



UNTERSTÜTZT VON / SUPPORTED BY

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VS-LITE

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VS-LITE

Low-complexity non-linear sink-oriented process-based model of wood formation

Tolwinski-Ward, S.E., Evans, M.N., Hughes, M.K., Anchukaitis, K.J., 2011. An efficient forward model of the climate controls on interannual variation in tree-ring width. Clim. Dyn. 36, 2419–2439. <https://doi.org/10.1007/s00382-010-0945-5>

HOW TO QUANTIFY CLIMATE-GROWTH RESPONSES?

1. Statistical approaches

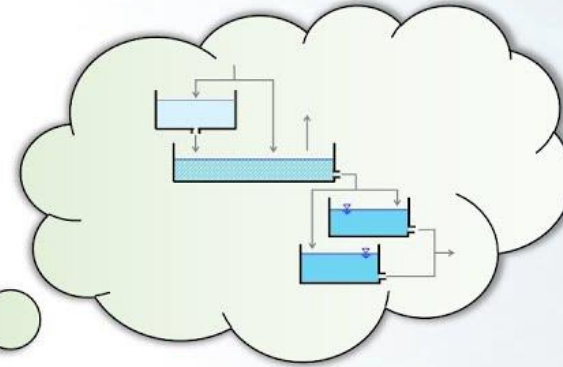
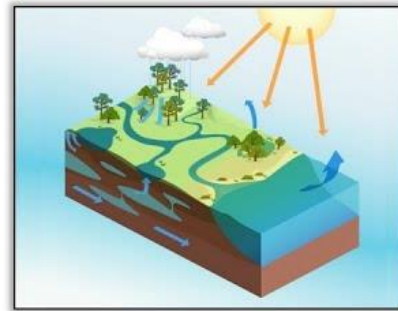
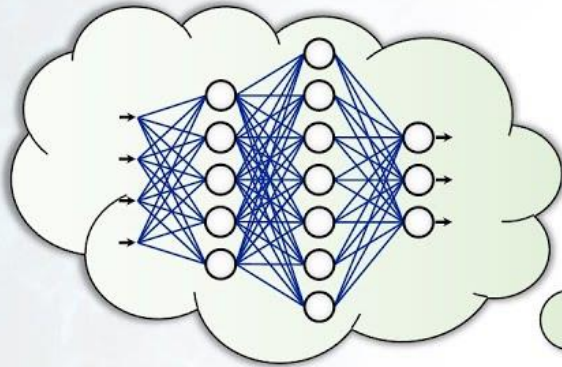
- Statistical function (e.g., linear regression) → statistical parameter(s) (e.g., correlation)
 - + Easy to implement (mathematical definitions)
 - Statistical assumptions (≠ ecological reality)

2. (Climate-driven) process-based models of tree-ring formation

- Set of equations implementing current state of knowledge about climatic effects on kinetics and phenology
 - Complexity, input requirements
 - + Realistic implementation of ecological principles

HOW TO QUANTIFY CLIMATE-GROWTH RESPONSES?

Deep learning versus process-based modelling



Deep learning

- Based on correlational relationships
- Strong in complex many dimensional mapping
- Easy scaling to any big data
- Limited interpretability and explainability



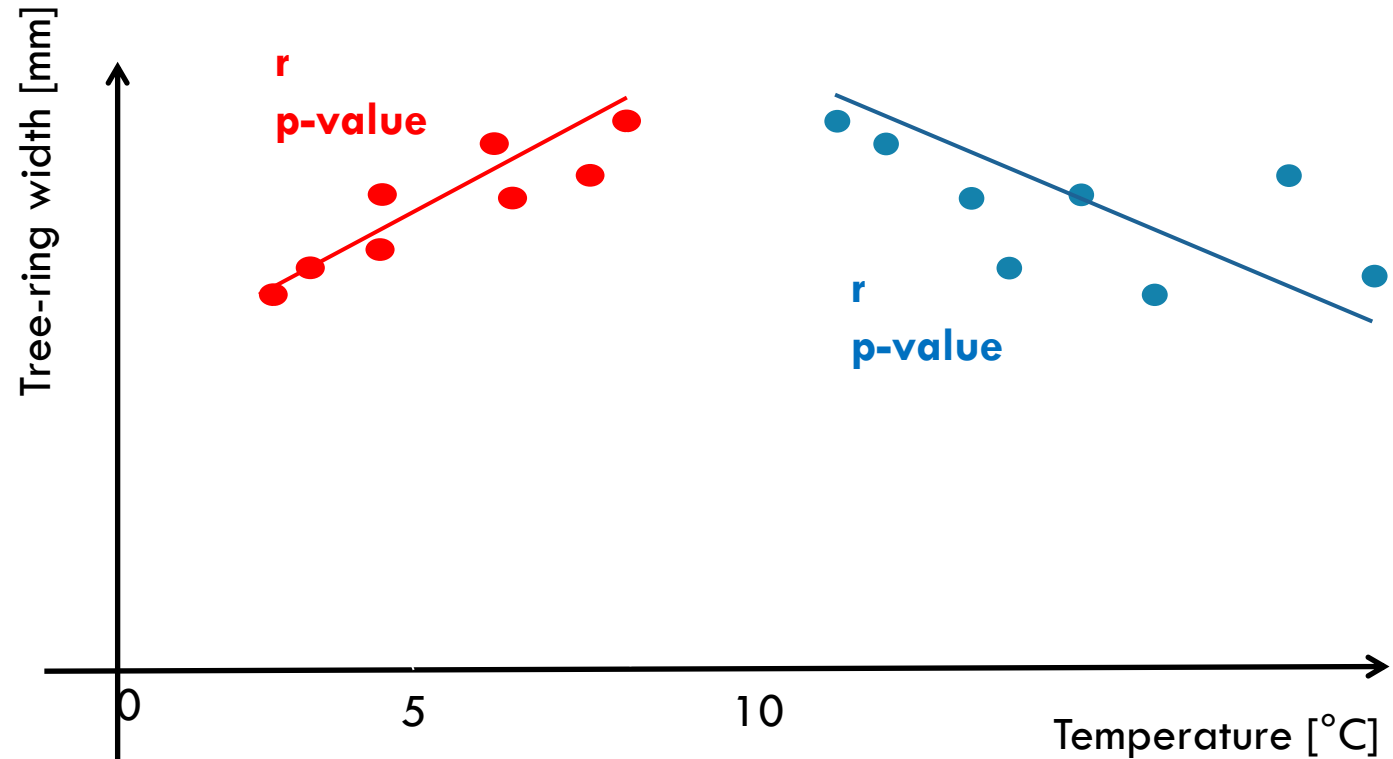
Process-based modelling

- Based on causal relationship, presumptive or real
- Strong in hypothesis development and testing
- Inefficient in incorporating big data
- Logical and intuitive

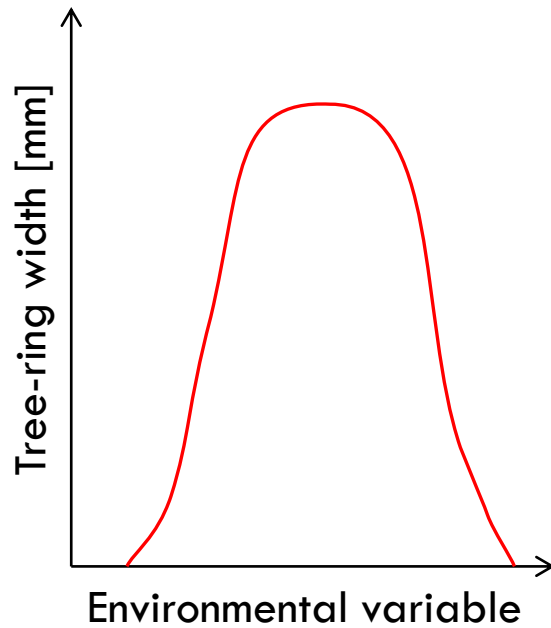
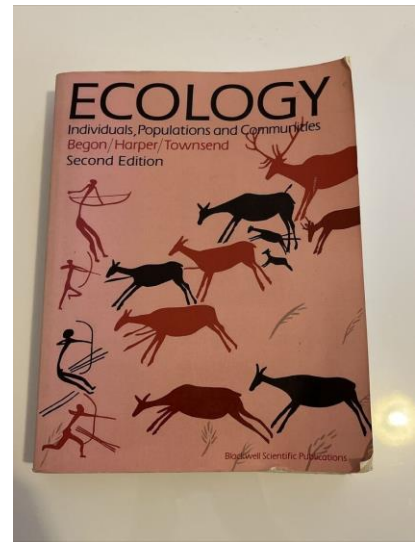
WHAT ARE KEY LIMITATIONS OF CLIMATE-GROWTH CORRELATIONS?

Linearity assumption

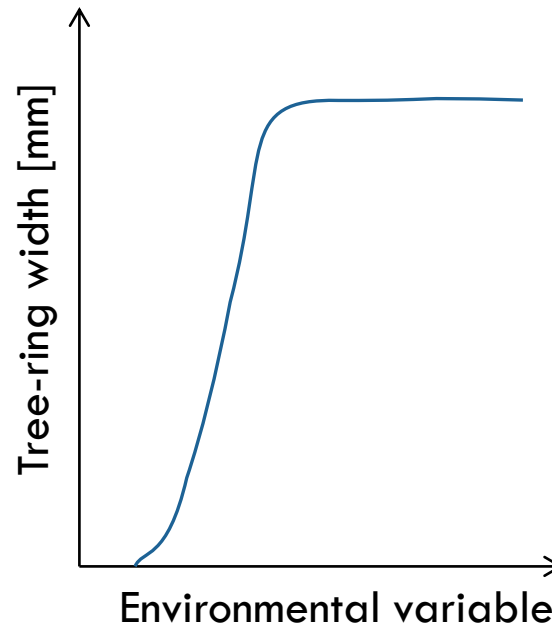
Interpretability
(„black box“)



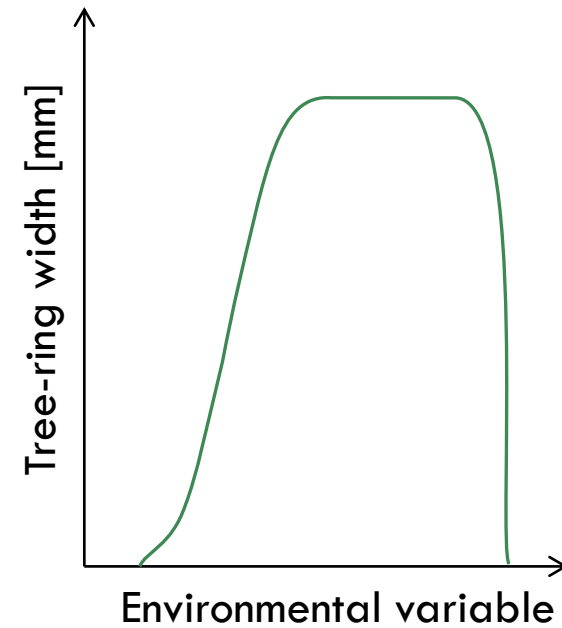
LINEAR OR NON-LINEAR RESPONSE IN ECOLOGY?



Temperature

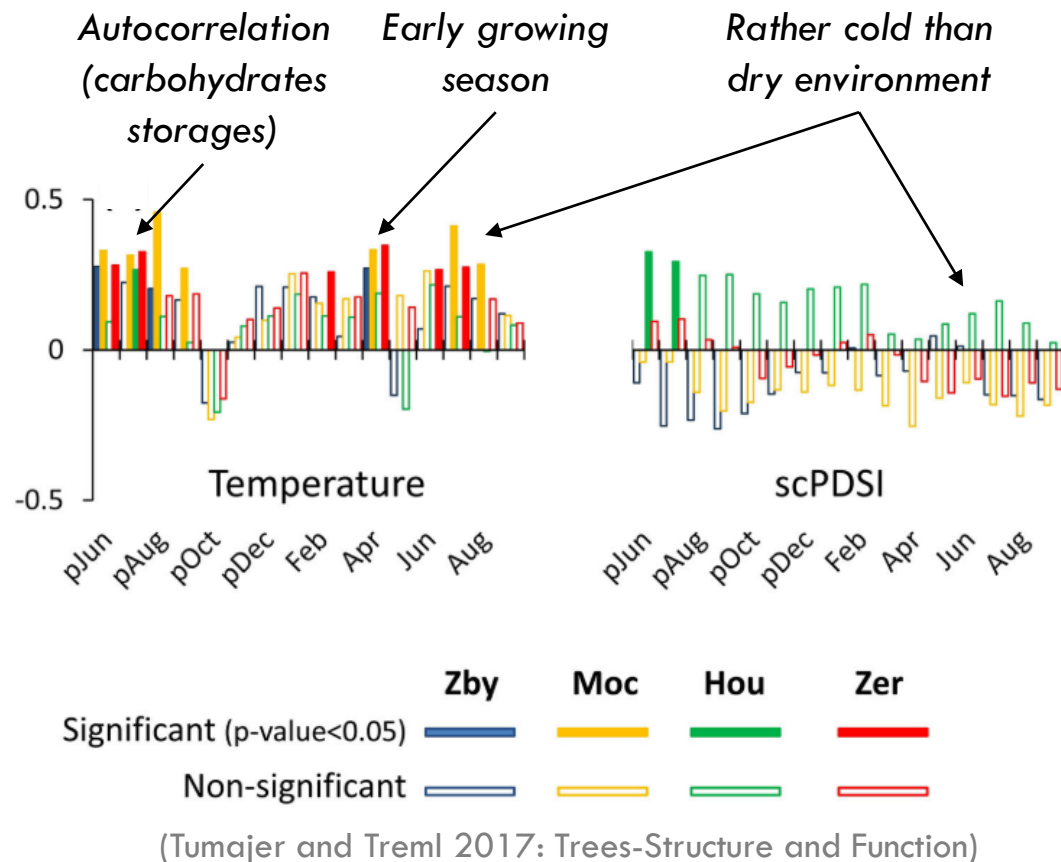


CO₂ concentration
(greenhouse)



N concentration in soil

INTERPRETATION OF CORRELATIONS



... but climate-growth correlations cannot answer following questions:

- How trees grew during 1976 extreme year?
- What shapes the growth in May?
- Was the climatic response stable over the calibration period?
- ...

PROCESS-BASED MODELS OF WOOD FORMATION

= sets of numerical equations that implement current state of knowledge about mechanisms of environmental control of tree-ring formation, QWA, photosynthesis, isotopic composition of lignin, hormonal dynamics, ...

- Sink X Source models

Eckes-Shephard et al. (2022): Frontiers in Plant Science

Guiot et al. (2014): Frontiers in Ecology and Evolution

Table 1 | Rough classification of the models cited according to the main processes included.

Model	Water cycle	Carbon cycle	Tree compartments	Wood structure	Isotopes
Biome3 (Rathgeber et al., 2000a)	x	x			
VS-light (Tolwinski-Ward et al., 2011)	x				
- (LeBlanc and Terrell, 2001)	x				
StandLEAP (Girardin et al., 2008)		x	x		
SIMFORG+SICA (Berninger and Nikinmaa, 1997)	x	x	x		
MAIDEN (Misson, 2004)	x	x	x		
CASTANEA (Dufrene et al., 2005)	x	x	x		
VS (Fritts et al., 1991)	x	x	x	x	
ECOPHYS (Rauscher et al., 1990)		x	x		
-(Ogee et al., 2009)	x	x	x		x
-(Hölttä et al., 2010)			x	x	
CAMBIUM (Drew et al., 2010)	x	x	x	x	
MAIDENiso (Danis et al., 2012)	x	x	x		x
ISOCASTANEA (Eglin et al., 2010)	x	x	x		x

VS-LITE

Low-complexity climate-driven ...

- *Considers climatic limitation of the growth (temperature, soil moisture)*
- *Works with monthly resolution*
- *+ Can be applied almost everywhere (you only need monthly temperature, precipitation and site chronology)*
- *- Less detailed outputs of simulations compared to other models*

... non-linear ...

- *Climate-growth response functions are non-linear*

... sink-oriented ...

- *Considers direct effects of climate on cambium, ignores everything related to photosynthesis*

... process-based model of wood formation

TRACH, VAGANOV-SHASHKIN, VS-LITE

TRACH (Fritts et al. 1991)

- Original ancestor

Vaganov-Shashkin model (Vaganov et al. 2006)

- Daily resolution
- Three serialy-linked modules
 - Environmental module – calculation of dimensionless relative daily growth rates GrINT (VS-Oscilloscope – Shishov et al. 2016: Dendrochronologia)
 - Xylogenesis module – conversion of GrINT into daily cell numbers inside cambial zone and kinetics of their radial growth and division (Anchukaitis et al. 2021: Dendrochronologia; Tumajer et al. 2021: Frontiers in Plant Science)
 - QWA module – calculating LA and CWT for each developing tracheid each day (Popkova et al. 2023: Dendrochronologia)

VS-Lite (Tolwinski-Ward et al. 2011)

- Adopting environmental module of the Vaganov-Shashkin model for monthly resolution

VS-LITE – WORKFLOW (1)

Calculating environmental variables that (according to the model) affect tree growth

- Mean monthly air temperature $T[^{\circ}\text{C}]$
 - Provided by the user as an input
- Mean monthly volumetric soil moisture $M[\text{v}/\text{v}]$
 - Provided by the user as an input OR ...
 - ... calculated from temperature and precipitation (input) by inbuilt soil moisture model (Huang et al. 1996: Journal of Climate)
- Mean monthly daylength $E[\text{h}]$
 - Calculated automatically from site latitude

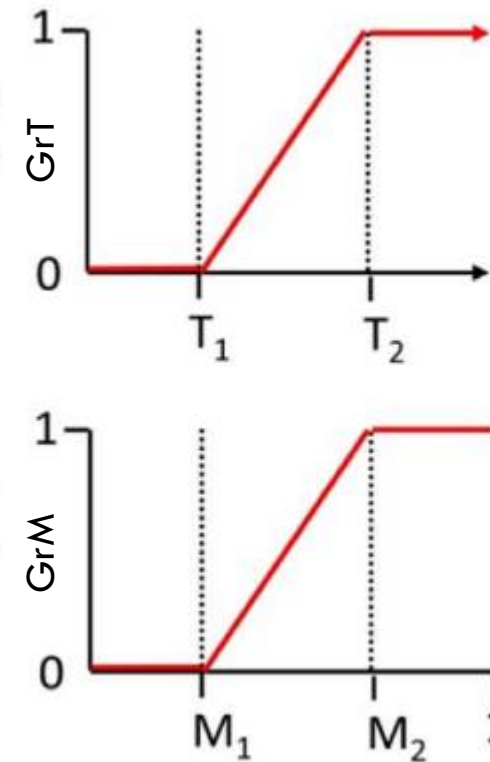
VS-LITE – WORKFLOW (2)

Converting environmental variables into monthly **partial growth rates**

= relative variable describing the capacity of a tree to produce wood under given temperature OR soil moisture OR daylength

= how fast would a tree grow in case its growth would be fully controlled by temperature OR soil moisture OR daylength

- 0 = no growth, dormancy; 1 = optimum, full growth capacity
- Partial growth rate to temperature (GrT) and partial growth rate to soil moisture (GrM)
 - Determined from climatic variables by means of non-linear response functions



VS-LITE – WORKFLOW (3)

Converting environmental variables into monthly **partial growth rates**

= relative variable describing the capacity of a tree to form wood under given temperature OR soil moisture OR daylength

- 0 = no growth, dormancy; 1 = optimum, full capacity to growth
- T_1 , T_2 , M_1 and M_2 are usually calibrated inside „reasonable ranges“
 - Subjectivity

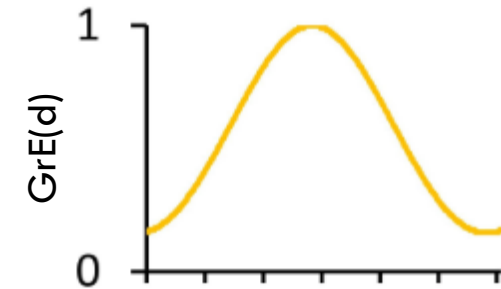
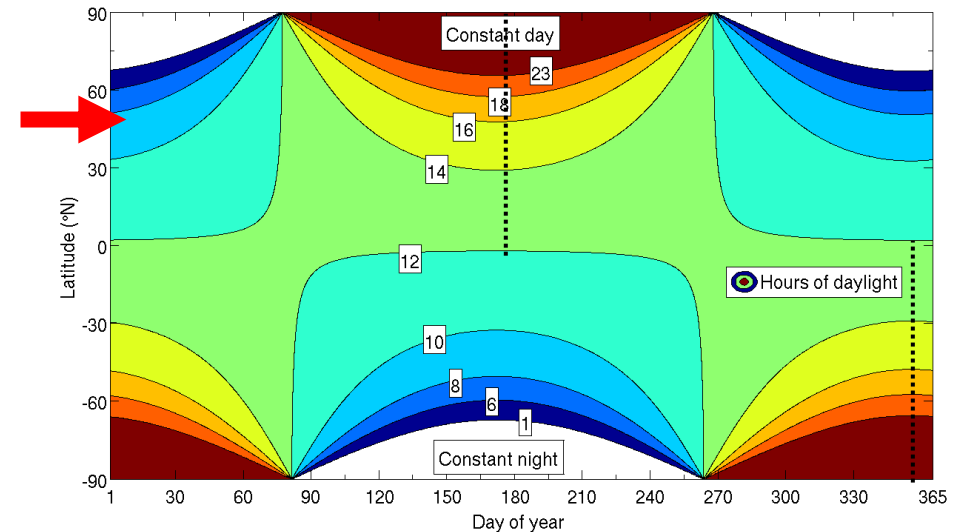
$$\text{GrT} = \begin{cases} 0 & \text{if } T \leq T_1 \\ (T - T_1)/(T_2 - T_1) & \text{if } T_1 < T < T_2 \\ 1 & \text{if } T_2 \leq T \end{cases}$$

$$\text{GrM} = \begin{cases} 0 & \text{if } M \leq M_1 \\ (M - M_1)/(M_2 - M_1) & \text{if } M_1 < M < M_2 \\ 1 & \text{if } M_2 \leq M \end{cases}$$

VS-LITE – WORKFLOW (4)

Converting environmental variables into monthly **partial growth rates**

- Partial growth rate to daylength (GrE)
 - $\text{GrE}(d) = \text{daylength of day } d / \text{daylength of summer solstice}$
 - Calculated automatically

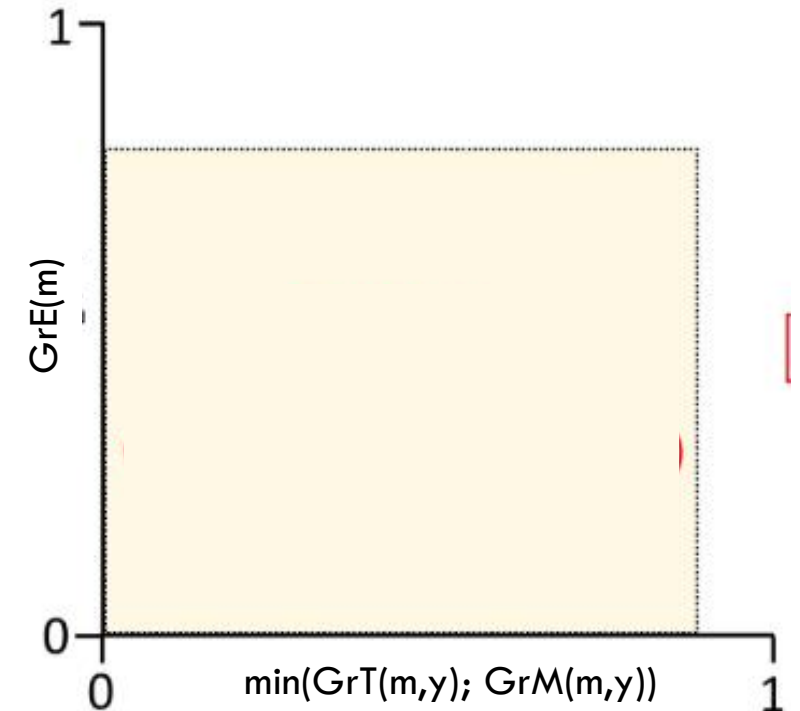


VS-LITE – WORKFLOW (5)

Integration of partial growth rates into integral growth rates (GrINT)

- Dimensionless proxy of monthly growth rate
- Liebig's law of minimum – the more limiting climatic variable (temperature, soil moisture matters) determines GrINT

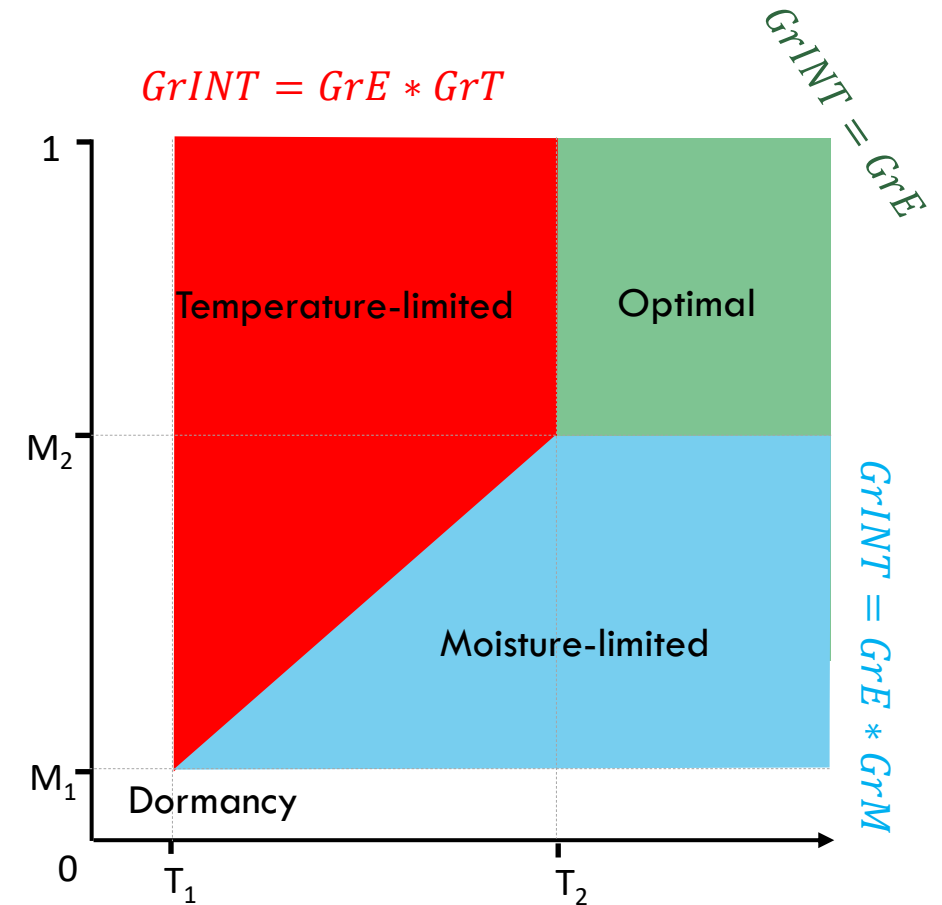
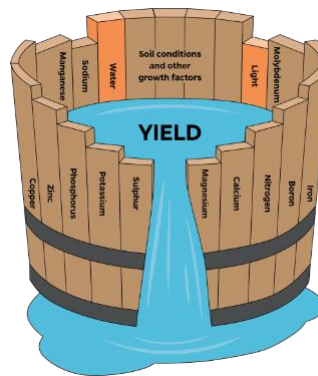
$$GrINT(m, y) = GrE(m) * \min(GrT(m, y) ; GrM(m, y))$$



VS-LITE – WORKFLOW (6)

Identification of dominant climatic limiting factor of growth for each month

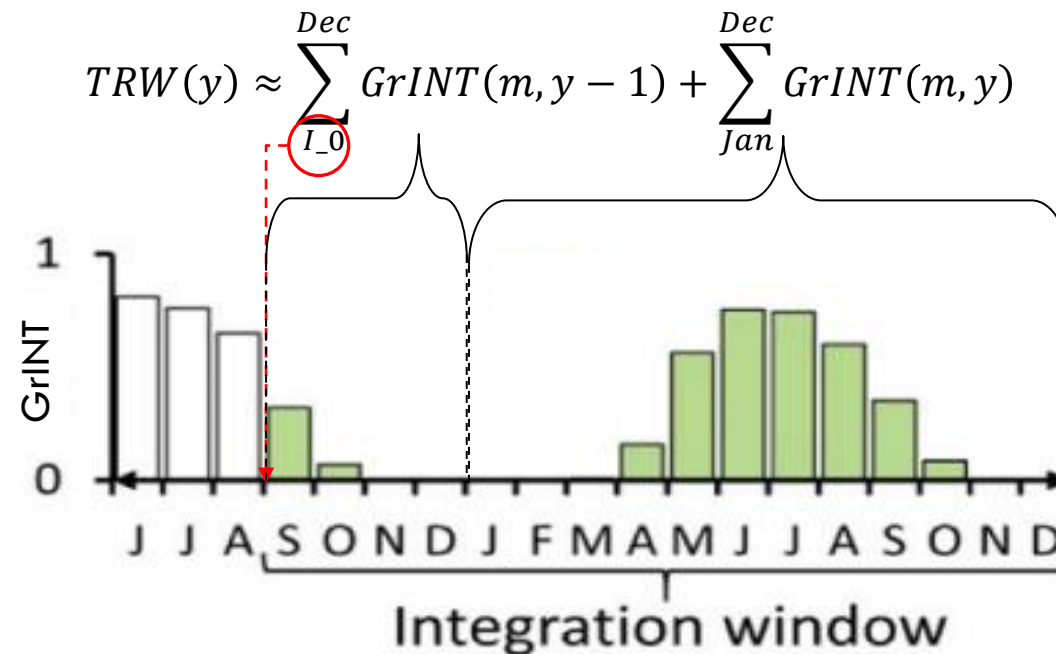
- GrINT follows the lower of GrT and GrM
- $0 < \text{GrT} < \text{GrM}$... temperature-limited
- $0 < \text{GrM} < \text{GrT}$... moisture-limited
- $\text{GrT} = \text{GrM} = 1$... optimal growth
- $\text{GrINT} = 0$... dormancy



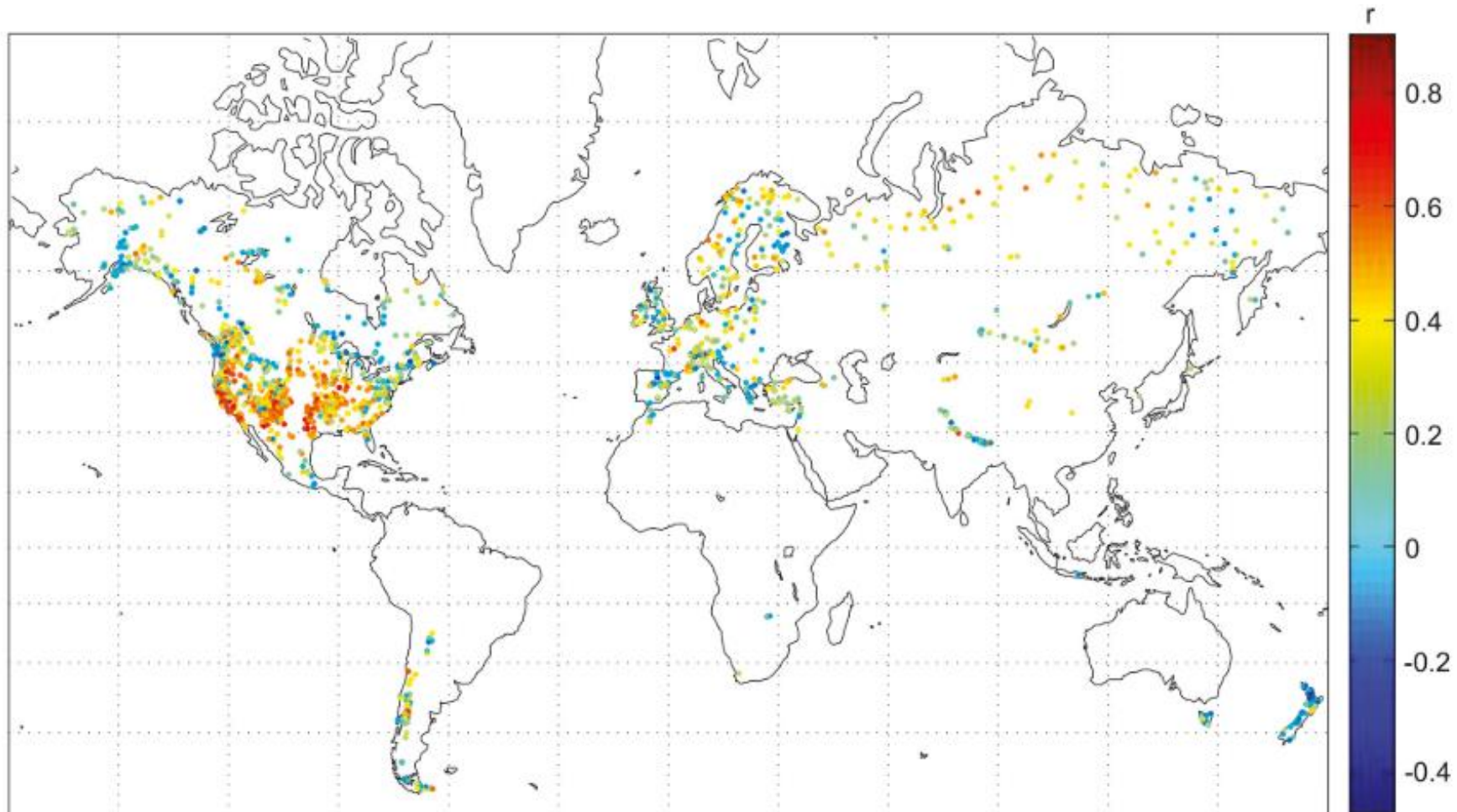
VS-LITE – WORKFLOW (7)

Calculating simulated annual tree-ring width chronology

≈ sum of GrINT during the given year + (optionally) part of GrINT from the previous year *
(optionally) weight



GLOBAL APPLICATION OF THE VS-LITE



Breitenmoser et al (2014): Climate of the Past

MODEL DEVELOPMENT

Dendrochronologia 49 (2018) 77–88



Original Article

The facultative bimodal growth pattern in *Quercus ilex* – A simple model to predict sub-seasonal and inter-annual growth

Filipe Campelo^{a,*}, Emilia Gutiérrez^b, Montserrat Ribas^b, Raúl Sánchez-Salguero^{c,d}, Cristina Nabais^a, J. Julio Camarero^c

Agricultural and Forest Meteorology 247 (2017) 56–64



Research paper

Increasing moisture limitation of Norway spruce in Central Europe revealed by forward modelling of tree growth in tree-ring network

Jan Tumaier^{a,b,*}, Jan Altman^c, Petr Štěpánek^d, Václav Trembl^b, Jiří Doležal^c, Emil Cienciala^a

Science of the Total Environment 905 (2023) 167153



Linkage between growth phenology and climate-growth responses along landscape gradients in boreal forests

Jan Tumaier^{a,*}, Jan Altman^{b,c}, Jiří Lehejček^{d,e}

Agricultural and Forest Meteorology 221 (2016) 13–33



Forward modeling of tree-ring width improves simulation of forest growth responses to drought

Marco Mina^a, Dario Martin-Benito, Harald Bugmann, Maxime Cailleret

RESEARCH PAPERS

WILEY Global Ecology and Biogeography

The climatic drivers of normalized difference vegetation index and tree-ring-based estimates of forest productivity are spatially coherent but temporally decoupled in Northern Hemispheric forests

Kristina Seftigen^{1,2} | David C. Frank^{3,4} | Jesper Björklund^{3,5} | Flurin Babst^{3,6} | Benjamin Poulter⁷

Agricultural and Forest Meteorology 327 (2022) 109196



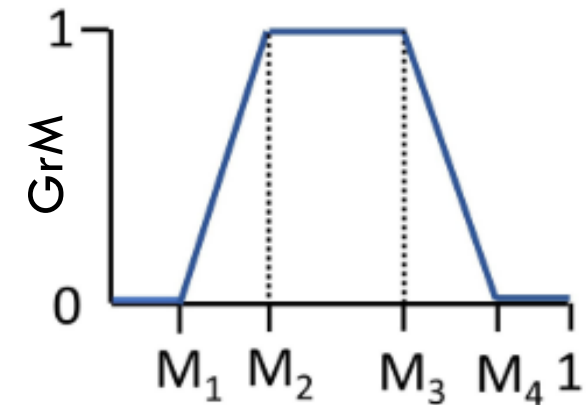
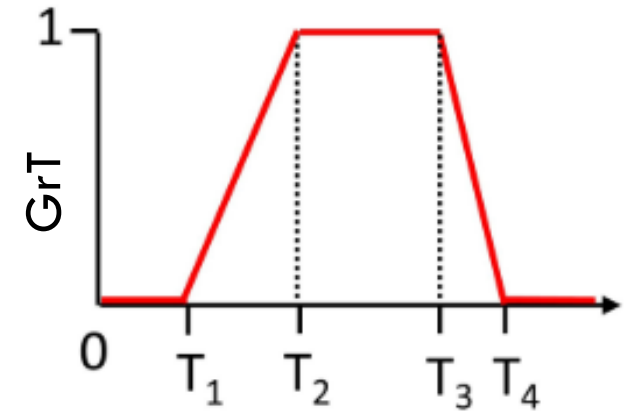
Process representation of conifer tree-ring growth is improved by incorporation of climate memory effects

Xiaomin ZENG^{a,*}, Michael N. EVANS^b, Xiaohong LIU^{a,c,*}, Drew M.P. PELTIER^d, Simin ZHAN^e, Ping NI^a, Yao LI^a, Lingnan ZHANG^a, Bao YANG^f

MODEL MODIFICATIONS (1)

More complexity in response functions

- Declining partial growth rates for too high temperatures and too high soil moisture
- New parameters T_3 , T_4 , M_3 , M_4
- New types of limitation
 - Low temperature – **High temperature**
 - Drought – **Soil water oversaturation** (wetlands!!!)



$$GrT = \begin{cases} 0 & \text{if } T \leq T_1 \\ (T - T_1)/(T_2 - T_1) & \text{if } T_1 < T \leq T_2 \\ 1 & \text{if } T_2 < T \leq T_3 \\ (T_4 - T)/(T_4 - T_3) & \text{if } T_3 < T \leq T_4 \\ 0 & \text{if } T_4 \leq T \end{cases}$$

MODEL MODIFICATIONS (2)

Integration based on interaction of temperature and soil moisture instead of Liebig's law

Original VS-Lite: $GrINT(m, y) = GrE(m) * \textcolor{red}{min}(GrT(m, y) ; GrM(m, y))$

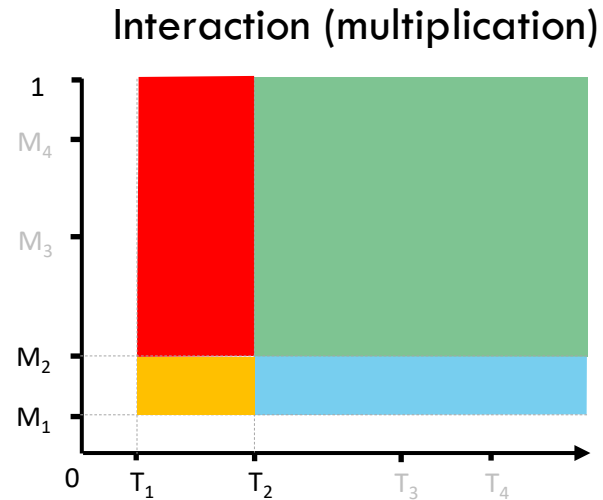
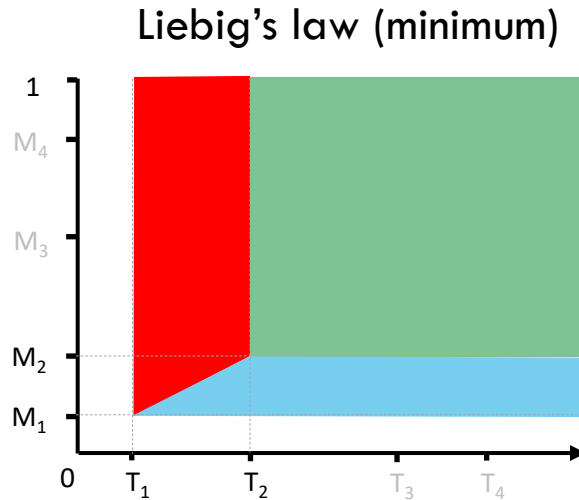
Modified VS-Lite: $GrINT(m, y) = GrE(m) * GrT(m, y) * \textcolor{red}{GrM}(m, y)$

New type of limitation

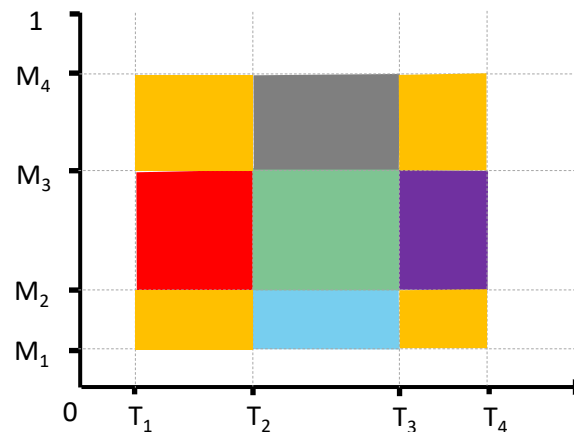
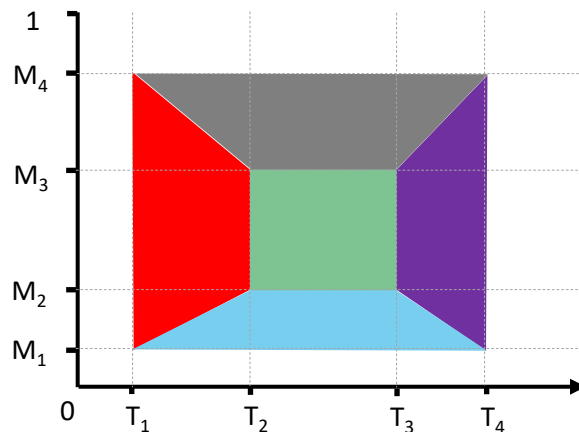
- **Mixed**

MODEL MODIFICATIONS (3)

Original
GrT and GrM definition



Modified
GrT and GrM definition



Limitations:

Cold

Warm

Dry

Wet

Mixed

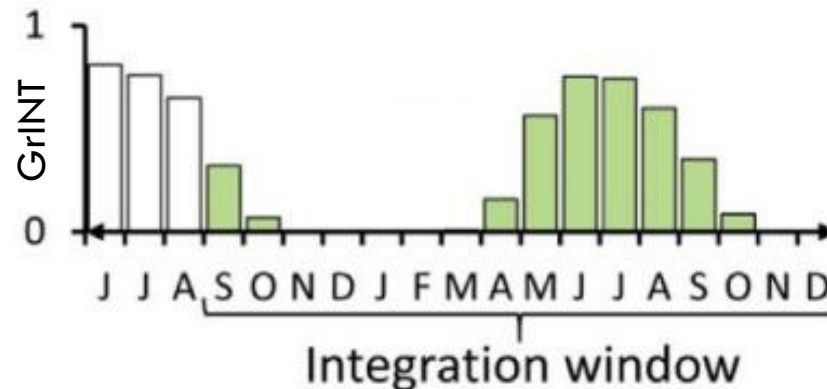
Optimal growth

MODEL MODIFICATIONS (4)

Weighting previous year integral growth rates in proxy of annual tree-ring width

Original: $TRW(y) \approx \sum_{Jan}^{Dec} GrINT(m, y) + \mathbf{1} * \sum_{I_0}^{Dec} GrINT(m, y - 1)$

Modified: $TRW(y) \approx \sum_{Jan}^{Dec} GrINT(m, y) + \mathbf{Acor} * \sum_{I_0}^{Dec} GrINT(m, y - 1)$



MODEL PARAMETERS – HOW TO DETERMINE THEM?

Parameters of response functions

- T1, T2, (T3), (T4)
- M1, M2, (M3), (M4)

Parameters related to autocorrelation component

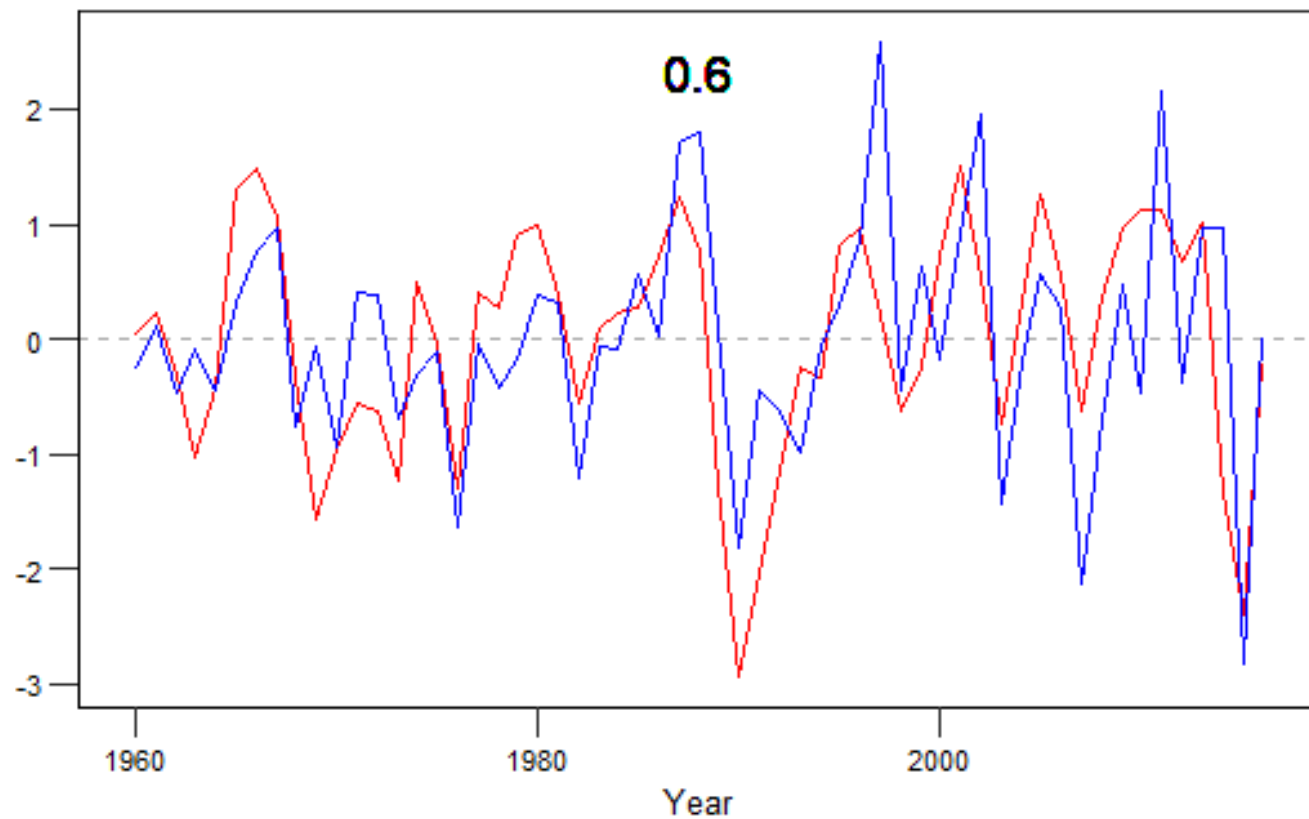
- I_0, Acor

Parameters of soil moisture model

1. Fixed value - estimate
2. Calibration against site chronology and, if possible ...
 - Dendrometers, xylogenesis, (NDVI)
 - Soil moisture level
 - ...

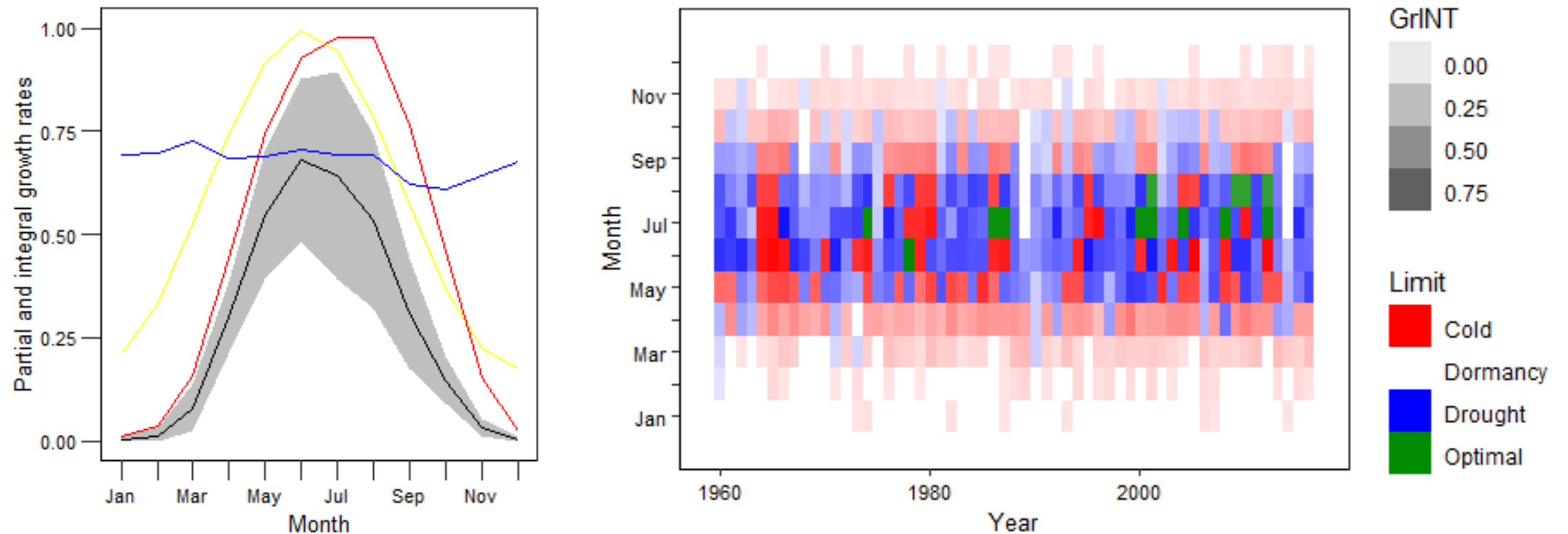
RESULTS (1)

Simulated and observed chronologies



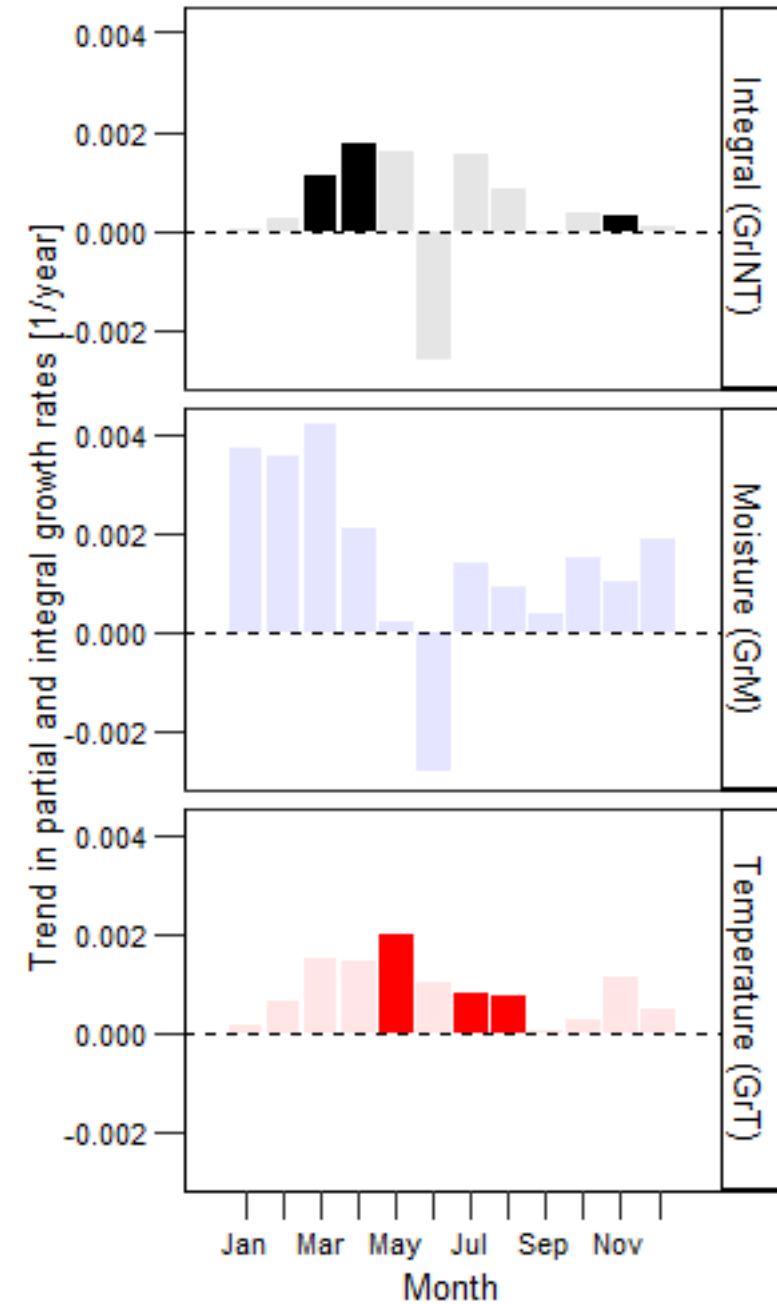
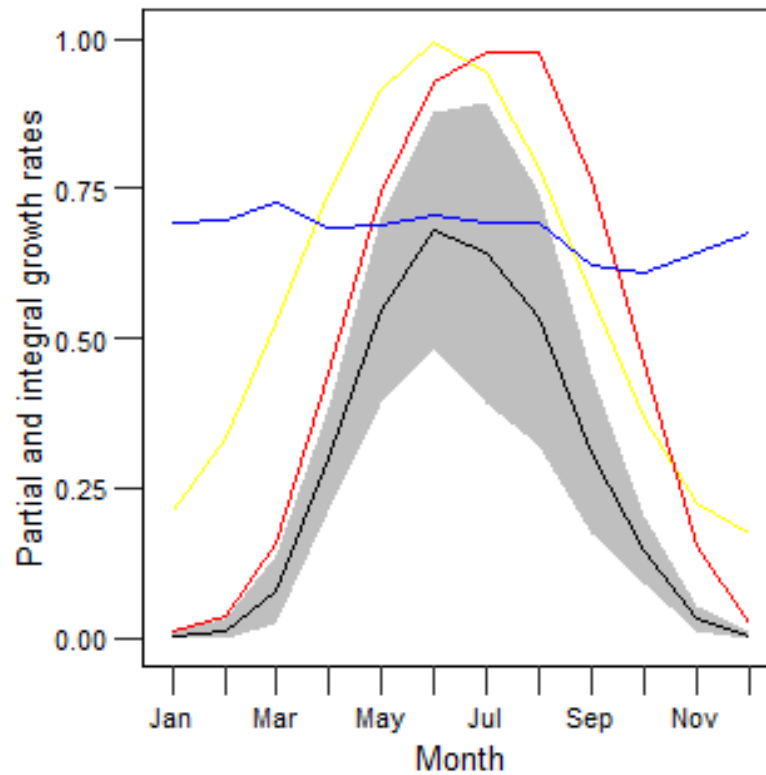
RESULTS (2)

Intra/inter-annual variation of partial and integral growth rates



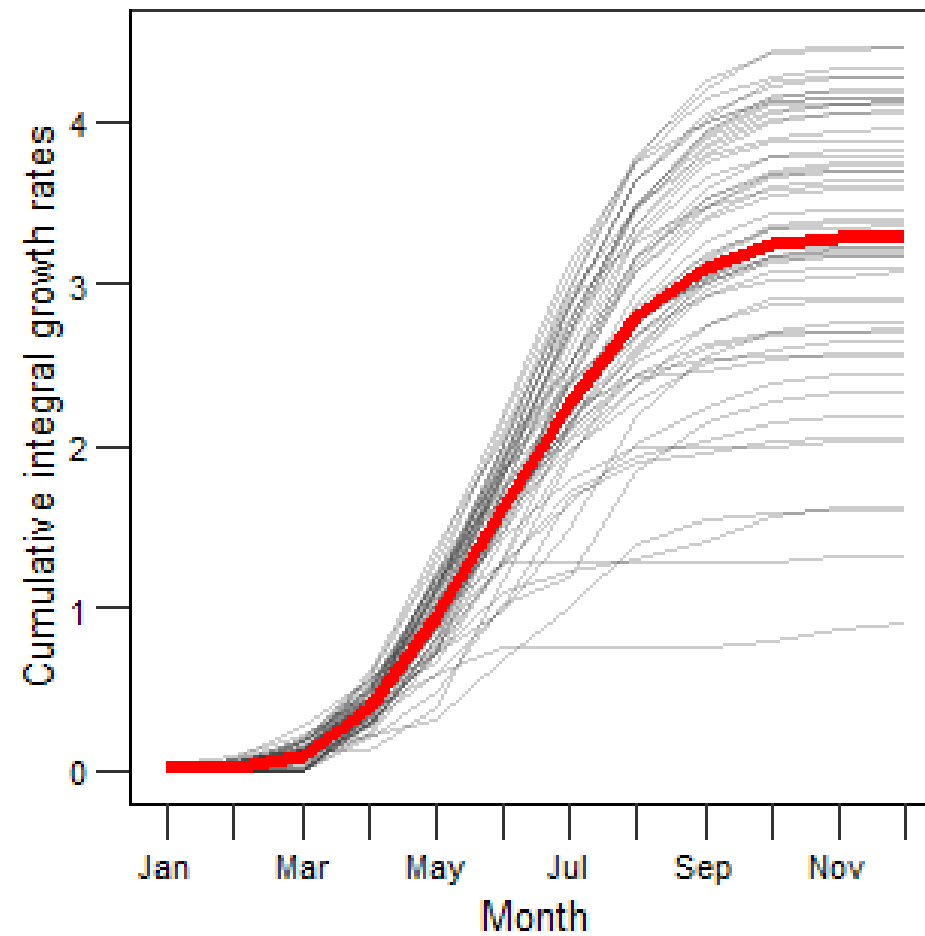
RESULTS (3)

Temporal changes of partial and integral growth rates



RESULTS (4)

Phenology



Thank you for your attention

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