1	On eco-evolutionary dynamics of phenologies in competitive
2	communities and their robustness to climate change
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### 24 Abstract

25 Global changes currently cause temporal shifts in the favourable conditions for different 26 phases of species life cycles. Phenologies characterizing temporal presence, may adapt 27 through heritable evolution in response to these changes. Given a community context, this 28 evolution may cause a change in the phenology overlap and thus a change of interspecific 29 interactions such as competition. Using a model in which phenologies compete and coevolve, 30 we study the conditions under which diversity emerges, as well as their annual distribution. 31 We find that the environment richness (food quantity, light, pollinators...) and competition 32 constrain the diversity and spread of phenologies. A robust pattern of phenologies distribution 33 emerges consistent with Swedish flowering observations. Once a stable community is 34 reached, we apply a progressive change in environmental conditions. We found that 35 adaptation eventually restored diversity, but that the simulated change often led to numerous 36 extinctions due to increased competition. The percentage of diversity lost depends on the 37 speed of change and on the initial diversity. Phenologies already pre-adapted to the new 38 environmental conditions drive the restoration of diversity after the change. We finally study 39 a spatial version of the model in which local communities are organized along an 40 environmental gradient. Pre-change, allowing dispersal decreases the local adaptation of 41 phenologies to their local fixed environmental conditions. Dispersal however largely 42 enhances the maintenance of biodiversity in changing environments, though its benefits are 43 not homogeneous in space. Evolution remains the only rescue mechanism for southern 44 phenotypes.

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Keys words : Phenology, community ecology, evolutionary rescue, competition, adaptivedynamics, dispersal

### 49 Introduction

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Brittany, once a humid region favoring artichoke cultivation may well soon become a new
French wine-growing region. On the other hand, in traditional wine-growing regions,
grapes ripen earlier in the season. Such agricultural shifts immediately pinpoint how species
phenologies are currently affected by climate changes. Wild species undergo similar changes
and many recent shifts in phenology and distributions have been documented (Parmesan and
Yohe 2003).

57 Phenologies are simultaneously selected by environmental conditions and interspecific 58 interactions. Depending on the species life cycle and phenotypic traits, some parts of the year 59 may be more favorable for investment in growth, reproduction and resource acquisition. 60 Environmental factors favoring the presence of a species can be linked to fluctuations in 61 temperature, light or to the availability of certain limiting nutrients (J. Lloyd and Taylor 62 1994). For a given species, the combination of favorable abiotic conditions can be seen as a 63 temporal niche space or environmental window. The presence of other species however 64 constrains species phenology on an ecological and evolutionary scale. Within a functional 65 group, species present at the same time may find themselves in competition for resources or 66 space. Flowering plants may be in competition for pollinators (Mitchell et al. 2009), while 67 developing amphibian larvae may compete with breeding species within a pond (Alford and 68 Wilbur 1985). Mutualistic and trophic interactions similarly require overlapping phenologies 69 for the two species (Loeuille 2019; Waser 1979), so that the fitness of partner species largely 70 depends on their relative timing. Interspecific relationships thereby likely influence the 71 coevolution of species phenologies in natural communities.

72 Competition can cause phenologies to diversify. Assuming a suitable temporal window,

73 phenotypes active at different times partly avoid competition. Niche partitioning and limiting

74 similarity is then expected, so that a given diversity of phenologies may coexist (Macarthur 75 and Levins 1967; Chesson 2000). Such competitive effects are for instance well known for flowering species. In the Arima Valley of Trinidad (tropical region), fruiting seasons of the 19 76 77 species of Miconia genus are spread out to cover the entire year. The staggered fruiting season 78 would have evolved through interspecific competition (Snow 1965). An annual temporal 79 partitioning of pollinators has also been reported many times as an important selective factor 80 of flowering phenologies (Appanah 1985; Botes, Johnson, and Cowling 2008; Wheelwright 81 1985).

82

83 Under current global changes, environmental conditions largely vary in space (warmer 84 conditions northward and at higher altitude) and in time (eg, earlier onset of phenologies, 85 (Sherry et al. 2007; Vitousek 1992)). Such changes in the abiotic conditions directly affect the 86 environmental window in which phenologies may coevolve. Evolution of phenological traits 87 or dispersal to colonize new parts of the changing environmental niche can both save a 88 population. Consistent with this view, many instances of rapid evolution of phenologies have 89 been recently reported (Carter, Saenz, and Rudolf 2018; Franks, Sim, and Weis 2007; Husby, 90 Visser, and Kruuk 2011; Jonzen 2006; Nussey 2005; Phillimore et al. 2010). Earlier arrival 91 dates of migratory birds have for instance been noted, with evolution likely playing a key role 92 (Jonzen 2006). If evolution is fast enough to keep a match between the species phenology, its 93 interactor and the environmental window, evolutionary rescue is expected (Gomulkiewicz and 94 Holt 1995). As global changes also shift the fundamental niche of species in space, dispersal 95 of phenologies to match the environmental niche could similarly offer a rescue mechanism. 96 Northward shifts and phenological shifts have been simultaneously noted in many groups of 97 species (Guisan and Thuiller 2005; Parmesan and Yohe 2003). The extent of dispersal or local 98 adaptation depends on the species ability to disperse and on the environmental fragmentation

99 (Kubisch et al. 2013; Loeuille 2019). For warm latitudes (equator, tropics), no source of
100 phenotypes adapted to warmer temperature may exist. When the environment changes, local
101 adaptation is then the only mechanism capable of saving biodiversity (Norberg et al. 2012;
102 Sinervo et al. 2010).

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104 Changes in the environment are not simply abiotic and climatic, but also entail variations in 105 the community and interaction context. Reshuffling of interactions and local extinctions 106 largely restructure present-day communities (Tylianakis et al. 2008). As matching of 107 phenologies underpin ecological interactions, the restructuring of natural communities largely 108 impacts the fitness of coexisting phenologies and can cause diversity losses. For instance, 109 (Carter, Saenz, and Rudolf 2018) studied the phenology of 66 amphibian species on a 15 year 110 interval. They showed that phenology overlap increased and proposed that this may increase 111 competitive interactions by up to 25%. Eco-evolutionary consequences are intriguing. From 112 an ecological point of view, the increased competition may lead to species loss, due to 113 competitive exclusion. From an evolutionary point of view, given an increase in competitive 114 selective pressures, further displacement of phenologies is expected. Note that the two aspects 115 are in fact intertwined. If species have different abilities to evolve (population size, genetic 116 diversity...), evolutionary rescue may save species that evolve, but increase competition on 117 other species of the community (Loeuille 2019). Such asymmetric effects could make certain 118 species more vulnerable and cause their extinction (Johansson 2008). Interspecific 119 competition can also accentuate the selection gradient in certain situations and accelerate the 120 evolution (Osmond and de Mazancourt 2013). Finally, when local diversity is large, niche 121 packing constrains the possible evolution in response to environmental changes (de 122 Mazancourt, Johnson, and Barraclough 2008). Changing competitive interactions in a

123 community can therefore alter evolutionary rescue by changing the ability of species to track124 environmental changes.

125

126 We build a model of a community of competing phenologies in a temporal niche potential 127 which we will call an environmental window. The environmental window is first fixed, then 128 altered to mimic global changes. Phenologies are characterized by two traits, the spread and 129 the mean date. Fitnesses of the different phenologies depend not only on abiotic constraints 130 (environmental window) but also on surrounding phenologies (competition). Using this 131 model, we investigate the following questions. (1) Given a fixed environmental window, and 132 starting with just one phenology, we investigate the conditions of diversification. When it 133 occurs, we characterize both the ecological (total diversity, community structure) and the 134 evolutionary state (phenology distribution). Phenological traits distribution is then compared 135 to an empirical dataset of flowering plants from Sweden. (2) We then study the impact of a 136 change of the environmental window on traits and on local diversity. We link the loss of 137 phenological trait diversity with the ability of species to evolve for both date and spread. We 138 expect greater losses of biodiversity when evolutionary potential are decreased. (3) Finally, 139 we undertake metacommunity simulations along a continuum of latitudes and investigate 140 whether dispersal or phenology evolution better explain evolutionary rescue events.

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#### 142 I Construction of the eco-evolutionary model

Variable	Significance	Unit
n <sub>i</sub>	Population density of the i <sup>th</sup>	n
	phenotype phenology	
$\mu_i$	Average date of the i <sup>th</sup> phenotype	date
	phenology	

$\sigma_i$	Spread of the i <sup>th</sup> phenotype	days
	phenology in days	
$R(\mu_i,\sigma_i)$	Intrinsic reproduction rate of the	$t^{-1}$
	population	
$C(\mu_i,\mu_j,\sigma_i,\sigma_j)$	Per capita competition rate	$t^{-1} \cdot n^{-1}$
	between phenotypes i and j	

# 144 Table 1 : Model variables and their associated units.

Parameter	Significance	Unit	Value	
m	The threshold for intrinsic reproduction to reach a	t <sup>-1</sup>	200000	
	overall positive reproduction rate			
G	Ability of a species to exploit the environment	days.t <sup>-1</sup>	200	
P <sub>max</sub>	Richness of the environment	$t^{-1}$	[3;64]	
С	Competition	$t^{-1}.n^{-1}$	0.01	
λ	The slope of the resource function at the inflection	date <sup>-1</sup>	0.1	
	point.			
j <sub>1/2</sub>	The date of the inflection of the sigmoid.	date	[60;120]	
P <sub>dep</sub> Richness depletion in summer		t <sup>-1</sup>	[0;0.9 <i>P</i> <sub>max</sub> ]	
$\lambda_{dep}$ The slope of inflection		date <sup>-1</sup>	0.5	
$j_{1/2dep}$ The date of inflection of the depletion.		date	[170,120]	
$\beta_{\mu}, \beta_{\sigma}$	Poisson expectation of mutations per individual every	n <sub>mut</sub> . <i>n</i> <sup>-1</sup>	[0;10]*10 <sup>-6</sup>	
	$dt_{mut}$ for $\mu$ and $\sigma$			
$dt_{mut}$	The time steps between mutations	t	0.1	
T <sub>ch</sub>	The duration of environmental change	t	[40:9000]	
$\omega_{\mu}, \omega_{\sigma}$	The variance of the mutation distribution for $\mu$ and $\sigma$	date, days	0.1,0.01	
r <sub>disp</sub>	Poisson expectation of dispersers per individual every	$n_{disp}$ . $n^{-1}$	[10 <sup>-7</sup> ;10 <sup>-4</sup> ]	
	$dt_{disp}$			
dt <sub>disp</sub>	The time step between dispersal events	t	0.01	

145 Table 2 : The parameters of the model, their meaning and their associated unit. The values

146 reported are those used in the simulations. The intervals correspond to the variation of this

147 parameter for the analyses.

# 148 **I.1 Population dynamics of a given phenology** $(\mu_i, \sigma_i)$

- 149
- 150 For a given phenotype ( $\mu_i, \sigma_i$ ), population density  $n_i$  follows a simple Lotka-Volterra system.
- 151 Assuming that *k* phenologies coexist in the environment:
- 152

$$\frac{dn_i}{dt} = n_i \left( R(\mu_i, \sigma_i) - \sum_{j=0}^k n_j C(\mu_i, \mu_j, \sigma_i, \sigma_j) - m \right)$$
(1)

153

154

Here, *R* embodies the *per capita* reproduction rate and *C* the competition kernel, explained
below. All parameters are detailed in table 1.

157

# 158 I.2 Phenological traits and associated trade-offs

159 Phenological traits ( $\mu_i, \sigma_i$ ) define a temporal occupancy function g, modeled using a gaussian

160 function centered on  $\mu_i$  (Equation 2, Figure 1a). Note that this function is normalized, so that

161 when activity is spread on a larger time window (higher  $\sigma$ ), it is also reduced (fig 1c):

$$g(x) = \frac{G}{\sigma 2\pi} e^{\frac{(x-\mu)^2}{2\sigma^2}}$$
<sup>(2)</sup>

$$R(\mu,\sigma) = \int_{x} \min(P(x), g(x)) dx$$
<sup>(3)</sup>

165	The match between the temporal occupancy function and the environmental window defines
166	the per capita reproduction rate R (equation 3, fig1a). As displayed on figure 1c, this creates a
167	trade-off acting on the spread $\sigma$ , linking generalism and environmental use. When
168	phenologies are spread on little time (small $\sigma$ ), the quality of the environment may not be
169	sufficient to support this intense activity (narrow gaussian function overshoots the
170	environmental window). However, plants may swamp their herbivores by producing
171	vulnerable organs in concentrated bursts (Augspurger 1981). For large $\sigma$ (spread phenology)
172	on the other hand, energy may be too limiting at extreme dates. Exploiting an environment to
173	reproduce can be resource-intensive (Primack and Stacy 1998).
174	Note that the environmental window (equation 4, fig 1a) summarizes biotic and abiotic
175	conditions (excluding competition) suitable for the development of the considered phenotype.
176	Such factors include temperature, rainfall, and resource availability. Taking the example of
177	plants, vegetative phenologies often depend on the photoperiod, humidity and temperature
178	(Chuine and Régnière 2017). Flowering phenology is constrained by the presence of
179	pollinators and resource accumulation (Rathcke and Lacey 1985) while fruiting phenology
180	may depend on the temporal availability of seed dispersers (Wheelwright 1985). We consider
181	several scenarios for the environmental window. First, the environmental niche is fixed and
182	made of two stuck sigmoids (first part of equation 4, fig 1A) and we let emerge the
183	community from the diversification of phenologies. Suitability is maximum in the middle of
184	the year at 180.

- 185 In equation 4,  $P_{max}$  represents the quality of the environment. Parameter  $j_{1/2}$  is inversely
- 186 related to the width of the environmental window. Parameter  $\lambda$  affects the steepness of the
- 187 environmental window early and late in the year.

$$P(x) = \frac{P_{max}}{1 + e^{\lambda(|x - 180| - j_{1/2})}}$$
(4)

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# 189 **I.3 Linking phenologies and competitive interactions**

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When phenologies co-occur within the environmental window, they are assumed to compete for available resources. Following classical frameworks (MacArthur and Levins 1964), we assume that competition is larger when phenologies are more similar, so that competition is proportional to the integral of the product of the two presence functions (equation 5).

$$C(\mu_{i},\mu_{j},\sigma_{i},\sigma_{j}) = G^{2}e^{\frac{-(\mu_{i}-\mu_{j})^{2}}{2(\sigma_{i}^{2}+\sigma_{j}^{2})}}$$
(5)

195

196 Note that individuals having exactly the same phenology compete at a maximum and constant 197 rate  $G^2$ .

198

## 199 II Ecological dynamics

200 Consider first that all individuals have the same phenology. Equation (1) then simply

201 corresponds to a logistic equation and the population reaches its carrying capacity (6).

202

$$n *= \frac{R-m}{G^2} \tag{6}$$

203

- 204 The population then exists whenever the intrinsic reproduction rate is higher than intrinsic
- 205 mortality rate *m*.

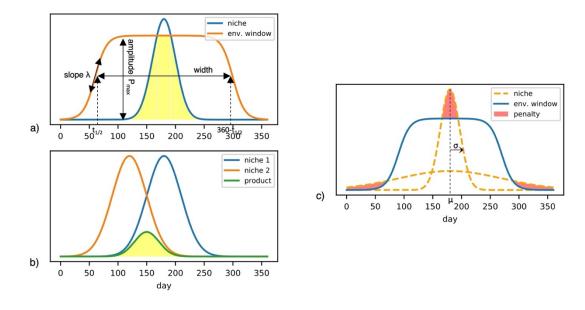


Figure 1 : Defining the population dynamics of phenologies : a) The temporal occupancy function (equation 2, blue) and environmental window (equation 4, orange) define the intrinsic reproduction rate (equation 3, yellow integral). b) Competition between two phenologies (yellow integral) increases with their similarity (equation 5). c) Note that because of our definition of the reproduction rate, phenologies that are too narrow or too wide (variations in  $\sigma$ ) pay a cost here represented by the red integral.

## 213 III Evolution, coevolution and diversification of phenologies in a fixed environment

214

Evolution of phenologies is studied using a numerical implementation of adaptive dynamics (Dieckmann and Law 1996). Mutations occur independently, either on the phenological spread  $\sigma$  or on the mean date  $\mu$ .

218 The equations of population dynamics (equation 1) are integrated, and at fixed time 219 intervals  $dt_{mut}$ , the number of mutants is drawn in a poisson distribution that depend on the 220 *per capita* mutation probability ( $\beta_{\mu}$  for  $\mu$ ,  $\beta_{\sigma}$  for  $\sigma$ ) and on the size of the populations 221 currently present in the community. While we typically consider rare mutations, we allow 222 variations in the frequency of mutation  $dt_{mut}$  to modulate the evolutionary potential of 223 evolving phenologies. Whenever a population mutates, a rare mutant population is introduced 224 (at density 1). Mutations are of small amplitude and the mutant trait is drawn in a normal 225 distribution centered on the parent trait. The variance of this normal distribution is the parameter  $\omega_{\mu}$  for  $\mu$  and  $\omega_{\sigma}$  for  $\sigma$ . When integrating equation (1) any population passing 226 227 below the extinction threshold (<1) is assumed extinct and dropped from the system.

While we are able to give a few mathematical results for simpler cases (see below), most scenarios are not mathematically trackable so that we mostly rely on simulations. A benefit of this simulation choice is that it allows us a large flexibility as we can make the environmental window take very diverse forms to investigate climate change, but also systematically vary the relative speed of ecology and evolution.

To uncover how the evolution of each trait  $(\mu, \sigma)$  depends on the value of the other trait, but also on other parameters of the system, we first fix the environment and study the evolution of each trait separately, the other being fixed.

#### 236 **<u>III.1 Evolution and diversification of μ</u>**

We start with a single resident population of phenology  $(\mu, \sigma)$  and consider the evolution of the mean date  $\mu$ . The relative fitness of a mutant  $\mu'$  that differs slightly from the resident population  $\mu$  is given by its invasion fitness (equation 7), ie, its growth rate when rare and the resident at equilibrium (Metz, Nisbet, and Geritz 1992): 241

243

$$s(\mu,\mu',\sigma,\sigma) = R(\mu',\sigma) - m - \frac{(R(\mu,\sigma) - m) * C(\mu,\mu',\sigma,\sigma)}{C(\mu,\mu,\sigma,\sigma)}$$
<sup>(7)</sup>

- 244
- 245
- 246

247 Because we assume no depletion, the first term of the equation will be maximum mid-year

248 (creating stabilizing selection). On the contrary, the last term will be larger when phenological

249 niches have less overlap, i.e. when  $\mu'$  differs from  $\mu$ . This will favor disruptive selection,

250 creating diversification when the environmental window is wide enough or when the spread  $\sigma$ 251 is small enough.

252 Since the maximum of the environmental window is mid-year (x=180), the penalty of a wide

253 or narrow phenological niches (fig 1c) will be minimal at this date. Evolutionary dynamics of

the trait can be visualized using pairwise invasibility plots (PIPs, (Geritz et al. 1998)). A PIP

- 255 (figure 2b) shows the sign of the invasive fitness (equation 7) of a mutant  $\mu'$  (y-axis) in a
- 256 resident population  $\mu$  (x-axis). Black areas show positive values where corresponding mutants
- 257 invade the resident population. The direction of evolution can then be deduced (blue

258 trajectories, red trajectories correspond to failed invasions). On figure 2b (left), note that for 259 narrow phenologies ( $\sigma = 30$ ), evolution eventually leads to a singularity at which both earlier 260 and later mean dates are able to invade (blue dots at the end of the trajectory). Such situations 261 correspond to branching points that allow diversification around  $\mu = 180$  (fig2a). Because the 262 environmental window is much larger than the phenology here, the fitness landscape is rather 263 flat (large black areas along the diagonal from 100 to 260). Conversely, for wide phenologies 264 (fig 2b, right), evolution leads to a unique singular strategy at  $\mu = 180$  that cannot be invaded 265 (read crosses). Such situations are called CSS (Continuously Stable Strategies, (Eshel 1983)) 266 and are indicative of stabilizing selection. Evolution stops there and no diversification occurs. 267

268 We now detail further situations in which diversification occurs. Figure 2c shows the quasi-269 equilibrium situations for different sets of simulations where spread is systematically 270 manipulated. Not that the wider phenology ( $\sigma = 50$ ) has only one date (yellow) and makes 271 the limit beyond which no diversification occurs. When the spread is more limited ( $\sigma = 30$ , 272 light green), the system eventually settles at two phenological dates (close to 150 and 210). 273 Smaller phenological spreads lead to increasingly more phenological niches with 274 heterogeneous densities. We quantified diversity using Shannon indices to account for 275 density asymmetries. The equilibrium diversity of phenologies increases when the (fixed) 276 phenological spread is smaller (figure 2d), which is consistent with niche packing 277 expectations (Macarthur and Levins 1967). 278 Note that diversity also depends on characteristics of the environmental window (fig2e). 279 While it varies rather little with the maximum richness of the environmental window  $P_{max}$ 280 (blue), it increases with the width of the environmental window (orange). Intuitively, given

281 the phenological spread  $\sigma$  is fixed, it is possible to pack more phenologies when a wider

282 environmental window exists.

### 283 III.2 $\sigma$ is evolving to accommodate the richness of the environment

$$s(\mu,\sigma,\sigma) = R(\mu,\sigma) - m - \frac{(R(\mu,\sigma)-m)*C(\mu,\mu,\sigma,\sigma)}{C(\mu,\mu,\sigma,\sigma)} = R(\mu,\sigma) - R(\mu,\sigma)$$
<sup>(8)</sup>

We now fix the phenology mean date  $\mu$  and study the evolution of phenological spread  $\sigma$ . As before, evolution can be understood by analyzing the invasion fitness of a rare mutant  $\sigma'$  in a resident population  $\sigma$ :

287 Remembering that mutants can invade when this quantity is positive, equation 8 means that 288 evolution will simply follow variations of the intrinsic reproduction rate. Penalties shown on 289 figure 1c then simply have to be minimized. To minimize the first penalty, for a given date, the optimal phenology should match the environmental quality, not overshoot the window. 290 291 Such a perfect match however happens for a given  $\sigma$  that may induce penalties early and late 292 in the year. This last penalty can often be neglected if the phenology is not too spread or too 293 close from the edge of the window. The optimal strategy under these conditions is stable and 294 can be explicitly computed:

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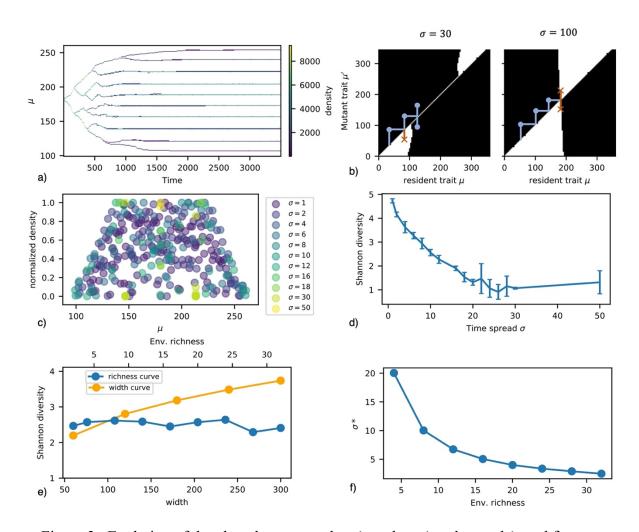
$$\sigma^*(\mu) = \frac{G}{2\pi P(\mu)} \tag{9}$$

296

Equation 9 shows that the selected spread is inversely proportional to the quality of the environment, given the (fixed) mean phenological date  $\mu$ . Phenologies are therefore more spread when the environment is poor (low  $P_{max}$ ). A direct consequence is that phenologies at

300 the edge of the environmental window are expected to be more spread out. Numerical

- 301 simulations confirm the mathematical analysis (figure 2f). We find that evolutionary
- 302 equilibrium  $\sigma$  \* decreases in richer environments, so that phenologies specialize in time.



304

Figure 2 : Evolution of the phenology mean date (panels a-e) and spread (panel f) depending on the environmental conditions and the other trait. a) Diversification of  $\mu$  in time  $(\sigma = 10)$  b) Pairwise invasibility plot (PIP) showing the evolutionary dynamics of the mean date for two (fixed) values of  $\sigma$  (black: mutant  $\mu'$  can invade resident  $\mu$ , white: mutant  $\mu'$ cannot invade resident  $\mu$ ). Example evolutionary trajectories are in blue while examples of failed invasions are in red. ( $P_{max} = 3$ ) c) Distribution of equilibrium phenology mean dates for several  $\sigma$  values. d) Shannon diversity at equilibrium according to  $\sigma$  with  $\mu$  evolving (the

error bars are the standard deviation for 10 replicates). e) Diversity of phenologies at equilibrium depending on the characteristics of the environmental window (amplitude and width) with  $\mu$  evolving. f) Stable evolutionary equilibrium for phenology spread ( $\sigma$ ) depending on the richness of the environmental window. ( $\beta_{\mu}$ ,  $\beta_{\sigma} = 10^{-5}$  for panels (acdef),  $j_{1/2}$ = 120 for panels (acdf))

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We stress that no diversification is possible at  $\sigma^*(CSS)$  so that in our model the diversification only happens for mean dates  $\mu$ . This diversification is however constrained by both the environment and the spread of phenology  $\sigma$  (fig2d, e). The spread therefore potentially allows an adaptation to the abundance of the resource when  $\mu$  has evolved. To confirm this, we now investigate the coevolution of the two traits.

323

## 324 III.4 Coevolution of phenological traits

325 We now allow mutations to occur on both traits ( $\sigma$  and  $\mu$ ). We investigate how the shape of 326 the environmental window affects the evolutionary equilibrium. An example simulation 327 showing the emergence of seven different phenologies is displayed on fig3a. In link with 328 previous analyses (equation 9), we observe that phenologies that evolve at central (high 329 quality) dates evolve narrow phenologies, while phenologies evolving at extreme date become 330 spread. This pattern of phenology distribution is robust to variations in the environmental 331 window. For instance, on fig 3b, for nine different maximum qualities of the environment, we 332 observe that the further the phenologies evolve from central dates, the greater their temporal 333 spread (figure 3b). In summary, phenologies adapt to the environment richness at the date of 334 their phenology which constrains the diversification indirectly through interspecific 335 competition and the availability of ressources on both sides.

336

337	Emerging diversity depends on the shape of the environmental window (figure 3d).
338	Particularly, higher quality of the environmental window leads to higher diversity levels. The
339	richer the environment, the more phenologies evolve to restricted temporal presence thereby
340	avoiding competition with surrounding phenologies. The width of the environmental window
341	here plays a minor role for diversity.

342

# 343 **Empirical analysis of flowering phenological spread**

344

345 We test whether the pattern of more spread phenologies at extreme dates (figure 3b) is 346 relevant for species constrained by the same environmental window. We investigate how the 347 flowering interval of 63 plant species in Sweden depends on their flowering time. For this 348 dataset, the seasonality of the conditions favorable to the development of flowers (light, 349 pollinators...) is very marked and reduced in time. 30 specimens per species were collected in 350 the herbarium of the Swedish Natural History Museum (Weinbach 2015). 351 The number of flowers per specimen was reported for each observation. We fit a Gaussian on 352 the counting of flowering observations through the year of each species. It is assumed that the 353 sampling effort was the same for all species over time. Each sampling corresponds to a count 354 of the number of flowers. Having count data, we use a generalized linear model with a 355 poisson-like error: 356

$$log(Y_{ij}) = a_i X_j^2 + b_i X_j + c_i + \varepsilon_{ij}, \varepsilon_{ij} \sim N(0, \sigma^2)$$
<sup>(10)</sup>

358 (10)  $X_i$  being the day of the year,  $Y_{ij}$  being the count of the flowering-species i on day j.  $a_i, b_j$ 

- 359 and  $C_i$  are estimated for each species.
- 360 The mean date of *i* correspond to:  $\frac{-b_i}{2a_i}$
- 361 The temporal spread:  $\frac{1}{\sqrt{-a_i}}$

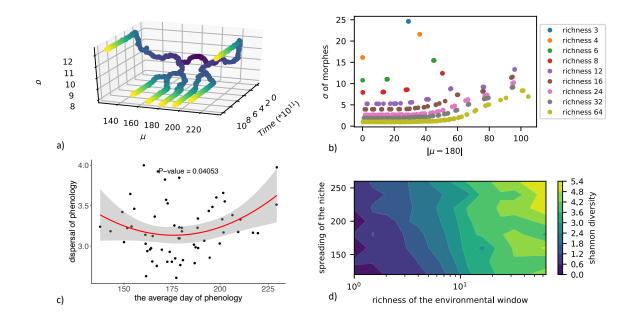
362 For the different species, we want to link the estimated spread to the estimated mean date.

363 Equation (11) shows the statistical model with  $X_i$  the mean date of species i and  $Y_i$  its spread.

$$log(Y_i) = dX_i^2 + eX_i + f + \varepsilon_i, \varepsilon_i \sim N(0, \sigma^2)$$
<sup>(11)</sup>

364

Consistent with our expectation, Figure 3c shows that plants flowering in the middle of the summer have shorter phenologies than those flowering at more extreme dates. Short spread flowering is more common in the summer when the competition might be stronger. An explanation could be the low presence of pollinators at the beginning of the season limiting the rate of visitation per flower or competition for other resources (nutrient, light) on a short suitable period.



373 Figure 3 : Coevolution in a stable environment and comparison with empirical data. a) 374 Coevolutionary dynamics of the spread and average date of phenologies. The color yellows in time. ( $P_{max} = 8$ ) b) Distribution of evolved phenological spread  $\sigma$  depending on evolved mean 375 376 date  $\mu$  at equilibrium. Nine simulations are shown, for different qualities of the 377 environmental window. In all cases, phenologies are more spread as the evolved dates 378 become less central. c) Relationship between phenological spread and mean date for the 379 flowering of 63 plant species in Sweden. d) Variations in Shannon diversity at coevolutionary equilibrium depending on the environmental window parameters. ( $\beta_{\mu}$ ,  $\beta_{\sigma} = 10^{-5}$  for panels 380 381 (abd),  $j_{1/2} = 120$  for panels (ab))

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#### 384 IV Eco-evolutionary dynamics under global changes

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386 As a second step, we no longer consider the environmental window as fixed, but allow it to 387 change to reflect possible consequences of global changes. Specifically, we allow the system

388 to evolve toward quasi-equilibrium in a fixed environmental window (blue in fig 4a). We then

389 modify environmental conditions and study the consequences of this modification for eco-390 evolutionary dynamics and for the maintenance of diversity. Modifications correspond to 391 changes in the onset and ending of the environmental window (parameter  $j_{1/2}$ ) (eg, milder 392 conditions in early spring and late autumn) and to a depletion of up to 90% within summer 393 (second part of equation 4) to reflect harsher conditions mid-summer (drought, extreme 394 temperatures, (Spinoni et al. 2018)) (fig 4a). This change consists in a linear evolution of the 395 parameters of the environmental window for the time period  $T_{ch}$ . We keep the integral under 396 the curve constant, so that total environmental quality per se does not change in these 397 simulations.

$$P(x) = \frac{P_{max}}{1 + e^{\lambda(|x - 180| - j_{1/2})}} - \frac{P_{dep}}{1 + e^{\lambda_{dep}(|x - 180| - j_{dep_{1/2}}))}}$$
(12)

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## 399 IV.1 Evolutionary rescue of phenologies

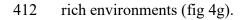
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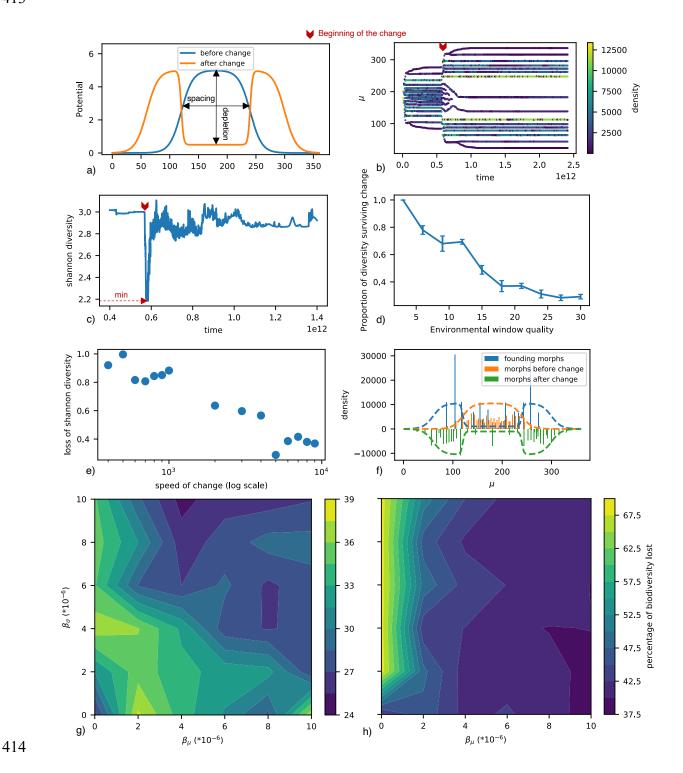
401 Based on evolutionary rescue (Gomulkiewicz and Holt 1995) we expect that a given 402 phenology may more easily persist when its evolutionary potential (here mutation rate and 403 amplitude) is larger, and when the disturbance is less intense. Evolutionary rescue theory is 404 however based on single species models and may not hold in complex communities where 405 indirect effects occur (Loeuille 2019). Surprisingly, we found that the tenets of evolutionary 406 rescue still apply to our communities of competing phenologies. Particularly, biodiversity is 407 saved when evolution is allowed to be faster and disturbances are slower. 408 We vary the environmental window for different time periods  $T_{ch}$  to simulate various speeds

409 of current changes (fig 4e). This speed of the environmental change is to be contrasted with

410 the adaptation capacity of phenologies, that is also systematically manipulated (fig 4gh).

411 Finally, we investigate whether consequences of global changes are similar in poor (fig 4h) vs





415 Figure 4 : Consequences of environmental for community eco-evolutionary dynamics a)
416 Modeling environmental changes through modifications of the environmental window b) an

417 example of coevolutionary dynamics of mean dates under environmental changes. Densities 418 of the phenologies are reported through variations in colors. c) Diversity dynamics in time. d) 419 Proportion of the phenologies that contribute to diversity post change depends on the quality 420 of the environmental window. e) Percentage of diversity loss as a function of the rate of 421 change. Loss is measured based on the difference between Shannon diversity at the onset of 422 environmental change and the minimum of Shannon diversity following it. ( $T_{ch} \in [40:9000]$ ) 423 f) The funding phenotypes: dashed lines represent the environmental windows. Bars are the 424 densities of each phenotype with their associated mean date. The orange bars are the ones 425 before the change, the green ones are the phenotypes after the change. In bleu are the funding 426 phenotypes, the density associated is the cumulated density of all its descendants. g,h) 427 biodiversity loss (in percentage) as a function of evolutionary capacity for  $\mu$  and  $\sigma$  in a rich (g) and in a poor environment (h). ( $P_{max} = 12$  for panels (bcdfg),  $P_{max} = 8$  for panel (h),  $\beta_{\mu}$ , 428  $\beta_{\sigma} = 10^{-5}$  for panels (bcdef),  $T_{ch} = 2000$  for panels (bcdfgh),  $j_{1/2} = 120$  for panels (ab),  $j_{1/2} = 120$ 429 120 for panels (abcdefgh),  $j_{1/2dep} = 60$  for panels (abcdefgh)) 430 431

Following the environmental change, we observe that phenologies evolve toward newly
suitable early and late dates, while most go extinct mid-year due to the depletion (Fig 4b). As
expected from previous results (eg, equation 9), mid-year phenologies have large spreads
(light blue, sup fig 1) as they evolve in a deteriorated environment (summer depletion).

436

In spite of this continuous adaptation of phenologies, modeled changes have large impacts on
the maintenance of diversity. Diversity decreases drastically during the environmental change,
then partially recovers (Fig4c). Diversity loss is quantified based on the difference between
the diversity level observed just before the change and the minimum diversity observed post-

441 change. We confirm the intuition that the faster the change, the greater diversity losses

442 (Fig4e).

443 Fast evolution of the two traits allows a better resistance of the community (fig 4g,h). In poor 444 environments (Fig4h), fast evolution of mean dates  $\mu$  is particularly important. Evolution of 445 spread  $\sigma$  alone is detrimental as phenologies adapt to the local environmental quality thereby widening and increasing competition with surrounding phenologies (low  $\beta_{\mu}$  on Fig 4g,h). 446 447 Mean date evolution allows phenologies to move to new suitable parts of the environmental 448 window. In rich environments, however, evolutionary potentials of both traits jointly favor the 449 maintenance of diversity (Fig 4g), emphasizing a stronger interaction between the two dimensions of phenologies. A possibility is that in such rich environments selection of larger 450 451 spread (hence increased competition) is less prevalent. 452 Phenologies existing pre-change contribute differently to biodiversity post-change. Founding 453 phenologies are mostly at the edge of the environmental window, pre-change (Fig 4f). Early 454 and late season phenology could better maintain themselves in the face of change and drive 455 future diversity. The proportion of initial lineages founding post-change diversity is smaller 456 for high quality environments that have high pre-change diversity (Fig 4d). Competition has a 457 greater effect on the loss of diversity in such systems, as they initially have many high density 458 phenologies mid-summer. Coevolved changes in the timing and spread of phenologies in 459 response to change then increase competition between phenologies and cause extinctions.

#### 461 IV.2 Phenology coevolution in heterogeneous space

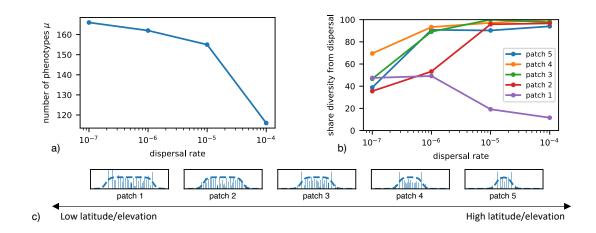


Figure 5 : Implications of dispersal for metacommunity eco-evolutionary dynamics a) Global diversity at the evolutionary equilibrium decreases with dispersal rate. b) Share of final (postchange) diversity attributable to dispersal versus local evolution for the 5 patches c) Gradient of environmental windows (thick dashed lines) and evolved phenologies (light blue) from low latitudes (left) to high latitudes (right).  $(j_{1/2} \in [60,80,100,120,140]$  for (ab) ,  $j_{1/2dep} \in$ [30,40,60,70] for (b))

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470 As a final step, we extend our eco-evolutionary model to account for spatial aspects 471 (metacommunity). This will allow us to discuss the relative contribution of spatial dynamics 472 (dispersal) vs local evolution in determining diversity maintenance. Our model has 5 patches 473 along a gradient of the environmental windows (latitudinal or elevation gradient, figure 5c). 474 Patches at the lower end of the gradient have a large environmental window (eg, temperature 475 allows activity for a large part of the year), while at the other extreme of the gradient, the 476 environmental windows are narrower. Local ecological and evolutionary dynamics are similar to previous sections. Phenologies have a certain probability  $P_m$  of dispersing to the adjacent 477 478 patch every fixed time step  $dt_m$ . Phenologies at the edge can only migrate inward. Once the

479 metacommunity has settled on an eco-evolutionary dynamics quasi-equilibrium, we alter the 480 environmental windows to mimic global changes as we did in the previous section. 481 Before the environmental change, total diversity decreases as the dispersal rate increases 482 (figure 5a). Such increases in dispersal homogenise the competitive context at the 483 metacommunity scale. Consistent with previous metacommunity works, phenotypes that are 484 better adapted to this global context are favored, while others go extinct, which explains the 485 drop in diversity (de Mazancourt, Johnson, and Barraclough 2008; Mouquet and Loreau 2003; 486 Thompson and Fronhofer 2019). 487 We now turn to global change simulations and study whether phenologies maintained after 488 change come from another patch (dispersal contribution) vs in situ evolution (adaptation 489 contribution). At higher dispersal rates, the share of phenotypes resulting from dispersal 490 increases in high latitude/elevation patches 2,3,4 or 5 but decreases in the low 491 latitude/elevation patch 1 (Figure 5b). Phenologies that could have evolved on patches 2,3,4 492 to fill the new environmental window have been outcompeted by phenotypes coming from 493 lower latitudes. On patch 1 (low latitude), no pre-adapted disperser exists so that the 494 maintenance of diversity largely rely on adaptation (Figure 5b). 495

# 496 VII Discussion

497 Our simple model suggests that eco-evolutionary dynamics of competing phenologies often 498 allow the emergence of diversification, leading to communities whose diversity is constrained 499 by the available environmental window. Diversity may be partly maintained given 500 environmental changes due to evolutionary rescue, though competitive exclusion may be 501 intensified in some instances. The spatial model reveals that this maintenance of diversity 502 through local evolution is dominant at low latitudes or elevations, but that dispersal 503 contribution is dominant in other conditions.

504

505 For a fixed environment, we find that phenologies adapt to local environmental quality 506 through changes in the phenological spread while limiting similarity leads to partitioning of 507 the environmental window through evolution of different mean dates. Coevolution of the two 508 traits thereby lead to a robust pattern where long phenologies are favored early and late in the 509 year, while central phenologies are short. The empirical pattern we observe in the Swedish 510 flora is consistent with this prediction. Among these flowering plants likely sharing roughly 511 similar environmental windows, we find short flowering blooms during summer and longer 512 flowering periods at the beginning and the end of the year. Such variations may be related to 513 the abundance of pollinators, nutrient or light allowing for shorter flowering periods when 514 environments are more suitable during summer (Kehrberger and Holzschuh 2019). Short mass 515 blooming then increases the frequency of visits by pollinators (Ashman and Shoen 1996). On 516 the contrary, at the beginning of the season phenologies are more spread out. Such a spread, 517 selected in the model by competition in poor resource conditions, could be further enhanced 518 in nature as bet hedging strategy given the risks of an uncertain pollination (Kehrberger and 519 Holzschuh 2019; Rathcke and Lacey 1985). We want to stress that the study of flowering 520 phenology in Sweden is here provided as an illustration, a way to test one of the key results of 521 the model. We do not claim that such patterns will inevitably be found in nature. Among 522 pollinators in Corsica (sup fig 2), phenological spread increases linearly with the average 523 phenology date (Menegus 2018). One possibility is that the shape of the environmental 524 window differs in these locations. For instance, vegetation environmental windows seem to 525 vastly differ across Europe (Stöckli and Vidale 2004). In this article, authors observed very 526 abundant vegetation at the beginning of the season. Insect pollinators can be expected to have 527 a reduced phenology early in the year when vegetation is flourishing. However, in our model, 528 the minimum limit of phenological spread only depends on the environmental richness,

529 whereas this limit certainly also depends on physiological constraints related to development. 530 The phenologies can then be artificially infinitely fine if the environment is infinitely rich. 531 Some models explicitly take into account organism development as a function of the 532 environment (Johansson and Bolmgren 2019). This sets a more realistic minimum limit for 533 the phenological spread, but would not necessarily change our predictions. 534 Next to the hypothesis of variation in the shape of the environmental window, we want to 535 stress that the pattern we propose here is a signature of the coevolution of competing 536 phenologies. We do not expect to observe it when phenologies are mainly constrained not by 537 interspecific interactions, but directly by abiotic conditions. For instance, if late phenologies 538 were to be mostly determined by abiotic factors, competition playing a lesser role (few active 539 individuals), while competition decrease progressively in the year, we would expect an 540 increased phenological spread only late in the year, which would be consistent with the 541 pattern here reported in Corsica. 542 Our model often allows diversification, following a partitioning of the environmental window 543 that leads to a limiting similarity of phenologies, thereby reducing competition (Macarthur 544 and Levins 1967). Such a temporal partitioning of activity of species competing for common 545 resources has been reported in various contexts. Mediterranean amphibians share the use of 546 ponds for breeding (Richter-Boix, Llorente, and Montori 2006). Our competition term would 547 then correspond to competition for spawning space. In flowering plants, many examples of 548 exclusion through competition for pollinators have been shown (Willmer 2011). For systems 549 in which hybrids have low fitness (Waser 1978), competition for pollinator exclusivity may 550 cause the partitioning of phenologies. Conversely, having very distinct phenologies could be 551 indicative of limiting competition. The diversification process we report here maintains

552 various levels of diversity. We find that diversity mainly increases with the width of the

553 environmental window when spread is fixed and only phenological dates evolve. In case of

554 coevolution, diversity is not tightly linked to the width of the environmental window, but 555 rather increases the total quality of the environment. The difference has be explained by the 556 fact that high quality environments select for narrower spread, so that if spread can evolve, 557 more phenologies can be packed within the environmental window. 558 While current changes threaten biodiversity, evolution may play a key role in saving certain 559 species (evolutionary rescue, (Gomulkiewicz and Holt 1995)). It is however unclear whether 560 such a positive role of evolution may remain in a community context (Johansson 2008; 561 Loeuille 2019; Osmond and de Mazancourt 2013). For instance, in a competition context, fast 562 evolution of a phenology may allow it to outcompete neighbor phenologies. Theoretically, for 563 a given phenology, evolutionary rescue may happen due to changes on either dimensions: 564 changing dates to follow suitable conditions, or changing spread to cover more conditions. 565 Interestingly, we find that adaptive evolution tracks the new shape of the environmental 566 window mainly through the evolution of the mean date, particularly in poor environments. 567 Shifts in reproductive phenologies of plants in California towards earlier and later dates in the 568 year are similar to patterns observed in our model (Parmesan 2006; Sherry et al. 2007). 569 Phenological shifts of dates have been linked to adaptive evolution for plants (Franks, Sim, 570 and Weis 2007), for amphibians (Phillimore et al. 2010) and for pollinators (Duchenne et al. 571 2020). If this evolution is fast enough to match the speed of change, we observe an 572 evolutionary rescue of part of our community. Evolution of phenological spread can in some 573 instances lead to increased competition and diversity losses. This result is consistent with 574 earlier results emphasizing that competition can alter evolutionary rescue. (Johansson 2008). 575 Note however that competition possibly facilitates evolutionary rescue when it sufficiently 576 increases selection in the direction of environmental changes (Osmond and de Mazancourt 577 2013).

579 Increasing competition through the evolution of the date or spread may decrease diversity. 580 Increases of overlap of phenologies can come from antagonistic forces selecting them. 581 Asymmetries in the evolutionary potential of the different species of the community may 582 increase phenology overleap as well, potentially leading to competitive exclusion 583 (THACKERAY et al. 2010; Visser, te Marvelde, and Lof 2012). Evolutionary potentials may 584 be related to variations in population size, generation time or mutation rates (Frankham 1996). 585 Changes in phenology overlap has been reported in Texas amphibian communities possibly 586 leading to increased competition (Carter, Saenz, and Rudolf 2018). In a changing 587 environment, when species adapt while competing, some often end up outcompeting the 588 other, partly by preventing its evolution as competition lowers population sizes and 589 corresponding evolutionary potentials (Johansson 2008; Norberg et al. 2012). While these 590 phenomena are well known in a spatial context (Norberg et al. 2012; Thompson and 591 Fronhofer 2019), we propose that they also likely happen for phenological shifts.

592

593 Whether rescue of biodiversity through niche tracking may happen through dispersal or 594 adaptation depends on geographical position as well as the ability to disperse. Our model 595 suggests that at high connectivity, dispersal plays a dominant role for niche tracking 596 compared to evolutionary contribution. Increasing dispersal allows a fast redistribution of pre-597 adapted phenologies more quickly, consistent with observations of a more general model 598 (Thompson and Fronhofer 2019). On the other hand, if no pre-adapted phenotype exists, 599 dispersal has a negative contribution. In our simulations, this happens for the low 600 altitude/elevation patch, where the role of evolution is dominant. The dominant role of 601 evolution at low latitudes is consistent with another (non phenology) model (Norberg et al. 602 2012). Consistent with this view, empirical analyses of the role of evolution in extremely hot 603 environments have been undertaken. For instance, (Sinervo et al. 2010) particularly studied

604 Mexican lizard communities and proposed that by 2050 many areas could lose all their lizard 605 diversity and favor only extremophiles (Sinervo et al. 2010). This work also suggests that the 606 evolutionary potential of these populations may be too limited to allow evolutionary rescue. 607 Because in other latitudes a dominant role of dispersal is found, this raises the question of 608 connectivity. Habitat fragmentation could affect the ability of species to disperse, creating 609 genetic isolation and decreasing colonization potentials (Clark, Lewis, and Horvath 2001; 610 Jump and Penuelas 2005). Some places like islands or the high mountain floors cannot rely on 611 dispersal and can only count on adaptive evolution (Krajick 2004; Thuiller et al. 2005). The 612 ability of species to disperse is therefore likely to vary with habitat. 613 The model we propose here is very simple and therefore has many limitations. Particularly, 614 the diversification process is linked to species competition, so that it is necessary that 615 competition plays an important structuring role for the model to apply. While competition is 616 key here, many other mechanisms could of course allow the emergence and maintenance of 617 diversity, from the specialization on a precise set of conditions that would limit the temporal 618 presence of a species, to the evolution of bet-hedging strategies in a (within year) varying 619 environment. Our model is however an invitation to consider the possible role of interspecific 620 interactions (here competition) to better understand the effect of current changes on the eco-621 evolutionary dynamics of natural communities.

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## 806

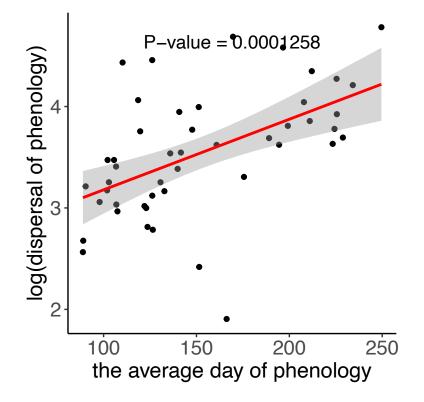
25 300 20 200 ь 15 10 100 5 0.0 0.5 1.0 1.5 2.0 2.5 1e12 time Beginning of the change

807

808

809 Supplementary figure 1 : An example of coevolutionary dynamics of spread under

810 environmental changes. Variation of colors shows the associated mean date.



811

812 Supplementary figure 2 : Distribution of the mean date of phenology and their spread along

the year for pollinators of Corsica (Menegus 2018). The best fit is a linear regression model.

814 The methods used are the same that the one of figure 3c.

815

# 816 **Computation of the singularity for** $\sigma$

- 817 It is assumed that losses are minimal when the maximum of the Gaussian fits the
- 818 environmental window.
- 819 Let's take equation of the exploitation of the environment over time (2) :

820 
$$g(x) = \frac{G}{\sigma 2\pi} e^{\frac{(x-\mu)^2}{2\sigma^2}}$$

821 The maximum of this function if for  $x = \mu : g(\mu) = \frac{G}{\sigma_2 \pi}$ 

822 At this date the richness of the environment is  $P(\mu)$ , under the assumption of relatively low

spread and not too close from the edge of the window:

824 
$$g(\mu) = P(\mu)$$

825 
$$\Leftrightarrow \frac{G}{2\pi\sigma} = P(\mu)$$

826 
$$\Leftrightarrow \sigma = \frac{G}{2\pi P(\mu)}$$

827