#### **RESEARCH PAPER**



# Size-density trajectories for even-aged sessile oak (*Quercus petraea* (Matt.) Liebl.) and common beech (*Fagus sylvatica* L.) stands revealing similarities and differences in the mortality process

François Ningre<sup>1</sup> · Jean-Marc Ottorini<sup>1</sup> · Noël Le Goff<sup>1</sup>

Received: 19 November 2018 / Accepted: 18 June 2019 / Published online: 17 July 2019  $\ensuremath{\mathbb{C}}$  INRA and Springer-Verlag France SAS, part of Springer Nature 2019

#### Abstract

• Key message We studied the size-density trajectories of pure even-aged unthinned experimental sessile oak (Quercus petraea (Matt.) Liebl.) stands in the ranges of 994–135,555 trees per hectare initial densities, observed from the ages of 5 to 38. We compared them to unthinned beech (Fagus sylvatica L.) stands from the same experimental area. An original piecewise polynomial function was fitted to the trajectories, giving way to various applications. For each species, the initial number of trees per hectare ( $N_0$ ) and the mean girth at breast height at the onset of mortality (Cg<sub>0</sub>) were parameters of the trajectory model, in addition to the parameters of the maximum size-density lines. The two former parameters (Cg<sub>0</sub>,  $N_0$ ) were tied by a linear relationship, which allowed the prediction of trajectories for initial densities not included in the study data. For oak and beech, mortality onset occurred at a constant relative density (RDI), for all initial stand densities, respectively, 0.35 and 0.29. The comparison of the size-density trajectories of oak and beech in its space requirements. • Context This paper models the size-density trajectories of pure even-aged sessile oak stands, including the early development stage. It compares the oak results with those on common beech on the same site from a previous study.

• *Aims* A novel approach to size-density trajectories, with an original polynomial piecewise function previously used for beech stands on the same site, was satisfactorily used again as a mortality model to provide references to managers of oak forests.

• *Material and methods* A 38-year-old oak spacing trial, re-measured from year 5 to year 38, provided the opportunity to study the size-density trajectories of unthinned stands of this species.

• *Results* The fit of the piecewise polynomial function allowed us to estimate the parameters of the size-density trajectories of all stands, which were the initial number of trees per hectare  $(N_0)$  and the mean girth at breast height at the onset of mortality  $(Cg_0)$ , in addition to the intercept (*a*) and slope (*b*) of the maximum size-density line. A linear relationship between  $Ln(N_0)$  and  $Ln(Cg_0)$  (where Ln is the Neperian logarithm) allowed us to reduce the number of parameters needed to fit the trajectories and made it possible to predict a size-density trajectory from any initial density not observed in the experimental stands. Moreover, this later line appeared to be parallel to the maximum size-density line, and new data allowed to establish that this was also the case for the beech stands on the same site. This parallelism feature translates to the onset of mortality occurring at the same relative density for stands of every initial density that is 0.35 for oak and 0.29 for beech.

Handling Editor: John M. Lhotka

Contribution of the co-authors: The three co-authors read and revised the manuscript and contributed equally to the analysis of the data. François Ningre conducted the experiment, managed the data, and contributed to the writing of the paper. Jean-Marc Ottorini supervised the statistical treatment of the data and the writing of the paper. Noël Le Goff was particularly influential in the development of the discussion and contributed to the writing of the paper.

François Ningre francois.ningre@inra.fr AgroParisTech, INRA, Silva, Université de Lorraine, 54000 Nancy, France



🖄 Springer

• Conclusion Given the parameters of the maximum size-density line, a single-parameter function family could be used to predict the size-density trajectories of oak stands. The predicted trajectories have various applications in oak silviculture and growth simulators. The oak data and new data for beech stands on the same site allowed to compare the two species and draw conclusions on similitudes and differences concerning mortality and space requirements of both species.

Keywords Mortality  $\cdot$  Intra-specific competition  $\cdot$  Relative density  $\cdot$  Size-density curve modeling  $\cdot$  Piecewise function  $\cdot$  Stand management

#### **1** Introduction

Size-density relationships provide an insight into the dynamics of undisturbed forest stands from the point of view of the correlated variations of a mean stand characteristic and the number of trees per hectare (number of trees is sometimes used as an abbreviation). Usually, the mean characteristic of the stand is the mean quadratic diameter at breast height (1.30 m) or the mean quadratic girth at breast height (mean girth is used as an abbreviation). We will consider pure undisturbed even-aged stands, only subject to intra-specific competition-induced mortality (coined "regular mortality" by Lee 1971). It has been observed that, as the mean quadratic girth at breast height (Cg) of these stands increases, the number of trees per hectare (N) does not decline until a critical value  $(Cg_0)$  of Cg, which marks the onset of competition induced tree mortality, is reached (first stage of stand development). Then, for greater values of Cg (second stage of stand development), N progressively decreases (Smith and Hann 1984, 1986), and eventually, its relative variation becomes proportional to Cg relative increment (third stage of stand development). This later relationship<sup>1</sup> translates to Ln(N) depending linearly on Ln(Cg), where Ln is the Neperian natural logarithm. This linear relationship was described and studiedprobably for the first time-by Reineke (1933) and became a main subject of investigations on various forest species, afterwards, as attested to by many observations of forest stand data from Reineke (1933) to-for instance-Pretzsch and Biber (2005) and more recently Trouvé et al. (2017). Many other references were given in Le Goff et al. (2011) and Ningre et al. (2016a, b). Thus, the third stage of stand development is reached when stand density is at its maximum value, and the linear relationship between the maximum number of individuals per unit area and their mean size, on a log-log scale, is called the *maximum size-density relationship*. We do not consider a later old growth stage, due to tree decline, when overstory trees die in an irregular fashion (Oliver 1996). Maximum size-density relationships exist also for plants in general (Yoda et al. 1963; Deng et al. 2012). For forest trees, it has been used to define relative stand density measures (Reineke 1933; Curtis 1970, 1982) and contributed to establish management diagrams (Drew and Flewelling 1979; Jack

<sup>&</sup>lt;sup>1</sup> Stands of greater numbers of trees per hectare are very scarce above this line.





and Long 1996, Lopez-Sanchez and Rodriguez-Soalleiro 2009; VanderSchaaf and Burkhart 2012; Long and Vacchiano 2014). Useful discussions of self-thinning of forest stands and maximum size-density can be found in chapter 6 of Johnson et al. (2009) and in Lhotka and Loewenstein (2008), with references on past works on the subject.

For a given forest stand, the size-density trajectory is the succession of the observed values of N and Cg, and, by extension, of the logarithms of these values, over a given time period. In this paper for oak, we used a new kind of continuous smooth piecewise polynomial function-introduced in a previous work on beech (Ningre et al. 2016a)-to model and fit the mean size-density trajectories of oak stands, expressing the number of trees (Ln(N)) as a function of the mean girth (Ln(Cg)) over the three development stages considered above. The number of trees per hectare  $(N_0)$  and the mean girth  $(Cg_0)$ at the onset of mortality were the parameters of this spline function, which allowed the explicit estimation of these two characteristics. Other uses of segmented polynomial functions to model size-density trajectories appear in VanderSchaaf and Burkhart (2008), VanderSchaaf (2010), and Cao and Dean (2008). With the function we used, all the stand characteristics at the critical development stages, namely  $(N_0)$ ,  $(Cg_0)$ , and  $(Cg_1)$ , the mean girth at which the stands reach the maximum density, could be explicitly estimated.

In this paper, we report a study of the size-density trajectories of unthinned oak stands. These oak stands are a part of the same experimental site (Lyons-la-Forêt) as the beech stands whose data were used in a previous study of size-density trajectories (Ningre et al. 2016a). The two species shared a common experimental design. The same three segments piecewise polynomial function defined in the beech study was used for the oak stands; thus, comparisons could be made between the two species. The oak stand measurements covered a 33-year period, beginning at an early development stage, and with a time interval between measurements of one to 3 years, exceptionally 4 years. These data featured a wide range of initial densities. As a result of a functional dependence between the initial oak stand density  $(N_0)$  and the mean girth  $(Cg_0)$  at the onset of mortality, all size-density trajectory equations reduced to a one-parameter function family indexed by the initial stand densities.

There are few studies on self-thinning and maximum sizedensity of oak stands, due to the scarcity of data needed

(Johnson et al. 2009). Most are based on mixed species forest data in the USA (Williams 2003, for instance). In Europe, Barrio Anta and Álvarez González (2005) considered stand density management measures related to the stand density index of Reineke (1933), for a limited density range of pedunculate oak (Quercus robur L.) stands. For the same purpose, Fonseca et al. (2017) obtained maximum size-density relationships for cork oak stands (Quercus suber L.) with up to 3350 trees  $ha^{-1}$ . The review of Pretzsch and Biber (2005) on maximum size-density lines for European pure even-aged forest stands included oak stands with a rather limited range of densities. In France, maximum size-density lines were established for sessile oak on forest inventory data by Charru et al. (2012) and on data from unthinned experimental stands by Le Goff et al. (2011). Thus, the oak data set of the Lyons-la-Forêt long-term experiment addressed this knowledge gap.

Throughout this work, we used a relative density measure (Curtis 1970), the relative density index (RDI), to measure stand density (Drew and Flewelling 1979). For a pure evenaged stand with quadratic mean girth at breast height Cg, N trees per hectare, and mean area—or average growing space—per tree s = 1/N, the stand RDI is the ratio  $s_m/s$ , where  $s_m$  is the mean area per tree of a stand with the same quadratic mean girth at breast height and having the maximum possible number of trees per hectare ( $N_{\text{Max}}$ ) permitted by this mean girth. Thus, we have: RDI =  $N / N_{\text{Max}} = N / (e^a \text{Cg}^b)$ , where a and b are the parameters of the maximum size-density—linear—relationship for the considered species ( $\text{Ln}(N_{\text{Max}}) = a + b \text{Ln}(\text{Cg})$ ), respectively, the constant at the origin and the slope.

Further references and details, particularly concerning the origin and the development of forest tree stand trajectories and their applications, are to be found in the previous beech study (Ningre et al. 2016a). For this study, we used nonlinear mixed models, leading more easily to detailed statistical analysis than "frontier methods" considered by Zhang et al. (2005) and Vanclay and Sands (2009).

#### 2 Material and methods

## 2.1 The Lyons-la-Forêt experiment and the oak plot survival and mortality data

#### 2.1.1 Study site and experimental design

The data of this study came from an experimental plantation established in the spring of 1981 in the Lyons-la-Forêt National Forest in northwestern France (49° 28' 19" N, 1° 33' 52" E). This experiment was set up at the same time and in the same site as the experimental beech (*Fagus sylvatica* L.) plantation used to model size-density trajectories of beech

stands (Ningre et al. 2016a). The soil and climate of the site were very favorable for beech and for oak. The dominant height<sup>2</sup> of oak at 36 years of age was 18.7 m, which corresponds to an excellent site index for oak (Sardin 2008).

The acorns used to regenerate the experimental site were all from the same origin (state forest of Roumare in Normandy, northwest France) and were either directly sown on the site or planted as seedlings. The oak seedlings were 1 year old at the date of plantation, in the spring of 1981, at which stage they were 25-cm tall (Colin et al. 2012). The seedlings were planted in an open area at three different densities (1333, 2667, and 5333 seedlings per hectare), and the acorns were sown at the density of 50 trees per m<sup>2</sup> (500,000 trees per hectare) (Table 1). Irregular mortality (Ningre et al. 2016a) due to transplant shock was rather low and planted seedlings were replaced after mortality, more or less successfully, in the year following plantation (Colin et al. 2012).

The planted plots were arranged in a randomized complete block design, covering a total area of 1.3 ha, whereas a single sown plot of 500 m<sup>2</sup> was installed close to the planted plots. The design comprised four blocks, each consisting of three rectangular plots corresponding to the actual stand densities (1333, 2667, and 5333 seedlings per hectare), the plot size depending on initial density (Table 1). Each plot was surrounded by a buffer zone of 4 to 6 m in width, depending on the plantation density. To maintain a strictly intra-specific competition in the early phases of stand development, several vegetation and pest control measures were undertaken during the experiment (see Colin et al. 2012 for details).

The dominant heights of the 4 blocks in 2003 (mean of dominant heights for all densities)—12.19, 12.48, 12.75, and 12.42 at 24 years of age for blocks 1, 2, 3, and 4 respectively—were not significantly different (ANOVA analysis), which confirmed the homogeneity of the site conditions of the four blocks. The dominant height of the sown plot in the same year was slightly lower (11.3 m), probably due to the high level of inter-tree competition.

#### 2.1.2 Density "treatments"

Irregular mortality, after initial replacement of dead planted seedlings, was relatively low, except for the plot at planting density of 1333 trees per hectare in block 4. Then, five density treatments were defined corresponding to the planting densities and the density of sowing, and the plots with comparable initial densities were grouped together. The plots with a planting density of 1333 trees per hectare were split into two groups, 1333a and 1333b, as they presented contrasted initial densities (Table 1).

 $<sup>^2</sup>$  The dominant height was calculated as the mean of the dominant heights of the 6 unthinned plots in 2015.



Planting density (trees ha <sup>-1</sup> )	Plot area (m <sup>2</sup> )	area (m <sup>2</sup> ) Treatment	Actual initial density (trees $ha^{-1}$ )					
			Block 1	Block 2	Block 3	Block 4	Mean	
1333	750.0	1333a	b	•	•	994	994	
		1333b	1227	<sup>a</sup> 1200	<sup>a</sup> 1267	•	1231	
2667	525.0	2667	2560	<sup>a</sup> 2538	<sup>a</sup> 2558	2438	2523	
5333	487.5	5333	5333	<sup>a</sup> 5333	<sup>a</sup> 5333	5333	5333	
Sowing density (acoms per m <sup>2</sup> )	Plot area (m <sup>2</sup> )	Treatment	Actual initia (trees ha <sup>-1</sup> )	al density				
50	500	500,000	135,555					

Table 1 Description of the Lyons-la-Forêt experiment, established in 1981

<sup>a</sup> Thinned plots

<sup>b</sup> No such plot after reclassifying initial treatment

Some of the planted plots were thinned one time. For those plots, the thinning was carried out in 2003 for the plots of block 2 and block 3 at initial planting densities of 1333, 2667, and 5333 trees per hectare. Stand density was reduced to a same level—600 to 656 trees per hectare—independently of the initial density, after selecting crop trees (between 30 and 45 trees selected, depending on plot area). Only the part of the size-density trajectory before thinning was used in the modelization process, while the part of the observed density trajectories after thinning was considered for comparison with the predicted trajectories obtained from the model.

#### 2.1.3 Size-density data

The oak stand data, quadratic mean girth (Cg) and density (N)—number of trees per hectare—cover a 33-year period from 1984 to 2017 (Ningre 2019).

**Planted plots** At the time of the first measurement in 1984, a permanent sample of 43 to 50 trees with a uniform spatial distribution was selected in each plot (i.e., a total of 580 trees). From 1984 to 1997 (i.e., in years 1984, 1990, 1994, and 1997), total height and girth at breast height were regularly measured on all live trees from the original sample. The quadratic mean girth (Cg) and the density (*N*)—number of trees per hectare—of each plot were estimated from the tree sample data (as it was done for beech, Ningre et al. 2016a). Cg was estimated for the first time in 1990 when nearly all of the trees had reached the height of 1.30 m.

From 2000 to 2017, all live trees in each plot were measured regularly for girth at breast height (nearly each year since 2004). The total number of trees measured, before and after some plots were thinned in 2003, appears in Table 2. For the period 2000 to 2017, plot density and mean girth were obtained from the complete inventory of live trees per plot. The reduction of the number of trees measured, apart from the

Deringer



reduction due to thinnings between 2003 and 2004 for "thinned plots," was due to self-thinning alone (*regular mortality*: see Ningre et al. 2016a).

**Sown plot** At the time of the first measurement in 1987, the tree survey was made on nine  $1\text{-m}^2$  sub-plots systematically distributed in the sown area of the experiment. All trees were higher than 1.3 m. For the following surveys and up to 2006, one plot of 50 m<sup>2</sup>, centered in the 500-m<sup>2</sup> sown plot, was defined (Tables 1 and 3). A last survey in 2017 was done on a larger area of nearly 170 m<sup>2</sup> including the 50-m<sup>2</sup> sub-plot.

## 2.2 Size-density curve modeling and statistical analysis

The three segments piecewise polynomial function defined below has been successfully applied to beech and Douglasfir stands (Ningre et al. 2016a, b). It is a continuous and smooth—i.e., continuously differentiable—function. We will refer below to the definitions given in the introduction. The

Table 2Number of live trees measured in the planted plots of theLyons-la-Forêt experiment since the first complete survey in year 2000

Thinning treatment	Number of trees measured						
	Before thinning		After thinning				
	2000	2003	2004	2017			
Unthinned plots	688	608	579	329			
Thinned plots	734	632	218	204			
Total	1422	1240	797	533			

After thinning in 2003, the totals are only given for the first (2004) and the last (2017) years of survey

size-density trajectory equation for a given stand is defined as follows with the function *f*:

$$\begin{aligned} \mathrm{Ln}(N) &= f(\mathrm{Cg}_0, N_0, a, b, \mathrm{Cg}) \\ &= \begin{cases} \mathrm{Ln}(N_0) & \text{if } 0 < \mathrm{Cg} \leq \mathrm{Cg}_0 \\ p + q \mathrm{Ln}(\mathrm{Cg}) + r \mathrm{Ln}(\mathrm{Cg})^2 & \text{if } \mathrm{Cg}_0 < \mathrm{Cg} \leq \mathrm{Cg}_1 \\ a + b \mathrm{Ln}(\mathrm{Cg}) & \text{if } \mathrm{Cg} > \mathrm{Cg}_1 \end{cases} (1) \end{aligned}$$

The parameters p, q, and r appear in the continuity and derivability constraints which solve in Cg<sub>0</sub>,  $N_0$ , a, and b to give the following values:

$$\begin{cases} p = \text{Ln}(N_0) + \frac{b^2 \text{Ln}(\text{Cg}_0)^2}{4\text{Ln}(\text{RDI}_0)} \\ q = -\frac{b^2 \text{Ln}(\text{Cg}_0)}{2\text{Ln}(\text{RDI}_0)} \\ r = \frac{b^2}{4\text{Ln}(\text{RDI}_0)} \end{cases}$$
(2)

RDI<sub>0</sub> being the stand relative density just before the occurrence of tree mortality, when the number of trees is still  $N_0$ , and the mean girth is Cg<sub>0</sub> (Ln (RDI<sub>0</sub>) = Ln( $N_0$ ) – (a + bLn (Cg<sub>0</sub>))). From the continuity and derivability constraints again, the mean girth at breast height (Cg<sub>1</sub>) of the stand when it reaches the maximum density depends only on the previous parameters a, b, Cg<sub>0</sub>, and  $N_0$  and is given by the following equation:

$$\operatorname{Ln}(\operatorname{Cg}_1) = \frac{2(\operatorname{Ln}(N_0) - a) - b \operatorname{Ln}(\operatorname{Cg}_0)}{b}$$
(3)

Adequately, Eq. (1) is qualitatively suitable to depict the development stages of a pure even-aged forest stand reflected by its size-density trajectory, which is continuously evolving from an initial plateau to a linear maximum size-density relationship on a double logarithmic scale (Fig. 1).

Equation (1) was fit to the oak data using a mixed effect model with b as a fixed parameter common to all treatments. As for the preceding beech study (Ningre et al. 2016a), a graphical analysis suggested that the parameter a had a mean value common to all treatments with an added normal random effect due to stand to stand variability and additional hypotheses. The parameters depending on the treatments were  $Cg_0$  and  $N_0$ , the first as a fixed parameter, and the second having a normal random component due to stand effects. The resulting statistical equation was the following:

$$\operatorname{Ln}(N_{ijk}) = f\left(Cg_{0i}, N_{0i} + N_{0ij}, a + a_{ij}, b, Cg_{ijk}\right) + \varepsilon_{ijk}$$
  

$$i = 1, \dots, n$$
  

$$j = 1, \dots, m_i$$
  

$$k = 1, \dots, l_{ij}$$
(4)

where the indices *i*, *j*, and *k* are for treatment, stand, and year, respectively; n is the number of treatments;  $m_i$  is the number of stands for treatment *i*; and  $l_{ii}$  is the number of years when stand *i* was measured in treatment *i*. Statistical treatments of the oak data were based on the following hypotheses of the mixedeffects models (Pinheiro and Bates 2000). The within-group residual errors  $\varepsilon_{iik}$  are normally distributed random variables with mean 0; the random effects  $a_{ij}$  and  $N_{0ij}$  are such that the vectors  $(a_{ii}, N_{0ii})^T$  are normal variables with mean 0 and variance-covariance matrix  $\Psi$ , independently distributed from one treatment or one stand to the other (i.e.,  $cov(a_{ij}, a_{i'i'}) =$  $cov(N_{0ij}, N_{0i'j'}) = cov(a_{ij}, N_{0i'j'}) = 0$ , if  $i \neq i'$  or  $j \neq j'$ ). Graphical analysis showed that for the residual errors ( $\varepsilon_{iik}$ ), a standard error  $(\sigma_{ii})$  specific to each stand was needed. This later hypothesis could be handled with the preceding ones by the REnvironment for Statistical Computing, with the mixed model package *nlme* that was extensively used during the study (Pinheiro and Bates 2000; Pinheiro et al. 2014; R Core Team 2014). These hypotheses were subjected to validation.

Furthermore, based on this fit, graphical analysis showed that the data were reasonably consistent with the assumption of aligned inflection points (Ln (Cg<sub>0</sub>), Ln( $N_0$ )), or, in other words, that there were two parameters  $a_1$  and  $b_1$  satisfying the following equations:

$$Ln(N_{0i}) = a_1 + b_1 Ln(Cg_{0i}), i = 1, ..., n$$
(5)

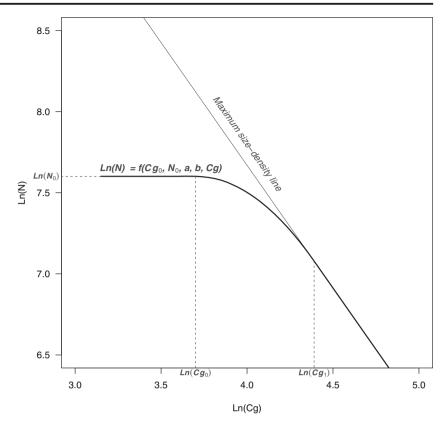
Consequently, Eq. (4) was fit to the data with the constraints of Eq. (5). For this purpose, the mean girth (Cg) was

Table 3Number of treesmeasured and calculated standdensity in the sown plot of theLyons-la-Forêt experiment, since1987

Year	Age	Number of trees measured	Plot area (m <sup>2</sup> )	Number of trees (50 m <sup>2</sup> )	Stand density (trees ha <sup>-1</sup> )
1987	7	122	9.0	678	135,555
1990	10	49	9.0	272	54,444
1994	14	130	50.0	130	26,000
1997	17	86	50.0	86	17,200
2000	20	47	50.0	47	9400
2003	23	38	50.0	38	7600
2006	26	30	50.0	30	6000
2017	37	45	169.6	13	2653



**Fig. 1** Graph of the size-density trajectory model, in log-log scales, defined by a piecewise polynomial function with Eqs. (1) and (2). Mortality onset occurs at  $(Cg_0, N_0)$  and the reach of maximum density at  $Cg_1$ . This function models the three stages of forest stand development in terms of size and density. Equation (4) is the statistical model used to fit this function



replaced in Eq. (4) by its value as a function of the initial number of trees per hectare ( $N_0$ ) obtained from Eq. (5), and Eqs. (1) and (2) were passed to the *nlme* fitting package as a R function.

#### 3 Results

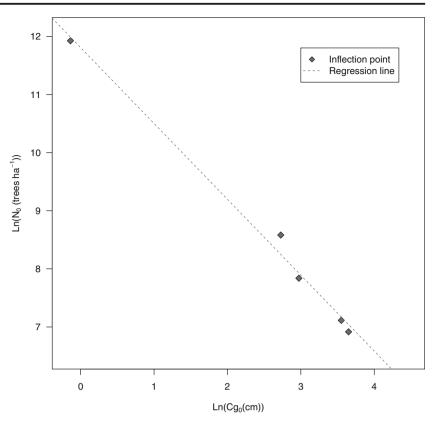
The fit of Eq. (4)—the statistical version of Eq. (1)—to the oak data clearly showed a linear relationship (Fig. 2) between the estimated values of  $Ln(N_0)$  and  $Ln(Cg_0)$  ( $Ln(N_0)=11.81-$ 1.31Ln(Cg<sub>0</sub>),  $R^2 = 0.99$ ). Consequently, Eq. (4) was fit to the data with the constraints of Eq. (5) (that is, mean girth (Cg) was replaced in Eq. (4) by its value as a function of the initial number of trees per hectare  $(N_0)$  obtained from Eq. (5)). We assumed that there was a random effect due to treatment for the parameter  $a_1$ , without interaction with the stand effects. This random effect was needed to obtain estimates of  $a_1$  and  $b_1$  close to the values of the parameters of the line fitted to the inflection points estimated by the unconstrained fit of Eq. (4). Resulting from this fit, Fig. 3 shows the fitted trajectories for each treatment with the aligned inflection points and their limiting maximum size-density line, together with the observed stand data. The standardized-corrected to allow for plot discrepanciesresiduals of the fit relative to the fitted values did not show time dependence, which is consistent with the graphics presentation of their empirical autocorrelation function (R ACF function, not





shown) nor did they show heteroscedasticity (Fig. 4). Normality of these residuals was assessed with a QQ plot (Fig. 5). The normality of the random effects was also assessed by a QQ plot (except for the random effect associated with  $a_1$ , because there were too few values). The estimated values of the parameters  $a_1$  and  $b_1$  ( $a_1 = 11.87$  and  $b_1 = -1.331$ ) were very close to the values obtained with the—least square—linear regression fit to the estimated values of the inflection points resulting from the fit of the unconstrained equation (i.e., Eq. (4) alone). Table 4 gives the parameters and statistics of the fit of Eq. (4) with the constraints of Eq. (5) (referred hereafter as trajectory model 1).

Then, the attempt was made to fit Eq. (4) with the constraints of Eq. (5) and the hypothesis of the alignment of the inflection points parallel to the maximum size-density line (Fig. 6; Table 5), i.e., with the additional constraint ( $b_1 = b$ ). The likelihood ratio test (Table 6) failed to reject this hypothesis at the 1% probability level (Wilks  $\chi^2$  test). The diagnostic plots of this fit (trajectory model 2) showed as good results as those previously performed without the hypothesis of parallelism, and the adequacy of the fitted model was fully assessed by displaying the fitted and observed values on the same plot (Fig. 7). Relying on this latest fit, we derived stand characteristics for the various treatments at the critical stand development stages corresponding to the onsets of mortality and maximum RDI (Table 7). The ages appearing in this table were obtained thanks to a mean girth-age nonlinear relationship **Fig. 2** Alignment of the inflection points of the oak stand sizedensity trajectories obtained by fitting Eq. (4), without constraint, to the oak stand data of the Lyonsla-Forêt experiment



fitted to the experimental data, with the plot initial densities (trees  $ha^{-1}$ ) as a covariate (1.93 cm residual standard deviation for the mean girth estimation).

**Fig. 3** The oak stand size-density trajectories observed data of the Lyons-la-Forêt experiment and the model obtained by fitting to them Eq. (4), with the constraints of Eq. (5) (alignment of the inflection points). The maximum size-density line and the line where lie the inflection points are represented

Finally, the size density trajectory data of the stands that were eventually thinned to 621 trees per hectare were plotted together with trajectory model 2 for stands of initial density

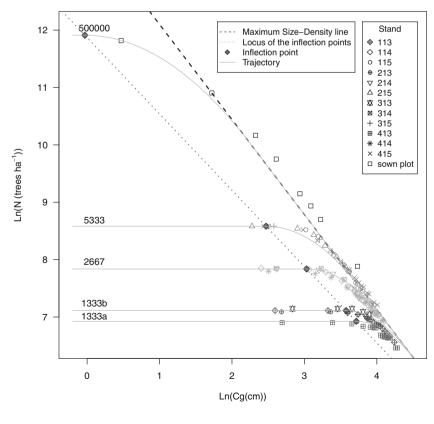
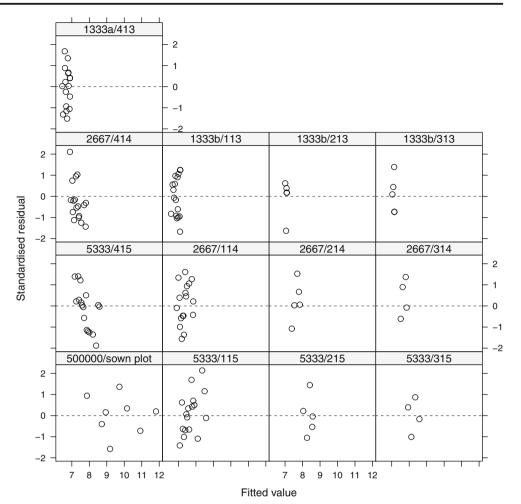




Fig. 4 Standardized residuals versus the fitted values for the fit of Eq. (4) trajectory model, with the alignment of the inflection points constraints (Eq. (5)) to the oak stand data of the Lyons-la-Forêt experiment. Neither bias, heteroscedasticity, nor correlation appear. Each panel is identified with the format *treatment/stand* 



equal to the stand densities to which the thinned stands were lowered. Figure 8 allows comparing the observed trajectories with the trajectories predicted by this model.

#### **4** Discussion

#### 4.1 Statistical treatment of the experimental data

One might think that a statistical test could be needed to assess the alignment of the inflection points. But, on one hand, in this context of a mixed model, as both random and fixed effects are involved, there is no statistical test currently available (Pinheiro and Bates 2000, pp. 82–91 § 2.4 *Hypothesis tests and confidence intervals*) to make the decision. The difference between the *AIC* values of the two models were large, but it did not seem advisable to resort to *AIC* in this case, as the aligned inflection point model was not embedded in the unconstraint model (because the structures of random effects in the two models were different), and the use of *AIC* is controversial in this case (Burnham and Anderson (1998), Ripley (2004)). On the other hand, we cannot think that there is no

 $\underline{\textcircled{O}}$  Springer

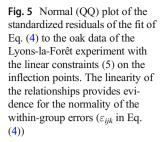


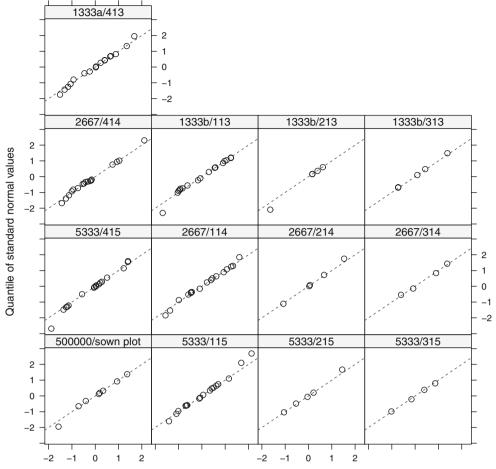
monotonic relationship between the initial densities of stands, and the mean girths at the onset of mortality. And, as it appears in Fig. 2, it does not seem that an alternative to a log-log linear relationship is possible.

Concerning the parallelism of the inflection point alignment to the maximum-size density line, the significance level of 1% probability was retained. This level was more prone to the risk of accepting a false hypothesis than the 5% level. But, Pinheiro and Bates (2000) warned that the statistical test used in this case is anticonservative (and they add "sometimes quite badly so"), that is, the resulting p value is underestimated. Moreover, no lack of fit of the model is appearing on Fig. 7, which does not cast doubt on the adequacy of the model.

#### 4.2 Modelization of the size-density trajectories

The Lyons-la-Forêt density trial allowed us to analyze and fit the size-density trajectories of oak for a wide range of initial densities, as we did previously for beech on the same site (Ningre et al. 2016a). Similarly, the considered period covers the early development stage before competition-induced mortality appears, up to the stages where stands reach and follow





Quantile of the standardised residuals

the maximum size-density line (except for the lowest initial densities) with a particular attention to the onset of mortality (inflection point of the size-density trajectories). Moreover, we revised the size-density trajectories of beech because new data were available (see Appendix 1). Thus, the Lyons-la-Forêt density trial gave us the opportunity to compare the

characteristics of the size-density trajectories of oak and beech on the same site conditions.

The size-density trajectory model, previously established for beech (Ningre et al. 2016a) and used for Douglas-fir (Ningre et al. 2016b), worked also for oak in the Lyons-la-Forêt trial. The piecewise polynomial function defined (Eq.

Parameter	Treatment	Observed value $^{\dagger}$	Estimate	Std. error	t value	p value
a b	All	_	13.757 	0.095 0.022	144.66 76.14	$0^{\ddagger}$
$a_1 \\ b_1$	All	_	11.869 1.331	0.199 0.067	59.59 19.92	0
$N_0$ (trees ha <sup>-1</sup> )	1333a 1333b	994 1231	1018 <sup>¶</sup> 1228	39.12 22.87	26.01 53.69	0
	2667	2523	2534	33.39	75.89	
	5333	5333	5336	39.61	134.72	
	500,000	135,555	148,740	7401.99	20.09	
Residual std. devi	iation = $0.027$ ; d	f=117				

Table 4Parameter estimates and<br/>statistics of Eq. (4) fit to the oak<br/>experimental stand data with the<br/>constraints of Eq. (5)

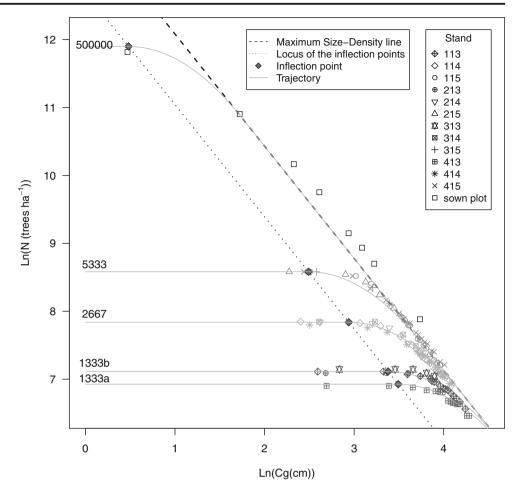
<sup>†</sup>Mean of observed values in a treatment

<sup>‡</sup> Far smaller than the standard probability levels

 ${}^{{}^{I\!\!I}}$  Rounded to the nearest integer



**Fig. 6** The oak stand size-density trajectories obtained by fitting Eq. (4) to the data of the Lyons-la-Forêt experiment, with alignment of the inflection points parallel to the maximum size-density line (Eq. (5), with the additional constraint  $b_1 = b$ )



(4)) proved adequate to represent the size-density trajectories of unthinned oak stands of various initial densities, from the early stages of development preceding the onset of mortality up to the maximum relative density. The components (Cg<sub>0</sub>,  $N_0$ ) of the inflection point of a given trajectory are parameters of this function, together with the specific parameters (*a*, *b*) of the maximum size-density line. The logarithms of these two components were linearly correlated for the oak stands of this study. Thus, as previously seen for beech and Douglas-fir, their size-density trajectories were uniquely determined by the initial stand density  $N_0$ .

#### 4.3 Maximum size-density line

The constant and slope parameters of the maximum sizedensity line (a = 13.733 and b = -1.652 respectively)

Parameter	Treatment	Observed value $^{\dagger}$	Estimate	Std. error	t value	p value
a b	All	_	13.733 - 1.652	0.092 0.021	149.94 - 79.01	0‡
$a_1$	All	_	12.694	0.226	56.19	0
$N_0$ (trees ha <sup>-1</sup> )	1333a 1333b	994 1231	1018 <sup>¶</sup> 1228	43.85 25.37	23.22 48.42	0
	2667	2523	2536	34.39	73.74	
	5333	5333	5333	41.20	129.45	
	500,000	135,555	147,136	7074.92	20.80	
Residual std. devi	ation = $0.027$ ; d	f=118				

<sup>†</sup>Mean of observed values in a treatment

<sup>‡</sup> Far smaller than the standard probability levels

 $\ensuremath{\P}$  Rounded to the nearest integer



 Table 5
 Parameter estimates and statistics of Eq. (4) fit to the oak experimental stand data with the constraints of Eq. (5), and where,

in addition,  $b_1 = b$ 

**Table 6** ANOVA for the fit of Eq. (4) to the oak data with the constraints of Eq. (5), (1) without or (2) with the additional constraint  $b_1 = b$ 

Model	Number of parameters	AIC	Log. likelihood	Test	Likelihood ratio	$p$ value $\left(\chi_1^{2^*}\right)$
(1) with constraints (5)	26	- 555.74	303.87			
(2) with constraints (5) and $b_1 = b$	25	- 551.49	300.74	(1) vs. (2)	6.252	0.0124

\*Likelihood ratio test (Wilks)

obtained for oak in this study, with the constrained fit (*trajectory model 2*), were close to the ones previously obtained in a study dedicated to the comparison of maximum size-density lines of several broadleaved species on a larger scale in France (13.531 and -1.566 respectively, Le Goff et al. 2011). These later values were not contained in the confidence intervals established for oak parameters in this study [13.56, 13.90] and [-1.69, -1.61] for the constant and slope parameters respectively, but close to the lower limit for the intercept and to the upper limit for the slope. The values obtained for oak by Charru et al. (2012) differed much more (14.87 and -1.911 respectively), being largely outside the confidence intervals of the parameters obtained in this study: this may be due to the

uncertainty of the maximum size-density line established by Charru et al. (2012) from data contained in a restricted diameter interval (15 to 30 cm) which, moreover, did not correspond to the interval of diameters of this study (1 to 25 cm). The estimation of the constant and slope parameters for oak in the Lyons-la-Forêt experiment will possibly be improved, as the plots at low initial planting densities (1333 trees per ha) will reach the maximum size-density line, that is when Cg and N will reach the values Cg<sub>1</sub> and  $N_1$  respectively (see Table 7).

The constant and slope parameters of the maximum sizedensity line obtained for beech in the same experiment (Table 8; Appendix 1) compared relatively well with those of oak: the oak intercept (13.733) was contained in the beech

Fig. 7 Observed and predicted size-density trajectories of the oak stands of the Lyons-la-Forêt experiment obtained with the fit of the model defined by Eq. (4) and the constraint of alignment of the inflection points parallel to the maximum size-density line. The plain line is the prediction at the treatment level which does not include the random effects due to stand-to-stand variations accounted for by the (complete) fit represented by the dashed line. The figure does not show any lack of fit

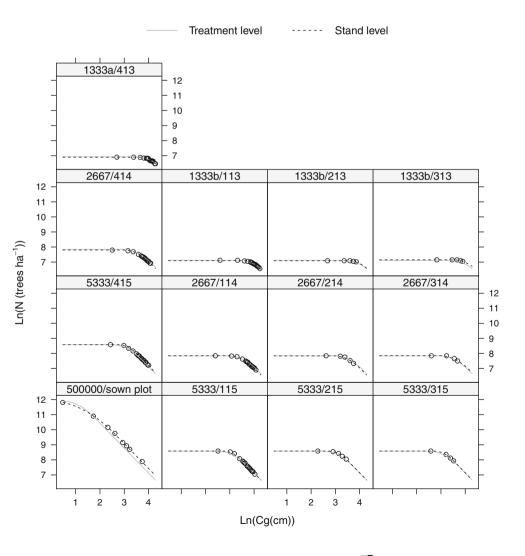




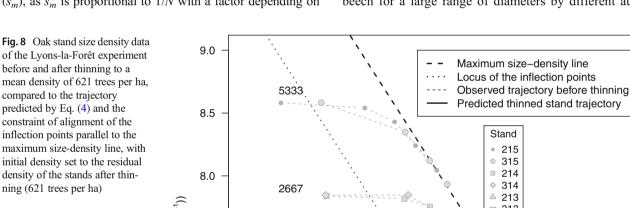
Table 7 Stand characteristics estimated by Eq. (4) with the added constraints of Eq. (5) and  $b_1 = b$ , when fitted to the oak data

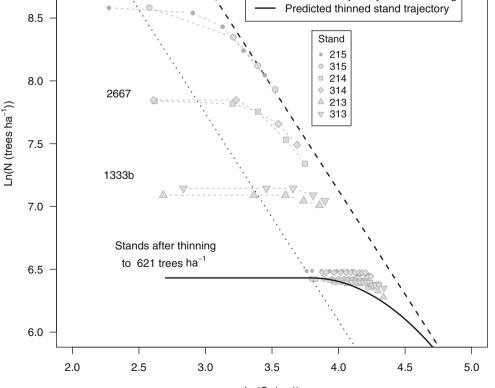
Treatment	Estimated initial density (trees $ha^{-1}$ )	RDI at mortality onset	Cg <sub>0</sub> (cm)	Age	Cg <sub>1</sub> (cm)	Density at max. RDI (trees ha <sup>-1</sup> )
1333a	1018	0.35	32.9	17	115.6	360
1333b	1228		29.3	16	103.2	435
2667	2536		18.9	13	66.5	897
5333	5333		12.1	11	42.4	1887
500,000	147,136		1.6	6	5.7	52,072

The table gives the mean girths at breast height (Cg<sub>0</sub>) and the corresponding ages at the onset of mortality. It gives the mean girths at breast height  $(Cg_1)$  with the corresponding densities when the stands reach the maximum RDI

confidence interval of the intercept coefficient [13.3, 13.9], while the slope parameter of oak (-1.652) appeared slightly higher than that of beech (-1.512) and outside the confidence interval of beech slope parameter (-1.58, -1.45) but not very far. Then, the maximum relative density of oak and beech in the Lyons-la-Forêt experiment occurred at about the same point for small mean girths, but for oak appeared to be lower for higher mean girths, the maximum size-density line of oak presenting then a slightly steeper slope than that of beech (Fig. 9a).

The maximum size-density line (Ln(N) = a + bLn(Cg)) can be expressed in terms of the average growing space per tree  $(s_m)$ , as  $s_m$  is proportional to 1/N with a factor depending on the surface unit. The variation of growing space with mean tree diameter (Fig. 9b) is such that oak occupies much space than beech, and its space need increases with age much more than it does for beech. This is in line with the results obtained by Pretzsch and Biber (2005) in the range of diameters of this study. However, for higher diameters, Pretzsch and Biber found that beech space requirements tended to meet and even exceed those of oak, in relation with the steeper slope of the maximum size-density line of beech as compared to that of oak observed in his case: this differed from our results (Fig. 9b). The maximum size-density lines established for oak and beech for a large range of diameters by different authors









compared to the trajectory

ning (621 trees per ha)

Annals of Forest Science (2019) 76: 73

Model	Number of parameters	AIC	Log	Test likelihood	Likelihood ratio	$p$ value $\left(\chi_5^{2^{\dagger}}\right)$
<ul> <li>(1) Eq. (4)</li> <li>(2) Eq. (4) with Eq. (5) and b<sub>1</sub> = b</li> </ul>	19 14	- 544.41 - 544.26	291.20 286.13	(1) vs (2)	10.15	0.07
(see Appendix1 for details)						

**Table 8** Likelihood ratio test for the fit of Eq. (4) to the beech size-density data with the constraints of Eq. (5) and b1 = b

<sup>†</sup> Likelihood ratio test (Wilks)

confirm the higher growing space requirement of oak (Rivoire and Le Moguedec 2012; Le Goff et al. 2011). Beech appears then more efficient than oak in its space requirements.

#### 4.4 Mortality onset and initial density

The locus of the inflection points of the stand density trajectories corresponding to oak mortality onset was a line whose slope was not considered significantly different from the slope of the maximum size-density line. In other words, mortality began to occur at a same relative density ( $RDI_0 = 0.35$ ), independently of initial stand density (Fig. 9a; Table 7).

As new inventory data were available, a re-evaluation of the locus of the inflection points of the size-density trajectories of beech in the Lyons-la-Forêt experiment was done (Table 9; Appendix 1). As for oak, it was found to be a line parallel to the maximum size-density line, mortality onset occurring at a constant RDI value equal to 0.29 (Table 10; Appendix 1). As a consequence, mortality of oak appeared to occur at a slightly higher relative density than that of beech (0.35 compared to 0.29). The occurrence of mortality onset at a constant RDI was observed for other species in foreign countries (see references in Ningre et al. 2016a): that was especially the case of red alder (*Alnus rubra* Bong.) (Puettmann et al. 1993).

Fig. 9 Comparison of sizedensity trajectory features of oak and beech in the Lyons-la-Forêt experiment. a Characteristic sizedensity lines. b Average growing space of trees at maximum density and at mortality onset. c Sizedensity trajectories-log scalefor three initial densities  $(N_0 =$ 1000, 5000, 40,000 trees ha<sup>-1</sup>) together with characteristic sizedensity lines. d Stand characteristics-age Ao and dominant height  $H_0$ —at mortality onset, in relation to initial stand density  $(N_0)$ 

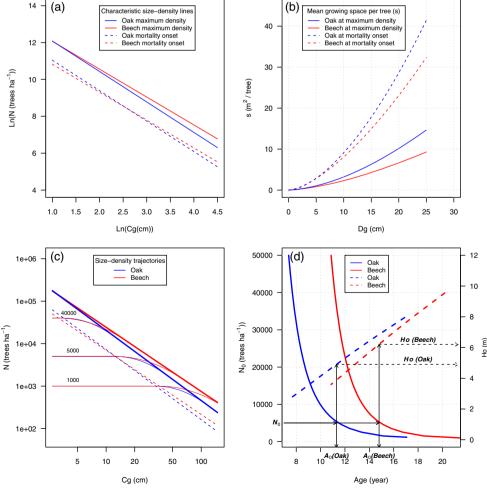




Table 9 Parameter estimates and statistics of the fit of Eq. (4) to the data of the beech stands of the Lyons-la-Forêt experiment, with the constraints of Eq. (5) where  $b_1$ = b (see text for details)

				Annals of For	est Science (2	019) 76: 73
Parameter	Treatment	Observed value <sup>†</sup>	Estimate	Std. error	t value	<i>p</i> value
a b	All	_	13.58 - 1.512	0.147 0.035	92.58 - 43.26	0‡
$a_1$	All	_	12.333	0.127	96.71	0
$N_0$ (trees ha <sup>-1</sup> )	625a 625b	472 573	446 <sup>¶</sup> 558	18.61 14.22	23.98 39.21	0
	2500	2086	2050	51.81	39.56	
	4444	4016	3999	92.43	43.27	
	10,000	9129	8927	331.77	26.91	
	40,000	34,316	35,111	2191.28	16.02	
Residual standard	deviation = 0.0	61; df=140				

<sup>†</sup> Mean of the observed values in a treatment

<sup>‡</sup> Far smaller than the standard probability levels

<sup>¶</sup>Rounded to the nearest integer

The trajectory Eq. (1) may be parameterized with RDI<sub>0</sub> (equation system (2) without further development of RDI<sub>0</sub>). Fitted to the observed oak and beech data, this parameterized form of Eq. (1), with the constraints of Eq. (5), allowed estimation of the approximate 95% confidence intervals of  $RDI_0$  for the two species, namely [0.23, 0.47] for the value 0.35 obtained for oak, and [0.24, 0.34] for the value 0.29 obtained for beech (the calculated confidence intervals are comparable with that of red alder [0.31, 0.5]obtained by Puettmann et al. (1993)).

The size-density line at mortality onset  $(Ln(N)=a_1+$ bLn(Cg) can be expressed, as the maximum size-density line, in terms of average growing space per tree  $(s_0)$ . At mortality onset,  $s_0$  followed what was observed for the reach of maximum stand density (Fig. 9b). That is, the mean growing space  $(s_0)$  was higher for oak than for beech, which meant that less trees could stay alive in the case of oak and again that oak was less efficient than beech in its space requirements.

#### 4.5 Size-density trajectories

To allow the comparison of oak and beech, the fitted parameters of the size-density trajectories of these species in the Lyons-la-Forêt experiment were used to predict size-density trajectories for a larger interval of initial densities.

#### 4.5.1 Mortality charts

While mortality onset occurred at a relative initial density higher for oak, mean stand dimensions  $(Cg_0)$  at this stage appeared to be quite comparable for oak and beech. For a given initial density, however, after mortality onset, oak presented a higher mortality rate than beech, reaching its maximum "more rapidly," that is within a narrower interval of mean girths, as the maximum size-density line was lower for oak than for beech, for the major part of stand development (Fig. 9c).

Table 10 Stand characteristics for the beech stands of the Lyons-la-Forêt experiment estimated by Eq. (4) with the constraints of Eq. (5) where  $b_1 = b$ . RDI, mean girth  $(Cg_0)$ , and age at mortality onset

Treatment	Estimated initial density (trees $ha^{-1}$ )	RDI at mortality onset	$Cg_0$ (cm)	Age at mortality onset	$Cg_1$ (cm)	Density at max. RDI (trees $ha^{-1}$ )
625a	447	0.29	62	25	321	128
625b	558		53	23	277	160
2500	2050		22	17	117	588
4444	3999		14	15	75	1148
10,000	8927		8	14	44	2562
40,000	35,111		3	11	18	10,077

Mean girth  $(Cg_1)$  and stand density  $(N_1)$  when maximum RDI is reached (the age at mortality onset was obtained through a non-linear relationship fitted to the mean girth, age, and initial density of the stands)

D Springer



 Table 11
 Values of relative stand density RDI corresponding to increasing cumulative mortality rates, between the onset of mortality and the advent of stand maximum relative density

Mortality rate <sup>†</sup> (%)	$\frac{N_t}{N_0}$ ‡	RDI	Characteristic trajectory point
0	1.00	0.35	Mortality onset
10	0.90	0.62	
20	0.80	0.74	
30	0.70	0.84	
40	0.60	0.91	
50	0.50	0.97	
60	0.40	1.00	
65	0.35	1.00	Max. relative density

<sup>†</sup> Mortality rate =  $100\frac{N_0 - N_t}{N_0}$  (see text)

<sup>‡</sup>Relative number of surviving trees

The age ( $A_0$ ) at the onset of mortality was obtained with a relationship fitted to the age-Cg data, with stand initial density as a covariate (see "Results"). For oak,  $A_0$  increased from ages 8 to 17 when initial density decreased from 40,000 to 1000 trees per ha (Fig. 9d). At the same time, dominant height ( $H_0$ ) increased from about 3 up to 8 m. For beech,  $A_0$  increased

Fig. 10 New fitted size-density trajectories (in logarithmic scales) of the beech plots of the Lyons-la-Forêt experiment with inflection points aligned parallel to the maximum size-density line (observed size-density data coming from the two blocks of the Lyonsla-Forêt beech design are also shown: see Ningre et al. 2016a) from about 11 to 20 years of age and  $H_0$  from 4 to 9.5 m (Fig. 9d). So, while starting at about the same Cg<sub>0</sub>, mortality onset happened earlier and at a lower dominant height for oak than for beech, for a given initial stand density.

These stand characteristics at mortality onset, depending on initial stand density, may help forest managers to carry out the first thinning before mortality begins. In the conditions of the Lyons-la-Forêt experiment, these thinnings should occur earlier for oak than for beech and at a lower dominant height despite a slightly greater height growth of oak (Fig. 9d).

#### 4.5.2 Mortality simulation

As for beech (Ningre et al. 2016a), in the absence of an available individual mortality model, the size-density model established here for oak in the Lyons-la-Forêt experiment should be adequate to model mortality prior to any management treatment in stand growth simulators as "Fagacées" (Le Moguedec and Dhôte 2012).

However, unlike what was observed for thinned beech stands, for oak, the observed onset of mortality after thinning occurred several years after the predicted onset (about 8 years after, relying on the predicted trajectory of stands of initial

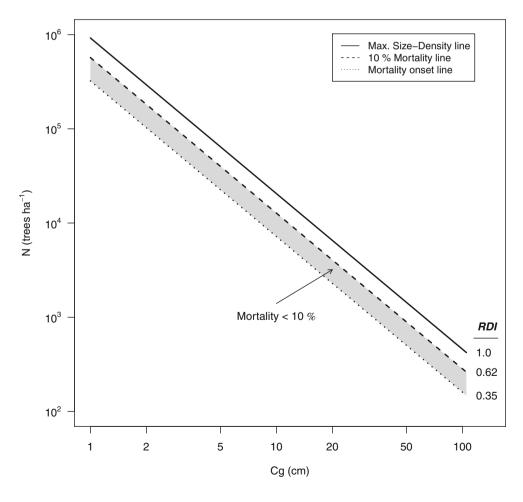
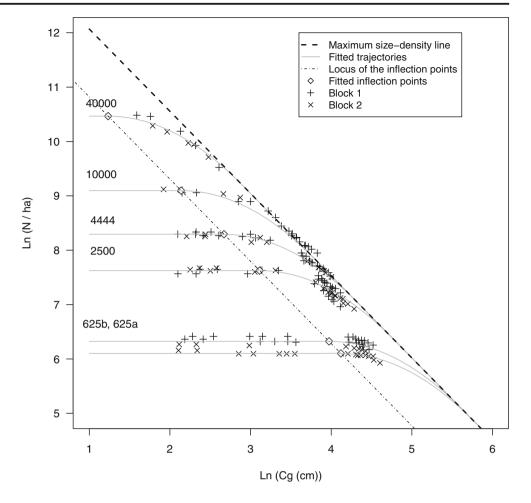




Fig. 11 Stand density management diagram (SDMD) for oak in the Lyons-la-Forêt experiment. Three parallel sizedensity lines are represented: the maximum size-density line (RDI = 1), the line of mortality onset (RDI = 0.35), and the line of 10% cumulative mortality rate (RDI = 0.62). Also represented on the figure is the zone where cumulative mortality is under 10% (shaded area)



density equal to the residual density after thinning; Fig. 8). This may be due to the type of thinning performed in the thinned oak plots at Lyons-la-Forêt where density was drastically reduced by removing all suppressed trees and a high proportion of codominant and dominant trees, leaving only about 600 dominant crop trees per ha when the initial stand density was comprised between 1200 and 5333 trees per ha. By removing all suppressed trees—those trees more prone to die—and by reducing strongly stand density, it took several years before the first trees among the remaining ones had their crowns sufficiently reduced by competition to die. Thus, mortality after thinning occurred when the stand density reached an RDI value between 0.6 and 0.75, which is relatively far from the RDI at the mortality onset observed in unthinned plots (0.35) and outside the confidence interval of this value.

#### 4.5.3 Stand management

To help with the management of oak stands, the RDI corresponding to 10% mortality in number of trees was calculated (the 10% mortality level appears in forest management as a relatively low but nevertheless significant level of mortality). It appeared that this level is reached at a constant RDI value equal to 0.62, independently of the initial stand density  $N_0$  (see Appendix 2).

 $\underline{\textcircled{O}}$  Springer



Thus, in order to maintain the mortality of oak under 10%, the forest manager should keep stand density in the area comprised between the mortality onset line (RDI = 0.35) and the 10% mortality line (RDI = 0.62) in the (Ln(Cg)–Ln(N)) coordinate system. This is in accordance with the objective of maximizing net stand growth (gross stand growth minus mortality), which was observed at a RDI around 0.5 for sessile oak (Trouvé et al. 2019). Maintaining mortality under 10% can only be achieved with relatively heavy thinnings reducing stand density below the 0.35 RDI line, so as the density of the thinned stands remains between the 0.35 and 0.62 RDI lines after crown canopy closes again. This guideline might work fine for the first thinning. For subsequent thinnings, mortality might be delayed, as observed in our study, making the upper bound of the 10% mortality line following successive thinnings a point of uncertainty given data currently available. However, in our case, thinnings were very specific and differ from those currently applied in forest management.

Other mortality lines could be considered by choosing different mortality ratios (other than 10%) after calculating the corresponding RDI values (Table 11; Appendix 2). It can be noticed that when stands reach the maximum size-density line (RDI = 1), mortality already reaches a relatively high level: in the case of oak, 65% of trees have already died since mortality onset. This shows how important it is to include size-density trajectory models in stand growth simulators and to be careful when selecting temporary plots in order to establish the maximum size-density line of a given species (Le Goff et al. 2011).

Such characteristic density lines are at the basis of the construction of density management diagrams—called SDMDs which are commonly used in the USA since Drew and Flewelling (1979) and more recently in Europe (Sales Luis and Fonseca 2004; Penner et al. 2006; Lopez-Sanchez and Rodriguez-Soalleiro 2009; Patricio and Nunes 2017; Minoche et al. 2017). It can be mentioned here that the characteristic sizedensity lines represented in these SDMD diagrams are often drawn somewhat arbitrarily parallel to the maximum sizedensity line, whereas the parallelism of these characteristic sizedensity lines for oak and beech could be really established in this study (Fig. 10; Appendix 2).

#### **5** Conclusion

The piecewise polynomial function used to describe the sizedensity trajectories of beech (Ningre et al. 2016a) and Douglas-fir stands (Ningre et al. 2016b) proved again useful in describing the size-density trajectory of oak in the Lyons-la-Forêt experiment and suited to a wide range of initial stand densities (from about 1000 to 140,000 trees per ha).

Our results show that the inflection points of the oak trajectories are aligned in parallel to the maximum size-density line. Then, mortality of oak starts at a constant RDI value, independently of initial stand density. It appeared to be also the case for beech, which was not established at first (Ningre et al. 2016a) but could gain evidence thanks to new additional data.

The maximum size-density line obtained for oak was close to the one established earlier at a larger scale (Le Goff et al. 2011). The comparison with that of beech in the same site conditions allowed to establish that oak needs more space than beech for comparable mean size. Then, beech appears more efficient than oak in its space requirements.

As a result of this study, a SDMD diagram composed of three useful lines could be established for the management of even-aged oak stands: one indicating the conditions of maximum stand density and the two others being relative to mortality. The first one corresponds to the beginning of competition-induced mortality and the other one to the reach of a 10% mortality level (in number of trees per ha). This level is considered as a limit not to be exceeded to reduce the production losses. Incorporating size-density trajectory equations in stand growth simulators would also improve the prediction of tree mortality. However, the conditions of renewed mortality after thinning operations still need to be better established.

It would be advisable, looking forward, to obtain additional data, more particularly for the low density oak plots of the Lyons-la-Forêt experiment, in order to better estimate the parameters of the maximum size-density line. More data should also be necessary to establish the onset of mortality after thinning for oak, as it appears from the Lyons-la-Forêt data that thinned oak stands do not behave as unthinned oak stands of the same initial density, as it was observed for beech (Ningre et al. 2016a).

Finally, the segmented model fitted here to the oak sizedensity trajectories, and already fitted to beech and Douglasfir size-density trajectories, seems to be easily adapted to other species if appropriate data are available.

Acknowledgments The oak and beech data of the Lyons-la-Forêt experiment were issued from the long-term experimental network managed by the UMR LERFoB (Installation Expérimentale Croissance) at INRA-Nancy. The Lyons-la-Forêt experiment on oak, the basis for our study, was originally set up by H. Oswald, a former scientist at INRA-Nancy. The data used were collected under the supervision of B. Garnier and D. Rittié, which were assisted by the forest research technicians F. Bernier, F. Bordat, R. Canta, and L. Garros, for the field measurements and data management. We would like also to thank the reviewers of our manuscript for their constructive contributions.

**Statement on data availability** The datasets generated and/or analyzed during the current study are available in the Portail Data Inra repository (Ningre 2019) at https://doi.org/10.15454/LBPYLN.

**Funding** A part of the data used in this work was collected within the frame of the *Modelfor* 2012–2015 joint project between INRA and ONF. The UMR 1434 SILVA, with which the authors are affiliated, is supported by a grant overseen by the French National Research Agency (ANR) as part of the "Investissements d'Avenir" program (ANR-11-LABX-0002-01, Lab of Excellence ARBRE).

#### **Compliance with ethical standards**

**Conflict of interest** The authors declare that they have no conflict of interest.

## Appendix 1. Update of the size-density trajectories of beech in the Lyons-la-Forêt experiment

As new inventory data were available for beech in the Lyonsla-Forêt experiment (Ningre 2019), the size-density trajectories previously established (Ningre et al. 2016a) were fitted again. This new fit, with a larger data set, allowed a better comparison with the size-density trajectories of oak. The density treatments considered in the updated data set were the same as those described in Ningre et al. (2016a), and the previous size density data were only supplemented with the new measurements made in 2016. We used the same piecewise polynomial function already used for beech in Ningre et al. (2016a), oak in this paper (Eqs. (1) and (2)), and for Douglas-fir (Ningre et al. 2016b).

The statistical model used to fit the new size-density relationships was the same as for Eq. (4), with two differences. There was no heteroscedasticity of the residual errors to be



corrected, and the graphics of the empirical autocorrelation function of these errors showed an autoregressive correlation of order 1 that needed to be accounted for. These statistical hypotheses were validated with the diagnostic plots of the residuals.

As already observed for beech (Ningre et al. 2016a), and for oak in this study, with the new beech data, the inflection points— $(Cg_0, N_0)$  on the log-log scale—of the size-density trajectories obtained by the fit of Eq. (4) still lined up. Contrarily to what happened with oak for the fit of Eq. (4) with the constraints of Eq. (5), there was no need to include a random effect on the parameter  $a_1$  to obtain estimates of  $a_1$  and  $b_1$ close to the values of the-estimated-parameters of the line fitted to the inflection points estimated by the unconstrained fit of Eq. (4). As there was no random effect associated with the parameter  $a_1$ , Eq. (4) with the constraints of Eq. (5) and the additional constraint  $(b_1 = b)$  was a model embedded in the model of Eq. (4) alone, and passing from one model to the other involved only fixed effects. These conditions allowed performing a likelihood ratio test to compare these two models (Pinheiro and Bates 2000). No significant difference-at the 5% probability level—was found between the unconstrained and-doubly-constrained models (Table 8). The results of the fit of Eq. (4)—including the statistical hypotheses modified as stated for the beech case—with the constraints of Eq. (5) and the additional hypothesis  $(b_1 = b)$  are given in Table 9. The plots of the observed data and fitted curves of the constrained model did not show any lack of fit.

With this new fitting of the size-density trajectories of beech in the Lyons-la-Forêt experiment (Fig. 11), mortality onset took place at a constant relative density ( $RDI_0 = 0.29$ ; Table 10), to be compared to the results found previously, that is, RDI values ranging from 0.31 to 0.58 for stand densities ranging from 625 to 40,000 trees per ha. Then, mortality appeared to start at a lower relative density than expected before, particularly for stands at high initial densities. However, the change in  $Cg_0$  is very limited (3.4 cm compared to 4 cm for treatment 40,000, the highest initial density, and 61.6 cm, compared to 57 cm for treatment 625a, the lowest density). The change in stand characteristics at the onset of maximum relative density appears greater, particularly for stands of higher initial densities: mean girth  $Cg_1$  and stem number  $N_1$ are half the previous values for treatment 40,000 (Table 10 in this paper and Table 6 in Ningre et al. 2016a).

## Appendix 2. Property of the constant RDI mortality lines of oak

To better control mortality in unthinned oak stands, it may be of interest to investigate a connection between their cumulated mortalities and RDI.

🖄 Springer



It appeared that from the onset of mortality (RDI<sub>0</sub> = 0.35) up to the advent of maximum relative density (RDI = 1), the relative number of surviving trees ( $N_t/N_0$ ) of a given stand, where  $N_t$  is the number of trees per hectare observed at some time *t*, depended only on the relative density at this time, regardless of the initial density  $N_0$  of the stand. The proof is sketched as follows.

Let  $Cg_t$  be the mean girth of a stand at time *t*, with relative number of surviving trees  $N_t / N_0$ , and let us consider the following logarithms:

$$Ln(N_0) - Ln(N_t) = \Delta Ln(N_0)$$
(6)

Let Cg<sub>0</sub>—as already specified—be the mean girth of the stand at the mortality onset. Using Eq. (5) with  $b_1 = b$ , it results that, for the nonlinear part of the size-density trajectory, described by Eqs. (1) and (2), the following equation holds:

$$Ln(Cg_0) - Ln(Cg_t) = \frac{2}{b} [(a - a_1)\Delta Ln(N_0)]^{\frac{1}{2}}$$
(7)

Using again Eq. (5) with  $b_1 = b$ , and Eq. (7), and substituting Ln (Cg<sub>0</sub>) for its value obtained by solving Eq. (6), we obtain the following:

$$\operatorname{Ln}(N_t) = c + b\operatorname{Ln}(\operatorname{Cg}_t) \tag{8}$$

where  $c = a_1 - \Delta Ln(N_0) + 2 [(a - a_1)\Delta Ln(N_0)]^{\frac{1}{2}}$ 

The relative density  $\text{RDI}_t$  of a stand at the time t when natural mortality has reduced the stand density to  $N_t$  trees per hectare is  $\text{RDI}_t = N_t / N_{\text{Max},t}$  where  $N_{\text{Max},t}$  is the maximum number of trees per hectare of a stand of mean girth Cg<sub>t</sub>. The logarithmic transformation of  $\text{RDI}_t$  gives the following:

$$Ln(RDI_t) = Ln(N_t) - Ln(N_{Max,t})$$
(9)

As:

$$\operatorname{Ln}(N_{\operatorname{Max},t}) = a + b\operatorname{Ln}(\operatorname{Cg}_t) \tag{10}$$

Using (8), (9) and (10), we obtain the following:

$$\operatorname{Ln}(\operatorname{RDI}_t) = c - a$$

That is:

$$\mathrm{RDI}_t = e^{c-a} \tag{11}$$

Then, the stands with a given relative number of surviving trees  $(N_t/N_0)$  have the same RDI value (Eq. (11)). The locus of the points corresponding to a given mortality rate for the trajectories of various initial stand densities is a line parallel to the maximum size-density line. In this study, we considered a

cumulative mortality rate amounting to 10%, corresponding to a ratio of surviving trees of 0.9. For this value, the RDI is equal to 0.62 (Fig. 11). Other rates of mortality could be retained. The corresponding RDI values were calculated for increasing mortality rates (Table 11).

#### References

- Barrio Anta M, Álvarez González JG (2005) Development of a stand density management diagram for even-aged pedunculate oak stands and its use in designing thinning schedules. Forestry. 78(3):209– 216. https://doi.org/10.1093/forestry/cpi033
- Burnham KP, Anderson DR (1998) Model selection and inference: a practical information-theoretic approach. Springer- Verlag, New York. https://doi.org/10.1007/b97636
- Cao QV, Dean TJ (2008) Using segmented regression to model the sizedensity relationship in direct-seeded slash pine stands. For Ecol Manag 255:948–952. https://doi.org/10.1016/j.foreco.2007.10.004
- Charru M, Seynave I, Morneau F, Rivoire M, Bontemps J-D (2012) Significant differences and curvilinearity in the self-thinning relationships of 11 temperate tree species assessed from forest inventory data. Ann For Sci 69:195–205. https://doi.org/10.1007/s13595-011-0149-0
- Colin F, Ningre F, Fortin M, Huet S (2012) Quantification of *Quercus* petraea Liebl. Forking based on a 23-year-long longitudinal survey. For Ecol Manag 282:133–141. https://doi.org/10.1016/j.foreco. 2012.06.040
- Curtis RO (1970) Stand density measures: an interpretation. For Sci 16: 403–414. https://doi.org/10.1093/forestscience/16.4.403
- Curtis RO (1982) A simple index of stand density for Douglas-fir. For Sci 28:92–94. https://doi.org/10.1093/forestscience/28.1.92
- Deng J, Zuo W, Wang Z, Fan Z, Ji M, Wang G, Ran J, Zhao C, Liu J, Niklas KJ, Hammond ST, Brown JH (2012) Insights into plant sizedensity relationships from models and agricultural crops. Procs Natl Acad Sci 109:8600–8605. https://doi.org/10.1073/pnas. 1205663109
- Drew TJ, Flewelling JW (1979) Stand density management: an alternative approach and its application to Douglas-fir plantations. For Sci 25:518–532. https://doi.org/10.1093/forestscience/25.3.518
- Fonseca T, Montero L, Enes T, Cerveira A (2017) Self-thinning dynamics in cork oak woodlands: providing a baseline for managing density. Forest Systems 26(1):e006. ISSN 2171-9845. https://doi.org/10. 5424/fs/2017261-10105
- Jack SB, Long JN (1996) Linkages between silviculture and ecology: analysis of density management diagrams. For Ecol Manag 86: 205–220. https://doi.org/10.1016/S0378-1127(96)03770-X
- Johnson PS, Shifley R, Rogers R (2009) The ecology and silviculture of oaks, 2nd edn. CAB International, Wallingford 580 p
- Le Goff N, Ottorini J-M, Ningre F (2011) Evaluation and comparison of size-density relationships for pure even-aged stands of ash (*Fraxinus* excelsior L.), beech (*Fagus sylvatica* L.), oak (*Quercus petraea* Liebl.), and sycamore maple (*Acer pseudoplatanus* L.). Ann For Sci 68:461–475. https://doi.org/10.1007/s13595-011-0052-8
- Le Moguedec G, Dhôte J-F (2012) Fagacées: a tree-centered growth and yield model for sessile oak (*Quercus petraea* L.) and common beech (*Fagus sylvatica* L.). Ann For Sci 69:257–269. https://doi.org/10. 1007/s13595-011-0157-0
- Lee Y (1971) Predicting mortality for even-aged stands of lodgepole pine. For Chron 47:29–32. https://doi.org/10.5558/tfc47029-1
- Lhotka JM, Loewenstein EF (2008) An examination of species-specific growing space utilization. Can J For Res 38:470–479. https://doi. org/10.1139/X07-147

- Long JN, Vacchiano G (2014) A comprehensive framework of forest stand property–density relationships: perspectives for plant population ecology and forest management. Ann For Sci 71:325–335. https://doi.org/10.1007/s13595-013-0351-3
- Lopez-Sanchez C, Rodriguez-Soalleiro R (2009) A density management diagram including stand stability and crown fire risk for *Pseudotsuga menziesii* (Mirb.) Franco in Spain. Mt Res Dev 29(2):169–176. https://doi.org/10.1659/mrd.1070
- Minoche D, Risio-Allione L, De Aza CH, Martinez-Zurimendi P (2017) Density management diagram for teak plantations in Tabasco, Mexico. iForest 10:909–915. https://doi.org/10.3832/ifor2247-010
- Ningre F (2019) Dynamics of main stand characteristics (*N*, *Cg*) of an oak and a beech spacing and thinning trials at an early development stage, in view to modeling oak and beech size-density trajectories. V1.0. Portail Data Inra. [Dataset]. https://doi.org/10.15454/ LBPYLN
- Ningre F, Ottorini J-M, Le Goff N (2016a) Modelling size-density trajectories for even-aged beech (*Fagus sylvatica* L.) stands in France. Ann For Sci 73:765–776. https://doi.org/10.1007/s13595-016-0567-0
- Ningre F, Ottorini J-M, Le Goff N (2016b) Trajectoires d'autoéclaircie du Douglas (*Pseudotsuga menziesii*) en France. Rev For Fr 68(4):323– 343. https://doi.org/10.4267/2042/62130
- Oliver CD (1996) Forest stand dynamics. John Wiley & Sons, Inc., New York 520 p
- Patricio MS, Nunes L (2017) Density management diagrams for sweet chestnut high-forest stands in Portugal. iForest 10:865–870. https:// doi.org/10.3832/ifor2411-010
- Penner M, Swift DE, Gagnon R, Brissette J (2006) A stand density management diagram for balsam fir in New Brunswick. For Chron 82: 700–711. https://doi.org/10.5558/tfc82700-5
- Pinheiro JC, Bates DM (2000) Mixed-effects models in S and S-PLUS. Springer, New York 528 p
- Pinheiro J, Bates D, DebRoy S, Sarkar D, R Core Team (2014) nlme: linear and nonlinear mixed effects models. R package version 3.1– 117, URL: http://CRAN.R-project.org/package=nlme
- Pretzsch H, Biber P (2005) A re-evaluation of Reineke's rule and stand density index. For Sci 51:304–320
- Puettmann KJ, Hann DW, Hibbs DE (1993) Evaluation of the sizedensity relationships for pure red alder and Douglas-fir stands. For Sci 39:7–27. https://doi.org/10.1093/forestscience/39.1.7
- R Core Team (2014) R: a language and environment for statistical computing. R Foundation for Statistical Computing, Vienna URL http:// www.R-project.org/
- Reineke LH (1933) Perfecting a stand-density index for even-aged forests. J Agric Res 46:627–638
- Ripley BD (2004) Selecting amongst large classes of models. In: Adams N, Crowder M, Hand DJ, Stephens D (eds) Methods and models in statistics. Imperial College Press, London, pp 155–170
- Rivoire M, Le Moguedec G (2012) A generalized self-thinning relationship for multi-species and mixed-size forests. Ann For Sci 69:207– 219. https://doi.org/10.1007/s13595-011-0158-z
- Sales Luis JF, Fonseca TF (2004) The allometric model in the stand density management of *Pinus pinaster* Ait. in Portugal. Ann For Sci 61:807–814. https://doi.org/10.1051/forest:2004077
- Sardin T (2008) Guide des sylvicultures Chênaies continentales. ONF/ Lavoisier, Paris
- Smith NJ, Hann DW (1984) A new analytical model based on the 3/2 power rule of self-thinning. Can J For Res 14:605–609. https://doi. org/10.1139/x84-110
- Smith NJ, Hann DW (1986) A growth model based on the self-thinning rule. Can J For Res 16:330–334. https://doi.org/10.1139/x86-056
- Trouvé R, Nitschke CR, Robinson AP, Baker PJ (2017) Estimating the self-thinning line from mortality data. For Ecol Manag 402:122– 134. https://doi.org/10.1016/j.foreco.2017.07.027



- Trouvé R, Bontemps J-D, Collet C, Seynave I, Lebourgeois F (2019) When do dendrometric rules fail ? Insights from 20 years experimental thinnings on sessile oak in the GIS Coop network. For Ecol Manag 433:276–286. https://doi.org/10.1016/j.foreco.2018.11.007
- Vanclay JK, Sands PJ (2009) Calibrating the self-thinning frontier. For Ecol Manag 259:81–85. https://doi.org/10.1016/j.foreco.2009.09. 045
- VanderSchaaf CL (2010) Estimating individual stand-density trajectories and a maximum size-density relationship species boundary line slope. For Sci 56(4):327–335. https://doi.org/10.1093/forestscience/ 56.4.327
- VanderSchaaf CL, Burkhart HE (2008) Using segmented regression to estimate stages and phases of stand development. For Sci 54:7–27. https://doi.org/10.1093/forestscience/54.2.167

- VanderSchaaf CL, Burkhart HE (2012) Development of planting densityspecific management diagrams for loblolly pine. South J Appl For 36(12):126–129. https://doi.org/10.5849/sjaf.10-043
- Williams R (2003) Use of stand density index as an alternative to stocking percent in upland hardwoods. Northern J Appl For 20:137–142
- Yoda K, Kira KT, Ogawa H, Hozumi H (1963) Self-thinning in overcrowded pure stands under cultivated and natural conditions. J Biol, Osaka City Univ, series D 14:107–129
- Zhang L, Bi H, Gove JH, Heath LS (2005) A comparison of alternative methods for estimating the self-thinning boundary line. Can J For Res 35:1507–1514. https://doi.org/10.1139/x05-070

**Publisher's note** Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

