

Disjunct populations of European vascular plant species keep the same climatic niches

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▶ To cite this version:

Safaa Wasof, Jonathan Roger Michel Henri Lenoir, Per Arild Aarrestad, Inger Greve Alsos, W. Scott Armbruster, et al.. Disjunct populations of European vascular plant species keep the same climatic niches. Global Ecology and Biogeography, 2015, 24 (12), pp.1401 - 1412. 10.1111/geb.12375 . hal-01599162

HAL Id: hal-01599162 https://agroparistech.hal.science/hal-01599162v1

Submitted on 17 Jan2024

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This document is the accepted manuscript version of the following article: Wasof, S., Lenoir, J., Aarrestad, P. A., Alsos, I. G., Armbruster, W. S., Austrheim, G., ... Decocq, G. (2015). Disjunct populations of European vascular plant species keep the same climatic niches. Global Ecology and Biogeography, 24(12), 1401-1412. https://doi.org/10.1111/geb.12375 1 **ARTICLE TITLE** 2 Disjunct populations of European vascular plant species keep the same climatic niches 3 4 5 **AUTHOR LIST** Safaa Wasof¹, Jonathan Lenoir*¹, Per Arild Aarrestad², Inger Greve Alsos³, W. Scott 6 Armbruster^{4,5}, Gunnar Austrheim⁶, Vegar Bakkestuen⁷, H. John B. Birks^{8,9,10}, Kari Anne 7 Bråthen¹¹, Olivier Broennimann¹², Jörg Brunet¹³, Hans Henrik Bruun¹⁴, Carl Johan 8 Dahlberg¹⁵, Martin Dieckmann¹⁶, Stefan Dullinger¹⁷, Mats Dynesius¹⁸, Rasmus Ejrnæs¹⁹, 9 Jean-Claude Gégout^{20,21}, Bente Jessen Graae²², John-Arvid Grytnes²³, Antoine Guisan^{12,24}, 10 Kristoffer Hylander¹⁵, Ingibjörg S. Jónsdóttir²⁵, Jutta Kapfer²⁶, Kari Klanderud²⁷, Miska 11 Luoto²⁸, Ann Milbau²⁹, Mari Moora³⁰, Bettina Nygaard¹⁹, Arvid Odland³¹, Harald Pauli³², 12 Virve Ravolainen³³, Stefanie Reinhardt³¹, Sylvi Marlen Sandvik³⁴, Fride Høistad Schei³⁵, 13 James Speed³⁶, Jens-Christian Svenning³⁷, Wilfried Thuiller³⁸, Liv Unn Tveraabak³⁹, Vigdis 14 Vandvik²³, Liv Guri Velle⁴⁰, Risto Virtanen⁴¹, Pascal Vittoz^{12,24}, Wolfgang Willner⁴³, Thomas 15 Wohlgemuth⁴⁴, Niklaus E. Zimmermann⁴⁵, Martin Zobel³⁰, Guillaume Decocq¹ 16 17 **AUTHOR RESEARCH ADDRESSES** 18 ¹Jules Verne University of Picardie, UR "Ecologie et Dynamique des Systèmes Anthropisés" 19 (EDYSAN, FRE 3498 CNRS), 1 rue des Louvels, F-80037 Amiens Cedex 1, France 20 ²Norwegian Institute for Nature Research, PO Box 5685 Sluppen, NO-7485 Trondheim, 21 22 Norway ³Tromsø Museum, University of Tromsø NO-9037 Tromsø, Norway 23 24 ⁴School of Biological Sciences, University of Portsmouth, Portsmouth PO1 2DY, UK 25 ⁵Institute of Arctic Biology, University of Alaska, Fairbanks, AK 99775, USA

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KEYWORDS

Alpine plants, climatic niche, disjunct populations, distant populations, native plants, niche
conservatism, niche evolution, niche optimum, niche overlap, niche width, species
distribution modelling

100	
101	SHORT RUNNING TITLE
102	Climatic niche of terrestrial vascular plants
103	
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107	
108	ARTICLE TYPE
109	Research Article
110	
111	NUMBER OF WORDS
112	Abstract: 290
113	Main text (Introduction / Materials & Methods / Results / Discussion): 5776
114	Manuscript as a whole (Introduction / Materials & Methods / Results / Discussion /
115	Acknowledgements / References / Biosketch): 7532
116	
117	NUMBER OF REFERENCES
118	51 references (1611 words)
119	
120	NUMBER OF FIGURES AND TABLES
121	6 figures

122

ABSTRACT

Aim Research on how the climatic niche varies across a species range has focused on a limited number of species, mostly invasive, and has not been very conclusive so far. Here, we assess the degree of niche conservatism between distant populations of alpine plant species

- 126 that have been established for thousands of years.
- 127 **Location** European Alps and Fennoscandia.

Methods Focusing on a representative sample (n = 389) of the pool of terrestrial vascular 128 plant species (n = 888) occurring in both the Alps and Fennoscandia, we used two 129 130 complementary approaches to test for and quantify climatic-niche shifts for species with Alpine and Fennoscandian populations that are either strictly disjunct (n = 31) or at least 131 distant (n = 358). First, we used a species distribution modelling approach to test for a region 132 133 effect on each species' climatic niche. Second, we quantified niche overlap and shifts in niche 134 width (i.e., ecological amplitude) and position (i.e., ecological optimum) within a bi-135 dimensional climatic space.

136 **Results** Only one species (3%) with strictly disjunct populations and 58 species (16%) with at 137 least distant populations showed a region effect on their climatic niche. Niche overlap was 138 higher for species with strictly disjunct populations (0.50 ± 0.1) than for species with distant 139 populations (0.42 ± 0.1) , and highest for Arctic-alpine species (0.55 ± 0.06) . Estimated climatic niches were, on average, larger and located towards warmer and wetter conditions in the Alps. 140 141 Main conclusion Climatic niches seem to be generally conserved between populations that are separated between the Alps and Scandinavia and likely have been so for 10,-15,000 years, 142 143 despite the fact that populations in the Alps and Fennoscandia became adapted over time to 144 their respective sets of regional climatic conditions. Therefore, the basic assumption of species distribution models that species' climatic niche is constant in space and time – at least 145 one time scales 10^4 years or less – seems to be largely valid for arctic-alpine plants. 146

147

INTRODUCTION

148 A long-standing question in ecology is whether species populations that occupy distant 149 regions have retained similar ecological requirements, i.e. whether their environmental niche 150 remained constant over space and time (Lavergne et al., 2010). This question departs from the 151 principle of phylogenetic niche conservatism, the tendency of closely related species to be 152 more similar than expected, and which involves evolutionary time scales (Losos, 2008; Lavergne et al., 2010; Wiens et al., 2010). Determining whether or not geographically distant 153 154 populations have evolved to occupy distinct niches, and to what extent, and in which conditions, is of paramount importance in predicting future biodiversity under climate change. 155 156 Indeed, most correlative models used to predict species range changes take the conservative 157 assumption that species' environmental niches are relatively constant in space and time 158 (Guisan et al., 2014).

One difficulty when trying to address this question is that species' fundamental 159 160 environmental niche reflecting their physiological tolerances cannot be estimated from 161 empirical field data because other factors, such as biotic interactions and dispersal limitation, 162 often restrict the range of conditions species may encounter. The latter is often called the 163 realised ecological niche (Hutchinson, 1957; Austin et al., 1990). For example, changes in 164 biotic interactions or dispersal limitation across regions may create two distinct realised 165 niches within the same global fundamental niche. Reversely, lack of change of the realised 166 niche usually indicates that the underlying fundamental niche has been largely conserved and 167 no strong regional adaptations have occurred.

Invasive species colonising newly separated regions have been particularly studied in this context (see Guisan *et al.*, 2014 for a review). Range-filling processes in the invaded range are indeed strongly limited or at an early stage and the potential for divergence of niche requirements are largely unexploited (Williamson *et al.*, 2009). Instead, assessments of

172 climatic niche differences between distant populations originating from distinct post-173 glaciation colonisation events are more likely to inform us about species' abilities to modify 174 their ecological requirements under future climate change. However, such comparisons have 175 rarely been undertaken (but see Pellissier *et al.*, 2013).

176 Here, we extend such niche comparison between distant populations of native species 177 by using a representative sample of the pool of vascular plants (n = 888) that have successfully recolonised both the European Alps and Fennoscandia. These two geographically 178 179 distant mountainous regions have the advantage of having different recolonisation histories 180 during the last glacial-interglacial cycle and sharing analogous macroclimatic gradients. 181 During the Last Glacial Maximum (LGM, ca 23,000-18,000 yr BP), Fennoscandia was 182 largely covered by the Eurasian ice-sheet (Svendsen et al., 2004), and largely recolonized from In contrast, numerous ice-free refugial areas were located relatively close to each 183 184 other at the eastern and southern periphery of the much smaller ice caps that covered central 185 parts of the Alps (Schönswetter et al., 2005). Thus, many high-elevation plants probably 186 survived the LGM at the margins of both the Alps (Schönswetter et al., 2005) and the 187 Eurasian ice-sheet (Birks, 1994), and on the nunataks or other ice-free pockets in the Alps 188 (Stehlik et al., 2002). The realised climatic niche of a given Arctic-alpine plant species should 189 thus be wider in the Alps than in Fennoscandia since the process of post-glacial recolonisation 190 of all climatically suitable sites (i.e. range-filling) has probably been less constrained by 191 dispersal limitations (Dullinger et al., 2012). In addition, proximity of the Alps to the main 192 southern refugia of the temperate European flora (Iberian, Italian, and Balkan Peninsulas) 193 (Birks & Willis, 2008), with larger population sizes and genetic diversity (Hewitt, 2000), may 194 have enhanced population adaptability, and also genetic variation in the Alps. This may have 195 fostered a species' capability to exploit available post-glacial ice-free areas and thus widen its 196 fundamental climatic niche as well as shift its fundamental climatic niche towards warmer

197 conditions. In contrast, the long-distance recolonisation of Fennoscandia is likely to have 198 involved repeated founder events, successively reducing the genetic variation and most likely 199 also the fundamental climatic niche (e.g. Giesecke, 2005). Additionally, such long-distance 200 recolonisation of Fennoscandia not only originated from the main southern refugia located in 201 southern Europe, but also from eastern refugia located in Russia (Eidesen *et al.*, 2013), which 202 may have contributed to shift the fundamental climatic niche towards somewhat colder 203 conditions due to founder events from cold-adapted populations.

204 Conversely, total vascular plant species richness in the Alps is much higher than in Fennoscandia (Lenoir et al., 2010), generating different competition regimes, which may 205 206 result in different realised climatic niches between populations in the Alps and in 207 Fennoscandia (Pellissier et al., 2013). The greater the number of species in a region, the 208 narrower the species' realised niche width should theoretically be (regional diversity-niche width hypothesis; MacArthur, 1972), due to contraction at the least stressful margin of the 209 210 environmental gradient. This would lead to the expectation of narrower realised niches through contraction of the warmer part of the range, resulting in the species being observed 211 212 towards colder conditions in the Alps.

213 Finally, potential differences in the realized climatic niche between distant populations 214 of the same species are likely to be related to its life-history traits. For instance, we can 215 assume that a generalist or opportunistic species is able to occupy wider fundamental niches 216 and thus can more easily adjust its realised niche, depending on the region, than a specialist or 217 late-successional species whose fundamental niche is too narrow to allow large shifts of the 218 realised niche (Pearman et al., 2008). But we could also assume that disjunct populations of a 219 dispersal-limited species are likely to be isolated from gene flow thus favouring local adaptation and increasing the chances for strong differences between their respective realized 220 221 climatic niches compared with distant populations of a widespread species not limited by its

dispersal abilities. Linking the extent to which two distant populations of the same specieshave similar realized climatic niche (cf. niche overlap) with traits is therefore informative.

224 Knowing all this, we aim to answer five questions: (i) Do the realised climatic niches of 225 species native to both the Alps and Fennoscandia differ between the two regions? (ii) To what extent does the realised climatic niche of a species overlap between the two regions? (iii) Is 226 227 there a trend towards wider (supporting the genetic diversity hypothesis) or narrower 228 (supporting the diversity-niche width hypothesis) realised climatic niches in the Alps? (iv) Are the realised climatic niches of species shifting towards warmer (supporting the genetic-229 230 diversity hypothesis) or colder (supporting the diversity-niche width hypothesis) conditions in the Alps? (v) How much of the variation in species' niche overlap can be explained by 231 232 species' life-history traits?

233

MATERIALS AND METHODS

234 Study area and species pool

235 The study area covers two geographically distant regions: the European Alps as delineated by 236 the Alpine Convention Boundary (http://www.alpconv.org/) and Fennoscandia as delineated 237 by the administrative boundaries of Norway, Sweden, Finland and Denmark (excluding 238 islands such as the Svalbard archipelago) (Fig. 1(a)). To select the list of terrestrial vascular 239 plant species occurring in both study regions, we assembled more than 70,000 vegetation 240 plots from the most recent versions of two different European vegetation databases: (i) the Alps vegetation database (AVD, n = 31,524, http://www.givd.info/ID/EU-00-014) (Lenoir et 241 242 the Nordic vegetation database (NVD, n =al.. 2012) and (ii) 41.785. http://www.givd.info/ID/EU-00-018) (Lenoir et al., 2013). A total of 888 species occurred in 243 244 both databases. This corresponds to the common species pool obtained by matching species 245 lists from AVD and NVD (see Appendix S1 in Supporting Information).

246 Because most of the 888 species common to the Alps and Fennoscandia also occur outside this study area, it is likely that the realised climatic niche of at least one of the two 247 248 studied populations will be truncated thus potentially affecting our results. To account for 249 such effects, we screened each of the 888 species' range maps (Comparative Chorology of the Central European Flora; Meusel et al., 1965, 1978, 1992) to subdivide this pool into two 250 251 subsets: (i) species having disjunct distribution restricted to mountainous areas or Arctic-252 alpine tundra with at least one population strictly confined to the Alps and another strictly 253 confined to Fennoscandia, hereafter referred as the "restricted" group for which the entire 254 realised climatic niche is likely to be captured (n = 105); and (ii) species having either a 255 contiguous distribution between the Alps and Fennoscandia, with these simply constituting 256 distant populations, or a patchy distribution not restricted to mountainous areas or Arctic-257 alpine tundra with populations extending outside the Alps or Fennoscandia, hereafter referred

as the "enlarged" group for which the realised climatic niche will be truncated in at least one of the two studied regions (n = 783). We analysed and reported all our results separately for the restricted and enlarged groups.

261

262 Climatic data

We used nine bioclimatic variables expected to have direct ecophysiological impacts on plant 263 distributions (Prentice et al., 1992). Three related to temperature: growing-degree-days above 264 265 0°C (GDD); absolute minimum temperature (AMT); and continentality index (CI). The remaining six were water-related variables: annual aridity index (AI: note that higher AI 266 267 values represent more humid conditions); annual potential evapotranspiration (PET); annual 268 actual evapotranspiration (AET); Priestley-Taylor alpha coefficient (ALPHA = AET/PET); 269 water balance over the year (sum of monthly precipitation minus monthly potential 270 evapotranspiration) (WBAL); and soil water content of the most stressful month (SWC). All 271 variables were derived from globally available datasets at a spatial resolution of 30 arc seconds which is less than one kilometre at the equator: WorldClim (Hijmans et al., 2005: 272 273 http://www.worldclim.org/) and CGIAR (CGIAR-CSI: http://www.cgiar-csi.org/) (Appendix 274 **S2**).

275

276 **Presence and absence data**

For each of the 888 species, we followed a set of data-handling procedures (**Appendix S3**). We first compiled geo-referenced presence records by querying AVD, NVD, and the Global Biodiversity Information Facility (GBIF: <u>http://www.gbif.org/</u>) and geo-referenced absence records from AVD and NVD. Presence (AVD, NVD, GBIF) and absence (AVD, NVD) data were then aggregated across the study area at a 1-km resolution (cf. climatic grids) to compute a probability of presence (*pr*) of the focal species per grid cell by dividing the number of

presence records found within a given grid cell by the total number of presence and absence records of that species in it. Note that we could not compute a *pr* value for grid cells without information on presence and absence data and thus grid cells lacking presence and absence data were not used in the subsequent analyses. Finally, we subsampled all available grid cells for which a *pr* value had been computed to limit spatial autocorrelation issues and to balance sampling effort between regions (**Appendix S3**).

289

290 Trait data

To explain the observed differences in the realised climatic niche of species between the Alps 291 292 and Fennoscandia, we assembled data on species' traits according to their biogeography, 293 ecology, and biology. For biogeographic data, we extracted information on chorology (i.e. 294 biogeographic origins) from Landolt et al., (2010). For ecological data, we used Ellenberg indicator values (Ellenberg et al., 1991) for light (L), soil nutrients (N), soil pH (R), soil 295 296 moisture (F), temperature (T), and continentality (K). For biological data, we collected data on plant height, specific leaf area (SLA), diaspore mass and Raunkiaer's life-forms from 297 298 several sources (Appendix S1). Diaspore mass and plant height values were log-transformed 299 prior to analyses.

300

Data analyses

To compare the realised climatic niches between two distant populations of the same species, we used two complementary approaches. First, we tested for any overall regional differences (region effect) in the realised climatic niche of each species using an environmental niche modelling (ENM) approach based on generalised linear models (GLMs). Second, we used a bivariate analysis based on the two most statistically significant climatic layers found in the GLMs, including one energy-related variable (GDD) and one water-related variable (AI) to

308 quantify the degree of niche overlap and niche shifts between regions for each species. Once 309 differences in the realised climatic niches between distant populations in the Alps and 310 Fennoscandia were assessed, we linked species' niche overlap values to species' life-history 311 traits.

312

313 Region effect

For each of the 888 species, all 1-km^2 grid cells retained after the selection process (Appendix S3) were split into two subsets: one subset for model development (training dataset) including 2/3 of the selected grid cells and one subset for model validation (test dataset) consisting of the remaining 1/3 of the grid cells. Because of this splitting, 550 species, of which 65 belong to the restricted group, were sufficiently frequent (i.e. having a *pr* value exceeding 0 in at least 50 grid cells within each region of the training dataset) to be retained for model development.

321 For each of the 550 selected species, we ran a series of GLMs for proportion data with pr as the dependent variable to select the most influential bioclimatic variables (GDD, AMT, 322 323 CI, PET, AET, WBAL, ALPHA, AI, SWC). We also evaluated the effect of the region 324 variable (Alps vs. Fennoscandia) and the potential interaction with any of the selected climatic 325 variables in the models (Appendix S4). Finally, we updated the model by incorporating the 326 total number of presence/absence records per grid cell as a covariate to correct for the effect 327 of sampling effort across the study area and checked for overdispersion. In those cases where 328 overdispersion was found a quasi-binomial error function was used.

We then evaluated the quality of the GLM using the test dataset for each species and the area under the receiver-operating characteristic curve (AUC) ranging from 0.5 (poor models) to 1 (perfect models) (Swets, 1988). We decided to retain only the best models by focusing on species that had AUC values greater than 0.8 for further comparisons of the realised climatic

niche between regions. A total of 389 species, of which 31 belong to the restricted group, out of 550 fulfilled this requirement (Fig. S5 in Appendix S5). To transform the *pr* into presence/absence data (Fig. S3 in Appendix S3), we computed the sensitivity–specificity sum maximiser criterion (MST) based on the test dataset (Jiménez-Valverde & Lobo, 2007).

Finally, for each of the 389 species, we merged the training and test datasets to recalibrate the final model based on all the available data and extracted several model statistics (coefficient estimates, *p*-values, AIC, null deviance, residual deviance). To test for differences in the realised climatic niche of a given species, we focused on the significance of the region effect and its interaction with the climatic variables (**Fig. 2 and Fig. S6 in Appendix S6**).

343

344 Observed niche overlap

345 For each of the 389 species, we estimated niche overlap between the two regions within the 346 bi-dimensional climatic space defined by GDD and AI (Fig. 1(b)). These two variables were selected since they were important for many of our species. We divided the bi-dimensional 347 climatic space into a grid of 500×500 cells bounded by the minimum and maximum values 348 349 of GDD (first axis) and AI (second axis) (Fig. 1(b), Appendix S7). For each region separately, we mapped the occurrence data (pr > 0) in the bi-dimensional space defined by the 350 351 subset of grid cells in which the focal species was recorded as present (pr > 0) or absent (pr =352 0) to map its realized climatic niche within the available climatic space. We applied a kernel 353 smoother to standardise species densities across the bi-dimensional climatic space 354 independently of the sampling effort and the resolution in the climatic space (Fig. S7 in 355 Appendix S7. Broennimann et al., 2012).

356 We used Schoener's D similarity index (Schoener, 1970; Broennimann et al., 2012) (see

formula in Appendix S7) to compute the observed niche overlap (D_{obs}) . The D index was

358 calculated on the above-mentioned smoothed density of occurrences, (i.e. observed niche 359 overlap, D_{obs}), and varies from 0 (no overlap) to 1 (complete overlap). We assessed D_{obs} not 360 only across the overall climatic space including both analogue and non-analogue climates, but 361 also within the analogue climatic space alone (Fig. 1). Assessing D_{obs} across the whole 362 climatic space allows to account for non-analogue climatic conditions that may become 363 analogue with future climate change, whereas focusing on the analogue climatic space solely 364 enables D_{obs} assessment to be independent of simple changes in climatic conditions thus 365 precluding to mix up apples and pears. In theory D_{obs} should be higher when focusing on the 366 analogue climatic space alone with difference in D_{obs} values between the analogue (cf. 367 baseline) and the overall climatic space indicating to what extent non-analogue climates 368 matter for D_{obs} . To compute D_{obs} across the analogue climatic space alone, we quantified for 369 each species the part of the bi-dimensional climatic space that was shared by the two regions 370 (i.e., analogue climates) (Fig. S7 in Appendix S7) and then D_{obs} was computed once again as

above using Schoener's *D* similarity index (Schoener, 1970; Broennimann *et al.*, 2012).

372 Niche overlap test

To assess to what extent the realized climatic niche of a given species is conserved between 373 374 the Alps and Fennoscandia, we compared its empirical D_{obs} value to its simulated niche overlap (D_{sim}) value obtained under a baseline scenario of climatic-niche identity. By baseline 375 376 scenario, we mean setting and using exactly the same climatic niche model (cf. climatic-niche identity) for each of the two studied populations of the focal species to successively: (i) 377 378 predict each population distribution in the Alps and Fennoscandia based on climatic 379 conditions solely; (ii) project these spatial predictions into the GDD-AI climatic space; and (iii) compute D_{sim} using the same approach as for D_{obs} (see Appendix S7 for more details). 380

381 Comparing a species' D_{obs} value in light of its D_{sim} value help to appreciate how much 382 the realized climatic niche of this focal species is conserved. The lower the D_{obs} value

383 compared with D_{sim} , the greater the niche differentiation between the Alps and Fennoscandia. 384 Note that D_{obs} can be greater than D_{sim} , i.e. the realized climatic niche is more conserved than 385 expected under the climatic-niche identity assumption. On the one hand, D_{sim} can reach low 386 values simply because our simulations account for the potential effects of other climatic 387 variables than the one used to compute D_{sim} (cf. GDD and AI) (Appendix S7). On the other 388 hand D_{sim} is based on model predictions that incorporate climatic predictors only whereas D_{abs} 389 relies on empirical data that reflect not only climatic dimensions of the realised niche but also 390 other abiotic and biotic dimensions not considered in our models and which could involve 391 habitat-compensation effects. For these two reasons, it is not that odd to find greater values for D_{obs} than D_{sim} . We used Student's paired *t*-test to assess the significance of the average 392 393 difference between D_{obs} and D_{sim} across all species.

394

395 Niche width and niche optimum

We used two other parameters to assess differences in the realised climatic niche of each of the 389 studied plant species between the two regions: niche width (range of climatic conditions suitable for a species) and niche optimum (maximum probability of presence of a species within its realised climatic niche). Species niche-width and niche-optimum values were computed for both the Alps and Fennoscandia from the observed density of occurrences of a given species within both the overall and analogue climatic spaces.

We followed the method of Theodoridis *et al.*, (2013) to compute these parameters and did so for the Alps and Fennoscandia, separately. Species' niche-width and niche-optimum values were assessed by first extracting the scores along GDD and AI of 100 pixels sampled randomly from its bi-dimensional climate space, selecting pixels with a probability according to species' density of occurrences. Once extracted, the inter-decile range (80%) of these 100 values along GDD and AI (i.e. niche width) as well as GDD and AI coordinates of the pixel

408 where the species reached its maximum occupancy (i.e. niche optimum) were computed. This 409 randomisation procedure was repeated 100 times and the mean values of the 100 obtained 410 values for niche width and niche optimum for both the Alps and Fennoscandia were retained. 411 We used Student's paired *t*-test to assess the significance of the mean difference in species' 412 niche width and niche optimum between regions.

413

414 Insights from plant traits

415 Finally, we used three independent ordinary least square (OLS) regressions to assess how much of the variation in D_{obs} could be explained by plant biogeography, ecology, and biology. 416 417 First, we fitted D_{obs} against a qualitative variable representing species' biogeographic origins 418 (Arctic-alpine, Asia, Eurasia, Europe, Holarctic, Mediterranean, North America) followed by 419 Tukey's HSD test for *post-hoc* pairwise comparisons of group means. Second, we fitted D_{obs} 420 against all six semi-quantitative Ellenberg indicator values (L, N, R, F, T, K). Third, we fitted 421 D_{obs} against plant growth, photosynthetic performances, and dispersal abilities (plant height, 422 SLA, diaspore mass) as well as Raunkiaer's life-forms. We ran all three models for both D_{obs} 423 computed across the overall climatic space including both analogue and non-analogue 424 climates, but also for D_{obs} computed within the analogue climatic space only.

425

RESULTS

426 **Regional differences**

427 Among the 31 species belonging to the restricted group and that were retained after the 428 modelling procedure to test for a region effect, only one species (Epilobium alsinifolium) 429 showed regional differences in its response curves, namely along the aridity gradient (AI) 430 (Fig. S8 in Appendix S8). Among the remaining 358 species belonging to the enlarged 431 group, only 58 species showed regional differences in their response curves along at least one 432 of the nine studied climatic variables (Table S8 in Appendix S8). Of these 58 species, 29 433 showed regional differences in response to growing degree days (GDD) (Fig. 2(b)), 26 in 434 response to soil water content during the most stressful month (SWC), 8 in response to the 435 aridity index (AI), and 5 in response to the continentality index (CI) (Fig. S8 in Appendix 436 **S8**).

437

438 Niche overlap

439 Based on the overall climatic space defined by GDD and AI, the observed niche overlap 440 (D_{obs}) for the 31 species belonging to the restricted group was 0.50 on average, ranging from 0.16 to 0.59 (Table S9 in Appendix S9). These values were higher, on average, than the D_{obs} 441 442 values calculated for the 358 remaining species from the enlarged group (mean = 0.42; min = 443 0.02; max = 0.66) (two-sample Student's *t*-tests, *p*-value = 0.002) (Table S9 in Appendix 444 **S9**). The simulated niche overlap (D_{sim}) under the baseline scenario of climatic-niche identity 445 was much lower than D_{obs} for both the restricted (mean = 0.40; min = 0.25; max = 0.52) (paired two-sample Student's *t*-tests, n = 27, *p*-value $\ll 0.001$) and the enlarged (mean = 446 0.28; min = 0.005; max = 0.7) (paired two-sample Student's *t*-tests, n = 195, *p*-value << 447 0.001) species groups. Among the 58 species that showed regional differences in their 448 449 response curve along at least one climatic variable (Table S8 in Appendix S8), only 6 species

had distant realised climatic niches that overlapped less than under the baseline scenario (D_{obs} $< D_{sim}$): Alyssum alyssoides, Avenula pratensis, Carex ericetorum, Ranunculus bulbosus, Rubus idaeus, and Vincetoxicum hirundinaria. We found similar patterns for the results based on the analogue climatic space solely, except that all niche overlap values were higher (**Table S10 in Appendix S10**).

455

456 Niche width and niche optimum

457 Irrespective of the species group considered (i.e. restricted vs. enlarged), niche width across 458 the overall climate space was larger in the Alps than in Fennoscandia for GDD (Figs. 3(a) 459 and 3(b)) and larger in Fennoscandia than in the Alps for AI (Figs. 3(c) and 3(d)) (Table S9 in Appendix S9). The same patterns were found for the 31 species of the restricted group 460 461 when assessing niche width based on analogue climates alone, except that the trend was not 462 significant for AI (p-values = 0.06). However, when assessing niche width based on analogue climates alone for the remaining 358 species of the enlarged group, species' realised climatic 463 464 niches were larger in the Alps than in Fennoscandia for both variables (Table S10 in 465 Appendix S10).

466 Niche optima results across the overall climatic space for the 31 species of the restricted group showed no difference, on average, along GDD but a shift towards higher values of AI 467 468 (more humid conditions) in the Alps compared with Fennoscandia (Figs. 4(a) and 4(c)) (Table S9 in Appendix S9). For the remaining 358 species of the enlarged group, niche 469 470 optima were located, on average, towards higher values of both GDD and AI (warmer and 471 more humid conditions) in the Alps than in Fennoscandia, (Figs. 4(b) and 4(d)) (Table S9 in 472 **Appendix S9**). We found the same patterns when assessing niche optima based on analogue 473 climates alone (Table S10 in Appendix S10).

475 **Insights from plant traits**

476 Whatever the species group (i.e. restricted vs. enlarged) and the climatic space (whole vs. analogue) considered, we found similar patterns (Appendices S11 and S12). For clarity, we 477 478 only report results based on the full climate space (Appendix S11). Species' biogeographic 479 origins of the restricted and enlarged species groups explained 50% vs. 7%, respectively, of 480 the variation in D_{obs} , with Arctic-alpine species showing the highest D_{obs} values and standing 481 out of the other biogeographic groups (Fig. 5(a) and 5(b)). Species' ecological indicator 482 values of the restricted and enlarged species groups explained 53% vs. 21%, respectively, of 483 the variation in D_{obs} , with contrasting patterns depending on the species group. For the 484 restricted group, Dobs increased with increasing preference for cold temperatures and moist 485 soils (Fig. 6(a) and 6(c)). In contrast, for the enlarged group, D_{obs} increased with increasing 486 preference for acid soils and for fertile soils (Fig. 6(a) and 6(c)). There was no clear 487 relationship between *D*_{obs} and species' biological traits (Appendix S11).

488

DISCUSSION

489 The realised climatic niche is conserved

490 Our findings suggest predominant niche conservatism, with only 15% of the 389 studied 491 species displaying regional differences in realised climatic niches. Noteworthy, only one (3%) 492 of the 31 species for which populations are clearly disjunct between the Alps and 493 Fennoscandia showed regional differences in its climatic niche. Additionally, the fact that the 494 observed niche overlap (50%) is higher, on average, than the simulated niche overlap (40%) 495 obtained under a baseline scenario of climatic-niche identity suggests strong niche 496 conservatism. Using a different approach and with a smaller set of plant species (n = 8), 497 Martínez-Meyer & Peterson (2006) showed that the current species' distribution in North 498 America predicts well their distribution at the Last Glacial Maximum (LGM) and 499 reciprocally, suggesting an ecological niche conservatism despite changes in climate and 500 environmental conditions over that time period. Our results confirm the general idea that 501 niche conservatism is more likely to be the rule over short to moderate time events (thousands 502 of year or shorter) and support results from previous studies focusing on a limited set of 503 species (Martínez-Meyer & Peterson, 2006; Pearman et al., 2008; Peterson, 2011). Over 504 longer time periods of million to billion years, there is no study testing species niche 505 conservatism, certainly because very few relict species have survived since the 506 Palaeogene/Neogene without involving speciation events. However, many studies have tested 507 phylogenetic niche conservatism between closely related species and found evidence for niche 508 differentiation (see Table 1 in Peterson, 2011).

509

510 The observed niche overlap is greater for species with strictly disjunct populations

511 Niche overlap was higher for species having disjunct distribution with at least one population

512 confined to the Alps and one population confined to Fennoscandia (cf. the restricted group:

513 0.50±0.1) than for species having contiguous or patchy distribution across Europe with 514 populations extending outside the Alps or Fennoscandia (cf. the enlarged group: 0.42±0.1). 515 This difference may stem from the fact that the entire realized climatic niche is likely to be 516 captured in the restricted group whereas in the enlarged group the realized climatic niche will 517 be truncated in at least one of the two studied regions and thus we may underestimate niche 518 overlap for the enlarged group.

519 Considering species' biogeographic affinities, niche overlap was highest for arctic-520 alpine species (Fig. 5), supporting former findings of Pellissier et al. (2013), who found a strong conservatism of the low-temperature limit of 26 arctic-alpine plant species. 521 522 Consistently with their findings that thermal niches are more conserved at cold than at warm limits in aArctic-alpine plant species, we found that niche overlap for arctic-alpine plant 523 524 species increased with increasing preference for cold temperatures and moist soils. On the 525 other hand, species displaying dissimilar realised climatic niche were geographically and/or 526 edaphically widespread species (e.g., Alyssum alyssoides, Calluna vulgaris, Carum carvi, 527 Fragaria vesca, Galeopsis tetrahit, Juniperus communis, Ranunculus bulbosus, Rubus idaeus, 528 Vaccinium myrtillus, Viburnum opulus) (Table S8 in Appendix S8). This supports the idea 529 that generalist species are tolerant of a wider range of environmental conditions given their 530 often great diversity of phenotypes and thus are more able than a specialist species to respond 531 to regional differences by exploiting a greater diversity of habitats (Colles et al., 2009). 532 Generalist or opportunistic species are able to occupy wider fundamental niches and thus can 533 easily shift their realised niche depending on the region, leading to a lower niche overlap than 534 for a specialist or late-successional species whose fundamental niche is too narrow to allow large shifts of the realised niche (Pearman et al., 2008). This contradicts recent findings from 535 Early and Sax, (2014), who compared native vs. naturalised ranges of the same species and 536 537 found greater disequilibrium (cf. lower niche overlap) for species with native ranges that are

small and occupy a narrow range of climatic conditions. However and as suggested by Early and Sax (2014), the stronger climatic disequilibrium for range-restricted species is likely due to non-climatic factors such as dispersal and biotic factors constraining the native range whereas in the naturalised range especially the latter biotic constraints may be alleviated (cf. enemy-release hypothesis), thus leading to strong climatic disequilibrium. Here, rangerestricted species are arctic-alpine species whose distribution is chiefly constrained by climatic factors and less so by biotic factors, which could explain such discrepancy.

545 Niche overlap also increased as plant species prefer acid grounds. Interestingly, siliceous bedrock predominates across Fennoscandia and calcareous bedrock is rare and local. 546 547 Thus, acidic soils developed rapidly across Fennoscandia soon after deglaciation (e.g., Boyle et al., 2013), leading today to a larger pool of acidophilous species in Fennoscandia than in 548 549 the Alps (Lenoir *et al.*, 2010). Therefore, in comparison to calciphilous species, postglacial recolonisation of acidophilous species in Fennoscandia might have been less constrained by 550 551 dispersal limitation, leading to greater niche overlap with their distant populations in the Alps. 552 In brief, the regional imprint on of the Quaternary climate changes on is weak and 553 the realised climatic niches of terrestrial vascular plants seem largely conserved. This is 554 particularly true for specialist species like Arctic-alpine plants.

555

556 The realised climatic niche is wider in the Alps

557 Despite the realised climatic niche being globally conserved, we find regional differences 558 trended towards wider niches in the Alps than in Fennoscandia (**Fig. 3**), especially when 559 constraining our analyses to the analogue climatic space (**Table S9 in Appendix S9**). This 560 suggests that species have filled a greater proportion of their fundamental climatic niche in the 561 Alps and runs counter to MacArthur's (1972) hypothesis for island biogeography, which 562 proposes that species' realised-niche width is constrained by the size of the regional species

563 pool so that more intense competition in species-rich islands should lead to narrower realised 564 niches. The same reasoning for mainland biogeography does not seem to hold. Our findings, 565 however, are consistent with a recent study on the realised-niche width of plants which 566 concludes that competition from ecologically similar species plays a relatively minor role in 567 species' establishment in different habitat types (Manthey *et al.*, 2011).

568 The wider realised climatic niches in the Alps support our hypothesis that greater genetic diversity due to different refugia close to the Alps, corresponding to greater habitat 569 570 heterogeneity, increases the likelihood for a species to fill its fundamental climatic niche. Many refugia provided ice-free areas with various habitat conditions where high elevation 571 572 plants could survive the glacial stages in the Alps (Schönswetter et al., 2005). This has likely played an important role in the intraspecific diversification of many alpine plants in the Alps 573 574 (Alvarez et al., 2009), and is also reflected by the higher levels of genetic diversity within species in the Alps than Fennoscandia (Eidesen et al., 2013). In contrast, cryptic glacial 575 576 refugia in the north (Stewart et al., 2010) were probably confined to areas outside the margin of the massive Fennoscandia ice-sheet (Birks, 1994) and fewer, smaller, genetically 577 578 depauperate populations survived, with these populations contributing little to total gene pool 579 after post-glacial population recolonisation (Edwards et al., 2014), thus resulting in lower 580 genetic diversity and narrower realised climatic niches in modern populations. However, such 581 differences in realised niches width may also result from time-lagged range expansion 582 following post-glacial warming and disequilibrium with contemporary climate for populations 583 in Fennoscandia (Svenning & Skov, 2004).

584

585 **The realised climatic niche is located towards warmer and wetter conditions in the Alps** 586 The large and diverse set of terrestrial vascular plants occurring in two distant regions in the 587 present study show that species generally have their climatic optima in warmer and more

588 humid conditions in the Alps than in Fennoscandia, irrespective of the climatic space 589 considered (whole or analogue). At least two different processes could explain these inter-590 regional differences.

First, shifts in the position of the fundamental niche itself may be involved through local adaptation (Davis *et al.*, 2005; Leimu & Fischer, 2008). Results from common garden experiments, where species' populations from different geographic areas are together in several climates, reveal local adaptation of most tree and herbaceous plant species to their local home environments compared to the foreign environments (Davis *et al.*, 2005; De Frenne *et al.*, 2011; Alberto *et al.*, 2013).

597 Second, species may change their optimum position along one climatic axis (e.g., 598 growing degree days or aridity index) of the *n*-dimensional niche hypervolume (*sensu* 599 Hutchinson 1957) to compensate for differences in local conditions other than climatic 600 factors. It has been shown that vascular plant species can spatially shift their realized-niche 601 optima for soil nutrients and pH (Diekmann & Lawesson, 1999; Wasof *et al.*, 2013). We did 602 not account for this process in our analyses (e.g. soil pH or land-use), thus it could be a 603 confounding...?

604 We conclude that the realised climatic niche of terrestrial vascular plants that 605 successfully recolonised northern Europe in the last glacial-interglacial cycle has largely been 606 conserved and that this is especially true for specialist species like arctic-alpine plants and 607 species less constrained by dispersal limitation. This has important consequences for 608 predicting future biodiversity under climate change. Notably, the basic assumption that 609 species' realised climatic niche is constant in space and time (thousands of years) seems to be 610 valid to a large extent. Indeed, if the aim is to track the geographic distribution of species with low dispersal limitations this might well work. However, we also show that regional 611 612 differences in niche width and optimum are rather common. Hence, if the aim is to track

- 613 precisely the geographic position of some key species distribution parameters (range limit or
- 614 center), then the basic assumption of species distribution models is likely to be flawed, simply
- 615 because it does not account for regional subtleties in niche width and optimum values.

616

ACKNOWLEDGMENTS

617 We are grateful to the many people who collected plot data and to those who managed and 618 provided the databases for use. We wish to thank two anonymous referees and Linda 619 Beaumont for insightful comments as well as Emilie Gallet-Moron for help in preparing 620 geographical maps. We greatly acknowledge the Syrian Ministry of Higher Education for 621 funding SW's PhD thesis. JCS and WT were supported by the European Research Council 622 (ERC-2012-StG-310886-HISTFUNC and ERC-2011-StG-281422-TEEMBIO, respectively). 623 MD acknowledges financial support from the Swedish Research Council Formas and AM from the Swedish Research Council VR. MM and MZ were supported by Centre of 624 625 Excellence FIBIR and IUT 20-28. PAA, GA, VB, KAB, HHB, BJG, JAG, JK, KK, AO, VR, SR, SMS, FHS, JS, LUT, VV, and LGV were supported by the Norwegian Research Council. 626 JD and KH were supported by the EkoKlim Program at Stockholm University. 627

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BIOSKETCHES

785 Safaa Wasof is a PhD student at Jules Verne University of Picardie in France and is interested in plant community ecology and in how plant communities are affected by contemporary 786 787 environmental changes. SW prepared the data, ran the analyses, interpreted the results, and 788 wrote the first draft of the manuscript; JL designed the study, provided part of the data, 789 analysed the data and interpreted the results; PAA, GA, VB, KAB, HJBB, HHB, CJD, MD, 790 SD, MD, RE, JCG, BJG, JAG, AG, KK, ML, AM, BN, AO, HP, VR, SR, SMS, FHS, JS, 791 WT, LUT, VV, LGV, RV, PV, WW, TW, NEZ, and JK, provided the data; GD, WT, AG, HJBB, IGA, MD, KH, SD, RV, JAG, WSA, VV, RE, JCS, TW, WW, MM, MZ, and JCG 792 793 contributed to the design of the study and to the interpretation of the results. All authors 794 contributed substantially to elaborate the final version of the manuscript.

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FIGURE LEGENDS

796 Figure 1 Delineation of the two study regions (a, b), i.e. the Alps in red and Fennoscandia in blue, as well as maps showing the predicted presence-absence distribution (obtained by using 797 798 a species-specific threshold value based on the sensitivity-specificity sum maximiser criterion 799 (MST) (see explanations related to model evaluation in the section on data analyses in the 800 main text) to convert probabilities of presence into presence (1) and absence (0) data) and 801 realised climatic niches of Dryas octopetala and Fragaria vesca (b, c, d, e) across both the 802 studied geographical space (a, c, e) and the studied bi-dimensional climatic space represented by growing degree days above 0°C (GDD) and the aridity index (AI) (b, d, f). The 803 804 intersection of climatic conditions (GDD and AI) shared by both the Alps and Fennoscandia 805 corresponds to the analogue climatic space whereas climatic conditions unique to the Alps or 806 Fennoscandia constitute the non-analogue climatic space. Climatic conditions outside the 807 analogue and non-analogue climatic spaces are not available within the study area. The warm 808 and cold color scales in the GDD-AI space represent kernel densities (cf. the realised climatic 809 niches) for populations of both Dryas octopetala (d) and Fragaria vesca (e) in the Alps and 810 Fennoscandia, respectively. Maps are depicting the digital terrain model (DTM) from the 811 Shuttle Radar Topography Mission (SRTM) at 1-km resolution and projected into the 812 'ETRS89 / ETRS-LAE; code EPSG: 3035' projection system. Dryas octopetala is a typical 813 Arctic-alpine plant with a strictly disjunct distribution across Europe and which populations in 814 the Alps and Fennoscandia are confined to mountainous areas or Arctic-alpine tundra (cf. the 815 "restricted" group). Fragaria vesca is a widespread plant which distribution is patchy across 816 Europe but not necessarily confined to mountainous areas or Arctic-alpine tundra (cf. the 817 "enlarged" group).

819 Figure 1 Delineation of the two study regions (a, b), i.e. the Alps in black and Fennoscandia 820 in dashed, as well as maps showing the predicted presence-absence distribution (in grey, 821 obtained by using a species-specific threshold value based on the sensitivity-specificity sum 822 maximiser criterion (MST) (see explanations related to model evaluation in the section on 823 data analyses in the main text) to convert probabilities of presence into presence (1) and 824 absence (0) data) and realised climatic niches of *Drvas octopetala* and *Fragaria vesca* (b. c. 825 d, e) across both the studied geographical space (a, c, e) and the studied bi-dimensional 826 climatic space represented by growing degree days above 0°C (GDD) and the aridity index (AI) (**b**, **d**, **f**). The intersection of climatic conditions (GDD and AI) shared by both the Alps 827 828 and Fennoscandia corresponds to the analogue climatic space whereas climatic conditions 829 unique to the Alps or Fennoscandia constitute the non-analogue climatic space. Climatic 830 conditions outside the analogue and non-analogue climatic spaces are not available within the 831 study area. The colour scales in the GDD-AI space represent kernel densities (cf. the realised 832 climatic niches) for populations of both Dryas octopetala and Fragaria vesca in the Alps 833 (grey scales) and Fennoscandia (from white in the center to black), respectively. Maps are 834 depicting the digital terrain model (DTM) from the Shuttle Radar Topography Mission 835 (SRTM) at 1-km resolution and projected into the 'ETRS89 / ETRS-LAE; code EPSG: 3035' 836 projection system. Dryas octopetala is a typical Arctic-alpine plant with a strictly disjunct 837 distribution across Europe and which populations in the Alps and Fennoscandia are confined 838 to mountainous areas or Arctic-alpine tundra (cf. the "restricted" group). Fragaria vesca is a 839 widespread plant which distribution is patchy across Europe but not necessarily confined to 840 mountainous areas or Arctic-alpine tundra (cf. the "enlarged" group).

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843 Figure 2 Response curves of *Drvas octopetala* (a) and *Fragaria vesca* (b) along the growing 844 degree days above 0°C (GDD) in both the Alps (dashed curve) and Fennoscandia (solid curve), according predictions from the final model (see the section on data analyses in the 845 846 main text) after model calibration and model selection (Appendix S4) as well as model 847 evaluation (Appendix S5). Dryas octopetala is a typical Arctic-alpine plant with a strictly 848 disjunct distribution across Europe and which populations in the Alps and Fennoscandia are 849 confined to mountainous areas or Arctic-alpine tundra (cf. the "restricted" group). Fragaria 850 *vesca* is a widespread plant which distribution is patchy across Europe but not necessarily 851 confined to mountainous areas or Arctic-alpine tundra (cf. the "enlarged" group).

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853 Figure 3 Histograms showing the differences between species' realised-niche width in Alps 854 and species' realised-niche width in Fennoscandia across the overall climatic space (i.e. both 855 analogue and non-analogue climatic spaces together) among the 31 species belonging to the 856 restricted group (i.e. species that have disjunct distribution between two study regions; **a**, **c**) 857 and among the 358 species belonging to the enlarged group (i.e. species that are widespread 858 across Europe and found in both regions; b, d) along the growing degree days above 0°C 859 (GDD) (**a**, **b**) and aridity index (AI) (**c**, **d**) gradients. The dotted and solid vertical lines show 860 the mean differences and the zero values, respectively. P-values calculated from paired two-861 sample Student's *t*-tests were significant in all cases and means that the niche breadths are significantly different between the two study regions. P-values are given as: *** <0.001; ** 862 <0.01; * <0.05. 863

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Figure 4 Histograms showing the differences between species' realised-niche optimum in
Alps and species' realised-niche optimum in Fennoscandia across the overall climatic space

(i.e. both analogue and non-analogue climatic spaces together) among the 31 species belonging to the restricted group (\mathbf{a} , \mathbf{c}) and among the 358 species belonging to the enlarged group (\mathbf{b} , \mathbf{d}) along the growing degree days above 0°C (GDD) (\mathbf{a} , \mathbf{b}) and aridity index (AI) (\mathbf{c} , \mathbf{d}) gradients. The dotted and solid vertical lines show the mean differences and the zero values, respectively. Significant *P*-values, calculated from paired two-sample Student's *t*-tests, means that the niche optima are significantly different between the two study regions. *P*values are given as: *** <0.001; *n.s.* non significant.

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876 Figure 5 Box plots showing the distribution of observed niche overlap values across the 877 overall climate space (i.e. both analogue and non-analogue climatic spaces together) 878 according to species' biogeographic groups when considering the 31 species belonging to the 879 restricted group (a) and the 358 species belonging to the enlarged group (b). Chorology is a qualitative variable representing species' biogeographic origins: Arctic-alpine (Ar.-al.), Asia, 880 881 Eurasia (EU), Europe (EUR), Holarctic (Hol.), Mediterranean (Med.), North America (NA) 882 (Landolt et al., 2010). Numbers in brackets correspond to the number of species in each 883 biogeographic group. Box plots show median, 25 and 75% percentiles, whiskers extend to 1.5 884 x interquartile range, and points are values lying outside this range.

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Figure 6 Scatter plots showing the distribution of the observed niche overlap across the
overall climate space (i.e. both analogue and non-analogue climatic spaces together) among
the 31 species belonging to the restricted group (a, b) and among the 358 species belonging to
the enlarged group (c, d) along Ellenberg gradients for temperature (T) (a), soil moisture (F)
(b), soil nutrient (N) (c), and soil acidity (R) (d). Trend line obtained using a univariate linear
regression when only the ecological gradient in question was considered as the independent

- 892 variable and the observed niche overlap as the response variable. For a complete multivariate
- 893 linear regression model, see Appendix S11.









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SUPPORTING INFORMATION

- 910 Additional Supporting Information may be found in the online version of this article:
- 911 Appendix S1 Pool of terrestrial vascular plant species common to the Alps and Fennoscandia.
- 912 Appendix S2 Details about the nine climatic variables considered in this study.
- 913 Appendix S3 List of data-handling manipulations on presence and absence data of each of the
- 914 888 terrestrial vascular plant species belonging to the common species pool.
- 915 Appendix S4 Model calibration and model selection.
- 916 Appendix S5 Model evaluation.
- 917 Appendix S6 Region effect.
- 918 Appendix S7 Niche overlap.
- 919 Appendix S8 Full results on region effect.
- 920 Appendix S9 Full results on niche overlap, niche width, and niche optimum across the overall
- 921 climatic space.
- 922 Appendix S10 Full results on niche overlap, niche width, and niche optimum across the
- 923 analogue climatic space.
- 924 Appendix S11 Full results on niche overlap and plant traits.