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1	Habitat heterogeneity mediates effects of individual variation on spatial species
2	coexistence
3	Dongdong Chen ^{1,2,#} , Jinbao Liao ^{3,#} , Daniel Bearup ⁴ and Zhenqing Li ^{1,2*}
4	¹ State Key Laboratory of Vegetation and Environmental Change, Institute of Botany,
5	Chinese Academy of Sciences, Beijing 100093, China
6	² University of Chinese Academy of Sciences, Beijing 100049, China
7	³ Ministry of Education's Key Laboratory of Poyang Lake Wetland and Watershed
8	Research, School of Geography and Environment, Jiangxi Normal University,
9	Ziyang Road 99, 330022 Nanchang, China
10	⁴ University of Kent, School of Mathematics, Statistics and Actuarial Sciences,
11	Parkwood Road, Canterbury, CT2 7FS, UK
12	
13	*Author for correspondence: Prof. Dr. Zhenqing Li, e-mail: lizq@ibcas.ac.cn
14	Address: 20 Nanxincun, Xiangshan, Haidian District, Beijing 100093, China
15	Tel: +86-10-62836956

#Co-first authors with equal contribution

17 Abstract

18	Numerous studies have documented the importance of individual variation (IV) in
19	determining the outcome of competition between species. However, little is known
20	about how the interplay between IV and habitat heterogeneity (i.e. variation and
21	spatial autocorrelation in habitat quality) affects species coexistence at the landscape
22	scale. Here we incorporate habitat heterogeneity into a competition model with IV, in
23	order to explore the mechanism of spatial species coexistence. We find that
24	individual-level variation and habitat heterogeneity interact to promote species
25	coexistence, more obviously at lower levels of dispersal rates. This is in stark contrast
26	to early non-spatial models, which predicted that IV reinforces competitive
27	hierarchies and therefore speeds up species exclusion. In essence, increasing variation
28	in patch quality and/or spatial habitat autocorrelation moderates differences in the
29	competitive ability of species, thereby allowing species to coexist both locally and
30	globally. Overall, our theoretical study offers a mechanistic explanation for emerging
31	empirical evidence that both habitat heterogeneity and IV promote species
32	coexistence and therefore biodiversity maintenance.
33	Keywords: Beverton-Holt model, spatial competition, habitat heterogeneity,
34	intraspecific variability

35 **1. Introduction**

36 Understanding the underlying mechanism of species coexistence in space and 37 therefore biodiversity maintenance, is a fundamental issue in ecology [1, 2]. Recent 38 developments in spatial competition theory have already advanced our understanding 39 of competitive coexistence in spatially structured habitats [3-7]. In general, 40 coexistence requires species to be different in the way they affect, and are affected by, 41 competitors and available resources, resulting in niche difference or average fitness difference between species [3, 7-11]. Differences in the ecological niches occupied by 42 43 the species within a community act to stabilize the system, with large differences 44 promoting coexistence [10, 11]. By contrast, differences in the fitness of those species 45 drive competitive exclusion, with large differences suppressing coexistence [8, 9]. As 46 the major forces driving interspecific differences, both individual-level variation and 47 habitat heterogeneity can play a vital role in mediating the demographic 48 characteristics of species, thereby altering population dynamics and species 49 coexistence [11-13]. 50 Recent work, including both theoretical and empirical studies, has begun to 51 highlight the importance of individual-level variation (e.g. life-history processes, 52 functional traits) in determining coexistence outcomes of species [14-19]. Individual 53 variation (IV) can affect species dynamics and community structure through Jensen's 54 inequality (i.e. variation around the trait mean can alter the average interaction 55 strength if the interaction depends nonlinearly on a species' trait) [14, 20], increased

56	degree of species interaction (i.e. strength of heterospecific interaction) [21-23], and
57	the Portfolio effect (i.e. intraspecific trait variation can protect populations from
58	extreme temporal fluctuations in population density) [24]. A series of studies found
59	that IV has a positive effect on coexistence when differences in competitive ability
60	among conspecific individuals can break down competitive hierarchies of species,
61	such that intraspecific competition is stronger than interspecific competition [4, 25,
62	26]. In contrast, other studies predicted that intraspecific variation should increase
63	niche overlap between species and thus suppress coexistence [14, 27]. This
64	discrepancy is probably a result of the fact that almost all studies involving IV are
65	non-spatial, omitting the vital role of spatiality. For instance, species in nature are
66	often spatially structured, and their demographic traits might be strongly selected for
67	by habitat heterogeneity resulting from climate change and anthropogenic disturbance
68	[4, 28, 29]. As such, the effects of individual-level variation on demography are likely
69	to be altered by habitat heterogeneity. Although Uriarte and Menge [4] explored
70	species regional coexistence with IV, they only simulated two different patches (with
71	different species preferring different patches) [4], omitting the potential for variation
72	and spatial autocorrelation in habitat quality.
73	In recent decades, the importance of habitat heterogeneity for species coexistence
74	has received great attention [30-34]. In spatially heterogeneous landscapes, the
75	demographic characteristics of species (e.g. mortality and fecundity) are likely to vary
76	across environmental gradients, resulting in intra- and inter-specific variation within

77	the community. For instance, empirical evidence showed that the germination rate and
78	per-germinant fecundity of plants might be subject to local habitat suitability (e.g.
79	light, moisture or soil nutrients) [35, 36]. In addition, competitive hierarchies of
80	species might shift in a spatial context due to the effects of biotic and abiotic
81	heterogeneity [5]. In particular, habitat heterogeneity (e.g. resulting from land use
82	change, pollution, over-exploitation and climate change) can have a significant effect
83	on species coexistence for suitable spatial scales, for example, the 'grain' of the
84	heterogeneity should be smaller than the 'extent' of the community [30, 37].
85	Although the individual effects of IV and habitat heterogeneity on species
86	coexistence have been well documented, very few studies have explored their
87	interactive effects on the outcomes of competition at a regional scale. Spatial habitat
88	heterogeneity can be expected to add another axis, in addition to IV, over which
89	species can differ [3]. Consequently, systems incorporating both forms of variation
90	could produce asynchronous community dynamics, as spatial habitat heterogeneity
91	can directly result in individual-level variation among patches. In this study, we
92	incorporate IV into the classical Beverton-Holt model of two competitors [38] with
93	neighbour dispersal in spatially heterogeneous landscapes. With the model, we
94	attempt to answer the following questions. (i) Whether and how IV interacts with
95	habitat heterogeneity to alter competitive outcomes and what is the underlying
96	mechanism? (ii) How does increasing species dispersal rate modulate the interactive
97	effect of IV and habitat heterogeneity on spatial coexistence?

98 **2. Modelling description**

99 **2.1 Beverton-Holt model with IV**

We base this study on the competition model for two annual plant species developed by Beverton and Holt [38]. This model is well characterized analytically [39] and can describe plant community dynamics in the field [40]. In addition, recently it has been applied to explore the effect of IV on species coexistence [4,15]. In the absence of IV

and habitat heterogeneity, the dynamics of the first species are described by

105
$$n_{1,t+1} = g_1 \lambda_1 n_{1,t} / (1 + \alpha_{11} g_1 n_{1,t} + \alpha_{12} g_2 n_{2,t}), \qquad (1)$$

106 where $n_{1,t}$ is the density of seeds of species 1 at time *t*, g_1 is the germination rate of 107 the seeds, λ_1 is the low density fecundity of the germinated seed, and α_{11} and α_{12} 108 are the interaction coefficients describing the per-capita effects of conspecifics and 109 heterospecifics on seed production. The dynamics of the second species are given by 110 an equation of the same form.

- 111 According to Godoy et al. [41], the interaction coefficient between
- 112 heterospecifics (α_{12}) can be decomposed into species 1's generic response to
- 113 competition (competitive sensitivity r_1) and the effect of species 2 on all other species

114 (e_2), i.e. $\alpha_{12} = r_1 e_2$. This simplification can be further applied to diverse

- 115 communities, as it primarily focuses on the competition between each pair of species
- 116 (i.e. pairwise interaction), instead of higher-order interactions involving multiple
- 117 species. In this form, the competitive ability of species 1 becomes a trait of the species
- 118 independent of the identity of its competitors [41, 42], characterized by

119
$$(g_1\lambda_1 - 1)/r_1$$
 (2)

120 In the absence of niche difference and IV in the demographic and competitive 121 parameters in eqn 2, the superior competitor can outcompete the inferior species [41]. 122 Recently, Hart et al. ([14] and more detail therein) investigated the effects of IV 123 on local coexistence by incorporating IV into the competitive sensitivity r. In 124 particular, they reformulated eqn 1 as an integro-difference equation $n_{1,t+1} = n_{1,t} \int \frac{g_1 \lambda_1}{1 + r_1(e_1 g_1 n_{1,t} + e_2 g_2 n_{2,t})} p_1(r_1) dr_1$ 125 (3) where $p_1(r_1)$ is the probability distribution of r_1 . Thus the integral represents the 126 127 mean effect of intra- and inter-specific (with species 2) interactions on species 1. Note 128 that, following previous studies on the effects of variation in species demographic 129 properties on population dynamics [15, 43], the variation in competitive sensitivity r

130 is assumed to be constant across generations.

131 **2.2 Spatially structured competition model**

132 Next, we introduce spatial habitat heterogeneity into the above competition model.

133 Specifically, we assume that individuals of the two species with intraspecific variation

134 in *r* compete in a lattice-structured landscape consisting of 10×10 patches with

- 135 periodic boundary conditions (i.e. acting as a torus). The local patch quality (e.g.
- 136 nutrients, moisture) was assumed to vary and, thus, to affect species low density
- 137 fecundity (λ) [35, 44]. This assumption introduces a spatial factor that influences
- 138 competitive outcomes, since in this model, fecundity affects those outcomes.
- 139 Following typical assumptions for metacommunity models, we assume that the two

140 species compete only in patches where they co-occur.

141	The two species were assumed to disperse within the landscape using neighour
142	dispersal. In particular, they were able to colonize patches that share an edge with
143	those in which they were already present (i.e. a von Neumann neighborhood $z = 4$)
144	[45]. In our framework, we divided habitat heterogeneity into two elements [34]:
145	variation in patch quality and spatial autocorrelation of patch quality (i.e. the
146	clustering degree of patches with similar quality).
147	We assume that competitive sensitivity is not heritable but rather a population
148	level variation, thus in each generation seeds mature into plants with sensitivity drawn
149	from the sensitivity distribution for their species r_i . However, the fecundity of mature
150	plants is determined by the quality of the patch in which they reside, and so, in
151	particular, the number of seeds L they produce varies by patch. These seeds can either
152	be dispersed into neighbouring patches or stay in the natal patch. Thus we derive the
153	following equations for the dynamics of species 1 in a given patch <i>i</i>

154
$$n_{1,t+1,i} = \left(\left(1 - \sum_{j} m_{1,i \to j} \right) L_{1,t,i} + \sum_{j} m_{1,j \to i} L_{1,t,j} \right)$$
(4a)

155
$$L_{1,t,i} = \int \frac{g_{1,i}\lambda_{1,i}n_{1,t,i}}{1 + r_1(e_{1,i}g_{1,i}n_{1,t,i} + e_{2,i}g_{2,i}n_{2,t,i})} p_1(r_1)dr_1$$
(4b)

156
$$L_{1,t,j} = \int \frac{g_{1,j}\lambda_{1,j}n_{1,t,j}}{1 + r_1(e_{1,j}g_{1,j}n_{1,t,j} + e_{2,j}g_{2,j}n_{2,t,j})} p_1(r_1)dr_1$$
(4c)

where m_{1,i→j} is the proportion of species 1's seeds dispersing from patch *i* to patch *j*.
L_{1,t,i} is the seed number of species 1 in patch *i*, while L_{1,t,j} is the seed number of
species 1 in patch *j*. The dynamics of the two species within any patch can be
expressed with equations of the form eqn 4a-c with appropriate changes in subscripts.

161 Following Hart et al. [14] and Uriarte et al. [4], we consider individual variation in competitive sensitivity (r) and assume it obeys a four-parameter beta distribution 162 (characterized by the mean \bar{r} , variance σ_r^2 , the maximum and the minimum), 163 regardless of patch quality. The variance σ_r^2 can reflect the magnitude of IV, with IV 164 at $\sigma_r^2 > 0$ but no IV if $\sigma_r^2 = 0$. 165 166 We simulate the lattice-structured landscape with periodic boundaries, consisting 167 of 10×10 patches (cells) of varying habitat quality and spatial habitat autocorrelation (figure 1a, b). Variation in patch quality (h_i) is characterized using a probability 168 distribution (uniform or gamma) with the mean \bar{h} and the variance σ_h^2 ($\sigma_h^2 = 0$ 169 representing the homogeneous landscape). We assume the low-density fecundity λ_i 170 171 of individuals inhabiting a patch *i* is positively correlated to the local patch quality (i.e. $\lambda_{i1} = ah_i, \ \lambda_{i2} = bh_i$). Equation 2 demonstrates that both greater λ and lower *r* have 172 173 a positive effect on competitive ability [41]. As such, we assume that there exists a

174 tradeoff between λ and *r* for both competitors (i.e. higher fecundity implies greater

175 sensitivity to competition and vice versa). This is implemented by assuming that a > a > b

176 b > 0 and $\bar{r}_1 > \bar{r}_2$. To make our results comparable to Hart et al. [14], we set $\bar{r}_1 =$

177 0.012 and $\bar{r}_2 = 0.011$. In our study, two types of landscape are considered by

178 generating spatially correlated random fields based on variogram models [46]

179 (electronic supplementary material, appendix A and figure S1 in appendix C):

180 randomly structured (Moran's I = 0) and spatially autocorrelated (Moran's I = 0.75)

181 landscapes (e.g. figure 1a, b). Additional simulations with intermediate Moran's I =

182	0.5 are provided in figures S2-S4 (electronic supplementary material, appendix C).
183	Using R [47], we simulate three scenarios (see Table 1): (i) the separate effect of
184	habitat heterogeneity and IV on the coexistence of two competitors; (ii) the interactive
185	effect of IV and landscape heterogeneity on competitive coexistence; and (iii) the
186	effect of dispersal rates on spatial competition Specifically, we study spatial
187	coexistence by modelling invasion dynamics, i.e. an exotic species (greater fecundity
188	or lower competitive sensitivity) with low initial density invades into the patches
189	housing a resident species until the system reaches the equilibrium state [14].
190	However, for display purposes, we show competitive dynamics by initially assigning
191	an intermediate density to each species in each patch (see figure 1 and sensitivity
192	anlaysis in electronic supplementary material, figures S5-S6 in appendix C). We run
193	simulations up to 1000 timesteps (sufficient for the system to reach its equilibrium
194	state) with 50 replicates for each scenario (varying IV, habitat heterogeneity, spatial
195	autocorrelation, or dispersal rate), and quantify the competition dynamics over the
196	landscape (population densities of the two species across space and time). A new
197	landscape was generated for each simulation run, by randomly drawing the habitat
198	quality of each patch from a normal distribution with a given variance. These patch
199	properties determined the fecundity of each species within that patch for the duration
200	of the run. A broad range of biologically reasonable parameter combinations were
201	explored and found to yield qualitatively consistent competitive patterns (see
202	electronic supplementary material, figures S2-S10 in appendix C). As such, we use

203 one of these parameter combinations as a representative reference parameter set204 throughout.

205 **3. Results**

206	Firstly, we undertook a systematic comparison of competitive dynamics in random vs.
207	autocorrelated landscapes (Figure 1). In both landscapes, only the combination of IV
208	and patch-quality variation results in species coexistence (blue lines in figure 1c, d),
209	while other cases lead to the exclusion of the inferior species. In particular, the cases
210	without IV result in rapid species exclusion, regardless of habitat heterogeneity (red
211	and black lines in figure 1c, d). In the homogeneous landscape including IV (all
212	patches with the same quality) slows down species exclusion (green lines in figure 1c,
213	d) but does not prevent it. We find that there is little difference between random and
214	auto-correlated landscapes, with the coexistence (or exclusion) patterns remaining the
215	same and very small changes in equilibrium population levels.
216	Here the combined effects of IV in r and variation in habitat quality facilitate
217	species coexistence because the negative, concave-up relationship between
218	competitive sensitivity (r) and seed production (L) can alter the dominance of the
219	superior species in heterogeneous landscapes (figure 2). Specifically, if the low
220	density fecundities (λ) of the two species are the same (e.g. for homogeneous
221	landscapes), it is clear that the relationship between r and L is also the same. Thus, IV
222	in r speeds up competitive exclusion and species 2 (with lower mean r) wins (figure
223	2a). In the heterogeneous landscape, variation in habitat quality induces differences in 11

224	fecundity between patches. Thus, the nonlinear relationship between r and L is not
225	only species-specific but also patch-specific, and the degree of dominance of the
226	superior species in one patch might decline in another (figure 2b). For instance, for
227	two neighbouring patches i and j with variation in patch quality, the mean seed
228	production of species 1 in patch j can be greater than that of species 2 in patch i . This
229	allows dispersal of species 1 from patch <i>j</i> to compensate for species 1's higher
230	sensitivity to competition, ultimately allowing it to dominate patch <i>i</i> . Thus, regional
231	coexistence can occur. The underlying mechanism can be thought of the interplay of
232	nonlinear averaging and source-sink dynamics.
233	Secondly, we evaluated the effect of individual variation on competitive
234	outcomes through varying IV in r between species in random and autocorrelated
235	landscapes (figure 3a, b). For limited dispersal rates ($m = 0.01$), the species with
236	larger IV dominates in either landscape type. If the difference in IV between two
237	species is too small, then IV fosters species coexistence. Furthermore, the coexistence
238	region expands in autocorrelated landscapes relative to random landscapes, reducing
239	the region where species 2 dominates. This indicates that spatial autocorrelation in
240	habitat quality weakens the competitive ability of species 2.
241	The degree of variation in patch quality also has significant effects on species
242	coexistence (figure 3c). In the homogeneous landscape ($\sigma_h^2 = 0$) or landscapes with
243	small variation in patch quality, the dominant species 1 (with greater fecundity)
244	outcompetes species 2 (with lower competitive sensitivity). However, increasing

245	variation in patch quality creates high quality patches which favour species 2's lower
246	competitive sensitivity. This allows the two species to co-occur regionally. At high
247	variation in patch quality, the population density of species 2 exceeds species 1, and
248	thus the dominance shifts from species 1 to species 2.
249	Thirdly, since individual dispersal can alter population dynamics in
250	heterogeneous landscapes, we systematically investigated the effects of dispersal rate
251	on species coexistence. At zero dispersal rate, species can coexist, with species 2
252	having a higher final population density (figure 4a). At low dispersal rates, the
253	dominance of species 2 increases with dispersal rate. However, this trend reverses at
254	high dispersal rates with species 1 becoming dominant and excluding species 2. When
255	the dispersal rate varies between species, large differences in dispersal rate result in
256	competitive exclusion, and the species with the lower dispersal rate wins in both
257	random and autocorrelated landscapes (figure 4b, c). Coexistence occurs when the
258	difference in dispersal rates of both species is relatively small. Spatial autocorrelation
259	in patch quality produces a wider coexistence region than the random landscapes
260	(figure 4c). Note that without IV, the coexistence region decreases rapidly due to
261	competitively exclusion of species 2 (electronic supplementary material, figure S10 in
262	appendix C).
263	Finally, we determined the spatial distribution of the coexisting species in
264	spatially heterogeneous landscapes (electronic supplementary material, figure S8). In
265	both random and autocorrelated landscapes, individuals of species 2 are more likely to

inhabit high-quality patches due to their lower mean competitive sensitivity. In
contrast, individuals of species 1 are more likely to be found in low-quality patches
where their higher fecundity rate compensates for this poorer habitat. Although
species have different habitat preferences, species can coexist locally and regionally
when dispersal rates are low.

271 **4. Discussion**

272 Early non-spatial models of species competition found that, due to the negative, 273 concave-up relationship between competitive sensitivity and population growth, IV in 274 competitive sensitivity reinforced competitive hierarchies, thereby promoting 275 exclusion of weaker competitors from the community [14]. However, we found that 276 spatial heterogeneity in habitat quality reverses this outcome. Variation in patch 277 quality altered the strength of the nonlinear competitive relationship and reduced 278 species differences in competitive ability (figure 2b), allowing them to co-occur on 279 both local and regional scales. In addition, with short-range dispersal, conspecifics 280 aggregated while heterospecifics segregated in spatially autocorrelated landscapes 281 according to the spatial distribution of the coexisting species (electronic 282 supplementary material, figure S8 in appendix C). This further decreases the intensity 283 of interspecific interaction and thus reduces the probability of competitive exclusion, 284 as intraspecific, rather than inter-specific, interactions dominate the population 285 dynamics. Consequently, the probability of regional coexistence of species was higher 286 in auto-correlated landscapes compared to those with random structure (figures 3b &

4c). Therefore, habitat heterogeneity promotes species coexistence through two key
mechanisms, the direct effect of variation in habitat quality and, additionally, the
effect of spatial autocorrelation in local habitat quality.

290 These effects of habitat heterogeneity depend on the rate at which the species 291 disperse within the landscape. In particular, for species with similar dispersal rates, 292 habitat heterogeneity promoted coexistence when these rates were low, but as rates increased, one species came to dominate and eventually excluded the other. This 293 294 phenomenon follows naturally from the observation that the effect of increasing 295 dispersal rate is approximately the same as that of increasing dispersal range or, 296 equivalently, increasing the characteristic size of a habitat patch [48]. Thus, for a fast 297 dispersing species, the landscape can be regarded as being composed of a smaller 298 number of larger "patches" (each made up of several of lattice cells) with a habitat 299 quality equal to the average quality in those constituent cells. As a result, the variation 300 in habitat quality experienced by a fast dispersing species is lower than that 301 experienced by a slow dispersing species, thus the effect of habitat heterogeneity 302 declines with dispersal rate. This emergent property of the model can be interpreted 303 ecologically as increasing dispersal rates causing waste of resources on poorer 304 habitats [49] and the destruction of refuges for weaker competitors. 305 Furthermore, large differences in dispersal rate between species promote 306 competitive exclusion, with the slower dispersing species winning. This is initially a 307 counter-intuitive result, in that greater dispersal rate is typically an advantage.

308	However, it can, again, be understood in terms of the connection between dispersal
309	rate and effective patch size. In particular, whereas a fast dispersing species
310	experiences a landscape of large patches of similar quality, a slow dispersing species
311	can distinguish between patches of high quality and those of low quality. In ecological
312	terms, a fast dispersing species wastes a significant proportion of the seeds it produces
313	on poorer habitats, while the slow dispersing species does not and thus selectively
314	colonizes high quality habitats [49]. Thus, the optimal dispersal strategy for a species
315	may depend on the scale of heterogeneity within the landscape it inhabits. This can be
316	expected to shape the dispersal strategies of resident species through natural selection
317	[50].

318 Previous studies have classified the mechanisms by which species can coexist in 319 spatially heterogeneous landscapes as: a spatial relative nonlinearity, a spatial storage effect, and growth-density covariance [7, 8]. In these terms, species coexistence 320 321 emerges in our model as a result of the simultaneous operation of a spatial relative 322 nonlinearity and a spatial storage effect (electronic supplementary material, appendix 323 B). On the one hand, a spatial relative nonlinearity is created by the interplay between 324 habitat heterogeneity and the nonlinear relationship between competitive sensitivity and population growth, which is not only patch-specific but also species-specific [3]. 325 This landscape scale variation in the strength of the interaction between the species 326 creates variation in the relative competitive strength of the two species, providing the 327 equalising mechanism needed for coexistence [51]. On the other hand, a spatial 328

329	storage effect arises when a species response to local patch quality varies in space
330	(positive relationship between fecundity and local quality in our model), thereby
331	generating a covariance between habitat quality and competitive ability (i.e. the
332	interaction between the effects of environment and competition in determining
333	population growth rate [1, 8]; see derivation in electronic supplementary material,
334	appendix B). For species with IV in competitive sensitivity (as the first niche axis),
335	habitat heterogeneity acts as a second niche axis, creating a broader range of niches
336	for the species to fill and thus promoting coexistence. In addition, relatively low
337	dispersal rates among patches further facilitate species coexistence both locally and
338	regionally by maximizing the species' experience of habitat heterogeneity, a
339	fundamental component of the mechanisms outlined above.
340	The interactions between habitat heterogeneity and individual variation have clear
341	implications for future empirical studies. In particular, while there is substantial
342	experimental evidence for the existence of habitat heterogeneity and IV in ecological
343	systems, there has been little work exploring their combined effects. Instead,
344	experimental studies have focused on predicting competitive outcomes by measuring
345	the variation of functional traits within and between species [28]. Additionally, the
346	interplay of IV and habitat heterogeneity can reinforce the effects of spatial
347	nonlinearity and spatial storage effects. Recent empirical studies have found that in
348	spatially heterogeneous landscapes, species responses to local patch quality (with
349	variation in soil nutrients) result in an increase in population density as variation in

350 patch quality increases, suggesting that more species and more individuals could 351 co-occur [52, 53]. Thus, integrating individual-level variation in species traits with 352 spatial habitat heterogeneity into statistical analysis of experimental data could offer 353 new insights into the mechanism of spatial competitive coexistence. 354 Our study demonstrates the critical role of habitat heterogeneity for species 355 coexistence in a spatial competition model with IV. In particular, habitat heterogeneity promotes spatial coexistence in a two-competitor system if both species have: (1) 356 357 similar degrees of IV and a negative, concave-up relationship between competitive 358 sensitivity and per-capita growth, (2) a low dispersal rate relative to the scale of 359 habitat variability, and (3) a life-history trade-off between competitive sensitivity and 360 fecundity. Our model suggests that previous non-spatial models might underestimate 361 species coexistence and thus biodiversity in spatially realistic landscapes. Note that, 362 IV is constant in our model, but we might expect a strong selective pressure on IV if 363 its degree is insufficient to maintain species coexistence from an evolutionary perspective. This type of selection occurs rapidly when there is only a small change in 364 365 the relative abundance of existing genotypes in the population. As such, we strongly recommend that future models could further explore this process in the context of 366 367 species range boundaries by tracking both demography and the evolution of a 368 quantitative trait in a population that is continuously distributed in space [54-56]. 369 Further studies could also extend this theoretical framework to multispecies systems, 370 but care needs to be taken in inferring that our current outcomes can be applied to

371	diverse communities, as there may be some differences in the behaviours of two vs.
372	multispecies models [57]. Overall, we demonstrate the importance of the combination

- 373 of habitat heterogeneity and IV for outcomes of competition between species, offering
- 374 new insights into the mechanisms of spatial coexistence at both local and regional
- 375 scales.

- 376 Code accessibility: The R source code supporting this article is available at
- 377 https://github.com/dongdongc/habitat-heterogeneity-and-IV.
- 378 Authors' contributions: DC conceived of the study and did the simulations, DC and
- 379 ZL built the model, DC and JL draft the manuscript. All authors gave final approval
- 380 for publication and agree to be held accountable for the work performed therein.
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545 **Tables**

546 **Table 1.** Three cases of spatial competition simulation. Abbreviations: $n_{1,t}$ – seed density of species 1 at time t; g – seed germination rate; λ

547 – low-density fecundity of the germinated seed; α_{ij} – per-capita effects of conspecifics (i=j) or heterospecifics ($i\neq j$) on seed production; r –

548 competitive sensitivity; e - species competitive effect; $m_{1,i \rightarrow j}$ - proportion of species 1's seeds from patch *i* dispersing into patch *j*; $L_{1,t,i}$ - seed

Sii	imulation- case	Landscape heterogeneity		Individual variation (IV) in r			
		Spatial autocorrelation (Moran's I)	Variation in patch quality (σ_h^2)	Mean (\bar{r})	Variance (σ_r^2)	Dispersal rate (m)	Figures
	1	0,0.5,0.75	0,8.3	$\bar{r}_1 = 0.012, \bar{r}_2 = 0.011$	5e-5	0.01	1,2,82
	2	0,0.5,0.75	0,0.2,0.4,10	$\bar{r}_1 = 0.012, \bar{r}_2 = 0.011$	0.5e-5,1e-5,10e-5	0.01	3,\$3
	3	0,0.5,0.75	0,8.3	$\bar{r}_1 = 0.012, \bar{r}_2 = 0.011$	5e-5	0,0.01,0.2	4, S 4, S 8

549	production of species	1 in patch <i>i</i> at time <i>t</i> ; o	r^2 - magnitude of IV in r; h_i	- quality of patch <i>i</i> ; and σ_h^2	- variation in patch quality.
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Figure captions 550

551	Figure 1. Dynamics of two competitors in (a) random (Moran's $l = 0$) vs. (b)
552	autocorrelated (Moran's I=0.75) landscapes, where each cell represents a patch with
553	different quality (described using uniform distributions). The landscape is
554	homogeneous when $\sigma_h^2 = 0$, i.e. all patches have the same quality (not shown).
555	Graphs (c & d): Population dynamics of species 1 (short dashed lines) and species 2
556	(dashed lines) in both random and autocorrelated landscapes with/without IV and
557	variation in patch quality. Parameter values: $\bar{h} = 5.5$, $\sigma_h^2 = 8.3$, $m = 0.01$, $\lambda_{i1} = h_i$,
558	$\lambda_{i2} = 0.77h_i, \ e_1 = e_2 = 1, \ g_1 = g_2 = 1, \ \bar{r}_1 = 0.012, \ \bar{r}_2 = 0.011, \ n_{1,1,i} = n_{2,1,i} = 0.011$
559	175, max/min values for beta distribution: $\bar{r}_1 \pm 0.0109$, $\bar{r}_2 \pm 0.0109$.
560	Figure 2. Effects of IV in r on species coexistence in homogeneous vs . heterogeneous
561	landscapes, with IV being constant across species and patches. (a) The nonlinear
562	relationship between r and L for two competitors is identical in the homogeneous
563	landscape, with IV accelerating competition exclusion. (b) In the heterogeneous
564	landscape with variation in patch quality, IV can facilitate coexistence or switch
565	which species is dominant. For visualisation, results are illustrated using a Gaussian
566	distribution for r . Note that, the straight lines perpendicular to the coordinate axes
567	represent the case without IV. Parameter values: $\bar{r}_1 = 0.015$, $\bar{r}_2 = 0.01$, $\sigma_r^2 = 0.001$,
568	$m = 0.01, \ e_1 = e_2 = 1, \ g_1 = g_2 = 1, \ n_1 = n_2 = 165.$ In (a): $h = 3, \ \bar{\lambda}_1 = \bar{\lambda}_2 = \bar{h};$
569	(b): $h_i = 3 \ h_j = 5, \ \bar{\lambda}_1 = 1.25\bar{h}, \ \bar{\lambda}_2 = \bar{h}.$

Figure 1 Dynamics of two compatitors in (a) random (Maran's I = 0) us (b) 551

570	Figure 3. Interactive effects of IV and landscape heterogeneity (spatial
571	autocorrelation and variation in patch quality) on species coexistence. IV varies across
572	species in both (a) random and (b) autocorrelated landscapes. (c) Effect of variation in
573	patch quality (σ_h^2) on species final population density with 95% confidence interval.
574	Graphs (a & b): patch quality is uniformly distributed with $\sigma_h^2 = 8.3$; and graph (c):
575	patch quality follows the gamma distribution with $\sigma_r^2 = 5e-5$. Graphs (a & c):
576	Moran's I = 0; and graph (b): Moran's I = 0.75. Other parameters: $\bar{h} = 5.5, m = 0.01,$
577	$\lambda_{i1} = h_i, \ \lambda_{i2} = 0.77 h_i, \ e_1 = e_2 = 1, \ g_1 = g_2 = 1, \ \bar{r}_1 = 0.012, \ \bar{r}_2 = 0.011,$
578	max/min values for beta distribution: $\bar{r}_1 \pm 0.0109$, $\bar{r}_2 \pm 0.0109$. Standard
579	derivations of 50 replicates of graphs (a & b) are shown in figure S7 (appendix C).
580	Figure 4. Effect of dispersal rate on the competitive outcomes in both random vs.
581	heterogeneous landscapes. Graph (a): the effect of dispersal rate on final population
582	density with two competitors having the same dispersal rate. Dispersal rates vary
583	across species in (b) random and (c) autocorrelated landscapes. Patch quality is
584	uniformly distributed with $\sigma_h^2 = 8.3$. Graphs (a & b): Moran's I = 0; and graph (c):
585	Moran's I=0.75. Other parameters: $\bar{h} = 5.5, m = 0.01, \lambda_{i1} = h_i, \lambda_{i2} = 0.77h_i, e_1 =$
586	$e_2 = 1, g_1 = g_2 = 1, \bar{r}_1 = 0.012, \bar{r}_2 = 0.011, \sigma_r^2 = 5e-5, \text{max/min values for beta}$
587	distribution: $\bar{r}_1 \pm 0.0109$, $\bar{r}_2 \pm 0.0109$. Standard derivations (SDs) of 50 replicates
588	of (a) are omitted for clarity as they are very small (<7), while SDs for graphs (b & c)
589	are shown in figure S7 (appendix C)