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2	Snatial heterogeneity in temporal dynamics of Alnine hird communities
5	spatial neterogeneity in temporal dynamics of Aprile on d communities
4	along an elevational gradient
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34 Abstract Aim: Mountains are biodiversity hotspots and are among the most sensitive ecosystems to 35 ongoing global change being thus of conservation concern. Under this scenario, assessing how 36 biological communities vary over time along elevational gradients and the relative effects of niche-37 based deterministic processes and stochastic events in structuring assemblages is essential. Here, we 38 examined how the temporal trends of bird communities vary with elevation over a 20 year-period 39 (1999-2018). We also tested for differences in temporal dynamics among habitat types (among-40 community variability) and functional groups (within-community variability). Taxon: 97 species of 41 common breeding birds. Location: Swiss Alps. Methods: We used abundance data 42 from the Swiss breeding bird survey to compute different temporal dynamics metrics (temporal 43 turnover, synchrony, rate of community change, and community-level of covariance among species). 44 We also examined the relative contribution of deterministic and stochastic processes in community 45 assembly using the Raup-Crick method and the normalized stochasticity ratio. Results: We found that, 46 with greater elevation, temporal species turnover increased while the rate of overall community 47 change over successive years decreased, suggesting that high-elevation communities display more 48 erratic dynamics with no clear trend. Despite this, we found a more deterministic assembly of alpine 49 communities in comparison to those located at lower elevations. Deterministic processes had greater 50 influence than stochastic processes on community assembly along the entire elevational gradient 51 (80% of communities). Forest communities exhibited higher synchrony in comparison to the 52 remaining habitats likely because they consisted of species with greater functional redundancy, 53 whereas alpine communities were the least stable as a result of their low taxonomic richness 54 ('portfolio' effect). Main conclusions: Community-level synchrony was overall positive supporting 55 the idea that compensatory mechanisms are rare in natural biological communities. Our results 56 suggest that rather than competition, the existence of differences in the ecological strategies of species 57 may have a stabilizing effect on bird communities by weakening the concordance of species responses 58 to fluctuations in environmental conditions (i.e., enhanced interspecific temporal asynchrony). This 59 study provides evidence that, although species turnover in metacommunities is frequent, a high 60 temporal turnover does not necessarily imply the overriding importance of stochastic processes.

## 62 Introduction

63 The richness and composition of biological communities, termed community structure, changes 64 through time as a result of population fluctuations as well as local colonizations and extinctions of 65 species (species turnover; Legendre & Gauthier, 2014). Both abiotic and biotic factors are responsible for generating instabilities that lead to either directional (predictable) or non-directional changes in 66 67 species assemblages. Directional changes imply a general pattern in response to a meaningful 68 disturbance or a perturbation that extends over time (e.g., progressive habitat change linked to land 69 use change or long-term climate trends) (Dornelas et al., 2014; Hoover et al., 2014). These are driven 70 by deterministic processes that involve non-random, niche-based mechanisms including 71 environmental filtering and interspecific interactions (Vellend, 2016). In contrast, erratic fluctuations 72 may arise as a consequence of stochastic processes (e.g., ecological drift or unpredictable weather 73 events like hurricanes) without a particular direction (Renner et al., 2014). Under certain 74 circumstances, community structure remains stable over long time periods ('loose equilibrium') 75 despite the existence of annual fluctuations in composition and abundance (Collins, 2000). The 76 capacity of communities to rebound from perturbations and persist over time is known as community 77 stability. This property informs us about the potential resilience of species to disturbances such as 78 biological invasions (Elton, 1958; Loreau et al., 2002; Tilman et al., 2006). Consequently, assessing 79 how communities vary over time and the relative effects of deterministic and stochastic processes in 80 structuring assemblages is highly relevant from a conservation perspective, particularly in the face of 81 climate change which is characterized by increasingly extreme weather events (Buckley et al., 2018). 82 Community stability is largely dependent on the degree of synchrony in population 83 fluctuations of its constituent species. The lower the degree of similarity in year-to-year fluctuations 84 among species, the greater the stability of the community ('insurance effect': Yachi & Loreau, 1999). 85 Community synchrony can be affected by external factors, such as disturbances (e.g., habitat 86 degradation as result of land use changes), which can lead to long-term directional trends in species 87 composition, and by internal properties of the community like the strength of interspecific

88 competition. Regarding this, competition among species is generally expected to increase asynchrony, 89 leading to compensatory dynamics where fluctuations in the density of one species are offset by the 90 opposite fluctuations of (an)other species (González & Loreau, 2009). Therefore, communities with 91 high functional diversity (i.e., those composed of species with different ecological strategies) should 92 be more likely to exhibit a higher level of asynchrony, and thus higher stability than functionally poor 93 assemblages ('portfolio effect': Doak et al. 1998). In addition to community synchrony, several other 94 metrics have been devised in order to quantify how communities change in in response to 95 environmental drivers; that is, if they remain invariant, if they gradually track these changes or, 96 instead, they shift abruptly exhibiting early warning signals of ecological collapse (Gaüzère et al., 97 2015; Blüthgen et al., 2016; Spanbauer et al., 2016). For instance, Collins et al. (2008) employed the 98 rate of compositional change to compare the temporal dynamics of plant species in burned versus 99 unburned areas at the Konza Prairie Long-Term Ecological Research (LTER) site.

100 Environmental gradients have been frequently employed to examine the influence of varying 101 environmental conditions on community assembly (e.g., Cornwell & Ackerly, 2009). The relative 102 influence of biotic and abiotic factors on community composition varies along such gradients of 103 environmental stress or resource availability. For instance, the relevance of competitive interactions 104 tends to decline with environmental harshness (Travis et al., 2006), whereas the role of abiotic factors 105 (e.g., elevation or mean temperature) as drivers of biodiversity is generally more important in severe 106 environments (Kraft et al., 2015; Jarzyna et al., 2019). However, the relationship between temporal 107 patterns in community dynamics and environmental drivers has received minimal attention (e.g., 108 Blüethgen et al., 2016). Although temporal patterns are often assumed to be relatively homogeneous 109 across a landscape, spatial variation in ecological conditions may create heterogeneity in the temporal 110 dynamics of communities (Devictor et al., 2008; Spotswood et al., 2015; Dencker et al., 2017; 111 Beukhof et al., 2019). For instance, habitats with lower carrying capacity like alpine grasslands and 112 other low-productivity ecosystems may exhibit higher turnover in community composition compared 113 to environments supporting large populations, mainly due to increased demographic or environmental 114 stochasticity (Jarzyna & Jetz, 2017). Likewise, not all components of a given community necessarily 115 respond in a similar way, and consequently, certain taxonomic groups or ecological guilds may be

116 more likely to exhibit signatures of directional change than others (Kampichler et al., 2012).

117 Regarding the latter case, in another study carried out at the Konza LTER site, Jones et al. (2017)

118 reported that grasshopper and small mammal communities were stable, whereas bird communities

119 underwent directional change driven to some extent by stochastic processes. It is likely that this has to

- 120 do with the fact that the food resources on which birds depend -insects- are more unpredictable from
- 121 one year to the next.

122 Here, we study spatial heterogeneity in the temporal dynamics of bird communities in the 123 Swiss Alps. The main goal was to examine how temporal trends in community structures vary along 124 an elevational gradient. Elevation is typically the main agent driving species assembly in montane 125 communities, and, consequently, a plethora of studies have addressed how the compositional, 126 functional, and phylogenetic structure of ecological communities varies with elevation (e.g., Graham 127 et al. 2009; Machac et al., 2011; Dehling et al., 2014; see also García-Navas et al., 2020). 128 Nevertheless, few studies have looked at the relationship between elevation and the trajectories that 129 communities exhibit over time, which, in turn, may affect the stability and temporal variability of 130 communities (Jarzyna et al. 2015, 2016; Gaüzère et al., 2017). We also tested if the influence on 131 elevation of these metrics differed among different habitat types (forests; farmlands; mixed and alpine 132 habitats) nested within the elevational gradient (among-community variability) and tested for 133 differences in temporal dynamics among functional groups (within-community variability). 134 Specifically, we tested the following predictions, which are summarized in Fig.1a: [*i*] since high-135 elevation communities are typically composed of (a) mountain specialists whose populations tend to 136 be relatively stable and (b) generalists expanding their distribution range upwards and undergoing 137 marked population fluctuations (Zamora et al., 2017), we predict a higher temporal turnover in alpine 138 environments; [ii] since environmental adversity at high-elevation sites results in limited functional 139 trait diversity and functional convergence (functional clustering; García-Navas et al., 2020), we 140 predict the existence of higher temporal synchrony in alpine communities in comparison to 141 communities at lower elevations; *[iii]* since forests are more predictable environments and thus, more 142 likely to remain unaltered over time in comparison with farmlands and alpine habitat as a result of 143 management (e.g., Burel et al., 2013) and more variable conditions (e.g., landslides and snowslides),

we predict a higher stability in forest bird communities compared to those from farmlands and alpine habitats; and [*iv*] since it has been hypothesized that deterministic processes inherent in niche-based theories of community assembly predominate in lower-productivity systems and stochastic processes are more prevalent in high productivity systems due to differential colonization history (Chase, 2010), we predict that the relative contribution of deterministic *vs*. stochastic processes increases with elevation.

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151

## 152 Material and Methods

#### 153 Data collection

154 We compiled data from the 'Monitoring Häufige Brutvögel' (MHB) scheme, a volunteer-based 155 programme aimed at annual monitoring of population dynamics of common breeding species in 156 Switzerland, a small country (41,285 km<sup>2</sup>) in Western Europe. This programme started in 1999 and 157 follows a standardized territory mapping protocol in which 267 1×1 km plots from a regular grid 158 covering the entire country are surveyed 2-3 times by skilled birdwatchers during the breeding season (15<sup>th</sup> april-15<sup>th</sup> June). Observers record every bird seen or heard along a square specific transect route 159 160 (~5-km long) that does not change over the years (for more details see Schmid et al., 2004; Kéry & 161 Royle, 2009). In this study, we restricted our analysis to the region of the Alps (60% of Switzerland; 162  $\sim$ 25,000 km<sup>2</sup>), and selected those plots that have been uninterruptedly surveyed from 1999 to 2018. 163 Observations of the two or three visits were grouped into territories using "TerriMap" (Schmid, 164 2017). Thus, our dataset consisted of relative abundance data (number of territories per site) collected 165 during two decades in 131 plots along a ~2,300 m elevational gradient (range: 380-2,710 m). Study 166 plots were classified into four different habitat categories (forest; farmland; mixed; alpine) according 167 to the predominant land use (see Table 1 and Fig. 1b). Land use information (geostat data at  $1 \times 1$  km<sup>2</sup> 168 resolution) was obtained from an aerial survey carried out by the Swiss Federal Office for Statistics 169 (Arealstatistik; www.bfs.admin.ch). Waterbirds, nocturnal birds and raptor species with large home 170 ranges were excluded from the dataset as they are not properly surveyed by the programme. In total,

97 common breeding species (accounting for about 99% of the abundance data) were included in theanalyses.

173

174 *Quantifying temporal dynamics* 

175 In order to test our first prediction (prediction [*i*] in Fig. 1a), we computed an estimate of temporal

176 turnover defined as the proportion of species that differ between consecutive years ([number of

177 species gained + number of species lost]/total number of species observed in both years) (i.e.,

178 richness-based species exchange ratio *sensu* Hillebrand et al., 2018; see also Cleland et al., 2013). We

179 also calculated the number of species that appeared ('gains') and disappeared ('losses') in  $t_1$  relative to

180 total species richness across both time points,  $t_{-1}$  and  $t_{1}$ .

181 We then distinguished between directional and non-directional change by estimating the rate of 182 community change over the study period for each plot. This metric quantifies the rate and direction of 183 change in a given community (time-lag analysis; Collins et al., 2000; Hallett et al. 2016). It is 184 calculated by regressing Euclidean distances arising from pair-wise communities on the time-lag 185 interval (i.e., plots are compared to themselves across years in terms of species composition). A 186 positive-sloped relationship indicates that a given community is increasingly dissimilar over time (i.e., 187 it veers away from its original state directionally driven by internal or external factors or due to 188 autocorrelated stochastic variability). Also, it means that there is a high proportion of species with 189 stochastic dynamics or directional change. A slope close to zero indicates that abundances of the 190 constituent species oscillate around a constant mean over time or that local populations show high 191 lability and they randomly disperse or disappear according to a white noise process, which means that 192 the abundance of a species at a given time  $(t_1)$  is partly or completely independent of the previous 193 state  $(t_0)$  (i.e., high stochasticity; Kampichler & van der Jeugd, 2013). Significant negative slopes 194 indicate convergent behavior; for instance, the return of the community to an earlier state in the time 195 series (Kampichler et al., 2014). In this way, we tested whether in a given community species are 196 continually reshuffled at random or there is a progressive succession of species so that the resulting 197 species composition differs greatly from the original one.

Complementarily, we split our abundance data into different subsets according to the foraging niche (aerial; arboreal; ground; and generalist) and diet (insectivorous; granivorous, frugivorous and/or herbivorous; carnivorous and/or scavenger; and omnivorous) of species. Foraging niche and diet (feeding group) categories were assigned following Storchová & Hořák, (2018). In this way, we assessed if different components of the community are responding in similar or different ways over time.

204

## 205 Estimating extinction rates

206 We estimated extinction rates for each plot (i.e., for the entire community) and for the two main 207 guilds (arboreal- and ground-foragers) and feeding groups (insectivorous and granivorous-208 frugivorous-herbivorous) separately, by using the R package island (Ontiveros et al., 2019). This 209 package follows the stochastic implementation of Simberloff's model (1969) inspired by the theory of 210 island biogeography (MacArthur & Wilson, 1967) and developed by Alonso et al. (2015) to estimate 211 colonization and extinction rates for communities that have been repeatedly sampled through time by 212 means of a likelihood approach. We do not report colonization rates as preliminary analyses showed 213 that the probability of colonization heavily depends on the number of species not detected across two 214 time periods and thus, on the species pool, which vary among plots. That is, colonization rates are not 215 comparable among communities as they are computed in relation to the number of missing species in 216 each plot. Meanwhile, extinction rates are computed with respect to the number of species 217 occurrences and are independent from the overall species pool. Consequently, we could not calculate 218 a relationship between colonization rates and 'gains' (i.e., number of species that appeared in  $t_1$ 219 relative to  $t_0 + t_1$ ), whereas we found a strong relationship between extinction rates and 'losses' (i.e., 220 number of disappearances) ( $\rho = 0.98$ , p < 0.001).

221

## 222 Quantifying community stability

In connection with the second prediction (prediction [*ii*]) we quantified the degree of synchrony in species abundances within each plot over time. Despite the existence of strong fluctuations in species' population sizes, communities may remain stable if increases of certain species are accompanied by

226 compensating declines in other species. That being so, it should translate into a great level of 227 asynchrony among species over time and the existence of negative covariance among population 228 abundances in a given community (Yachi & Loreau, 1999). We first quantified the level of synchrony 229 in species abundances within a community over time using the approach proposed by Loreau & 230 Mazancourt (2008). This measure of synchrony ( $\varphi$ ), which oscillates between 0 (total asynchrony) 231 and 1 (total synchrony), compares the variance of aggregated species abundances with the summed 232 variances of individual species:

233 
$$\varphi = \frac{\sigma(\chi_T)^2}{(\Sigma_i \sigma_{\chi_i})^2}$$

where:

235 
$$\chi_T(t) = \sum_{i=1}^N \chi_i(t)$$

Thereby, we assessed how changes in taxon abundances within a community track one another over time. Complementarily, we used two additional measures of species synchrony;  $\eta$  (Gross et al., 2014) and its modified version,  $\eta_w$  (Blütghen et al., 2016), in which species are weighted by their relative total abundances over all years. Both,  $\eta$  and  $\eta_w$  were compared with the null model of independence of species fluctuations ( $\eta$  or  $\eta_w = 0$ ) and oscillate between -1 and 1, with negative values indicating compensatory dynamics and positive values (partial) synchrony.

242 Next, we calculated a community-level measure of species covariance, the log-transformed 243 Schluter' variance ratio, in order to test for negative covariance among species (i.e., compensatory 244 dynamics) (Schluter, 1984; Lepš et al., 2018). The variance ratio (VR) compares the variance of the 245 community as a whole relative to the sum of individual population variances (Peterson, 1975; 246 Houlahan et al., 2007). Negative values of log VR indicate that species tend to co-vary negatively, 247 suggesting the existence of 'compensatory dynamics' (i.e., increases/decreases in some species are 248 partly compensated for by decreases/increases in others). Positive values of VR indicate that species 249 generally positively co-vary, suggesting the existence of 'synchronous dynamics' (i.e., community 250 variability is greater than expected under the assumption of species independence) (Lepš et al., 2018). Complementarily, to test whether variance ratios significantly differed from what is expected at random, we used a temporal modification of the torus translation (Harms et al., 2001) in which we randomly selected a different starting year for each species' time series following Hallet et al. (2014). This randomization procedure generates a null community matrix in which species abundances vary independently whereas within-species autocorrelation is kept constant. The null distribution was obtained after 10,000 cyclic shift permutations.

257 Further, we disentangled the effect of directional trends and similarity in year-to-year 258 fluctuations on synchrony indices following two methods recently developed by Lepš and 259 collaborators (2019). The rationale behind this analysis is that long-term directional trends in species 260 composition due to land-use or climate change can lead to an apparent increase in synchrony that is 261 not due to concordant fluctuations in species abundances. To filter out the pervasive effects of 262 directional trends, Lepš et al. have proposed two solutions. The first approach is applicable to the 263 above-mentioned synchrony indices and consists of applying the three-term local variance (T3). That 264 is, variance is not computed as the average of squared deviations from the overall mean, but from the 265 squared difference of the middle year  $(t_0)$  and average of the year before  $(t_1)$  and after  $(t_1)$  within a 266 movable 3-yr window (Lepš et al., 2019). The second approach is based on computing synchrony 267 over the residuals of fitted species trends over time. Thereby, it is possible to decompose synchrony 268 into the part that can be ascribed to the directional trend and the part that is due to residual variation 269 (i.e., detrended component) (i.e.,  $S_{\text{total}} = S_{\text{trend}} + S_{\text{detrended}}$ ). Thus, for each plot we estimated the T3 270 version of each synchrony index ( $\varphi$ ,  $\eta$  and  $\eta_w$ ) and decomposed total synchrony into two components: 271 the one caused by the trend and the one arising from year-to-year fluctuations.

Lastly, in order to test the third prediction (prediction [*iii*]), we used the stability of summed species abundances defined as the temporal mean divided by the temporal standard deviation (i.e., the inverse of community variability,  $CV = \sigma/\mu$ ) as an estimate of community stability (Tilman, 1999). We calculated an overall estimate of community stability and community asynchrony for each plot. In addition, we calculated eight complementary estimates after classifying species by ecological guild and feeding group in a similar way to that described above.

279 Deterministic vs. stochastic processes

In order to disentangle the relative contribution of deterministic (i.e., niche-based mechanisms including environmental filtering) and random (e.g., ecological drift) processes in community assembly and examine whether our fourth expectation (prediction [*iv*]) was fulfilled, we applied two methods: a null model-based approach, the Raup-Crick metric, developed by Chase et al. (2011) over Raup & Crick (1979)'s original idea, and a mathematical framework with an associated normalized index, the normalized stochasticity ratio (NST), recently devised by Ning et al. (2019) with microbial

286 data.

287 Raup-Crick ( $\beta_{RC}$ ) is robust to variations in local species richness and expresses the 288 compositional dissimilarity between the observed communities relative to those generated under a 289 null model. Thus, this method evaluates the role of deterministic *vs.* stochastic processes while 290 controlling for differences in  $\alpha$ -diversity among localities.  $\beta_{RC}$  values indicate whether two given 291 communities are more dissimilar (approaching 1), as similar (approaching 0) or less dissimilar 292 (approaching -1) than expected by random processes. The null expectation was generated using 1,000 293 iterations.

The NST method measures the relative position of observed values between the extremes under pure deterministic and pure stochastic assembly. NST ranges from 0 to 100%, with 50% being the boundary point between more deterministic (<50%) and more stochastic (>50%) assembly. See Ning et al. (2019) for an explanation of the equation employed to compute the NST ratio and additional mathematical details.

299

## 300 *Community composition*

As final step, in order to visually assess differences in community composition among habitat types, we used the 'betadisper' function, which implements Anderson (2006)'s procedure for the analysis of multivariate homogeneity of group dispersions (variances). This procedure plots dissimilarity between sampling groups using principal coordinates analysis and reduces the original multidimensional space to a 2-D space. We then determined if communities differed statistically among habitat types using permutational multivariate analysis of variance (PERMANOVA) based on Bray-Curtis dissimilarities 307 (Anderson, 2001). We used the function 'envfit' to test the significance of the relationship between
308 elevation and community structure. This function tests the significance of environmental factors using
309 squared correlation coefficients as a goodness-of-fit following 999 permutations and providing
310 empirical *p*-values. We then used 'ordisurf' to illustrate relationships in bird communities to changes
311 in elevation. This function fits a smooth surface for continuous variables onto the ordination plot with
312 cross-validatory selection of smoothness.

313

314 Statistical analyses

We used generalized linear models to test the effect of elevation on the different metrics of temporal dynamics (namely; temporal turnover, number of appearances ('gains') and disappearances ('losses'), rate of change, synchrony and community stability estimates, and relative contribution of stochasticity). As the relationship between elevation and the response variable does not necessarily have to be linear, we also built polynomial models (including a quadratic or cubic term). We further tested for habitat differences in the above-mentioned metrics using one-way ANOVA. Complementarily, we analyzed both factors, elevation and habitat, jointly. Despite the relationship

322 between our response variable and elevation being non-linear in several cases (see *Results*) and

323 habitats were not evenly distributed along the elevation gradient, when both factors were analyzed

324 together we did not find a significant elevation×habitat interaction in most cases (see Table S1). This

325 means that the slope of the relationship between the response variable and elevation does not change

326 direction based on the habitat type. Consequently, we examined the main effects using Type-II sums

327 of squares (only in those cases in which the elevation×habitat interaction was significant, we applied

328 Type-III ANOVA). For the sake of brevity, these results are only shown in Supplementary Material.

329 Lastly, we also examined whether these metrics differed between guilds within the same plot by

330 means of paired *t*-tests.

All analyses were carried out in the R environment (R v. 3.5.2.; www.r-project.org) using the
libraries *car* (Fox & Weisberg, 2019), *vegan* (Oksanen et al., 2013), *codyn* (Hallett et al., 2016), *island* (Ontiveros et al., 2019) and *nst* (Ning, 2019).

#### 336 **Results**

337

338	Temporal	dynamics
	,	~

Turnover rates between adjacent years averaged 26.3% (± 6.0%, range from 6.2 to 43.6%). The turnover rate tended to increase with elevation up to 2,000 m, although a few localities in the lowlands (most of them located in the Northern Alps) exhibited above average values leading to a sigmoidal pattern (Fig. 2a). There were statistically significant differences among habitat types in terms of gains, losses, and turnover rate (Table 2). Both the proportion of species that disappeared and the proportion that appeared were higher in alpine localities compared to the remaining habitat types, highlighting the dynamic nature of these high-elevation environments (Table 2).

346 The rate of community change decreased with elevation (Fig. 2b). Communities located in 347 mixed habitats displayed the fastest change (i.e., steepest slopes), which suggests that these bird 348 assemblages were increasingly dissimilar over time (Table 2). Meanwhile, alpine environments 349 showed the shallowest time-lag analysis (TLA) slopes, suggesting low directionality in compositional 350 changes of species assemblages inhabiting these environments, in which species appeared and 351 disappeared in a more erratic way. When assessing species exploiting different resources, we found 352 that the arboreal and insectivorous guilds showed steeper TLA slopes (b = 0.41 and 0.53, 353 respectively) in comparison to the ground-foraging and plant-and-seed-eating guilds, respectively (b = 354 0.34 and 0.16).

355

## 356 Extinction

The mean value of extinction for all species was 0.19 ( $\pm$  0.05), which indicates that on an average survey plot, approximately 19% of species of the original assemblage had become extinct. Estimated extinction rates differed among habitat types (farmland: 0.18  $\pm$  0.05, mixed: 0.17  $\pm$  0.02, forest: 0.18  $\pm$  0.05, alpine: 0.22  $\pm$  0.07;  $F_{3,126}$  = 9.50, p <0.001) and increased from 1,500 up to 2,000 m, from which a sharp decrease was found (see Fig. S1). Extinction rates estimated separately for arboreal species increased positively with elevation, whereas extinction rates of ground-foragers tended to adopt a quadratic pattern (Fig. S2). On the contrary, extinction rates for insectivorous and plant-andseed-eating guilds did not correlate with elevation (both *p*-values >0.05). Estimated extinction rates were higher for the herbivorous group (plant, fruit, and seed eaters) in comparison with those obtained for the insectivorous guild ( $0.34 \pm 0.16 vs. 0.18 \pm 0.06$ ; paired *t*-test: t = -10.59, p < 0.001). There were no significant differences in probability of extinction between arboreal and ground-foraging guilds ( $0.22 \pm 0.15 vs. 0.21 \pm 0.08$ ; t = -0.62, p = 0.53).

369

### 370 Synchrony and community stability metrics

371 The four synchrony measures used ( $\varphi$ ,  $\eta$ ,  $\eta_w$  and log VR) were all positively correlated (see Table S2), 372 but only  $\varphi$  was significantly correlated with elevation (t = 2.23, p = 0.03) probably due to this index 373 being more sensitive to species richness variation than the others (Table S2). However, the 374 polynomial (cubic) model provided a better fit than the linear one (Table 3; Fig. S3). The variance 375 ratio (VR) among species was quadratically related to elevation with maximum values around 1,000-376 1,500 m (Table 3: Fig. 3). Most plots (87%) exhibited VR values higher than expected by chance and 377 only two presented a negative covariance. All synchrony indices except  $\eta$  differed significantly 378 among habitat types (Table 3). Forest assemblages exhibited the highest values of synchrony and 379 covariance. Alpine, farmland, and mixed habitats showed quite similar values of synchrony, but the 380 variance ratio (log VR) was much lower in alpine environments in comparison to the remaining 381 categories (Table 3). Alpine and forest communities also exhibited the lowest values of stability, 382 which decreased with elevation (Table 3). On the contrary, mixed habitats harbored the most stable 383 communities (Table 3).



389 seed-eating guilds, respectively (ground *vs*. arboreal:  $4.98 \pm 1.77 vs$ .  $2.46 \pm 1.00$ ; t = 14.48, p < 0.001, 390 insectivorous *vs*. plant-and-seed-eating:  $5.64 \pm 2.16 vs$ .  $3.12 \pm 1.10$ ; t = -14.57, p < 0.001).

391 When using the three-term local variance (T3) approach to filter out the pervasive effects of 392 directional trends on synchrony, we obtained very similar results to those described above; forests 393 harbored the most synchronous communities, although differences between alpine communities and 394 the remaining habitat types were slightly larger (see Table 3). Accordingly, when decomposing 395 synchrony values, we found that habitat differences in synchrony were not governed by differences in 396 directional trends ( $S_{\text{trend}}$ ), which did not differ significantly among habitat categories ( $F_{3,126} = 2.51$ , p =397 0.062). Habitat differences in species year-to-year fluctuations ( $S_{detrended}$ ) were significant ( $F_{3,126}$  = 398 12.17, p < 0.001); forest and alpine communities exhibited the greatest and smallest values of 399 detrended synchrony, respectively (Fig. 4a). S<sub>detrended</sub> was quadratically related with elevation (Fig. 4a; 400 elevation: t = 2.78, p < 0.01, elevation<sup>2</sup>: t = -3.52, p < 0.001), whereas S<sub>trend</sub> showed a less pronounced 401 (non-significant) 'hump-shaped' pattern (Fig. 4b). The proportion of communities exhibiting negative 402 Strend values indicative of successional dynamics was much higher (about double) in mixed habitats 403 compared to other categories (Table 4).

404

## 405 Deterministic vs. stochastic processes

406 The Raup-Crick null-based approach allowed us to estimate the magnitude to which beta  $(\beta)$  diversity 407 deviated from the expectation under a random assembly process while taking differences in species 408 richness and relative abundance into account (i.e., beta-deviation,  $\beta_{RC}$ ).  $\beta_{RC}$  values adopted a sigmoid 409 curve along the elevational gradient; alpine communities were more dissimilar than expected by 410 chance (i.e., more distant from null expectations) relative to mid-elevation communities, suggesting 411 that changes in  $\beta$ -diversity were not simply due to a random influence of elevation on species in each 412 locality, and instead likely due to elevation acting as an environmental filter (elevation: t = -2.04, p =413 0.04; elevation<sup>2</sup>: t = 2.21, p = 0.03; elevation<sup>3</sup>: t = -2.33, p = 0.04; Fig. 5a). Alpine communities had 414 greater  $\beta_{\rm RC}$  values compared to the rest of the habitats (alpine: 0.093 ± 0.04, forest: 0.064 ± 0.02, 415 farmland:  $0.066 \pm 0.02$ , mixed:  $0.060 \pm 0.02$ ;  $F_{3,126} = 11.36$ , p < 0.001).

- 416 Most communities (80%) showed normalized stochasticity ratio (NST) values <50%
- 417 indicating the prevalence of deterministic assembly. Alpine communities presented half as large NST
- 418 values (19.7%) compared to the remaining habitats (forest: 40.5, farmland: 47.2, mixed: 48.3%)
- 419  $(F_{3,125} = 37.13, p < 0.001)$ . Accordingly, the relative importance of stochastic processes in governing
- 420 community diversity decreased with elevation after reaching its maximum around 1,500 m (elevation:
- 421 *t* = 3.19, p <0.01; elevation<sup>2</sup>: *t* = -5.45, *p* <0.001; Fig. 5b).
- 422

## 423 *Community composition*

The PERMANOVA analysis showed significant differences among habitat types ( $R^2 = 0.44$ , F =424 678.01, p = 0.001) and study year ( $R^2 = 0.01$ , F = 6.35, p = 0.002), and a habitat  $\times$  year interaction 425  $(R^2 = 0.01, F = 2.58, p = 0.015)$ . Bird communities belonging to different habitat types occupied a 426 427 different region in the 2-D ordination space (Fig. 6). Almost all the space occupied by communities 428 from mixed habitats overlapped that of forest and farmland assemblages, whereas alpine communities 429 conformed a cluster with the highest level of spatial separation (Fig. 6). When we fitted elevation as 430 environmental vector onto the ordination space, we observed that this factor explained a significant 431 proportion of the variance ( $r^2 = 0.81$ , p = 0.001). We obtained a similar result when fitting elevation as smoothed surface using a Generalized Additive Model (GAM) ( $R^2 = 0.88$ , t = 429.2, p < 0.001; see 432 433 inset in Fig. 6).

434

435

## 436 **Discussion**

437 Here, we provided evidence that high-elevation bird communities in the Alps exhibit a higher

438 turnover rate and limited directional change in composition over time despite the predominance of

- 439 niche-based, deterministic processes in community assembly. Communities at mid- and low-
- 440 elevations are increasingly more dissimilar over time, particularly in mixed habitats where
- 441 successional dynamics are more likely to occur (e.g., open-habitat specialists progressively colonizing
- 442 woodland edges and forest glades). The role of stochastic assembly was greater at low- and mid-

elevation than at higher elevations, but deterministic processes had a predominant role in structuringbird communities along the entire elevational gradient.

445

## 446 Indices of temporal dynamics and extinction rates

447 Communities located at higher elevation displayed greater number of species gains and losses, and 448 consequently a higher turnover rate. Many alpine localities were occupied by the same species only 449 for one or two years before being abandoned, only to be recolonized later, indicating a high instability 450 in these communities (Knaus et al., 2018). On the contrary, farmland communities exhibited the 451 lowest numbers of both appearances and disappearances of new species. The low extinction rate is 452 striking as in Switzerland (as in other regions of Europe) farmland bird populations have experienced 453 marked declines in recent decades (55% on average for the period 1990-2018; Knaus et al., 2019), but 454 the regions in which these were steepest, for instance the Central Plateau, were not included in this 455 study. This suggests that trends observed at community level do not mirror those observed at an 456 individual species level, which may be due to the existence of compensatory mechanisms or lags in 457 the response of communities to disturbances (Supp & Ernest, 2014).

458 The most probable reason for more dynamic communities occurring at high elevation (around 459 1,800-2,000) is that a substantial proportion of species present in these assemblages are close to their 460 physiological limits and their populations are therefore more vulnerable to fluctuations in abiotic 461 conditions, which gives rise to a high temporal turnover (e.g., Sexton et al., 2009; Londoño et al., 462 2017). Accordingly, we observed that extinction rates increased from 500 to 2,000 m, reinforcing the 463 idea that increasing environmental harshness makes local populations more susceptible to extinction 464 or more prone to move in search of more benign conditions (McCain, 2009). Thus, communities at 465 high elevation are largely made up of species that come and go uninterruptedly as they are at their 466 range boundaries (Sekercioglu et al., 2008). In this sense, there is evidence that some species in the 467 Swiss Alps and other mountain systems are shifting their upper elevational limit in response to the 468 upward advancement of the treeline (e.g., Harsch et al., 2009; Vittoz et al., 2013; Freeman et al., 469 2018). Nevertheless, although these shifts occur from one year to the next, they take time to 470 consolidate and perpetuate over the years. Above the natural treeline (>2,100 m) only a small subset

471 of taxa adapted to high-elevation conditions (bare rock, permanent snow) are able to subsist. They are 472 high mountain specialists (e.g., snow finch Montifringilla nivalis) as they live only near mountain 473 summits, and thus their populations are more stable in comparison to that of generalist species 474 colonizing new elevation levels (e.g., tree pipit Anthus trivialis; alpine accentor Prunella collaris; European robin Erithacus rubecula, see Knaus et al., 2018) (Kolasa & Li, 2003). In addition, species 475 476 conforming these high-elevation communities tend to exhibit lower reproductive rates, lower survival 477 prospects, and lower dispersal capacity, which would make them less resilient to environmental 478 change (García-Navas et al., submitted).

479 Our time-lag analyses showed that the slope resulting from plotting pairwise temporal 480 dissimilarity values against temporal distances between samples decreased with increasing elevation, 481 suggesting that the way communities change over time varies along an elevational gradient. Time-lag 482 analysis (TLA) revealed an increase in dissimilarity with increasing time lag in lowland communities, 483 mainly those located in mixed habitats (open and successional forests, edge habitats). These transition 484 environments may harbor a considerable number of 'directional' species (species that were present 485 earlier, but later become locally extinct or colonizing species that enter the community later and 486 continually increase their abundance). Conversely, alpine communities showed the shallowest slopes, 487 which suggests a more erratic nature (no temporal autocorrelation) of species assemblages in this 488 habitat. The low densities of many alpine species may lead to stochastic disappearances and 489 reappearances. In addition, it may also be due to these assemblages being composed of a mixture of 490 constant species and species that have more erratic or directional species with low temporal variability 491 (Kampichler & van der Jeugd, 2013). Our results agree with those reported by Kampichler et al. 492 (2014) in a comparative analysis of bird communities from a variety of terrestrial ecosystems, from 493 primeval to disturbed forests. They reported that, although the slope, and thus the rate of community 494 change, varied widely among localities (with lowest and highest values for Białowieża' pristine 495 forests and successional forests, respectively), all assemblages showed significant directional change 496 of community composition (Kampichler et al., 2014). Thus, TLA can yield significant slopes for 497 communities characterized by remarkably different dynamics, and only those communities that are 498 almost entirely composed of species with constant population sizes or those whose species

499 abundances are driven by a pure white noise process are differentiated from the rest. The observation 500 of shallowest slopes in high elevation environments (alpine meadows) may also have to do with the 501 lower proportion of foliage-gleaning species that can be found in these habitats in comparison with 502 those at lower elevations. When discerning between species guilds, we found that arboreal species and 503 insectivorous species showed steeper slopes than ground-dwelling and herbivorous guilds suggesting 504 that guilds that heavily depend on trees may *a priori* exhibit less steady population dynamics.

505

## 506 Temporal synchrony and community stability

507 We failed to detect a significant linear relationship between elevation and most indices of community 508 synchrony. It may be due to the existence of habitat-specific differences and variations in the 509 representation of each habitat type along the elevational gradient (see Table 1). Temporal synchrony 510 analysis indicated that species in forest communities are more synchronous than those in the 511 remaining habitats probably as a result of differences in magnitude and duration of resource pulse 512 events. Whereas farmlands, mixed and alpine habitats are unlikely to exhibit large interannual 513 differences in food resources for birds inhabiting these ecosystems, forests are more prone to display 514 huge variations in resource availability (insects, fruits, seeds) from one year to the next. It occurs as a 515 result of fluctuations in mast production and cyclic or non-cyclic caterpillar outbreaks, which initiate 516 cascades of direct and indirect effects that permeate throughout forest communities (e.g., Schmidt & 517 Ostfeld, 2003; Clotfelter et al., 2007). Regarding this, there is evidence that fluctuating resource 518 availability increases community synchrony and temporal variability (i.e., the inverse of temporal 519 stability) (Li & Stevens, 2017). Although resource availability seems to play a central role in 520 regulating species responses and how they fluctuate in relation to the rest of the community, intrinsic 521 properties of assemblages can also have influence on the level of community-wide synchrony. For 522 instance, according to theory-based expectations (Morin et al., 2014), taxa with different ecological 523 strategies should fluctuate less synchronously than more similar taxa; however, the relationship 524 between functional diversity and community synchrony have been barely explored (but see Klink et 525 al., 2019). Hence, it is likely that low functional originality and functional divergence in forest 526 assemblages (García-Navas et al., 2020) contribute to the concordance of species responses to

527 environmental fluctuations (e.g., inter-annual climatic fluctuations). Thus, even though most bird 528 species breeding in temperate systems exhibit a similar response to favorable and unfavorable 529 environmental conditions (e.g., most species show higher fitness in warm springs with sufficient 530 precipitation), the level of functional resemblance among species may boost or dampen the influence of environmental filtering on community synchrony (Loreau & de Mazancourt, 2008; Adler et al. 531 532 2013). Another factor that can either increase or decrease the level of synchrony is the directional 533 change in species composition. For instance, successional changes after some disturbance (e.g., fire or 534 human-induced deforestation) can catalyze community change in a directional way, masking the 535 effect of year-to-year variation (Chapin III et al., 2006; Pandit et al., 2013). When filtering out the 536 effects of directional trends, we observed that the level of synchrony of alpine communities decreased 537 slightly with respect to that of other categories. However, results remained quite similar; the higher 538 synchrony level observed in forest communities cannot be attributed to the existence of habitat-539 specific long-term directional trends. In fact, when decomposing overall synchrony into trend  $(S_{\text{trend}})$ 540 and detrended ( $S_{detrend}$ ) synchrony, we observed that  $S_{trend}$  dampens differences in year-to-year 541 variation among habitats.

542 Since community stability and synchrony were negatively correlated, the less stable 543 communities were those located in forests and alpine habitats. On the contrary, farmlands and mixed 544 habitats exhibited the highest community stability values. Our results thus do not support the idea that 545 habitat conversion and historical deforestation result in reduced diversity and asynchrony (cf. 546 Blüethgen et al., 2016). It may be due to agriculture in Switzerland being largely dominated by small 547 farms, mostly in the Alps where traditional and agri-environmental practices are more common than 548 in other regions (Jura region and Central Plateau) (BAFU, 2017). Regarding this, theoretical studies 549 have suggested that interspecific competition may stabilize biological communities by enhancing 550 negative covariation in relative abundances of the constituent species (e.g., González & Loreau, 551 2009). However, here we only found two plots with negative covariance values, supporting the view 552 that compensatory dynamics are rare in natural biological communities (Houlahan et al., 2007; 553 Valone & Barber, 2008; but see Hallett et al., 2014). The level of asymmetry between coexisting 554 species seems to constitute a more important factor in terms of community stability. By weakening

555 interspecific temporal synchrony, species functional dissimilarity may have contributed to stabilize 556 communities in farmlands and mixed habitats. Although the alpine communities presented values of 557 synchrony similar to those observed in farmland and mixed-habitat communities, the average level of 558 stability was even lower than that reported for forests. Such a discrepancy probably arises as result of 559 lower taxonomic richness of alpine environments, since temporal stability at the community level 560 cannot be achieved solely by higher asynchrony across species ('insurance effect'; Naeem & Li, 561 1997; Yachi & Loreau, 1999), but also by higher species diversity (the so-called 'portfolio effect'; 562 Doak et al., 1998). The negative relationship between community stability and elevation provides 563 support for the notion that species richness acts as a buffer against environmental perturbation, which 564 is highly relevant in conservation terms (Tilman, 1999; García-Palacios et al., 2018; Joseph et al., 565 2019).

566

#### 567 Deterministic vs. stochastic processes

568 The relative influence of deterministic versus random processes in community assembly varied along 569 the elevational gradient, with stochastic factors being more influential in low-elevation communities. 570 Raup-Crick β-deviation analysis showed that alpine communities were more dissimilar than expected 571 by chance in relation to communities located at lower elevations, which were closer to null 572 expectations (see also Mori et al., 2013). Accordingly, our normalized stochasticity ratio (NST) 573 values decreased substantially above the treeline (Fig. 5). This finding is in agreement with the notion 574 that ecological communities in more benign environments (e.g., those with high productivity) are 575 more likely to be shaped by neutral processes, whereas environmental selection is more plausible in 576 communities thriving in high stress habitats (Chase, 2010; Andrew et al., 2012). Two non-mutually 577 exclusive circumstances may underlie the observed pattern. First, the realized pool of species 578 inhabiting high-elevation environments may be more or less nested within the pool of species that can 579 be found at lower elevations (Chase, 2010). Secondly, habitat specialists seem to be mostly influenced 580 by deterministic factors than generalist species do (e.g., Pandit et al. 2009). Since the proportion of 581 habitat specialists (i.e., taxa with narrow ecological tolerance) increases as environmental conditions 582 become increasingly demanding (Devictor et al., 2010), this may contribute to a larger influence of

583 deterministic mechanisms (mainly selection) in shaping assemblages at harsh, high-mountain

584 environments. These factors may counterbalance the effect of community size, as it has been recently

585 suggested that ecological drift drives variation in small communities and that they deviate less from

null expectations in comparison with larger communities (Siqueira et al., 2019).

587

## 588 *Community composition*

589 Bird communities belonging to different habitat types showed distinct spatial separation as illustrated 590 in Fig. 6. Accordingly, the PERMANOVA analysis yielded significant differences among habitats 591 despite the existence of interannual variability in community composition, mostly in alpine 592 environments. When plotting elevation onto the ordination plot, we observed a greater dispersion of 593 the data at an elevation from 2,000 to 2,200 m compared to other elevation levels (inset in Fig. 6). 594 This suggests an above average level of heterogeneity in community composition around the treeline. 595 This heterogeneity probably arises as a result of two factors: spatial variation in the uppermost limit of 596 treeline (Gehrig-Fasel et al., 2007) and the high temporal turnover rate observed at this elevation (as a 597 result of recurrent colonization and extinction events). In addition, during the last decades the 598 proportion of forest area has increased noticeably at high elevations in alpine regions; the higher up, 599 the sharper the relative increase in forest area. For instance, whilst the growth rate at low elevations 600 was minimal during the period 1985-2009, it was 23.1% between elevations of 2,000 and 2,200 m 601 (Swiss Federal Statistical Office SFSO, 2013). Thus, changes in land use probably have contributed to 602 the existence of higher temporal variability in alpine communities.

603

## 604 Imperfect detection

We did not account for imperfect detection of species in our analyses. Although we cannot discard that imperfect detection has influenced our results to some extent, to constitute an important factor behind our findings, species detectability would have needed to change directionally over time and along the elevational gradient, in a way systematically related to our temporal dynamics metrics. In addition, species detectability in this monitoring programme has been assessed and has been proven to 610 be high (89% according to the Burnham's Jackknife method; see Kéry & Schmid, 2006) in 611 comparison with other programs like the American Breeding Bird survey (Boulinier et al., 1998). In 612 particular, Kéry & Schmid (2006) did not find a significant effect of either elevation or forest cover 613 on detection probability. This result was confirmed in a later study using species-specific occupancy 614 models in which Kéry & Royle (2009) reported that in 97% of cases the estimated number of 615 overlooked species per plot was only 1-4 (proportion of detected species = 91%). On the other hand, 616 metrics are likely to be robust to detection filtering if the effects of the environment on functional 617 diversity and similar estimates are larger than the effects of detection. Regarding this, Johnson (2008) 618 argued that no method of adjusting bird count data appears to be effective for large-scale, multi-619 species monitoring surveys (i.e., a single method in unlikely to work well across all species). In a 620 more recent review, Banks-Leite et al. (2014) identified several practical limitations associated with 621 the use of detectability models concluding that unadjusted estimates of single- and multiple-species 622 responses to ecological gradients can be just as robust as estimates that were *a posteriori* controlled 623 for covariates of detection probability (see e.g., Welsh et al., 2013). Thus, we think it is unlikely that 624 this issue had a relevant impact on our results.

625 Conclusions

626 Most traditional measures of community structure represent a 'snapshot in time' whereas ecological 627 communities are dynamic and many are experiencing directional change over time. Here, we used 628 multivariate methods including recently developed analyses such as the three-term local variance 629 analysis (Lepš et al., 2019) and the NST ratio (Ning et al., 2019) for testing hypotheses of temporal 630 dynamics in Alpine bird communities. Our results provide evidence that niche-based processes are 631 more pronounced in alpine communities, where abiotic conditions are more hostile (and thus, the 632 strength of environmental filtering increases; García-Navas et al., 2020). At lower elevations, the 633 relative contribution of stochastic regulatory mechanisms was greater, yet the assembly of low- and 634 mid-elevation communities was also fundamentally driven by deterministic processes. These findings 635 agree with the idea that, although species turnover in metacommunities is frequent, a high temporal 636 turnover does not necessarily imply the overriding importance of stochastic processes (Freestone &

637 Inouye, 2015; Leibold & Chase, 2017). According to our results reported here and in a previous study 638 (García-Navas et al., 2020), taxonomic and functional diversity may have a more important role as a 639 stabilizing agent than intraspecific competition (negative covariation) in this Alpine region. Our study 640 shows the convenience of studying community dynamics over long time-periods in order to better 641 understand the mechanisms that shape the identity and abundance of species within natural 642 communities. In particular, this study is one of the first to address the relationship between patterns in 643 community dynamics and elevation, which is of utmost importance from a conservation point of view 644 given the vulnerability of mountain systems to global change impacts (Kohler et al., 2014; Lehikoinen 645 et al., 2019; Perrigo et al., 2019).

646

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657

#### 658 Data accessibility

The data that support the findings of this study are available from the Swiss Ornithological Institute
(www.vogelwarte.ch) but restrictions apply to the availability of these data, which were used under
license for the current study, and so are not publicly available.

662

663 *Conflict of interest* 

664 The authors declare that they have no conflict of interest.

- 667 Vicente García-Navas is a researcher at the Center for Ecology, Evolution and Environmental Changes
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- 669 communities. He is interested in how species assemblages change over time and along environmental
- 670 gradients and the influence of historical processes on local coexistence patterns.
- 671

#### 672 *Author contribution*

- 673 VGN conceived the study; TS and HS provided the dataset; VGN analyzed the data; VGN, TS and674 AO interpreted the results; VGN wrote the manuscript with inputs from TS and AO.
- AO interpreted the results; VGN wrote the manuscript with inputs from 1S and A
- 675

# 676 References677

- Adler, P.B., Fajardo, A., Kleinhesselink, A.R. & Kraft, N.J.B. (2013) Trait-based tests of coexistence
  mechanisms. Ecology Letters, 16, 1294-1306.
- Alonso, D., Pinyol-Gallemí, A., Alcoverro, T., & Arthur, R. (2015) Fish community reassembly after
  a coral mass mortality: Higher trophic groups are subject to increased rates of extinction. Ecology
  Letters, 18, 451-461.
- Anderson, M.J. (2001) A new method for non-parametric multivariate analysis of variance. Austral
  Ecology, 26: 32-46.
- Anderson, M.J. (2006) Distance-based tests for homogeneity of multivariate dispersions. Biometrics,
  686 62, 245-253.
- Andrew, M.E., Wulder, M.A., Coops, N.C. & Baillargeon, G. (2012) Beta-diversity gradients of
  butterflies along productivity axes. Global Ecology and Biogeography, 21, 352-364.
- 689 BAFU (2017): Biodiversität in der Schweiz: Zustand und Entwicklung. Ergebnisse des
- 690 Überwachungssystems im Bereich Biodiversität, Stand 2016. Umwelt-Zustand Nr. 1630.
  691 Bundesamt für Umwelt (BAFU), Bern.
- Banks-Leite, C., Pardini, R., Boscolo, D., Righetto Cassano, C., Püttker, T., Santos Barros, C. &
- Barlow, J. (2014) Assessing the utility of statistical adjustments for imperfect detection in tropical
  conservation science. Journal of Applied Ecology, 51: 849-859.
- Beukhof, E., Dencker, T.S., Pecuchet, L., & Lindegren, M. (2019). Spatio-temporal variation in
  marine fish traits reveals community-wide responses to environmental change. Marine Ecology
  Progress Series, 610, 205-222.
- Blüethgen, N., Simons, N.K., Jung, K., Prati, D., Renner, S.C., Boch, M., et al. (2016) Land use
- 699 imperils plant and animal community stability through changes in asynchrony rather than
- 700 diversity. Nature Communications, 7, 10697.

- Boulinier, T., Nichols, J.D., Sauer, J.R., Hines, J.E. & Pollock, K.H. (1998) Estimating species
   richness: the importance of heterogeneity in species detectability. Ecology, 79, 1018-1028.
- Buckley, H.L., Day, N.J., Case, B.S., Lear, G. & Ellison, A.M. (2018) Multivariate methods for
  testing hypotheses of temporal community dynamics. bioRxiv,
- 705 doi: https://doi.org/10.1101/362822.
- 706 Burel, F., Aviron, S., Baudry, J., Le Feón, V. & Vasseur, C. (2013) The Structure and Dynamics of
- 707 Agricultural Landscapes as Drivers of Biodiversity. In: Landscape Ecology for Sustainable
   708 Environment and Culture. Fu, B. & Jones, B. (Eds.). Chapter 14. Springer.
- Chapin III, F.S., Robards, M.D., Huntington, H.P., Johnstone, J.F., Trainor, S.F., Kofinas, G.P., Rues,
  R.W. *et al.* (2006) Directional Changes in Ecological Communities and Social-Ecological
- 711 Systems: A Framework for Prediction Based on Alaskan Examples. The American Naturalist, 168,
- 712 S36-S49.
- Chase, J.M. (2010) Stochastic community assembly causes higher biodiversity in more productive
  environments. Science, 328, 1388-1391.
- Chase, J.M., Kraft, N.J.B., Smith, K.G., Vellend, M. & Inouye, B.D. (2011) Using null models to
  disentangle variation in community dissimilarity from variation in α-diversity. Ecosphere, 2, 24.
- 717 Cleland, E.E., Collins, S.L., Dickson, T.L., Farrer, E.C., Gross, K.L., Gherardi, L.A. et al. (2013)
- Sensitivity of grassland plant community composition to spatial *vs*. temporal variation in
  precipitation. Ecology, 94, 1687-1696.
- Clotfelter, E.D., Pedersen, A.B., Cranford, J.A., Ram, N., Snajdr, E.A., Nolan Jr, V. & Ketterson,
  E.D. (2007) Acorn mast drives long-term dynamics of rodent and songbird
- populations. Oecologia, 154, 493-503.
- Collins, S.L. (2000) Disturbance frequency and community stability in native tallgrass prairie.
  American Naturalist, 155, 311-325.
- Collins, S.L., Micheli, F. & Hartt, L. (2000) A method to determine rates and patterns of variability in
  ecological communities. Oikos, 91, 285-293.
- 727 Cornwell, W.K. & Ackerly, D. (2009) Community assembly and shifts in the distribution of
- functional trait values across an environmental gradient in coastal California. Ecological
  Monographs, 79, 109-126.
- 730 Dehling, M.D., Fritz, S.A., Töpfer, T., Päckert, M., Estler, P., Böhning-Gaese, K. & Schleuning, M.
- (2014) Functional and phylogenetic diversity and assemblage structure of frugivorous birds along
  an elevational gradient in the tropical Andes. Ecography, 37, 1047-1055.
- 733 Dencker, T.S., Pecuchet, L., Beukhof, E., Richardson, K., Payne, M.R. & Lindegren, M (2017)
- 734 Temporal and spatial differences between taxonomic and trait biodiversity in a large marine
- ecosystem: Causes and consequences. PLoS ONE, 12, e0189731.
- 736 Devictor, V. Julliard, R. Clavel, J. Jiguet, F. Lee, A. Couvet, D. (2008) Functional biotic
- homogenization of bird communities in disturbed landscapes. Global Ecology and

- 738 Biogeography, 17, 252-261.
- Devictor V., Clavel J., Julliard R., Lavergne S., Mouillot D., Thuiller W., *et al.* (2010). Defining and
   measuring ecological specialization. Journal of Applied Ecology, 47, 15-25.
- 741 Doak, D.F., Bigger, D., Harding, E.K., Marvier, M.A., O'Malley, R.E. & Thomson, D. (1998) The
- statistical inevitability of stability-diversity relationships in community ecology. American
- 743 Naturalist, 151, 264-276.
- Dornelas, M., Gotelli, N.J., Mcgill, B., Shimadzu, H., Moyes, F., Sievers, C. *et al.* (2014) Assemblage
  time series reveal biodiversity change but not systematic loss. Science, 344, 296-299.
- 746 Elton, C.S. (1958) *The ecology of invasions by animals and plants*. Methuen, London, UK.
- Fox, J., Weisberg, S. (2019) *An R Companion to Applied Regression*, Third edition. Sage, Thousand
  Oaks CA.
- Freeman, B.G., Scholer, M.N., Ruiz-Gutierrez, V. & Fitzpatrick, J.W. (2018) Climate change causes
  upslope shifts and mountaintop extirpations in a tropical bird community. Proceedings of the
  National Academy of Sciences, 115, 11982-11987.
- Freestone, A.L., Inouye, B.D. (2015) Nonrandom community assembly and high temporal turnover
  promote regional coexistence in tropics but not temperate zone. Ecology, 96, 264-273.
- García-Navas, V., Sattler, T., Schmid, H. & Ozgul, A. (2020) Temporal homogenization of functional
  and beta diversity in bird communities of the Swiss Alps. Diversity and Distributions, 26, 900911.
- García-Navas, V., Sattler, T., Schmid, H. & Ozgul, A. High-elevation bird communities in the Swiss
  Alps exhibit reduced fecundity and lifespan independently of phylogenetic effects. *Submitted*.
- 759 García-Palacios, P., Gross, N., Gaitán, J. & Maestre, F.T. (2018) Climate mediates the biodiversity-
- ecosystem stability relationship globally. Proceedings of the National Academy of SciencesUSA, 115, 201800425.
- Gaüzère, P. Jiguet, F. & Devictor, V. (2015) Rapid adjustment of bird community compositions to
   local climatic variations and its functional consequences. Global Change Biology 21, 3367-3378.
- Gaüzère, P. Princé, K. & Devictor, V. (2017) Where do they go? The effects of topography and
  habitat diversity on reducing climatic debt in birds. Global Change Biology, 23, 2218-2229.
- 766 Gross, K., Cardinale, B.J., Fox, J.W., González, A., Loreau, M., Polley, H.W., et al (2014) Species
- richness and the temporal stability of biomass production: a new analysis of recent biodiversityexperiments. American Naturalist, 183, 1-12.
- Graham, C.H., Parra, J.L., Rahbek, C., & McGuire, J.A. (2009) Phylogenetic structure in tropical
  hummingbird communities. Proceedings of the National Academy of Sciences of the United States
  of America, 106, 19673-19678.
- Hallett, L.M., Hsu, J.S., Cleland, E.E., Collins, S.L., Dickson, T.L., Farrer, E.C. et al. (2014) Biotic
- mechanisms of community stability shift along a precipitation gradient. Ecology, 95, 1693-1700.

- Hallett, L.M., Jones, S.K., MacDonald, A.A., Jones, M.B., Flynn, D.F., Ripplinger, J., Slaughter, P.,
  Gries, C. & Collins, S.L. (2016) *codyn*: An R package of community dynamics metrics. Methods
  Ecology and Evolution, 7, 1146-1151.
- Harms, K.E., Condit, R., Hubbell, S.P. & Foster, R.B. (2001) Habitat associations of trees and shrubs
  in a 50-ha neotropical forest plot. Journal of Ecology, 89, 947-959.
- Harsch, M.A., Hulme, P.E., McGlone, M.S. & Duncan, R.P. (2009) Are treelines advancing? A global
- 780 meta-analysis of treeline response to climate warming. Ecology Letters, 12, 1040-1049.
- Hillebrand, H., Blasius, B., Borer, E.T., Chase, J.M., Downing, J.A. *et al.* (2018) Biodiversity change
  is uncoupled from species richness trends: consequences for conservation and monitoring. Journal
  of Applied Ecology, 55, 169-184.
- Hoover, D.L., Knapp, A.K., & Smith, M.D. (2014) Resistance and resilience of a grassland ecosystem
  to climate extremes. Ecology, 95, 2646-2656.
- Houlahan, J.E., Currie, D.J., Cottenie, K., Cumming, G.S., Ernest, S.K.M., Findlay, C.S. et al. (2007)
- Compensatory dynamics are rare in natural ecological communities. Proceedings of the NationalAcademy of Sciences of the USA, 104, 3273-3277.
- Jarzyna, M.A., Porter, W.F., Maurer, B.A., Zuckerberg, B., & Finley, A.O. (2015) Landscape
- fragmentation affects responses of avian communities to climate change. Global Change Biology,21, 2942-2953.
- Jarzyna, M.A., Zuckerberg, B., Finley, A.O. & Porter, W.F (2016) Synergistic effects of climate and
  land cover: grassland birds are more vulnerable to climate change. Landscape Ecology, 31, 22752290.
- Jarzyna, M.A. & Jetz, W (2017) A near half-century of temporal change in different facets of avian
  diversity. Global Change Biology, 23, 2999-3011.
- Jarzyna, M.A., Quintero, I. & Jetz, W (2019) Functional community assembly and turnover along
  elevation and latitude. bioRxiv preprint 706523.
- Johnson, D.H. (2008) In defense of indices: the case of bird surveys. Journal of Wildlife Management,
  72: 857-868.
- Jones, S.K., Ripplinger, J. & Collins, S.L. (2017) Species reordering, not changes in richness, drives
   long-term dynamics in grassland communities. Ecology Letters, 20, 1556-1565.
- Joseph, G.S., Seymour, C.L., Muluvhahothe, M.M., Munyai, T.C., Bishop, T.R. & Foord, S.H. (2019)
- 804 Stability of Afromontane ant diversity decreases across an elevation gradient. Global Ecology and805 Conservation, 17, e00596.
- 806 Kampichler, C., van Turnhout, C.A.M., Devictor, V. & van der Jeugd, H.P. (2012) Large-scale
- 807 changes in community composition: determining land use and climate change signals. PLoS ONE,
- 808 7, e35272.

- 809 Kampichler, C. & van der Jeugd, H.P. (2013) Determining patterns of variability in ecological
- 810 communities: time lag analysis revisited. Environmental Ecological Statistics, 20, 271-284.
- 811 Kampichler, C., Angeler, D.G., Holmes, R.T., Leito, A., Svensson, S., van der Jeugd, H.P. et al.
- 812 (2014). Temporal dynamics of bird community composition: an analysis of baseline conditions
- 813 from long-term data. Oecologia, 175, 1301-1313.
- 814 Kaplan, J.O., Krummhardt, K.M. & Zimmermann, N.E. (2009) The prehistoric and preindustrial
- 815 deforestation of Europe. Quaternary Science Reviews, 28, 3016-3034.
- Kéry, M. & Schmid, H. (2006) Estimating species richness: calibrating a large avian monitoring
  programme. Journal of Applied Ecology, 43: 101-110.
- 818 Kéry, M. & Royle, J.A. (2009) Inferences about species richness and community structure using
- 819 species-specific occupancy models in the national Swiss breedingbird survey MHB. In: *Modeling*
- 820 *Demographic Processes in Marked Populations*. Thomson, D.L., Cooch, E.G., Conroy, M.J.
- 821 (Eds), pp. 639-656.Springer, NewYork.
- Klink, R., Lepš, J., Vermeulen, R. & de Bello, F. (2019) Functional differences stabilize beetle
  communities by weakening interspecific temporal synchrony. Ecology, 100, e02748.
- Knaus, P., Antoniazza, S., Wechsler, S., Guélat, J., Kéry, M., Strebel, N. & Sattler, T. (2018). Swiss *Breeding Bird Atlas 2013–2016. Distribution and population trends of birds in Switzerland and*
- 826 *Liechtenstein.* Swiss Ornithological Institute, Sempach.
- Knaus, P., C. Müller, C., Sattler, T., Schmid, H., Strebel, N. & Volet, B. (2019) *The State of Birds in Switzerland: Report 2019*. Swiss Ornithological Institute, Sempach.
- Kolasa, J. & Li, B.L. (2003) Removing the confounding effect of habitat specialization reveals the
  stabilizing contribution of diversity to species variability. Proceedings of the Royal Society of
  London B, 270, 198-201.
- 832 Kohler, T., Wehrli, A. & Jurek, M. (2014) *Mountains and climate change: A global concern.*
- 833 Sustainable Mountain Development Series. Bern, Switzerland, Centre for Development and
- 834 Environment (CDE), Swiss Agency for Development and Cooperation (SDC) and Geographica
  835 Bernensia. 136 pp.
- 836 Kraft, N.J., Adler, P.B., Godoy, O., James, E.C., Fuller, S. & Levine, J.M. (2015) Community
- assembly, coexistence and the environmental filtering metaphor. Functional Ecology, 29, 592-599.
- 838 Legendre, P. & Gauthier, O. (2014) Statistical methods for temporal and space-time analysis of
- community composition data. Proceedings of the Royal Society of London B, 281, 20132728.
- Lehikoinen, A., Brotons, L., Calladine, J., Campedelli, T., *et al.* (2019). Declining population trends
  of European mountain birds. Global Change Biology, 25, 577-588.
- Leibold, M.A., Chase, J.M. (2017) *Metacommunity Ecology*. Princeton University Press, Princeton,
  NJ.
- 844 Lepš, J., Májeková, M., Vitová, A., Dolezal, J. & de Bello, F. (2018) Stabilizing effects in temporal
- 845 fluctuations: management, traits and species richness in high-diversity communities. Ecology, 99,

- 846 360-371.
- Lepš, J., Götzenberger, L., Valencia, E. & de Bello, F. (2019) Accounting for long-term directional
  trends on year-to-year synchrony in species fluctuations. Ecography, *in press*.
- Li, W. & Stevens, M. (2017) Community temporal variability increases with fluctuating resource
  availability. Scientific Reports, 7, 45280.
- 851 Londoño, G.A., Chappell, M.A., Jankowski, J.E. and Robinson, S.K. (2017), Do thermoregulatory
- 852 costs limit altitude distributions of Andean forest birds?. Functional Ecology, 31: 204-215.
- Loreau, M., Naeem, S. & Inchausti, P. (2002) *Biodiversity and ecosystem functioning: synthesis and perspectives*. Oxford University Press, Oxford, UK.
- Loreau, M. & de Mazancourt, C. (2008) Species synchrony and its drivers: neutral and nonneutral
  community dynamics in fluctuating environments. American Naturalist, 172, 48-66.
- Loreau, M. & de Mazancourt, C. (2013) Biodiversity and ecosystem stability: a synthesis of
  underlying mechanisms. Ecology Letters, 16, 106-115.
- 859 Machac, A., Janda, M., Dunn, R.R., & Sanders, N.J. (2011) Elevational gradients in phylogenetic
- structure of ant communities reveal the interplay of biotic and abiotic constraints ondiversity. Ecography, 34, 364-371.
- Maggini, R., Lehmann, A., Kéry, M., Schmid, H., Beniston, M., Jenni, L. & Zbinden, N. (2011) Are
  Swiss birds tracking climate change? Detecting elevational shifts using response curve shapes.
  Ecological Modelling, 222, 21-32.
- McCain, C.M. (2009) Global analysis of bird elevational diversity. Global Ecology and
  Biogeography, 18, 346-360.
- Mori, A.S., Furukawa, T. & Sasaki, T (2013) Response diversity determines the resilience of
  ecosystems to environmental change. Biological Reviews, 88, 349-364.
- 869 Naeem, S. & Li, S. (1997) Biodiversity enhances ecosystem reliability. Nature, 390, 507-509.
- 870 Ning, D (2019) Normalized Stochasticity Ratio R package.
- 871 https://cran.r-project.org/web/packages/NST/NST.pdf
- 872 Ning, D., Deng, Y., Tiedje, J.M. & Zhou, J. (2019) A general framework for quantitatively assessing
- 873 ecological stochasticity. Proceedings of the National Academy of Science USA, 116, 16892-874 16898.
- Ontiveros, V.J., Capitán, J.A., Arthur, R., Casamayor, E.O., Alonso, D. (2019) Colonization and
  extinction rates estimated from temporal dynamics of ecological communities: The *island*
- 877 R package. Methods in Ecology and Evolution, 10, 1108-1117.
- Pandit, S.N., Kolasa, J. & Cottenie, K. (2009) Contrasts between habitat generalists and specialists: an
  empirical extension to the basic metacommunity framework. Ecology, 90, 2253-2262.

- 880 Pandit, S.N., Kolasa, J. & Cottenie, K. (2013) Population synchrony decreases with richness and
- increases with environmental fluctuations in an experimental metacommunity. Oecologia, 171,237-247.
- Perrigo, A., Hoorn, C. & Antonelli, A. (2019) Why mountains matter for biodiversity. Journal of
  Biogeography, 00, 1-11.
- Peterson, C.H. (1975) Stability of species and of community for the benthos of two lagoons. Ecology,
  56, 958-965.
- Raup D. M., Crick R. E. (1979). Measurement of faunal similarity in paleontology. Journal of
  Paleontology, 53, 1213-1227.
- Renner, S.C., Gossner, M.M., Kahl, T., Kalko, E.K.V., Weisser, W.W., Fischer, M., *et al.* (2014)
  Temporal Changes in Randomness of Bird Communities across Central Europe. PLoS ONE, 9,
  e112347.
- Roth, T., Allan, E., Pearman, P.B., Amrhein, V. (2018) Functional ecology and imperfect detection of
  species. Methods in Ecology and Evolution, 9, 917-928.
- Schluter, D. (1984) A Variance Test for Detecting Species Associations, with Some Example
  Applications. Ecology, 65, 998-1005.
- Schmid, H. (2017) *TerriMap*-online ein Tool zur rationellen Auswertung von vereinfachten
   Revierkartierungen. Swiss Ornithological Institute.
- Schmidt, K.A. & Ostfeld, R.S. (2003) Songbird populations in fluctuating environments: predator
  responses to pulsed resources. Ecology, 84, 406-415.
- Sekercioglu, C.H., Schneider, S.H., Fay, J.P. & Loarie, S.R. (2008) Climate Change, Elevational
  Range Shifts, and Bird Extinctions. Conservation Biology, 22, 140-150.
- 902 Sexton, J.P., McIntyre, P.J., Angert, A.L. & Rice, K.J. (2009) Evolution and Ecology of Species
  903 Range Limits. Annual Review of Ecology, Evolution, and Systematics, 40, 415-436.
- 904 Siqueira, T., Saito, V.S., Bini, L.M., Melo, A.S., Petsch, D.K., Landeiro, V.L. et al. (2019)
- 905 Community size affects the signals of ecological drift and niche selection on biodiversity.
  906 BioRxiv 515098; doi: https://doi.org/10.1101/515098.
- 907 Spanbauer, T.L., Allen, C.R., Angeler, D.G., Eason, T., Fritz, S.C., Garmestani, A.S. et al. (2016).
- Body size distributions signal a regime shift in a lake ecosystem. Proceedings of the Royal Societyof London B, 283, 20160249.
- 910 Spotswood, E.N., Bartolome, J.W., Allen-Diaz, B. (2015) Hotspots of Community Change: Temporal
- 911 Dynamics Are Spatially Variable in Understory Plant Composition of a California Oak Woodland.
  912 PLoS ONE, 10, e0133501.
- 913 Storchová, L, Hořák, D. (2018) Life-history characteristics of European birds. Global Ecology and
- Biogeography, 27: 400-406.
- 915 Gonzalez, A. & Loreau, M. (2009) The Causes and Consequences of Compensatory Dynamics in
- 916 Ecological Communities. Annual Review Ecology, Evolution and Systematics, 40, 393-414.

- Supp, S.R. & Ernest, S.K. (2014) Species-level and community-level responses to disturbance: a
  cross-community analysis. Ecology, 95, 1717-1723.
- Schmid, H., Zbinden, N., Keller, V., (2004) Überwachung der Bestandsentwicklung häufiger
  Brutvögel in der Schweiz. Schweizerische Vogelwarte, Sempach.
- 921 Swiss Federal Statistical Office (2013) Land use in Switzerland. Results of the Swiss land use
   922 statistics. Swiss Statistics series, Neuchâtel. <a href="http://landuse-stat.admin.ch">http://landuse-stat.admin.ch</a>
- 923 Tilman, D. (1999) The ecological consequences of changes in biodiversity: a search for general
  924 principles. Ecology, 80, 1455-1474.
- Tilman, D., Reich, P.B. & Knops, J.M.H. (2006) Biodiversity and ecosystem stability in a decadelong grassland experiment. Nature, 441, 629-632.
- 927 Travis, J.M.J., Brooker, R.W., Clark, E.J. & Dytham, C. (2006) The distribution of positive and
- 928 negative species interactions across environmental gradients on a dual-lattice model. Journal of
  929 Theoretical Biology, 241, 896-902.
- Valone, T.J. & Barber, N.A. (2008) An empirical evaluation of the insurance hypothesis in diversitystability models. Ecology, 89, 522-531.
- 932 Vellend, M. (2016) The Theory of Ecological Communities. Princeton University Press. 248 pp.
- Vittoz, P., Cherix, D., Gonseth, Y., Lubinid, V., Maggini, R., Zbindenf, N. & Zumbachg, S. (2013)
  Climate change impacts on biodiversity in Switzerland: A review. Journal for Nature
  Conservation, 21, 154-162.
- Welsh, A.H., Lindenmayer, D.B. & Donnelly, C.F. (2013) Fitting and Interpreting Occupancy
  Models. PLoS ONE, 8: e52015.
- Yachi, S. & Loreau, M. (1999) Biodiversity and ecosystem productivity in a fluctuating environment:
  The insurance hypothesis. Proceedings of the National Academy of Sciences USA, 96, 1463-1468.
- 940 Zamora, R., Pérez-Luque, A.J. & Bonet, F.J. (2017) Monitoring global change in high mountains. In:
- 941 High Mountain Conservation in a Changing World. Catalan, J., Ninot, J.M. & Aniz, M. (Eds.) pp
- 942 385-413. Springer-Verlag.
- 943
- 944

## 946 *Figure captions*

948 Figure 1. Graphical summary of the four main predictions examined in this study (left) and overview 949 of the study area including a representative picture of the four habitat types and a topographic map 950 with the distribution of the 131 plots (right). In brief, the four predictions can be summarized as 951 follows: both temporal turnover (i) and synchrony (ii) increases with elevation as result of low 952 taxonomic richness, low functional diversity and high ephemerality of populations in high-elevation 953 communities; (iii) community stability shows a quadratic relationship with elevation ('hump-shaped' 954 pattern) because the more dynamic habitants (farmlands and alpine environments) tend to be 955 predominant at both extremes of the elevational gradient (at low- [<1,000 m] and high- [>1,800 m] 956 elevation, respectively); and (iv) the relative contribution of stochastic processes increases with 957 elevation due to a stronger effect of environmental filtering as abiotic conditions become harsher and 958 more stressful (see main text for details). (Photo credits: A. Ozgul and T. Sattler). 959 960 Figure 2. Plots showing the relationship between elevation and (a) temporal turnover rate, and (b) rate 961 of directional change in bird community composition in the Swiss Alps over the period 1999-2018. 962 Each point corresponds to a different study plot, which is colored according to the habitat type it 963 belongs to (orange: farmland; grey: mixed; green: forest; blue: alpine). Relationships were fitted using 964 polynomial (*turnover rate* elevation: t = -3.18, p < 0.01; elevation<sup>2</sup>: t = 3.68, p < 0.001; elevation<sup>3</sup>: t = -965 3.85, p < 0.001) or linear models (*rate of community change* elevation: t = -3.50, p < 0.001). 966 967 Figure 3. Relationship between community-level species covariance and elevation. Species 968 covariance is shown as log-transformed Schluter' variance ratio (VR), which compares the variance of 969 the community as a whole relative to the sum of the individual population variances. All values 970 except two were positive (VR > 0), reflecting the rarity of compensatory dynamics (negative

- 971 covariance). The dotted line indicates the significance threshold. Values above the line are
- 972 significantly different from that expected by chance (null model).

974

975 due to year-to-year fluctuations (S<sub>detrended</sub>) along the elevational gradient. Synchrony components were 976 obtained from an overall estimate of community synchrony following the decomposition method 977 proposed by Lepš et al. (2019). 978 979 Figure 5. Changes in the relative influence of deterministic versus stochastic processes in shaping 980 bird community assembly estimated as (a) Raup-Crick dissimilarity values ( $\beta_{RC}$ ), and (b) normalized 981 stochasticity ratio (NST), along an elevational gradient in the Swiss Alps. According to the Raup-982 Crick' method, a beta-deviation ( $\beta_{RC}$ ) close to zero suggests that neutral processes are more important 983 in structuring the community, whereas larger null deviations suggest that niche-based processes are 984 more important (communities are more dissimilar than expected by chance). According to Ning et al. 985 (2019), NST discern between more deterministic (<50%) and more stochastic (>50%) processes being 986 50% the boundary point. 987 988 Figure 6. Principal coordinates analysis (PCoA) based on the distance matrix of Bray-Curtis 989 dissimilarity for bird communities (131 study plots, 20 yr). Each dot represents community 990 composition at a site (study plot) for each sample year. Habitat type is indicated by color. The inset 991 shows elevation fitted as a smooth surface onto the ordination plot ('ordisurf' model). 992

Figure 4. Variation in the synchrony component due to long-term trends (Strend) and the component







1003 Figure 3 











1009 Figure 6 



- *Table 1.* Description of the four habitat categories considered in the present study including
- 1012 information on mean elevation and mean proportion of surface covered by agriculture land, forests
- 1013 and alpine environments. Means  $\pm$  SD are given (ranges in brackets).

Habitat	п	Elevation (m)	% Farmland	% Forest	% Alpine
Alpine	44	$2063\pm325$	2.94 ± 8.81 (0-	$9.65 \pm 13.87$	84.98 ± 16.44
(natural grasslands, alpine		(1,180-2,710)	36)	(0-45)	(51-100)
meadows, moors, and bare rocks)					
Forest	46	$1445\pm365$	$11.92 \pm 12.75$	$67.77 \pm 12.95$	$17.18 \pm 14.18$
(coniferous and broad-		(590-2,020)	(0-42)	(51-98)	(0-44)
leaved/coniferous forests)					
Mixed	21	$1300\pm424$	$27.33 \pm 17.18$	$40.66 \pm 6.54$	$24.00\pm18.49$
(forests with significant proportion		(380-2,030)	(0-50)	(29-50)	(0-49)
[>50%] of open habitat)					
Farmland	20	$949\pm394$	$67.95 \pm 12.17$	$21.04 \pm 14.01$	2.27 ± 4.87 (0-
(pastures, non-irrigated arable land,		(390-1,980)	(51-92)	(0-42)	20)
crops-mosaics, and vineyards)					

- *Table 2.* Temporal diversity metrics (mean  $\pm$  SD) for bird communities in the Swiss Alps estimated
- 1017 over a 20-yr period. Results of ANOVA analyses testing for the existence of habitat differences are
- 1018 given at the bottom.

				1022
	Gains	Losses	Turnover	Rate of
			rate	change
Alpine	$0.15\pm0.04$	$0.14\pm0.04$	$0.29\pm0.07$	$0.47 \pm 0.54$
				1025
Forest	$0.13\pm0.02$	$0.12\pm0.01$	$0.24\pm0.06$	$0.79 \pm 0.72$
				1027
Mixed	$0.12\pm0.01$	$0.12\pm0.01$	$0.25\pm0.04$	$0.87\pm0.58$
Farmland	$0.12\pm0.03$	$0.11\pm0.03$	$0.24\pm0.03$	$0.66\pm0.34$
	$F_{3,127} = 4.63$	$F_{3,127} = 6.78$	$F_{3,127} = 8.38$	$F_{3,127} = 3.04$
	p<0.01	p<0.001	p<0.001	p = 0.03

1028 *Table 3.* Synchrony and community stability metrics (mean  $\pm$  SD) for Alpine bird communities

1029 estimated over the period 1999-2018, and results of analyses testing for a linear relationship with

1030 elevation and differences among habitat categories. The average number of species per plot is given in

1031 brackets. Metrics were computed by using both the standard method (a) and the three-term local

1032 variance (*T3*) approach (b) proposed by Lepš et al. (2019) to filter out the pervasive effects of

1033 directional trends on community synchrony (see main text for more details).

1034

	Habitat type				Analyses		
	Alpine (34)	Forest (55)	Mixed (59)	Farmland (57)	<i>Relationship</i> with elevation (*: quadratic term; **: cubic term)	Habitat differences	
(a) Standard	l approach					•	
φ Loreau & de Mazancourt's <i>phi</i>	$0.20 \pm 0.12$	0.22 ± 0.14	0.15 ± 0.11	$0.14 \pm 0.08$	t = 1.69 p = 0.09 $t^* = -1.92$ p = 0.057 $t^{**} = 2.20$ p = 0.029	$F_{3,126} = 2.79$ p = 0.04	
η Gross et al' <i>eta</i>	$0.19 \pm 0.12$	$0.23 \pm 0.10$	$0.18\pm0.11$	$0.18\pm0.08$	t = 0.59 p = 0.56	$F_{3,126} = 1.54$ p = 0.21	
$\eta_{w}$ Blüthgen et al' weighted <i>eta</i>	0.33 ± 0.18	$0.44 \pm 0.15$	$0.34 \pm 0.15$	$0.34 \pm 0.15$	t = -0.05 p = 0.96	$F_{3,126} = 3.76$ p = 0.01	
Log- transformed Schluter' variance ratio	$0.84 \pm 0.47$	1.59 ± 0.48	$1.28 \pm 0.48$	$1.28 \pm 0.48$	t = 3.06 p < 0.01 $t^* = -3.87$ p < 0.001	$F_{3,126} = 14.06$ p < 0.001	
Stability	5.45 ± 2.17	$5.62 \pm 2.17$	$7.31 \pm 2.87$	$7.23 \pm 3.19$	t = -3.26 p = 0.001	$F_{3,126} = 4.85$ <i>p</i> < 0.01	
(b) Three-term	local variance (T3	3) approach					
φ Loreau & de Mazancourt's <i>phi (T3)</i>	$0.15 \pm 0.09$	$0.15 \pm 0.08$	0.11 ± 0.05	$0.11 \pm 0.08$	t = 2.38 p = 0.02	$F_{3,126} = 2.37$ p = 0.07	
$\begin{array}{c} \eta \\ \text{Gross et al' } eta \\ (T3) \end{array}$	$0.12 \pm 0.08$	$0.17 \pm 0.08$	$0.13 \pm 0.06$	$0.13\pm0.07$	t = -0.42 p = 0.67	$F_{3,126} = 3.74$ p = 0.01	
η <sub>w</sub> Blüthgen et al' weighted <i>eta</i> ( <i>T3</i> )	$0.26 \pm 0.16$	$0.35 \pm 0.14$	$0.28 \pm 0.12$	$0.28 \pm 0.13$	t = -0.87 p = 0.38	$F_{3,126} = 3.38$ p = 0.02	
Log- transformed Schluter' variance ratio ( <i>T3</i> )	2.05 ± 0.84	4.00 ± 1.85	3.38 ± 1.44	3.19 ± 1.83	t = 11.21 p < 0.001 $t^* = -4.03$ p < 0.001	$F_{3,126} = 13.8$ p < 0.001	

1035

- 1037 Table 4. Results of decomposing overall synchrony estimated for each habitat type into two different
- 1038 components: the component due to long-term trends ( $S_{\text{trend}}$ ) and the effect beyond these trends
- 1039 (*S*<sub>detrended</sub>). Values given in brackets denote the percentage of communities with negative values.
- 1040
- 1041
- 1042

	$S_{ m trend}$	$S_{ m detrend}$
Alpine	$0.55\pm0.12$	$1.07\pm0.12$
	(23%)	
Forest	$1.71\pm0.14$	$2.77\pm0.10$
	(22%)	
Mixed	$1.04\pm0.11$	$2.35\pm0.11$
	(43%)	
Farmland	$1.24 \pm 0.08$	$1.94\pm0.08$
	(15%)	

# SUPPLEMENTARY MATERIAL FOR

1045Spatial heterogeneity in temporal dynamics of Alpine bird1046communities along an elevational gradient

1047

by Vicente García-Navas, Thomas Sattler, Hans Schmid and Arpat Ozgul

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1052 Table S1. Results of ANOVA Type-II Sums of Squares models testing for the effect of elevation and

1053 habitat type on different metrics of temporal dynamics for bird communities in the Alps. In those

1054 cases in which there was a significant interaction (indicated with double asterisk), we performed

- 1055 Type-III SS models.
- 1056

	Metric	Elevation	Habitat	Elevation×Habitat
Temporal	Temporal turnover	$F_{1,122} = 0.17$	$F_{3,122} = 5.00$	$F_{3,122} = 1.45$
dynamics		<i>p</i> = 0.67	<i>p</i> <0.01	p = 0.23
	Rate of community	$F_{1,122} = 7.81$	$F_{3,122} = 1.45$	$F_{3,122} = 1.31$
	change	<i>p</i> <0.01	p = 0.23	p = 0.27
	Estimated extinction	$F_{1,121} = 0.02$	$F_{3,121} = 5.53$	$F_{3,121} = 1.03$
	rate	p = 0.87	<i>p</i> <0.01	p = 0.38
Community	φ Loreau & de	$F_{1,122} = 11.72$	$F_{3,122} = 4.05$	$F_{3,122} = 3.83$
synchrony and	Mazancourt's phi**	<i>p</i> <0.001	<i>p</i> <0.01	p = 0.01
stability	η	$F_{1,122} = 0.84$	$F_{3,122} = 1.70$	$F_{3,122} = 1.12$
	Gross et al' eta	p = 0.36	p = 0.17	p = 0.34
	$\eta_{\rm w}$ Blüthgen et al'	$F_{1,122} = 0.48$	$F_{3,122} = 3.89$	$F_{3,122} = 0.94$
	weighted eta	<i>p</i> = 0.49	<i>p</i> = 0.01	p = 0.42
	Log-transformed	$F_{1,122} = 0.31$	$F_{3,122} = 9.48$	$F_{3,122} = 2.14$
	Schluter' variance	p = 0.57	<i>p</i> <0.001	p = 0.10
	ratio			
	Stability	$F_{1,122} = 2.18$	$F_{3.122} = 2.00$	$F_{3,122} = 1.08$
		p = 0.14	p = 0.11	<i>p</i> = 0.36
Relative	Raup-Crick beta	$F_{1,122} = 0.45$	$F_{3,122} = 4.85$	$F_{1,122} = 0.09$
contribution of	deviation	p = 0.50	<i>p</i> <0.01	<i>p</i> = 0.96
stochastic vs.	NST values**	$F_{1,121} = 30.98$	$F_{3,121} = 2.61$	$F_{3,121} = 6.06$
deterministic		<i>p</i> <0.001	p = 0.05	<i>p</i> <0.001
processes				

1058	Table S2. Correlation matrix showing the relationship between different metrics of synchrony viz.							
1059	Loreau & de Mazancourt's <i>phi</i> ( $\varphi$ ), Gross et al' eta ( $\eta$ ), Blüthgen et al' weighted eta ( $\eta_w$ ), log-							
1060	transformed Schluter' variance ratio (log $VR$ ), the three-term local variance (T3) version of each							
1061	metric, and species richness (SR).							
1062								
1063								
1064			arphi	η	$\eta_{ m w}$	log VR		
1065								
1066		φ						
1067		n	0.829***					
1068		''						
1069		$\eta_{ m w}$	0.835***	0.805***				
1070		log VR	0.530***	0.724***	0.774***			
1071		<i>T3</i>	0.616***	0.588***	0.582***	0.667***		
1072		SR	-0.358***	-0.129	-0.072	0.418***		
1073								
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- 1081 Figure S1. Plot showing the relationship between elevation and estimated extinction rates for bird
- 1082 communities in the Swiss Alps over the period 1999-2018. Extinction rates increases sharply between
- 1083 1,500 and 2,000 and then decreased gain leading to a cubic pattern (estimated extinction rate
- 1084 elevation: t = -3.11, p < 0.01; elevation<sup>2</sup>: t = 3.50, p < 0.001; elevation<sup>3</sup>: t = -3.57, p < 0.001). Each
- 1085 point corresponds to a different study plot, which is colored according to the habitat type it belongs to
- 1086 (orange: farmland; grey: mixed; green: forest; blue: alpine).
- 1087



*Figure S2.* Relationship between estimated extinction rates for (a) ground-dwelling and (b) arboreal1090species, and elevation. The relationship followed a quadratic and cubic pattern, respectively (*arboreal*1091elevation: t = 2.44, p = 0.016; ground-dwelling elevation: t = 2.14, p = 0.03; elevation<sup>2</sup>: t = -1.69, p =10920.09).



- *Figure S3.* Level of synchrony (*phi*) in species abundances within a community over time estimated
  following the Loreau & de Mazancourt's method plotted against elevation. Each point corresponds to
  a different study plot, which is colored according to the habitat type it belongs to (orange: farmland;
  grey: mixed; green: forest; blue: alpine).

