

Spatiotemporal patterns of tree growth as related to carbon isotope fractionation in European forests under changing climate

Running head: Ecophysiology of forest growth in Europe

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Abstract

Aim

To decipher continent-wide spatiotemporal patterns of forest growth dynamics and their associations with carbon isotope fractionation processes inferred from tree rings as modulated by climate warming in Europe.

Location

Europe and North Africa (30–70°N, 10°W–35°E).

Time period

1901–2003.

Major taxa studied

Temperate and Euro-Siberian trees.

Methods

We characterize changes in the relationship between tree productivity and carbon isotope fractionation over the 20th century using a European network. Using indexed tree-ring widths (TRW_i), we assess shifts in the temporal coherence of radial growth (synchrony) for five forest ecosystems (Atlantic, Boreal, cold continental, Mediterranean and temperate). We also examine whether TRW_i shows increased coupling with leaf-level gas exchange, inferred from indexed carbon isotope discrimination in tree-ring cellulose ($\Delta^{13}\text{C}_i$), through enhanced stomatal regulation in response to amplified drought stress spreading northwards.

Results

We find spatial autocorrelation for TRW_i and $\Delta^{13}\text{C}_i$ extending over up to 1,000 km among forest stands. However, growth synchrony is not uniform across Europe, but increases along a latitudinal gradient concurrent with decreasing temperature and evapotranspiration. Latitudinally-structured relationships between TRW_i and $\Delta^{13}\text{C}_i$ (changing from negative to positive as latitude increased) point to drought impairing carbon uptake via stomatal regulation of water losses as the main mechanism underlying synchronous forest growth in continental Europe below 50°N. At the turn of this century, warming-induced effects on leaf physiology increased synchrony in tree growth among European forests to unprecedented levels over the last century.

110

111 *Main conclusions*

112 Increased growth synchrony from the first to the second half of the 20th century in
113 Mediterranean, temperate and cold continental forests, together with a tighter relationship
114 between TRW_i and $\Delta^{13}\text{C}_i$, indicate increasing drought effects on productivity across Europe.
115 Such recent tendency towards exacerbated moisture-sensitive forest growth could override a
116 positive effect of enhanced leaf intercellular CO₂ concentration, resulting in forthcoming
117 declines in forest carbon gain continent-wide.

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120 **Keywords:** carbon isotopes, climate change, dendroecology, drought stress, European forests,
121 latitudinal gradients, *Pinus*, *Quercus*, stomatal control, tree rings

Introduction

Understanding the physiological mechanisms underlying variations in forest productivity is a key priority in global change research. Factors such as tree age, forest structure and management, nutrient availability, pollution and disturbance regimes influence the carbon budget of forested areas. During the last decades, however, climate change and increased atmospheric CO₂ (atmCO_2) have largely altered the growth of natural forests (Nabuurs et al., 2013). To explore these dynamics, research efforts have been mainly confined to local ecosystems, with some representative woody species and their interactions examined at small spatial scales (Pivovarov et al., 2016). This approach is hampered by site-dependent effects and limited representativeness of environmental conditions. A comprehensive understanding of tree functioning is urgently needed across broad regions in order to assess the potential and limits of forest carbon uptake globally (Chown, Gaston, & Robinson, 2004). Through the analysis of meaningful functional traits (Violle, Reich, Pacala, Enquist, & Kattge, 2014), the interpretation of spatiotemporal patterns of forest growth variability can provide comprehensive insights into the environmental responses that may change forest's services for carbon storage in the next decades (Anderegg et al., 2016).

The mechanisms and processes influencing forest productivity are extremely variable (Gibert, Gray, Westoby, Wright, & Falster, 2016). Despite such complexity, regionally coherent multispecies responses have been linked to global change effects on forest ecosystems using tree-ring networks (Babst et al., 2013; Shestakova et al., 2016). Dendroecological studies rely on the presence of common signals archived in tree populations, which are often derived from ring-width series reflecting variations in environmental factors (Fritts, 2001). Alternatively, stable isotopes are proxies of ecophysiological traits that are valuable to assess plant carbon and water relations at large spatiotemporal scales (Werner et al., 2012; Frank et al., 2015). In particular, the carbon isotope discrimination ($\Delta^{13}\text{C}$) of tree rings reflect more directly the complex array of physiological responses to environmental conditions than classical dendrochronological traits such as ring-width (Treydte et al., 2007; Gessler et al., 2014). The ratio of the heavy to light carbon isotopes ($^{13}\text{C}/^{12}\text{C}$) of organic matter depends on factors affecting CO₂ assimilation, which is mainly controlled by photosynthetic rate (A) and stomatal conductance (g_s) (Farquhar, Ehleringer, & Hubick 1989). Hence, the interannual variation in $\Delta^{13}\text{C}$ can be evaluated and retrospectively related to leaf-level physiological processes (e.g., Andreu-Hayles et al., 2011; Shestakova, Aguilera, Ferrio, Gutiérrez, & Voltas, 2014). This is especially relevant in temperate forests thriving under near-optimal conditions, where tree growth patterns may not be informative of climate variability, but stable isotopes have been

shown to be sensitive to environmental variables (Hartl-Meier et al., 2015). Indeed, much complementary information can be gained by analysing carbon isotopes in addition to ring-widths (Cernusak & English, 2015), which together provide relevant evidence on how trees respond to climate change and increasing atmCO_2 (Andreu-Hayles et al., 2011; Saurer et al., 2014).

In drought-prone environments, tree-ring $\Delta^{13}\text{C}$ can be mainly related to the stomatal control of CO_2 fluxes into the leaf, integrating any environmental variable affecting stomatal conductance (Gessler et al., 2014). Under such conditions, radial growth and $\Delta^{13}\text{C}$ are bound together by two factors: stomatal regulation and water availability. However, $\Delta^{13}\text{C}$ is also affected by changes in photosynthetic activity associated with irradiance, phenology, nutritional stresses or N deposition when water becomes less limiting (Livingston et al., 1998). By combining ring-width and $\Delta^{13}\text{C}$, information can be gained on the array of tree performances that underlie biogeographical interactions, as these traits share spatial responses to drought events (Voelker, Meinzer, Lachenbruch, Brooks, & Guyette, 2014).

In the present study, we attempt to characterize the degree of dependence of stem growth on photosynthetic carbon isotope fractionation across European forests using a unique tree-ring network (Treydte et al., 2007). So far, only the isotope data of this network have been analysed, but not radial growth, nor the relationship between the two parameters. We used 20 chronologies from old trees comprising conifers (*Pinus*) and oaks (*Quercus*) spanning the 20th century and ranging from Mediterranean to Boreal latitudes (37°N to 69°N). Indeed, latitudinal gradients are extremely relevant for the analysis of large-scale patterns of trait variability and their relationships with ecosystem functioning (Violle et al., 2014). We hypothesise that, on a continental scale, (i) the temporal coherence of radial growth in forest trees is geographically structured, with more synchronous growth to be found among cold-limited, high latitude forests than among drought-prone, low-latitude forests (Shestakova et al., 2016); (ii) these patterns of synchrony are linked to the relative significance of carbon assimilation and stomatal control on growth determination, as reflected by relationships between ring-widths and $\Delta^{13}\text{C}$; and (iii) warming-induced drought stress triggers a tighter stomatal control of water losses which, in turn, enhances synchrony in low latitude forests owing to more coordinated physiological reactions to climate. On the basis of the joint analysis of radial growth and $\Delta^{13}\text{C}$, the assessment of spatiotemporal tree responses to environmental changes may improve our understanding of growth and physiology changes experienced by European forests throughout the 20th century.

Materials and methods

Tree-ring network

We used a tree-ring dataset from the pan-European network ISONET (European Union, EVK2-2001-00237), which is comprised of 20 sites and provides a comprehensive coverage of the biogeographic conditions that are found across Europe into northern Africa (Treydte et al., 2007) (Table 1). Sites consist of old-grown forests (mean age = 454 ± 196 years [SD]) from the two main genera in Europe (*Pinus* and *Quercus*) plus *Cedrus atlantica* (Morocco). The forests originate from semiarid (Mediterranean basin), humid temperate (western-central Europe), cold continental (north-central Europe) and subarctic (Fennoscandia) climates (Table 1). The sampled trees are temperate (*Quercus petraea*, *Q. robur*) and Euro-Siberian (*Pinus nigra*, *P. sylvestris*, *P. uncinata*) taxa, with sites distributed across most of their climatic ranges (Table 1). Sampled stands spread along broad latitudinal (from 32°58'N to 68°56'N) and altitudinal (from 5 m to 2,100 m a.s.l.) gradients, with high-elevation sites concentrated in southern Europe. Conifers are the dominant species in unmanaged cold Boreal or Mediterranean zones (i.e., high-latitude or high-elevation sites), whereas oaks are mainly found in humid western and central European lowlands. The distance between sites varies from about 50 km up to 4,500 km.

Increment cores were extracted from numerous trees at each site (Table S1), and tree rings were cross-dated and measured following standard dendrochronological procedures (Cook & Kairiukstis, 1990). As a proxy for above-ground woody biomass accumulation, basal area increment (BAI) for each stand was calculated as the bi-weight site mean of BAI of individual ring-width series. Temporal trends in the BAI chronologies were estimated through the slope (b) of the linear regression of BAI records on time. Indexed tree-ring width (TRW_i) and carbon isotope discrimination ($\Delta^{13}C_i$) chronologies were obtained by high-pass filtering and autocorrelation removal (see Appendix 1 in Supporting Information). Details on tree-ring network characteristics can be found in Appendix 2. The indexed ring-width and isotope chronologies were used as input for statistical analyses. The study period was 1901–2003.

Analysis of spatial variability of tree growth

Spatial structure of tree-ring traits and climatic signals across Europe

The temporal coherence of tree-ring signals (TRW_i , $\Delta^{13}C_i$) among sites was characterized to determine how far such coherence extends over Europe. To this end, correlation coefficients (r) between pairs of chronologies, calculated over the period 1901–2003, were regressed on their geographic distance using a negative exponential function for both TRW_i and $\Delta^{13}C_i$. The modified correlogram technique (Koenig & Knops, 1998) was also employed to characterize

the spatial autocorrelations in the network. To this end, the statistical significance of the pairwise correlations among chronologies was calculated within classes located 500 km apart. Chronologies located farther than 2,500 km apart were combined into a single class. Hence, six classes were defined ranging from <500 to >2,500 km. To evaluate the geographic extent of synchrony in climate factors, the same analysis was performed for mean annual temperature and precipitation.

Temporal coherence of ring-width signals

The investigation of common TRW_i variability among chronologies (growth synchrony, $\hat{\alpha}$) was performed through variance-covariance (VCOV) modelling following Shestakova et al. (2014, 2018) (Appendix 3.1). This approach is suited to test the presence of contrasting tree-ring patterns in pre-established groups of chronologies, where particular groups can be defined based on existing knowledge (Shestakova et al., 2018). Here, the 20 chronologies were classified into four groups according to membership to a particular climate type following the Köppen climate classification (Köppen & Geiger, 1936): Boreal (*Dfc*), cold continental (*Dfb*), humid temperate (*Cfb*) and Mediterranean (*Csb*) (Table 1). In turn, the humid temperate climate was split into Atlantic (for western Europe chronologies) and temperate (for central Europe chronologies) types. These two groups originated as the result of constraining the maximum distance among sites at the group level to 1,000 km (i.e., the spatial range of coherent tree-ring signals as inferred from correlograms). Therefore, five different groups were defined. Each group consisted of a number of neighbouring forest stands (≥ 3) that ensured a solution to mixed model estimates.

A number of variance-covariance (VCOV) models accommodating between- and within-group variability were tested and compared using Akaike and Bayesian information criteria for model selection, which favour parsimonious models (Burnham & Anderson, 2002). The VCOV models were broad evaluation (denoting common synchrony across groups), narrow evaluation (corresponding to a banded main diagonal matrix denoting perfect asynchrony between groups), unstructured (a completely general covariance matrix), compound symmetry (a matrix having constant variance and covariance) and variants of a Toeplitz structure (a matrix allowing for different (co)variances depending on the relative proximity or neighbourhood among groups). These models are described in detail in Table S2. Afterwards, estimates of growth synchrony ($\hat{\alpha}$) were derived using the best VCOV model for the entire period (1901–2003) (Shestakova et al., 2018). The evolution of changes in $\hat{\alpha}$ was also studied for successive 50-year segments lagged one year by fitting the same VCOV models.

The best fitting model was independently selected for each segment. This was done to characterise shifts in common TRW_i variability over time potentially related to instability in the relationship between tree growth and climate factors at the high-frequency domain. Significant trends were determined by using the non-parametric Kendall τ rank correlation coefficient.

Relationships between radial growth and carbon isotope discrimination

The temporal (yearly) association between TRW_i and $\Delta^{13}\text{C}_i$ (hereafter, r_Y) was investigated at the group level through a bivariate mixed-effects model (Appendix 3.2) (Shestakova et al., 2017). Broadly speaking, this approach estimates the extent by which TRW_i and $\Delta^{13}\text{C}_i$, measured on the same set of chronologies, contain overlapping information as a result of plant processes related to carbon uptake and water use. Hence, the relevance of a physiological attribute ($\Delta^{13}\text{C}_i$) as determinant of regional forest growth is quantified by estimating how much of TRW_i variability across chronologies is associated with the variability of isotopic records. We argue that this quantification is relevant for studying the variable role of a putative physiological tracer of productivity across large areas. The bivariate analysis was performed for the entire period (1901–2003). We also evaluated the changes in r_Y between TRW_i and $\Delta^{13}\text{C}_i$ chronologies for successive 50-year segments lagged one year.

Meteorological data

Monthly mean temperature, precipitation and potential evapotranspiration were used for climate characterization. Meteorological variables were obtained from the nearest grid point to each site of the high-resolution climate dataset (Climatic Research Unit, CRU TS 3.21; Harris, Jones, Osborn, & Lister, 2014). CRU provides climate series on a $0.5^\circ \times 0.5^\circ$ grid-box basis, interpolated from meteorological stations across the globe, and extends back to 1901. However, it should be noted that climate data mainly originate from low-elevation stations. This leads to remarkable differences in elevation between stations and sampling sites in mountainous Mediterranean areas. To account for this discrepancy, we applied lapse rate adjustments to the CRU dataset for the Mediterranean sites ($<45^\circ\text{N}$) following Gandullo (1994). Potential evapotranspiration was estimated from CRU records using the Hargreaves method (Hargreaves & Samani, 1982).

Bootstrapped correlations between TRW_i or $\Delta^{13}\text{C}_i$ chronologies and monthly temperature, precipitation and the Standardized Precipitation-Evapotranspiration Index (SPEI3, a 3-month integrated drought index; Vicente-Serrano, Beguería, & López-Moreno, 2010) were

computed over the period 1901–2003 to examine site-specific responses to climate. To assess the temporal stability of these responses, the same analysis was conducted for the split 1901–1950 and 1951–2003 periods. To ensure that results were driven by local climate rather than by long-term trends (e.g., global warming), the climatic series exhibiting a linear trend over time were detrended by fitting a straight line and keeping the residuals of these linear fits or, otherwise, simply differencing from the mean. Climate relationships were analysed from the previous October to the current September of tree-ring formation.

Analysis of biogeographical patterns of tree performance

To characterize the spatial patterns of tree growth and its dependence on $\Delta^{13}\text{C}$, changes in growth synchrony ($\hat{a}$) and in the relationship between TRW_i and $\Delta^{13}\text{C}_i$ (r_Y) were evaluated as a function of biophysical variables through simple correlations. We used geographic (latitude, longitude and elevation) and climatic records (mean annual temperature [MAT], mean annual precipitation [MAP] and potential evapotranspiration [PET]; period 1901–2003) averaged across sites for every group. It should be noted that climatic records in the network strongly depended on geographic location: MAT decreased linearly with increasing latitude ($r = -0.61$, $P < 0.01$) and longitude (or distance inland from the Atlantic Sea) ($r = -0.50$, $P < 0.05$), but it was not related to elevation. Similarly, PET was negatively related to latitude ($r = -0.84$, $P < 0.001$) and longitude ($r = -0.58$, $P < 0.01$), and positively to elevation ($r = 0.45$, $P < 0.05$). MAP was also positively related to elevation ($r = 0.45$, $P < 0.05$). The stability of these relationships was assessed through correlation analysis for the split 1901–1950 and 1951–2003 periods.

Results

Site-level growth trends and responses to climate

Eleven sites showed positive BAI trends and one site showed a negative BAI trend (slope b , $P < 0.05$) for the period 1901–2003, while no significant trend was detected for seven sites (Table 1). Growth acceleration was observed at all oak sites and at three pine sites from mid and high latitudes, whereas growth significantly declined in a Mediterranean site. High summer temperatures enhanced growth in Fennoscandia, whereas summer drought often constrained growth at central and southern latitudes (as indicated by negative correlations with summer temperature and positive correlations with summer precipitation and SPEI3) (Fig. S1a–c). In addition, the positive growth responses to high winter temperatures observed at some mid- and low-latitude sites suggested co-limitation by cold winters and dry summers. In comparison,

more clear-cut climate signals were shared by $\Delta^{13}\text{C}_i$ records, which were especially associated with summer temperatures (negatively) and summer precipitation and SPEI3 (positively) (Fig. S1d–f).

Spatial consistency of tree-ring signals

Naturally, the correlations between pairs of chronologies for TRW_i decreased with increasing distance between sites. This effect accounted for 29% variability of inter-site correlation coefficients if subject to exponential decay (Fig. 1a). The highest correlations were found between *Quercus* stands from central Europe and between *Pinus* stands from north-eastern Europe ($r \geq 0.30$). Significant spatial autocorrelation was recorded up to 1,000 km, with a mean correlation of 0.22 and 0.12 for sites within distances of 0–500 and 501–1,000 km, respectively (Fig. 1c). A Principal Component Analysis performed on TRW_i returned five principal components (PCs) that accounted for 50% of the total variance. The first PC, which explained 12.9% of variance, had positive loadings for all chronologies, except for one Iberian site with *P. sylvestris* and the Moroccan site with *C. atlantica* (Fig. S2). The highest PC1 loadings corresponded to western and central European chronologies, indicating larger growth similarities compared to peripheral chronologies, located farther away from each other. The second PC, which explained 11.0% of variance, was also related to the geographic location of chronologies: positive PC2 loadings corresponded to south-western chronologies, while north-eastern chronologies had negative loadings (Fig. S2). The remaining three PCs accounted for <10% of variance and showed mixed spatial signals, indicating species-specific differences and the influence of local conditions on tree growth.

For $\Delta^{13}\text{C}_i$ chronologies, we found an exponential decrease in coherence with distance between chronology pairs accounting for 28% variability of inter-site correlation coefficients (Fig. 1b). Significant spatial autocorrelations were recorded up to 1,000 km (Fig. 1d). Similarly, the analysis of spatial autocorrelation in climate parameters revealed that the common signal declined with distance (Fig. S3a,b) and extended >2,500 km for MAT (linear function) and up to 1,000 km for MAP (decay function) (Fig. S3c,d). There was also a significant negative association between the most distant sites (>2,500 km) for MAP.

Tree growth synchrony across Europe

The five climate groups identified across the network consisted of three to five chronologies sharing temporal growth patterns (Fig. 2). A heterogeneous Toeplitz with two bands was the best model for the period 1901–2003, indicating covariation between neighbouring groups only

(Table S3). Growth synchrony ($\hat{a}$) varied considerably among groups, ranging from 0.06 ± 0.01 (Mediterranean) to 0.36 ± 0.06 (Boreal) (mean $\pm$ SE) (Fig. 3a). The $\hat{a}$ values were unrelated to the average distance between sites at the group level, with groups showing the lowest and highest $\hat{a}$ having inter-site distances of 785 ± 118 km and 913 ± 119 km (mean $\pm$ SE), respectively. In addition, the variable number of chronologies at the group level did not influence $\hat{a}$. At the between-group level, the highest $\hat{a}$ was found between Boreal and cold continental forests (0.11 ± 0.02), with progressively decreasing common signals between neighbours observed southwards (Fig. 3b).

Differences in synchrony among groups were geographically structured and related to latitude ($r = 0.96$, $P < 0.01$) and longitude ($r = 0.89$, $P < 0.05$), but not to elevation (Fig. S4). At the site level, however, there were strong associations between latitude and longitude ($r = 0.65$, $P < 0.01$), latitude and elevation ($r = -0.59$, $P < 0.01$), and longitude and elevation ($r = -0.44$, $P < 0.10$). To check for geographic consistency in these synchrony gradients across Europe, we examined an independent, larger dataset of ring-width chronologies obtained from the International Tree-Ring Data Bank (Grissino-Mayer & Fritts, 1997) having the same species representation ($n = 80$; 52 *Pinus* chronologies and 28 *Quercus* chronologies) (Appendix 4). In this case, we also detected a strong latitudinal gradient in $\hat{a}$ (Fig. S5). Consequently, we assumed that this trend was essentially independent of the particular tree-ring network under consideration. The observed geographic gradient in growth synchrony was also analysed in relation to the potential climatic drivers of forest performance across Europe. Notably, climate variables explained most geographic variation in $\hat{a}$ among groups (Fig. S6). We found strong negative relationships between $\hat{a}$ and PET, followed by MAP and MAT, which are consistent with a gradual decrease in evapotranspirative demand and temperature with increasing latitude.

Temporal changes in growth synchrony

The synchrony patterns changed markedly across Europe over the 20th century. $\hat{a}$ increased at low and mid latitudes (i.e., in Atlantic, Mediterranean and temperate forests), whereas it decreased at high latitudes (especially in Boreal, but also in cold continental forests) (Fig. 4a). Such divergent geographic trends weakened the relation between $\hat{a}$ and biogeographic factors, resulting in less geographically- and climatically-dependent $\hat{a}$ values across the continent after 1950 (Fig. S4, S6). At the between-group level, different trends were observed depending on the particular group combination. For neighbouring groups, we found a substantial decrease in synchrony between Boreal and cold continental forests, whereas synchrony remained steady or increased for other group combinations (Fig. 4b). A modest, albeit sizeable common signal

emerged among the more geographically distant group pairs after 1960 ($\hat{a} \approx 0.05-0.10$) (Fig. 4c). In fact, synchrony among forest types strongly converged across Europe in the second half of the century. In contrast, we did not find changes in synchrony patterns of climate parameters (MAT, MAP) throughout the 20th century (results not shown). This led us to discard the possibility that the observed changes in growth synchrony had been driven by concomitant fluctuations in synchrony of climate factors.

Tree growth patterns as related to isotopic signals

The temporal variability shared by TRW_i and $\Delta^{13}\text{C}_i$ (r_Y) was investigated at the group level. We found very different, geographically-structured relationships between these traits. The association was mainly positive (for Atlantic, cold-continental and temperate forests) or very positive (for Mediterranean forests), being significantly negative for Boreal forests (Fig. 5), hence following a latitudinal gradient ($r = -0.96$, $P < 0.05$) (Fig. S7). Conversely, r_Y was non-significant for neither longitude nor elevation (Fig. S7). In addition, r_Y was correlated to climate variables at the group level, with the strongest positive association found for both PET and MAP (Fig. S8).

The association between TRW_i and $\Delta^{13}\text{C}_i$ changed markedly across Europe throughout the 20th century. r_Y turned from negative to non-significant in Boreal forests, and changed from non-significant to positive in cold-continental (recently), temperate and Mediterranean forests (Fig. 6). As a result, TRW_i and $\Delta^{13}\text{C}_i$ mainly became positively related across Europe. The latitudinal pattern of r_Y was also stronger in the second than in the first half of the century (Fig. S7). This relationship became more dependent on PET after 1950 (Fig. S8).

Discussion

This study yields evidence for geographically-structured patterns of forest growth and its associations with carbon isotope fractionation processes across Europe. Common tree growth and physiology were shared by stands spread up to 1,000 km. This outcome provides a general indication on the geographical extent by which climate factors influence tree performance continent-wide; indeed, no other environmental driver is likely to act on the same spatial scale at the high-frequency domain (Fritts, 2001).

Geographic structure and climatic controls of tree-ring signals in European forests

Differential growth responses to climate were evident across the network, with temperature-sensitive growth at northern latitudes, precipitation-sensitive growth at central-southern

latitudes, and mixed signals in temperate and high-elevation European forests (Babst et al., 2013). Conversely, the extent of common climate signals present in carbon isotopes suggests a tight stomatal control of water losses and, indirectly, photosynthetic activity during summer across most of Europe (Cullen, Adams, Anderson, & Grierson, 2008). These results suggest a partial de-coupling between leaf- and stem-level processes (Jucker et al., 2017). They are consistent with current evidence supporting that carbon allocation patterns change with increasing temperature and this change varies between tree species from different biomes and functional groups (Way & Oren, 2010). Details on the nature and magnitude of carbon isotope signals across the network have been reported by Treydte et al. (2007).

Interpreting ring-width patterns continent-wide

Our results show a marked geographical organization of 20th-century growth patterns across Europe. The most conspicuous changes in synchronous tree growth occurred along a north–south gradient, with $\hat{a}$ increasing northwards concurrent with a thermal gradient of decreasing temperature and reduced evapotranspiration (Babst et al., 2013). This agrees with our hypothesis of more synchronous growth in cold-limited, high-latitude forests owing to the greater spatial homogeneity of temperature effects on tree growth in northern Europe (Düthorn, Schneider, Günther, Gläser, & Esper, 2016). It contrasts with the more geographically complex drought events occurring in central and southern Europe (Orlowsky & Seneviratne, 2014), hence resulting in substantially less synchronous growth patterns (Shestakova et al., 2016).

Notably, $\hat{a}$ increased after 1950 except in Fennoscandia, which weakened the northward trend of enhanced synchrony observed during the preceding period. This outcome suggests warming-induced climatic forcing spreading across central and southern Europe, irrespective of species and local site conditions, thus enhancing synchrony through common tree sensitivity to such emergent exogenous factor (Fig. S9). It is in line with previous findings on recent high-frequency adjustments of ring-width patterns in response to amplified drought effects on growth in temperate and semiarid regions (Latte, Lebourgeois, & Claessens, 2015; Shestakova et al., 2016). In contrast, climate warming would progressively mitigate low-temperature constraints on tree performance occurring in Boreal forests (Düthorn et al., 2016). This leads to an increasing importance of local (stand-level) effects on tree growth over time, hence triggering regional asynchrony (but see Shestakova et al., 2016). We interpret these phenomena as a sign of increasing drought effects on forest growth dynamics expanding northwards across Europe, which are concurrent with temperature trends across the study area (+0.15 to +0.35°C decade⁻¹ between 1960 and 2015) (EEA, 2016).

Carbon isotope fractionation relates to spatial patterns of forest growth in Europe

We investigated the physiological mechanisms underlying geographically-structured temporal growth variability through bivariate random-effects modelling of the common temporal signal present in TRW_i and $\Delta^{13}C_i$. This approach is appropriate for investigating exogenous constraints on forest growth and physiology acting over large (continental) climate gradients, because site-level impacts on tree-ring traits (e.g., differential management, competition, soil depth and fertility, etc.) are set aside explicitly from the analysis.

The positive relationships between TRW_i and $\Delta^{13}C_i$ at low and mid latitudes suggest that stomatal limitation of leaf carbon assimilation is a key mechanism controlling tree growth synchrony south of 50°N in Europe (Fig. 5). Therefore, leaf-level physiology and tree growth are driven, to a relevant extent, by water stress at about half of the study area (including e.g., France, Austria and south of Germany and Poland) during the 20th century. Conversely, the negative relationship between TRW_i and $\Delta^{13}C_i$ in Fennoscandia indicates that photosynthesis was constrained by low temperatures/sunshine hours (Gagen et al., 2011). At cool, moist sites the main control over water-use efficiency is assimilation rate, which can be limited by either enzyme activity (photon flux) or enzyme production (leaf temperature or nitrogen availability). These limitations would increase $\Delta^{13}C$ at the expense of decreased carbon uptake, hence reducing radial growth. Although our results must be weighed against the limited spatial representativeness of the sampling network, they allow delineating broad geographical trends that so far have been difficult to ascertain continent-wide, partly due to the unsystematic and sparse nature of data collection (Saurer et al., 2014). Besides, the observed trends agree with previous studies performed across smaller areas showing strong positive ring-width vs. $\Delta^{13}C$ correlations for trees growing under water-limited conditions, but weak correlations at wetter and colder sites (Voelker et al., 2014; del Castillo, Voltas, & Ferrio, 2015).

Strengthening of $\Delta^{13}C$ –growth relationships in response to climate change

The geographical structure of tree growth relationships with carbon isotope fractionation processes varied during the 20th century. Alongside the increase in growth synchrony observed at the temperate, cold-continental and Mediterranean groups, a change from non-significant to positive correlations suggests intensified drought impacts on tree physiology since 1950 (Saurer et al., 2014). Such warming-induced drought effects influencing stomatal regulation have been shown insufficient to decrease 20th-century transpiration, as alternative factors (e.g., lengthened growing seasons or increased leaf area) counterbalance the impacts of leaf-level gas exchange

processes on whole-tree physiology (Frank et al., 2015). Indeed, we found evidence of growth enhancement across Europe, but mainly in oaks originating from moist temperate climates in low-elevation stands. For conifers, growth stimulation was observed in some of the cold-limited sites, while growth decline was found in drought-constrained Mediterranean mountains. In high-latitude and high-elevation sites, the increasing growth trend could be produced by a raise in photosynthetic rates, which is likely driven by a combination of rising CO₂, temperature and surface radiation. However, drought stress seems to override a positive effect of enhanced leaf intercellular CO₂ concentration in the Mediterranean region, resulting in no change or decline in productivity (Andreu-Hayles et al., 2011).

In Fennoscandia, the negative ring-width dependence on $\Delta^{13}\text{C}$ vanished after 1950, which suggests that an earlier photosynthetic limitation of growth driven by low temperatures, high cloudiness or both factors has attenuated in recent decades. In the western Mediterranean, this dependence changed abruptly from zero to nearly one after 1970. Previously, growth synchrony among the group chronologies was absent, rendering a null signal shared by ring-width and $\Delta^{13}\text{C}$. After 1950, a common growth signal was low but relevant: this signal was essentially related to $\Delta^{13}\text{C}$ fluctuations, resulting in a highly positive correlation. Although this correlation implies a tight stomatal control of common radial growth in high-mountain Mediterranean forests, the limited number of chronologies and the sudden change in tree performance between periods might question this interpretation. A recent study carried out in Iberian mountain forests allows the downscaling of our results to a local area (Shestakova et al., 2017). These authors reported that multispecies tree growth at about 1,500 m is more dependent on a tighter stomatal control of water losses (inferred from $\Delta^{13}\text{C}$) since the 1980s, hence resembling lower elevation stands. These results reinforce our view, although more data supporting this evidence are still needed on a regional scale. Unfortunately, studies on long-term shifts in radial growth related to switches of the main environmental limitations to photosynthetic carbon gain are still scarce (Voelker et al., 2014).

To conclude, we have reported forest shifts from temperature- to moisture-sensitive growth spreading northwards continent-wide and associated to latitudinal changes in tree dependence on carbon isotope fractionation processes. Leaf-level physiology and radial growth of trees are ultimately linked via carbon allocation strategies. Common signals imprinted in ring-width and stable isotopes have been broadly reported, either along geographical gradients (i.e., phenotypic plasticity; del Castillo et al., 2015), over time (i.e., temporal covariation; Voelker et al., 2014; Shestakova et al., 2017; this work) or at the intraspecific level (i.e., genetic correlation; Fardusi et al., 2016). These evidences support (direct or indirect) effects of carbon

uptake processes on above-ground growth. On the other hand, carbohydrates are used for various other processes than growth (e.g., maintenance, respiration, reproduction) and carbon availability is seldom considered to limit tree growth (Palacio, Hoch, Sala, Körner, & Millard, 2014; but see Wiley & Helliker, 2012), which suggests that the relationship between productivity and stable isotopes may not be straightforward (Jucker et al., 2017). Alternative physiological mechanisms related to above-ground growth may interact with photosynthetic processes; for example, a critical turgor disrupting cell growth or the appearance of hydraulic constraints under drought (Sperry, 2000), or the weakening of meristematic growth under low temperatures (Rossi et al., 2016). These mechanisms would need to be carefully assessed against stable isotope signals.

Together with climate change, the increasing atmCO_2 may have played a role in the observed shift in growth synchrony and the stronger relation between $\Delta^{13}\text{C}$ and TRW_i . Disentangling the relative effects of climate and CO_2 fertilization on spatially structured tree-ring information is challenging because both low- and high-frequency signals overlap impacting on tree physiology, carbon allocation and above- and below-ground growth. Additional factors interacting with climate change and atmCO_2 such as increasing nutrient limitations (Jonard et al., 2015) or atmospheric deposition (de Vries, Dobbertin, Solberg, van Dobben, & Schaub, 2014) should also be considered. A previous study on the same tree-ring network demonstrated that CO_2 fertilization has increased water-use efficiency of European forests in the 20th century (Saurer et al., 2014). However, these increments were not spatially uniform and, notably, the strongest increase was reported in response to summer drought for temperate forests in central Europe, an area in which we observe large increases in growth synchrony. These findings definitely point to an increasing impact of water stress spreading northwards across European forests. Therefore, this research demonstrates that broad-scale climatic variation jointly influences tree ecophysiology and productivity in previously unrecognized ways, and sheds more light on the ecological implications of ecosystem functioning under the new climate conditions.

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Data Accessibility Statement

The tree-ring data used in this study are available upon request from the authors. Contact Emilia Gutiérrez (emgutierrez@ub.edu) for ring-width chronologies and Gerhard Helle (ghelle@gfz-potsdam.de) for carbon isotope records.

Biosketch

Tatiana A. Shestakova is a post-doctoral researcher at the Woods Hole Research Center, Falmouth, MA (USA). Her research interests include dendroecology, stable isotope biogeochemistry and climate change impacts on natural forest ecosystem. Particularly, she works on designing efficient inference tools and algorithms based on mixed modelling principles to understand the processes underlying the complexity and diversity in tree response patterns to environmental forcing and how these patterns are spatially structured across biogeographical gradients.

FIGURE CAPTIONS

Figure 1. Spatial patterns of indexed tree-ring traits across Europe for the period 1901–2003: **(a, c)** indexed tree-ring width (TRW_i), **(b, d)** indexed carbon isotope discrimination ($\Delta^{13}\text{C}_i$). *(Left panels)* Pairwise correlations of tree-ring chronologies as a function of geographical distance. The patterns are summarized by regressing the correlation coefficients (r values) involving pairs of chronologies (y -axis) on their corresponding distance (x -axis) by using negative exponential functions ($y = be^{-cx}$). Different dot colors indicate pairwise correlations within and between functional groups as follows: conifers (green), oaks (orange), and mixed conifer–oak (blue). Asterisks after the coefficient of determination (r^2) indicate level of significance ($***P < 0.001$). *(Right panels)* Spatial structure of tree-ring traits across European forests. The spatial autocorrelation in the tree-ring network was characterized for six consecutive distance classes (listed on the x -axis). Mean r values and their statistical significance (P) within each distance class were estimated from 1,000 randomizations. Significant correlation coefficients ($P < 0.05$) are indicated by an asterisk.

Figure 2. Geographical distribution of sites, definition of groups of chronologies and synchrony in radial growth at group level. Each dot identifies a chronology ($n \geq 20$ trees) according to the codes shown in Table 1 (oak codes are shown in italics). Each colored encircled area identifies a group of chronologies belonging to a particular climate type (see Table 1) that are separated in pairs up to 1,000 km (see Fig. 1d for the distance threshold where significant radial growth patterns are shared among chronologies). The corresponding growth synchrony at the group level ($\hat{a}$) is shown within a rectangle. At least three neighbouring sites form a group (total number of groups, $n = 5$). $\hat{a}$ values are estimated using indexed ring-width chronologies for the period 1901–2003 as described in Appendix 3.1 (Supporting Information).

Figure 3. Growth synchrony across Europe. Patterns of growth synchrony ($\hat{a}$) at the within-group level for the entire period 1901–2003 **(a)**. Patterns of growth synchrony ($\hat{a}$) at the between-group level for the entire period 1901–2003 **(b)**. All calculations are based on indexed ring-width chronologies. Groups sorted latitudinally from north to south. Error bars denote standard errors.

Figure 4. Temporal trends in growth synchrony at within- and between-group levels for the period 1901–2003. Growth synchrony ($\hat{a}$) is estimated for 50-year periods lagged by 5 year

following Eqs. 5 and 6 as described in Appendix 3.1 (Supporting Information). All calculations are based on indexed ring-width (TRW_i) chronologies. For the sake of visual clarity, the estimates of $\hat{a}$ are represented separately for pairs of chronologies belonging to the same group (i.e., within-group level) **(a)**, and for pairs of chronologies belonging to different groups (i.e., between-group level) for neighbouring **(b)** and non-neighbouring chronologies **(c)**. Grey lines denote the SE. Note the change in scale of the Y-axis between panels.

Figure 5. Geographical patterns of the relationship between TRW_i and $\Delta^{13}C_i$ chronologies across Europe. The correlations at the group level (r_Y) are estimated for the entire period 1901–2003. Significant associations are depicted with an asterisk ($P < 0.10$). Error bars denote standard errors.

Figure 6. Temporal trends in associations between TRW_i and $\Delta^{13}C_i$ chronologies at the group level for the period 1901–2003. The correlations (r_Y) are estimated for 50-year periods lagged by 5 year following Eq. 7 as described in Appendix 3.2 (Supporting Information). All calculations are based on indexed ring-width (TRW_i) and carbon isotope ($\Delta^{13}C_i$) chronologies. Grey lines denote the SE of r_Y . Significant correlations (correlation coefficients with 90% confidence intervals not embracing zero) are depicted as filled dots.

Table 1. Geographical features and climatic characteristics of the sampling sites. Sites are sorted latitudinally, from north (top) to south (bottom). Climate parameters were obtained based on CRU TS 3.21 data over the period 1901–2003. See Meteorological data subsection in Materials and Methods for details. Climate types were estimated using the Köppen classification (Köppen & Geiger, 1936).

No	Country	Site name	Code	Species	Latitude (°N)	Longitude (°E)	Elevation (m)	MAT (°C)	MAP (mm)	PET (mm)	MAP < PET	BAI trend, <i>b</i> (cm ² yr ⁻¹)	Köppen classification
1	Finland	Kessi, Inari	INA	<i>Pinus sylvestris</i>	68.93	28.42	150	−1.2	432	413	Apr-Aug	0.008	Dfc, subarctic
2	Finland	Sivak., Ilomantsi	ILO	<i>Pinus sylvestris</i>	62.98	31.27	200	2.2	573	515	Apr-Aug	0.003	Dfc, subarctic
3	Norway	Gutuli	GUT	<i>Pinus sylvestris</i>	62.00	12.18	800	0.7	586	512	Apr-Aug	0.019**	Dfc, subarctic
4	Finland	Bromarv	BRO	<i>Quercus robur</i>	60.00	23.08	5	4.9	568	562	Apr-Aug	0.083*	Dfb, cold continental
5	UK	Lochwood	LOC	<i>Quercus robur</i>	55.27	−3.43	175	7.4	1517	589	Jun	0.105***	Cfb, humid temperate
6	Lithuania	Panemunės Silas	PAN	<i>Pinus sylvestris</i>	54.88	23.97	45	6.6	634	672	Apr-Sep	0.010	Dfb, cold continental
7	Poland	Suwalki	SUW	<i>Pinus sylvestris</i>	54.10	22.93	160	6.7	619	686	Apr-Sep	0.020*	Dfb, cold continental
8	UK	Woburn Abbey	WOB	<i>Quercus robur</i>	51.98	−0.59	50	9.5	709	724	Apr-Sep	0.162**	Cfb, humid temperate
9	Germany	Dransfeld	DRA	<i>Quercus petraea</i>	51.50	9.78	320	7.7	723	677	Apr-Sep	0.070***	Cfb, humid temperate
10	UK	Windsor	WIN	<i>Pinus sylvestris</i>	51.41	−0.59	10	9.5	763	738	Apr-Sep	0.047	Cfb, humid temperate
11	Poland	Niepolomice, Gibiel	NIE1	<i>Quercus robur</i>	50.12	20.38	190	8.0	676	674	Apr-Aug	0.238***	Dfb, cold continental
12	Poland	Niepolomice, Gibiel	NIE2	<i>Pinus sylvestris</i>	50.12	20.38	190	8.0	676	674	Apr-Aug	−0.021	Dfb, cold continental
13	France	Fontainebleau	FON	<i>Quercus petraea</i>	48.38	2.67	100	11.5	608	861	Mar-Sep	0.084***	Cfb, humid temperate
14	France	Rennes	REN	<i>Quercus robur</i>	48.25	−1.70	100	11.1	733	786	Apr-Sep	0.098***	Cfb, humid temperate
15	Austria	Lainzer Tiergarten	LAI	<i>Quercus petraea</i>	48.18	16.20	300	9.6	654	792	Mar-Sep	0.091***	Cfb, humid temperate
16	Austria	Poellau	POE	<i>Pinus nigra</i>	47.95	16.06	500	8.3	815	762	Apr-Aug	0.021**	Cfb, humid temperate
17	Spain	Pinar de Lillo	LIL	<i>Pinus sylvestris</i>	43.07	−5.25	1600	5.1	1505	688	Jul-Aug	−0.008	Csb, Mediterranean
28	Spain	Massis de Pedraforca	PED	<i>Pinus uncinata</i>	42.23	1.70	2100	3.9	1299	692	Jul-Aug	−0.023***	Csb, Mediterranean
19	Spain	Sierra de Cazorla	CAZ	<i>Pinus nigra</i>	37.80	−2.95	1816	8.9	712	1014	May-Sep	−0.003	Csb, Mediterranean
20	Morocco	Col du Zad	COL	<i>Cedrus atlantica</i>	32.97	−5.07	2200	10.4	717	1163	Apr-Oct	−0.001	Csb, Mediterranean

Abbreviations: MAT, mean annual temperature; MAP, mean annual precipitation; PET, potential evapotranspiration; BAI, basal area increment

* $P < 0.05$; ** $P < 0.01$; *** $P < 0.001$. The significance of BAI trends is assessed using the Mann-Kendall non-parametric test which accounts for the effect of temporal autocorrelation (Hamed & Rao, 1998)

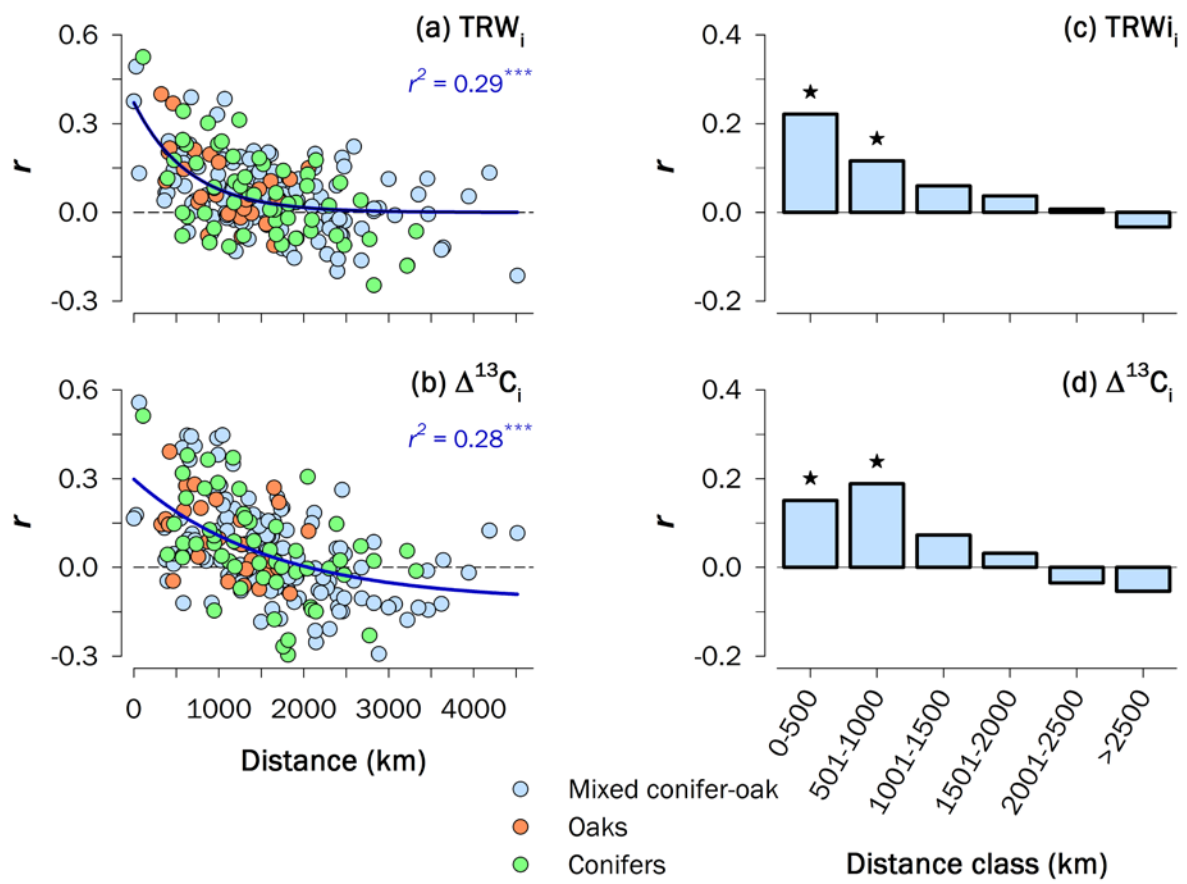


Figure 1

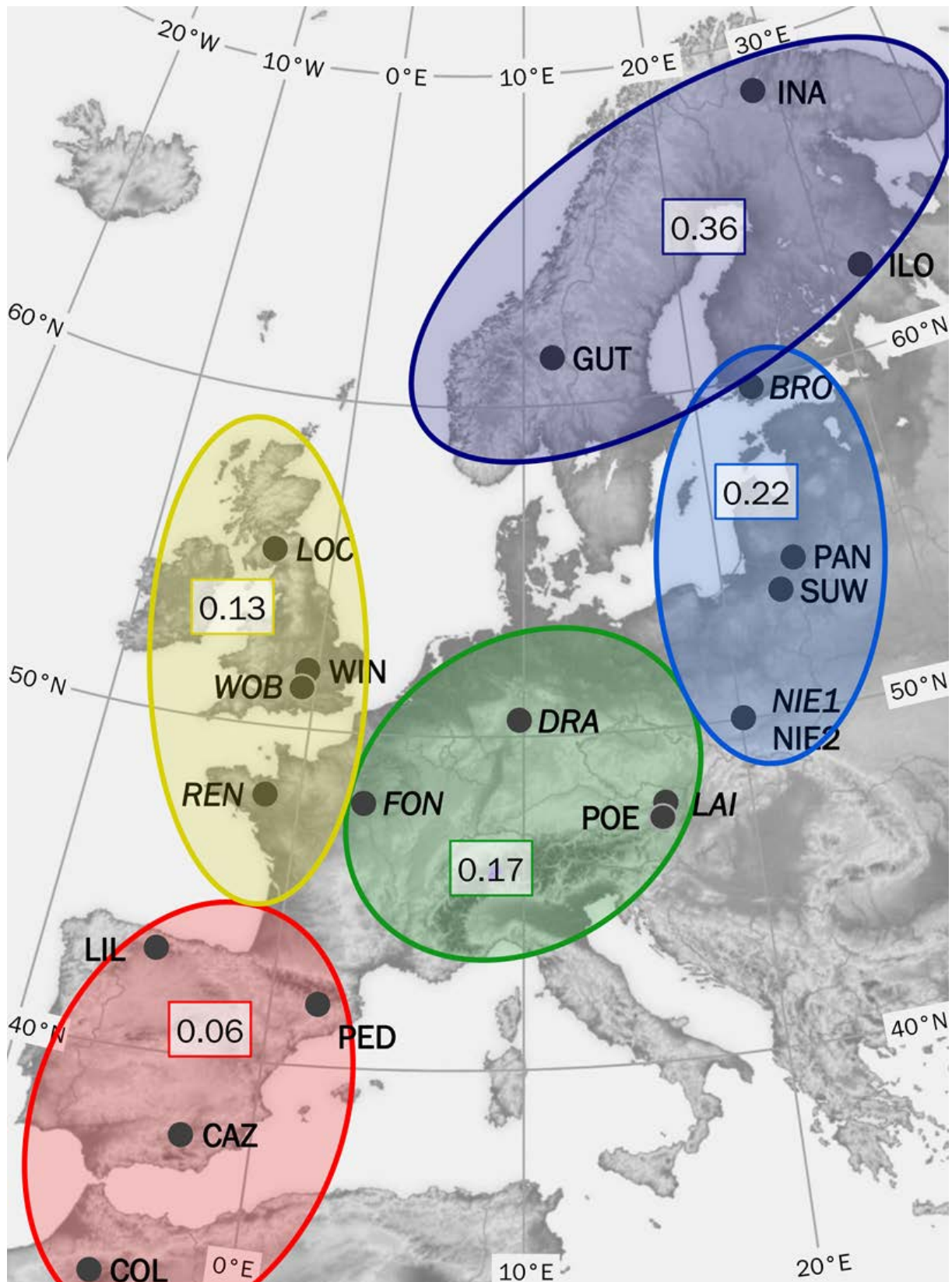


Figure 2

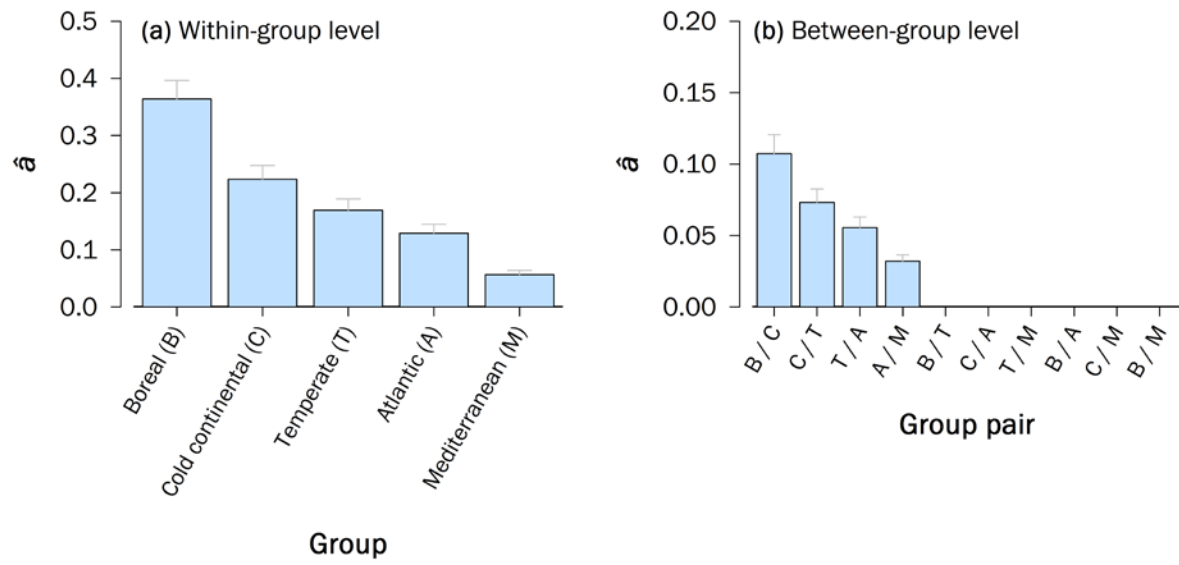
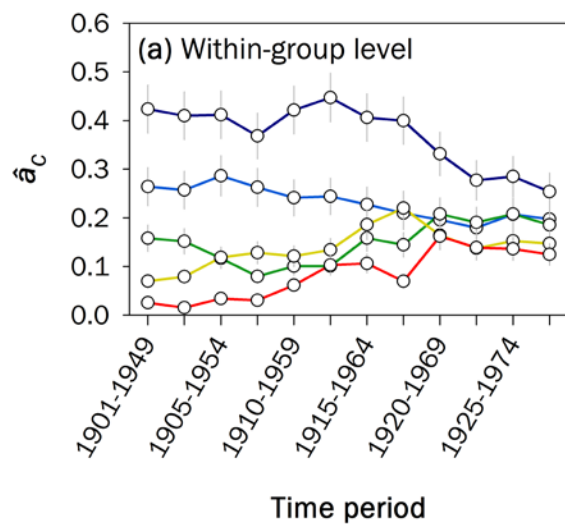
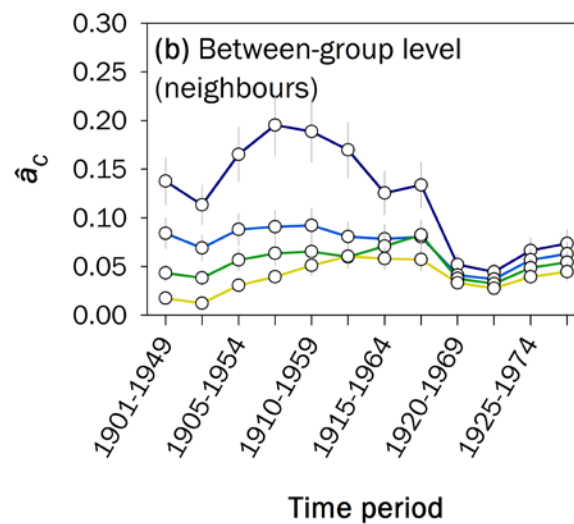


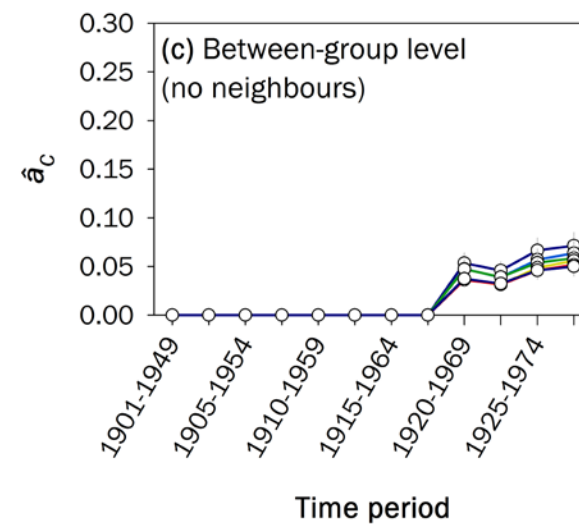
Figure 3



—○— Boreal (B)
 —○— Cold continental (CC)
 —○— Temperate (T)
 —○— Atlantic (A)
 —○— Mediterranean (M)



—○— B/CC
 —○— CC/T
 —○— T/A
 —○— A/M



—○— B/T
 —○— CC/A
 —○— T/M
 —○— B/A
 —○— CC/M
 —○— B/M

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810 **Figure 4**

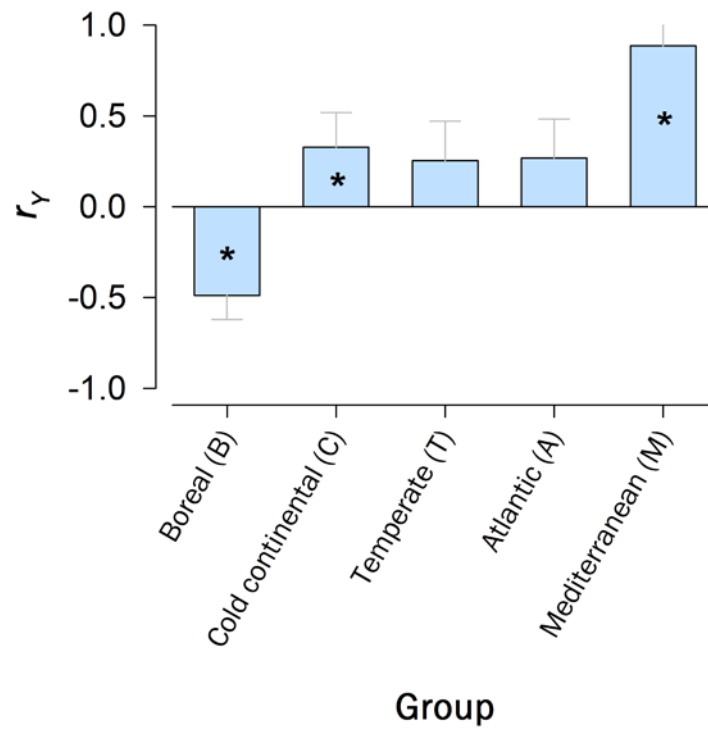
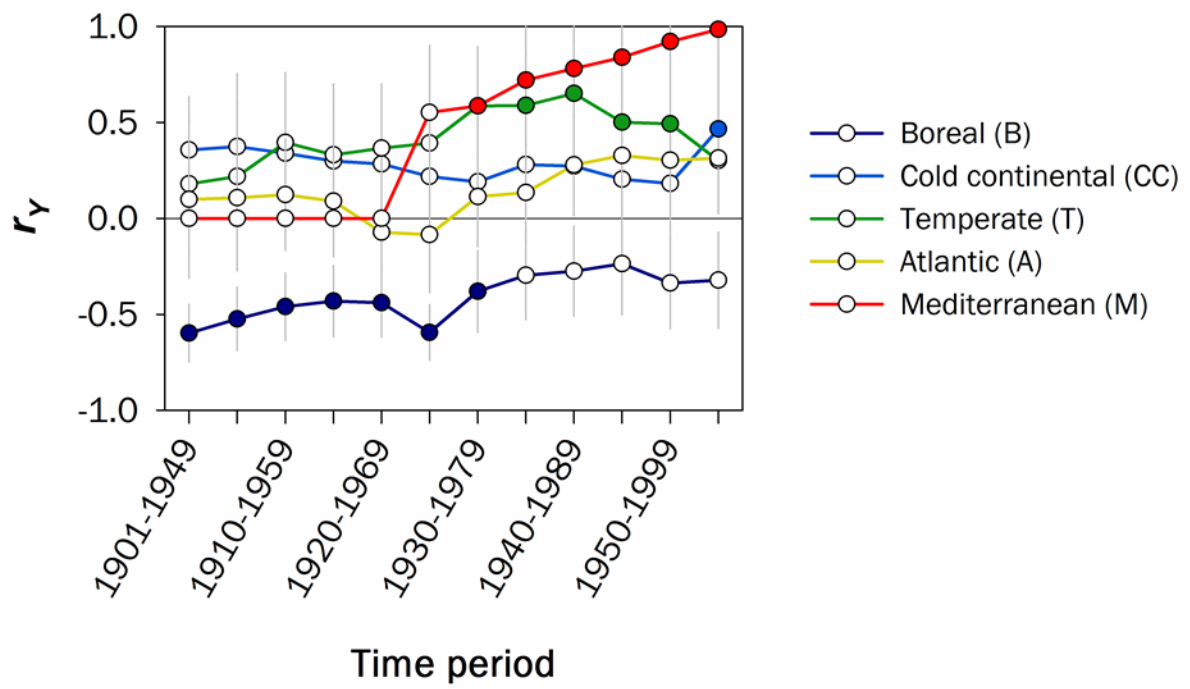


Figure 5



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815 **Figure 6**

Supporting Information

Additional Supporting Information may be found in the online version of this article:

Appendix 1. Field sampling and tree-ring measurements.

Appendix 2. Tree-ring chronology characteristics.

Appendix 3. Random modelling analysis.

Appendix 4. Further evaluation of geographical trends in growth synchrony across Europe.

Table S1. Dendrochronological characteristics of the study sites.

Table S2. Description of variance-covariance (VCOV) models accommodating between- and within-group variability.

Table S3. Results of variance-covariance models for synchrony analysis.

Figure S1. Climate signals at the site level for TRW_i and $\Delta^{13}C_i$ for the period 1901–2003.

Figure S2. Principal component analysis performed on 20 indexed ring-width chronologies distributed across Europe and northern Africa for the common period 1901–1998.

Figure S3. Spatial patterns of climate signals (mean annual temperature, MAT; mean annual precipitation, MAP) across Europe for the period 1901–2003.

Figure S4. Geographical patterns of growth synchrony ($\hat{a}$) at the group level for the entire period 1901–2003 and change in $\hat{a}$ for two consecutive periods (1901–1950 and 1951–2003).

Figure S5. Geographical patterns of growth synchrony ($\hat{a}$) for chronologies obtained from the International Tree-Ring Data Bank (ITRDB) dataset for the period 1901–2003.

Figure S6. Climatic patterns of growth synchrony ($\hat{a}$) at the group level for the entire period 1901–2003 and change in $\hat{a}$ for two consecutive periods (1901–1950 and 1951–2003).

Figure S7. Geographical patterns of the relationship between TRW_i and $\Delta^{13}C_i$ chronologies across Europe for the entire period 1901–2003 and for two consecutive periods (1901–1950 and 1951–2003).

Figure S8. Climatic patterns of the relationship between TRW_i and $\Delta^{13}C_i$ chronologies across Europe for the entire period 1901–2003 and for two consecutive periods (1901–1950 and 1951–2003).

Figure S9. Trends in climate parameters: mean annual temperature (MAT) and mean annual precipitation (MAP) at the group level.