36 cycle, rendering it sensitive to climate change. Future-proofing the supply chain under 37 climate change is seen as a major objective for the coffee sector, but so far there has been 38 limited progress. There are three main resiliency pathways for coffee: (1) the relocation of 39 coffee farming to areas with suitable climates, especially to higher elevations; (2) adapting 40 coffee farming practices (e.g. the use of irrigation, shade or improved shade, cover mulching, 41 etc.); and (3) the development of either adapted coffee crops cultivars (via plant breeding) or 42 the use of new coffee crop species. Relocation of coffee farming to higher elevations offers 43 44 considerable long-term potential for high elevation coffee producing countries, such as Ethiopia, but there are disadvantages, including competing land use and loss of livelihoods 45 for lower elevation farming communities<sup>4</sup>. Irrigation is effective against low rainfall, and 46 other farm adaptation interventions may offer some potential; both imply additional costs. 47 Progress on breeding climate resilient coffee crop plants is at an early stage, with attention 48

49 focused on the two main coffee crop species, Arabica (*Coffea arabica*)<sup>13</sup> and robusta (*C*.
50 *canephora*)<sup>14</sup>.

In 2019/20 Arabica contributed c. 56% of global production, robusta 43%, and 51 Liberica coffee (*C. liberica*) less than  $1\%^{10}$ . Within the context of long-term climate change, 52 it has been argued that Arabica alone does not have the potential to attain the level of climate 53 resiliency required for adaptation<sup>15</sup> under existing climate change projections<sup>12</sup>. Arabica is a 54 cool-tropical plant, originating from the highlands (1,000–2,200 m) of Ethiopia and South 55 Sudan<sup>16</sup>; in the wild and in cultivation is has an optimum mean (annual) temperature range of 56 18–22°C<sup>5,6</sup>. For Arabica, there appears to be no evidence of climate partitioning, or useful 57 (physical or physiological) climate resilience attributes, over its indigenous range or in 58 cultivation<sup>5,7,17</sup>. Robusta coffee is a predominately low elevation species (50–1,500 m), 59 occurring naturally across much of wet-tropical Africa<sup>18</sup>, and is adapted to higher mean 60 temperatures of  $24-26^{\circ}C^{\circ}$  or perhaps even higher to  $30^{\circ}C^{\circ}$ . It is also resistant to the prevalent 61 strains of coffee leaf rust (Hemileia vastatrix Berk. & Broome), a serious constraint for 62 Arabica farming in Central and South America. For these reasons, robusta is often mooted as 63 the replacement species for Arabica under a scenario of increasing temperatures and 64 declining and increasingly erratic rainfall. However, robusta may require as much or more 65 rainfall (soil moisture) as Arabica, relative to other climate variables (e.g. air temperatures), 66 67 and could be more temperature sensitive than previously supposed ( $\leq 16.2-24.1^{\circ}$ C under a revised estimate of optimal range<sup>9</sup>). There is a well-defined price difference between the two 68 species, with Arabica achieving higher prices<sup>10</sup> due to its superior taste. Robusta and Liberica 69 are excluded from the higher value specialty coffee sector, which is currently the sole 70 71 preserve of Arabica. Coffea eugenioides, a very minor crop species, has an excellent flavour and has started to gain attention as a niche-market, high-end coffee, but its seeds (coffee 72 beans) are small (less than half the size of Arabica seeds) and yields are low<sup>19</sup>. 73

Amongst the other 120 coffee species<sup>15</sup> there are numerous species able to grow in warmer and drier environments relative to Arabica, robusta and Liberica, and some markedly so<sup>18</sup>. So far, however, none of these species have demonstrated the required flavour and agronomic attributes for wide-scale commercial success.

78 In this respect, C. stenophylla (hereafter given as stenophylla), a species endemic to Guinea, Sierra Leone, and Ivory Coast (Fig. 1), is of considerable interest<sup>1</sup>. Several historical 79 references (1834–1929) indicate that this species has an excellent taste<sup>1</sup>, as good as 'best 80 Mocha<sup>2</sup>, and possibly superior to all other coffees, including Arabica<sup>3</sup>. However, given 81 their age and context, these claims have been heavily caveated<sup>1</sup>, and sensory praise for this 82 species has not been universal $^{20}$ . In its native habitat, stenophylla is a species of low elevation 83 (c. 400 m), hot-tropical environments. It is also reported to be drought tolerant and have 84 85 partial resistance to coffee leaf rust, as reviewed by Davis et al.<sup>1</sup>. The seeds of stenophylla are about the same size or slightly smaller than Arabica. 86

There has been no published sensory information for stenophylla since the 1920s, 87 probably due to its scarcity in cultivation and rarity in the wild: it has not been in general 88 cultivation since the 1920s<sup>1</sup>, and is threatened with extinction in the wild<sup>15</sup>. Poor yield has 89 been given as the main reason stenophylla failed to become established as a major global 90 coffee crop species<sup>21</sup>, although competition from robusta coffee, whose early progress 91 92 towards becoming a global commodity coincides with the decline of stenophylla farming, is likely to be a major contributing factor<sup>15</sup>. Based on the number of flowers/fruits per node and 93 shoot, stenophylla yields are likely to be less than Arabica and robusta, although 94 commercially viable yields are evident<sup>1,20</sup>. 95

Following the rediscovery of wild populations of stenophylla in Sierra Leone in
2019<sup>1</sup>, in May 2020 we obtained a sample of wild-collected stenophylla coffee beans (seeds)
from Sierra Leone. A second sample was obtained in October 2020, via the *Coffea* Biological

99 Resources Center (BRC *Coffea*) on Reunion Island (originally collected from the forests of
100 eastern Ivory Coast). These samples and other accessions were evaluated by five
101 professional, independent sensory panels, using two protocols (see Methods and
102 Supplementary Information), in mid to late 2020 and early 2021.

In a sensory evaluation employing the CIRAD protocol (four panels and 15 judges) a 103 high overall quality score was awarded for stenophylla. Two Arabica samples, one of high 104 105 quality (from Ethiopia) and one of medium quality (from Brazil), and one high quality robusta sample (from Indonesia), were used as the controls (Fig. 3). The evaluation was 106 107 blind, i.e. the name and origin of the samples was unknown to the judges. The evaluation revealed that stenophylla has a complex flavour profile (Supplementary Tables 1–3), natural 108 sweetness (Supplementary Table 3), medium-high acidity, fruitiness, and good body, as in 109 110 higher quality Arabica (Fig. 3; Supplementary Figs. 1 & 2; Supplementary Table 1). When asked if the four samples represented Arabica, 81% of the (15) judges said 'yes' for 111 stenophylla, compared to 98% for Arabica from Ethiopia, 44% for Arabica from Brazil, and 112 7% for robusta from Indonesia (Fig. 4; Supplementary Table 4). Despite the high Arabica-113 like percentage score for stenophylla, 42% of the judges identified the sample as something 114 new; 58% did not (Fig. 4; Supplementary Table 4). The difference in the scores for the 115 Ethiopia vs. Brazil samples, do not infer substantive differences in intrinsic quality. Arabica 116 cultivated in Brazil can attain high quality; Ethiopian-grown Arabica can be of lower quality. 117 Three judges from a fifth panel, using the sensory protocol and scoring system of the 118 Specialty Coffee Association (SCA), identified the sample of stenophylla from Sierra Leone 119 (sample (5)) as Arabica-like. The panel leader awarded a (consensus) specialty score (SCA) 120 of 80.25. Specialty coffee refers to high quality Arabica, and requires a score of 80 points or 121 higher. This was remarkable, given the size of the sample (10g), crudeness of processing and 122 lack of either domestication or pre-farm selection (i.e. the sample was from wild plants, 123

selected at random). Positive attributes conferred by the panel using the SCA protocol 124 included: a fragrance [i.e. the smell of the dry, ground coffee] reminiscent of washed African 125 Arabica, close to a Rwandan profile, and other characteristics associated with quality 126 Arabica, including sweetness and fruit driven acidity (E. Chodarcevic pers. comm.). 127 Across the two protocols, the judges identified a complex range of tasting notes<sup>22</sup> for 128 stenophylla (Supplementary Table 3), including those popular or desirable in high quality 129 130 Arabica, including: stone fruit (peach), soft fruits (blackcurrant, mandarin), honey, light black tea, jasmine, spice, floral, chocolate, caramel, nuts, English candy, and elderflower syrup. 131 132 Negative notes were given by some judges, e.g. fermented, medicinal, soup (Supplementary Table 3), although the main negative attributes were not pronounced (Fig. 3), or significant in 133 a statistical test (Supplementary Table 1). Further details of the sensory analyses are given in 134 Supplementary Information. 135

These results provide the first credible sensory evaluation for stenophylla coffee, from
which we are able to: (1) corroborate historical reports of a superior taste (see above); (2)
demonstrate a complex and desirable flavour (aroma and taste); and (3) reveal a flavour
profile analogous with high quality Arabica coffee.

The sensory similarity with Arabica is surprising, and remarkable, because
stenophylla does not have a close phylogenetic relationship with Arabica<sup>23,24</sup>; populations of
indigenous Arabica and stenophylla occur on opposite sides of the African continent,
separated by a distance of c. 4,800 km (Fig. 1); the environmental requirements of these two
species are very different (Fig. 2); and their seed (coffee bean) chemistry is not the same<sup>25,26</sup>,
although some of the key chemical constituents are shared.

Trigonelline and sucrose, two coffee aroma precursors, are suggested as among the
 main chemical constituents relating to consumer preference for Arabica<sup>27</sup>. Levels of
 trigonelline in stenophylla are similar to Arabica, and both species have considerably greater

amounts than robusta; the sucrose content of stenophylla is reported to be greater than 149 robusta, but less than Arabica<sup>27</sup>. Kahweol, a diterpene of high pharmacological interest and 150 with anti-inflammatory properties, is present in considerable amount in Arabica and 151 stenophylla, but is almost entirely absent in robusta<sup>26</sup>. The seed chemistry of stenophylla 152 populations from Sierra Leone and Ivory Coast are broadly the same<sup>28</sup> but with some clear 153 differences. For example, Sierra Leone stenophylla has a caffeine content of 0.9–1.9 % dry 154 matter basis (dmb), which falls within the range of Arabica (0.6-1.9% dmb)<sup>25</sup>, whereas those 155 from Ivory Coast are higher  $(2.05-2.64\%)^{25,27}$ . 156

157 The reported mean annual temperature for stenophylla is 25–26°C, and mean total annual rainfall 1,500–2,650 mm per year<sup>1,29</sup>. Our modelled climate data for stenophylla was 158 congruent with these observed data, with a mean annual temperature of 24.9°C, and mean 159 160 total annual rainfall of 2,288 mm per year (Fig. 2). The mean annual temperature and mean total annual rainfall of stenophylla, is slightly and considerably higher (respectively), than 161 wild and cultivated robusta<sup>8,9</sup>, and modelled robusta and Liberica, although the ranges for 162 these values are similar (Fig. 2; Supplementary Table 6). The mean temperature reported and 163 modelled, for Arabica is 19.0°C (18–20°C)<sup>5,6</sup> and 18.7°C (Fig. 2), respectively; and for 164 stenophylla 25.8°C (25.5°C/26°C)<sup>1,29</sup>, and 24.9°C, respectively (Fig. 2). These data infer that 165 stenophylla has a much higher temperature tolerance than Arabica, with a mean annual 166 temperature difference of 6.8°C for recorded data, and 6.2°C for modelled data. Total mean 167 annual rainfall for stenophylla is higher than Arabica, but even at higher temperatures the 168 rainfall requirements can be equivalent, as reported<sup>1,29</sup> and as demonstrated here (Fig. 2; 169 Supplementary Table 6). Arabica cannot be cultivated successfully in the locations where 170 stenophylla either occurs in the wild or was once cultivated in Upper West Africa; only 171 robusta and Liberica can be used as crop plants in these areas<sup>1</sup>, confirming both published <sup>5,8</sup> 172 and modelled (Fig. 2; Supplementary Table 6) climate data. 173

In the analysis (Fig. 2) the number of data points for stenophylla is far fewer than 174 Arabica, robusta and Liberica, owing to the rarity of this species and paucity of field data (see 175 Methods). This will influence the density of the datapoints for stenophylla, but changes to the 176 climate envelope for this species are likely to be negligible if further data points were to be 177 added (as demonstrated in Fig. 2). A T-test for temperature and rainfall for stenophylla vs. the 178 other three species (via their data points) gives p-values of 1.117e-08 for temperature and 179 180 0.0458 for precipitation. The temperature profile is highly significant, whereas precipitation is not, compared to the other coffee species. The precipitation P-value is what we would 181 182 expect, i.e. not substantially different across the four species. Like Arabica, stenophylla experiences a distinctly seasonal climate over its native range, with a marked three to four 183 month dry season (November to March/April)<sup>1</sup>. 184

These findings open the way for substantially broadening the temperature range for 185 farming high quality (and thus higher value) coffee, and the possibility for market 186 differentiation in the specialty coffee sector, via the reestablishment of stenophylla coffee. In 187 the longer term, this species could have critical utility in coffee plant breeding, especially for 188 climate resiliency. To ensure a commercially acceptable taste, the production of interspecies 189 hybrids has so far relied on back-crossing with Arabica. In the case of breeding for heat and 190 drought tolerance, initial and repeated backcrossing to Arabica (to ensure sensory quality) 191 would likely weaken climate resiliency attributes<sup>30</sup>. Interspecies hybridization using 192 193 stenophylla, and backcrossing using this species would alleviate this limitation, as it has the required sensory traits and ability to withstand elevated temperatures, and may have drought 194 tolerance attributes. Drought tolerance has been attributed<sup>29,31,32</sup> or implied<sup>33-35</sup> for 195 196 stenophylla, but so far this has not been properly tested. Stenophylla is an amenable breeding partner. Interspecies crosses with Liberica have been confirmed<sup>1</sup>, as have those with robusta, 197 C. psedozanguebariae and C. congensis<sup>36</sup>. The diploid hybrid C. stenophylla  $\times$  C. liberica 198

shows marked vegetative vigour and an accelerated growth rate (A.P.D, J.H., D.S. pers. observ.). Conversion of diploid (2n = 2x = 22) hybrids to the tetraploid (2n = 4x = 44) state would be required to restore or improve fertility<sup>15,37</sup>. Over its natural range, and in cultivation, stenophylla demonstrates substantial phenotypic diversity<sup>1,20</sup>, and the potential for considerable inter-population genetic diversity<sup>1</sup>.

Efforts are now required to safeguard the future of the species in the wild and *ex situ*, and to evaluate its full potential as a climate resilient high-value crop species and breeding resource.

207 Methods

The sensory analysis was undertaken using two different protocols, for five samples, 208 comprising four species: (1) a high quality (specialty) Arabica coffee, farmed in Sidamo, 209 Ethiopia; (2) a medium quality Arabica, farmed in Sul de Minas, Brazil; (3) a high quality 210 robusta, farmed on Flores Island, Indonesia; (4) stenophylla, maintained on Reunion Island 211 (Mascarene Islands), but originally from eastern Ivory Coast; and (5) stenophylla, collected 212 from the wild in eastern Sierra Leone<sup>1</sup>. Samples (1) to (4) were evaluated using a protocol 213 214 developed by CIRAD (Centre de Coopération Internationale en Recherche Agronomique pour le Développement), derived from the European standard ISO 6668 and 13299 215 216 (https://www.iso.org/standard/44609), and hereafter referred to as the CIRAD protocol. Sample (5) was evaluated using the Specialty Coffee Association (SCA) protocol and scoring 217 system (https://sca.coffee/research/protocols-best-practices), and sensory terminology of the 218 SCA Coffee Taster's Flavor Wheel<sup>22</sup>, with modifications due to small sample size. Further 219 details of the two protocols are given in Supplementary Information. Four independent 220 sensory panels were used for the CIRAD protocol evaluation, including 15 panel members 221 (judges). A total of 15 variables were scored (10 points each; 150 points in total). Scores from 222 each of the 15 judges were combined (Supplementary Tables 1 & 2), and an analysis of 223

variance (ANOVA) was applied to the scores, followed by a Tukey test (HSD for Honest 224 Standard Deviation) for comparison of means (XLSTAT 2021, Addinsoft). Additional 225 commentary, e.g. tasting notes, sweetness, and negative characteristics were also requested 226 (Supplementary Table 3). In addition to the CIRAD protocol, the panel were asked four 227 questions: (1) Is this Arabica coffee (yes/no)? (2) Is this robusta coffee (yes/no)? (3) Is this 228 coffee new (yes/no)? (4) Could this coffee be commercialized (yes/no)? Yes/no responses 229 230 (0/1) for the four questions were totalled to provide a percentage score (Fig. 4; Supplementary Table 4). 231

The SCA protocol (https://sca.coffee/research/protocols-best-practices) was undertaken using a single panel, with three judges, and by applying a consensus cupping score (an overall score awarded by the panel leader), based as closely as possible on the SCA scoring system. Four other species (Arabica, Liberica, *C. brevipes* and *C. montekupensis*) were assessed alongside the stenophylla (sample (5), although they were not included in the analysis or scoring. Full details of the sensory protocols are given in Supplementary Information.

For the distribution map and climate envelope analysis we used a dataset of 1,324 239 ground point records, derived from a coffee occurrence database (herbarium specimens and 240 *in situ* observation)<sup>4,15</sup>, comprising 711 records for Arabica, 297 for Liberica, 304 for robusta, 241 and 20 for stenophylla. In situ observation data (615 records) were only for wild Arabica in 242 243 Ethiopia<sup>4</sup>, otherwise all specimens are vouchered by herbarium specimens (verifications by A.P.D.). All ground point data were georeferenced (if not already available), manually 244 checked for geolocation accuracy (1 km<sup>2</sup> or less), and corrected if necessary. Fig. 1 was 245 produced in ArcGIS Pro 2.6.1 (ESRI, Redlands, CA<sup>38</sup>), using background and country data 246 from Natural Earth (https://www.naturalearthdata.com/). For Fig. 2 we resampled all 247 specimen data to remove duplicates within 1km of each other, reducing the total number of 248

249	records used from 1,324 to 586 (193, 182, 199, 12, respectively for each species). $R^{39}$ was
250	used to sample specimen data against all Bioclim variables <sup>40</sup> from the CHELSA dataset <sup>41</sup>
251	(Supplementary Table 6). We originally selected four Bioclims for our analysis (Bio1 =
252	Annual Mean Temperature; Bio4 = Temperature Seasonality; Bio12 = Annual Precipitation;
253	Bio15 = Precipitation Seasonality) to represent the main abiotic determinants of coffee
254	species distribution <sup>4</sup> , simplifying to Bio1 and Bio12 for demonstration purposes (Fig. 2).
255	Scatter and density plots were plotted using R <sup>39</sup> and using the ggplot2 <sup>42</sup> and ggpubr
256	packages <sup>43</sup> . For validation purposes, our modelled temperatures and rainfall for Arabica and
257	robusta (Fig. 2) were compared against published data for cultivated coffee, and were found
258	to fall within reported ranges <sup>5,6,8,9</sup> . We agree that temperature ranges given for the native
259	range of coffees is often reported as too high9, especially when comparing wild and farmed
260	coffee, but did not find any marked discrepancies in our analysis and observations.
261	Temperature range data for cultivated Liberica is limited and unreliable, at present. To test
262	for significances, we used a standard T-test in R <sup>39</sup> to ascertain whether the climate results for
263	stenophylla could be a sample of the other coffee species.

264

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291	Data and materials availability
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294	
295	Supplementary Information
296 297 298 299	Supplementary Figs. 1, 2 Supplementary Text Supplementary Tables 1–6 [tabulated spreadsheet]

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*canephora*), Liberica (*C. liberica*) and stenophylla (*C. stenophylla*) coffee. Location of

403 sensory (cupping) samples for stenophylla coffee, circled. See Methods for further details.



Fig. 2. Scatter and density plots of modelled annual mean temperature vs. total mean
annual precipitation. Mean values in parentheses. Arabica (*C. arabica*; 18.7 °C/1,614 mm),
robusta (*C. canephora*; 23.7°C/1,601 mm), Liberica (*C. liberica*; 23.9 °C/1,699 mm) and
stenophylla (*C. stenophylla*; 24.9°C/2,288 mm). Stenophylla data points black-outlined for
single (small) and double data points (large). Location of sensory (cupping) samples for
stenophylla coffee, circled (upper circle for Sierra Leone, lower for Ivory Coast). See
Methods for further details.



419 Fig. 3. Radar graph for sensory (flavour) profile using a light roast, for stenophylla,

420 Arabica and robusta coffee. Graph based on results of CIRAD sensory protocol evaluation

421 (see Methods, Supplementary Informaton, and Supplementary Table 1). The first four criteria

- 422 (clockwise from the top (overall quality, fruity, acidity and body) are positive for coffee
- 423 quality, the other four (bitterness, astringency, earthy and burned) are usually negative.





Fig. 4. Yes/no responses to four additional questions. Questions asked, in addition to the
CIRAD sensory protocol. From bottom to top: (1) Is this Arabica coffee? (2) Is this robusta
coffee? (3) Is this coffee new? (4) Could this coffee be commercialized? Grey shading
represents 'no' answers. See Methods, Supplementary Information, and Supplementary Table
4.