1	For: PeerJ Preprints
2	Article type: Research article
3	Short title: Reverse diversity gradients in mammals
4	
5	
6	
7	Historical contingency, niche conservatism and the tendency for
8	some taxa to be more diverse towards the poles
9	
10 11	Ignacio Morales-Castilla ^{1,2} *, Jonathan T. Davies ³ and Miguel Á. Rodríguez ¹
12 13 14	¹ Departament of Life Sciences, University of Alcalá, 28871, Alcalá de Henares, Spain ² Department of Organismic and Evolutionary Biology, Harvard University, 26 Oxford St, Cambridge, MA, 02138, USA
15 16 17	³ Botany, forest & conservation sciences, University of British Columbia, 2212 Main Mall, Vancouver, BC, V6T 1Z4, Canada
18	
19 20	*Correspondence to: Ignacio Morales-Castilla
21	E-mail: <u>ignacio.moralesc@uah.es</u>
22	

23 Abstract 24 Successful explanations for diversity gradients should account for both the generalized 25 tendency towards a higher tropical diversity and its exceptions. Moreover, identifying 26 exceptions to general trends, such as the latitudinal diversity gradient can give insight into 27 the mechanistic explanations responsible for structuring them. The Cenozoic biotic 28 exchange of mammals across the Bering land-bridge provides an illuminating case-study. It 29 allows comparing the diversity of clades that participated in the exchange (colonizers), 30 whose ancestors withstood the Beringian cold temperatures, with that of the clades that did 31 not participate (sedentaries). We find that assemblages of colonizers are more diverse 32 towards higher latitudes, opposing the traditional latitudinal diversity gradient which is 33 followed by sedentaries. Despite the long passage of time since this major dispersal event, the geographic distribution of colonizers is more strongly correlated to the distributions of 34 35 other colonizers inhabiting a different continent than by the distribution of sedentary species. These results highlight the importance of historical migrations and dispersal in 36 37 configuring present-day diversity gradients. Importantly, we also suggest that colonizers 38 may be particularly vulnerable to projected climate change because of the predicted 39 decrease in climate space in the extra-tropical realm where they are currently most diverse. 40 41 42 **Keywords**: Biotic exchange; niche conservatism; Bering land-bridge; diversification; 43 reversed diversity gradients; time-for-speciation effect; species richness.

45 Introduction

46 The latitudinal diversity gradient (LDG)—the tendency for species diversity to increase 47 toward the tropics—is perhaps one of the most ubiquitous pattern in ecology (Hawkins 48 2001). The literature on the LDG is vast due to the large number of hypotheses proposed to 49 account for it, but we still lack a single overarching explanation. Further complicating the 50 search for a single cause, there are numerous exceptions to the LDG, in which species 51 richness shows the reverse diversity gradient (Kindlmann et al. 2007; Morales-Castilla & 52 García-Valdés 2014). Examples of reverse gradients include: Lagomorpha (Rolland et al. 53 2014), Artiodactyla (Fergnani & Ruggiero 2015), migratory birds (Cook 1969; Morales-54 Castilla et al. 2013; Storch et al. 2005), emydid turtles (Stephens & Wiens 2003), arboreal 55 ants (Ribas 2006), aphids (Dixon et al. 1987), ichneumonids (Gauld 1987; Gauld et al. 56 1992; Janzen 1981; Janzen & Pond 1975; Shaw 1994), mollusks (Valdovinos et al. 2003) and, benthonic algae (Santelices 1980). If we consider the LDG not as a spatial pattern, but 57 58 as reflecting a climate-richness relationship – i.e. with richness peaking under warmer and 59 wetter climatic conditions - we find additional exceptions, for example, in the elevational 60 species richness patterns of treefrogs (Smith et al. 2007) and salamanders (Kozak & Wiens 61 2010), and in the tendency of some squamate reptile groups to show higher richness in arid 62 environments (Morales-Castilla et al. 2011; Wiens et al. 2013). Explanations proposed for 63 these less common gradients have generally been proposed *ad hoc*, for example, calling 64 upon differential habitat availability (Storch et al. 2005; Valdovinos et al. 2003), or biotic 65 interactions (Buckley et al. 2003), and do not widely generalize. We suggest that a general 66 explanation for the LDG must also be able to account for these, less common, reverse 67 gradients.

68 Climatic niche conservatism—the tendency of species to retain ancestral climatic 69 niches (Wiens & Donoghue 2004)—couple with the time-for-speciation effect—the 70 expectation of higher species richness for clades that have remained for longer in a given 71 environment) (Stephens & Wiens 2003) -have been proposed as a plausible explanation 72 for both the LDG and its exceptions. Niche conservatism predicts higher species richness 73 within ancestral environments, i.e. those occupied by species' ancestors, regardless whether 74 that environment is tropical or extra-tropical. This is because species are pre-adapted to 75 these ancestral conditions, and because clades would have had more time for diversification

76 in their ancestral environments (Wiens & Donoghue 2004). While niche conservatism as an 77 explanation for the LDG has frequently been referred to as the Tropical Conservatism Hypothesis (TCH, (Wiens & Graham 2005)), it could also be applied to clades that 78 79 originated under extratropical conditions (Buckley et al. 2010b). The expectation for these clades would be of higher species richness within temperate or cold regions (see figure 1). 80 81 Correlative support for the TCH is widespread (Buckley et al. 2010a; Hawkins & DeVries 82 2009; Hawkins et al. 2007); however, a more powerful test of the niche conservatism 83 hypothesis would be to evaluate predictions by contrasting diversity gradients between 84 taxon sets with differing biogeographic histories.

85 Testing the niche conservatism hypothesis requires information on historical niches. However, data on species ancestral distributions are rarely available (Springer et al. 2011). 86 87 One approach is to assign ancestral niches based on species present-day distributions 88 (Buckley et al. 2010a); but current methods for reconstructing ancestral climate niches, 89 which are a product of a species' geographic distribution, can be highly unreliable (Kozak 90 & Wiens 2010). An alternative, but less explored approach, is to use information on 91 historical biogeography to characterise species climatic origins. For example, major 92 historical dispersal events, such as biotic exchanges, have helped in understanding 93 comparisons between contemporary versus ancestral mammalian body size patterns 94 (Morales-Castilla et al. 2012). The biotic exchanges that occurred during the Cenozoic are 95 reasonably well documented, with detailed information in the fossil record allowing 96 identification of the mammalian genera that participated (or not) in the biotic exchange 97 across the Bering land bridge (Tedford et al. 2004; Woodburne & Swisher 1995). In this 98 example, even if the precise geographical origins of the mammal species remain unclear, 99 we can assume with reasonable confidence that their ancestors crossing the Bering bridge 100 must have been generally well adapted to withstand the lower temperatures that 101 characterised Beringia towards the end of the Cenozoic (Lavrushin & Alekseev 2005). We 102 can thus assume that colonizers (species with ancestors that crossed the Bering land bridge) 103 likely descend from cold-adapted ancestors, whereas sedentaries (species with ancestors 104 that were not part of the biotic exchange across the Bering land bridge) might have more 105 tropical ancestry, reflecting the earlier diversification of mammal lineages in the tropical 106 biome (Buckley et al. 2010a).

107 Here we evaluate the niche conservatism hypothesis by contrasting diversity 108 gradients between Holarctic mammal faunas grouped according to their participation in the 109 Bering biotic exchange. We compared diversity gradients between colonizer and sedentary 110 taxa, and tested the following three linked predictions related to the niche conservatism 111 hypothesis. First, if crossing Bering were a useful proxy for ancestral niches, we predict 112 sedentaries would conform to the classical LDG in both the Palaearctic and the Nearctic, as 113 observed for all mammals globally (Davies et al. 2008), whereas colonizers would show a reverse gradient with more species at high latitudes and within colder areas. Second, we 114 115 would expect environment-richness models for colonizers to perform better at predicting 116 species richness of colonising lineages in their area of origin than species richness of 117 sedentaries. Third, we predict negative temperature-richness relationships for colonizers 118 and positive ones for sedentaries.

119

120 Material and Methods

121 Empirical Data

We obtained range maps for all Palaearctic and Nearctic non-volant terrestrial mammal
species from (Schipper et al. 2008) and rasterized them on a *ca*. 100 x 100 Km equal-area
grid comprising 2,244 cells in the Nearctic and 4,162 cells in the Palaearctic. Nearctic and
Palaearctic biogeographic regions were delimited according to the mammalian
zoogeographic domains in (Rueda et al. 2013). We used biogeographic regions rather than
smaller domains (i.e. sub-continents) because their delineation implicitly represents

128 geographic extents with homogeneous biogeographic histories.

129 Mammal species within each domain were classified according to whether or not they 130 fell within genera that participated in the Bering biotic exchange (i.e. colonizers versus 131 sedentaries). To identify the genera that crossed the Bering land bridge we followed the 132 palaeontological literature documenting the fossil record of the Nearctic and the Palaearctic 133 through the Pliocene-Pleistocene (Bell et al. 2004; Tedford et al. 2004; Webb & Barnosky 1989; Woodburne & Swisher 1995). For some species, we used familial (rather than 134 135 generic) associations due to the lack of resolution in the fossil record (e.g. families 136 Erinacidae, Soricidae and Talpidae, see Woodburne & Swisher 1995; and see electronic 137 supplementary material, Appendix S1). Mammal taxonomy was standardised to Wilson &

138 Reeder (2005), and the resulting dataset encompassed a total of 865 species classified 139 within the following three major groups: (i) P-N colonizers, (ii) N-P colonizers, and (iii) P 140 and N sedentaries. We considered as colonizers the species belonging to genera that 141 dispersed from the Palaearctic to the Nearctic ("P-N colonizers"), or from the Nearctic to 142 the Palaearctic ("N-P colonizers"). In addition, we considered two sub-groups within the P 143 and N sedentaries: (iv) confamilial sedentaries, representing species belonging to non-144 colonizing genera but falling within families that contained colonizer genera, and (v) old colonizers, including species that were not identified as colonizers but which fall within 145 146 cosmopolite genera present in both the Palaearctic and the Nearctic. Confamilial 147 sedentaries could be more similar to colonizers due to phylogenetic relatedness, while old 148 colonizers might have crossed Bering prior to the Plio-Pleistocene or might be actual 149 colonizers for which we lack a detailed fossil record (see Table 1 for number of taxa and details of each group). 150

151

152 Environmental models

153 To make cross-predictions of species richness among assemblages of colonizers, we 154 followed the macroecological modelling approach (MEM hereafter), which models species 155 richness against a set of environmental variables. MEMs have proven useful as a 156 conservative alternative to stacking species distribution models in order to make 157 assemblage level predictions of species richness (Dubuis et al. 2011b; Guisan & Rahbek 158 2011). We used MEMs rather than stacked species distribution models because the latter 159 have shown a tendency to over-predict species richness (Dubuis et al. 2011a). The goal was 160 to quantify the ability of MEMs for colonizers calibrated on their biogeographic region of 161 origin to predict species richness of their biogeographic region of current occupancy (see 162 Table 1). 163 First, we used five environmental variables (see below) commonly used to model 164 mammalian species richness (Hawkins et al. 2012) to build MEMs of species richness for 165 both colonizer and sedentary groups within each biogeographic region. Second, for 166 colonizers, we used the MEMs constructed on their biogeographic region of origin to make

167 predictions of species richness on their colonized region. Third, we used MEMs for

168 colonizers constructed on their biogeographic region of current occupancy to predict
169 species richness of sedentary species in that same biogeographic region.

170 The five environmental variables used to build the MEMs were: (1) mean annual 171 temperature and temperature seasonality (Bio 1 and 4, respectively, from WorldClim; Hijmans et al. 2005); (2) annual average Net Primary Productivity, extracted from Imhoff 172 173 et al. (2004; data available at http://sedac.ciesin.columbia.edu/es/hanpp.html); (3) mean 174 annual precipitation (Bio 12, from WorldClim; Hijmans et al. 2005); (4) range in elevation 175 (data available at http://www.ngdc.noaa.gov/seg/cdroms/ged_iia/datasets/a13/fnoc.htm); 176 and (5) a measure of mesoclimatic variation derived from the interaction between 177 temperature and topography (mean annual temperature [+21°C] x range in elevation).

178 MEM fits were stimated by averaging the predictions of four common modelling 179 techniques (Dubuis et al. 2011b): generalized linear models (GLMs; McCullagh & Nelder 1989), generalized additive models (GAMs), which are a non-parametric version of GLMs 180 181 (Hastie & Tibshirani 1990); and two machine learning methods based on decision trees, 182 generalized boosted models (GBMs; Friedman et al. 2000; Ridgeway 1999) and random 183 forests (RF; Breiman 2001). Since the relationship between species richness and annual temperature was non-linear, GLMs also included a quadratic term for this variable. Both 184 185 GLMs and GAMs were fit assuming a Poisson distribution and a logarithmic link function 186 (i.e. logistic regression). GBMs and RFs were computed using a maximum of 500 trees.

187 We tested if the five environmental variables included in the models accounted for 188 the spatial autocorrelation in species richness by analysing autocorrelation in model 189 residuals. For this, we computed Moran's I values for the raw richness data of each species 190 group as well as for the averaged residuals generated by each MEM. MEMs were 191 constructed in R (R Development Core Team, 2011) with the libraries 'glm2' (Marschner 192 2011), 'gam' (Hastie 2008), 'gbm' (Ridgeway 2007) and 'randomForest' (Liaw & Wiener 193 2002) and autocorrelation analyses were run in SAM v.4.0 (Rangel et al. 2010). We 194 inspected the variable importance metrics to detect potential differences in the main drivers 195 of richness variation between species groups and/or regions (see electronic supplementary 196 material, Appendix S2).

197

198 Evaluation and comparison of environmental models

199To evaluate the model performance, we used a tenfold cross-validation procedure200with 1,000 iterations. The original dataset was split into two, with models fitted to 70% of201the data and verified on a 30% hold-out set. Split-sample iterations were computed for202MEMs for each subset of species in each region. Model accuracy was assessed with203Spearman correlations between fitted species richness (estimated from the 70% modelled204set) and predicted species richness (from the 30% hold-out set).

In some cases, species within the P-N and N-P colonizer sets belong to the same genera, a stronger correlation between their MEMs might then be attributed to the phylogenetic closeness among congeneric species. We explored potential for bias by testing the ability of MEMs for colonizers to predict species richness of sedentary confamilials.

209

210 Phylogenetic models

To test for differences in the environment-richness relationships between colonisers and sedentries we used phylogenetic generalized least squares models (PGLS; Freckleton et al. 2002) on the slopes of the richness-temperature relationship within mammal families. The slopes of the richness-temperature relationship were obtained for each mammalian family by fitting GLS logistic regression models (see above). Mammal families were classified as colonizer if they contained one or more colonizing genera. To account for additional factors that might mediate the environment-richness relationships, we included average log-body

- 218 mass and log-range size, both computed at the family level. We accounted for uncertainty
- 219 in the phylogenetic hypothesis by running analyses on a random sample of 100 trees from
- 220 the posterior distribution of the complete mammal phylogeny in (Faurby & Svenning
- 221 2015). Each of the sampled trees was pruned to a single tip for each included family.
- 222 Phylogenetic analyses were performed in the R library 'caper' (Marschner 2011).
- 223

224 Results

- 225 Colonizers showed inverse latitudinal species richness patterns regardless of the
- 226 biogeographic domain and irrespective of whether P-N colonizers (figure 2a), N-P
- 227 colonizers (figure 2b) or Old colonizers (figure 2c) were considered. Overall, assemblages
- of colonizers are more species-rich across temperate and high latitudes than within the
- 229 lowest latitudes of the Nearctic and the Palaearctic. P-N colonizers showed highest species

230 richness concentrated in Alaska and the northern half of the Nearctic and, coinciding with 231 Mongolia, Siberia and mountainous regions of the Palaearctic (figure 2a). Assemblages of 232 N-P colonizers show a similar species richness pattern with higher species richness along 233 the Rockies and the Appalachians in the Nearctic (figure 2b). Species richness of Old 234 colonizers is also higher along the Rockies in the Nearctic and in Mongolia in the 235 Palaearctic (figure 2c) and does not conform to the LDG. In contrast, species richness 236 patterns for sedentary species follow the pattern expected by the LDG, regardless of whether P and N sedentaries (figure 2d) or confamilial sedentaries (figure 2e) are 237 238 considered. Assemblages of sedentary species clearly present increasing species richness 239 with decreasing latitude in both the Nearctic and the Palaearctic.

240 Results from averaged MEMs utilizing five environmental predictors explain most of variation in species richness for assemblages of both colonizers and sedentaries ($R^2 > 0.7$). 241 Hence, richness predicted by MEMs highly correlates with observed species richness in all 242 243 cases (Spearman's $\rho > 0.834$) (Table 1). Outcomes from the four modelling techniques are 244 consistent in their predictive ability (Spearman's $\rho > 0.736$) and in identifying temperature 245 and net primary productivity as the predictors more strongly associated with species 246 richness of P-N colonizers and N-P colonizers, respectively (see electronic supplementary 247 material for details, Appendix S2). Model verification confirms that MEMs are accurate 248 overall, and that models for P-N colonizers consistently yield better predictions than 249 models for N-P colonizers (see electronic supplementary material, Appendix S3).

250 MEMs for colonizers (see summary statistics in Table 2) at their biogeographic 251 region of origin predicted substantial variation in species richness at their biogeographic 252 region of destination (P-N colonizers $R^2 = 0.502$; N-P colonizers $R^2 = 0.310$, Table 3). The 253 cross-predictive ability among MEMs of Old colonizers was weaker than that among MEMs of colonizers in both the Nearctic ($R^2 = 0.340$) and the Palaearctic ($R^2 = 0.114$) (see 254 255 Table 3). Furthermore, MEMs predictions among colonizers significantly outperformed 256 predictions between sedentaries and colonizers, regardless of whether all sedentary species, or sedentary confamilials were accounted for (figure 3; Table 3). Spatial autocorrelation did 257 258 not affect our results since Moran's I correlograms showed little or no autocorrelation in 259 MEMs residuals, indicating that most spatial variation in species richness was accounted 260 for by the environmental predictors (see electronic supplementary material, Appendix S4).

261 PGLS models confirmed a significant effect of being colonizer on the temperature-262 richness relationships at the family level (see electronic supplementary material, Appendix 263 S5). As expected, colonizer clades tend to show negative temperature-richness relationships 264 while sedentary clades increase in species richness with increasing temperature, and 265 differences are significant as shown by a phylogenetic ANOVA (*p*-value = 0.040 ± 0.019 ; 266 figure S5 in Appendix S5). Further, being colonizer is significant after controlling for 267 phylogenetic relatedness (*p*-value = 0.048 ± 0.008), after including body mass as a covariate (*p*-value = 0.020 ± 0.016), and is marginally significant after including both 268 269 body-mass and range size as covariates (*p*-value = 0.072 ± 0.032 ; see Table S5 in Appendix 270 S5). These results support all three predictions.

271

Discussion

Our results evidence that the contemporary geographic distribution of species can be 273 274 partially explained by historical events of dispersal and subsequent conservatism of 275 ancestral climatic preferences. This is particularly true if historical dispersal took place 276 across a corridor such as the Bering Strait that would have acted as a strong environmental 277 filter only allowing cold-adapted species to pass. Despite the long time-period spanned 278 since the analysed Plio-Pleistocene biotic exchanges through Bering, species with cold-279 adapted ancestors are still preferably distributed within the colder climates at higher 280 latitudes (see figure 2). In contrast, species richness of sedentary clades that did not cross 281 the Bering Strait conform to the pattern of increasing diversity with decreasing latitude 282 predicted by the LDG. The marked divergence between colonizers and sedentaries is 283 confirmed by both geographically and phylogenetically explicit analyses and, offer a 284 compelling mechanism able to simultaneously explain why most taxonomic groups are 285 more diverse in the tropics while other taxa would show inverse latitudinal diversity 286 gradients.

- Far from novel, the fact that most clades increase their diversity towards the equator and certain clades are more diverse towards the poles has been long acknowledged and intensely studied (Fergnani & Ruggiero 2015; Rolland et al. 2014). However, encompassing explanations for such a pattern have remained elusive. For instance, in
- Buckley et al. (Buckley et al. 2010a), the authors analysed the variation in climate-richness

292 relationships as a function of clade age for all world's mammals. They found that negative 293 temperature-richness relationships are strongly phylogenetically constrained and that, 294 overall, clades with negative temperature-richness relationships tend to be younger. The 295 existence of many young clades with positive temperature-richness relationships (Buckley 296 et al. 2010a) suggests that mechanisms complementary to age should be assessed. While 297 our results cannot be extrapolated to all mammals, they combine a specific historical event 298 of dispersal and phylogenetic niche conservatism, to robustly explain differences in 299 climate-richness relationships across clades. For the 28 families of mammals in our study, 300 those with genera that participated in the biotic exchange through Bering are significantly 301 more likely to show negative climate-richness relationships, even after controlling for 302 phylogenetic relatedness, for body size and for range size (see Appendix S5).

303 The ability of MEMs to cross-predict species richness among assemblages of 304 colonizers from one biogeographic region to the other may be related to phylogenetic 305 relatedness among the subsets of colonizers (i.e. their species belong to the same genera). 306 This is, ancestral environmental preferences would have been conserved through evolution 307 and thus, closely related species distribute in similar environments within different 308 biogeographic domains. Accordingly, phylogenetic niche conservatism expects closely 309 related species to be more similar in their traits than expected by chance (Losos 2008). A 310 twofold approach allowed us inspecting to what extent the stronger predictive ability of 311 MEMs amongst colonizers was due to phylogenetic relatedness.

312 First, we compared the ability of phylogenetic relationships to account for proxies of 313 the environmental tolerances (extracted from the environmental distributions of species, 314 regarding temperature and net primary productivity) of each subset of colonizer and 315 sedentary species (see electronic supplementary material, Appendix S6). Consistently with 316 cross-predictions among MEMs, we found that phylogenetic filters selected for temperature 317 and productivity yielded stronger predictions among colonizers than between sedentary and 318 colonizer species. Nonetheless, we found predictions based on phylogenetic relationships to 319 be generally weak (see electronic supplementary material, Appendix S6). Second, if 320 phylogenetic relatedness was the sole mechanism behind the similarities in the distributions 321 of colonizers across continents, then MEMs for Old colonizers should also predict species 322 richness from one biogeographic region to the other. MEMs among Old colonizers partially

323 predicted species richness across biogeographic regions, but these predictions were weaker324 than among P and N colonizers (Table 2).

Together, these results suggest that the effects of phylogenetic relatedness manifest 325 326 preferably at the generic level or below since predictions made among models of 327 confamilial species are significantly weaker than predictions among congenerics (Table 2). 328 Recent works (Khaliq et al. 2015; Olalla-Tárraga et al. 2011) have provided evidence for 329 conservatism of climatic tolerances. In particular, conservatism of tolerance to cold temperatures has been shown to manifest more clearly at the generic level for mammals 330 331 (Olalla-Tárraga et al. 2011). Overall, phylogenetic relatedness seems not enough to explain 332 the conservatism of cooler climatic niches shown by colonizers. Considering that they share 333 a common biogeographic history would be needed to understand the current distribution of 334 species whose ancestors crossed Beringia.

335 Alternatively to explanations based on niche conservatism (Wiens & Donoghue 336 2004) and on the time that clades had to diversify (Stephens & Wiens 2003), other 337 evolutionary mechanisms may underlay our findings. Differences in diversification rates 338 (i.e. speciation minus extinction) between tropical and temperate regions have often been 339 invoked to explain why the tropics harbour the highest diversity (Chown & Gaston 2000; 340 Mittelbach et al. 2007). However, studies referring to diversification rates to explain 341 diversity gradients often provide contradictory results (Soria-Carrasco & Castresana 2012; 342 Weir & Schluter 2007). Surprisingly, and despite the expectation for higher net 343 diversification rates within the tropics, there are examples of higher temperate 344 diversification for mammals (Rolland et al. 2014; Weir & Schluter 2007). All the same, 345 even the literature in diversification rates recurs to both the age and the geographic origin 346 of the clades, to explain differences in speciation rates (Rolland et al. 2014; Soria-Carrasco 347 & Castresana 2012). For example, (Rolland et al. 2014) found higher diversification within 348 temperate regions for the order Lagomorpha and the family Talpidae, which was 349 interpreted based in their origin within temperate Asia and the time that clades would have 350 had to diversify in situ. To assess the extent to which diversification rates would affect our 351 results, we compared net diversification rates and Lineage Through Time (LTT) plots 352 between colonizer and sedentary mammals. We found little difference in diversification 353 rates among colonizers and sedentaries and a more recent diversification of colonizers (see

electronic supplementary material, Appendix S7), which would coincide with some
colonizers' diversification posterior to pre-Plio-Pleistocene Beringian biotic exchanges.
Nevertheless, these analyses suggest that we can rule out rates of evolution as a cause for
the observed differences in species richness among exchanged and non-exchanged
mammals, consistent with previous findings (McPeek & Brown 2007; Soria-Carrasco &
Castresana 2012); but see (Rolland et al. 2014).

360 Admittedly, our results might be limited by not considering extinct taxa. A number of extinct mammal genera are identified as participants in the biotic exchange through the 361 362 Bering land bridge (Tedford et al. 2004; Woodburne & Swisher 1995). For example, most 363 taxa present in the Plio-Pleistocene record identified by (Bell et al. 2004) (see figure 7.2 364 therein) have become extinct. What would be the diversity pattern of exchanged species if 365 extinct species were still alive? A likely answer is that the observed pattern of higher 366 temperate species richness for colonizers would be reinforced. This conjecture stems from 367 the fact that many extinct genera were distributed across the northernmost latitudes of the Holarctic (e.g. genera Mammuthus or Coelodonta) (Lorenzen et al. 2011), and that the 368 369 regions witnessing more extinctions were those where climate change was more severe 370 (Nogués-Bravo et al. 2010). Furthermore, most of the orders encompassed by our analyses 371 have shown higher extinction rates within the temperate regions (Rolland et al. 2014). 372 These facts indicate that it is unlikely that the distributions of most extant species belonging 373 to exchanged genera across temperate, polar or mountainous regions (figure 2a-b) be due to 374 higher extinctions of colonizers within lower latitudes.

375 Global mammalian diversity gradients emerge through addition of markedly different 376 clade-specific patterns (Buckley et al. 2010b; Isaac 2005). Global diversity patterns can be 377 'deconstructed' in a number of ways to understand the underlying processes. Common 378 approaches include studying distributional patterns for individual taxonomic groupings (i.e. 379 orders, families) (Cooper & Purvis 2010); to deconstruct the patterns attending to traits 380 such as body size (Terribile et al. 2009); or, grouping taxa according to phylogenetic 381 characteristics – i.e. the length of the terminal branches (Davies & Buckley 2012). Here, we 382 propose to deconstruct diversity patterns by selecting subsets of species according to their 383 biogeographic history. Our results support this choice since neither taxonomic grouping (at 384 the family level) nor phylogenetic relatedness, account for the observed patterns as strongly

as historically defined groupings do (Table 2). Although this approach may not be
recommendable for any study of niche conservatism, it proves suited for taxa with inverse
LDG patterns, or taxa whose distributions are suspected to be strongly influenced by
biogeographic history.

389

390 Conclusions

391 All our predictions are supported by data and show a strong influence of deep historical biogeographic events over contemporary diversity patterns. Mammal species whose 392 393 ancestors colonized a new continent by crossing the Bering land-bridge preferably 394 distribute across cooler latitudes. Further, their environmental preferences resemble more 395 those of other colonizers in a different continent than the environmental affinities of 396 sedentary species. Logically, the environmental preferences of ancestors are not perfectly 397 conserved, which is expected given that the evolutionary process consists of accumulation 398 of change through time. The mammal genera that participated in the Beringian biotic 399 exchange expanded their ranges longitudinally across the Holarctic even crossing 400 continents, but seemingly, did not expand as much their latitudinal ranges (figure 2). Niche 401 conservatism would have prevented species whose ancestors were adapted to high latitude 402 climates from colonizing and expanding towards tropical latitudes. In sum, the combination 403 of past dispersal events and the longer time to diversify within cold environments while 404 constrained by the retention of ancestral niches, can explain the inverse LDG patterns 405 observed for colonizers. Our findings not only add to our understanding of how diversity 406 patterns are configured through time, but they also might have implications for the effects 407 that ongoing global change could have over extant species adapted to temperate and cold 408 environments. Cold-adapted species have also shown to maintain the environmental 409 preferences of their ancestors through time, and might be at risk if the geographic extent of 410 cooler niches shrinks in a future.

411

412 Acknowledgements

413 I.M.-C. received support by the Fonds de Recherches du Québec - Nature et Technologies

414 (FQRNT) programme, Projet de Recherche en Équipe and is currently supported by a

415 Postdoctoral Fellowship by the Programa Propio de la Universidad de Alcalá. The Ministry

416	of Economy	y and Com	petitivenes	s of Spain a	warded a g	grant to M	I.A.R.	(CGL2013-4876	8-
-----	------------	-----------	-------------	--------------	------------	------------	--------	---------------	----

- 417 P).
- 418

419 **References**

- Bell CJ, Lundelius Jr EL, Barnosky A, Graham R, Lindsay E, Ruez Jr D, Semken Jr H, Webb S, Zakrzewski
 R, and Woodburne M. 2004. The Blancan, Irvingtonian, and Rancholabrean mammal ages. In:
 Woodburne MO, ed. *Late Cretaceous and Cenozoic mammals of North America: biostratigraphy and geochronology*: Columbia University Press, 232-314.
- 424 Breiman L. 2001. Random forests. *Machine learning* 45:5-32.
- Buckley HL, Miller TE, Ellison AM, and Gotelli NJ. 2003. Reverse latitudinal trends in species richness of
 pitcher-plant food webs. *Ecology Letters* 6:825-829.
- Buckley LB, Davies TJ, Ackerly DD, Kraft NJ, Harrison SP, Anacker BL, Cornell HV, Damschen EI,
 Grytnes J-A, and Hawkins BA. 2010a. Phylogeny, niche conservatism and the latitudinal diversity
 gradient in mammals. *Proceedings of the Royal Society of London B: Biological Sciences* 277:21312138.
- Buckley LB, Davies TJ, Ackerly DD, Kraft NJB, Harrison SP, Anacker BL, Cornell HV, Damschen EI,
 Grytnes J-A, Hawkins Ba, McCain CM, Stephens PR, and Wiens JJ. 2010b. Phylogeny, niche
 conservatism and the latitudinal diversity gradient in mammals. *Proceedings of the Royal Society B*277:2131-2138. 10.1098/rspb.2010.0179
- Chown SL, and Gaston KJ. 2000. Areas, cradles and museums: the latitudinal gradient in species richness.
 Trends in Ecology & Evolution 15:311-315.
- 437 Cook RE. 1969. Variation in species density of North American birds. *Systematic Biology* 18:63-84.
- 438 Cooper N, and Purvis A. 2010. Body size evolution in mammals: complexity in tempo and mode. *American* 439 *Naturalist* 175:727-738. 10.1086/652466

440Davies TJ, and Buckley LB. 2012. Exploring the phylogenetic history of mammal species richness. Global441Ecology and Biogeography 21:1096-1105. 10.1111/j.1466-8238.2012.00759.x

- 442 Davies TJ, Fritz SA, Grenyer R, Orme CDL, Bielby J, Bininda-Emonds OR, Cardillo M, Jones KE, Gittleman
 443 JL, and Mace GM. 2008. Phylogenetic trees and the future of mammalian biodiversity. *Proceedings*444 of the National Academy of Sciences 105:11556-11563.
- Dixon A, Kindlmann P, Lepš J, and Holman J. 1987. Why there are so few species of aphids, especially in the tropics. *American Naturalist* 129:580-592.
- 447 Dubuis A, Pottier J, Rion V, Pellissier L, Theurillat J-P, and Guisan A. 2011a. Predicting spatial patterns of
 448 plant species richness: a comparison of direct macroecological and species stacking modelling
 449 approaches. *Diversity and Distributions* 17:1122-1131. 10.1111/j.1472-4642.2011.00792.x
- Dubuis A, Pottier J, Rion V, Pellissier L, Theurillat JP, and Guisan A. 2011b. Predicting spatial patterns of
 plant species richness: a comparison of direct macroecological and species stacking modelling
 approaches. *Diversity and Distributions* 17:1122-1131.
- Faurby S, and Svenning J-C. 2015. A species-level phylogeny of all extant and late Quaternary extinct
 mammals using a novel heuristic-hierarchical Bayesian approach. *Molecular Phylogenetics and Evolution* 84:14-26.
- Fergnani PN, and Ruggiero A. 2015. Ecological diversity in South American mammals: their geographical distribution shows variable associations with phylogenetic diversity and does not follow the latitudinal richness gradient. *PloS one* 10:e0128264.
- 459 Freckleton RP, Harvey PH, and Pagel M. 2002. Phylogenetic analysis and comparative data: a test and review 460 of evidence. *The American Naturalist* 160:712-726.
- 461 Friedman J, Hastie T, and Tibshirani R. 2000. Additive logistic regression: a statistical view of boosting (with
 462 discussion and a rejoinder by the authors). *The annals of statistics* 28:337-407.
- Gauld ID. 1987. Some factors affecting the composition of tropical ichneumonid faunas. *Biological Journal of the Linnean Society* 30:299-312.
- Gauld ID, Gaston KJ, and Janzen DH. 1992. Plant allelochemicals, tritrophic interactions and the anomalous
 diversity of tropical parasitoids: the" nasty" host hypothesis. *Oikos*:353-357.

167	Guisan A and Babbak C 2011 SESAM a new framework integrating macroscological and macro
468	distribution models for predicting spatio temporal patterns of spacios assemblages. <i>Journal of</i>
160	$B_{iogeography} = 29.1423 + 1444 + 10 + 1111/i + 1365 + 2600 + 2011 + 02550 \text{ s}$
470	Hactia T 2008 gam: Constalized additive models <i>P. nackaga varsion</i> 10
470 171	Hastie TL and Tibebironi PL 1000 <i>Conoralized additive models</i> : CPC Press
472	Hawking BA 2001 Ecology's oldest pattern? Trands in Ecology & Evolution 16:470
473	Hawkins BA. 2001. Ecology's oldest patient: Trends in Ecology & Evolution 10.470.
473 171	American butterflies <i>Journal of Riageography</i> 26:1608–1711
474 175	Howking RA Diniz Filho LAF Joramillo CA and Scaller SA 2007 Climate niche conservatism and the
476	global bird diversity gradient. The American Naturalist 170:S16 S27
477	Hawkins Ba McCain CM Davies TI Buckley I B Anacker BI Cornell HV Damschen EI Grutnes I-A
478	Harrison S. Holt RD. Kraft NIB and Stephens PR 2012 Different evolutionary histories underlie
479	congruent species richness gradients of birds and mammals <i>Journal of Riogeography</i> 39:825-841
480	101111/i1365.2609201102655x
481	Hijmans RI Cameron SF Parra II Jones PG and Jarvis A 2005 Very high resolution interpolated climate
482	surfaces for global land areas. International journal of climatology 25:1965-1978
483	Imhoff M Bounoua I, Ricketts T Loucks C, Harriss R, and Lawrence WT 2004. Global patterns in net
484	primary productivity Global Patterns in Human Appropriation of Net Primary Productivity Human
485	Appropriation of Net Primary Productivity as a Percentage of Net Primary Productivity'
486	Socioeconomic Data and Applications Center (SEDAC), available online [29 Sep 08] at<
487	http://sedac.ciesin.columbia.edu/es/hannn.html.
488	Isaac JL, 2005. Potential causes and life-history consequences of sexual size dimorphism in mammals.
489	Mammal Review 35:101-115.
490	Janzen DH. 1981. The peak in North American ichneumonid species richness lies between 38 degrees and 42
491	degrees N. <i>Ecology</i> 62:532-537.
492	Janzen DH, and POND CM. 1975. A comparison, by sweep sampling, of the arthropod fauna of secondary
493	vegetation in Michigan, England and Costa Rica. Transactions of the Royal Entomological Society of
494	London 127:33-50.
495	Khaliq I, Fritz SA, Prinzinger R, Pfenninger M, Böhning-Gaese K, and Hof C. 2015. Global variation in
496	thermal physiology of birds and mammals: evidence for phylogenetic niche conservatism only in the
497	tropics. <i>Journal of Biogeography</i> 42:2187-2196.
498	Kindlmann P, Schödelbauerová I, and Dixon AF. 2007. Inverse latitudinal gradients in species diversity.
499	Scaling biodiversity:246-257.
500	Kozak KH, and Wiens JJ. 2010. Niche conservatism drives elevational diversity patterns in Appalachian
501	salamanders. American Naturalist 176:40-54. 10.1086/653031
502	Lavrushin YA, and Alekseev M. 2005. The arctic regions. <i>Geological Society of America Special Papers</i>
503	382:13-29.
504	Liaw A, and Wiener M. 2002. Classification and regression by randomforest. R News 2 (3): $18-22$. URL:
505	nup://CKAN K-project org/aoc/Knews.
500	Cilbert MTP, and Nielson P. 2011. Species specific responses of Late Outermany magafauna to
507	olimete and humang. Nature 470:250-264
508	L acos ID 2008 Dhylogenetic niche conservatism, nhylogenetic signal and the relationship between
510	nbylogenetic relatedness and ecological similarity among species. <i>Ecology Latters</i> 11:005, 1003
511	Marschner IC 2011 glm2: fitting generalized linear models with convergence problems. The R journal 3:12-
512	15
513	McCullagh P and Nelder IA 1989 Generalized linear models: CRC press
514	McPeek MA and Brown IM 2007 Clade age and not diversification rate explains species richness among
515	animal taxa. American Naturalist 169:E97-E106.
516	Mittelbach GG, Schemske DW, Cornell HV, Allen AP, Brown JM, Bush MB, Harrison SP, Hurlbert AH
517	Knowlton N, and Lessios HA. 2007. Evolution and the latitudinal diversity gradient: speciation.
518	extinction and biogeography. <i>Ecology Letters</i> 10:315-331.
519	Morales-Castilla I, and García-Valdés R. 2014. Gradientes latitudinales de diversidad inversos, <i>j</i> excepciones
520	que prueban la regla? Revista Ecosistemas 23:4-12.

521	Morales-Castilla I, Olalla-Tárraga MÁ, Bini LM, De Marco Jr P, Hawkins Ba, and Rodríguez MÁ. 2011.
522	Niche conservatism and species richness patterns of squamate reptiles in eastern and southern Africa.
523	Austral Ecology 36:550-558. 10.1111/j.1442-9993.2010.02186.x
524	Morales-Castilla I, Olalla-Tárraga MÁ, Purvis A, Hawkins BA, and Rodríguez MÁ, 2012. The imprint of
525	Cenozoic migrations and evolutionary history on the biogeographic gradient of body size in New
526	World mammals American Naturalist 180:246-256 10 1086/666608
527	Morales-Castilla I. Rodríguez MÁ Kaur R and Hawkins BA 2013 Range size natterns of New World oscine
528	passerines (Aves): insights from differences among migratory and sedentary clades <i>Journal of</i>
520	<i>Biogeography</i> 40:2261, 2273, 10 1111/ibi 12150
530	Nagués Brava D. Ohlemüller P. Batra D. and Arayia MB. 2010. Climate predictors of late Quaternary
531	avtinations, Evolution 64:2442, 2440
537	Ololla Térraga MÁ Molnnes I. Bini I.M. Diniz Filho IA. Fritz SA. Howkins BA. Hortal I. Orma CDI
532	Pablak C and Podríguez MÁ 2011 Climatic niche conservatism and the evolutionary dynamics in
537	species range hounderies slobel congruence conservation and amplifiant. <i>Journal of</i>
525	species range boundaries: global congruence across mammals and amphibians. <i>Journal of</i>
535	Diogeography 56:2257-2247.
527	Ranger 1F, Diniz-Fino JAF, and Bini Livi. 2010. SAIVI: a comprehensive application for spatial analysis in
520	macroecology. <i>Ecography</i> 33:46-50.
520	Ribas CR. 2006. Gradiente latitudinal de riqueza de especies de formigas em cerrado: regra de rapoport e
539	eteitos da produtividade e heterogeneidadePhD. Universidade Federal de Viçosa.
540	Ridgeway G. 1999. The state of boosting. Computing Science and Statistics: 1/2-181.
541	Ridgeway G. 2007. gbm: generalized boosted regression models. R package ver. 1.6-3. R package version 16.
54Z	Rolland J, Condamine FL, Jiguet F, and Morlon H. 2014. Faster speciation and reduced extinction in the
543	tropics contribute to the mammalian latitudinal diversity gradient. <i>PLoS Biology</i> 12:e10017/5.
544	Rueda M, Rodriguez MA, and Hawkins BA. 2013. Identifying global zoogeographical regions: lessons from
545	Wallace. Journal of Biogeography 40:2215-2225.
546	Santelices B. 1980. Phytogeographic characterization of the temperate coast of Pacific South America.
54/	Phycologia 19:1-12.
248 540	Schipper J, Chanson JS, Chiozza F, Cox NA, Hoffmann M, Katariya V, Lamoreux J, Rodrigues AS, Stuart
549	SN, and Temple HJ. 2008. The status of the world's land and marine mammals: diversity, threat, and
550	knowledge. Science 322:225-230.
551	Shaw MR. 1994. Parasitoid host ranges. Parasitoid Community Ecology:111-144.
552	Smith SA, De Oca ANM, Reeder TW, and Wiens JJ. 2007. A phylogenetic perspective on elevational species
555	richness patterns in middle american treefrogs: Why so few species in lowland tropical rainforests?
554	Evolution 61:1188-1207. 10.1111/j.1558-5646.2007.00085.x
222	Soria-Carrasco V, and Castresana J. 2012. Diversification rates and the latitudinal gradient of diversity in
556	mammals. Proceedings of the Royal Society B 2/9:4148-4155.
55/	Springer MS, Meredith RW, Janecka JE, and Murphy WJ. 2011. The historical biogeography of Mammalia.
558	Philosophical Transactions of the Royal Society B: Biological Sciences 366:24/8-2502.
559	Stephens PR, and Wiens JJ. 2003. Explaining species richness from continents to communities: the time-for-
500	speciation effect in emydid turtles. American Naturalist 161:112-128.
561	Storch D, Evans KL, and Gaston KJ. 2005. The species–area–energy relationship. <i>Ecology Letters</i> 8:487-492.
562	Tedford RH, Albright III LB, Barnosky AD, Ferrusquia-Villafranca I, Hunt Jr RM, Storer JE, Swisher III CC,
563	Voorhies MR, Webb SD, and Whistler DP. 2004. Mammalian biochronology of the Arikareean
564	through Hemphillian interval (late Oligocene through early Pliocene epochs). In: Woodburne MO,
565	editor. Late Cretaceous and Cenozoic mammals of North America: biostratigraphy and
566	geochronology: Columbia University Press. p 169-231.
567	Terribile LC, Diniz-Filho JAF, Rodríguez MA, and Rangel TFL. 2009. Richness patterns, species
568	distributions and the principle of extreme deconstruction. <i>Global Ecology and Biogeography</i> 18:123-
569	136.
570	Valdovinos C, Navarrete SA, and Marquet PA. 2003. Mollusk species diversity in the Southeastern Pacific:
5/1	why are there more species towards the pole? <i>Ecography</i> 26:139-144.
572	Webb SD, and Barnosky AD. 1989. Faunal dynamics of Pleistocene mammals. Annual Review of Earth and
5/3	Planetary Sciences 17:413.
5/4	Weir JT, and Schluter D. 2007. The latitudinal gradient in recent speciation and extinction rates of birds and
5/5	mammals. Science 315:15/4-15/6. 10.1126/science.1135590

576	Wiens II and Donoghue MI 2004 Historical biogeography ecology and species richness. Trends in Ecology
577	& Evolution 19:639-644.
578	Wiens JJ, and Graham CH. 2005. Niche conservatism: integrating evolution, ecology, and conservation
579	biology. Annual Review of Ecology, Evolution and Systematics: 519-539.
580	Wiens JJ, Kozak KH, and Silva N. 2013. Diversity and niche evolution along aridity gradients in North
581	American lizards (Phrynosomatidae). Evolution 67:1715-1728.
582	Wilson DE, and Reeder DM. 2005. <i>Mammal species of the world: a taxonomic and geographic reference:</i>
583	JHU Press.

- Woodburne M, and Swisher C. 1995. Geochronology, time scales, and global stratigraphic correlations.
 SEPM (Society of Economic Paleontologists and Mineralogists) Special Publication 54:335-364.
- 586

587 Figure captions

588

589 Figure 1. Scheme modified from (Wiens & Donoghue, 2004) depicting how niche 590 conservatism and the time-for-speciation effect (Stephens & Wiens, 2003) would also apply 591 to a clade originated within an extra-tropical region (i.e. temperate region). That clade 592 would accumulate more species through the diversification process within the region of 593 origin. The lower panel shows how for equal diversification rates, a clade of temperate 594 origin would accumulate more species than a tropical clade at a given moment t₁ (modified 595 from Mittelbach et al., 2007). 596 597 Figure 2. Species richness gradients for species of Nearctic and Palaearctic non-volant 598 mammals grouped as follows: (A) richness of P-N colonizers (n = 127), (B) richness of 599 exchanged species to the Nearctic (n = 126), (C) richness of exchanged species to the 600 Palaearctic (n = 172), (D) richness of all non-exchanged species (n = 572), and, (E) species 601 richness of con-familial non-exchanged species (n = 219). Grey arrows indicate the 602 direction of the biotic exchange for the groups of exchanged species. 603 604 Figure 3. Comparison among MEMs' cross-predictions between exchanged species from 605 the biogeographic region of origin to the biogeographic region of destination (green) and 606 MEMs of non-exchanged species predicting species richness of exchanged species (yellow) 607 within the Nearctic (A) and the Palaearctic (B). Frequency distributions of errors of both 608 cross-predictions (i.e. among MEMs of exchanged species and among MEMs of non-609 exchanged and exchanged species) are also shown for the Nearctic (C) and the Palaearctic 610 (D).

611





617 Figure 2.



- 620
- 621

622 Table 1. Mammal groups used for the study of species richness gradients in the Palaearctic and the Nearctic. Each group comprises species belonging to genera that either remained in 623 their native region ("sedentary" species), or colonized the other region by crossing the 624 Bering Strait during the Plio-Pleistocene ("colonizer" species). Species belonging to genera 625 present in both regions that might have crossed Bering prior the Plio-Pleistocene have been 626 identified as a separate group (i.e. "Old colonizers"). Species confamilial to colonizer 627 species but belonging to genera that did not cross Bering are identified as "confamilial 628 sedentaries". 629

630

Native	Colonized	Colonizer/	Group	Current number of taxa					
region	region	Sedentary	name	Hola	arctic	Palae	earctic	Nea	rctic
				Genera	Species	Genera	Species	Genera	Species
Palaearctic	Nearctic	Colonizer	P-N colonizers	22	127	14	79	21	58
Nearctic	Palaearctic	Colonizer	N-P colonizers	35	170	24	90	14	83
Palaearctic & Nearctic	-	Old colonizer	Old colonizers	10	136	10	67	10	73
Palaearctic & Nearctic	-	Sedentary	Confamilial sedentaries	78	217	45	99	36	120
Palaearctic & Nearctic	-	Sedentary	P and N sedentaries	170	568	103	292	77	280

- 632 **Table 2.** Summary of Goodness of fit of averaged Macro-Ecological Models (MEMs) of
- 633 species richness for P-N and N-P colonizers. Both Spearman's ρ and R^2 are indicative of
- 634 relationships between predicted and observed species richness values. All Spearman
- 635 correlations were significant (P < 0.001).

Taxa	Biogeographic Region	n	Spearman's ρ	\mathbb{R}^2
P-N colonizer	Nearctic (destination)	2244	0.922	0.859
	Palaearctic (origin)	4162	0.834	0.701
N-P colonizer	Nearctic (origin)	2244	0.872	0.772
	Palaearctic (destination)	4162	0.843	0.723

- 638 **Table 3.** Cross-predictions among MEMs of colonizers and sedentaries at the
- 639 biogeographic region of origin predicting species richness at the biogeographic region of
- 640 destination.

MEM	Predicted species richness	Spearman's ρ <i>p</i> -value <	\mathbb{R}^2
P-N colonizers in Palaearctic	P-N colonizers in Nearctic	0.679 0.001	0.502
	N sedentaries	0.204 0.001	0.053
	N confamilial sedentaries	0.508 0.001	0.255
N-P colonizers in Nearctic	N-P colonizers in Palaearctic	0.521 0.000	0.310
	P sedentaries	0.244 0.001	0.049
	P confamilial sedentaries	0.244 0.001	0.042
Old colonizers in Palearctic	Old colonizers in Nearctic	0.610 0.001	0.340
Old colonizers in Nearctic	Old colonizers in Palearctic	0.344 0.001	0.114