Modeled tracheidograms disclose drought influence on Pinus sylvestris

2 tree-rings structure from Siberian forest-steppe

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Abstract

Wood formation allows trees to adjust in a changing climate. Understanding what determine its adjustment is crucial to evaluate impacts of climatic changes on trees and forests growth. Despite efforts to characterize wood formation, little is known on its impact on the xylem cellular structure. In this study we apply the Vaganov-Shashkin model to generate synthetic tracheidograms and verify its use to investigate the formation of IADFs, one of the most frequent climate tree-ring markers in drought-exposed sites. Results indicate that the model can produce realistic tracheidograms, except for narrow rings (<1 mm), when cambial activity stops due to an excess of drought or a lack of growth vigor. These observations suggest that IADFs are caused by a release of drought limitation to cells formation in the first half of the growing season, but that narrow rings are indicators of an even more extreme and persistent water stress. Taking the example of IADFs formation, this study demonstrated that the Vaganov-Shashkin model is a useful tool to study the climatic impact on tree-ring structures. The ability to produce synthetic tracheidogram represents an unavoidable step to link climate to tree growth and xylem functioning under future scenarios.

1 Introduction

As long-living and sessile organisms, wooden plants needs to continuously adjust their structure to survive under changing environmental conditions. These adjustments are usually achieved while growing (Meinzer et al., 2011). Thanks to the primary and secondary meristems, plants are indeed constantly producing new tissues when conditions are favorable (Vaganov et al., 2006). The cambium can modify the number of cells produced, and their morphological characteristics to regulate the important xylem and phloem functions of transport, storage and mechanical support. In this way, not only the tissues are constantly renewed, but also their form and functioning. This capacity offers trees the necessary dynamic to face changes. However, since wood formation requires resources and time to take place (Steppe et al., 2015), the current environment conditions strongly influence the width, structure and chemical composition of the annual rings, thus limiting the ability of plants to acclimate and endure. These limitations can restrict the physiology over several years, as already observed as a consequence of increasing drought pressure (Anderegg et al., 2013; Britez et al., 2014), threatening plant survival (McDowell et al., 2008) and eventually leading to forest mortality (Allen et al., 2010).

A better understanding of the chain between environment, tree-physiology, wood formation, wood structure and plant performance is unavoidable to soundly assess the fate of trees species and provenances under a rapidly changing environment (Sass-Klaassen *et al.*, 2016). Without a clear long-term and high-resolved perspective of the process of xylem formation and its interaction with the environment, it is not possible to fully comprehend how annual growth rings and their typical wood structures are formed and respond to climate and their extreme events (Pacheco *et al.*, 2016; Rathgeber *et al.*, 2016). Evidences of the impact of the environment on plant growth are not only manifold, but are also exploited to reconstruct past environmental conditions via the study of treerings (Fritts, 1976). Novel methods over the last decades have extended interests into the processes of tree-ring formation towards higher intra-annual resolution and deeper mechanistic understanding of environmental impact (McCarroll & Loader, 2004; Fonti *et al.*, 2010). Attention has also been given to the process of xylogenesis (e.g., Cuny *et al.*, 2015) to better assess cambial phenology (e.g., Rossi *et al.*, 2016), timing (Carrer *et al.*, 2017) and dynamic (Cuny *et al.*, 2014) of growth. Based on the improved spatial (cellular) and temporal (weekly) resolution, it has now become possible to better

- 71 link the impact of specific environmental events to the processes shaping the amount of carbon fixed
- (Cuny et al., 2015) and its cellular structure (e.g., Abrantes et al., 2013; Castagneri et al., 2015), as 72
- well as its influences on the functioning of the xylem (e.g., Mayr et al., 2006; Martin-Benito et al., 73
- 74 2017).
- Intra-annual density fluctuations (IADF), i.e., a density anomaly appearing within the annual ring due 75
- to the occurrence of latewood-like cells within earlywood, or earlywood-like cells within latewood, 76
- 77 represent one of the most obvious examples of climatic impact on the tree-ring structure (Fritts,
- 1976). IADFs are in general associated to unusual strong events (as drought or cold period) changing 78
- 79 the "typical" process of cell development" as e.g.; a temporary decrease in growth rate. Its
- 80 occurrence has been suggested to be associated with plastic adjustments to maintain the balance
- between hydraulic efficiency and safety under short-term variations in environmental conditions (De 81
- 82 Micco et al., 2016). Despite numerous investigations (e.g., Nabais et al., 2014;), reliability of IADFs
- occurrence and distribution is still uncertain (Campelo et al., 2015). IADFs do not arise in all the 83
- trees within the same site, not even all drought events trigger IADFs. This variability has been 84
- associated to differences in sensitivity among species (Pacheco et al., 2016), tree size and age 85
- (Campelo et al., 2015), growth rate (Rigling et al., 2001), sex (Olivar et al., 2015), or to difference in 86
- 87 intensity and duration of the climatic event (Vieira et al., 2017).
- 88 To better assess the ability of tree species to acclimate and endure a changing environment requires
- 89 tools allowing projecting growth under future climatic scenarios (Guiot et al., 2014). Process-based
- 90 models of tree-ring growth (e.g., MuSICA (Ogee et al., 2003); CASSIA (Schiestl-Aalto et al., 2015);
- and CASTANEA (Delpierre et al., 2012)) provide this additional perspective for simulating intra-91
- 92 annual growth under differing climatic scenario as increasing intensity and duration of drought (e.g.;
- 93 Wilkinson et al., 2015). Several process-based model exists to estimate the annual course of wood
- 94 biomass, which is essential to study the impact of intra-seasonal climatic event on tree-growth.
- 95 However, these models are usually not able to provide data on the formed wood structure (with few
- exception as Deleuze & Houllier (1998) and CAMBIUM model by Downes et al., (2009)) one of 96
- the most critical connections between environment and plant functioning precluding the 97
- 98
- opportunity to connect structure to function. The Vaganov-Shashkin model (VS-model, Vaganov et 99 al., 2006) is an environmental driven conifer tree-ring growth model that has proven to provide
- 100 reliable estimates under strong limited conditions (for examples of model applications see (Touchan
- et al., 2012; Shishov et al., 2016). A singularity of this model is the assumption that the environment 101
- 102 (via the most limiting environmental factor) is determining xylem cell differentiation (cell
- 103 enlargement and wall thickening) only during the time-window the cells are residing in the cambial
- zone. In this way, the model computes daily growth rate relative to the growth in absence of 104
- 105 limitations. To run, the model only requires daily temperature and precipitation data and needs to be
- 106 calibrated to the growth characteristics for the selected species specific to the site considered
- 107 (Vaganov et al., 2006; Shishov et al., 2016).

2 **Materials and Methods**

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2.1 Study site and climate

- This study uses wood cores collected in late 2013 on a foothill-forested site around Malaya Minusa 111
- 112 (53°43′ N, 91°47′ E, 251 m a.s.l.), southern Siberia (Russia), a village close to Minusinsk at the
- border with the Altai-Sayan region. The area is a steppe-like landscape characterized by a cold and 113
- 114 semi-arid climate. Records from the 25 km close meteorological station of Minusinsk (53°41' N,

- 115 91°40' E, 254 m a.s.l.) indicated an average annual temperature of 1.0°C and precipitation sum of 341
- mm (average 1936-2013), 90% of which falls from the end of April to the beginning of October. The 116
- site is composed of a mixed forest of birch (Betula pendula) and pine (Pinus sylvestris) growing on 117
- 118 deep sandy soil covered by sedge-grass and mosses.

2.2 Tree-ring width and tracheidograms

- 120 The wood cores were collected from a selection of 20 damage-free, dominant and mature Pinus
- 121 sylvestris trees. Two parallel radial cores were extracted at stem breast height from each tree using an
- 122 increment borer with a diameter of 5 mm. Half of the cores (one per tree) were prepared to build an
- annual growth chronology- necessary to calibrate the VS-model and the second half served the 123
- 124 description of the tracheid anatomical properties. Ring widths were measured with a precision of 0.01
- mm using a LINTAB measuring table connected to the TSAP software (Rinntech, Heidelberg, 125
- 126 Germany). The obtained time-series were visually cross-dated and verified with the software
- 127 COFECHA (Grissino-Mayer, 2001). A 50%-variance cubic smoothing spline with a 2/3 cut-off was
- used to remove non-climatic factors and the auto-correlations removed with an auto-regressive 128
- 129 modeling. The residual tree-ring chronology (1936-2013) was finally obtained by averaging the
- 130 individual time-series with a bi-weight robust mean (Cook & Kairiukstis, 1990).
- 131 Tracheidograms were built to characterize the variation of tracheid radial size along the annual rings
- (Vaganov, 1990). The cores from the five trees best correlating with the chronology (R > 0.70) were 132
- 133 selected. Cell measurements were performed on cross-section images of safranin-stained micro-
- 134 sections (15-20 µm thick) cut with a sliding microtome (Reichert, Germany) along the 50 last annual
- 135 rings (1964 to 2013). The images were captured at a 400× magnification with a digital camera (5
- 136 Megapixels) connected to a microscope (Axio Imager A1m, Carl Zeiss, Germany). Tracheids radial
- cell diameter (TD) were assessed by measuring the lumen radial diameter (LD) and double 137
- 138 tangential cell wall thickness (2CWT) along five undisturbed and representative radial files in each 139 ring (Vaganov et al., 2006; Seo et al., 2014) using the image analysis package Lineyka,
- SuperMoment and ProcessorKR (Silkin, 2010). All measured files were standardized, i.e. adjusted to 140
- 141 the rounded average cell number for the trees in that year (Vaganov et al., 1985; Campelo et al.,
- 142 2016).

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- 143 To perform analysis, from the 50 available calendar years, we selected three groups of years inducing
- 144 specific tree-ring anatomical patterns (ring types), namely the narrow (N, 1965, 1974, 1983, 1998,
- 2012), wide (W, 1970, 1982, 1995, 2003, 2006) and IADF (I, 1969, 1992, 1999, 2007, 2013) rings. 145
- The selection of narrow and wide ring was based on the five years in the chronology with 146
- 147 respectively the largest and smallest ring width (see Figure 1). The IADF have been based on the
- presence of IADF from the latewood type L+ (Campelo et al., 2007), i.e. density fluctuation 148
- 149 occurring in the latewood. These patterns have been identified using the tracheidograms and
- 150 specifically when tracheid radial size in the second half of the ring showed an increase of > 10%
- 151 compared to a previous local minima (Figure 2C).

2.3 Xylogenesis and tracheid anatomical measurements

- 153 To monitor seasonal tree-ring growth, microcores from 15 trees were collected at the stem breast
- height from April to October 2013 (with approx. a 10-days interval for a total of 18 sampling dates). 154
- Samples were fixed in water-glycerin-ethanol solution (1:1:1) to maintain the soft tissue in their 155
- original hydrated status. Cross-sections (15-µm thick) were obtained with a sliding microtome 156
- 157 (Thermo Fisher Scientific HM 450), stained with safranin (1% solution) and astra blue (2% solution)
- and placed into glycerin on a microscope slide. Growth was assessed by counting along three radial 158

- 159 files the tracheids in the cambial, enlargement, wall thickening, and mature zone. The last collected
- micro-sections were used to characterize tracheid anatomy, by measuring the radial lumen size and 160
- the double cell wall thickness along five radial files using AxioVision (SE64 Rel. 4.9.1, Carl Zeiss, 161
- 162 Jena, Germany).

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2.4 VS-model calibration and assessment of daily growth rates

- 164 The VS-model computes relative daily growth rate (Gr) from daily data of temperature, precipitation
- and hours of sunlight. These computations require the calibration of the most sensitive parameters to 165
- 166 the growing characteristics of the species at the site (Tychkov et al., in review). We performed the
- model calibration (1960-2013) and verification (1934-1959) by comparing the simulated time series 167
- 168 of annual growth rates with the site-specific detrended tree-ring width chronology using the VS-
- 169 oscilloscope (Shishov et al., 2016). This tool is specifically designed to interactively adjust the model
- 170 parameters and directly visualize and assess the match between the model output and the indexed
- 171 tree-ring width chronology. As input for the model we used the daily temperature and precipitation
- data from the meteorological station of Minusinsk (53°41' N, 91°40' E, 254 m a.s.l.) from January 172
- 173 1934 to December 2013.

174 Modeling tracheidogram for each grouping of radial patterns

- 175 The previously quantified associations have subsequently been applied to each ring type (N, W, and
- 176 I) to assess the ability of the model to reproduce the expected pattern of the tracheidogram.
- 177 Specifically, we run the model with the same original parameterization to first calculated the typical
- 178 seasonal growth rates for each group and subsequently we applied the exponential dependency
- 179 between growth rate and tracheid size to obtain the synthetic tracheidograms. As model input we first
- 180 calculated and then smoothed with a loess function (span = 0.3) the daily temperature and
- 181 precipitation average over the 5 calendar years included in each ring type. In order to account for the
- 182 soil moisture legacy, the model was run on a sequence of three years, whereby the two first years
- 183 where feed with the overall daily climate average (1936-2013) and the third year with the group
- 184 average. Only the output relative to the third year has been considered for further analysis.

185 Linking growth rates to tracheid radial diameter

- An important model assumption is that the main environmental conditions (temperature, light and 186
- 187 soil moisture) occurring when the cells are residing in the cambial zone determine the (future) growth
- 188 rate (Vaganov et al., 2006). In other words, the growth rate of the cambial zone cells, i.e. the actively
- 189
- dividing cells, cannot be higher then allowed by the most limiting factor. To assign the average cell
- 190 growth rates necessary to produce the tracheidograms, in this study we make the additional
- 191 assumptions that i) the number of dividing cells over a full growing season corresponds to the
- 192 number of cells produced in the tree ring, and ii) the actively dividing cells are successively produced
- 193 with no overlap. Thus, we assigned the growth rate matching each dividing cell by calculating the
- 194
- average growth rates over the time period required to form the corresponding part of the tree-ring
- 195 (Figure 3B). A corresponding R-code for time-assignment (VS-timing) has been developed for that
- 196 purpose and applied to derive the linear dependency between the average cell growth rate and the
- 197 tracheid size (Figure 3C-D). This relation is then inversely applied to estimate tracheid size (TD)
- 198 from the growth rate obtained from the model.

2.7 Identifying threshold conditions inducing IADF

- 200 To identify the threshold conditions generating IADFs, we compared modeled tracheidograms from
- 201 newly generated climatic scenarios obtained by progressively increasing the limitation of the main
- factor inducing the formation of IADF (i.e. by reducing precipitation by step of 20%). The same 202
- temperature course (as the average temperature among the groups) has been applied for each scenario 203
- 204 to focus on the influence of precipitations only. The occurrence of IADF in the modeled
- 205 tracheidograms has then been assessed with the same criteria used to its identification (Figure 2B).
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- 207 3 Results

3.1 Trees and tree-ring characteristics

- 209 The selected *Pinus sylvestris* trees were on average 17.8 (± 1.4 sd) m tall and their stem DBH varied
- between 26 and 46 cm. Tree age ranged from 76 to 111 and their average annual radial growth 210
- 211 (TRW) over the period 1936 to 2013 was 1.46 cm (Table 1). The common signal, expressed as the
- 212 mean correlation among the individual detrended time series, was 0.62. The 5 trees selected for the
- 213 tracheidograms were highly synchronized with the site chronology (r = 0.77) and showed a similar
- average annual growth of 1.33 cm. In terms of number of cell production, the annual increment was 214
- 215 composed on average by 38 radially aligned tracheids per ring (from a minimum of 9 to a maximum
- 216 of 76), but with variation among the trees (mean ranging from 21 to 49 tracheids).

217 Model calibration and verification

- 218 The model has been calibrated over the period 1960 to 2013 and verified (from 1936 to 1959) by
- 219 comparing the time-series of the modeled cumulated annual growth rates with the detrended residual
- 220 site chronology using the VS-oscilloscope (Vaganov et al., 2006). The selected parameters are shown
- 221 in Table 2. The calibrated model provided a simulated chronology matching the residual tree-ring
- chronology with a correlation of r = 0.71 (p < 0.001; n = 54 years) and a Gleichläufigkeit Glk of 80% 222
- over the calibration period, and a correlation of r = 0.55 (p<0.001, n = 25, Glk = 71%) for the 223
- 224 validation one (Figure 1).
- 225 According to the model, the growing season at the site extended on average for 131 days \pm 12, from
- 226
- DOY 137 \pm 10 (May 18th) to DOY 268 \pm 8 (September 26th). Growth was limited by drought from DOY 139 \pm 10 (May 20th) to DOY 259 \pm 10 (September 17th), and only affected by temperature 227
- limitation at both edges (beginning and end) of the growing season. 228

229 3.3 Tracheid anatomy and tracheidograms

- 230 The average tracheid radial diameter (TD) in the ring differed among trees ranging from 18.7 to 45.5
- 231 μm (Table 1). Intra-annually, TD usually decreased monotonically from a maximum in the
- earlywood (~ 60 μm) to a minimum in the latewood (~10 μm, Figure 2A), but in some cases it was 232
- 233 possible to identify the typical signature of latewood IADF (Figure 2B). IADFs occurred mainly in
- 234 particular years (i.e., 1973, 1995, 2001, 2007, 2009) and mostly when the ring width was > 1 mm
- (Figure 2C). The frequency of IADF occurrence was 21.2% (53 rings out of 250) and varied quite 235
- 236 strongly among the trees (from 6% in D5 to 46% in D7).

Calculation of timing and growth rate of cambial cells

- One assumption of the model is that the conditions occurring at time of formation of cambial cells 238
- 239 determine their cell developmental stages. The correlation between the observed and modeled growth

- 240 rate of cambial division is r = 0.93 and r = 0.84 for the cambial and enlarging cells, respectively 241 (Figure 3A,B). We used this assumption to first assign a time to each dividing cambial cell to
- subsequently assign the corresponding cumulative growth rate (Gr, Figure 3B). As shown in Figure 242
- 3C and Figure S1, there is a strong relationship between average cambial growth rate and tracheid 243 radial diameter. The correlation distribution shows a high frequency of high correlation (Figure 3D). 244
- 245 However, this relationship clearly weakens in some rings. However, in these specific rings, if the
- modeled growing season is progressively reduced, the correlations and the R² are considerably 246
- 247 recovered (see Figure S2, S3).

Modeling and simulating growth rates and tracheidograms by ring type

- The model calculations of the daily growth rates using the average daily climatic condition of the 249 250 years of the narrow (N), wide (W) and IADF (I) ring types indicated a common decreasing growth
- rates between 37% (W) to 64% (N) during the first half of the growing season (up to DOY 210, 251
- 252 Figure 4). During this period, the rates were about 42 and 48% higher for the wide ring then for the
- 253 other two groups. The pattern among the groups differed in particular in the second part of the
- season, where the Grs continued to decrease in the wide rings, while it showed a substantial recovery 254
- 255 before a new decrease at the end of the growing season for both IADF (+ 134%) and the narrow rings
- 256 (+ 24%). Up to the ending of the growing season (i.e., from DOY 1 to 270) the precipitation sum was
- 257 394, 363 and 286 mm for W, I and N respectively, whereby the precipitation in the IADF group were
- 258 initially not substantially differing from the narrow rings, but showed a strong increase in the second
- 259 part of the growing season. Over the growing season (DOY 142 to 270), the average temperature
- among the groups ranged between 16.35 °C and of 16.64 °C. 260
- The assessment of tracheid size (and thus of the average tracheidogram) for each group of year (using 261
- 262 the average relationship obtained based on the observation, Figure 3) indicated that the model is able
- to reproduce the main pattern of the original tracheidogram, with presence of IADF only in the 263
- 264 corresponding group (Figure 4C). However, the model failed to reproduce short rings, since growth
- 265 rate, similarly to the IADF group, also recovered after the summer drought. A stop of growth induced
- 266 at the end of the drought period would however provide a short ring, without IADF.
- 267 Model simulations performed to identify which conditions generate IADF by progressively reducing
- precipitation (by step of 20%) from W to I and I to N during the firs half of the growing season 268
- (period DOY 1 to 186) indicated that IADF started to appear when precipitations are below 132 mm 269
- 270 only if the second part of the growing season get sufficient precipitations (199 mm, see scenario W80
- 271 in Figure 5). Notably, if the second part of the growing season persists with below average
- precipitation, the model predicts the formation of a narrow ring. 272

Discussion 4

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- 275 To The application of the VS-model performed in this study, although based on assumptions
- simplifying the process of xylogenesis, provided outputs matching site observations. It is known that, 276
- 277 differently to our assumptions, the xylem cells resulting from cambial zone are disposed in a radial
- band and thus successively undergo the differentiation program with some time overlap (Rathgeber 278
- 279 et al., 2016). Moreover, a latewood tracheid differentiation can easily last for more than a month
- 280 (e.g.; (Cuny et al., 2013) and consequently cambial division stops earlier then assumed in this study.
- Despite these assumptions, the VS-model provided i) time-series of annual growth rate well matching 281
- 282 the site tree-ring chronology, ii) timing of cambial cells growth rates that matched with the
- observations of tissue formation performed in the field in 2013 (Figure 3A,B), and iii) modeled 283

tracheidograms reproducing most of the anatomical patterns of tree-rings typical in summer-drought exposed sites.

These results confirm the ability of the VS-model to deliver reliable annual growth outputs at cold and drought limited forest sites (Breitenmoser et al., 2014), as in the Quilian Mountains and Tibetan Plateau (e.g.; (Zhang et al., 2016; He et al., 2017; Yang et al., 2017), at the semi-arid central China (Shi et al., 2016), or within the drought sensitive Mediterranean Basin (Touchan et al., 2012). At our site, growth rates are generally limited by soil water shortage except for the margin of the growing season which are limited by cold (Arzac et al., in review; Tychkov et al., in review), as confirmed by results of climate-growth responses performed for the same species within the South-Central Siberian forest-steppe (Babushkina et al., 2015). Newly, we could verify that the VS-model also provided convincing intra-annual output typical of summer drought-limited environments characterized by a bi-modal growth (e.g. (Camarero et al., 2010; Pasho et al., 2012; Vieira et al., 2014) and a radial ring pattern with the occurrence of numerous IADF (e.g.; Campelo et al., 2007; De Micco et al., 2016; Zalloni et al., 2016). On the one hand, the growth rates modeled for the 2013 growing season were synchronous in timing and proportion with the number of cambial and enlarging cells observed on micro-cores collected in the field (r = 0.93 and 0.84 for cambial and enlarging, respectively), including direct observations on five trees performed in the same area during the years 1979-1981 (Vaganov et al., 1985). On the other hand, the tracheidograms simulated for the three ring types provided the expected radial patterns, with the occurrence of IADF in the second part of the annual ring for the IADF group.

However, interestingly, the model failed to reproduce the tracheid pattern of narrow rings by instead providing narrow rings with the occurrence of IADF. Strong indications suggest that this discrepancy is caused by a summer drought-induced growth stop in that particular year that the model misses to identify. In this specific case, there are indications that in extreme drought years, trees with reduced growth rate are not able to resume growth along with the drought release occurring in the second part of the season due to an excessive water shortage. This result is confirmed by previous observations indicating that water availability has a strong influence on growth rates and can induce an early cessation of wood formation (Eilmann et al., 2009; Vieira et al., 2017). Studies on IADF occurrence have already highlighted that IADFs were more frequent in younger trees (Vieira et al., 2009; Battipaglia et al., 2010) or in wider tree rings (Rigling et al., 2001; Campelo et al., 2013), supporting our suggestion that trees with smaller growth rates do not resume cambial division and thus do not form IADFs. The substantial improvement of the correlations and R² between cambial cell growth rates and cell diameter obtained when reducing the modeled growing season length (Figure S2 and S3) well supports our hypothesis.

The results obtained also reveals that the VS-model can be used for describing the processes underlying the environmental impact on the intra-annual tree-ring structure, at least within contexts characterized by climatic factors strong limiting growth, as at our site. In particular, the strength of the association between the simulated growth rates and the measured radial tracheid sizes supports the model assumption that tracheid radial size is pre-determined during the early stage of cell differentiation and can therefore be associated with the rate of cambial cells production (Vaganov et al., 2006; Vaganov et al., 2011). The climatic conditions occurring during this phase pre-determine the duration and rate that the forming cells are going to endure in the enlargement phase, which control the final tracheid size (Cuny et al., 2014). Studies on correlation between tracheid size and environmental conditions have indeed often identified seasonal climatic signals overlaying the developmental phases of cambial division and tracheid enlargement, thus supporting the existence of

- 329 a strong association between them (e.g.; Fonti et al., 2013; Carrer et al., 2017; Castagneri et al.,
- 330 2017).
- In this study we applied the model to assess which conditions (intensity and pattern of precipitation) 331
- 332 generate a latewood IADF in "an average tree" at the study site. Such an approach has a great
- potential for exploring how climate is affecting wood formation, even at individual tree level. For 333
- 334 example it might be interesting to investigate what summer drought conditions are inducing a stop in
- growth while considering both the level of drought and the individual tree growth potential by 335
- performing similar analyses on trees and calendar years grouped according to ring width and/or tree 336
- 337 vigor.

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5 Conclusion

- 339 This study demonstrated that the VS-model successfully generated realistic tracheidograms of
- 340 tracheid cell diameter for Pinus sylvestris trees growing in a drought sensitive environment. In
- particular the strong association between the growth rate of the dividing cambial cell and the tracheid 341
- 342 size was used to predict wood structure from daily climatic condition This intra-ring resolution has
- been achieved thanks to the model ability to provide daily growth rates (Vaganov et al., 2006). This 343
- 344 increased resolution helped us to identify narrow rings as an extreme manifestation of IADFs where
- 345 the recover in the second part of the season was impeded by a too high sensitivity to extreme drought
- 346 conditions. The model proved usefulness also to quantify average levels and seasonal patterns of
- precipitation (thus indirectly of drought) inducing IADFs and narrow rings. The association between 347
- 348
- climatic conditions and cell anatomical structure via model-generated tracheidogram provide a novel
- 349 opportunity to assess wood structure sensitivity to climate. Such intra-annual growth model
- 350 resolution represents a fundamental tool to provide reliable tracheidogram to better understand,
- develop and up-scale scenarios of wood structural responses to climate change over time and space. 351
- Considering that wood structure is an important legacy for tree performance (Björklund et al., 2017; 352
- 353 Rathgeber, 2017) the results from those scenarios might have relevant implications for the
- 354 assessment of future plant productivity and provided forest services (Sass-Klaassen et al., 2016).

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6 **Author Contributions**

- 357 M.P, E.V, V.S. and P.F. designed the research. E.B and M.F. performed data collection. M.P, M.F,
- and P.F. performed analyses and interpreted the data. All coauthors contributed to the preparation of 358
- 359 the manuscript.

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575 10 Figures

- Figure 1. Model calibration and selection of ring types. (A) The grey line indicates the detrended Pinus sylvestris tree-ring chronology over the period 1936 to 2013 at the Malaya Minusa in southern Siberia; the black one shows the growth rate obtained with the model. Pearson's correlations (r) and Gleichläufigkeit (Glk) for both the calibration (1960-2013) and verification period (1936-1959) are indicated. Colored years indicate the annual rings grouping (N = narrow rings (green); W = wide rings (blue); I = IADF rings (red)) according to their typical tree-ring pattern. (B) Images of a ring displaying a typical IADF (ring 2013, scale = 100 μm).
 - Figure 2. Tracheidograms and intra-annual density fluctuations (IADF). (A) Overview of all 50 tracheidograms of tracheid diameter for the annual rings of tree D8 with different ring types shown in colors (N = narrow rings (green); W = wide rings (blue); I = IADF rings (red), see Figure 1 and Figure 2B). (B) Example of tracheidogram displaying a L+ IADF (numbers indicate the tracheid diameter). L+ IADFs have been defined in this study as rings showing a tracheid size increase of at least 10% occurring in the last third of the tracheidogram. The formula in red indicates how the increase of tracheid diameter (DeltaIADF) has been assessed. (C) Presence of DeltaIADFs as a function of tree-ring width for all the 250 annual rings considered in the study. In black are indicated the years of the annual ring showing a L+ IADF (i.e. with DeltaIADF >10%). The year in red corresponds to the example of Figure 2B.

Figure 3. Assessment of cambial cell growth rates and its relationship to the tracheid diameter. **(A)** Average number of cambial (beige) and enlarging cells (yellow) as observed during the growing season 2013 with repeated micro-coring on 15 trees from the study site in Malaya Minusa. **(B)** Daily (grey bars) and cumulated (black thick line) growth rates as assessed by the calibrated model for the growing season 2013. Brown rectangles on the right indicate the sequentially developing cambial cells (n=31 for tree D1, assuming that the production of a successive cambium cell only occurs when the previous one is completed) used to assess the timing of their development and the corresponding average cell growth rate (the filled rectangle correspond to the 21st cambial cell). Specifically, the timing of each dividing cambial cell (i.e., when environmental conditions determine the future cell

differentiation, see (Vaganov et al., 2006)) was assigned by dividing the annual Gr by the number of cells produced. (C) Correlation between average cell growth rate and tracheid diameter for the example shown in Figure 3B (year 2013 of tree D1, numbers indicate the cell position in the ring); and (D) scatter plot of average cell growth rate and tracheid diameter for all 9468 tracheids included in the 250 tracheidograms. The exponential fitting function is shown in red. (E) Summary of all correlations between average cell growth rate (Gr) and tracheid diameter (TD) plotted as a function of ring width (n=250). The red dot refers to the example shown in Figure 3C. The red line shows the distribution of the correlations.

Figure 4. Comparison of climate, growth rate, and modeled wood structure among the three ring types (narrow rings (green); wide rings (blue); IADF rings (red)). (A) Daily temperature (dots) and precipitation (area) averaged for each the year in each ring type and smoothed with a loess function (span=0.3, thick lines). The smoothed values have been used as input for the model. (B) Growth rates obtained by the model. (C) Derived tracheidogram for each ring type by using the quantified relation between average cell growth rates and tracheid diameter (Figure 3D). The number of cell is proportional to the modeled ring width. (D) Schema of the tracheidogram shown in (C).

Figure 5. Exploring climatic scenarios generating IADF. (A) Averaged and loess smoothed (span=0.3) daily precipitation of each ring type (thick colored lines) and their progressive transition between groups (in 20% steps) between W - I and I -N (thin grey lines) used to run the model (with group average daily temperature). The black line indicates the average precipitation over the period 1960 to 2013. Psum [mm] Doy 0-186 = precipitation sum between DOY 1 and 186 (middle of the growing season); Psum [mm] Doy187-276 = precipitation sum between DOY 187 and 276 (end of the growing season). (B) Obtained daily growth rates. The legend quantifies the growth rates sum [%] for each climatic scenario. (C) Derived modeled tracheidograms for each precipitation scenario. Tracheidograms with filled circle display a L+ IADF according to the definition given in Figure 2B. The legend quantifies the DeltaIADF [%] for each climatic scenario. N = narrow rings (green); W =

wide rings (blue); I = IADF rings (red).

TABLES AND FIGURES

Table 1: Trees and tree-ring characteristics.

| H | DBH | Age | TRW | | | Ncell | | | TD | | |
|------|-----------------------------------|--|--|---|--|---|--|--|--|--|--|
| [m] | [em] | [years] | [mm] | | | | | | [µm] | | |
| mean | mean | mean | mean | min | max | mean | min | max | mean | min | max |
| 17.8 | 37.5 | 93 | 1.46 | 0.59 | 3.22 | 8 2 2 | Ħ. | * | | (*) | (2) |
| 18.2 | 35.8 | 95 | 1.33 | 0.22 | 2.88 | 38 | 9 | 76 | 35.0 | 18.7 | 45.5 |
| 18 | 40 | 90 | 1.75 | 1.05 | 2.88 | 44 | 29 | 71 | 40.2 | 36.2 | 45.5 |
| 17 | 26 | 91 | 1,69 | 0.69 | 2.64 | 49 | 23 | 76 | 33.9 | 29.0 | 37.2 |
| 20 | 41 | 90 | 0.73 | 0.22 | 2.51 | 21 | 9 | 70 | 33.4 | 18.7 | 38.9 |
| 20 | 43 | 111 | 1.27 | 0.57 | 2.38 | 43 | 23 | 73 | 29.0 | 23.1 | 33.7 |
| 16 | 29 | 92 | 1.22 | 0.51 | 1.99 | 32 | 17 | 53 | 38.4 | 28.5 | 44.8 |
| 9.2 | 9.3 | 9.4 3 | 9.5 | 9.6 | 9.7 | 9.8 | - 9.9 | 9.10 | 9.11 | 9.12 | - |
| | | (| • | 4/ | | | | | | | |
| | [m] mean 17.8 18.2 18 17 20 20 16 | [m] [cm] mean mean 17.8 37.5 18.2 35.8 18 40 17 26 20 41 20 43 16 29 | [m] [cm] [years] mean mean mean 17.8 37.5 93 18.2 35.8 95 18 40 90 17 26 91 20 41 90 20 43 111 16 29 92 9.2 9.3 9.4 3 | [m] [cm] [years] [mm] mean mean mean 17.8 37.5 93 1.46 18.2 35.8 95 1.33 18 40 90 1.75 17 26 91 1,69 20 41 90 0.73 20 43 111 1.27 16 29 92 1.22 9.2 9.3 9.4 3 9.5 | [m] [cm] [years] [mm] mean mean mean min 17.8 37.5 93 1.46 0.59 18.2 35.8 95 1.33 0.22 18 40 90 1.75 1.05 17 26 91 1,69 0.69 20 41 90 0.73 0.22 20 43 111 1.27 0.57 16 29 92 1.22 0.51 9.2 9.3 9.4 3 9.5 9.6 | [m] [cm] [years] [mm] mean mean mean min max 17.8 37.5 93 1.46 0.59 3.22 18.2 35.8 95 1.33 0.22 2.88 18 40 90 1.75 1.05 2.88 17 26 91 1,69 0.69 2.64 20 41 90 0.73 0.22 2.51 20 43 111 1.27 0.57 2.38 16 29 92 1.22 0.51 1.99 9.2 9.3 9.4 3 9.5 9.6 9.7 | [m] [cm] [years] [mm] mean mean mean min max mean 17.8 37.5 93 1.46 0.59 3.22 - 18.2 35.8 95 1.33 0.22 2.88 38 18 40 90 1.75 1.05 2.88 44 17 26 91 1,69 0.69 2.64 49 20 41 90 0.73 0.22 2.51 21 20 43 111 1.27 0.57 2.38 43 16 29 92 1.22 0.51 1.99 32 9.2 9.3 9.4 3 9.5 9.6 9.7 9.8 | [m] [cm] [years] [mm] mean mean mean min max mean min 17.8 37.5 93 1.46 0.59 3.22 - - 18.2 35.8 95 1.33 0.22 2.88 38 9 18 40 90 1.75 1.05 2.88 44 29 17 26 91 1,69 0.69 2.64 49 23 20 41 90 0.73 0.22 2.51 21 9 20 43 111 1.27 0.57 2.38 43 23 16 29 92 1.22 0.51 1.99 32 17 9.2 9.3 9.4 3 9.5 9.6 9.7 9.8 - 9.9 | [m] [cm] [years] [mm] mean mean min max mean min max 17.8 37.5 93 1.46 0.59 3.22 - - - 18.2 35.8 95 1.33 0.22 2.88 38 9 76 18 40 90 1.75 1.05 2.88 44 29 71 17 26 91 1,69 0.69 2.64 49 23 76 20 41 90 0.73 0.22 2.51 21 9 70 20 43 111 1.27 0.57 2.38 43 23 73 16 29 92 1.22 0.51 1.99 32 17 53 9.2 9.3 9.4 3 9.5 9.6 9.7 9.8 - 9.9 9.10 | mean mean mean mean min max max mean min max max <th< td=""><td>mean mean mean mean min max mean min min 17.83 37.5 93 1.46 0.59 3.22 -</td></th<> | mean mean mean mean min max mean min min 17.83 37.5 93 1.46 0.59 3.22 - |

H = Tree height; DBH = Stem diameter at breast height; TRW = tree-ring width; Ncell = number of cells in tracheidogram; TD = Cross-sectional tracheid radial diameter

Table 2: Selected model parameters

| Param | Description | Values |
|-------------|---|--------|
| T_{min} | Minimum temperature threshold for growth (°C) | 5.0 |
| T_{optl} | Lower temperatures threshold for optimal growth (°C) | 13.0 |
| T_{opt2} | Upper temperatures threshold for optimal growth (°C) | 22.0 |
| T_{max} | Maximum temperature threshold for growth (°C) | 32.0 |
| W_{min} | Minimum soil moisture threshold for growth, relative to saturated soil $\left(v/v\right)$ | 0.0775 |
| W_{opt1} | Lower soil moistures threshold for optimal growth (v/v) | 0.25 |
| W_{opt2} | Upper soil moistures threshold for optimal growth (v/v) $$ | 0.375 |
| W_{max} | Maximum soil moisture threshold for growth (v/v) | 0.45 |
| W_0 | Initial soil moisture (v/v) | 0.15 |
| T_{beg} | Temperature sum threshold for onset of growth (°C) | 110.0 |
| t_{beg} | Size of the moving window for calculation of temperature sum (days) | 10 |
| $l_{\rm r}$ | Depth of root system (mm) | 500 |
| P_{max} | Maximum daily precipitation for saturated soil (mm/day) | 40 |
| C_1 | Fraction of precipitation reaching the soil (not caught by crown) (rel. unit) | 0.5 |
| C_2 | First coefficient for calculation of transpiration (mm/day) | 0.3075 |
| C_3 | Second coefficient for calculation of transpiration (mm/day) | 0.11 |
| Λ | Coefficient for water drainage from soil (rel. unit) | 0.005 |
| V_{cr} | Critical growth rate to determine the end of the growing season (rel. unit) | 0.04 |











