Mechanisms driving interspecific variation in regional synchrony of trees reproduction

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25 Authorship statement

²⁶ All authors designed the study. JSz, AHP, VJ analysed the data. MB drafted the manuscript.

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28 Summary

Seed production in many plants is characterized by large interannual variation, which is synchro-29 nized at subcontinental scales in some species but restricted to local scales in others. The extent 30 of reproductive synchrony affects animal migrations, trophic responses to resource pulses, and 31 the planning of management and conservation. Spatial synchrony of reproduction is typically 32 attributed to the Moran effect, but this alone is unable to explain interspecific differences in syn-33 chrony. We show that interspecific differences in the conservation of seed production-weather 34 relationships combine with the Moran effect to explain variation in reproductive synchrony. 35 Conservative timing of weather cues that trigger masting allows populations to be synchronized 36 at distances > 1000km. Conversely, if populations respond to variable weather signals, syn-37 chrony cannot be achieved. Our study shows that species vary in the extent to which their weather 38 cueing is spatiotemporally conserved, with important consequences, including an interspecific 39 variation of masting vulnerability to climate change. 40 41

42 Introduction

Populations fluctuate in synchrony over large areas, which affects regional ecosystem functioning 43 (Bjørnstad et al., 2002; Ostfeld & Keesing, 2000; Earn et al., 2000; Liebhold et al., 2004). 44 One ecological phenomenon often associated with subcontinental spatial synchrony is seed 45 production in perennial plants, especially those that mast (LaMontagne et al., 2020; Koenig 46 & Knops, 2000). Masting is synchronous and interannually variable seed production by a 47 population of perennial plants (Kelly, 1994; Pesendorfer et al., 2021). The variable allocation 48 of resources associated with masting affects plant growth, population dynamics of plants and 49 animals, carbon stocks, and disease risk (Clark et al., 2019; Lauder et al., 2019; Pearse et al., 50 2021; Bregnard et al., 2021). Synchrony in seed production can extend between populations, 51 in some cases to subcontinental scales (LaMontagne et al., 2020; Bogdziewicz et al., 2021a). 52 However, large interspecific differences exist. In some species masting synchrony extends 53 across entire ranges (>1500 km), but in others synchrony is local (<100 km) (Koenig & Knops, 54 2000; Suzuki et al., 2005; Masaki et al., 2020). While the among-species variation in regional 55 seed production synchrony is well evidenced (Fig. 1), the mechanisms behind these differ-56 ences remain unknown. Yet, the variation in synchrony is important as it affects the spatial 57 scale of population outbreaks and collapses (Curran & Webb, 2000; Ostfeld & Keesing, 2000), 58 animal migrations (Zuckerberg et al., 2020), enhances gene flow promoting adaptation (Kremer 59 et al., 2012; Dale et al., 2021), affects regional forecasting of risk from Lyme disease and 60 hantavirus by rodents dependent on mast (Bregnard et al., 2021; Rubel & Brugger, 2021), and 61 the planning of management and conservation in forests (Pearse et al., 2021). Our study presents 62 new mechanisms responsible for interspecific differences in the extent of spatial synchrony in 63 masting. 64 The current consensus is that the driver of the regional synchrony of masting is the Moran 65 effect, i.e. spatial synchrony results from environmental entrainment (Haynes et al., 2013; Ascoli 66 et al., 2017; Koenig & Knops, 2013; Wion et al., 2020). Specifically, annual reproductive in-67 vestment is regulated by weather cues which plants use to maintain synchronous variation in 68 reproduction within populations (Kelly et al., 2013). The mechanisms underpinning the cues 69 vary between species, but examples include temperature-related regulation of flowering effort 70 and weather-dependent pollination success during flowering (Smaill et al., 2011; Koenig et al., 71

⁷² 2015). The spatial synchrony of reproductive effort then results from the spatial synchrony



Figure 1: Interspecific variation in regional synchrony of seed production in the northern hemisphere. Polygons at a) are drawn based on the spatial distribution of the seed production data for each species; color codes shown on b). Lines at b) are Mantel correlograms for each species. Full shapes indicate significant Mantel correlations. This figure is intended to present among species variation in the spatial synchrony of masting, and is not part of the analysis of the current study. A subset of species with the highest spatiotemporal resolution of seed production data was selected for further analysis (see Methods). Data derived from MASTREE+.

⁷³ of these weather cues (the Moran effect), and the spatial decay in masting synchrony often

parallels the spatial decay in synchrony of its cues (Koenig & Knops, 2013; LaMontagne et al.,

⁷⁵ 2020; Bogdziewicz *et al.*, 2021a; Wion *et al.*, 2020). Another potential driver of synchrony in

⁷⁶ masting is pollen coupling, but it does not appear to play a major role as a driver of regional

⁷⁷ (among-populations) masting synchrony (Koenig & Knops, 2013; Bogdziewicz *et al.*, 2021a;

⁷⁸ Wion *et al.*, 2020; LaMontagne *et al.*, 2020). The extent of regional synchrony in reproduction

⁷⁹ varies greatly among species, and this interspecific variation remains unexplained. For example,

the spatial synchrony of seed production in Fagus sylvatica and Picea glauca shows spatial

decay that parallels spatial decay in synchrony of summer temperatures at distances up to 1500

- ⁸² km (LaMontagne *et al.*, 2020; Bogdziewicz *et al.*, 2021a; Vacchiano *et al.*, 2017). In contrast,
- ⁸³ in other, often sympatric species such as oaks *Quercus petraea*, seed production synchrony can ⁸⁴ disappear at distances less than 400 km (Bogdziewicz *et al.*, 2019; Fernández-Martínez *et al.*,
- ⁸⁴ disappear at distances less than 400 km (Bogdziewicz *et al.*, 2019; Fernández-Martínez *et al.*, ⁸⁵ 2017). If the regional synchrony of weather conditions is largely similar, then what drives the
- interspecific variation in the spatial synchrony of seed production?
 and production in the spatial synchrony of seed production?
- ⁸⁶ Interspecific variation in the spatial synchrony of seed production?
- ⁸⁷ We propose that the spatiotemporal variation in weather cues that determine annual repro-

ductive investment across populations drives the interspecific differences in regional synchrony 88 of masting. Our logic has the following steps. First, the Moran effect drives the regional syn-89 chrony of masting (Vacchiano et al., 2017; LaMontagne et al., 2020). Second, species differ in 90 the spatiotemporal variation of seed production-weather relationships. A recent study detected 91 remarkable stability of the temporal window when beech trees are sensitive to cues that trigger 92 reproduction (Bogdziewicz et al., 2021b). Despite great differences in climate among sites 93 (mean summer temperatures range: 13.84 – 15.77 °C), and a significant warming trend (1°C 94 over 40 years) the timing when beech trees were responding to weather cues was generally 95 consistent across populations and decades (Bogdziewicz et al., 2021b). We suggest that the 96 conserved temporal window when populations of beech sense the environment to determine 97 the extent of annual reproduction allows distant populations to remain highly synchronous. In 98 species with lower regional synchrony, the timing of when trees are sensitive to environmental 99 signals will change among populations. For example, the temporal window of the weather cue 100 may shift towards earlier in the year in warmer climates, similar to the advance in bud break 101 or flowering with warming (Fu et al., 2015; Zohner et al., 2016). Due to the temporal vari-102 ation that we hypothesize exists in such species, the regional synchrony deteriorates, because 103 the temperature is well correlated in space but less so in time. For example, across a region, 104 unusually hot temperatures in March can trigger masting in populations that are sensing cues 105 at that time. Simultaneously, low temperatures in April will translate to small seed production 106 in populations whose sensitive period was delayed to that month, creating asynchrony among 107 those populations. 108

To test our theory, we used beech (Fagus sylvatica), Norway spruce (Picea abies), and 109 oaks (Quercus robur and Q. petraea). We first examined the extent of regional synchrony of 110 masting and the synchrony of weather cues previously recognized to be important for these 111 focal species, i.e. temperature in summer in beech and spruce, and temperature in spring for 112 oaks (Vacchiano et al., 2017; Caignard et al., 2017; Moreira et al., 2021). We predicted that 113 regional synchrony of temperature in all populations should be similarly high (Koenig & Knops, 114 2013). Masting synchrony should be high in beech (Bogdziewicz et al., 2021a), and lower in 115 oaks (Bogdziewicz et al., 2019; Fernández-Martínez et al., 2017), and remains to be determined 116 in Norway spruce. We explored the spatiotemporal stability of the weather-seed production 117 relationships by searching for the periods when the correlation between seed production and 118 temperature was the highest. According to our theory, the period should be relatively stable 119 across populations in beech, but not in oaks. In Norway spruce, the spatiotemporal conservation 120 of the weather-seed production relationships should be either high (if regional masting synchrony 121 is high) or low (if regional masting synchrony is low). In the final step, we estimated the spatial 122 synchrony of the cues actually used by each population, i.e., the synchrony of the weather-123 sensitive period revealed for each population in our moving window correlation analysis. That 124 temporally-adjusted synchrony of weather should reassemble the synchrony of seed production 125 across species, which should be especially relevant for less synchronous species like oaks. By 126 uncovering the spatiotemporal variation in weather cueing and its role in creating regional mast-127 ing synchrony, our study adds a key new brick to our understanding of proximate mechanisms 128 of mast seeding. 129

Material and Methods

131 Data

Seed production data: MASTREE+ We extracted data from the MASTREE+, a database of
 annual variation in plant reproductive effort from six continents. A key step of our analysis is

data-hungry, as it requires long, temporally overlapping time series that do not include missing 134 values. We, therefore, limited the analysis to species for which appropriate data were available: 135 European beech (Fagus sylvatica), common oak (Quercus robur), sessile oak (Q. petraea) and 136 Norway spruce (*Picea abies*) (Fig.2). We pooled acorn production data for (*Q. robur* and *Q.* 137 petraea) and analyzed the data on Quercus at the community level. We pooled them because, for 138 a number of populations, the specific oak species was not reported. Both species have similar 139 biology and ecology, seed production is expected to be correlated with spring temperatures, and 140 their seed production in our data was highly correlated (sympatric populations synchrony: r =141 0.77). Separating the two oak species provides qualitatively the same results (Table S4). 142



Figure 2: Sites location for beech, Norway spruce, and oaks from MASTREE+. A subset of that data was used in the moving window analysis (see Figure S1).

When characterizing the scale of synchrony in seed production, we used time series from the period 1954-2020 (beech) or 1954-2019 (oaks and spruce), while for all other analyses we used time series limited to 10-years (1995-2004) that included continuous, overlapping data records that provided highest possible spatial coverage. We used records of reproductive output measured on a continuous scale and excluded records of annual flower or pollen production, or tree-ring-based mast year reconstructions. The data used in this study are summarised in Table S1, and presented in Fig.2 and Fig.S1.

Weather data Daily weather data for each site were obtained from the corresponding 0.1° grid cell of the E-OBS dataset (Cornes *et al.*, 2018).

152 Analysis

Regional synchrony and its drivers We started by characterizing the scale of regional synchrony in our populations with Mantel correlograms. That procedure was repeated for seed production and for the weather cues previously reported to be the main seed production drivers in each species, i.e. summer (June-July) mean max temperature for beech (Piovesan & Adams, 2011; Vacchiano *et al.*, 2017), mean July temperature in Norway spruce (Moreira *et al.*, 2021), and mean April temperature in oaks (Caignard *et al.*, 2017).

To test the role of weather variation in driving the spatial synchrony of masting, we used the Multiple Regression Quadratic Assignment Procedure with Double-Semi-Partialing (MRQAP)

(Dekker *et al.*, 2007). The MRQAP is a modeling framework that allows investigation of the 161 relationship between a dependent matrix and independent matrices while considering the non-162 independence of relational data by using permutation techniques to test the significance of effect 163 sizes (Dekker *et al.*, 2007). We first created relatedness matrices where the elements were the 164 synchrony in seed production and weather and spatial distance for all pair-wise combinations of 165 locations. Synchrony in seed production and weather was calculated as the Spearman pairwise 166 correlation coefficients for all time series with at least 5 years of overlap. Spatial distance 167 values were calculated as the geodesic distance between all sites on a WGS84 ellipsoid. Next, 168 we investigated the roles of environmental factors in driving spatial synchrony by fitting a 169 separate MRQAP model for each species where explanatory matrices were spatial proximity 170 and synchrony in weather cues. The models were fitted using the asnipe R package and statistical 171 significance was assessed based on t-statistics and 1000 permutations (Farine, 2013). 172

Spatiotemporal stability of weather cues: moving window correlations We explored the 173 spatiotemporal stability of the weather-seed production relationships using a moving-window 174 approach. For each site-species, we tested seed production-weather relationships by calculating 175 correlations between seed production and the focal weather cue in 60-day (beech) or 30-day 176 (Norway spruce, oaks) windows for one and two years prior to the year of seed production 177 (beech, Norway spruce), or the year of seed production (oaks). Timing of cues followed well-178 established literature on the subject (Piovesan & Adams, 2011; Vacchiano et al., 2017; Caignard 179 et al., 2017; Zamorano et al., 2018; Moreira et al., 2021). We constructed an algorithm that 180 slides a moving window through the daily climate data, calculating the mean of the 30 or 60 181 daily observations. The function then calculated the correlation between the calculated mean 182 temperature at the window and the seed production at daily time steps. This method allowed 183 us to investigate the seasonal peaks in the relationships between seed production and seasonal 184 weather cues without being constrained by the timing of calendar months (i.e. monthly climate 185 data). This approach was designed to explore whether the weather cue of masting was shifting 186 over time and space. 187

Spatiotemporal variability of weather cues and regional synchrony To test if the spatiotemporal variability in the weather cues described for each species in the previous step is responsible for interspecific variation in regional synchrony, we re-run the MRQAP models. Here, we replaced the matrices of weather synchrony calculated on weather anchored to a species-specific calendar month with the population-specific cue revealed in the moving window correlations analysis.

Results

The extent of regional masting synchrony clearly differed among the studied species. The spatial 195 synchrony was highest in beech (mean pairwise Spearman rank correlation and 95% CI: 0.33, 196 (0.32 - 0.34) and noticeably lower in Norway spruce (0.21, 0.19 - 0.23) and oaks (0.20, 0.18 - 0.34)197 0.22) (Fig. 3). At the same time, spatial synchrony of the weather cues, i.e. of summer (in the 198 case of beech and spruce) and spring (oaks) temperatures, was uniformly high and similar in all 199 species (Fig. 3). Synchrony decreased with distance among sites. In all species, the MRQAP 200 indicated that the spatial synchrony in masting is higher among sites for which weather variation 201 is more synchronous (Table S2). 202



Figure 3: Spatial correlation in seed production and weather. Lines are Mantel correlograms for each species. Full circles indicate significant Mantel correlations. The vertical line highlights the difference in seed production (or lack of it in case of weather) synchrony at 500 km. The weather synchrony is summer (June-July) mean max temperature in beech, mean July temperature in Norway spruce, and mean April temperature for oaks. The time series are from the period 1954-2020 (beech) or 1954-2019 (oaks and spruce), sample size provided in Table S1. Mantel correlograms were cut at 1500 km due to a limited sample size above that distance.

Moving window correlations indicated differences in spatiotemporal conservation of seed 203 production - weather relationships among species. In accordance with our predictions, seasonal 204 peaks in relationships between seed production and seasonal weather cues were conserved in 205 beech (Fig. 4). Despite >10° latitudinal difference in locations among beech populations 206 that translated into $>10^{\circ}$ C difference in mean annual temperatures (Fig. S3), the strongest 207 relationships between seed production and seasonal weather cues occurred in the June-July 208 period at the majority of sites. The stability was especially clear for the negative correlation 209 with June-July temperature in year T-2. In contrast, seasonal peaks in relationships between 210 seed production and seasonal weather cues were less conserved in oaks and Norway spruce 211 (Fig. 4). Consistent timing of cue was generally absent in oaks, with populations responding 212 to winter, spring, and summer temperatures, depending on the location (Fig. 4). In Norway 213 spruce, several populations responded consistently to temperatures in June-July (year T-1), 214 although for a number of populations the strongest signal occurred in spring or autumn (Fig. 4). 215 Within species, the variation in climate among sites did not correlate with the timing of in seed 216 production - weather relationships (Table S3). 217

In the final step of our analysis, we re-run the MRQAP models using temporally-adjusted weather synchrony matrices. The goal of that analysis was to test whether adjusting for amongsite temporal differences in cues can help explain the interspecific differences in regional synchrony among species. The temporal adjusting improved model fit for all species, with clear interspecific differences. In beech, temporal adjusting of the cue had a small impact on the proportion of the variance in regional masting synchrony explained by weather synchrony (by a factor of 1.25; Table 1). The improvement was clearly higher in spruce (by a factor of 1.9), and



Figure 4: Spatiotemporal variation in seed production – weather cues correlations. Correlations are reported as the start DOY for the seasonal cues (y -axis) either T -2 and T-1 (beech and Norway spruce) or T (oaks) years before seed production, and the site location ordered by latitude (x -axis). The band highlighted by horizontal dashed lines in the figures indicates the 60- (beech, June-July) or 30- (Norway spruce; June, oak; April) day window of fixed weather cues. The strongest correlations as indicated by sliding windows are highlighted with vertical lines (vertical line length matches the length of the time window).

improved dramatically, i.e. by a factor of ten, in oaks (Table 1). Once the synchrony of weather
was adjusted temporally, its spatial decay reassembled the spatial decay of masting synchrony,
which was strikingly clear in oaks (Fig. 5, Fig. S2).

Discussion

Spatiotemporal conservation of the seed production - weather relationships explains interspecific 229 variation in the extent of regional synchrony of mast seeding. Regional synchrony of masting 230 in beech was about 1.5 higher compared to other studied species. At the same time, beech 231 was characterized by remarkably conservative timing of weather cues. Despite large spatial and 232 climatic distances among studied populations, the strongest correlation between seed production 233 and temperature in beech populations consistently occurred in the same summer months. In 234 turn, regional synchrony of masting was limited in oaks and Norway spruce. Oaks and spruce 235 lack conservative timing in seed production - weather relationships across populations. Our 236 study offers three major and novel results. First, large variation in the timing of weather cues 237 exists in masting trees and offers solutions to long-standing questions in the discipline. Second, 238 species vary in the extent to which their weather cueing is conserved in time and space, with 239 consequences that may reach beyond those described here, including an interspecific variation 240 of masting vulnerability to climate change. Third, the spatiotemporal stability of weather cueing 241



Figure 5: Relationship between weather synchrony and masting (seed production) synchrony in beech, Norway spruce, and oaks. Points show pairwise synchrony between populations, with weather synchrony calculated in either fixed time windows or temporally-adjusted time windows as revealed by moving windows analysis (Fig. 4). That analysis was run on a dataset limited to time series with 10 years of overlapping, continuous data records (see Methods). An alternative version of this Figure, with Mantel correlograms, is shown in Fig. S2.

²⁴² is a major mechanism determining the regional synchrony of masting.

A key question is whether a factor exists that would allow predicting which species have 243 stable spatiotemporal weather cueing. At least two, mutually non-exclusive, hypotheses can be 244 formulated. First, plant phenology, such as the timing of leaf out or flowering, is determined 245 by two major cues: temperature and photoperiod (Flynn & Wolkovich, 2018; Fu et al., 2019). 246 Species differ in their sensitivity to these cues (Körner & Basler, 2010; Flynn & Wolkovich, 247 2018). For example, beech is highly photoperiod sensitive (Vitasse & Basler, 2013), while 248 Norway spruce and oaks are less so (Zohner & Renner, 2015); experimental short-day conditions 249 delayed budburst in beech for 41 days, while had no impact on budburst in Norway spruce 250 (Zohner & Renner, 2015). In another experiment, common oak leaf-out phenology showed 251 low sensitivity to photoperiod, compared to high sensitivity in beech (Laube et al., 2014; 252 Zohner et al., 2016). Experiments in the mast-seeding grass Chionochloa rigida indicated that 253 promotion of flowering by high temperatures occurred only on long days (>14 h) (Mark, 1965). 254 Thus, the timing of masting cues in some species may be linked to certain photoperiod lengths, 255 limiting the regional variation in cue timing. In that context, studies exploring the phenology of 256 hormone secretion that are responsible for floral initiation and its dependency on photoperiod 257 appear an important avenue for future research (Satake & Kelly, 2021). 258

The weather cues' effects on seed production could be also spatiotemporally consistent

Table 1: Proportion of variance in regional masting synchrony explained by the MRQAP models that included weather synchrony matrix as explanatory variables. In the uncorrected model, the weather synchrony matrix includes temperatures from the same time window across sites (e.g. June-July temperature in beech, see Methods). In the corrected model, we used the seasonal peaks in relationships between seed production and weather cues, identified for each site-species with moving windows correlations. That analysis was run on a dataset limited to time series with 10 years of overlapping, continuous data records (see Methods).

	Uncorrected	Temporally-	R2
Species	model	corrected model	improvement
Beech	32%	40%	1.25
Oaks	3%	31%	10.33
Norway spruce	20%	38%	1.9

among populations in species in which one factor dominates the determination of seed production 260 (Bogdziewicz et al., 2019; Koenig et al., 2020). In beech, that major factor could be flowering 261 extent determined by temperatures during secretion of flowering hormones (Vacchiano et al., 262 2017; Satake et al., 2019). In other species, multiple factors can have similarly important effects 263 on seed production, including winter temperatures that determine resource levels (Wu et al., 264 2019; Harvey et al., 2020), spring temperatures that determine pollination efficiency (Koenig 265 et al., 2015; Schermer et al., 2019), and summer temperatures that determine seed abortion 266 (Pérez-Ramos et al., 2010; Girard et al., 2012). Such species can lack a consistent dominant 267 weather cue across the entire range; the dominant, population-specific weather cue will be 268 determined by local conditions. Past studies suggested that for oaks, spring-temperature effects 269 on pollination are more important in moist habitats, while drought-driven acorn abortion is 270 more important in arid habitats (Bogdziewicz et al., 2017; Nussbaumer et al., 2021). Thus, two 271 mechanisms may be at work: stable phenology of the same weather cue (e.g. beech) and varying 272 dominance of different weather cues depending on local conditions (e.g. oaks). 273

Our study recognizes that limiting weather cues to species-specific time windows is over-274 simplistic, especially in the category of species to which oaks and Norway spruce fell in our study. 275 The important role of weather variation in driving seed production in masting plants is widely 276 recognized (Pearse et al., 2016). Early studies in that subject were characterized by the wide 277 search for correlates, with mechanisms often assigned post-hoc, resulting in incremental progress 278 (Crone & Rapp, 2014). However, recent years brought important progress in the understanding 279 of the mechanistic links between weather variation and seed production (Pesendorfer *et al.*, 2016; 280 Samarth et al., 2021). Oaks are a notable example. Effects of spring temperatures on acorn 281 production arise through variation in weather-driven synchrony of flowering among trees that 282 determines pollination efficiency (Schermer et al., 2020; Pearse et al., 2015; Koenig et al., 2015). 283 Yet, even in this well-studied species, the driver of the flowering synchrony is still disputed 284 (Bogdziewicz et al., 2020b; Koenig et al., 2015). According to the photoperiod-sensitivity 285 hypothesis, the period when the temperature is important can be months before flowering occurs 286 (Bogdziewicz et al., 2020b), while the temperature during flowering is important according to 287 the micro-climatic hypothesis (Koenig *et al.*, 2015). As the flowering period can move by itself 288 several weeks among years (Zohner et al., 2018), it is perhaps unsurprising that anchoring the 289 weather cue to a specific calendar period is overly coarse. In fact, our results imply that the 290 seeding-weather relationships can be even more complicated. Seed production in some oak 291 populations was not primarily driven by spring temperatures, as predicted by the phenological 292 synchrony hypothesis (Koenig et al., 2015), but by winter or summer temperatures. The variation 293

in the timing of the signal lacked a clear climatic pattern. Perhaps site characteristics, such as 294 soil conditions, density, or stand age, that affect reproductive investment (Journé et al., 2022; 295 Pesendorfer et al., 2020; Qiu et al., 2022), would help to structure the variation in the timing 296 of strongest weather cues among populations. The mechanisms described here provide a sub-297 stantial improvement in our understanding of proximate mechanisms driving regional masting 298 synchrony, but substantial variation remains unexplained. We now know that spatiotemporal 290 variation in weather cueing exists, and its extent is species-specific and ecologically important, 300 which opens new venues for future research. 301

The spatiotemporal variation in weather cueing we uncovered is likely to be important in 302 the global change ecology of tree reproduction. In European beech, global warming led to 303 a breakdown in interannual variation and synchrony of masting that translated into dramatic 304 increases in seed predation and pollination failure (Bogdziewicz et al., 2020a). In these pop-305 ulations, warming increased the frequency of summer weather cues. In consequence, trees' 306 responses to the weather cue weakened, and interannual variation and synchrony of seed pro-307 duction declined (Bogdziewicz et al., 2021b). From that perspective, the conservation of cues 308 may prove to be a major determinant of the species-specific masting responses to warming. On 309 one hand, the conservative cueing phenology in European beech prevented the species from 310 shifting the temperature-sensitive period to earlier in the year, which might otherwise have 311 enabled the species to compensate for the change in cueing frequency associated with warming 312 (Bogdziewicz et al., 2021b). Other species that are similarly conservative in the weather cueing 313 may also be as vulnerable to warming-caused masting breakdown as beech. On the other hand, 314 unconservative species such as oaks could potentially shift the sensitive periods to compensate 315 for the eventual change in cueing frequency (Schermer et al., 2020). Exploring that hypothesis 316 will require multidecadal-long series of reproduction monitoring that are increasingly available. 317 In summary, we found that the spatiotemporal stability of the seed production - weather 318 relationships is responsible for interspecific variation in the regional synchrony of mast seeding. 319 With that discovery in hand, we may now search for species traits that determine what makes 320 a species spatiotemporally stable or not in weather cuing. The ecological consequences of the 321 interspecific variation in regional synchrony of masting are diverse and potentially great. For 322 example, reforestation strategies widely planned to mitigate climate change (Walker et al., 2022) 323 require a large seed supply that is difficult to meet, especially in masting species (Kettle et al., 324

³²⁵ 2010; Whittet *et al.*, 2016; Jalonen *et al.*, 2018). Species characterized by large-scale regional ³²⁶ synchrony will share nil seed production years over entire subcontinents, which requires planning ³²⁷ to stabilize the supply of seeds to nurseries (Kettle *et al.*, 2010). The good news here is that highly ³²⁸ synchronized beech reproduction consistently depends on clearly defined weather cues even in ³²⁹ distant populations. Therefore, masting forecasts that are based on weather variation might

³³⁰ be relatively easy to develop in such species (Pearse *et al.*, 2021; Chiavetta & Marzini, 2021).
 ³³¹ However, in the case of species like oaks or spruce, weather-based forecasting will require the
 ³³² identification of the population-specific weather drivers, a task that currently requires expensive
 ³³³ long-term monitoring of seed production.

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- 338
- **Competing interests**

³⁴⁰ The authors declare no competing interests.

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Supplementary material

Table S1: Summary of dataset used in the study. *N for subset of data limited to timeserieswith 10 years of continuous data overlap.

Species	N time-series	N time-series*
Beech	148	60
Oaks	53	45
Norway spruce	89	39

Table S2: Multiple Regression Quadratic Assignment Procedure (MRQAP) models summaries that regressed the matrices of masting synchrony against matrices of distance among sites and matrices of weather synchrony.

	Beech	Norway spruce	Oaks
Intercept	4.82e01; p < 0.001	2.91e-01; p < 0.001	1.14e-01; p = 0.18
Distance	-3.08e-07; p < 0.001	-1.59e-07; p < 0.001	-2.18e-08; p = 0.74
Weather synchrony	1.41e-01; p < 0.001	7.99e-02; p = 0.037	2.07e-01; p = 0.002

Table S3: Results of generalized additive models that regressed series-specific start of optimal time window (i.e., for which seed production-weather relationship peaks) against series-level long-term mean temperature and precipitation.

	Beech	Norway spruce	Oaks
Long-term mean temperature	6.257; p = 0.068	4.51; p = 0.315	1.00; p = 0.765
Long-term mean precipitation	2.268; p = 0.132	1.00; p = 0.559	1.00; p = 0.957

Table S4: Proportion of variance in regional masting synchrony explained by the MRQAP models that included weather synchrony matrix as explanatory variables. In the uncorrected model, the weather synchrony matrix includes temperatures from the same time window across sites (i.e. April temperatures). In the corrected model, we used the seasonal peaks in relationships between seed production and weather cues, identified for each site-species with moving windows correlations.

	Uncorrected	Temporally-
Species	model	corrected model
Q. robur	12%	15%
Q. petraea	3%	32%



Figure S1: Sites location for beech, Norway spruce and oaks from MASTREE+ limited to sites with 10 years of overlapping, continuous data records used for moving window correlation analysis.



Figure S2: Spatial correlation in masting, weather, and temporally-adjusted weather patterns. The temporally-adjusted weather patterns show spatial synchrony of weather cues that appear actually used by trees as revealed by our moving windows analysis (Fig. 4). Lines are Mantel correlograms for each species. Full circles indicate significant Mantel correlations. That analysis was run on a dataset limited to time series with 10 years of overlapping, continuous data records (see Methods).



Figure S3: Spatiotemporal variation in seed production – weather cues correlations. Correlations are reported as the start DOY for the seasonal cues (y -axis) either T -2 and T-1 (beech, Norway spruce) or T (oaks) years before seed production, and the site location ordered by latitude (x -axis). The dashed lines in the figures indicate the 60-(beech, June-July) or 30- (Norway spruce; June, oaks; April) day window of fixed weather cues. The strongest correlations as indicated by sliding windows are highlighted with vertical lines.