

# ARCHIVIO ISTITUZIONALE DELLA RICERCA

## Alma Mater Studiorum Università di Bologna Archivio istituzionale della ricerca

Combining climate, land use change and dispersal to predict the distribution of endangered species with limited vagility

This is the final peer-reviewed author's accepted manuscript (postprint) of the following publication:

Published Version: Della Rocca, F., Milanesi, P. (2020). Combining climate, land use change and dispersal to predict the distribution of endangered species with limited vagility. JOURNAL OF BIOGEOGRAPHY, 47(7), 1427-1438 [10.1111/jbi.13804].

Availability: This version is available at: https://hdl.handle.net/11585/927452 since: 2024-05-15

Published:

DOI: http://doi.org/10.1111/jbi.13804

Terms of use:

Some rights reserved. The terms and conditions for the reuse of this version of the manuscript are specified in the publishing policy. For all terms of use and more information see the publisher's website.

This item was downloaded from IRIS Università di Bologna (https://cris.unibo.it/). When citing, please refer to the published version.

(Article begins on next page)

1	Combining climate, land use change and dispersal to predict the distribution of
2	endangered species with limited vagility
3	
4	Running title: Integrating climate, land use change and dispersal
5	
6	DELLA ROCCA FRANCESCA <sup>1</sup> , MILANESI PIETRO <sup>2</sup>
7	
8	<sup>1</sup> Dipartimento di Scienze della Terra e dell'Ambiente, Università degli Studi di Pavia, Via
9	Ferrata 1, 27100 Pavia, Italy. fdellarocca@gmail.com
10	<sup>2</sup> Swiss Ornithological Institute, Seerose 1, 6204 Sempach, Switzerland.
11	
12	Corresponding author: Francesca Della Rocca fdellarocca@gmail.com
13	
14	ACKNOWLEDGEMENTS
15	We thank Prof. Francesco Bracco, manager of the Riserva Naturale Integrale Bosco Siro
16	Negri, who supported part of this research through funds from the Italian Ministry of the
17	Environment and Protection of Land and Sea.We thank the European Environment
18	Information and Observation Network (EIONET) for making their data publicly available;
19	Peter Verburg, who kindly provided the land use change scenario maps for the year 2040, and
20	Stephanie Witczak for revising and improving this manuscript. The comments of the Editor-in
21	Chief Jon Sadler, the Associate Editor Jenny McGuire, as well as those of Jakub Horák and an
22	anonymous reviewer greatly helped improving this paper.

## 23 ABSTRACT

Aim. To investigate the effects of both climate and land use change on the distribution of

endangered beetle species with limited vagility, accounting for and ignoring species-specific

26 dispersal when projecting species distribution.

27 Location. Europe.

**Time period.** 2007-2012; 2040-2050.

29 **Taxon.** Saproxylic beetles.

Methods. Using current (2007-2012) species occurrences, we predicted the distribution of six
 endangered saproxylic beetles under a range of future (2040-50) climate and land use change
 scenarios in Europe by using ecological niche models.

**Results.** Our results showed that, while all the species considered would increase their

distribution, areas both accessible and suitable would range between only 5% and 38% of the

total potential available area, depending on the species and the future scenarios considered.

36 Main conclusion. We strongly encourage researchers and conservationists to combine

37 climate and land use change with dispersal when projecting species distribution under future

38 scenarios. This should avoid misleading predictions and overestimation, as climate and land

39 use change generate differing effects depending on the inclusion or exclusion of species

40 dispersal abilities.

41

42 KEYWORDS: ecological niche models, future scenarios, global change, macroecology, *n*43 dimensional hypervolume, saproxylic beetles, species traits.

44

## 45 1. INTRODUCTION

Many rare species are dispersal-limited, exhibiting a low probability of colonizing new sites
and establishing viable populations (Baur, 2014). The current and future distributions of these
species are highly influenced by human-related environmental change, such as climate and

49 land use change, creating insurmountable barriers to their dispersal across space and time (Jaeschke et al., 2013). Although both climate and land use change are considered dominant 50 drivers of biodiversity at a global scale (Barbet-Massin et al., 2012; Pimm et al., 2014), only 51 the former has been widely used as a predictor for modelling future species distributions (e.g. 52 Markovic et al., 2014; Titeux et al., 2016). Indeed, during the last 25 years, more than 85% of 53 published research in this field explored the impact of future climate change alone on 54 biodiversity (Titeux et al., 2016). Moreover, in the few studies that considered the impact of 55 land use change on species distribution (Radinger et al., 2016; Milanesi et al., 2017a), the 56 combined effect with climate change was rarely investigated (Mantyka-Pringle et al., 2014; 57 Radinger et al., 2016). Since species range shift varies depending on site-specific climate-land 58 59 use combinations, neglecting the effect of land use change could lead to biased predictions of 60 species distributions under future conditions. Especially, this holds true for species with 61 limited dispersal capacities, for which even minimal land use changes can dramatically impact their colonization capacity (Velo-Antón et al., 2013; McCauley et al., 2014). 62 Actually, the Biotic-Abiotic-Mobility framework ('BAM': Soberón & Peterson, 2005) 63 highlighted also the importance of species-specific dispersal characteristics in determining 64 species distribution (De Marco et al., 2011; Nobis & Normand, 2014; Vasudev et al., 2015). 65 Incorporating dispersal in ecological niche models (ENMs) improves predictions for current 66 and future species occurrence compared to standard ENMs (Engler & Guisan, 2009; Smolik 67 et al., 2010; Vasudev et al., 2015). However, most studies developing ENMs to predict the 68 distribution of species under future scenarios have not incorporated species-specific dispersal 69 abilities, relying on overly simplistic conceptualizations of dispersal (Franklin, 2010; Peterson 70 71 et al., 2011).

Taking into account these limitations, in this study we (i) investigated the effect(s) of
climate and land use change on species with short-distance dispersal abilities and (ii) defined
areas that should be accessible to them in the future. We used the current (2007-2012)

occurrences of six endangered saproxylic beetles, widely considered to be umbrella species 75 for biodiversity conservation (Ranius, 2002; Buse et al., 2007; Russo et al., 2011; Campanaro 76 et al., 2011; Solano et al., 2013; Bełcik et al., 2019), to develop ENMs using current climate 77 and land use conditions. We then projected the distributions of our target species under future 78 scenarios to estimate species potential occurrences in the years 2040-50 (based on four 79 different climate and land use change scenarios). Finally, taking into account the species-80 specific dispersal abilities of our target species, we limited their distributions in 2040-50 to 81 82 areas accessible to them across Europe.

83

#### 84 2. METHODS

85 2.1 Study area and species data

86 Our study area consisted of all continental European countries (excluding Belarus, Moldova,

87 Russia and Ukraine, because of the lack of data in national biodiversity repository servers and

in other official archives; Fig. 1). The study area ranges from 0 to 4,810 m a.s.l., and is

characterized by forests (33.3% of the total area), croplands (32.4%), shrub-lands (11.5%)

and, to a lesser extent, grasslands (7.8%) and human settlements (4%).

91 We selected six threatened species of saproxylic beetles (out of the 21 saproxylic

92 beetles species listed in the EU habitat directive), namely *Cerambyx cerdo*, *Cucujus* 

93 cinnaberinus, Lucanus cervus, Morimus funereus, Osmoderma eremita and Rosalia alpina,

for which information on observed dispersal distances were available in literature (Table S1).

95 We obtained species occurrence data for the period 2007-2012 from (i) the European

96 Environment Information and Observation NETwork (EIONET, 2013) Central Data

97 Repository server (<u>http://cdr.eionet.europa.eu/</u>), (ii) the Swiss Biological Records Center

98 (<u>http://lepus.unine.ch/carto/</u>) and (iii) the Norwegian Taxonomy Initiative

99 (http://www.biodiversity.no/). All species occurrences were resampled at the same spatial

resolution of EIONET data ( $10 \times 10$  km grid cell size; Fig. 1), resulting in a total of 4,310

101 cells for *C. cerdo*, 3,561 for *C. cinnaberinus*, 11,535 for *L. cervus*, 2,211 for *M. funereus*,

102 5,248 for *O. eremita* and 2,628 for *R. alpina*. We tested for overestimation of saproxylic

103 species occurrences calculating a modified version of the Multivariate Environmental

104 Similarity Surface (mMESS, Milanesi et al., 2017b). We find consistent results (Fig. S1-6)

and thus, we included all data collected in the further analysis.

106

107 2.2 Species ecological requirement

The species considered in this study (Table S1) are highly susceptible to both climate and 108 land use changes (Gough et al., 2015). In fact, being highly specialized wood-living beetles, 109 110 their survival is, above all, linked to the availability of suitable forest habitat. As such, their 111 ability to respond to climate change is mainly influenced by habitat degradation (Filz et al., 2013; Ball-Damerow et al., 2014). Moreover, the study species are characterized by low 112 dispersal distances (Schiegg, 2001), and inhabit most of the European deciduous old-growth 113 forests currently threatened by large-scale human disturbance (Wirth et al., 2009; Stokland et 114 al., 2012). 115

116 *C. cerdo* is widespread in most parts of Europe, but more common in the Mediterranean 117 regions, generally associated with oak forests consisting of mature or partially dead, and sun-118 exposed trees (Sama, 1988). This species occurs in semi-open forest patches of lowland and 119 hilly forests (Redolfi de Zan et al., 2017).

*C. cinnaberinus* is a poorly known species (Horák, 2011) limited to Europe, scattered
distributed throughout the continent, probably because of past population decline and local
extinctions (Horák & Chobot, 2009; Horák et al., 2010). This species live under the bark of
dead tree trunks (Horák et al., 2008) in lowland poplars and willows forests or partially-mixed
mountain forests (e.g.; Horák et al., 2010).

*L. cervus* is widely spread across Europe and is associated with mature deciduous
forests. It can be found especially in lowland and medium-altitude oak woodlands, where the

127 saproxylic larvae feed on rotten deadwood at ground level (Campanaro et al., 2011). This
128 species may also be common in urban habitats (e.g. city parks, private gardens; Hawes, 2008;
129 Harvey et al., 2011).

*M. funereus* inhabits mature beech, poplar and oak forests (Sama, 2009) within a
relatively narrow geographical zone in south-eastern Europe (Jurc et al., 2008; Carpaneto et al., 2015). Even though their preferred habitats are mature forests, populations of this species
often occur in coppiced stands, characterised by old stumps and decaying wood on the ground (Hardersen et al., 2017).

*O. eremita* is a genus that includes many species. Based on genetic studies (Audisio et al. 2007, 2009), there is now consensus that *Osmoderma eremita* is just one of four species occurring in Europe. However, in our analysis, we considered all these species as belonging to *Osmoderma eremita*. It is generally associated with hollow veteran trees (Ranius & Hedin, 2001; Svensson et al., 2011), of the ecotonal areas and clearings of mature forests, agricultural and urban landscapes (Maurizi et al., 2017). *R. alpina* lives mainly in the mountainous regions of central and southern Europe and is

142 associated with beech forests, but also maples and elms (Bosso et al., 2013; Lachat et al.,

143 2013). It prefers open and semi-open woodlands (Russo et al., 2011), reproducing mainly in

144 mature, dead (or declining), and sun-exposed trees (Campanaro et al., 2017a).

145

146 2.3 Predictor variables

147 For the period 2007-2012, we considered a total of 28 predictors of species occurrence,

148 accounting for the assumed habitat characteristics of the target species, and for which

149 continuous spatial data were available for the entire study area (Table S2). We considered two

150 topographic variables (ASTER GDEM; <u>gdem.ersdac.jspacesystems.or.jp</u>), seven land use

151 variables (CORINE Land Cover 2012; <u>https://land.copernicus.eu/pan-european/corine-land-</u>

152 <u>cover/clc-2012</u>) and the Euclidean distances to human settlements (Table S2). Moreover, we

considered 19 bioclimatic variables (<u>http://www.worldclim.org</u>; Table S2). All predictors were resampled at a  $10 \times 10$  km grid cell size.

For the period 2040-50, we considered four different scenarios of climate and land use 155 change. Specifically, thanks to recent advances in the development of socioeconomic 156 storylines and their potential effect on future land use patterns, we used four land use change 157 scenarios addressing both changes in land cover and land use intensity, reflecting 158 socioeconomic, cultural, political, and technological changes in the EU (Stürck et al., 2015; 159 data provided by the authors). These scenarios, namely Libertarian Europe (A1), Eurosceptic 160 Europe (A2), Social Democracy Europe (B1) and European Localism (B2), represent strong, 161 162 high, moderate and low economic interventions and growth, respectively (see Table S3 and 163 Stürck et al., 2015 for details on the scenarios). Similar to Ihlow et al. (2016), we considered four climate change scenarios 164 (Representative Concentration Pathways, RCPs) for the year 2050 averaging 11 general 165 circulation models (GCMs: BCC-CSM1-1, CCSM4, GISS-E2-R, HadGEM2-AO, hadGEM2-166 ES, IPSL-CM5A-LR, MIROC-ESM-CHEM, MIROC-ESM, MIROC5, MRI-CGCM3 and 167 Nor-ESM1-M). These scenarios were obtained from the fifth assessment of the 168 169 Intergovernmental Panel for Climate Change (IPCC AR5WG1 2014; http://www.ipcc.ch). 170 The selected RCPs represent four possible greenhouse gas emission trajectories, including low (RCP 2.6), moderate (RCP 4.5), high (RCP 6) and strong (RCP 8.5) increases in global 171 radiative forcing (Ihlow et al., 2016). Based on these scenarios, we used the same predictors 172 173 for the period from 2007-2012, available at a  $10 \times 10$  km grid cell size (the same resolution as current climatic conditions) from the Worldclim website (http://www.worldclim.org). 174 175

176 2.4 Data analysis

177 To avoid multi-collinearity among predictors, we estimated the variance inflation factor (VIF)

178 for each predictor. Thus, in the further analysis we retained 13 (ecologically relevant;

Thomaes et al., 2008; Bosso et al., 2013; Campanaro et al., 2017b) out of 28 predictors due to
VIF values lower than three (i.e. poorly correlated with other predictors; Zuur et al., 2010;
Table S2).

Thus, we applied a recently developed ENMs, namely "*n*-dimensional hypervolume" (R 182 package HYPERVOLUME v. 2.0.11; Blonder et al., 2014; 2017a), considering current 183 species occurrences, climate and land use conditions but projecting on different future (2040-184 50) climate and land use change scenarios (see Table S4 for details on model parameters). N-185 dimensional hypervolume has several benefits compared to other extant ENMs as it (i) 186 considers all the dimensions (predictors) to measure the volume of a high-dimensional shape 187 188 (including holes or other complex geometrical features; Blonder et al., 2014; 2017a), (ii) 189 allows delineation of the entire hypervolume without generating unbounded volumes (Blonder et al., 2014; Peterson et al., 2011) and (iii) while relying on presence-only data, 190 correctly classified false absences through robust bandwidth estimation methods (e.g. 191 Silverman estimator; Blonder et al., 2017b). 192 Similar to Jaeschke et al. (2013), we identified suitable areas accessible to our target 193 species in the future multiplying the yearly dispersal distance of each species (Table S1) for 194 195 the total number of years (n=33, from 2013 to 2045, average of 2040-50). The resulting 196 distances were divided by the number of years larvae would take to develop in the adult stage 197 (Table S1) plus one and then used to define accessible areas around current occurrences. 198

## 199 **3. RESULTS**

Without taking into account species-specific dispersal abilities, we found that suitable areas
for the saproxylic beetles for the period 2040-50 would vary between 3,345,200 km<sup>2</sup> and
4,661,300 km<sup>2</sup>, corresponding to the scenario A2 – RCP 2.6 for *M. funereus* and scenario B2
– RCP 6 for *L. cervus*, respectively (Table 1). Specifically, suitable conditions for *C. cerdo*would occur all over Europe, mainly in the central-eastern part of the continent, while those

for *C. cinnaberinus* would occur in many areas of central-eastern Europe (excluding
Switzerland). For *L. cervus* suitable areas would be mainly located from eastern to western
Europe (excluding the southern part of the European continent), while those of *O. eremita*would be in central-eastern Europe, including Sweden and Finland. Finally, suitable areas for *M. funereus* would be widely located across central-eastern Europe, while *R. alpina* would be
distributed throughout Europe, though most concentrated in France, Lithuania and Latvia.

When examining the suitable areas available for the six modelled species (generated without accounting for dispersal abilities) we found a higher impact of climate change relative to land use change on the distribution of *C. cerdo, C. cinnaberinus, M. funereus* and *R. alpina*. For these species we found a direct relationship between climate change increase and the availability of suitable areas (Fig. 2). Conversely, the suitable area of *L. cervus* and *O. eremita* is more susceptible to land use change than climate change, reaching the maximum extent in land use change scenarios B2 and A1, respectively (Fig. 2)

When we combined climate and land use change with species-specific dispersal 218 abilities, we found that from 2040-50 accessible suitable areas for the six saproxylic beetles 219 would range between only 5.05% and 38.98% of the total available suitable areas calculated 220 221 previously (Table 2; Table S5). When considering dispersal abilities, C. cerdo would reach 222 24% of its suitable area available from 2040-50 (Fig. S7), while C. cinnaberinus would reach 223 only 13% (Fig. S8), mainly located in Eastern Europe, Fennoscandian and Baltic countries. L. cervus would reach the largest percentage of its suitable area available from 2040-50 in 224 225 relation to the other species considered, corresponding to 36 - 38% (Fig. S9), while M. funereus would reach only 5% of its suitable area for this timeframe (Fig. S10), mainly 226 227 located in Slovenia, Hungary, Bulgaria, Southern Romania and Northern Greece. Finally, O. eremita would reach 26% of its suitable areas available in 2040-50 (Fig. S11), mainly located 228 in central Europe, while *R. alpina* would reach 14% of its suitable area available during this 229

timeframe (Fig. S12), mainly located in the mountainous and hilly areas of Southern Europe
(excluding Bosnia, Montenegro, Albania and Kosovo).

When including species-specific dispersal abilities we generally found a higher impact 232 of land use change on the distribution of all six saproxylic beetles compared to when dispersal 233 abilities were excluded (Fig. 3). Specifically, the highest percentage of accessible suitable 234 areas for C. cerdo and M. funereus would be reached in the context of land use change 235 scenario B1 while for *C. cinnaberinus* and *R. alpina*, it would be land use change scenario B2 236 237 (Fig. 3). Finally, for *L. cervus* and *O. eremita*, the highest percentage of available suitable area reached corresponds to the A1 land use change scenario (Fig 3). Generally, an increase in 238 239 greenhouse gas emissions corresponds to an increase in the available suitable areas for C. 240 cerdo, C. cinnaberinus, L. cervus and R. alpina, while in a decrease O. eremita (Fig 3). However, climate change would have a weak effect on the available suitable areas reached for 241 M. funereus (Fig. 3). 242

243

#### 244 **4. DISCUSSION**

Our results highlighted differences in the predicted distributions of saproxylic beetles given the differing effects that climate and land use can generate when accounting for or ignoring species dispersal abilities. Land use change was found to be the main constraint to species distributions when accounting for dispersal, while climate change when ignoring dispersal.

4.1 Distribution of saproxylic species considering future climate and land use changes
Our modelled species' ranges will grow in the future due to the combined effects of changing
temperatures and precipitations (due to greenhouse gas emissions increase) and an expansion
of forested areas (occurring in all the land use scenarios considered). However, while climate
change has a similar effect on most of the investigated species, the effect of land use change is
more species-specific. This is mainly due to the different landscape variables considered: the

expansion of grasslands, the abandonment of grasslands resulting in forest expansion, the
expansion of human settlements, the intensification of forest management, and the resulting
habitat diversity and the intensity of their exploitation (Stürck et al., 2015).

259

4.2 Accessible vs. available suitable areas under future climate and land use change scenarios 260 We found that none of the saproxylic beetles considered in this study will reach all of the 261 suitable areas available in 2040-50, due to the limited dispersal abilities characterizing these 262 263 species. Flightless species with narrow geographic distributions would be able to occupy sometimes as little as 5% of the suitable area available to them in 2040-50, as is the case with 264 265 M. funereus. Conversely, widespread species might be able to cover as much as 38% of the 266 suitable area available to them in 2040-50, as is the case with L. cervus. Thus, species-specific dispersal abilities greatly limit the ability to colonize new suitable areas. 267

Without accounting for species-specific dispersal abilities, we generally found a strong 268 effect of climate change when predicting future species distributions (except for L. cervus and 269 O. eremita). Indeed, for most of our species, suitable areas would increase with increasing 270 greenhouse gas emissions, indicating better climatic conditions for their occurrence in the 271 272 future, supporting a general expansion of many species of saproxylic beetles to higher 273 elevations and latitudes in Europe. However, suitable areas of L. cervus and O. eremta would 274 be mainly affected by land use change: the future scenarios "European localism" (B2 – low economic interventions and growth) and "Libertarian" (A1 - strong economic interventions 275 276 and growth) predicted the maximum distribution expansion of these species, respectively.

When accounting for species-specific dispersal abilities, we found a weak effect of
climate change and a rather strong effect of land use change. Indeed, we found a clear, inverse
relationship between the amount of suitable accessible areas and the degree of land use
change for *C. cinnaberinus* and *R. alpina*, for which the scenario "European localism" (B2 –
low economic interventions and growth) predicted the highest expansion of suitable

accessible areas. This land use change scenario, followed by "Social Democracy Europe" (B1 282 - moderate economic interventions and growth), predicted the maximum expansion for C. 283 cerdo and M. funereus. The main differences among these two scenarios concern the extent of 284 grasslands, croplands (not included in the ENMs due to multi-collinearity, but see below), 285 forests and the intensity of their exploitation (Table S3; Stürck et al., 2015). However, while 286 the intensification of forest management, predicted for both the B1 and B2 scenarios, would 287 present a threat for saproxylic beetles (Jonsson et al., 2005; 2006), the increase in forest cover 288 (more than 170,000 km<sup>2</sup> of current croplands would be abandoned and return naturally to 289 forests or grasslands; Stürck et al., 2015) would increase the extent of suitable habitat for our 290 291 target species. Moreover, the de-intensification of grasslands predicted for both the B1 (in 292 combination with human settlement contraction) and B2 scenarios (i.e. reduction of livestock density to sustainable grazing) represent a positive change for saproxylic beetles (Russo et al., 293 294 2011).

Although, at a broad scale, climate change is expected to be the main constraint for 295 many species distributions, here we found that this is only true for C. cinnaberinus, R. alpina 296 and C. cerdo in the unrealistic scenario of unlimited dispersal. Conversely, we found that land 297 298 use change affects all our modelled species. In particular, L. cervus and O. eremita 299 distributions are affected by land use change in both the cases of limited and unlimited dispersal, while those of C. cerdo, C. cinnaberinus, M. funereus and R. alpina are affected by 300 land use change only upon taking their dispersal abilities into account. The strong effect of 301 302 land use change on these saproxylic beetles could be explained by the high dependence of these species on the amount, availability and distribution of deadwood, which, in turn, is 303 304 closely linked to forest use (Bradford et al., 2014; Mazziotta et al., 2016).

305

306 4.3 Caveats

We followed the approach of Jaeschke et al. (2013) for estimating yearly dispersal distance of 307 saproxylic beetles. While we estimated yearly dispersal distance by dividing the maximum 308 dispersal distance of each species by the number of years larvae would take to develop in the 309 adult stage plus one, this likely resulted in overestimation of the distance these species are 310 able to cover. Because of the lack of information on species-traits for our target species, we 311 assumed that the probability of colonization was 1 rather than 0. In doing so, we estimated the 312 maximum dispersal probability without including any species-traits in the model. Measuring 313 314 the real dispersive capacity of a species is very complex (Trakhtenbrot et al., 2005). In a variety of actively dispersing invertebrates, precise estimations of long-distance dispersal 315 316 ability are based on morphological characteristics, such as body size or wingspan (Merckx & 317 VanDyck, 2002; Cizek, et al., 2006), or on life-history traits (Sutherland et al., 2000). However, in many cases, such qualitative proxies do not prove informative about dispersal 318 ability, due to the uncertainty involved in the identification of the dispersal distance 319 320 mechanism (Trakhtenbrot et al., 2005). As such, often quantitative models are preferred (Trakhtenbrot et al., 2005). Some used data on variables affecting dispersal to predict the 321 magnitude and frequency of long-distance dispersal, including changes in parameter values 322 323 caused by human impacts threatening biodiversity (Trakhtenbrot et al., 2005). However, 324 because of the high variability in behavioural and environmental factors (Higgins et al., 325 2003), these models tend to be case-specific (e.g. South & Kenward, 2001; Macdonald & Rushton, 2003) and often are applied on passive dispersers (Nathan et al., 2002) rather than 326 327 active animals, such as our target species. For many active dispersers, including insects, phenomenological models are often used (Trakhtenbrot et al., 2005). These approaches can be 328 329 applied if previous population demographic studies are available, for example, capture-markrecapture studies that can provide presence/absence or dispersal distance data for the species 330 studied (Kuras et al., 2003). The quality and quantity of the necessary data needs to be 331 332 thoroughly assessed to make accurate predictions for specific species in a landscape context

(Whitmee & Orme, 2012). For most studies on species distribution these data are not
available (Nathan, 2002).

Despite its limitations, we felt that the approach of Jaeschke et al. (2013) can be 335 reasonably applied to our target species for two main reasons. First, the dispersal distances 336 reported in this study are most likely underestimated. Most field studies on saproxylic 337 dispersal distance focus on one or few populations (Chiari et al., 2013; Torres-Vila et al., 338 2017), and are spatially limited (Rossi De Gasperis et al., 2016; Drag et al., 2011) leading to 339 an underestimation of the real distances an individual might be able to cover. This 340 underestimation could be partially compensated by overestimation in our model. Second, 341 342 although we may overestimate dispersal in our target species, our resulting spatial predictions 343 are still very useful. In fact, they are more accurate than the unconstrained or no-dispersal scenarios often incorrectly assumed in most of the ENMs predicting the impact of climate 344 change on species distributions (Araújo & Rahbek, 2006; Broennimann et al., 2006; Botkin et 345 al., 2007). 346

While deadwood is the main resource affecting saproxylic beetle occurrence (Stokland 347 & Siitonen, 2012; Milberg et al., 2016) and can influence microclimatic parameters (e.g. 348 349 hollow trees, Ranius, 2002; Pilskog et al., 2016), we couldn't include deadwood-related 350 variables in our analyses as deadwood amount and forest management intensity data is 351 lacking at a continental scale (as well as a global scale). Actually, deadwood availability depends on forest management, which alter its distribution and abundance in a quite 352 353 unpredictable way (i.e. much more than climate and land use; Della Rocca et al., 2018). Thus, simulated future scenarios of deadwood amount/forest management intensity would be 354 random and not based on accurate data and validations. Hence, assuming that climate and 355 356 land use change are the main driving forces available to model species distribution (Walther et al., 2002; Hitch & Leberg 2007; Guo et al., 2018), we can identify those areas where 357 saproxylic species would exist should the deadwood required for their survival be present. 358

Finally, while the monitoring our target species is mandatory for EU Member States and regularly carried out in Switzerland and Norway, there are currently no standardized monitoring protocols at a continental scale (Campanaro et al., 2016). However, the methods used to sample our target species (e.g. attractive pheromones, baited traps, direct observations along transects) are the same within our study area (Campanaro et al., 2016; Maurizi et al., 2017) and thus comparable among different countries. Indeed, conservation actions at the continental scale within the EU are based on these data, collected from 28 countries.

#### 367 5. CONCLUSIONS

We developed this study with the observation that most of the published papers aiming to 368 predict species distribution under global change often lack the inclusion of species-specific 369 dispersal abilities. Surprisingly, this holds true also when dealing with species with low 370 371 vagility for which the dispersal is obviously the main factor limiting their distribution (McCauley et al., 2014). Thus, in this study we showed the importance of dispersal ability in 372 373 species distribution modeling and how the effect of climate and land use change differed if 374 dispersal abilities are taken into account or not. Moreover, we showed that combining climate and land use change scenarios with species-specific dispersal distances, resulted in more 375 accurate and realistic projections of species distributions. Our findings are very important 376 377 especially because poor dispersers suffer of high risk of extinction (Beissinger, 2000) due to their limited ability to move away from unsuitable habitat or climatic conditions. 378 379 Saproxylic beetles are emblematic from this point of view. Through our approach we were able to accurately identify areas with fundamental species-specific resources, such as ancient 380 woods, forest remnants, hedgerows and old deciduous tree and to provide tolls for 381 382 establishing protected areas and/or extending already existing ones. Concluding, we encourage researchers and conservationists to follow our approach when species dispersal 383

- information is available to avoid misleading and overestimated predictions, providing supportfor conservation actions on these species and their habitats.
- 386

## 387 DATA AVAILABILITY STATEMENT

- 388 Species occurrence data used in this study is freely available at the following links:
- 389 <u>http://cdr.eionet.europa.eu/, http://lepus.unine.ch/carto/ and http://www.biodiversity.no/.</u>
- 390 GIS layers related to bioclimatic predictors for both current and future scenarios used in this
- 391 study are available at <u>http://www.worldclim.org</u>. Current land use GIS layers are available at
- 392 <u>https://land.copernicus.eu/pan-european/corine-land-cover/clc-2012</u>, while future land use
- 393 scenarios are freely available at <u>http://labs.kh.hercules-landscapes.eu/labs/themeLD.html</u>.
- 394

## 395 **REFERENCES**

- Araújo, M.B. & Rahbek, C. (2006). How does climate change affect biodiversity? *Science*,
  313, 1396–1397.
- Audisio, P., Brustel, H., Carpaneto, G.M., Coletti, G., Mancini, E., Piattella, E., Trizzino, M.,
- 399 Dutto, M., Antonini, G. & De Biase, A. (2007) Updating the taxonomy and distribution of
- 400 the European Osmoderma, and strategies for their conservation (Coleoptera, Scarabaeidae,
- 401 Cetoniinae). *Fragmenta Entomologica*, **39**, 273–290.
- 402 Audisio, P., Brustel, H., Carpaneto, G. M., Coletti, G., Mancini, E., Trizzino, M., Antonini, G.
- 403 & De Biase, A. (2009). Data on molecular taxonomy and genetic diversification of the
- 404 European Hermit beetles, a species complex of endangered insects (Coleoptera:
- 405 Scarabaeidae, Cetoniinae, Osmoderma). Journal of Zoological Systematics and
- 406 Evolutionary Research, 47, 88-95.
- 407 Ball-Damerow, J.E., M'Gonigle, L.K. & Resh, V.H. (2014). Changes in occurrence, richness,
- 408 and biological traits of dragonflies and damselflies (*Odonata*) in California and Nevada
- 409 over the past century. *Biodiversity and Conservation*, **23**, 2107–2126.

- 410 Barbet-Massin, M., Thuiller, W. & Jiguet, F. (2012). The fate of European breeding birds
- 411 under climate, land-use and dispersal scenarios. *Global change biology*, **18**, 881–890.
- 412 Baur, B. (2014). Dispersal-limited species-a challenge for ecological restoration. *Basic and*
- 413 *Applied Ecology*, **15**, 559–564.
- 414 Beissinger, S.R. (2000). Ecological mechanisms of extinction. Proceedings of National
- 415 *Academy of Science USA*, **97**, 11688–11689.
- 416 Bełcik, M., Goczał, J., & Ciach, M. (2019). Large-scale habitat model reveals a key role of
- 417 large trees and protected areas in the metapopulation survival of the saproxylic specialist
- 418 *Cucujus cinnaberinus. Biodiversity and Conservation*, 1-21.
- 419 Blonder, B., Lamanna, C., Violle, C. & Enquist, B.J. (2014). The n-dimensional
- 420 hypervolume. *Global Ecology and Biogeography*, **23**, 595–609.
- 421 Blonder, B., Morrow, C.B., Maitner, B., Harris, D.J., Lamanna, C., Violle, C., Enquist, B.J. &
- 422 Kerkhoff, A.J. (2017a). New approaches for delineating n-dimensional hypervolumes.
- 423 *Methods in Ecology and Evolution*, **9**, 305–319.
- 424 Blonder, B., Lamanna, C., Violle, C. & Enquist, B.J. (2017b). Using *n*-dimensional
- 425 hypervolumes for species distribution modelling: A response to Qiao et al. (). *Global*
- 426 *Ecology and Biogeography*, **26**, 1071–1075.
- 427 Bosso, L., Rebelo, H., Garonna, A.P. & Russo, D. (2013). Modelling geographic distribution
- 428 and detecting conservation gaps in Italy for the threatened beetle *Rosalia alpina*. *Journal*
- 429 *for Nature Conservation*, **21**, 72–80.
- 430 Botkin, D.B., Saxe, H., Araujo, M.B., Betts, R., Bradshaw, R.H.W., Cedhagen, T., Chesson,
- 431 P., Dawson, T.P., Etterson, J.R., Faith, D.P., Ferrier, S., Guisan, A., Hansen, A.S., Hilbert,
- 432 D.W., Loehle, C., Margules, C., New, M., Sobel, M.J. & Stockwell, D.R.B. (2007).
- 433 Forecasting the effects of global warming on biodiversity. *Bioscience*, **57**, 227–236.

- 434 Bradford, M.A., Warren II, R.J., Baldrian, P., Crowther, T.W., Maynard, D.S., Oldfield, E.E.,
- 435 Wieder, W.R., Wood, S.A. & King, J.R. (2014). Climate fails to predict wood
- 436 decomposition at regional scales. *Nature Climate Change*, **4**, 625.
- 437 Broennimann, O., Thuiller, W., Hughes, G., Midgley, G.F., Alke-made, J.R.M. & Guisan, A.
- 438 (2006). Do geographic distribution, niche property and life form explain plants'
- 439 vulnerability to global change? *Global Change Biology*, **12**, 1079–1093.
- 440 Buse, J., Schröder, B. & Assmann, T. (2007). Modelling habitat and spatial distribution of an
- 441 endangered longhorn beetle–a case study for saproxylic insect conservation. *Biological*442 *Conservation*, 137, 372–381.
- 443 Campanaro, A., Toni, I., Hadersen, S. & Grasso, D.A. (2011). Monitoring of *Lucanus cervus*
- by means of remains of predation (*Coleoptera: Lucanidae*). *Entomologia generalis*, **33**, 79–
  89.
- 446 Campanaro, A., Zapponi, L., Hardersen, S., Méndez, M., Al Fulaij, N., Audisio, P., Bardiani,
- 447 M., Carpaneto, G.M., Corezzola, S., Della Rocca, F. & Harvey, D. (2016). A European
- 448 monitoring protocol for the stag beetle, a saproxylic flagship species. *Insect conservation*
- *and diversity*, **9**, 574–584.
- 450 Campanaro, A., RedolfideZan, L., Hardersen, S., Antonini, G., Chiari, S., Cini, A., Mancini,
- 451 E., Mosconi, F., Gasperis, S.R. de & Solano, E. (2017a). Guidelines for the monitoring of
- 452 *Rosalia alpina. Nature Conservation*, **20**, 165.
- 453 Campanaro, A., Hardersen, S., Zan, L.R. de, Antonini, G., Bardiani, M., Maura, M., Maurizi,
- 454 E., Mosconi, F., Zauli, A. & Bologna, M.A. (2017b). Analyses of occurrence data of
- 455 protected insect species collected by citizens in Italy. *Nature Conservation*, **20**, 265.
- 456 Carpaneto, G.M., Baviera, C., Biscaccianti, A.B., Brandmayr, P., Mazzei, A., Mason, F.,
- 457 Battistoni, A., Teofili, C., Rondinini, C. & Fattorini, S. (2015). A Red List of Italian
- 458 Saproxylic Beetles: taxonomic overview, ecological features and conservation issues
- 459 (*Coleoptera*). *Fragmenta entomologica*, **47**, 53–126.

- 460 Chiari, S., Carpaneto, G.M., Zauli, A., Zirpoli, G.M., Audisio, P. & Ranius, T. (2013).
- 461 Dispersal patterns of a saproxylic beetle, *Osmoderma eremita*, in Mediterranean
- 462 woodlands. *Insect Conservation and Diversity*, **6**, 309–318.
- 463 Cizek, L., Fric, Z. & Konvicka, M. (2006). Host plant defences and voltinism in European
  464 butterflies. *Ecological Entomology*, **31**, 337–344.
- 465 De Marco, D.E., Montemurro, M.A. & Cannas, S.A. (2011). Comparing short and long-
- distance dispersal: modelling and field case studies. *Ecography*, **34**, 671–682.
- 467 Della Rocca, F., Bogliani, G., Breienr, F.T. & Milanesi, P. (2019). Identifying hotspots for
- 468 rare species under climate change scenarios: improving saproxylic beetle conservation in
- 469 Italy. *Biodiversity and Conservation*, **28**, 433–449.
- 470 Drag, L., Hauck, D., Pokluda, P., Zimmermann, K. & Cizek, L. (2011). Demography and
- dispersal ability of a threatened saproxylic beetle: a mark-recapture study of the Rosalia
- 472 Longicorn (*Rosalia alpina*). *PLoS One*, **6**, e21345.
- 473 Engler, R. & Guisan, A. (2009). MigClim: predicting plant distribution and dispersal in a
  474 changing climate. *Diversity and Distributions*, **15**, 590–601.
- 475 Filz, K.J., Wiemers, M., Herrig, A., Weitzel, M. & Schmitt, T. (2013). A question of
- 476 adaptability: Climate and habitat change lower trait diversity in butterfly communities in
- south-western Germany. *European Journal of Entomology*, **110**, 633–642.
- 478 Franklin, J. (2010). Moving beyond static species distribution models in support of
- 479 conservation biogeography. *Diversity and Distributions*, **16**, 321–330.
- 480 Gough, L.A., Sverdrup-Thygeson, A., Milberg, P., Pilskog, H.E., Jansson, N., Jonsell, M. &
- 481 Birkemoe, T. (2015). Specialists in ancient trees are more affected by climate than
- 482 generalists. *Ecology and evolution*, **5**, 5632–5641.
- 483 Guo, F., Lenoir, J. & Bonebrake, T.C. (2018). Land-use change interacts with climate to
- determine elevational species redistribution. *Nature communications*, **9**, 1315.

- 485 Hardersen, S., Bardiani, M., Chiari, S., Maura, M., Maurizi, E., Roversi, P.F., Mason, F. &
- Bologna, M.A. (2017). Guidelines for the monitoring of *Morimus asper funereus* and

487 *Morimus asper asper. Nature Conservation*, **20**, 205.

- 488 Harvey, D.J., Gange, A.C., Hawes, C.J. & Rink, M. (2011). Bionomics and distribution of the
- 489 stag beetle, *Lucanus cervus* (L.) across Europe. *Insect Conservation and Diversity*, **4**, 23–

490 38.

Hawes, C. J. (2008). The stag beetle *Lucanus cervus* (linnaeus, 1758) (*coleoptera: lucanidae*):
a mark-release-recapture study undertaken in one united kingdom residential garden. *Rev.*

493 *Écol.* (*Terre Vie*), **63**, 139–146.

- Higgins, S.I., Lavorel, S. & Revilla, E. (2003). Estimating plant migration rates under habitat
- loss and fragmentation. *Oikos*, **101**, 354–366.
- Hitch, A.T. & Leberg, P.L. (2007). Breeding distributions of North American bird species
  moving north as a result of climate change. *Conservation Biology*, 21, 534–539.
- 498 Horák, J., Chobot, K., Kohutka, A. & Gebauer, R. (2008). Possible factors influencing the
- distribution of a threatened saproxylic beetle *Cucujus cinnaberinus* (Scopoli 1763)
- 500 (*Coleoptera: Cucujidae*). *The Coleopterists Bulletin*, **62**, 437–440.
- 501 Horák, J. & Chobot, K. (2009). Worldwide distribution of saproxylic beetles of the genus
- 502 *Cucujus Fabricius*, 1775 (*Coleoptera: Cucujidae*). Saproxylic beetles–Their role and
- diversity in European woodland and tree habitats. Pensoft Publishers, Sofia–Moscow, 189–
  206.
- 505 Horák, J., Vávrová, E. & Chobot, K. (2010). Habitat preferences influencing populations,
- 506 distribution and conservation of the endangered saproxylic beetle *Cucujus cinnaberinus*
- 507 (*Coleoptera: Cucujidae*) at the landscape level. *European Journal of Entomology*, 107, 81–
  508 88.
- 509 Horák, J. (2011). Response of saproxylic beetles to tree species composition in a secondary
- urban forest area. *Urban Forestry & Urban Greening*, **10**, 213–222.

- 511 Kuras, T., Benes, J., Fric, Z. & Konvicka, M. (2003). Dispersal patterns of endemic alpine
- 512 butterflies with contrasting popula- tion structures: *Erebia epiphron* and *E. sudetica*.

513 *Population Ecology*, **45**, 115-123.

- 514 Ihlow, F., Courant, J., Secondi, J., Herrel, A., Rebelo, R., Measey, G.J., Lillo, F., de Villiers,
- 515 F.A., Vogt, S. & de Busschere, C. (2016). Impacts of climate change on the global invasion
- 516 potential of the African clawed frog *Xenopus laevis*. *PLoS One*, **11**, e0154869.
- Jaeschke, A., Bittner, T., Reineking, B. & Beierkuhnlein, C. (2013). Can they keep up with
- 518 climate change?–Integrating specific dispersal abilities of protected *Odonata* in species

519 distribution modelling. *Insect Conservation and Diversity*, **6**, 93–103.

- 520 Jonsson, B.G., Kruys, N. & Ranius, T. (2005). Ecology of species living on dead wood-
- 521 lessons for dead wood management. *Silva Fennica*, **39**, 289–309.
- 522 Jonsson, M., Ranius, T., Ekvall, H., Bostedt, G., Dahlberg, A., Ehnström, B., Nordén, B. &
- 523 Stokland, J.N. (2006). Cost-effectiveness of silvicultural measures to increase substrate
- availability for red-listed wood-living organisms in Norway spruce forests. *Biological*
- 525 *Conservation*, **127**, 443–462.
- Jurc, M., Ogris, N., Pavlin, R. & Borkovic, D. (2008). Forest as a habitat of saproxylic beetles
  on natura 2000 sites in slovenia. *Rev. Écol.(Terre Vie)*, 63, 61–74.
- 528 Lachat, T., Ecker, K., Duelli, P. & Wermelinger, B. (2013). Population trends of *Rosalia*
- *alpina* (L.) in Switzerland: a lasting turnaround? *Journal of Insect Conservation*, **17**, 653–
  662.
- 531 Larsson, M.C. & Svensson, G.P. (2011). Monitoring spatiotemporal variation in abundance
- and dispersal by a pheromone-kairomone system in the threatened saproxylic beetles
- 533 *Osmoderma eremita* and *Elater ferrugineus*. *Journal of Insect Conservation*, **15**, 891–902.
- 534 Macdonald, D.W. & Rushton, S. (2003). Modelling space use and dispersal of mammals in
- real landscapes: a tool for conservation. *Journal of Biogeography*, **30**, 607.

- 536 Mantyka-Pringle, C.S., Martin, T.G., Moffatt, D.B., Linke, S. & Rhodes, J.R. (2014).
- 537 Understanding and predicting the combined effects of climate change and land-use change
- on freshwater macroinvertebrates and fish. *Journal of Applied Ecology*, **51**, 572–581.
- 539 Markovic, D., Carrizo, S., Freyhof, J., Cid, N., Lengyel, S., Scholz, M., Kasperdius, H. &
- 540 Darwall, W. (2014). Europe's freshwater biodiversity under climate change: distribution
- shifts and conservation needs. *Diversity and Distributions*, **20**, 1097–1107.
- 542 Maurizi, E., Campanaro, A., Chiari, S., Maura, M., Mosconi, F., Sabatelli, S., Zauli, A.,
- 543 Audisio, P. & Carpaneto, G.M. (2017). Guidelines for the monitoring of *Osmoderma*
- *eremita* and closely related species. *Nature Conservation*, **20**, 79.
- 545 Mazziotta, A., Triviño, M., Tikkanen, O.-P., Kouki, J., Strandman, H. & Mönkkönen, M.
- 546 (2016). Habitat associations drive species vulnerability to climate change in boreal forests.
- 547 *Climatic change*, **135**, 585–595.
- 548 Merckx, T. & Van Dyck, H. (2002). Interrelations among habitat use, behavior, and flight-
- related morphology in two cooccurring Satyrine butterflies, *Maniola jurtina* and *Pyronia*
- *tithonus. Journal of Insect Behavior*, **15**, 541–561.
- 551 McCauley, S.J., Davis, C.J., Werner, E.E. & Robeson, M.S. (2014). Dispersal, niche breadth
- and population extinction: colonization ratios predict range size in North American
- dragonflies. *Journal of Animal Ecology*, **83**, 858–865.
- 554 Milanesi, P., Breiner, F.T., Puopolo, F. & Holderegger, R. (2017a). European human-
- dominated landscapes provide ample space for the recolonization of large carnivore
- populations under future land change scenarios. *Ecography*, **40**, 1359–1368.
- 557 Milanesi, P., Herrando, S., Pla, M., Villero, D. & Keller, V. (2017b). Towards continental
- bird distribution models: environmental variables for the second European breeding bird
- atlas and identification of priorities for further surveys. *Vogelwelt*, 137, 53–60.
- 560 Milberg, P., Bergman, K., Sancak, K. & Jansson, N. (2016). Assemblages of saproxylic
- beetles on large downed trunks of oak. *Ecology and evolution*, **6**, 1614–1625.

- Nathan, R. (2001). Dispersal biogeography. Encyclopedia of biodiversity (ed. by S.A. Levin),
  pp. 127-152. Academic Press, San Diego.
- Nobis, M.P. & Normand, S. (2014). KISSMig–a simple model for R to account for limited
  migration in analyses of species distributions. *Ecography*, 37, 1282–1287.
- 566 Peterson, A.T., Soberón, J., Pearson, R.G., Anderson, R.P., Martínez-Meyer, E., Nakamura,
- 567 M. & Araújo, M.B. (2011). *Ecological Niches and Geographic Distributions (MPB-49)*.
- 568 Princeton University Press.
- 569 Pilskog, H.E., Birkemoe, T., Framstad, E. & Sverdrup-Thygeson, A. (2016). Effect of habitat
- size, quality, and isolation on functional groups of beetles in hollow oaks. *Journal of Insect Science*, 26, 1–8.
- 572 Pimm, S.L., Jenkins, C.N., Abell, R., Brooks, T.M., Gittleman, J.L., Joppa, L.N., Raven, P.H.,
- 573 Roberts, C.M. & Sexton, J.O. (2014). The biodiversity of species and their rates of
- extinction, distribution, and protection. *Science*, **344**, 1246752.
- 575 Radinger, J., Hölker, F., Horký, P., Slavík, O., Dendoncker, N. & Wolter, C. (2016).
- 576 Synergistic and antagonistic interactions of future land use and climate change on river fish
- assemblages. *Global change biology*, **22**, 1505–1522.
- 578 Ranius, T. & Hedin, J. (2001). The dispersal rate of a beetle, *Osmoderma eremita*, living in
- tree hollows. *Oecologia*, **126**, 363–370.
- 580 Ranius, T. (2002). Osmoderma eremita as an indicator of species richness of beetles in tree
- hollows. *Biodiversity and Conservation*, **11**, 931–941.
- 582 Redolfi de Zan, L., Bardiani, M., Antonini, G., Campanaro, A., Chiari, S., Mancini, E.,
- 583 Maura, M., Sabatelli, S., Solano, E. & Zauli, A. (2017). Guidelines for the monitoring of
- 584 *Cerambyx cerdo. Nature Conservation*, **20**, 129.
- 585 Rossi de Gasperis, S., Passacantilli, C., Redolfi De Zan, L. & Carpaneto, G.M. (2016).
- 586 Overwintering ability and habitat preference of *Morimus asper*: a two-year mark-recapture

- 587 study with implications for conservation and forest management. *Journal of Insect*
- 588 *Conservation*, **20**, 821–835.
- Russo, D., Cistrone, L. & Garonna, A.P. (2011). Habitat selection by the highly endangered
- 590 long-horned beetle Rosalia alpina in Southern Europe: a multiple spatial scale assessment.
- *Journal of Insect Conservation*, **15**, 685–693.
- 592 Sama, G. (1988). Fauna d'Italia XXVI. Coleoptera Cerambycidae. Catalogo topografico e
  593 sinonimico, Calderini, Bologna.
- Sama, G. (2009). Fauna Europaea: *Cerambycidae*. *Fauna Europaea*: *Coleoptera*. *Fauna Europaea version*, 2.
- Schiegg, K. (2000). Are there saproxylic beetle species characteristic of high dead wood
  connectivity? *Ecography*, 23, 579-587.
- 598 Smolik, M.G., Dullinger, S., Essl, F., Kleinbauer, I., Leitner, M., Peterseil, J., Stadler, L. &
- 599 Vogl, G. (2010). Integrating species distribution models and interacting particle systems to
- predict the spread of an invasive alien plant. *Journal of Biogeography*, **37**, 411–422.
- 601 Soberón, J. & Peterson, A.T. (2005). Interpretation of models of fundamental ecological
- niches and species' distributional areas. *Biodiversity Informatics*, **2**, 1–10.
- 603 Solano, E., Mancini, E., Ciucci, P., Mason, F., Audisio, P. & Antonini, G. (2013). The EU
- 604 protected taxon *Morimus funereus* Mulsant, 1862 (Coleoptera: Cerambycidae) and its
- 605 western Palaearctic allies: Systematics and conservation outcomes. Conservation Genetics.
- 606 14 (3), 683-694.
- South, A.B. & Kenward, R.E. (2001). Mate finding, dispersal distances and population
  growth in invading species: a spatially explicit model. *Oikos*, **95**, 53-5.
- 609 Sutherland, G.D., Harestad, A.S., Price, K. & Lertzman, K.P. (2000). Scaling of natal
- dispersal distances in terrestrial birds and mammals. *Conservation Ecology*, **4**, 16.
- 611 Stokland, J.N. & Siitonen, J. (2012). Mortality factors and decay succession. *Biodiversity in*
- 612 *dead wood. Cambridge University Press, Cambridge*, 110–149.

- 613 Stokland, J.N., Siitonen, J. & Jonsson, B.G. (2012). Threatened saproxylic species.
- 614 *Biodiversity in dead wood. Cambridge University Press, Cambridge*, 356-379.
- 615 Stürck, J., Levers, C., van der Zanden, Emma Henriëtta, Schulp, C.J.E., Verkerk, P.J.,
- Kuemmerle, T., Helming, J., Lotze-Campen, H., Tabeau, A. & Popp, A. (2015). Simulating
- and delineating future land change trajectories across Europe. *Regional Environmental*
- 618 *Change*, 1–17.
- 619 Svensson, G.P., Sahlin, U., Brage, B. & Larsson, M.C. (2011). Should I stay or should I go?
- 620 Modelling dispersal strategies in saproxylic insects based on pheromone capture and radio
- 621 telemetry: a case study on the threatened hermit beetle *Osmoderma eremita*. *Biodiversity*
- 622 *and Conservation*, **20**, 2883–2902.
- 623 Thomaes, A., Kervyn, T. & Maes, D. (2008). Applying species distribution modelling for the
- 624 conservation of the threatened saproxylic Stag Beetle (*Lucanus cervus*). *Biological*
- 625 *Conservation*, **141**, 1400–1410.
- 626 Titeux, N., Henle, K., Mihoub, J., Regos, A., Geijzendorffer, I.R., Cramer, W., Verburg, P.H.
- 627 & Brotons, L. (2016). Biodiversity scenarios neglect future land-use changes. *Global*
- 628 *change biology*, **22**, 2505–2515.
- 629 Torres-Vila, L.M., Mendiola-Diaz, F.J. & Sánchez-González, Á. (2017). Dispersal differences
- 630 of a pest and a protected Cerambyx species (*Coleoptera: Cerambycidae*) in oak open
- 631 woodlands: a mark–recapture comparative study. *Ecological Entomology*, **42**, 18–32.
- Trakhtenbrot, A., Nathan, R., Perry, G. & Richardson, D.M. (2005). The importance of long-
- distance dispersal in biodiversity conservation. *Diversity and Distributions*, **11**, 173-181.
- 634 Vasudev, D., Fletcher, R.J., Goswami, V.R. & Krishnadas, M. (2015). From dispersal
- 635 constraints to landscape connectivity: lessons from species distribution modeling.
- 636 *Ecography*, **38**, 967–978.

- 637 Velo-Antón, G., Parra, J.L., Parra-Olea, G. & Zamudio, K.R. (2013). Tracking climate change
- in a dispersal-limited species: reduced spatial and genetic connectivity in a montane

639 salamander. *Molecular ecology*, **22**, 3261–3278.

- 640 Walther, G.-R., Post, E., Convey, P., Menzel, A., Parmesan, C., Beebee, T.J.C., Fromentin, J.-
- 641 M., Hoegh-Guldberg, O. & Bairlein, F. (2002). Ecological responses to recent climate
- 642 change. *Nature*, **416**, 389.
- Whitmee, S. & Orme, D. (2012). Predicting dispersal distance in mammals: A trait-based
  approach. *Journal of Animal Ecology*, 82, 211–221.
- Wirth, C., Messier, C., Bergeron, Y., Frank, D. & Fankhänel, A. (2009). Old-Growth Forest
  Definitions: a Pragmatic View. *Old-Growth Forests*, 11–33.
- Zuur, A.F., Ieno, E.N. & Elphick, C.S. (2010). A protocol for data exploration to avoid
  common statistical problems. *Methods in Ecology and Evolution*, 1, 3–14.

649

## 650 **BIOSKETCH**

- 651 Francesca Della Rocca is an Adjunct Professor at the Department of Biology and
- Biotechnology, University of Pavia, and is broadly interested in the biogeography of
- endangered saproxylic beetles. Pietro Milanesi is a postdoc at the Swiss Ornithological
- Institute in spatial statistical modelling and is mainly interested in macroecology. Author
- 655 contributions: FDR and PM conceived and designed this study, analyzed the data and wrote
- the firsts drafts of this manuscript, and alternately commented and revised the manuscript.

Table 1. Suitable areas (km<sup>2</sup>) for saproxylic beetles in Europe without considering species-

- 658 specific dispersal distances under future (2040-50) scenarios. Four land use change scenarios:
- Libertarian Europe (A1), Eurosceptic Europe (A2), Social Democracy Europe (B1) and
- 660 European Localism (B2), representing strong (A1), high (A2), moderate (B1) and low (B2)
- 661 economic interventions and growth (Stürck *et al.*, 2015), and four Representative
- 662 Concentration Pathways (RCP) derived by 11 general circulation models (GCMs), were
- 663 combined to project species distribution in 2040-50. RCPs represent four possible greenhouse
- gas emission trajectories: low (RCP 2.6), moderate (RCP 4.5), high (RCP 6) and strong (RCP
- 8.5) increases in global radiative forcing (Ihlow et al., 2016). Source RCPs:
- 666 Intergovernmental Panel on Climate Change 5<sup>th</sup> assessment Coupled Model Intercomparison
- 667 Project Phase 5.

Species	RCP	A1	A2	B1	B2
Cerambix cerdo	2.6	4,350,600	4,364,800	4,340,000	4,347,600
	4.5	4,393,000	4,408,100	4,385,600	4,383,300
	6	4,414,500	4,428,000	4,411,600	4,412,100
	8.5	4,423,000	4,421,700	4,415,600	4,406,800
	2.6	4,357,500	4,359,000	4,352,500	4,351,600
Cuquius ginn gharinus	4.5	4,370,100	4,383,700	4,378,900	4,377,700
Cucujus cinnaberinus	6	4,355,800	4,370,100	4,363,500	4,360,300
	8.5	4,437,500	4,445,500	4,441,900	4,440,900
	2.6	4,545,800	4,616,000	4,585,600	4,646,100
T	4.5	4,532,300	4,608,900	4,558,300	4,624,800
Lucanus cervus	6	4,567,800	4,636,200	4,604,100	4,661,300
	8.5	4,508,300	4,577,100	4,539,600	4,601,900
	2.6	3,392,800	3,345,200	3,409,900	3,366,800
Monimus fun anous	4.5	3,499,200	3,451,400	3,507,600	3,479,300
Morimus junereus	6	3,476,700	3,429,100	3,487,700	3,446,400
	8.5	3,531,600	3,486,700	3,543,500	3,507,700
	2.6	3,906,500	3,839,500	3,897,500	3,853,400
	4.5	3,879,700	3,817,500	3,864,200	3,814,800
Osmoderma eremita	6	3,852,700	3,786,500	3,832,600	3,784,900
	8.5	3,880,500	3,817,500	3,862,700	3,822,000
	2.6 3,858,000 3,903,100 3,891,90	3,891,900	3,923,500		
Dogalia almina	4.5	3,867,900	3,921,000	3,906,400	3,945,200
Kosalla alpina	6	3,916,400	3,974,200	3,974,500	3,996,100
	8.5	3,923,200	3,975,100	3,966,900	3,996,900

668	Table 2. Suitable areas (km <sup>2</sup> ) for saproxylic beetles in Europe accounting for species-specific
669	dispersal distances under future (2040-50) scenarios. Four land use change scenarios:
670	Libertarian Europe (A1), Eurosceptic Europe (A2), Social Democracy Europe (B1) and
671	European Localism (B2), representing strong (A1), high (A2), moderate (B1) and low (B2)
672	economic interventions and growth (Stürck et al., 2015), and four Representative
673	Concentration Pathways (RCP) derived by 11 general circulation models (GCMs), were
674	combined to project species distribution in 2040-50. RCPs represent four possible greenhouse
675	gas emission trajectories: low (RCP 2.6), moderate (RCP 4.5), high (RCP 6) and strong (RCP
676	8.5) increases in global radiative forcing (Ihlow et al., 2016). Source RCPs:
677	Intergovernmental Panel on Climate Change 5th assessment - Coupled Model Intercomparison

Project Phase 5. 678

Species	RCP	A1	A2	B1	B2
	2.6	1,079,600	1,072,100	1,081,300	1,074,500
Community condo	4.5	1,083,500	1,083,000	1,087,200	1,076,100
Cerambix cerao	6	1,078,800	1,081,600	1,086,100	1,073,700
	8.5	1,090,000	1,089,700	1,091,500	1,086,500
	2.6	573,900	571,500	571,100	574,300
Cuquius ginn gharinus	4.5	578,300	577,700	578,100	583,200
Cucujus cinnaderinus	6	578,600	576,400	578,000	580,200
	8.5	583,600	582,200	584,200	585,600
	2.6	1,728,200	1,704,100	1,728,200	1,713,300
I waamuu aamuus	4.5	1,747,700	1,723,700	1,747,500	1,729,900
Lucanus cervus	6	1,738,300	1,708,100	1,735,000	1,719,400
	8.5	1,757,500	1,727,100	1,749,500	1,737,900
	2.6	179,000	179,300	182,800	173,900
Monimus fun anous	4.5	177,600	180,000	181,400	175,600
morimus junereus	6	179,300	181,500	183,000	176,900
	8.5	178,700	181,100	183,200	177,400
	2.6	1,041,000	1,029,800	1,032,300	1,030,900
Osmodorma oromita	4.5	1,021,300	1,015,000	1,022,900	1,018,500
Osmoder ma eremila	6	1,032,400	1,016,600	1,020,300	1,017,300
	8.5	1,018,200	1,005,700	1,009,900	1,009,700
	2.6	566,000	564,200	561,700	570,000
Posalia alpina	4.5	574,800	570,900	569,600	579,300
κοsαιια αιριπά	6	572,400	565,800	567,600	571,900
	8.5	579,100	571,400	570,900	581,300

Figure 1. Study area (in grey) and current species ranges, according to European Environment Information and Observation Network (EIONET)
 Central Data Repository server, Swiss Biological Records Center and Norwegian Taxonomy Initiative, of the six saproxylic species considered (in





Figure 2. Response curves of suitable areas (km<sup>2</sup>), generated without accounting for saproxylic beetles dispersal distances, in relation to four land
use change scenarios (Stürck *et al.*, 2015) and four Representative Concentration Pathways (RCP) derived by 11 general circulation models (GCMs)
for the period 2040-50 in Europe. Filled red for A1, dashed orange for A2, filled light green for B1 and dashed dark green for B2. Source RCPs:
Intergovernmental Panel on Climate Change 5<sup>th</sup> assessment - Coupled Model Intercomparison Project Phase 5.



Figure 3. Response curves of suitable areas (km<sup>2</sup>), accounting for saproxylic beetles dispersal distances, in relation to four land use change scenarios
(Stürck *et al.*, 2015) and four Representative Concentration Pathways (RCP) derived by 11 general circulation models (GCMs) for the period 204050 in Europe. Filled red for A1, dashed orange for A2, filled light green for B1 and dashed dark green for B2. Source RCPs: Intergovernmental
Panel on Climate Change 5<sup>th</sup> assessment - Coupled Model Intercomparison Project Phase 5.



## 693 SUPPORTING INFORMATION

- Additional supporting information may be found online, in the Supporting Information
- 695 section at the end of the article.