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6 Meteorology:  
7 <https://doi.org/10.1016/j.agrformet.2019.02.020>

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9 **Agro-climatic zoning of Spanish forests naturally producing black truffle**

10

11 Sergi Garcia-Barreda <sup>a,b,\*</sup>, Sergio Sánchez <sup>a</sup>, Pedro Marco <sup>a</sup>, Roberto Serrano-Notivoli <sup>c</sup>

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13 <sup>a</sup> Unidad de Recursos Forestales, Centro de Investigación y Tecnología Agroalimentaria de

14 Aragón (CITA), Instituto Agroalimentario de Aragón – IA2 (CITA-Universidad de

15 Zaragoza), Avda. Montañana 930, 50059 Zaragoza, Spain

16 <sup>b</sup> Centro de Investigación y Experimentación en Truficultura de la Diputación de Huesca

17 (CIET), Polígono Fabardo s/n, 22430 Graus, Spain

18 <sup>c</sup> Estación Experimental de Aula Dei – Consejo Superior de Investigaciones Científicas

19 (EEAD-CSIC), Avda. Montañana 1005, 50059, Zaragoza, Spain.

20 \* Corresponding author. E-mail: sergigarciabarreda@gmail.com

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22 Declarations of interest: none

23

24 **Abstract**

25 Black truffle is a highly appreciated edible fungus that grows wild in southwestern Europe,  
26 although its cultivation has recently spread to other continents. In Spain the widespread  
27 exploitation of wild truffles began only after 1950, whereas plantations play a relevant role in  
28 truffle production from the late 1990s. However, most plantations continue to apply empiric  
29 practices not taking into account local environmental conditions. The identification of  
30 environmental factors driving black truffle distribution and yield could help to optimise  
31 cultivation practices, but no agro-climatic zoning is currently available for this fungus in  
32 Spain. This study characterises the climate of Spanish forests naturally producing black  
33 truffle, defines an agro-climatic zoning for the fungus and examines the climatic patterns  
34 across its spatial distribution. The examined forests presented climatic ranges coherent with  
35 the available experts' surveys, except for an extended low end in annual precipitation. The  
36 clustering identified three agro-climatic zones, with dry environments tending to be dominant.  
37 The principal components analysis indicated that the examined forests tended to cluster along  
38 water availability and temperature gradients. Only in one of the zones mean precipitations  
39 during the vegetative period were similar to those characterising optimum years for black  
40 truffle fruiting, thus suggesting that plantations could benefit from practices increasing soil  
41 water content. Similarly, the results suggested that in two of the zones plantations could  
42 benefit from practices increasing soil temperature in winter and early spring. The study  
43 provides a basis for large-scale planning of truffle cultivation and identification of research  
44 priorities in Spain.

45

46 **Keywords:** *Tuber melanosporum*, black truffle, agro-climatic variables, Spain

47

## 48 **1. Introduction**

49 The black truffle (*Tuber melanosporum* Vittad.) is a highly appreciated edible fungus  
50 worldwide due to its organoleptic quality. It is ectomycorrhizal and typically grows wild in  
51 open *Quercus* forests in transitional stages between the Mediterranean and the oceanic  
52 climates (Bencivenga et al., 1990; Ricard et al., 2003; Le Tacon, 2016). Its natural  
53 distribution is limited to southwestern Europe, being a multi-million euro industry in France,  
54 Italy and Spain (Reyna and Garcia-Barreda, 2014).

55 Although *T. melanosporum* was originally a product merely harvested in the wild, the high  
56 demand aroused the interest in its cultivation, achieved for the first time in France during the  
57 19<sup>th</sup> century. In recent decades truffle cultivation has become an economic alternative for  
58 many regions in southwestern Europe and has spread to other continents (Olivier et al., 2002;  
59 Reyna and Garcia-Barreda, 2014). In Spain the widespread exploitation of wild truffle  
60 harvests began only in the second half of the 20<sup>th</sup> century, with plantations playing an  
61 increasingly dominant role in truffle production from the late 1990s (Garcia-Barreda et al.,  
62 2018). Spain is home to many of the southernmost natural locations of *T. melanosporum*, with  
63 relatively dry, warm climate and soils with relatively low levels of organic matter (Garcia-  
64 Barreda et al., 2007). This could be particularly relevant in view of climate change projections  
65 suggesting higher temperatures and lower precipitations, thus increasing irrigation  
66 requirements (Büntgen et al., 2012).

67 Truffle cultivation is not completely domesticated yet and, in most cases, practices applied by  
68 growers are empiric, mimicking natural ecosystems or guided by classic handbooks, and  
69 frequently not taking into account local conditions (Reyna and Garcia-Barreda, 2014).

70 Management of wild truffle populations and optimisation of truffle cultivation require to  
71 identify key environmental factors driving the distribution and yield of the fungus (Ágreda et  
72 al., 2016). Agro-climatic zoning studies allow to delimit homogeneous environments from the

73 perspective of a particular crop, thus providing the basis for land use planning, agronomics  
74 and identification of research challenges (Yamada and Sentelhas, 2014). However, no  
75 systematic agro-climatic zoning for *T. melanosporum* is currently available for the whole of  
76 Spain or any other European country. Most of the previous climatic studies are merely  
77 descriptive, providing climatic limits based on experts' surveys and commonly used  
78 parameters (Pacioni, 1987; Ricard et al., 2003; Garcia-Barreda et al., 2007). Other approaches  
79 have simply created regional suitability maps on the basis of the aforementioned parameters  
80 (Colinas et al., 2007; Alonso Ponce et al., 2010; Serrano-Notivoli et al., 2015; Serrano-  
81 Notivoli et al., 2016). Finally, other approaches assess the correlation between interannual  
82 meteorological variability and truffle yields in a particular location (Bardet and Fresquet,  
83 1995; Le Tacon et al., 2014). Despite the limited knowledge about the actual wild truffle  
84 presence, yields and their relationship with climatic parameters, the agro-climatic  
85 characterisation of wild locations could guide the efforts to identify the key environmental  
86 factors for truffle cultivation and harvesting.

87 In this study we aim (i) to define an agro-climatic zoning for the Spanish forests naturally  
88 producing *T. melanosporum*, and (ii) to examine variations in climate among the defined  
89 agro-climatic zones. As a secondary aim, the climate of Spanish truffle-producing forests is  
90 characterised. The implications of the results on land use planning, evaluation of the climatic  
91 requirements of the fungus, management of plantations and adaptation to local conditions are  
92 discussed. The truffle-producing locations were selected according to a criterion of good  
93 performance of the fungus instead of the traditional limits of existence. This approach benefits  
94 from the fact that in most Spain truffle was not exploited until recently and that harvesting  
95 became widespread throughout the country in a relatively short time. The selected climatic  
96 parameters included both commonly used parameters and parameters more directly related to  
97 the physiology of the sporocarp development and the host tree.

98

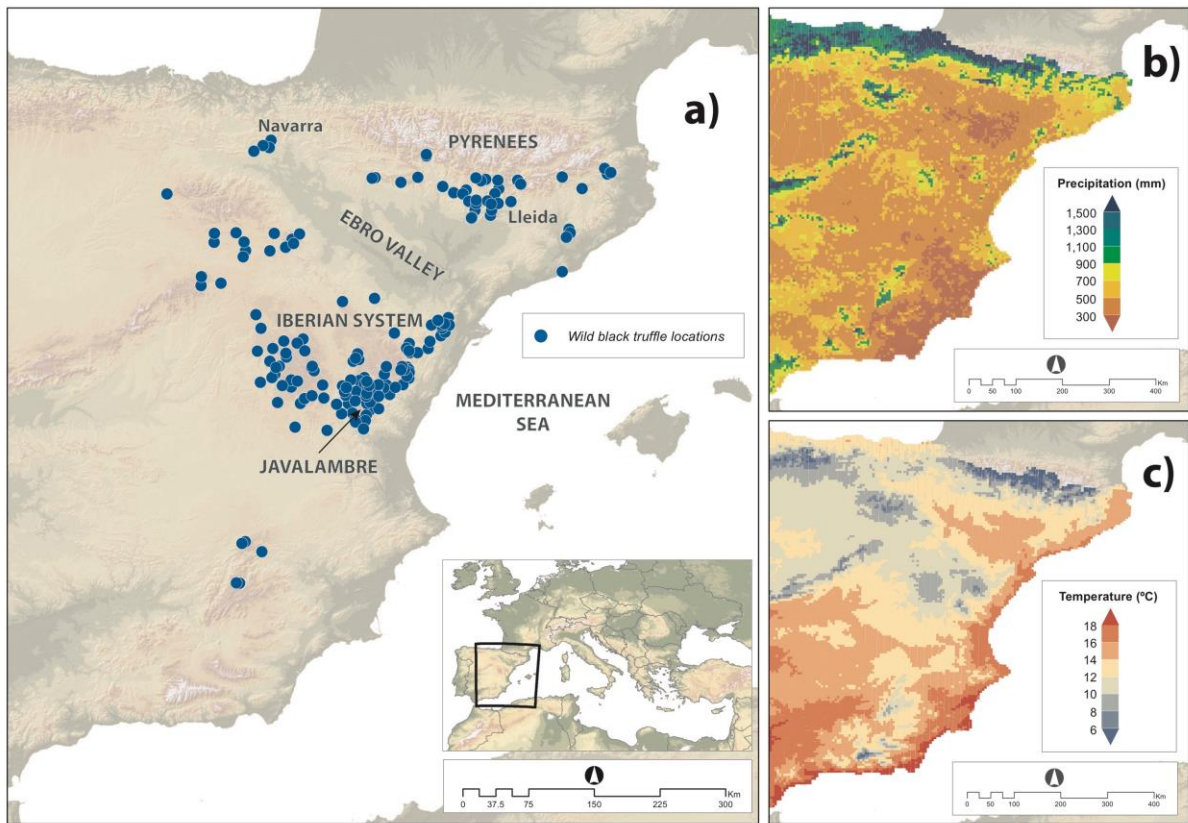
## 99 **2. Material and methods**

### 100 **2.1. Selection of wild truffle stands**

101 The Spanish truffle stands we selected for the study met the following two criteria: (i) forests  
102 naturally producing *T. melanosporum*, and (ii) the fungus had been commercially harvested at  
103 some point over the period 1990-2017. We assumed that these stands are more likely to  
104 present higher occurrence and fruiting yield of the fungus and thus better chances for the  
105 establishment of new truffle-producing stands. Sites where simply the occurrence of  
106 mycorrhizas has been cited were not considered, as well as stands where fruiting has been  
107 cited but without any record of commercial harvesting. The selected 175 wild truffle-  
108 producing stands are located in eastern Spain (Fig. 1a).

109 We collected data about forests with commercial lease agreements for black truffle from  
110 regional operating plans and from calls to public auctions. Yet our dataset is probably not  
111 complete and with varying degree of completion among regions. No information on private  
112 forests is publicly available, so only forests under public administration were included. Only  
113 lease agreements for the period 1990-2017 were considered. In most Spain harvesting of wild  
114 truffle began between the late 1940s and late 1960s, in all cases with a commercial aim  
115 (Garcia-Barreda et al., 2018), so the selected forests continued to provide commercial yields  
116 after at least 20 years of intensive harvesting. In addition, information for previous periods is  
117 scarce and fragmentary. In municipalities with more than three commercially harvested  
118 forests, up to a maximum of three stands were included, avoiding those with distance lower  
119 than 3 km.

120



121

122 Fig. 1. Location of the selected wild productions of black truffle (a). Mean annual

123 precipitation (b) and mean annual temperature (c) for the period 1961-1990.

124

125 A single geographical location corresponding to a truffle-producing stand was selected to  
 126 represent each forest. In this way we intended to avoid potential issues related to the  
 127 variability in the surface area of the forests selected, which ranged from less than 100 ha to  
 128 more than 3,000 ha, and to the distribution pattern of truffle fruiting in wild stands. Truffle-  
 129 producing stands typically take up only a small portion of the forest surface, showing a  
 130 clumped distribution (Garcia-Barreda and Reyna, 2013). On the other hand, this approach  
 131 does not mean that all the truffle production of the forest was concentrated in that stand. No  
 132 information is available on the truffle yield of Spanish public forests or on the density of  
 133 truffle-producing stands.

134 Given the particularities of truffle ecology and harvesting (Garcia-Barreda et al., 2018), we  
135 chose to avoid the use of absence data. It is often not possible to reliably corroborate absence  
136 points or the factor originating the absence (e. g. unsuitable climate, soil, hosts or forest  
137 density, postglacial expansion pattern or intensive harvesting). Truffles grow below ground  
138 and their symbiotic phase is microscopic. In edge populations, reproductive structures occur  
139 only occasionally (i. e. in years with very favourable weather). In productive regions,  
140 particularly in private forests, location and yield of the truffle stands are often withheld to  
141 avoid poaching and competition. Bearing in mind these constraints, we feel that our approach  
142 is still necessary because it focuses on the variations in climate throughout the natural  
143 distribution area and their potential implications on yield and management of truffle  
144 plantations.

145

## 146 **2.2. Climate data**

147 We selected 16 agro-climatic parameters related to the natural distribution area of *T.*  
148 *melanosporum* or to sporocarp productivity (Bardet and Fresquet, 1995; Ricard et al., 2003;  
149 Garcia-Barreda et al., 2007; Le Tacon et al., 2014) (Table 1). The agro-climatic parameters  
150 were chosen based on their representativeness of (1) the general mean climatic characteristics  
151 (e.g. mean annual temperature and precipitation, temperatures of the coldest and warmest  
152 month), or (2) periods which are related to key physiological stages of black truffle sporocarp  
153 development (Montant et al., 1983; Montant and Kulifaj, 1990; Coquelin et al., 2007). In this  
154 regard, several parameters were constrained to bimonthly aggregations to better represent the  
155 key periods for sporocarp formation (late spring), survival and rapid growth (summer) and  
156 ripening (winter), which are likely to happen during an extended period comprising more than  
157 one month (Montant et al., 1983; Montant and Kulifaj, 1990; Coquelin et al., 2007).

158



159 Table 1. Descriptive statistics for the agro-climatic parameters characterising the selected wild  
 160 truffle stands (n=175).

Parameter (units)	Abbreviation	Mean	Min.	Max.	5 <sup>th</sup> perc.	95 <sup>th</sup> perc.
Mean annual temperature (°C)	T_ANN	11.1	7.2	14.7	9.1	13.0
Mean temperature of coldest month (°C)	T_COLD	3.5	0.1	7.8	1.4	5.6
Mean temperature of warmest month (°C)	T_WARM	20.5	16.9	23.6	18.7	22.5
Mean temperature April-May (°C)	T_4_5	10.5	6.2	14.1	8.4	12.6
Mean daily temperature range May-June (°C)	T_DTR_5_6	12.5	8.7	14.8	11.2	13.9
Annual percentage of days with minimum temperature lower than -5°C (%)	DAYS_ICE	3.7	0.1	10.7	0.8	8.1
Mean annual precipitation (mm)	P_ANN	646	290	1672	386	1124
Mean precipitation March-April (mm)	P_3_4	111	44	337	57	196
Mean precipitation May-June (mm)	P_5_6	129	69	305	79	232
Mean precipitation July-August (mm)	P_7_8	63	19	221	32	148
Mean precipitation September-October (mm)	P_9_10	119	52	301	68	215
Aridity intensity <sup>1</sup>	ARID	0.23	0	0.63	0	0.44
Potential available water March-April (mm) <sup>2</sup>	AW_3_4	-16	-54	117	-49	33
Potential available water May-June (mm) <sup>2</sup>	AW_5_6	-71	-120	33	-102	1
Potential available water July-August (mm) <sup>2</sup>	AW_7_8	-145	-202	-48	-190	-82
Potential available water September-October (mm) <sup>2</sup>	AW_9_10	-24	-68	83	-56	38

161 <sup>1</sup> Calculated as a non-dimensional ratio between the dry and the humid area in climate  
 162 diagrams (Walter and Lieth, 1960).

163 <sup>2</sup> Calculated as the difference between precipitation and reference evapotranspiration  
 164 according to Hargreaves and Samani (1982).

165

166 These parameters were calculated for the climatological period 1961-1990, in which Spanish  
 167 wild *T. melanosporum* production was at its maximum. Before 1960 truffle harvesting was

168 not widespread in Spain and no information on the national production or the productive  
169 status of forests is available. Besides, before 1960 climatic data are scarce and irregular in  
170 almost all Spain. On the other hand, after 1990 Spanish wild truffle production was sensibly  
171 lower likely due to a combination of habitat deterioration, overexploitation and climate  
172 change (Büntgen et al., 2012; Garcia-Barreda et al., 2018).

173 Precipitation information was collected from the SPREAD dataset (Serrano-Notivoli et al.,  
174 2017a), a 5x5 km spatial resolution daily precipitation dataset that has been widely used for  
175 high resolution climate analysis in Spain (Serrano-Notivoli et al., 2018a; Serrano-Notivoli et  
176 al., 2018b). We extracted the values of the grid points nearest to the pair of coordinates of  
177 each truffle stand. Temperature data series were estimated for the same locations of the  
178 nearest grid points of SPREAD. The estimates were based in the same methodology as  
179 precipitation (Serrano-Notivoli et al., 2017b), estimating daily temperature values through a  
180 multivariate logistic regression using altitude, latitude and longitude of the original  
181 observations as predictor variables.

182

### 183 **2.3. Data analysis**

184 Agro-climatic parameters were clustered using a *k-means* method to provide a first insight  
185 about the grouping of truffle stands based on their climatic characteristics. Following  
186 Hartigan and Wong (1979) the scaled variables (using mean and standard deviation) were  
187 disaggregated into *k* groups so that the sum of squares in the within-cluster was minimized.  
188 The number of clusters was chosen according to criteria provided by the NbClust package  
189 (Charrad et al., 2014). Differences among clusters were tested through analysis of variance  
190 and post-hoc comparison tests with Bonferroni correction.

191

192 It was not possible to validate the clustering with previous climatic or production zoning of *T.*  
193 *melanosporum*, because none exists. However, in order to better describe the clusters, their  
194 correspondence with three Spanish phytoclimatic and natural vegetation maps was essayed:  
195 (1) the phytoclimatic classification by Allué-Andrade (1990); (2) the most abundant truffle-  
196 producing tree according to the actual vegetation map by MAGRAMA (2006); and (3) the  
197 potential vegetation according to Rivas-Martínez (1987). The relationship between these  
198 classifications and the clusters was assessed with the Adjusted Rand Index (ARI), which  
199 measures the agreement between two divisions from -1 (no agreement) to 1 (perfect  
200 agreement).

201 Finally, a Principal Components Analysis (PCA) was used to explore the variability explained  
202 by climatic parameters and to analyse the relationships between these parameters and *k-means*  
203 clusters.

204

### 205 **3. Results and discussion**

#### 206 **3.1. Agro-climatic characterisation and zoning of wild truffle stands**

207 In the analysed truffle stands the agro-climatic parameters varied within typical values for  
208 Mediterranean climate, with mild winters (3.5 °C of mean temperature in the coldest month  
209 and a mean of 3.7% days reaching temperatures under -5 °C) and dry, warm summers (20.5  
210 °C of mean temperature in the warmest month) (Table 1).

211 The values for several parameters spanned over wide ranges, with marked temperature and  
212 precipitation gradients from the Mediterranean coast and the bottom of the Ebro valley to the  
213 Pyrenees and the main ranges of the Iberian System (Fig. 1b, 1c). Most temperature  
214 parameters showed range widths of about 7 °C. Annual precipitation ranged from less than  
215 300 mm to more than 1,600 mm, with bimonthly precipitations showing differences between  
216 stands of up to 80% (Table 1). The aridity intensity ranged from absence of a dry period (in

217 which monthly precipitation is lower than twice the mean temperature) to typical values for  
218 semi-arid climate (Table 1). Potential available water from May to August were clearly  
219 negative in almost all truffle stands, whereas in March-April and September-October they  
220 were more balanced in coincidence with typical seasonal precipitation peaks of Mediterranean  
221 Spain (De Luis et al., 2010).

222 The resulting area suggested by the selected stands (Fig. 1a) was consistent with previous  
223 distribution maps (Reyna and Garcia-Barreda, 2009). Mean annual temperature and mean  
224 temperature of the coldest and warmest months showed ranges similar to those cited for wild  
225 *T. melanosporum* areas in France, Italy and Spain; whereas annual precipitation showed a  
226 wider range, particularly in the lower end (Pacioni, 1987; Ricard et al., 2003; Garcia-Barreda  
227 et al., 2007).

228 The *k-means* clustering resulted in three well-differenced groups. Cluster 1 included 46% of  
229 the stands and represented warm and dry climate conditions (Table 2). Most truffle stands in  
230 this cluster are located near the Mediterranean coast or in the southernmost areas, whereas the  
231 remaining are scattered throughout northern areas, mixed with the two other groups (Fig. 2).  
232 This cluster reaches the southernmost natural locations of *T. melanosporum* (Olivier et al.,  
233 2002). Cluster 2 included 21% of the stands and was characterised by a wetter and colder  
234 climate (Table 2). Truffle stands in this cluster are mainly located in the foothills of the  
235 Pyrenees and in the slopes of the main ranges of eastern Iberian System (Fig. 2). Cluster 3  
236 included 33% of the stands. It represented a cold and dry climate, typical from inland areas of  
237 northern Spain where the influence of maritime airflow from the Atlantic and the  
238 Mediterranean is minimum (Table 2). Truffle stands in this cluster are mostly located in  
239 central and western Iberian System (Fig. 2).

240

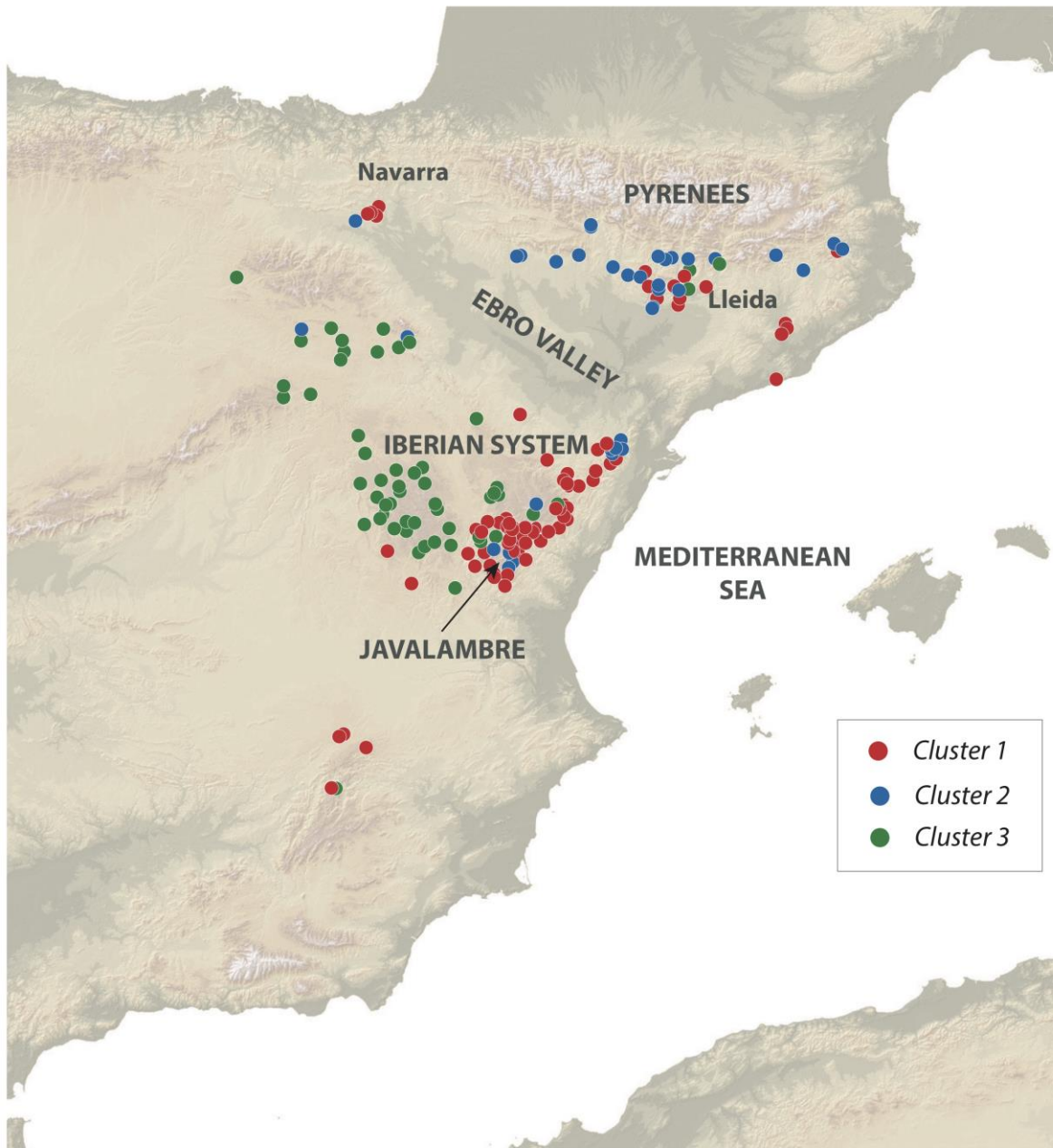
241 Table 2. Mean characteristics (and 95% confidence interval) for the agro-climatic parameters  
 242 in each cluster (parameter abbreviations in Table 1). Letters indicate significant differences ( $\alpha$   
 243 = 0.05) among clusters.

Cluster	1	2	3
N	81	36	58
T_ANN	12.1 (12.0, 12.3) a	10.3 (10.0, 10.6) b	10.1 (9.9, 10.3) b
T_COLD	4.8 (4.6, 4.9) a	2.7 (2.5, 3.0) b	2.4 (2.1, 2.6) b
T_WARM	21.3 (21.1, 21.5) a	19.6 (19.3, 19.9) b	19.9 (19.7, 20.1) b
T_4_5	11.6 (11.3, 11.8) a	9.8 (9.5, 10.1) b	9.5 (9.2, 9.7) b
T_DTR_5_6	12.1 (11.9, 12.3) b	12.0 (11.7, 12.2) b	13.3 (13.1, 13.5) a
DAYS_ICE	1.7 (1.3, 2.1) c	4.5 (4.0, 5.1) b	6.0 (5.6, 6.4) a
P_ANN <sup>1</sup>	504 (479, 532) c	1000 (924, 1082) a	572 (537, 609) b
P_3_4 <sup>1</sup>	82 (77, 88) c	169 (154, 186) a	101 (94, 109) b
P_5_6 <sup>1</sup>	101 (96, 105) c	204 (190, 218) a	116 (110, 122) b
P_7_8 <sup>1</sup>	46 (43, 50) b	116 (104, 129) a	44 (41, 48) b
P_9_10 <sup>1</sup>	104 (99, 110) b	184 (170, 198) a	91 (86, 97) c
ARID	0.30 (0.27, 0.32) a	0.05 (0.01, 0.09) b	0.26 (0.23, 0.29) a
AW_3_4	-33 (-37, -29) c	22 (16, 29) a	-17 (-22, -12) b
AW_5_6	-86 (-90, -83) b	-20 (-26, -15) a	-80 (-85, -76) b
AW_7_8	-149 (-154, -145) b	-99 (-106, -93) a	-166 (-172, -161) c
AW_9_10	-31 (-35, -27) b	19 (13, 25) a	-41 (-46, -37) c

244 <sup>1</sup> Variable log-transformed

245

246 The southeastern Iberian System exhibited a combination of the three clusters with clear  
 247 climatic gradients: (i) warm and dry (cluster 1) near the coast; (ii) cold and dry (cluster 3) in  
 248 inland areas and (iii) cold and wet (cluster 2) in higher areas of Javalambre mountain range.  
 249 On the other hand, there were at least two areas apparently contradicting expected climatic  
 250 patterns. The Pre-Pyrenees in Lleida province showed a combination of the three clusters in a  
 251 small space. This could be due to the east-west orientation of local mountain ranges leading to  
 252 contrasting results in north and south exposures. The northwesternmost stands, in Navarra  
 253 region, were dominated by cluster 1 despite the marked influence of the Atlantic on the  
 254 regional climate, predominantly characterised by high precipitations and smooth  
 255 temperatures. This could suggest that in regions with these conditions *T. melanosporum* seeks  
 256 for more xeric local climatic characteristics.



258

259 Figure 2. Location of the truffle stands in eastern Spain, coloured by cluster (cluster 1 in red,  
 260 cluster 2 in blue and cluster 3 in dark green).

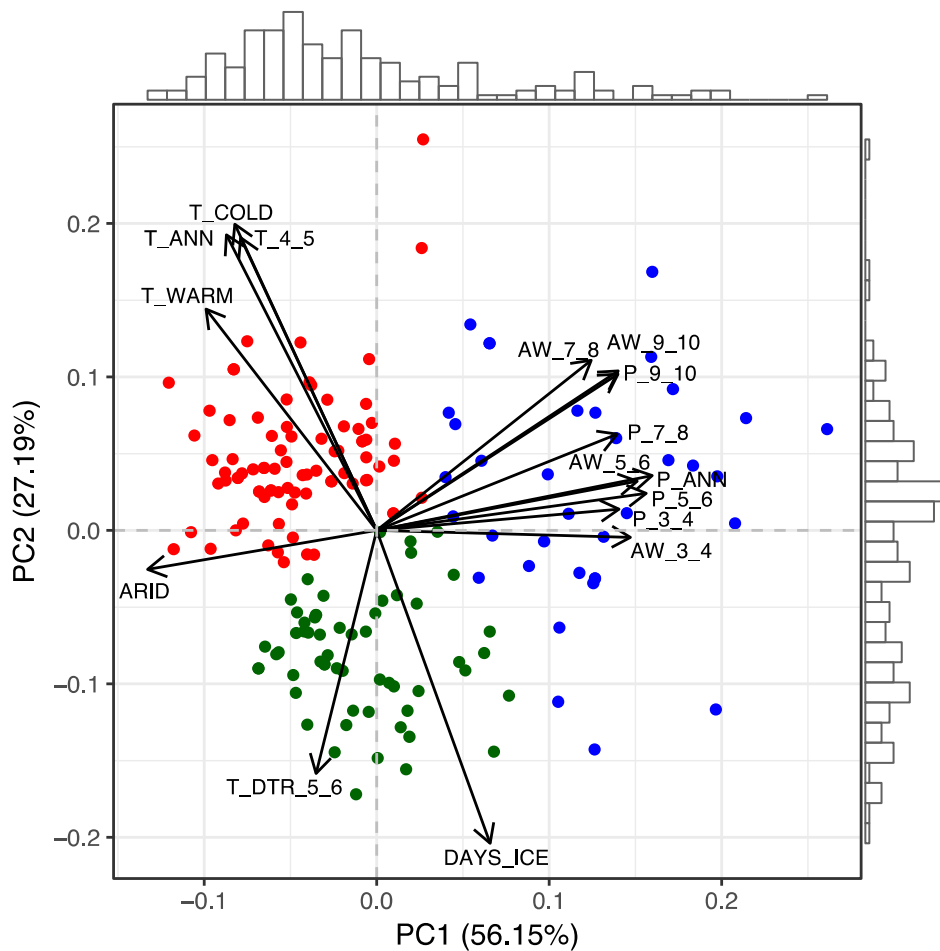
261

262 The k-means clusters did not show high ARI values (clearly different from a random  
 263 distribution) with any of the three phytoclimatic and natural vegetation classifications with  
 264 which they were compared: Allué-Andrade phytoclimate (0.08), Rivas-Martínez potential

265 vegetation (0.19) and actual truffle-producing vegetation (0.06). Almost 90% of the truffle  
266 stands were included in phytoclimates VI(IV)<sub>1</sub> (52%), VI(VII) (22%) or VI(IV)<sub>2</sub> (13%),  
267 nemoral phytoclimates with minimal or absent summer drought period. In more than 90% of  
268 the stands the potential vegetation was dominated by *Quercus ilex* L. (43% of  
269 supramediterranean type and 17% of mesomediterranean type), *Quercus faginea* Lam. (18%)  
270 or *Juniperus thurifera* L. (14%). In more than 90% of the stands the most abundant truffle-  
271 producing host tree was *Q. ilex* (77%) or *Q. faginea* (18%). *Quercus ilex* is the most  
272 widespread *Quercus* species in Spain, being present from sea level to more than 2,000 m of  
273 altitude, whereas *Q. faginea* is particularly frequent in Mediterranean-continental climates.  
274 The PCA analysis explained 83% of the data variability with the two first components. The  
275 first component corresponded to a water availability gradient and the parameters with the  
276 highest loadings were AW\_5\_6 (0.32), P\_5\_6 (0.32), P\_ANN (0.31) and AW\_3\_4 (0.30),  
277 although the remaining precipitation, potential available water and aridity parameters all  
278 showed loadings between 0.25 and 0.29. Spring precipitation and potential available water  
279 (March-April, May-June) showed high correlations among them and with annual precipitation  
280 (all of them higher than 0.80), while showing slightly lower correlations with summer and  
281 autumn parameters (Fig. 3).

282 The second component corresponded to a temperature gradient and the parameters with the  
283 highest loadings were DAYS\_ICE (-0.41), T\_COLD (0.41), T\_ANN (0.39) and T\_4\_5 (0.39).  
284 These parameters showed high correlations among them, being all of them higher than 0.83  
285 (Fig. 3).

286 These two PCA components allowed to clearly separate the three *k-means* clusters. Stands in  
287 the Pre-Pyrenees and Iberian System ranges (cluster 2) were differentiated from the rest by  
288 relatively high precipitations and more positive potential available water throughout March to  
289 October (Fig. 3, Table 2).



291

292 Figure 3. Biplot of the two first (scaled) components of the PCA. The left and bottom axes  
 293 show PCA scores. Colours indicate *k-means* clusters (cluster 1 in red, cluster 2 in blue and  
 294 cluster 3 in dark green). Parameter abbreviations as presented in Table 1.

295

296 Based on our current knowledge of *T. melanosporum* sporocarp development, May-June is  
 297 likely the period in which sporocarps are formed, whereas August is likely the period in  
 298 which they show rapid weight increment (Montant et al., 1983). Climatic studies commonly  
 299 considered water deficit and precipitation throughout late spring and summer as the  
 300 parameters explaining most interannual variability in truffle harvest (Ricard et al., 2003; Le  
 301 Tacon et al., 2014).



302 Delmas (1976) and Bardet and Fresquet (1995) also pointed out the importance of early  
303 spring precipitation, although it could be supplemented by high soil water content linked to  
304 late winter precipitation, according to Olivier (2008). In most truffle-producing areas of  
305 Spain, bud breaking of *Q. ilex* commonly happens in April. Le Tacon et al. (2013) found that  
306 sporocarps depended on carbon transfer from host trees throughout their development, thus  
307 suggesting a relevant role of host physiology on truffle yield. On the other hand, autumn  
308 precipitation is not considered critical in France, except for long periods of soil flooding or  
309 drought (Olivier, 2008).

310 Stands near the Mediterranean coast (cluster 1) and inland areas (cluster 3) comprise  
311 relatively drought-prone areas, with cluster 1 being differentiated from cluster 3 by relatively  
312 high temperatures in winter and spring and low frequency of frosts (Fig. 3, Table 2). Soil and  
313 air temperatures in April-May, the period of bud breaking and sporocarp induction, have been  
314 positively related to truffle harvest (Kulifaj, 1994 in Ricard et al., 2003; Coquelin et al.,  
315 2007). A similar relation was pointed out for summer temperature, the period of rapid  
316 sporocarp growth (Montant and Kulifaj, 1990; Bardet and Fresquet, 1995), although Ricard et  
317 al. (2003) and Olivier (2008) noticed that exceptionally long spells of hot weather could  
318 damage truffle harvest. Sporocarp ripening, characterised by spore maturation and aroma  
319 development, typically happens from late autumn, along with soil temperature drop (Montant  
320 and Kulifaj, 1990). On the other hand, Delmas (1976) and Le Tacon et al. (2014) indicated the  
321 negative effect of winter frosts below -5 to -10°C on truffle harvest.

322

### 323 **3.2. Implication on truffle cultivation**

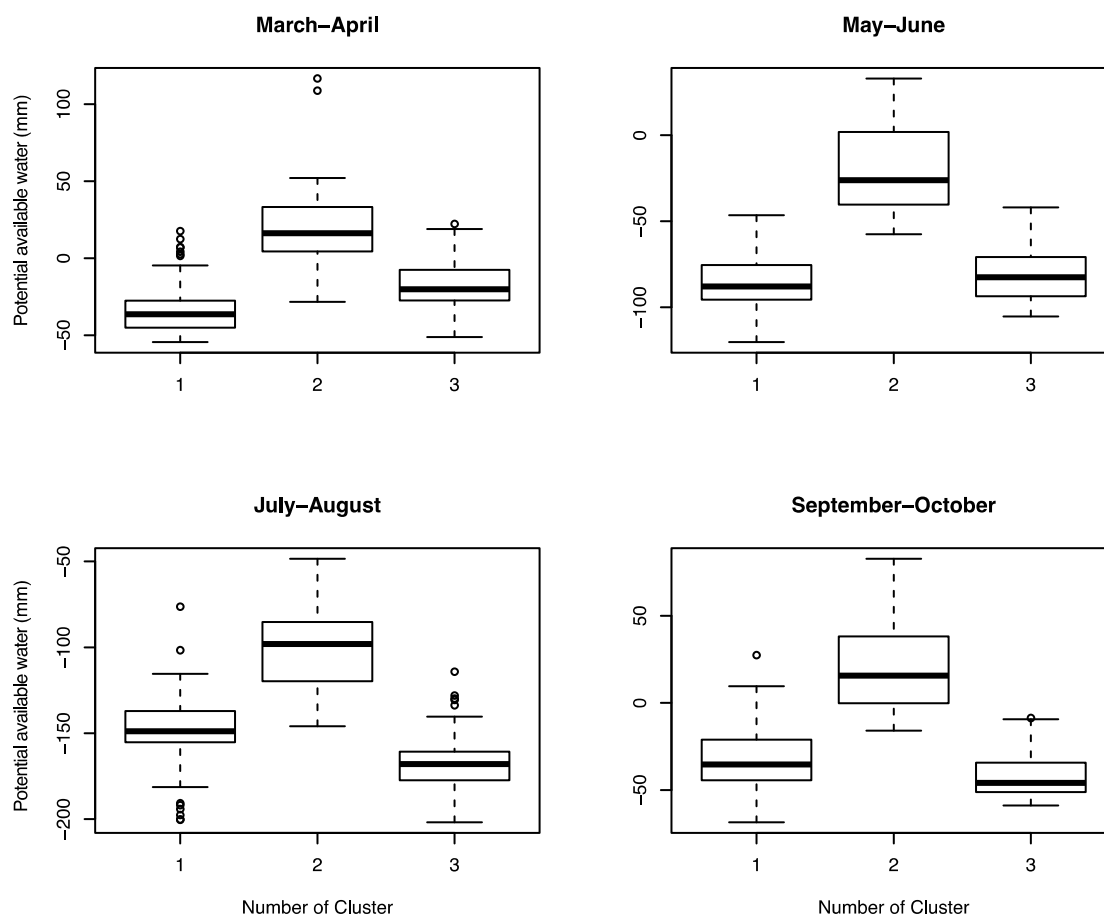
324 Agro-climatic zoning allowing to delimit homogeneous environments from the perspective of  
325 a particular crop provides a useful approach to regional planning, agronomics and  
326 identification of research challenges (Yamada and Sentelhas, 2014).

327 Regional planning for truffle cultivation has generally been based on suitability maps  
328 assessing climate, soil and topography potential. In Spain climate suitability has mostly been  
329 evaluated through annual precipitation, summer precipitation, mean annual temperature and  
330 mean temperature of the warmest and the coldest months (Colinas et al., 2007; Alonso Ponce  
331 et al., 2010; Serrano-Notivoli et al., 2015; Serrano-Notivoli et al., 2016). Our results showed  
332 that for eastern Spain, where truffle naturally grows, annual precipitation and temperature  
333 were highly correlated with most of the climatic parameters related to sporocarp development  
334 (Fig. 3), thus confirming their usefulness and suggesting that they alone could provide a  
335 coarse estimate for climate suitability. The most useful parameters to supplement them,  
336 according to our results, could be July-August (or September-October) potential available  
337 water, aridity intensity and mean temperature of the warmest month, due to their correlation  
338 with annual parameters not being especially high despite their high loading values (Fig. 3).  
339 In the last 20 years in Spain, truffles from plantations have an increasingly dominant position  
340 compared to those harvested in the wild (Garcia-Barreda et al., 2018). Truffle cultivation is  
341 not completely domesticated yet and many practices are empiric, mimicking natural  
342 ecosystems or following classic handbooks (Reyna and Garcia-Barreda, 2014). One of these  
343 empirically developed practices is irrigation, which has become key in many regions due to  
344 recent climate trends and future projections for precipitation (Millán et al., 2005; Büntgen et  
345 al., 2012; Le Tacon, 2016).

346 In the three clusters, precipitation and potential available water followed very similar patterns  
347 of seasonal variation, with values of cluster 2 being markedly higher than the rest and hence  
348 with much lower aridity intensity (Table 2). This demonstrates that in the wild *T.*  
349 *melanosporum* is able to grow in contrasting drought-stress environments, with the higher  
350 occurrence of truffle stands in relatively dry clusters apparently suggesting that the fungus  
351 prefers these environments. However, differences among clusters in water availability run in

352 parallel with differences in vegetation cover and growth, with wetter climates leading to  
353 improved vegetation performance (Vicente-Serrano et al., 2006; Alcaraz-Segura et al., 2010).  
354 Canopy closure negatively affects habitat suitability for truffle fruiting (Garcia-Barreda and  
355 Reyna, 2013) and this could explain that in dry regions conditions of low canopy cover linked  
356 to high habitat suitability are more frequent and persist longer term.

357 This interaction of water availability and canopy closure is not such a big deal in most  
358 plantations, which use to be intensively pruned (Olivier et al., 2002; Ricard et al., 2003).  
359 Cluster 2 was the only one showing mean precipitations similar to those characterising the  
360 summer period and the early spring of optimum years, according to data reviewed by Ricard  
361 et al. (2003) for the former and to Bardet and Fresquet (1995) for the latter. Thus, in  
362 plantations located in areas with a climate analogous to clusters 1 and 3 irrigation could be  
363 used to improve potential available water taking cluster 2 as a reference. This would imply  
364 maintaining a slightly positive potential available water in March-April and September-  
365 October, allowing a slight water deficit in May-June and a more important water deficit  
366 (about 50 mm per month) in July-August (Table 2, Fig. 4). In an average year, it would mean  
367 25-30 mm of irrigation each month from March to October. Le Tacon et al. (1982) already  
368 showed that sporocarp yield could be increased with irrigation, whereas Olivera et al. (2014)  
369 showed that the spread of *T. melanosporum* mycorrhizas in young plantations was favoured  
370 by a certain degree of water deficit. Büntgen et al. (2015) found that in an adult truffle  
371 plantation tree-ring growth was enhanced by medium –instead of high– irrigation intensity.  
372



373

374 Fig. 4. Variability of mean bimonthly potential available water within clusters

375

376 Managing soil temperature for truffle cultivation is more difficult than managing water  
 377 content. Pruning and management of soil cover (e. g. grass cover, mulching) are the most  
 378 useful tools (Ricard et al., 2003), although others such as soil tilling could also have a non-  
 379 negligible influence. Stands in cluster 1, which showed mean temperatures in the upper range  
 380 within *T. melanosporum* natural area (Garcia-Barreda et al., 2007), were the only ones  
 381 showing mean April-May temperature close to those pointed by Kulifaj (1994) in Ricard et al.  
 382 (2003) for optimum years. Cluster 1 also showed a relatively low frequency of severe frosts,  
 383 similar to the average value found by Le Tacon et al. (2014) in Richerenches region. The  
 384 remaining clusters showed higher mean frequencies, which in Richerenches were related to  
 385 years of low yield. Thus our results suggest that plantations located in areas with a climate

386 analogous to clusters 2 and 3 could benefit from practices increasing soil temperature in early  
387 spring and winter (in any case, monitoring of soil temperature would be necessary to address  
388 this issue in greater detail).

389 However canopy and soil cover have an effect not only on temperature but also on water  
390 content. During the growing season, higher temperatures intensify potential  
391 evapotranspiration, with prolonged droughts jeopardising sporocarp survival (Montant and  
392 Kulifaj, 1990; Olivier, 2008). This raises serious concerns about the interest of increasing soil  
393 temperature in non-irrigated plantations, especially in highly variable, drought-prone climates.  
394 On the other hand, it would be interesting to assess the potential of soil temperature  
395 management as a tool to boost truffle yields in irrigated plantations with climates analogous  
396 to clusters 2 and 3. In all cases these practices should not compromise potential available  
397 water or autumn temperature drop and should not be responsible of extreme and prolonged  
398 soil temperatures in summer (Montant and Kulifaj, 1990). Büntgen et al. (2015) found that a  
399 combination of warm spring and wet summer favoured tree-ring growth in an irrigated truffle  
400 plantation.

401 Some caution is required in extrapolating these results to the field. Climate change projections  
402 suggest lower precipitation and higher temperatures in southwestern Europe (Büntgen et al.,  
403 2012). For clusters 1 and 3 this means that in the short-medium term mean precipitation could  
404 drop below or near the lower end of the range in natural areas, increasing irrigation  
405 requirements. For cluster 1 it could also mean that mean temperatures could rise near the  
406 upper end of the natural range, with temperatures of the warmest month rising even above.  
407 This would require a rearrangement of cultural practices in plantations (Le Tacon, 2016).  
408 Wild populations in these areas would likely be highly vulnerable to climate change.  
409 Conservation strategies should take into account the existing genetic diversity (García-  
410 Cunchillos et al., 2014).

411 Another limitation of the study is that the agro-climatic zoning approach is not a manipulation  
412 experiment and lacks direct measures of the soil environment. Thus, we focused on  
413 identifying ecological patterns and research challenges. Irrigation research with precise soil  
414 temperature and water content measurements would be needed to fully understand irrigation  
415 needs and develop scientific irrigation programs (Le Tacon, 2016). Analysis of the correlation  
416 between interannual meteorological variability and truffle yields could be an intermediate step  
417 to approach this issue (Le Tacon et al., 2014).

418

#### 419 **4. Conclusions**

420 To our knowledge this is the first agro-climatic zoning for *T. melanosporum* cultivation in  
421 Europe and the first agro-climatic characterisation of Spanish forests naturally producing *T.*  
422 *melanosporum* that combines data from the whole country. Despite the lack of complete and  
423 reliable information about wild truffle presences and absences, the methodology has proved  
424 useful as a large-scale approach to truffle cultivation in Spain. Our results support the  
425 suitability of the climatic parameters and ranges commonly used in potentiality maps for  
426 Spanish regions. Three agro-climatic zones have been identified with a cluster analysis: (1)  
427 warm and dry climate conditions near the Mediterranean coast; (2) wet and cold conditions in  
428 the foothills of the Pyrenees and Iberian mountain ranges; and (3) cold and dry climate of the  
429 inland areas. The study provides insight into the climatic factors likely limiting harvests in the  
430 various zones and highlights the relevance of adapting cultural practices to environmental  
431 conditions. This can help truffle growers to plan ahead cultural itineraries and foresee climatic  
432 challenges. It can also help researchers to focus experimentation on the most likely limiting  
433 factors and to model the response of wild and cultivated truffles to climate change. Assessing  
434 the influence of these factors on each stage of the fruiting body development with

435 manipulation experiments in which soil temperature and water content are precisely  
436 monitored could greatly improve the management of truffle plantations.

437

#### 438 **Acknowledgements**

439 This work was supported by the collaboration agreement for the operation of CIET (funded  
440 by Diputación de Huesca, with the participation of CITA, Comarca de la Ribagorza and  
441 Ayuntamiento de Graus). R.S.N. is funded by a “Juan de la Cierva” postdoctoral grant FJCI-  
442 2017-31595.

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