

Stand Competition Determines How Different Tree Species Will Cope with a Warming Climate

Laura Fernández-De-Uña, Isabel Cañellas, Guillermo Gea-Izquierdo

▶ To cite this version:

Laura Fernández-De-Uña, Isabel Cañellas, Guillermo Gea-Izquierdo. Stand Competition Determines How Different Tree Species Will Cope with a Warming Climate. PLoS ONE, Public Library of Science, 2015, 10 (e0122255), <10.1371/journal.pone.0122255>. <hal-01217091>

HAL Id: hal-01217091

https://hal-amu.archives-ouvertes.fr/hal-01217091

Submitted on 19 Oct 2015

HAL is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers.

L'archive ouverte pluridisciplinaire **HAL**, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d'enseignement et de recherche français ou étrangers, des laboratoires publics ou privés.





Stand Competition Determines How Different Tree Species Will Cope with a Warming Climate

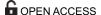
Laura Fernández-de-Uña¹*, Isabel Cañellas¹, Guillermo Gea-Izquierdo^{1,2}

- 1 Forest Research Centre, Instituto Nacional de Investigación y Tecnología Agraria y Alimentaria (INIA-CIFOR), Madrid, Spain, 2 Centre Européen de Recherche et d'Enseignement de Géosciences de l'Environnement (CEREGE), Unité Mixte de Recherche 7330, Centre National pour la Recherche Scientifique/Université Aix-Marseille, Aix-en-Provence, France
- * fernandez.laura@inia.es



Plant-plant interactions influence how forests cope with climate and contribute to modulate species response to future climate scenarios. We analysed the functional relationships between growth, climate and competition for Pinus sylvestris, Quercus pyrenaica and Quercus faginea to investigate how stand competition modifies forest sensitivity to climate and simulated how annual growth rates of these species with different drought tolerance would change throughout the 21st century. Dendroecological data from stands subjected to thinning were modelled using a novel multiplicative nonlinear approach to overcome biases related to the general assumption of a linear relationship between covariates and to better mimic the biological relationships involved. Growth always decreased exponentially with increasing competition, which explained more growth variability than climate in Q. faginea and P. sylvestris. The effect of precipitation was asymptotic in all cases, while the relationship between growth and temperature reached an optimum after which growth declined with warmer temperatures. Our growth projections indicate that the less drought-tolerant P. sylvestris would be more negatively affected by climate change than the studied sub-Mediterranean oaks. Q. faginea and P. sylvestris mean growth would decrease under all the climate change scenarios assessed. However, P. sylvestris growth would decline regardless of the competition level, whereas this decrease would be offset by reduced competition in Q. faginea. Conversely, Q. pyrenaica growth would remain similar to current rates, except for the warmest scenario. Our models shed light on the nature of the species-specific interaction between climate and competition and yield important implications for management. Assuming that individual growth is directly related to tree performance, trees under low competition would better withstand the warmer conditions predicted under climate change scenarios but in a variable manner depending on the species. Thinning following an exponential rule may be desirable to ensure long-term conservation of high-density Mediterranean woodlands, particularly in drought-limited sites.





Citation: Fernández-de-Uña L, Cañellas I, Gealzquierdo G (2015) Stand Competition Determines How Different Tree Species Will Cope with a Warming Climate. PLoS ONE 10(3): e0122255. doi:10.1371/journal.pone.0122255

Academic Editor: Eryuan Liang, Chinese Academy of Sciences, CHINA

Received: October 15, 2014

Accepted: February 10, 2015

Published: March 31, 2015

Copyright: © 2015 Fernández-de-Uña et al. This is an open access article distributed under the terms of the Creative Commons Attribution License, which permits unrestricted use, distribution, and reproduction in any medium, provided the original author and source are credited.

Data Availability Statement: All relevant data are within the paper and its Supporting Information files.

Funding: Funding was provided by the Spanish Ministry of Economy and Competitiveness (projects AGL2010-21153-C02-01 and AGL2013-46028R), Madrid Regional Government (projects REGENFOR and S2013/MAE-2760) and INIA (project AT2013-0004). LFU was supported by a FPI fellowship (BES-2011-047651). The funders had no role in study design, data collection and analysis, decision to publish, or preparation of the manuscript.



Competing Interests: The authors have declared that no competing interests exist.

Introduction

Changes in forest productivity [1], tree phenology [2] and species distribution, both in latitude [3] and altitude [4], have been observed as a result of climate change [5]. Its long-term effects can be, however, modulated by other factors, such as CO_2 and nitrogen fertilization [5,6] or stand dynamics affected by natural disturbances, forest management, and inter-tree relationships. Competition, both above- and belowground, decreases individual radial growth as a result of reduced resource availability, more negative water potentials and decreased photosynthetic rates and stomatal conductance [7–9]. Consequently, competition affects the variability of the tree growth response to climate [9–12].

Dendrochronological methods provide us with long series of growth data with an annual resolution. These datasets can be used to analyse forests' response to spatio-temporal changes in climate. However, due to a lack of long-term competition series, there are few studies that have been able to profit from the valuable long time span of this type of data to investigate the effect of the interaction between competition and climate on tree growth. Consequently, most studies addressing the effect of competition on the growth response to climate have analysed this relationship by comparing different competition classes or thinning regimes [10-12], whereas fewer studies explicitly modelled growth as a function of both climate and competition [13,14]. Thus, there is still much need to understand the underlying relationship between competition and climatic variability because these studies have traditionally simplified the growth response to environmental variables and assumed a linear relationship between them. Nonetheless, the physiological response to environmental forcing, and hence the growth response, is not linear [15–18]. Concretely, the functional response to a specific environmental variable has either a sigmoid form, when it increases until reaching a saturation state, such as the response of photosynthetic rates to light [15,19], or a bell-shaped form, when the response to the environmental factor presents an optimum or optimal range, e.g. the effect of nitrogen on growth [15,19]. Because nonlinear approaches can empirically model the biological mechanisms that control the relationship between growth and the interaction between the different environmental variables [15,20], they have greater power to predict growth under past and future climatic conditions [16,20,21].

In the Mediterranean region, drought is a key ecological factor determining plant performance and species distribution [1,22]. Climate change scenarios forecast rising temperatures with stable or even decreasing precipitation, further increasing the frequency and intensity of drought events [23]. Within the region, mountainous areas with colder and more humid climates have served as a refuge for boreal species. These species mingle with Mediterranean taxa increasing overall biodiversity [24]. Consequently, Mediterranean mountainous ecosystems could be particularly vulnerable to species loss under climate change scenarios [3]. The lower belt of the mountains of the central Iberian Peninsula is currently dominated by sub-Mediterranean species such as Quercus pyrenaica Willd. and Quercus faginea Lam., whereas the higher areas with colder, more continental climates are covered by conifer species such as *Pinus sylves*tris L. and Pinus nigra J.F. Arnold [24]. This distribution has been, however, highly influenced by various cycles of deforestation and reforestation in historical times [25]. P. sylvestris was particularly favoured in reforestation during the 19th century and currently covers 16.2% of the Iberian and Central Mountain Ranges [24,25]. Nevertheless, this Eurosiberian species finds its southwestern distribution limit in the Iberian Peninsula mountain ranges, where its natural populations are highly fragmented [24,25]. Consequently, as a result of climate change, P. sylvestris is expected to reduce its current distribution range, particularly in altitude, being displaced at low elevations by sub-Mediterranean species such as Q. pyrenaica and Q.faginea [24,26,27]. These two species are only found in the transition between the temperate and the



Mediterranean zones and together cover 30.3% of the above-mentioned mountain ranges [24,26]. They were traditionally managed as coppices or coppices with standards for firewood extraction, which favoured vegetative regeneration [28–30]. As a result of the abandonment of their traditional use, the stands of these two species have reached high densities with little structural diversity [28–30], which could increase their vulnerability to climate change. *Q. faginea* has a higher drought tolerance than *Q. pyrenaica*, and, although both species are better adapted to drought than *P. sylvestris*, they withstand lower water potentials than Mediterranean evergreen species such as *Quercus ilex* L. [31–34]. Consequently, with climate change, sub-Mediterranean *Quercus* species could be replaced in their lower and southern limits by more drought tolerant taxa [24,26,27].

Given the large area covered by these species in Mediterranean mountain ranges, understanding how *P. sylvestris*, *Q. pyrenaica* and *Q. faginea* stands will respond to changing climatic conditions is essential to assess which management practices would minimize the potentially adverse ecological and socio-economic impacts and ensure their conservation. This study first aims to describe and simulate the relationship between tree growth, climate and competition via a biologically meaningful nonlinear approach, using dendrochronological data and long-term competition series from stands subjected to different thinning regimes. Second, we apply these models to various climate change scenarios to project the future growth trends of these species at different stand competition levels to assess their vulnerability to climate change. Specifically, we were interested to analyse how competition modifies the growth response to climate. We hypothesized that the net effect of climate upon growth would be limited by a competition scale-dependent relationship and that the effect of the interaction between climatic factors and competition on growth would depend on the functional characteristics of the target species, particularly its drought tolerance.

Materials and Methods

Study sites

We selected different locations for each of the study species within the INIA network of longterm thinning experimental plots: Barriopedro (BP) for Q. faginea (QUFG); Navasfrías (NA) and Rascafría (RA) for Q. pyrenaica (QUPY); and Duruelo (DU) and Neila (NE) for P. sylvestris (PISY; Fig 1). The site characteristics are detailed in Table 1. All plots were located in evenaged, monospecific, naturally regenerated stands representative of the dominant woodlands currently found within the region. Quercus spp. stands were traditionally managed as coppice forests. Multiple stems per tree were common at the Q. faginea site, whereas the trees at the Q. pyrenaica sites generally had only one stem. At each site, 770-1600-m² plots were marked and randomly either assigned a thinning treatment (light thinning—15-25% plot basal area [BA] reduction—, moderate thinning—35% BA reduction—, or heavy thinning—up to 50% BA reduction) or left unaltered for control purposes, with at least one repetition per treatment. Thinning from below (i.e., thinning that removes the smallest trees in the stand) was performed the year of plot establishment (Table 1) and in approximately 10-year rotation periods. Diameter at breast height (DBH) of all trees was measured in all plots every 4-10 years since plot establishment. Plots were established and are periodically thinned and inventoried with the authorization of the regional governments of Castilla-La Mancha (BP), Castilla y León (NA, DU and NE) and Madrid (RA). No specific permits were required for sampling at these sites, because the study did not involve endangered or protected species nor did it have any potential longterm effects on the sampled trees.



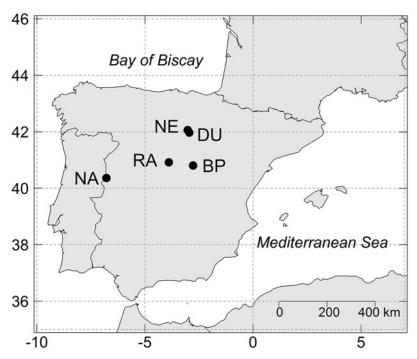


Fig 1. Map of the Iberian Peninsula with the location of the study sites. BP: Barriopedro (*Q. faginea*); NA: Navasfrías (*Q. pyrenaica*); RA: Rascafría (*Q. pyrenaica*); DU: Duruelo (*P. sylvestris*); NE: Neila (*P. sylvestris*).

Dendrochronological data

At each plot, 20 trees with diameters in the first inventory (i.e., before thinning was applied) above the plot's average were selected and sampled between 2010 and 2012. In trees with multiple stems (such as the case of control plots at the *Q. faginea* site), the largest stem was sampled. Two cores were sampled from each tree at 1.3 m height, with a total of 1100 trees from 55

Table 1. Site characteristics.

Site	Species	Age	Est. year	N plots	Altit. (masl)	Soil type	Expos.	Slope (%)	Prec. (mm)	Temp. (°C)	Stand type	Treatments	Average DBH (mm)	Plot BA (m²/ha)	Density (trees/ha)
BP	Q. faginea	59	1980	21	860	Haplic calcisol	W	0–35	505	10.5	Xeric	C, L, M, H	88±22-123±28	2.4–19	675–4090
NA	Q. pyrenaica	64	2004	9	895	Haplic umbrisol	W	0–10	927	10.7	Mesic	C, L, M	188±51-199±49	15–28	430–1100
RA	Q. pyrenaica	53	1994	8	1400	Haplic umbrisol	SE	30	790	9.4	Mesic	C, L, M, H	133±47-161±39	17–40	765–5490
DU	P. sylvestris	78	1968	8	1200	Haplic umbrisol	NW	15	860	7.3	Mesic	C, L, H	208±61-288±52	18–56	440–2870
NE	P. sylvestris	71	1972	9	1340	Haplic umbrisol	NE	15–20	860	6.6	Mesic	C, L, M	242±66-301±67	35–75	350–4600

Age: Average cambial age at breast height in 2014; Est. year: Year of plot establishment (i.e., year in which plots were marked and the first thinning was applied); Altit.: Altitude; C: Control; L: Light thinning; M: Moderate thinning; H: Heavy thinning; Expos.: Exposure; Prec.: Mean annual precipitation; Temp.: Mean annual temperature; DBH: diameter at breast height; Plot BA: Plot basal area. Average diameter is that of the most recent inventory and includes the standard deviation. Average DBH, plot BA and density show the minimum and maximum values per plot for each site.

doi:10.1371/journal.pone.0122255.t001



plots. Cores were air dried, mounted and sanded and measured with a LINTAB measuring table (Rinntech, Heidelberg, Germany) with an accuracy of 0.01 mm. Tree ring series were visually and statistically crossdated with the software TSAP [35], using the statistics Gleichläufigkeit (Glk), t-value and the crossdating index (CDI). Crossdating was finally verified with COFECHA [36].

Ring-width data were transformed into basal area increments (BAI) in mm²/year. BAI series were averaged per tree and single tree BAI series were in turn averaged per plot to obtain 55 plot BAI chronologies. Average plot chronologies included only those years for which at least five individual tree series existed. BAI series were used because, with the exception of the first few years of increasing juvenile growth, they minimize the tree-size and age effects while conserving both the high and low frequency signal in the tree ring series [37]. Because prewhitening BAI chronologies to eliminate autocorrelation also removed the short-term growth variations due to changes in competition that we aimed to model, we used raw BAI chronologies as the dependent variable in our models.

Competition data

Data from the periodic plot inventories were used to build annual chronologies of tree density and basal area (in stems/ha and m²/ha, respectively), which were used as proxies of competition at the plot level as they reflect the degree of crowding in the stand [14,38]. Competition series ranged between 9 and 42 years long. We assumed that mortality between inventories occurred gradually in such a way that the annual changes were equal to the difference between inventories divided by the number of years between them. Harvested trees were added to the estimated natural mortality of the year of thinning when this was performed.

Climate data

Climate data were obtained from the Spanish Meteorological Agency (AEMET), the Peñalara Natural Park Research and Management Centre, Barriopedro site's meteorological station (in operation from 1980 to 1991), Herrera et al. [39] and the CRU TS 3.10 dataset ([40]; accessed 2015 Feb 25 through the KNMI explorer, available http://climexp.knmi.nl/). We considered the climatic data from the weather station located closest to each study site (at 3-19 km away) and at a similar altitude to be the same as in our plots. Missing data were estimated using linear regressions between the data from that reference station and data from the closest weather stations and, when this was not possible, with data from Herrera et al. [39] or CRU. Because Neila did not have a station nearby at the same altitude, we used for that site the same precipitation data as for Duruelo, correcting temperature data with a lapse rate of 0.5°C/100 m [41]. Monthly and seasonal precipitation, mean temperatures, mean maximum temperatures and mean minimum temperatures were used for the study. Months were pooled as follows: Annual (January-December), Hydrological year (October of previous year—September of current year), Growing season (April-September), Spring (March-May), Summer (June-August), MJJ (May-July), JJ (June-July), Autumn (September-November) and Winter (December of previous year-February of current year).

Data analysis

We calculated Kendall rank correlation coefficients between BAI and the various precipitation and temperature variables to narrow down the covariates that were to be tested in the models. We used nonparametric tests because BAI data were not normally distributed. We also explored the data visually to detect non-linear relationships between covariates. The three species



differed in the variables triggering a maximum response in growth and, therefore, we calibrated a model per species.

We modelled growth using a nonlinear multiplicative approach [17], which allows modelling the nonlinear relationships between variables and investigating the interactions among them, as well as including the effect of the most strongly limiting factor. Growth was estimated as a function of the maximum potential growth (MG; BAI in mm²/year), i.e., the potential tree growth when all the environmental variables are at their optimum, multiplied by functions of tree size, competition and climatic variables (temperature and precipitation) with values enclosed between 0 and 1 [17]. Because age was highly correlated with tree size (Kendall's τ coefficient = 0.55–0.83), this variable was not included in the model. Therefore, the general form of our model was:

$$BAI = MG \cdot f1(Size) \cdot f2(Competition) \cdot f3(Precipitation) \cdot f4(Temperature) + \epsilon \tag{1}$$

where $f_i(x)$ are unitless functions (modifiers) representing the functional relationships between growth and the different covariates and ϵ is the random error.

Several functions per covariate were compared to choose the function that best fitted the data (<u>Table 2</u>):

- 1. $f_1(Size)$: The effect of size (mean annual diameter of the trees forming the chronology in mm) followed a logistic function (function 1 in <u>Table 2</u>), and thus increased up to an asymptote.
- 2. f₂(Competition): As suggested empirically by our data (Fig 2) and expressed in the literature [12,17], the relationship between BAI and competition followed a decreasing curve. Thus, we compared different formulations to represent this response, including the modified Gaussian, negative exponential and negative potential functions (functions 2 through 4 in Table 2). For PISY, we allowed the parameters in the competition function to vary with site because the competition curves from DU and NE were parallel (Fig 2). This was most likely a result of different site characteristics, such as soil fertility, not explained by our model.
- 3. f_3 (Precipitation): The relationship between growth and precipitation was expected to be represented by an increasing monotonic function with an asymptote [15,16]. Nonetheless, to ensure that growth did not decrease with increasing precipitation after an optimum, we compared the logistic function with a modified Gaussian (functions 1 and 2 in Table 2).
- 4. f_4 (*Temperature*): We expected temperatures to present an optimum or optimal range at which trees perform best [15,16]. Consequently, we compared logistic, modified Gaussian,

Table 2. Functions assessed, where x may be size, competition, precipitation or temperature variables, and $f(x) \sim [0, 1]$.

Function ID	Function type	Function general expression	Variables
1	Logistic	$f(x) = \frac{1}{1+\left(rac{a}{a} ight)^b}$	Size; Precipitation; Temperature
2	Modified Gaussian	$f(x) = \mathrm{e}^{-0.5\left(\frac{\chi-a}{b}\right)^c}$	Competition; Precipitation; Temperature
3	Exponential	$f(x) = ae^{bx}$	Competition
4	Potential	$f(x) = a^{bx}f(x) = a^{bx}$	Competition
5	Log-normal	$f(x) = e^{-0.5 \left(\frac{\log\left(\frac{x}{a}\right)}{b}\right)^2}$	Temperature
6	Modified Laplace	$f(x) = e^{\left(\frac{ x-a }{0.5}\right)^b}$	Temperature

doi:10.1371/journal.pone.0122255.t002



log-normal and modified Laplace functions (functions 1, 2, 5 and 6 in <u>Table 2</u>) to cover a variety of shapes reflecting different ecological responses to temperature.

Models were fitted using maximum likelihood. Model parameters, including MG and individual function parameters, were estimated using the global optimization algorithm 'simulated annealing' [42]. Various combinations of response functions and covariates preselected on the exploratory analysis were compared to select the covariate and response function that exhibited the strongest relationship with growth for each modifier in Eq.1 (i.e., one for competition, one for precipitation and one for temperature). The best model was selected based on the models' log-likelihood, Akaike Information Criterion (AIC), adjusted coefficient of determination (R^2) and root mean square error (RMSE) [43]. A model was considered to have a significantly higher explanatory power than another when the difference in AIC between models (Δ AIC) was equal to or greater than 2 [44]. Because data and residuals were heteroscedastic and presented positive kurtosis, a Gamma probability density function was used to fit ϵ in the models.

Growth projections under different climatic and competition scenarios

To project growth at the various studied sites by applying the selected best models, we used climatic scenarios of monthly minimum and maximum temperatures and precipitation of the study sites obtained from the University of Cantabria (http://www.meteo.unican.es/en/projects/estcena; Accessed 2015 Feb 25). Projections used the general circulation model ECHAM5 for the IPCC emission scenarios A1B, A2 and B1 [23]. Since climate predictions were made for 20 x 20 km grids, data were adjusted to the study sites when necessary using the

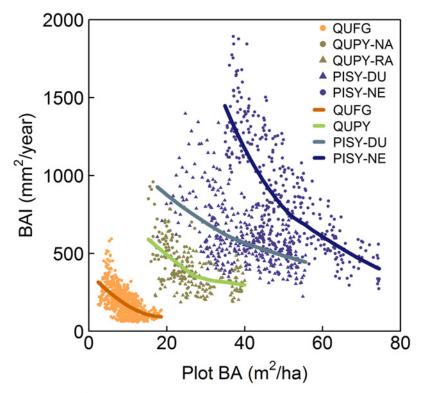


Fig 2. BAI (mm²/year) plotted against stand basal area (BA) per site. The relationship between competition and growth follows a negative exponential form in all sites, as shown by locally weighted polynomial regression (loess smoother) lines.

doi:10.1371/journal.pone.0122255.g002



overlapping period 2001–2011, common to both the data used to calibrate the models and the future predictions.

We projected two types of scenarios based on tree size. First, we projected the growth of the studied stands throughout the 21st century, increasing tree diameter based on the BAI predicted for previous years (hereafter dynamic projections). Second, we assessed the changes in annual growth that a given size class would suffer as a result of climate and competition, for which we used the same diameter per size class throughout the simulation period (hereafter constant-diameter projections). We estimated BAI for two different size classes per species: 100 and 150 mm-diameter for QUFG, 150 and 200 mm for QUPY and 200 and 300 mm for PISY. We considered two competition scenarios: heavy thinning (HT) and control (C). For the dynamic projections, in the heavy thinning scenario we presumed that competition would be kept steady at the same level as at present through forestry practices. Because under natural conditions competition rates are expected to increase up to a maximum level at which rates remain constant through self-thinning [45], for the control scenario we assumed that competition levels would increase over time at rates similar to those measured in the most recent years. We estimated for each site a specific asymptote reflecting constant competition rates based on observed trends and maximum competition levels found in National Forest Inventory data. For the constant-diameter projections, we kept competition levels constant at the same levels as in the present for both the control and heavy thinning scenarios. Climate and competition projections were introduced in the selected models to predict growth throughout the 21st century. For a better assessment of the long-term trends, a smoothing spline with a 50% frequency cut-off at 30 years was applied to the simulated growth series.

All analyses were carried out with R version 2.13.1 [46]. For BAI calculations and future growth projection smoothing we used the package "dplR" [47], while models were fitted using the package "likelihood" [48].

Results

Descriptive statistics of the studied 55 tree ring chronologies can be found in <u>S1 Table</u>. QUFG had the slowest growth, followed by QUPY. Growth rates were lower at the driest sampled site for each species (<u>S1 Table</u> and <u>Table 1</u>). Trees were relatively young, with chronologies ranging between 54 and 86 years in length (<u>S1 Table</u>).

Growth model

The variance explained by the models (R²) ranged from 55% for QUPY to 78% for QUFG and PISY (<u>Table 3</u> and <u>Fig 3</u>). The effect of size on growth was stronger on QUPY and PISY, whereas most of the growth variability of QUFG was explained by competition. For QUFG and PISY, the effect of competition on growth was stronger than that of climatic variables, whereas QUPY growth was more influenced by temperature than by competition (<u>Table 3</u>). Of the two climatic variables assessed, temperature had a stronger influence on both *Quercus* species growth than precipitation, whereas PISY responded more strongly to the latter (<u>Table 3</u>). For all species, plot BA better reflected the effect of competition changes in the stand than tree density. The relationship between growth and competition followed a negative exponential function in all cases (function 3 in <u>Table 2</u>; Figs 2 and 4). QUPY and PISY responded similarly to competition, whereas QUFG suffered stronger decreases in growth with increasing competition (<u>Table 4</u> and <u>Fig 4</u>).

The relationship between growth and the climatic variables also followed the same functional form for the three species, although the precipitation and temperature variables triggering this response were species-specific. The logistic function best captured the relationship between



Table 3. Effect of adding one more environmental variable to the nonlinear model.

			QUPY					PISY							
Model	LL	ΔΑΙС	R ²	RMSE	N par	LL	ΔΑΙС	R ²	RMSE	N par	LL	ΔΑΙС	R ²	RMSE	N par
Size	-3830.6	925.4	0.11	84.1	4	-1390.4	95.7	0.24	129.2	4	-4783.5	719.0	0.39	250.3	4
Size-Prec-Temp	-3787.6	847.4	0.20	79.7	8	-1354.9	33.2	0.45	110.1	8	-4593.1	346.3	0.63	195.0	8
Size-Comp	-3459.1	184.5	0.70	48.6	5	-1375.7	68.3	0.35	119.4	5	-4524.0	203.9	0.70	175.3	6
Size-Comp-Prec	-3422.3	114.9	0.73	46.2	7	-1356.2	33.6	0.46	109.4	7	-4454.8	69.7	0.76	159.3	8
Size-Comp-Temp	-3406.0	82.4	0.75	45.0	7	-1342.5	6.2	0.53	102.3	7	-4486.3	132.6	0.73	166.6	8
Size-Comp-Prec-Temp	-3362.9	0	0.78	42.1	9	-1337.2	0	0.55	100.1	9	-4417.9	0	0.78	152.7	10

Comp: basal area for all species; Prec: P_{Hyd} for *Q. faginea*, P_{Spr} for *Q. pyrenaica* and P_{MJJ} for *P. sylvestris*; Temp: Tmax_{Spr} for *Q. faginea* and *Q. pyrenaica* and Tmax_{Hyd} for *P. sylvestris*; LL: Log-likelihood; ΔAIC: difference between the AIC of the model being considered and the AIC of the complete model (Size-Comp·Prec·Temp); R²: Adjusted coefficient of determination; RMSE: Root mean square error; N par: Number of parameters in the model.

doi:10.1371/journal.pone.0122255.t003

precipitation and growth (function 1 in Table 2), indicating that the growth response reached an asymptote with increasing moisture availability, whereas the modified Laplace (function 6, a distribution with a single maximum located at a sharply pointed peak) worked best for temperatures (Fig 4). This function suggests that growth increased exponentially up to an optimum, after which growth decreased exponentially with increasing temperatures. The characteristics of this growth response to temperature were similar for both *Quercus* species, whereas changes in growth with temperature were steeper in PISY. For the analysis of the climatic variables affecting growth, only the final climate variables selected for the models are given due to the large number of variables tested. QUFG responded more strongly to precipitation of the hydrological year (P_{Hyd}) and spring maximum temperatures (T_{MXSpr}), whereas QUPY responded to spring precipitation (P_{Spr}) and maximum temperatures (T_{MXSpr}). PISY growth was mostly related to May-July precipitation (P_{MJJ}) and maximum temperatures of the hydrological year (T_{MXSpr}).

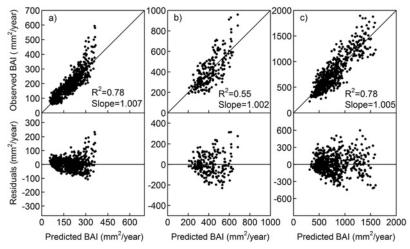


Fig 3. Observed vs. Predicted BAI and Residual plots for the models for (a) Quercus faginea, (b) Quercus pyrenaica and (c) Pinus sylvestris.

doi:10.1371/journal.pone.0122255.g003

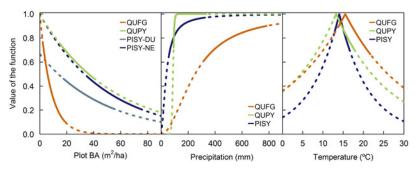


Fig 4. Comparison of the different functional relationships between growth and the various environmental variables as fitted in the models for each of the studied species. Solid lines represent the range for which the models were calibrated, whereas dotted lines represent extrapolations of the models. For Q. faginea, Precipitation = P_{Hyd} and Temperature = T_{MJ} and Temperature = T_{MJ} and Temperature = T_{MJ} and Temperature = T_{MJ} . Note that to ease the comparison among species of the different functional relationships, growth is shown on a relative scale for each species, with 1 representing the maximum growth of the species.

Growth projections under climate change scenarios

According to the dynamic projections made by our models for the study sites, the forecasted climate change scenarios would affect PISY more negatively than the oaks studied. QUFG growth would experience a decrease in control plots under all climatic scenarios, whereas it would remain constant under the heavy thinning scenario, except for the A2 scenario, which forecasts higher temperature increases [23] (Fig 5). PISY growth would significantly decrease under all size, climatic and competition scenarios assessed at both study sites (Figs 5 and 6). Conversely, QUPY growth would increase during the 21st century under the A1B and B1 scenarios in RA, the QUPY site located at a higher, colder location, whereas in NA this increase would only occur under reduced competition conditions, with stable or slightly decreasing growth trends in control plots (Fig 5). Nonetheless, the constant-diameter projections indicate that these increasing growth trends are due to the positive effect of increasing tree size and not

Table 4. Values and support intervals of the parameters for the different models.

Parameter	QUFG	QUPY	PISY			
			DU	NE		
MG	1055.2 (1044.1, 1065.7)	1965.9 (1908.9, 2006.5)	5546.8 (5491.3, 5602.3)			
Size_a	83.8 (83.8, 83.8)	227.5 (220.7, 234.3)	205.7 (203.6, 207.8)			
Size_b	-5.26 (-5.74, -4.92)	-1.48 (-1.66, -1.32)	-2.09 (-2.27, -1.95)			
Comp_a	1	1	0.6660 (0.6526, 0.6726)	1		
Comp_b	-0.1217 (-0.1243, -0.1181)	-0.0191 (-0.0206, -0.0178)	-0.0209 (-0.0214, -0.0203)			
Prec_a	221.0 (211.3, 229.9)	87.7 (85.0, 89.5)	39.0 (36.3, 41.4)			
Prec_b	-2.13 (-2.31, -1.99)	-20.27 (-32.16, 12.96)	-1.63 (-1.79, -1.52)			
Temp_a	16.1 (16.1, 16.4)	13.3 (13.0, 13.5)	14.0 (14.0, 14.0)			
Temp_b	0.0312 (0.0274, 0.0337)	0.0393 (0.0334, 0.0482)	0.0701 (0.0638, 0.0745)			

MG: maximum growth (mm²); Size_a and Size_b: parameters of the size function (logistic), which represent the half saturation point and the scale of the function, respectively; Comp_a and Comp_b: parameters of the competition function (negative exponential), which represent the intercept and the shape of the function, respectively; Prec_a and Prec_b: parameters of the precipitation function (logistic); Temp_a and Temp_b: parameters of the temperature function (modified Laplace), which represent the optimum temperature and the scale of the function, respectively.

doi:10.1371/journal.pone.0122255.t004

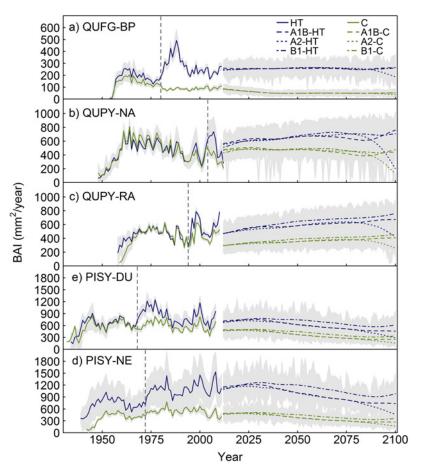


Fig 5. Mean chronologies and dynamic growth projections under different competition (Control, C, and Heavy thinning, HT) and climate change (A1B, A2 and B1) scenarios for the different study sites. (a) Barriopedro (*Q. faginea*); (b) Navasfrías (*Q. pyrenaica*); (c) Rascafría (*Q. pyrenaica*); (d) Duruelo (*P. sylvestris*); and (e) Neila (*P. sylvestris*). Grey dashed vertical lines indicate the time when plots were established and thus, the years from which data were used to calibrate the models, which do not include increasing juvenile growth. Shading represents the confidence intervals, calculated as the mean ± standard deviation.

a response to future climate, because they predict that both QUPY and QUFG tree productivity would remain constant or slightly decrease during the 21^{st} century for all size-classes assessed (Fig 6). Under the A2 scenario, however, the models predict a decrease in growth under both competition levels for all sites (Figs $\underline{5}$ and $\underline{6}$).

Discussion

Species-specific nonlinear interaction between competition and climate

Our nonlinear model succeeded in capturing the functional response of growth to climate, as well as the nonlinear interaction between climatic variables and stand competition. Precipitation had a positive effect on growth, as expected in water-limited Mediterranean ecosystems [1,10,49,50]. However, this positive effect is nonlinear and ultimately saturates and reaches an asymptote [15,16]. This indicates that in the study areas moisture availability constrains growth up to a species-specific threshold, after which precipitation never reaches high enough levels to

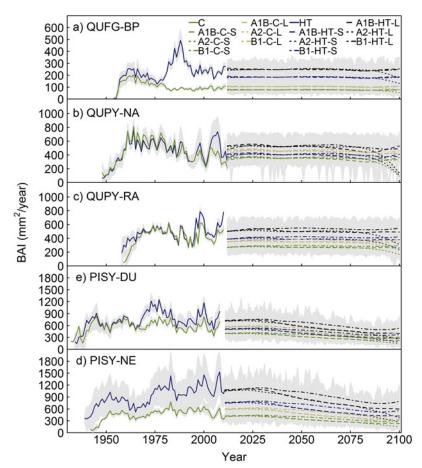


Fig 6. Mean chronologies and constant-diameter growth projections for the various size classes under different competition and climate change scenarios for the different study sites. (a) Barriopedro (*Q. faginea*); (b) Navasfrías (*Q. pyrenaica*); (c) Rascafría (*Q. pyrenaica*); (d) Duruelo (*P. sylvestris*); and (e) Neila (*P. sylvestris*). Competition scenarios: Control (C) and Heavy thinning (HT). Climate scenarios: A1B, A2 and B1. Size classes: S (100 mm for QUFG, 150 mm for QUPY and 200 mm for PISY) and L (150 mm for QUFG, 200 mm for QUPY and 300 mm for PISY). Shading represents the confidence intervals, calculated as the mean ± standard deviation.

limit growth [51]. In contrast, the response to temperature was positive up to an optimum, after which tree growth is limited by increasing temperatures [15,16]. This is consistent with the response of photosynthetic rates to temperature, which also shows an optimum as a result of Rubisco inactivity at low temperatures and stomatal closure with increasing water stress at high temperatures [52-54].

The growth response of each species to climate depends on the species' ecological requirements, particularly its drought tolerance. According to our model, the growth response to temperature was similar in both *Quercus* species, both in terms of the shape of the function and the strength of the effect, which was more intense than that of precipitation. In contrast, the effect of precipitation was stronger than that of temperature on *P. sylvestris*, although its response function to temperature showed that this species has higher sensitivity to temperature changes than do the other two species. This species has its southernmost and, thus, dry distribution limit in the Iberian Peninsula and is less drought tolerant than the studied *Quercus* spp. [27,32], which would explain its stronger dependence on precipitation. The nonlinear response



to climatic variables and the species-specific precipitation and temperature thresholds identified by our models improve our understanding of how species will respond under climate change. The assessment of the functional relationships between growth and climatic forcing can therefore improve the reliability of models using long-term dendroecological data. Hence, nonlinear approaches are able to overcome modelling shortcomings resulting from assumptions of linearity such as the 'divergence problem' observed in the temperature-tree growth relationship [55,56].

In spite of the substantial influence of climate on growth, the effect of competition was, however, dominant over that of climate for Q. faginea and P. sylvestris, as shown for other species [11,49,57]. The functional relationship between growth and competition followed a negative exponential function in all species. However, the responses of Q. pyrenaica and P. sylvestris to competition were similar in amplitude, while Q. faginea suffered stronger growth constraints with increasing competition. Q. faginea trees presented multiple stems which shared the same root system, and this characteristic caused high competition levels. After thinning, only one stem per tree remained on low competition plots. These single-stem trees most likely profited from larger root systems, which together with the more xeric conditions of this site, could have amplified the effect of competition on this species compared with the other two. This reflects the strong interaction between competition and climatic stress, which our model was able to capture thanks to its multiplicative nature. A proper characterization of this interaction is crucial to understand the combined effect of these two abiotic factors on the response of forests to climate change. Consequently, assuming that growth is a proxy for species performance and, therefore, that reduced growth rates imply enhanced vulnerability, the sustainability of these stands will depend on the species-specific nonlinear interaction between competition intensity and long-term climate forcing, with individuals subject to high competition levels being less likely to survive enhanced xericity [11,49,58,59].

Growth projections under different climate and competition scenarios. Implications for future management

Most studies on growth projections under climate change scenarios have neglected the importance of competition [60,61], despite the evidence indicating its role in altering tree growth response to climate [10-12,49] and, thus, the need to modify growth projections under future climate scenarios [13]. Our models predicted a reduction of tree growth in stands with high competition levels for Quercus faginea and Pinus sylvestris, whereas this reduction would be minimized under low competition levels. Multiple studies have recorded the negative effect of high temperatures and drought on tree physiology and growth [62,63], as well as the positive effect of reduced competition for resources on tree performance, particularly under xeric conditions [7-9,50]. Therefore, the predicted decreasing future growth trends and highly reduced growth rates could forecast enhanced tree mortality rates [59,64], particularly under high competition levels. Several studies have already observed an increase in mortality, consistent with self-thinning dynamics, in certain species of the Mediterranean region, including *P. sylvestris*, as a result of increased stand competition, rising temperatures and drought episodes [57,65,66]. Increased mortality, together with reduced regeneration [67,68] and decreased growth, could lead to the decline of these stands and their substitution by better adapted species, as predicted by species distribution models [24,26]. Our models suggest that P. sylvestris growth would be more negatively affected by climate change than that of the two more drought-tolerant sub-Mediterranean Quercus spp. studied. This could forecast a displacement in altitude of Pinus sylvestris in favour of Quercus pyrenaica, for which our models predicted an increase in growth for the site located at a higher elevation, which is consistent with species



distribution simulations in the literature [24,26]. Nonetheless, under the warmest climate scenario, Q. pyrenaica growth would also decline at both sites, indicating that, due to the nonlinear nature of the temperature-growth relationship, the forecasted temperature increase may become limiting for this species growth too [16].

Nevertheless, the mean growth rates predicted under decreased competition for both *Quercus* species indicate that applying competition reductions similar to those assessed with our models could mitigate the potential negative effects of climate change upon growth for trees suffering from stand densification. In contrast, *P. sylvestris* would suffer a reduction in growth even under the low-competition scenario, indicating high vulnerability to increasing temperatures. Therefore, heavier thinning intensities than those applied today may be necessary to maintain this species' tree growth. Because the negative effect of competition declines exponentially with decreasing competition, species-specific thresholds below which growth could be optimised without substantially reducing stand density must be identified, as intense thinning may have detrimental effects on stand productivity and sustainability [28,69]. These thresholds could also be site-dependent, particularly at the edges of each species distribution, where competitive stress may be strengthened due to the nonlinear interaction between competition and climate.

Despite their value for adaptive management, growth projections must be assessed with caution, because there are many inherent uncertainties associated with the extrapolation of models outside their calibration range. One of their main limitations is the impossibility of incorporating potential species acclimation to changing climatic conditions. The nonlinear nature of the models can, however, partially offset this uncertainty because they most likely capture the functional growth response to environmental variability. Moreover, we did not cover the whole climatic range of the studied species. Therefore, these models could still be improved by calibrating them with data from a broader climatic gradient [16] and, thus, extend their applicability to the entire distribution range of each of the studied species. This can be particularly relevant for *Q. faginea*, for which we only had one site and for which, therefore, our ability to assess climatic variability was most likely more reduced than that for the other two species. Nonetheless, as long series of competition levels are not readily available, our multispecies approach using stand competition series from long-term experimental plots is particularly valuable.

Conclusions

Our nonlinear models highlighted the species-specific nature of the growth response to climate and its interaction with competition. These models overcome several limitations of classic linear approaches. Moreover, they shed light on factors that contribute to better understanding of instabilities in the growth response to climate and could be used to detect climatic thresholds of species performance. As a result of this nonlinear interaction, trees under low competition will better withstand the warmer conditions predicted under climate change scenarios, particularly for the two *Quercus* species studied. Competition will most likely be naturally maintained at sustainable levels through self-thinning [45]. However, this process can be accelerated to reduce the vulnerability of the remaining trees to drought through thinning. In light of our results, plot basal area reductions as intense as or even heavier than the ones currently applied may be necessary to prevent stand growth stagnation, particularly in drought-limited sites. However, the assessment of the species-specific competition thresholds should follow an exponential rule, as shown by our models. Although thinning is already commonly applied in *P. sylvestris* stands, it still needs to be further developed and implemented for the studied *Quercus* spp. Because proactive approaches are more likely to avoid or reduce damage than reactive



ones as they enhance the stand's resilience, it is important to adapt management in time to prevent possible forest decline and to ensure long-term conservation of high-density Mediterranean woodlands.

Supporting Information

S1 Table. Characteristics of the complete tree ring chronologies averaged per treatment. C: Control; L: Light thinning; M: Moderate thinning; H: Heavy thinning; RW: Ring-Width; Rbar: Interseries correlation; EPS: Expressed Population Signal; MS: Mean sensitivity, AR1: Mean autocorrelation. N trees indicates the total number of trees used to build the chronologies and N cores the number of cores used, which, therefore, does not include those that were discarded. (DOCX)

Acknowledgments

The authors thank AEMET and University of Cantabria for the data provided for this work (Spain02 dataset, http://www.meteo.unican.es/datasets/spain02; and climate projections under IPCC scenarios), as well as the Peñalara Natural Park Research and Management Centre for their climate data. We would also like to thank all the technicians for their field and laboratory assistance.

Author Contributions

Conceived and designed the experiments: IC LFU GGI. Performed the experiments: IC LFU GGI. Analyzed the data: LFU GGI. Wrote the paper: IC LFU GGI.

References

- Sarris D, Christodoulakis D, Körner C. Recent decline in precipitation and tree growth in the eastern Mediterranean. Glob Chang Biol. 2007; 13: 1187–1200.
- Misson L, Degueldre D, Collin C, Rodriguez R, Rocheteau A, Ourcival J-M, et al. Phenological responses to extreme droughts in a Mediterranean forest. Glob Chang Biol. 2011; 17: 1036–1048.
- Thuiller W, Lavorel S, Aráujo MB, Sykes MT, Prentice IC. Climate change threats to plant diversity in Europe. Proc Natl Acad Sci. 2005; 102: 8245–8250. PMID: 15919825
- Lenoir J, Gégout JC, Marquet PA, de Ruffray P, Brisse H. A significant upward shift in plant species optimum elevation during the 20th century. Science. 2008; 320: 1768–1771. doi: 10.1126/science. 1156831 PMID: 18583610
- Hughes L. Biological consequences of global warming: is the signal already apparent? Trends Ecol Evol. 2000; 15: 56–61. PMID: 10652556
- 6. Quinn Thomas R, Canham CD, Weathers KC, Goodale CL. Increased tree carbon storage in response to nitrogen deposition in the US. Nat Geosci. 2009; 3: 13–17.
- Bréda N, Granier A, Aussenac G. Effects of thinning on soil and tree water relations, transpiration and growth in an oak forest (*Quercus petraea* (Matt.) Liebl.). Tree Physiol. 1995; 15: 295–306. PMID: 14965953
- 8. McDowell N, Brooks JR, Fitzgerald SA, Bond BJ. Carbon isotope discrimination and growth response of old *Pinus ponderosa* trees to stand density reductions. Plant Cell Environ. 2003; 26: 631–644.
- Martín-Benito D, Del Río M, Heinrich I, Helle G, Cañellas I. Response of climate-growth relationships and water use efficiency to thinning in a *Pinus nigra* afforestation. For Ecol Manage. 2010; 259: 967– 975
- Gea-Izquierdo G, Martín-Benito D, Cherubini P, Cañellas I. Climate-growth variability in Quercus ilex L. west Iberian open woodlands of different stand density. Ann For Sci. 2009; 66: 802–802.
- Linares JC, Camarero JJ, Carreira JA. Competition modulates the adaptation capacity of forests to climatic stress: insights from recent growth decline and death in relict stands of the Mediterranean fir Abies pinsapo. J Ecol. 2010; 98: 592–603.



- Piutti E, Cescatti A. A quantitative analysis of the interactions between climatic response and intraspecific competition in European beech. Can J For Res. 1997; 27: 277–284.
- 13. Martín-Benito D, Kint V, del Río M, Muys B, Cañellas I. Growth responses of West-Mediterranean Pinus nigra to climate change are modulated by competition and productivity: Past trends and future perspectives. For Ecol Manage. 2011; 262: 1030–1040.
- Martínez-Vilalta J, López BC, Loepfe L, Lloret F. Stand- and tree-level determinants of the drought response of Scots pine radial growth. Oecologia. 2012; 168: 877–888. doi: 10.1007/s00442-011-2132-8
 PMID: 21983639
- Vaganov EA, Hughes MK, Shashkin AV. Growth dynamics of conifer tree rings. Images of past and future environments. Berlin-Heidelberg: Springer; 2006.
- Gea-Izquierdo G, Fernández-de-Uña L, Cañellas I. Growth projections reveal local vulnerability of Mediterranean oaks with rising temperatures. For Ecol Manage. 2013; 305: 282–293.
- Canham CD, Papaik MJ, Uriarte M, McWilliams WH, Jenkins JC, Twery MJ. Neighborhood analyses of canopy tree competition along environmental gradients in New England forests. Ecol Appl. 2006; 16: 540–554. PMID: 16711043
- Fichtner A, Sturm K, Rickert C, Härdtle W, Schrautzer J. Competition response of European beech Fagus sylvatica L. varies with tree size and abiotic stress: minimizing anthropogenic disturbances in forests. J Appl Ecol. 2012; 49: 1306–1315.
- Landsberg J, Sands P. Physiological ecology of forest production: principles, processes and models. Boston: Academic Press; 2011.
- Ni F, Cavazos T, Hughes MK, Comrie AC, Funkhouser G. Cool-season precipitation in the southwestern USA since AD 1000: comparison of linear and nonlinear techniques for reconstruction. Int J Climatol. 2002; 22: 1645–1662.
- Tolwinski-Ward SE, Evans MN, Hughes MK, Anchukaitis KJ. An efficient forward model of the climate controls on interannual variation in tree-ring width. Clim Dyn. 2010; 36: 2419–2439.
- Andreu L, Gutiérrez E, Macias M, Ribas M, Bosch O, Camarero JJ. Climate increases regional treegrowth variability in Iberian pine forests. Glob Chang Biol. 2007; 13: 804–815.
- 23. IPCC. Climate Change 2007: The Physical Science Basis. Contribution of Working Group I to the Fourth Assessment Report of the Intergovernmental Panel on Climate Change. Solomon S, Qin D, Manning M, Chen Z, Marquis M, Averyt KB, Tignor M, Miller H, editors. New York, USA: Cambridge University Press; 2007.
- **24.** Ruiz-Labourdette D, Nogués-Bravo D, Ollero HS, Schmitz MF, Pineda FD. Forest composition in Mediterranean mountains is projected to shift along the entire elevational gradient under climate change. J Biogeogr. 2012; 39: 162–176.
- 25. Franco Múgica F, García Antón M, Sainz Ollero H. Vegetation dynamics and human impact in the Sierra de Guadarrama, Central System, Spain. The Holocene. 1998; 8: 69–82. PMID: 9519888
- Sánchez de Dios R, Benito-Garzón M, Sainz-Ollero H. Present and future extension of the Iberian submediterranean territories as determined from the distribution of marcescent oaks. Plant Ecol. 2009; 204: 189–205.
- 27. Rigling A, Bigler C, Eilmann B, Feldmeyer-Christe E, Gimmi U, Ginzler C, et al. Driving factors of a vegetation shift from Scots pine to pubescent oak in dry Alpine forests. Glob Chang Biol. 2013; 19: 229–240. doi: 10.1111/gcb.12038 PMID: 23504734
- 28. Valbuena-Carabaña M, González-Martínez SC, Gil L. Coppice forests and genetic diversity: A case study in *Quercus pyrenaica* Willd. from Central Spain. For Ecol Manage. 2008; 254: 225–232.
- Cañellas I, Montero G, Bachiller Á. Transformation of quejigo oak (Quercus faginea Lam.) coppice forest into high forest by thinning. Ann Ist Sper Selvic. 1996; 27: 143–147.
- Cañellas I, Del Río M, Roig S, Montero G. Growth response to thinning in Quercus pyrenaica Willd. coppice stands in Spanish central mountain. Ann For Sci. 2004; 61: 243–250.
- Corcuera L, Camarero JJ, Gil-Pelegrín E. Functional groups in Quercus species derived from the analysis of pressure–volume curves. Trees. 2002; 16: 465–472.
- Eilmann B, Zweifel R, Buchmann N, Fonti P, Rigling A. Drought-induced adaptation of the xylem in Scots pine and pubescent oak. Tree Physiol. 2009; 29: 1011–1020. doi: 10.1093/treephys/tpp035 PMID: 19483185
- **33.** Montserrat-Martí G, Camarero JJ, Palacio S, Pérez-Rontomé C, Milla R, Albuixech J, et al. Summerdrought constrains the phenology and growth of two coexisting Mediterranean oaks with contrasting leaf habit: implications for their persistence and reproduction. Trees. 2009; 23: 787–799.



- 34. Duursma RA, Kolari P, Perämäki M, Nikinmaa E, Hari P, Delzon S, et al. Predicting the decline in daily maximum transpiration rate of two pine stands during drought based on constant minimum leaf water potential and plant hydraulic conductance. Tree Physiol. 2008; 28: 265–276. PMID: 18055437
- Rinntech. TSAP-WIN. Time series analysis and presentation for dendrochronology and related applications. Version 0.53. 2003.
- Holmes RL. Computer assisted quality control in tree- ring dating and measurement. Tree-Ring Bull. 1983; 43: 69–78.
- **37.** Biondi F, Qeadan F. A theory-driven approach to tree-ring standardization: Defining the biological trend from expected basal area increment. Tree-Ring Res. 2008; 64: 81–96.
- Gea-Izquierdo G, Cañellas I. Analysis of holm oak intraspecific competition using Gamma regression. For Sci. 2009; 55: 310–322.
- Herrera S, Gutierrez JM, Ancell R, Pons MR, Frias MD, Fernandez J. Development and analysis of a 50-year high-resolution daily gridded precipitation dataset over Spain (Spain02). Int J Climatol. 2012; 32: 74–85.
- Mitchell TD, Jones PD. An improved method of constructing a database of monthly climate observations and associated high-resolution grids. Int J Climatol. 2005; 25: 693–712.
- Kirchner M, Faus-Kessler T, Jakobi G, Leuchner M, Ries L, Scheel H-E, et al. Altitudinal temperature lapse rates in an Alpine valley: trends and the influence of season and weather patterns. Int J Climatol. 2013; 33: 539–555.
- Goffe WL, Ferrier GD, Rogers J. Global optimization of statistical functions with simulated annealing. J Econom. 1994; 60: 65–99. PMID: <u>10138870</u>
- Johnson JB, Omland KS. Model selection in ecology and evolution. Trends Ecol Evol. 2004; 19: 101– 108. PMID: 16701236
- **44.** Burnham KP, Anderson DR. Model selection and multimodel inference: a practical information-theoretic approach. 2nd ed. New York, USA: Springer-Verlag; 2002.
- Pretzsch H, Biber P. A re-evaluation of Reineke's rule and stand density index. For Sci. 2005; 51: 304– 320.
- 46. R Development Core Team. R: A language and environment for statistical computing. R Foundation for Statistical Computing. 2011. Available: http://www.r-project.org/. Accessed 2015 Feb 25.
- 47. Bunn AG. A dendrochronology program library in R (dplR). Dendrochronologia. 2008; 26: 115–124.
- Murphy L. likelihood: Methods for maximum likelihood estimation. R package version 1.5. 2012. Available: http://cran.r-project.org/package=likelihood. Accessed 2015 Feb 25.
- **49.** Gómez-Aparicio L, García-Valdés R, Ruíz-Benito P, Zavala MA. Disentangling the relative importance of climate, size and competition on tree growth in Iberian forests: implications for forest management under global change. Glob Chang Biol. 2011; 17: 2400–2414.
- Moreno-Gutiérrez C, Battipaglia G, Cherubini P, Saurer M, Nicolás E, Contreras S, et al. Stand structure modulates the long-term vulnerability of *Pinus halepensis* to climatic drought in a semiarid Mediterranean ecosystem. Plant Cell Environ. 2012; 35: 1026–1039. doi: 10.1111/j.1365-3040.2011.02469.x PMID: 22146000
- Rozas V, García-González I. Too wet for oaks? Inter-tree competition and recent persistent wetness predispose oaks to rainfall-induced dieback in Atlantic rainy forest. Glob Planet Change. 2012; 94–95: 62–71.
- **52.** Webb WL, Newton M, Starr D. Carbon dioxide exchange of *Alnus rubra*. A mathematical model. Oecologia. 1974; 17: 281–291.
- Farquhar GD, Sharkey TD. Stomatal conductance and photosynthesis. Annu Rev Plant Physiol. 1982;
 33: 317–345.
- 54. Hikosaka K, Ishikawa K, Borjigidai A, Muller O, Onoda Y. Temperature acclimation of photosynthesis: mechanisms involved in the changes in temperature dependence of photosynthetic rate. J Exp Bot. 2006; 57: 291–302. PMID: 16364948
- D'Arrigo R, Wilson R, Liepert B, Cherubini P. On the "Divergence Problem" in Northern Forests: A review of the tree-ring evidence and possible causes. Glob Planet Change. 2008; 60: 289–305.
- **56.** Loehle C. A mathematical analysis of the divergence problem in dendroclimatology. Clim Change. 2008; 94: 233–245.
- Vayreda J, Martinez-Vilalta J, Gracia M, Retana J. Recent climate changes interact with stand structure and management to determine changes in tree carbon stocks in Spanish forests. Glob Chang Biol. 2012; 18: 1028–1041.



- Galiano L, Martínez-Vilalta J, Lloret F. Drought-induced multifactor decline of Scots pine in the Pyrenees and potential vegetation change by the expansion of co-occurring oak species. Ecosystems. 2010; 13: 978–991.
- Bigler C, Gričar J, Bugmann H, Čufar K. Growth patterns as indicators of impending tree death in silver fir. For Ecol Manage. 2004; 199: 183–190.
- **60.** Chen P- Y, Welsh C, Hamann A. Geographic variation in growth response of Douglas-fir to interannual climate variability and projected climate change. Glob Chang Biol. 2010; 16: 3374–3385.
- **61.** Huang J-G, Bergeron Y, Berninger F, Zhai L, Tardif JC, Denneler B. Impact of future climate on radial growth of four major boreal tree species in the Eastern Canadian boreal forest. PLoS ONE. 2013; 8: e56758. doi: 10.1371/journal.pone.0056758 PMID: 23468879
- 62. Bréda N, Huc R, Granier A, Dreyer E. Temperate forest trees and stands under severe drought: a review of ecophysiological responses, adaptation processes and long-term consequences. Ann For Sci. 2006; 63: 625–644.
- McDowell N, Pockman WT, Allen CD, Breshears DD, Cobb N, Kolb T, et al. Mechanisms of plant survival and mortality during drought: why do some plants survive while others succumb to drought? New Phytol. 2008; 178: 719–739. doi: 10.1111/j.1469-8137.2008.02436.x PMID: 18422905
- **64.** Gea-Izquierdo G, Viguera B, Cabrera M, Cañellas I. Drought induced decline could portend widespread pine mortality at the xeric ecotone in managed mediterranean pine-oak woodlands. For Ecol Manage. 2014; 320: 70–82.
- 65. Martínez-Vilalta J, Piñol J. Drought-induced mortality and hydraulic architecture in pine populations of the NE Iberian Peninsula. For Ecol Manage. 2002; 161: 247–256.
- 66. Ruiz-Benito P, Lines ER, Gómez-Aparicio L, Zavala MA, Coomes DA. Patterns and drivers of tree mortality in iberian forests: climatic effects are modified by competition. PLoS ONE. 2013; 8: e56843. doi: 10.1371/journal.pone.0056843 PMID: 23451096
- 67. Benavides R, Rabasa SG, Granda E, Escudero A, Hódar JA, Martínez-Vilalta J, et al. Direct and indirect effects of climate on demography and early growth of *Pinus sylvestris* at the rear edge: changing roles of biotic and abiotic factors. PLoS ONE. 2013; 8: e59824. doi: 10.1371/journal.pone.0059824 PMID: 23555794
- Kouba Y, Camarero JJ, Alados CL. Roles of land-use and climate change on the establishment and regeneration dynamics of Mediterranean semi-deciduous oak forests. For Ecol Manage. 2012; 274: 143–150.
- 69. Camarero JJ, Bigler C, Linares JC, Gil-Pelegrín E. Synergistic effects of past historical logging and drought on the decline of Pyrenean silver fir forests. For Ecol Manage. 2011; 262: 759–769.