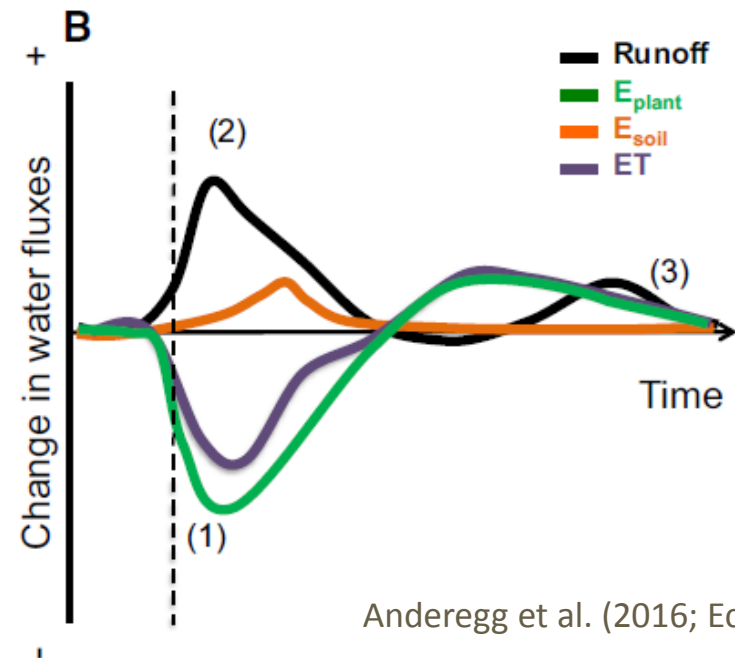
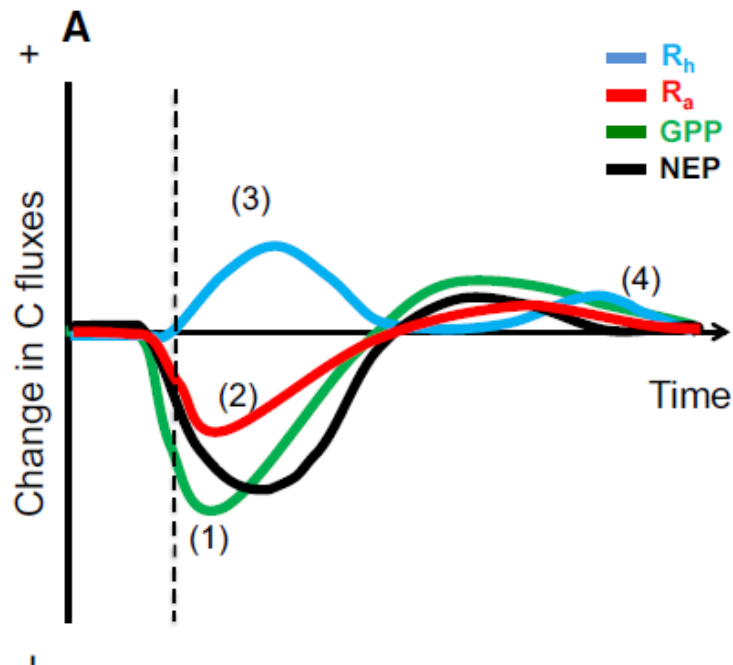


# Can we predict tree death based on its radial growth ?

**M. Cailleret**, C. Bigler, N. Bircher, H. Bugmann,  
P. Brang, V. Dakos, F. Hartig, L. Hülsmann, S. Jansen,  
J. Martinez-Vilalta, M. Vanoni, and many others...

# Why should we study tree mortality ?

1. Tree mortality affects ecosystem functions, structure, and composition

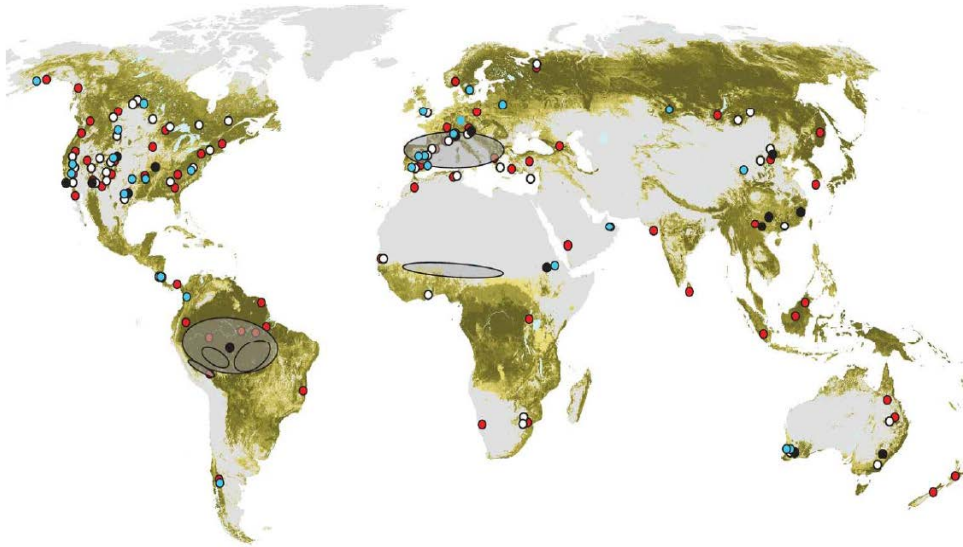


Anderegg et al. (2016; Ecosystems)

# Why should we study tree mortality ?

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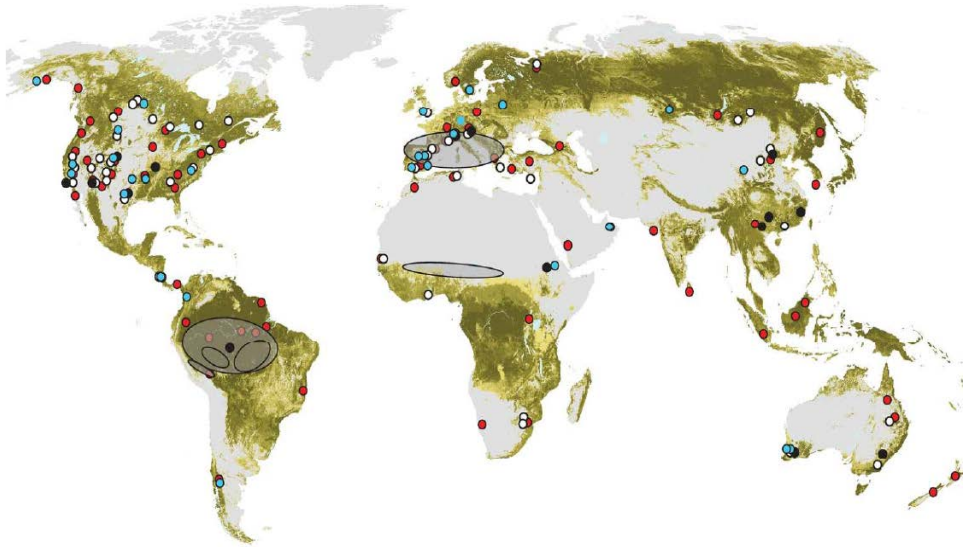
2. Increase in the number of drought-induced mortality events worldwide



Allen et al. (2010; For. Ecol. Manage.)  
Hartmann et al. (2018; New Phytol.)

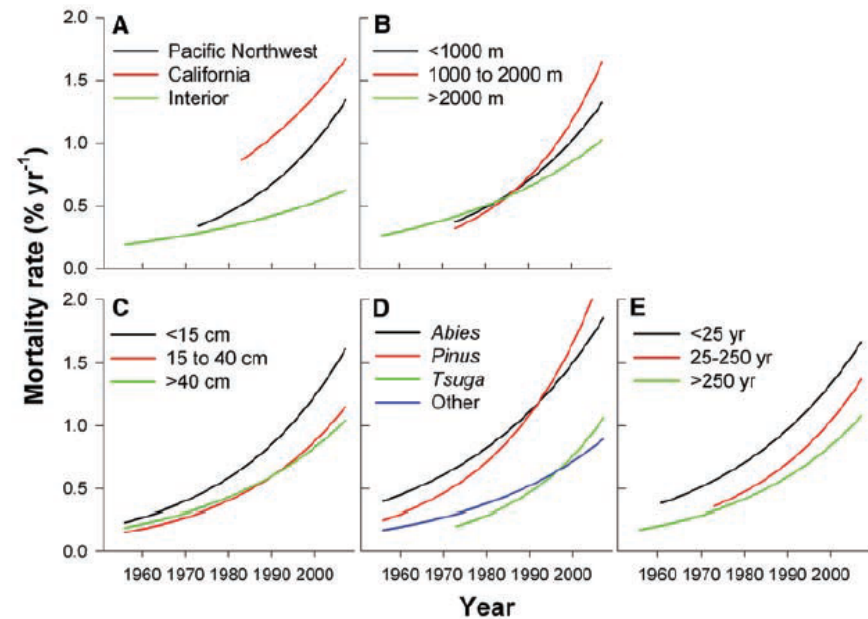
# Why should we study tree mortality ?

2. Increase in the number of drought-induced mortality events worldwide



Allen et al. (2010; For. Ecol. Manage.)  
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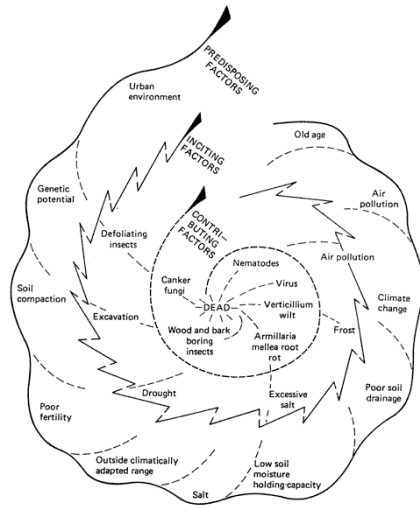
Increase in «background mortality» rates



Van Mantgem et al. (2009; Science)

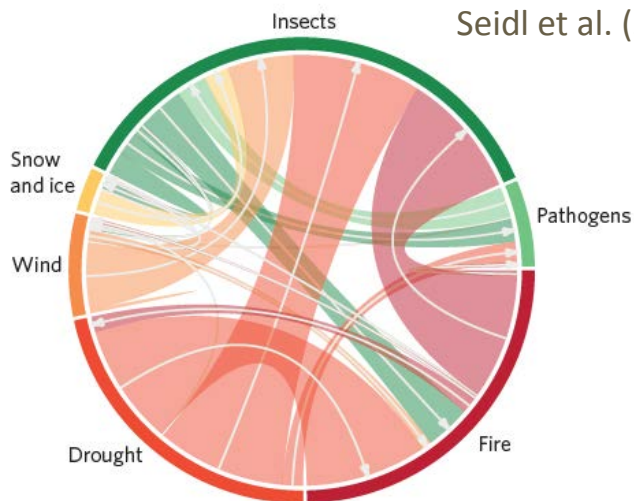
# Why should we study tree mortality ?

## 3. Limited understanding: interactions among mortality factors



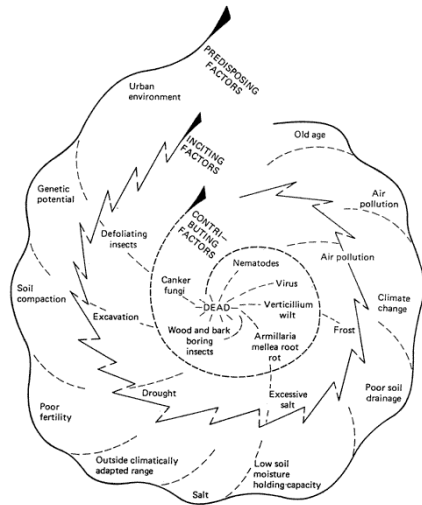
Manion (1991)

Seidl et al. (2017; NCC)



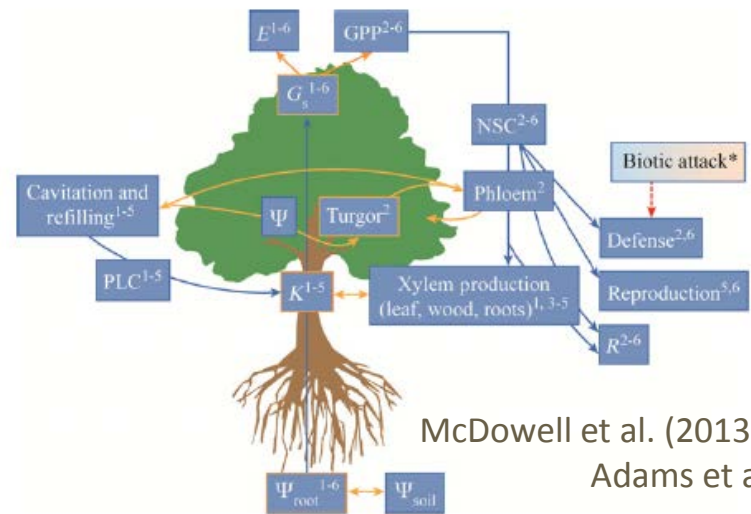
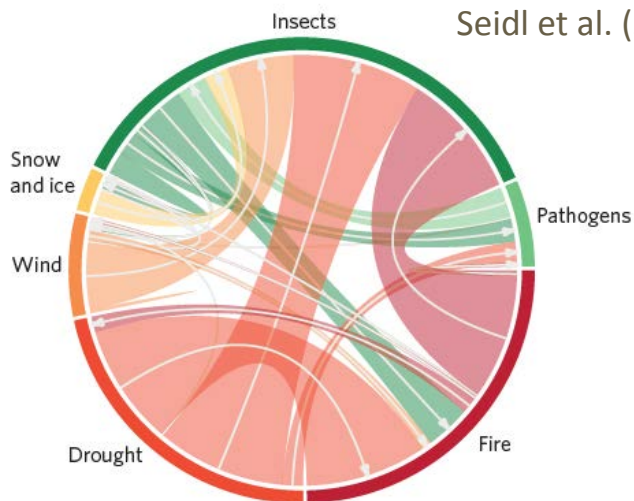
# Why should we study tree mortality ?

## 3. Limited understanding: interactions among mortality factors and among physiological processes



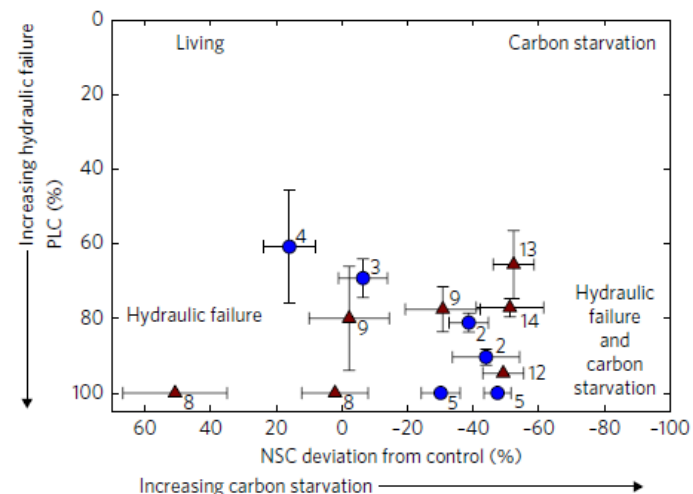
Manion (1991)

Seidl et al. (2017; NCC)



McDowell et al. (2013; New Phytol.)

Adams et al. (2017; NEE)

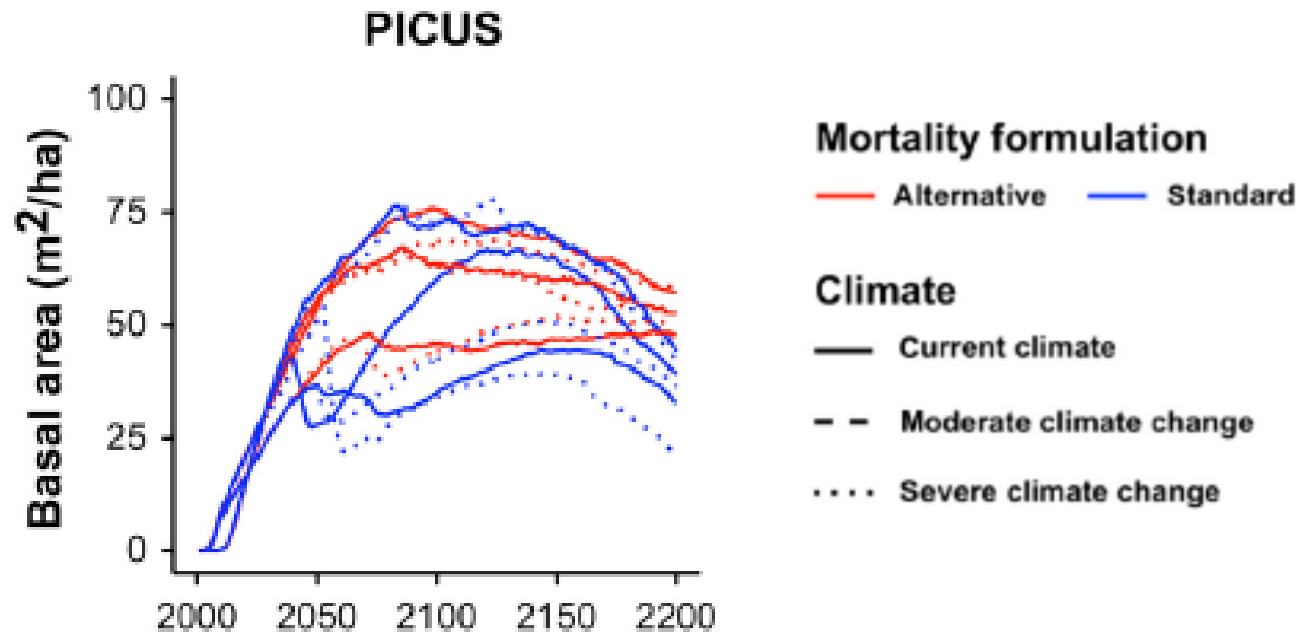




# Why should we study tree mortality ?

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4. Dynamic vegetation models poorly simulate tree mortality (e.g., constant % of the biomass in some biome models), but are highly sensitive to mortality functions

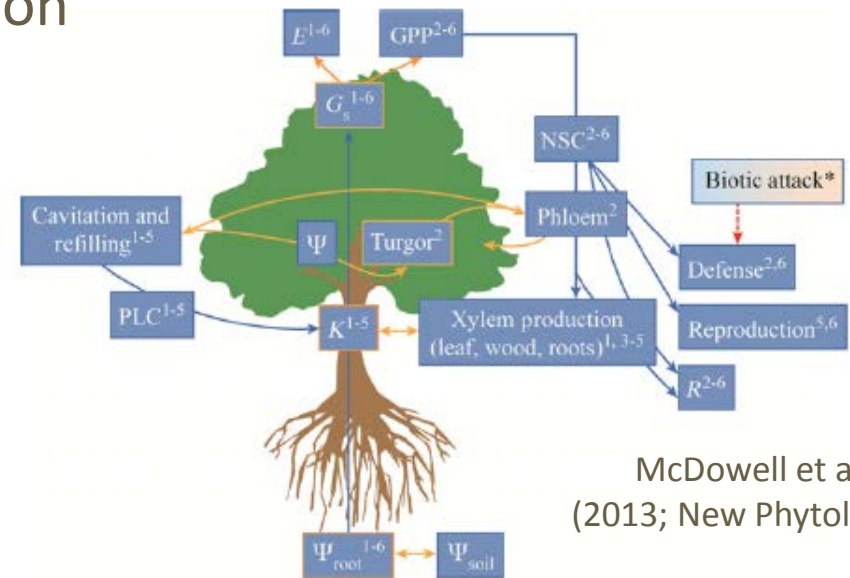


# Approaches to predict stress-induced tree mortality

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Empirical approach: only dependent on environmental conditions

Mechanistic approach: based on physiological processes



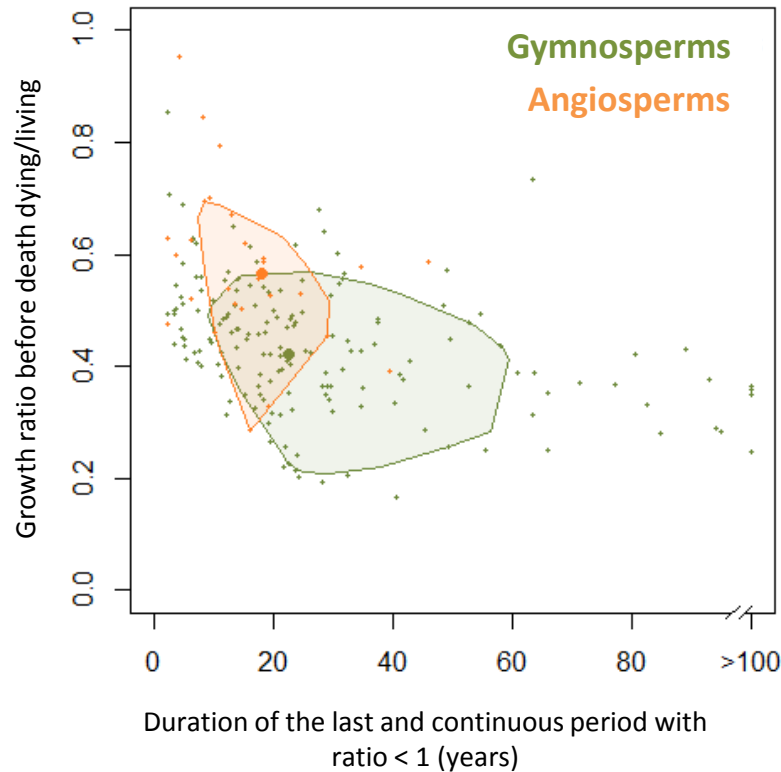
McDowell et al.  
(2013; New Phytol.)

Semi-empirical approach based on tree growth





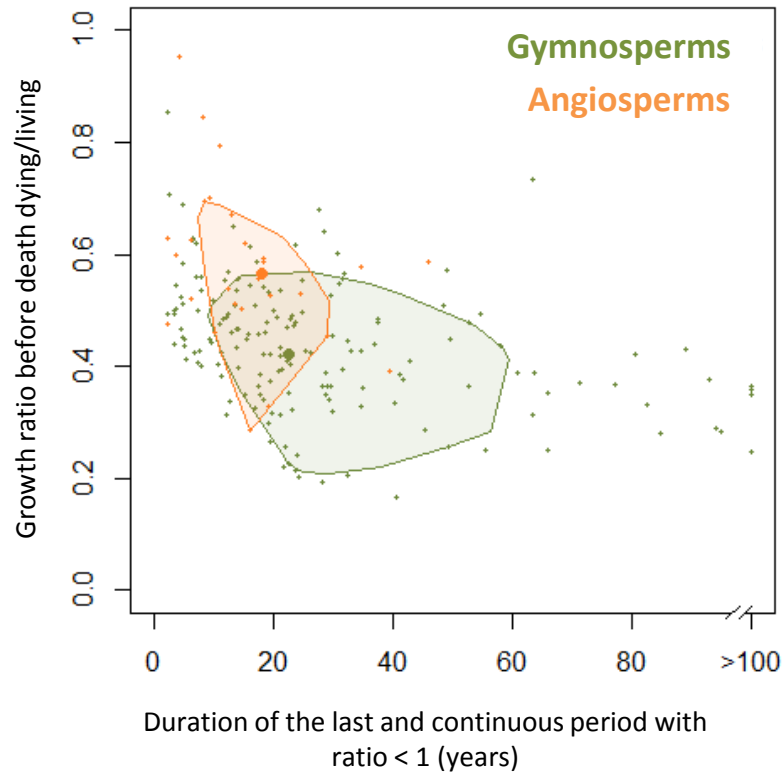
# Global synthesis of the ring-width patterns before death



Decrease in growth before tree death in 85% of the mortality events (190 sites)

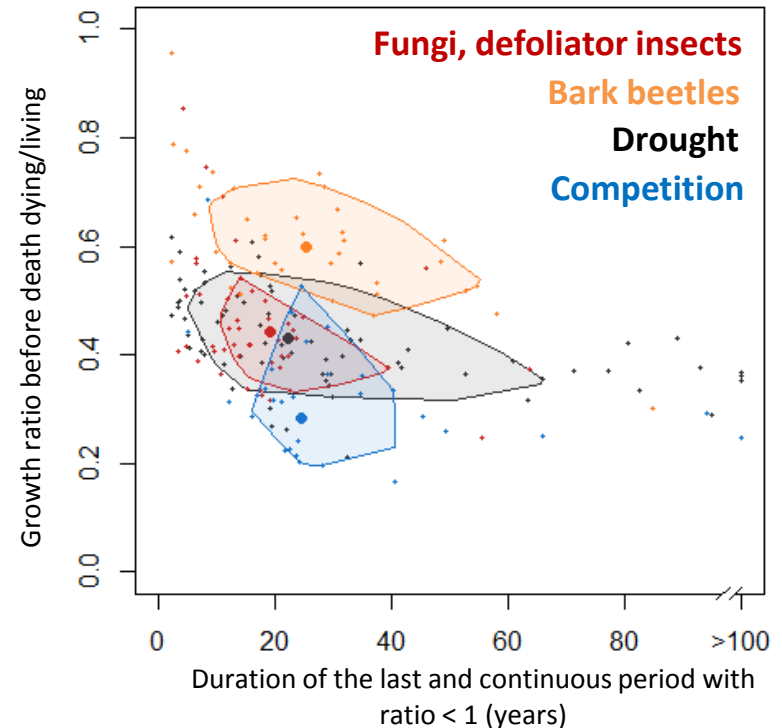
Effective for gymnosperms

# Global synthesis of the ring-width patterns before death



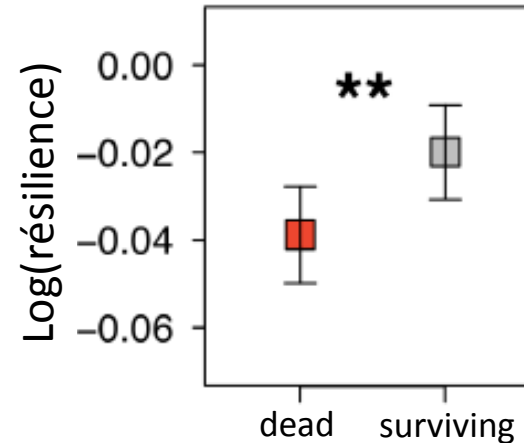
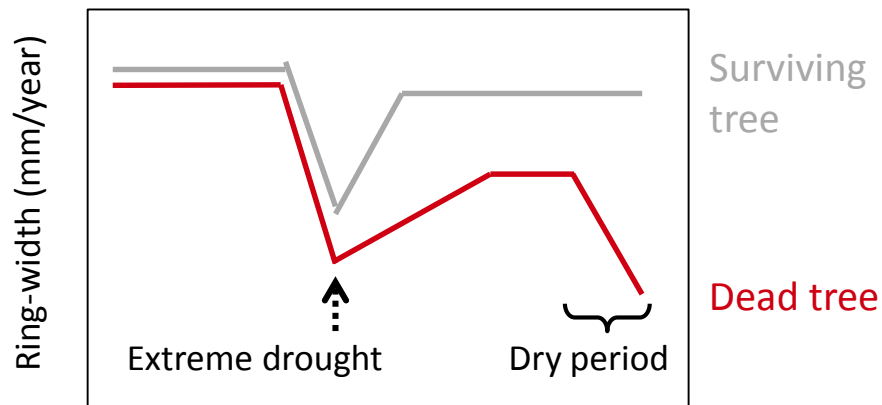
Effective for gymnosperms, but less so for angiosperms and in case of bark beetle attack

Decrease in growth before tree death in 85% of the mortality events (190 sites)



**YES ! BUT...**

# Global synthesis of the ring-width patterns before death



Trees that died during a dry period were less resilient to previous extreme drought events than surviving ones.

# A dynamic vegetation modeling perspective with ForClim

## 1. Based in expert knowledge (Solomon 1986; Oecologia)

$$P_{\text{mort}} = \text{fn} (\text{age}_{\text{tree}} / \text{age}_{\text{max,species}}, \text{RW of the last 3 years})$$

In ForClim v3



Model development for 18 tree species in Europe

## 2. Empirical model based on forest inventory data

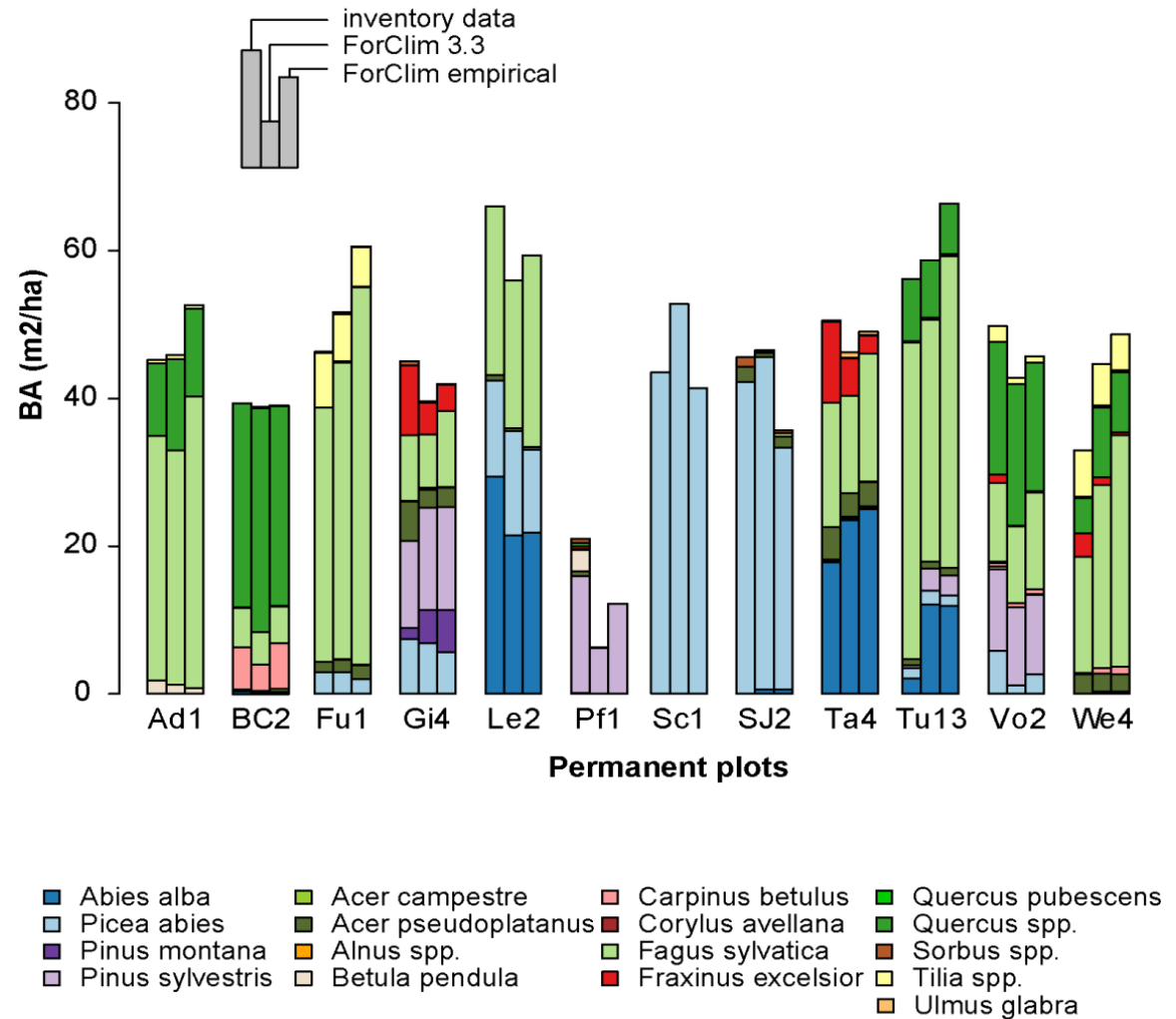
$$P_{\text{mort}} = \text{fn} (\text{DBH, relative growth over the last 7-10 years, stand density, climate})$$

Calibration: 54 forest reserves in Switzerland and Germany



# Empirical model based on forest inventory data

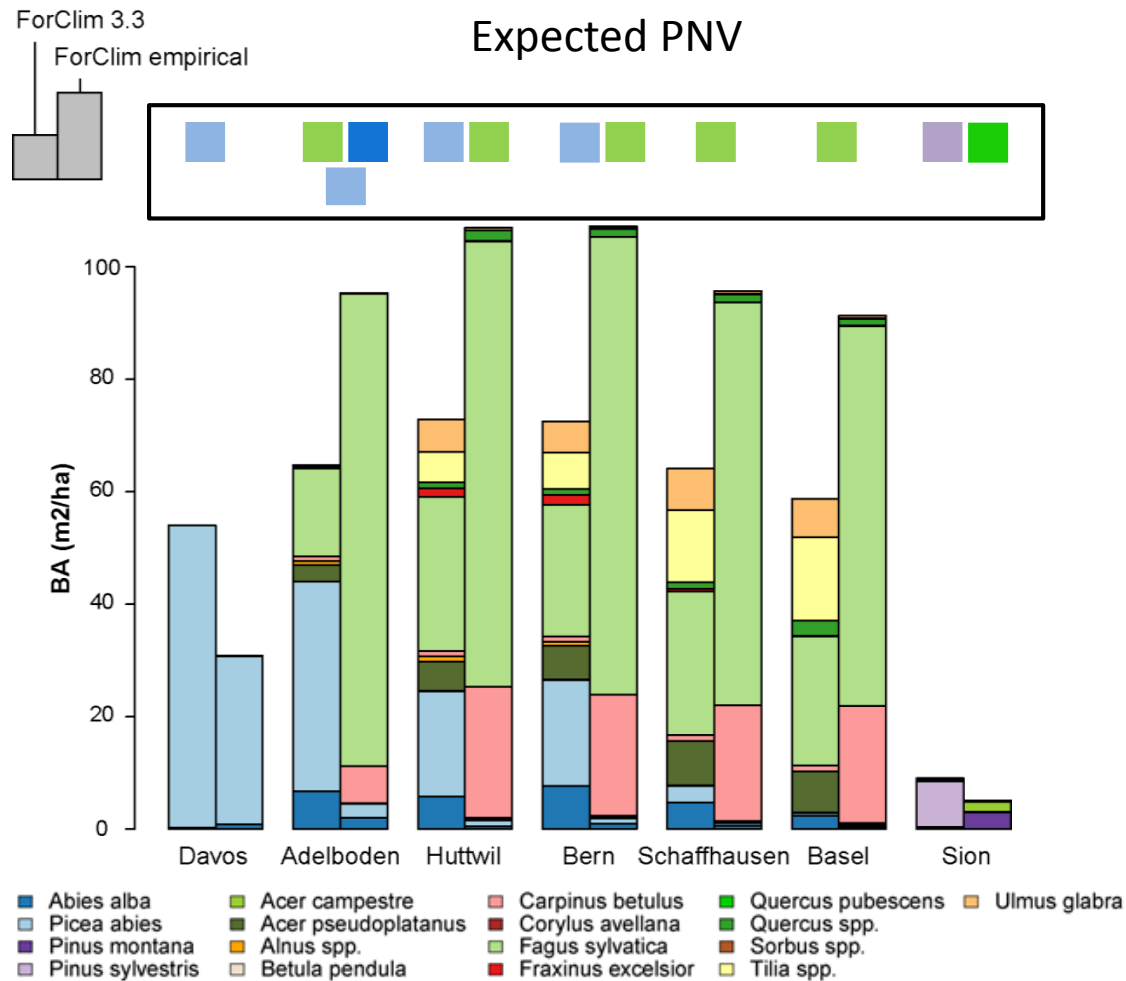
**Validation 1:** Historical short-term (30-50 ys) simulations



# Empirical model based on forest inventory data

**Validation 2:** Long-term (1500 ys) simulations: Potential Natural Vegetation along a „Swiss Environ. Gradient“

The inventory-based mortality model does not kill enough beech trees -> annual resolution?



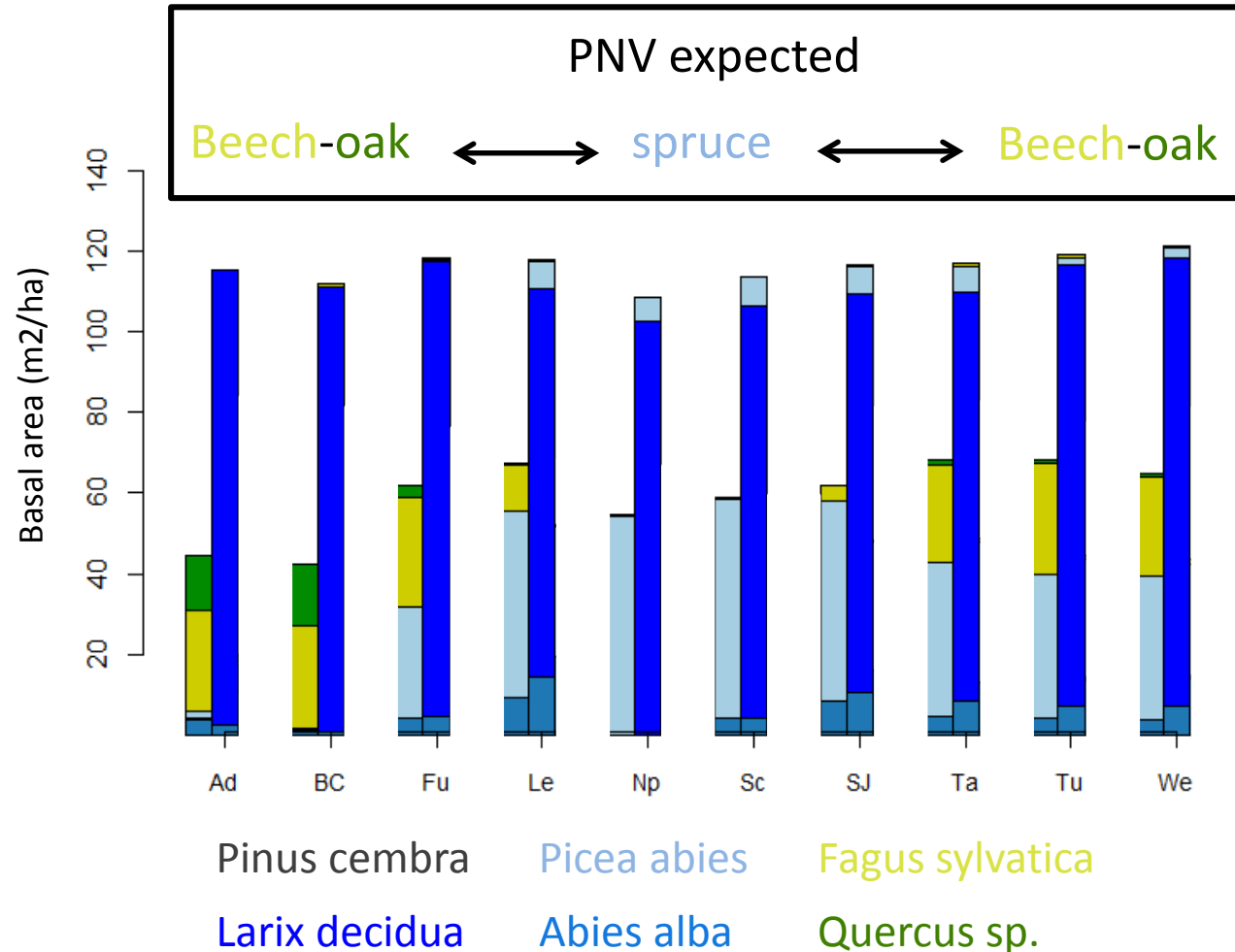


# Empirical model based on inventory and ring-width data

**Calibration data:**  
12 forest reserves in  
Switzerland  
6 species

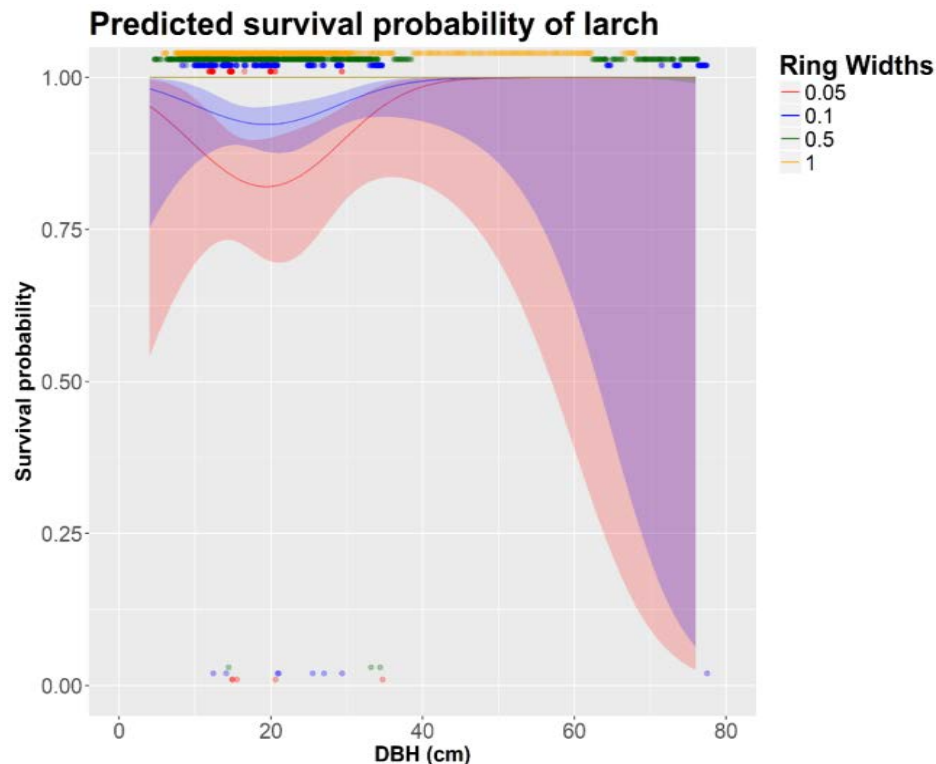
**Validation 1:** Historical  
short-term (30-50 ys)  
simulations **OK!**

**Validation 2:** Long-  
term (1500 ys)  
simulations: Potential  
Natural Vegetation



# Empirical model based on inventory and ring-width data

Overestimation of larch because of the scarce information for large trees (only one dead tree at DBH >40cm)



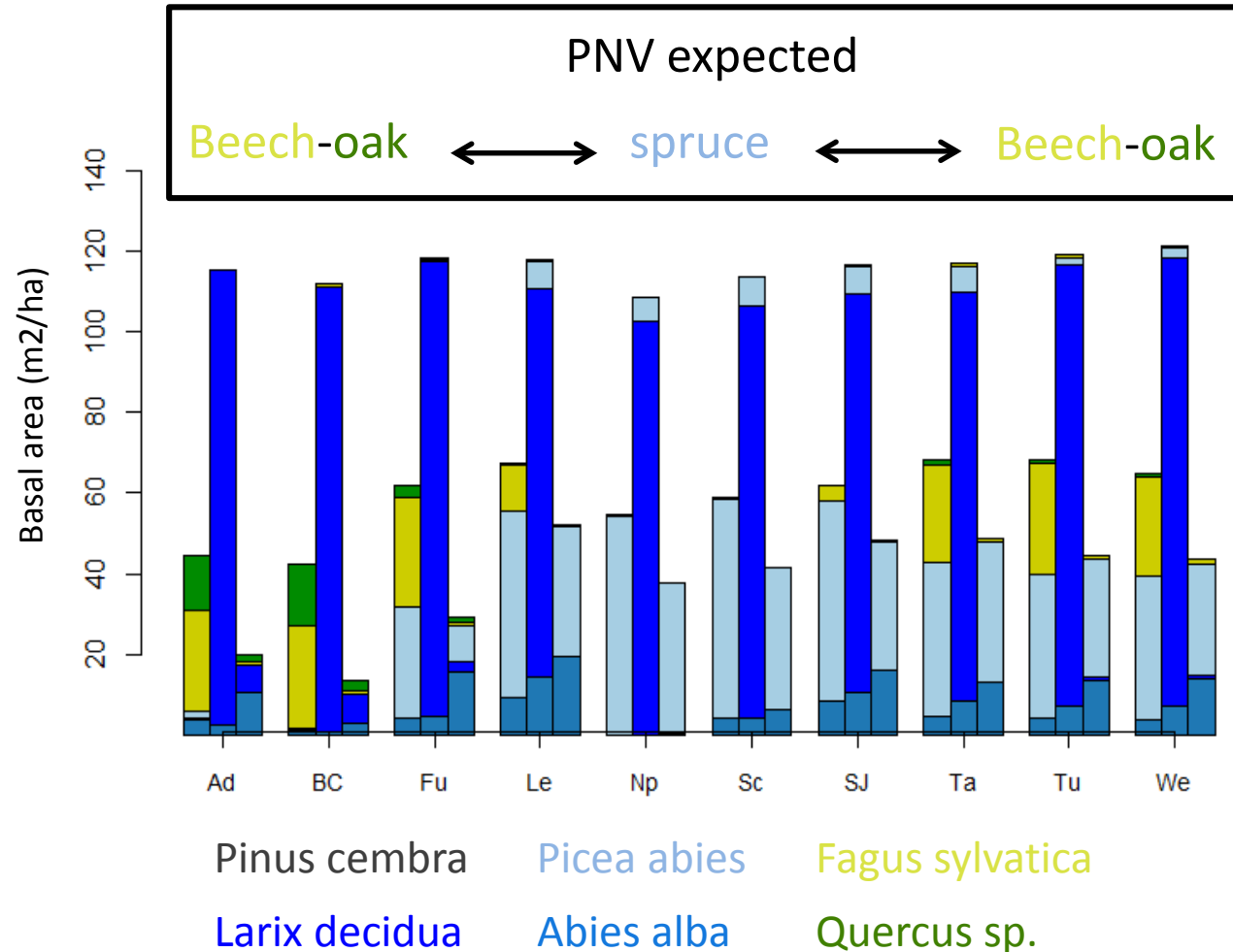
- Larch trees become almost immortal
- Version considering variability/uncertainty in the parameters of the mortality models

# Empirical model based on inventory and ring-width data

**Calibration data:**  
12 forest reserves in  
Switzerland  
6 species - 528 trees

**Validation 1:** Historical  
short-term (30-50 ys)  
simulations **OK!**

**Validation 2:** Long-  
term (1500 ys)  
simulations: Potential  
Natural Vegetation



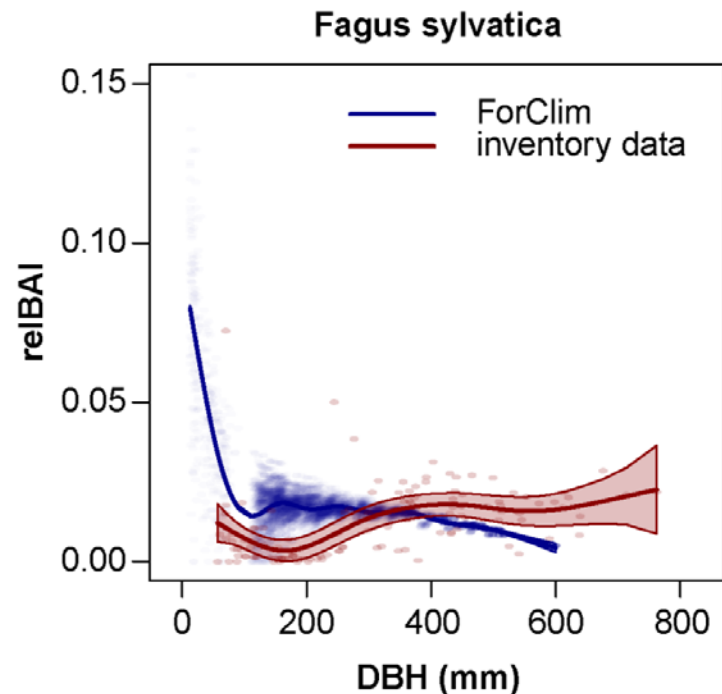
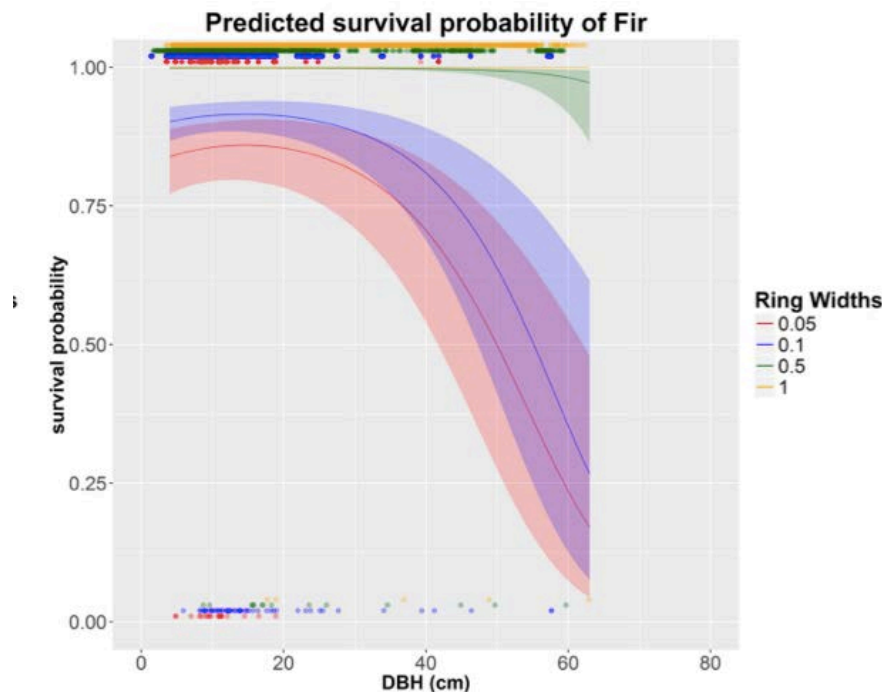
# Insights from these modelling exercises

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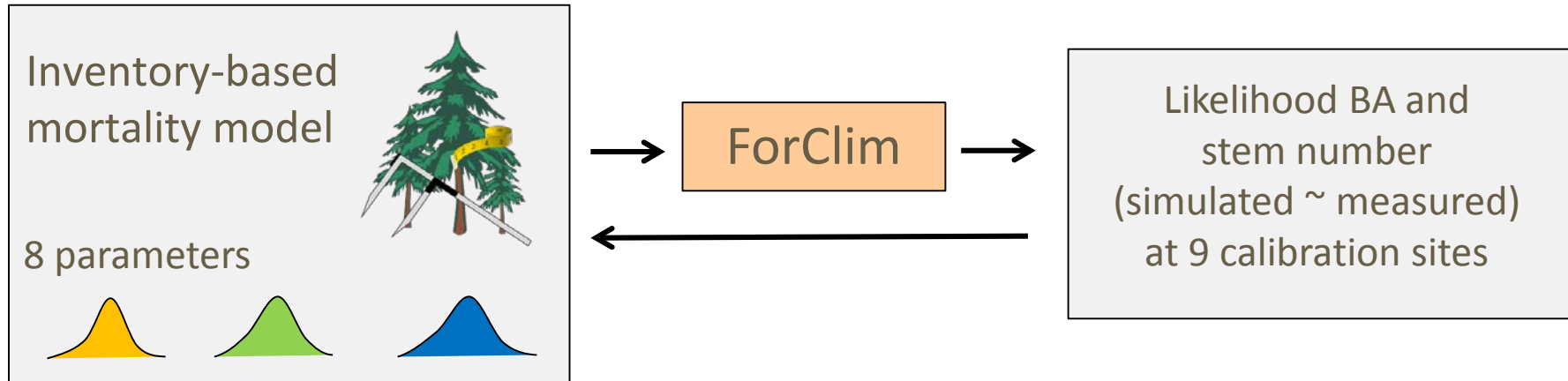
Problems in the calibration dataset: no data for small trees (calliper limit) and for very big trees (reserves  $\neq$  primary forests) -> extrapolation issue

Parameters may not be adequate for an implementation into ForClim because growth may not be accurately simulated

Potential solution -> inverse calibration of the mortality model



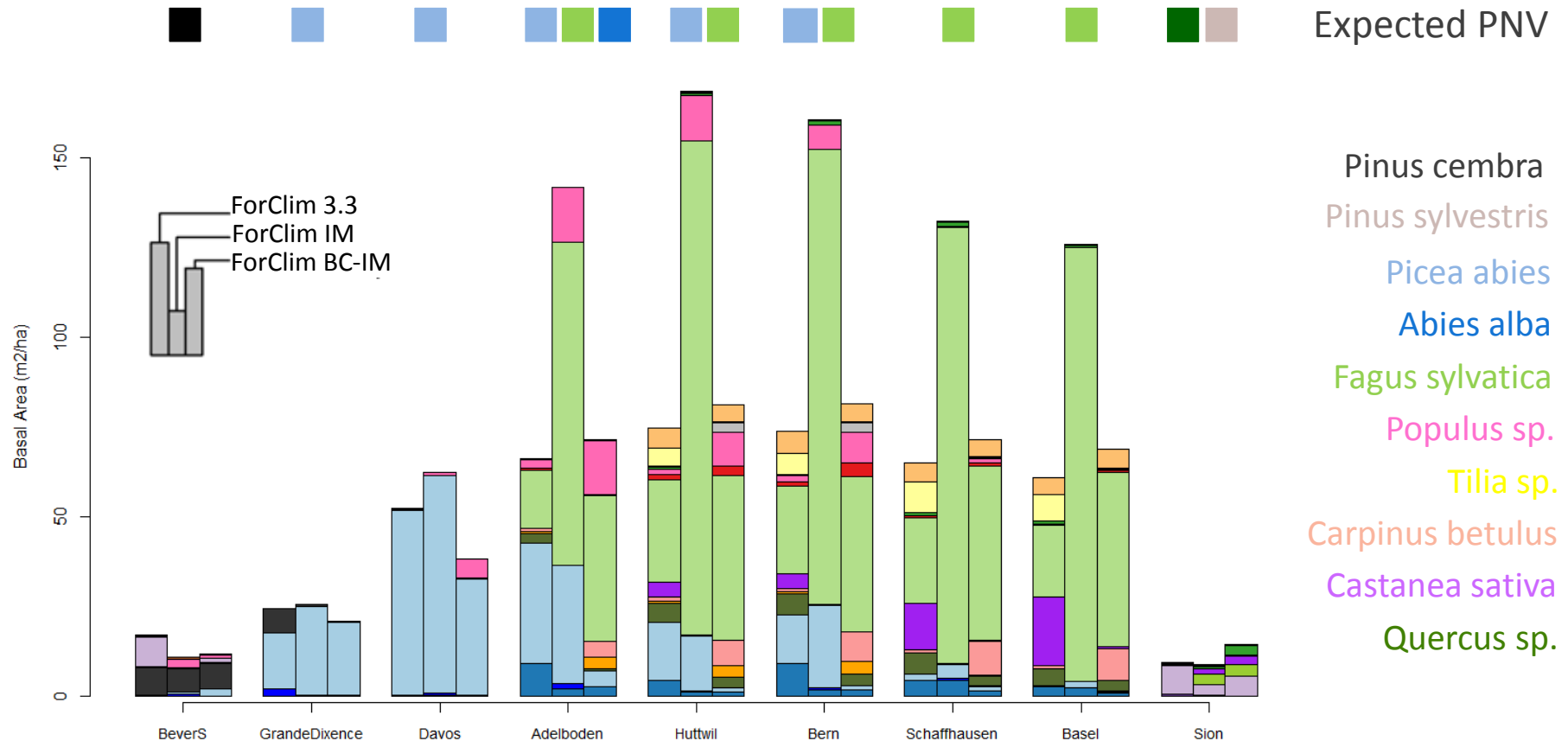
# Bayesian calibration of an inventory-based model in ForClim



<b>Validation 1:</b> Historical short-term (30-50 ys) simulations		Stem numbers			Basal area increment		
		<b>3.3</b>	<b>IM</b>	<b>BC-IM</b>	<b>3.3</b>	<b>IM</b>	<b>BC-IM</b>
Number of sites with best performance	Calibration	0	1	8	2	4	3
	Validation	2	8	11	9	4	8

# Bayesian calibration of a multi-species IM into ForClim

## Validation 2: Plausibility of the long-term projections (PNV)



Beech is not overestimated anymore, but pb with spruce and poplar



# Conclusions – Perspectives

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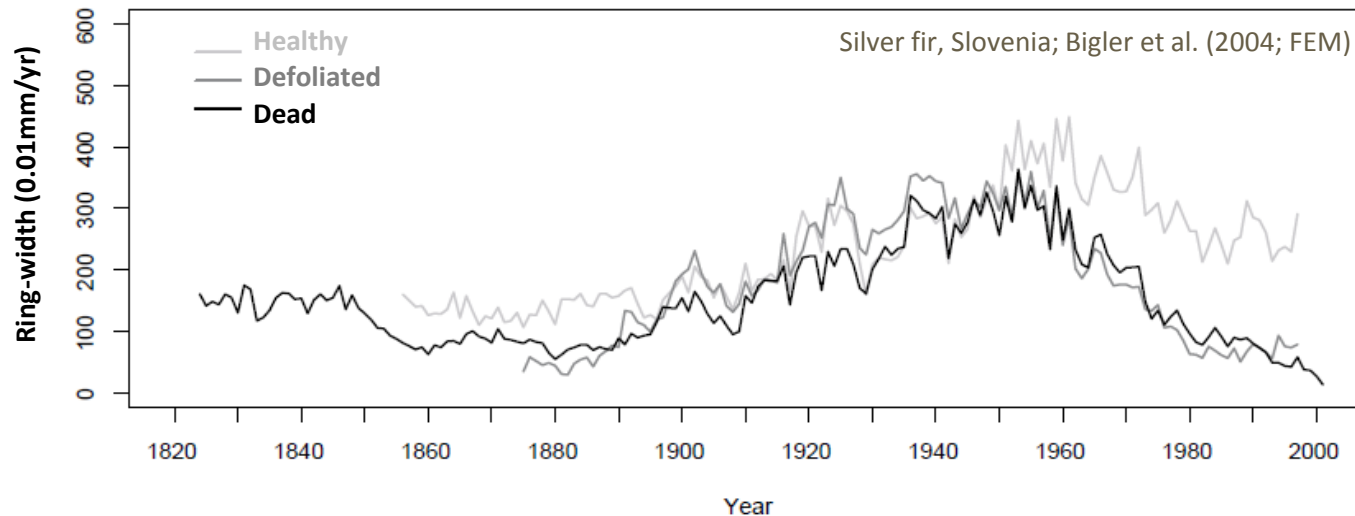
- Change in growth patterns is a good – but not perfect – indicator of mortality probability, especially for gymnosperms and in case of long-term stress
- The ,old‘ theoretical model is not so bad :-) :-(
- Making mortality models more empirical doesn't do the job, mainly because of the lack of data for small and big trees
- Bayesian approach can be a solution but can be problematic for model development: if the parameter values do not make sense, we can get good results for the wrong reasons

# Can we predict tree death based on its radial growth ?

**M. Cailleret**, C. Bigler, N. Bircher, H. Bugmann,  
P. Brang, V. Dakos, F. Hartig, L. Hülsmann, S. Jansen,  
J. Martinez-Vilalta, M. Vanoni, and many others...



# Interests of the growth-based approach



Radial growth is related to tree productivity and crown defoliation

Individual resolution; multi-annual to annual resolution

Long-term (last 20 years -> tree lifespan)

Sampling substantial (although limited for tree-rings)

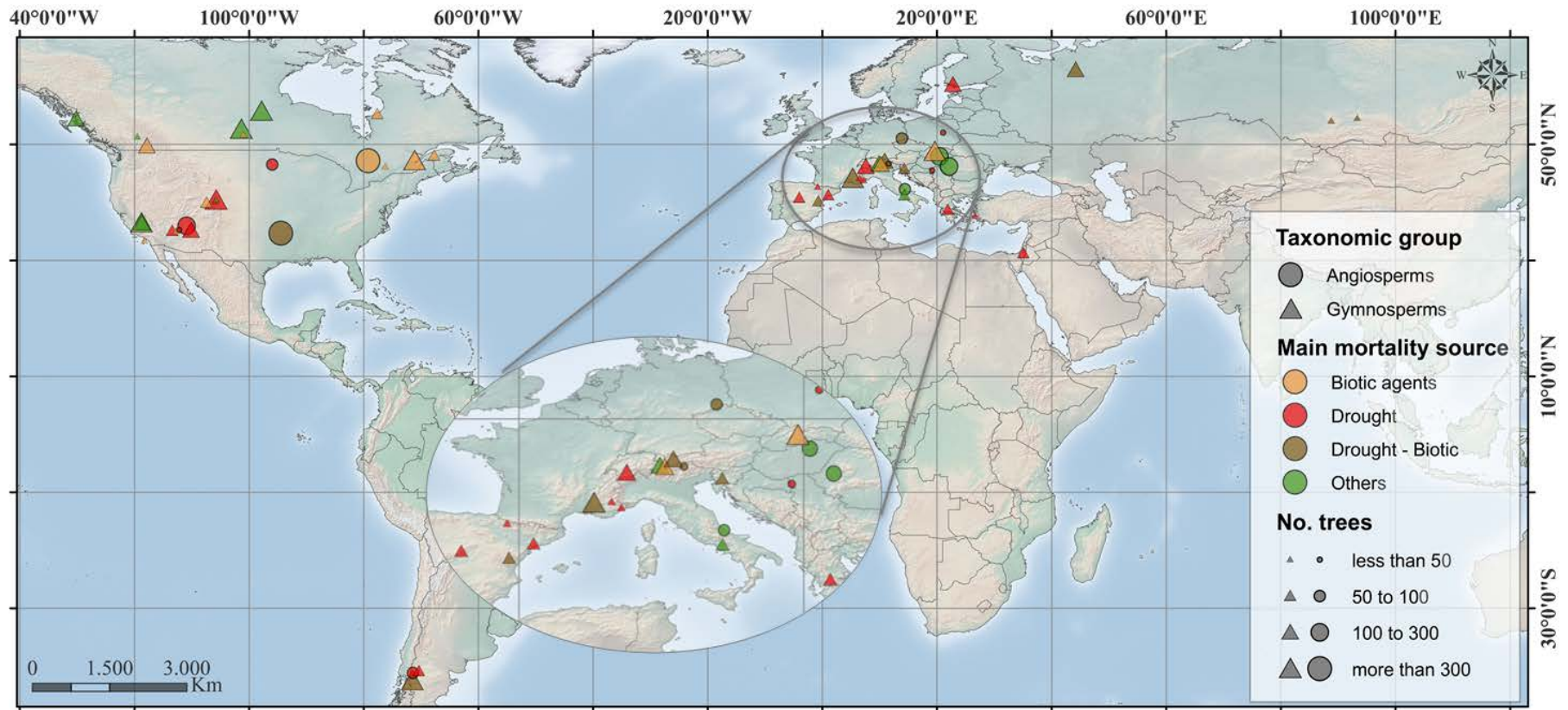
Biased estimation of the year of death?



Wood growth is also sink-driven

# Compilation of a new tree ring-width database

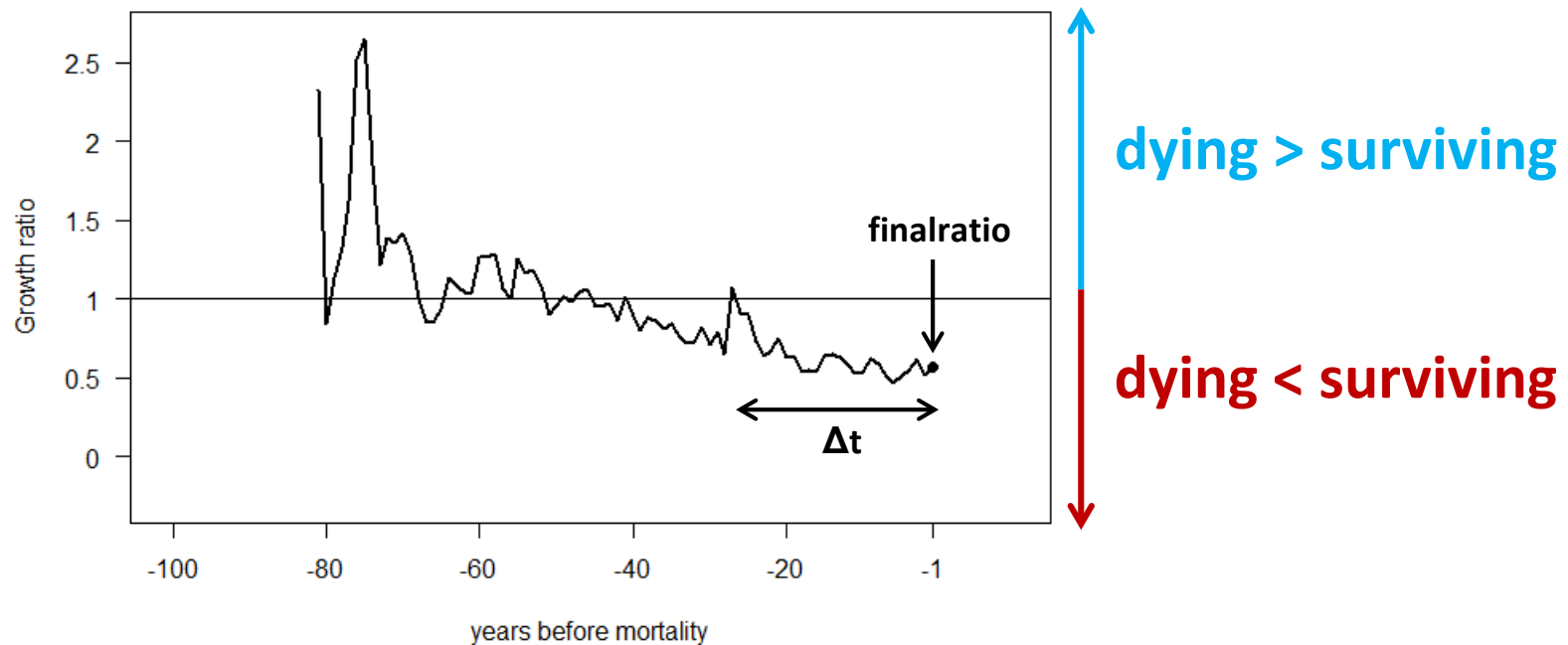
36 species | 196 sites | >8000 trees | >800'000 rings



# Analysis of the growth patterns before mortality

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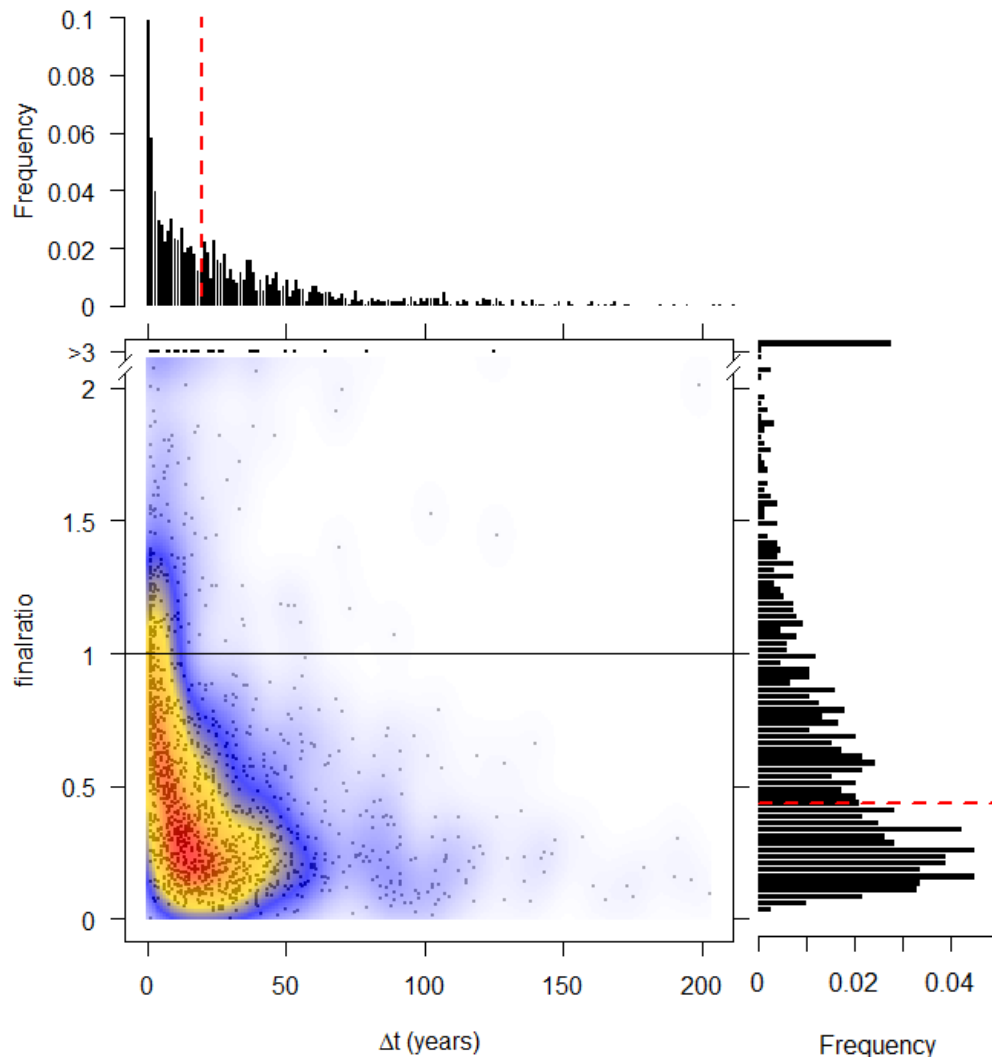
For each of the mortality events, we calculated the growth ratio between trees that died and trees that survived (with similar size)



- **finalratio**: growth ratio the year before mortality
- **$\Delta t$** : duration of the last and continuous period with ratio  $< 1$  (or  $> 1$ )



# Large variability in the growth patterns before mortality



Period with reduced growth  
( $\Delta t$ ) from 1 to 200 years

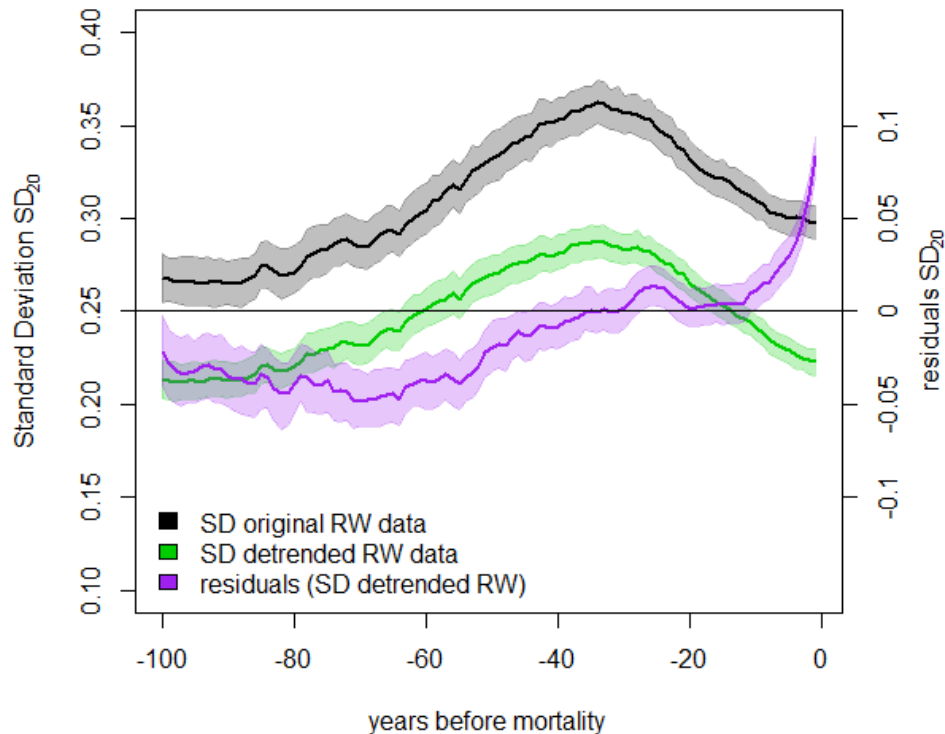
Median in  $\Delta t$  = 19 years

Dying trees had lower  
growth than living ones for  
85% of the mortality events

Median in finalratio = 40%

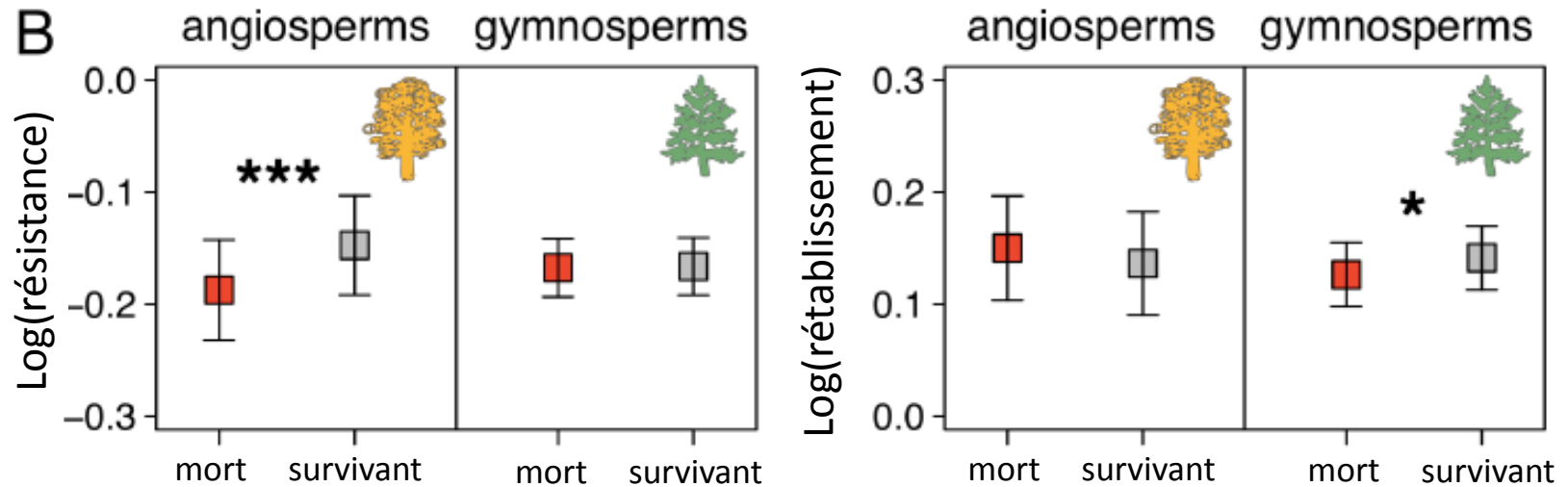
# Other changes in growth patterns before mortality

Change in SD in ring-width of dying trees (moving 20-y window) before their death



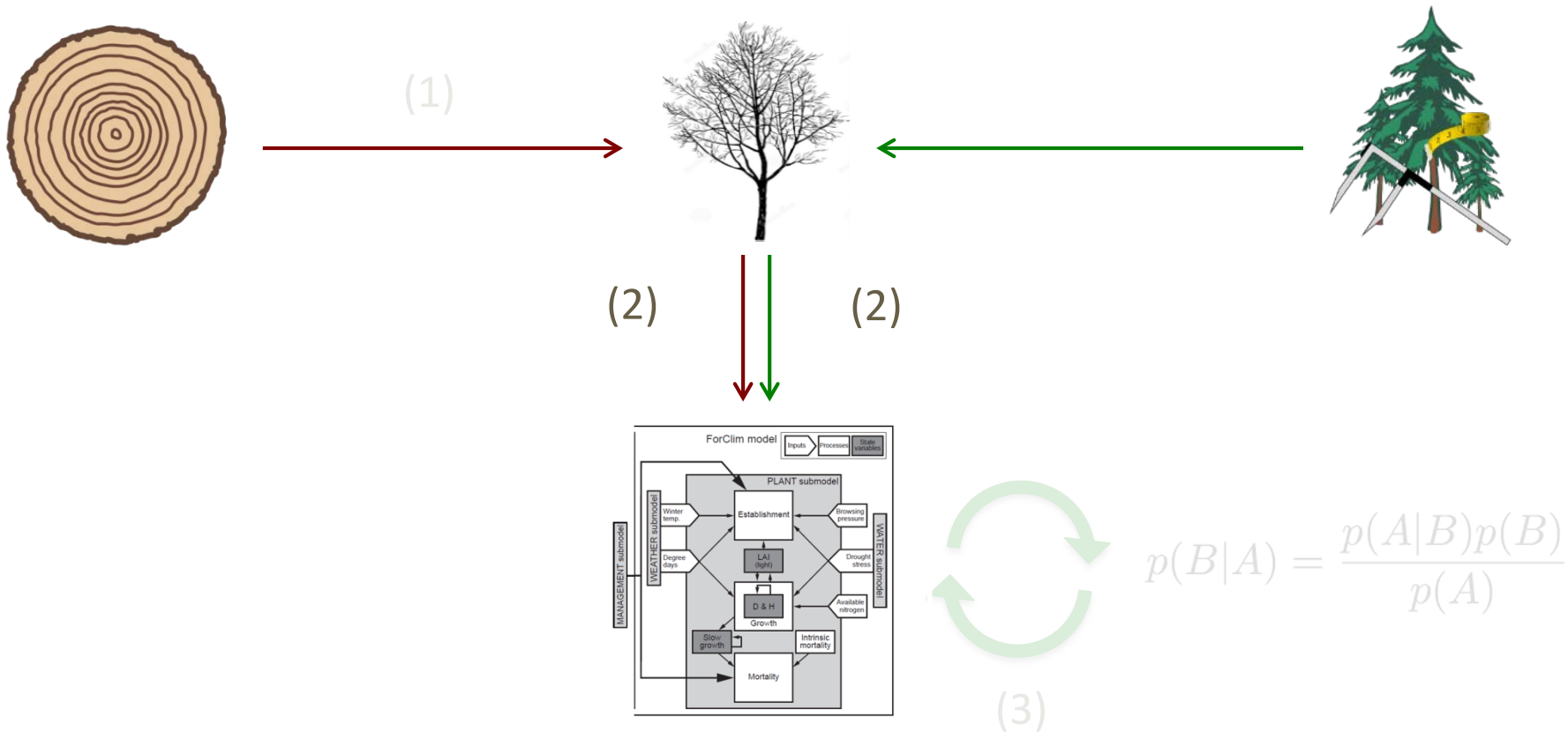
Increase in SD before tree mortality, no change for AR1

# Comparaison de la résilience d'arbres morts et survivants



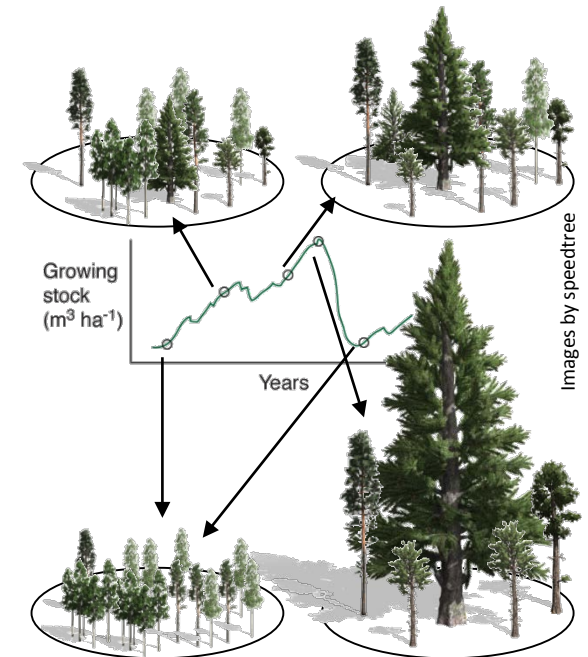
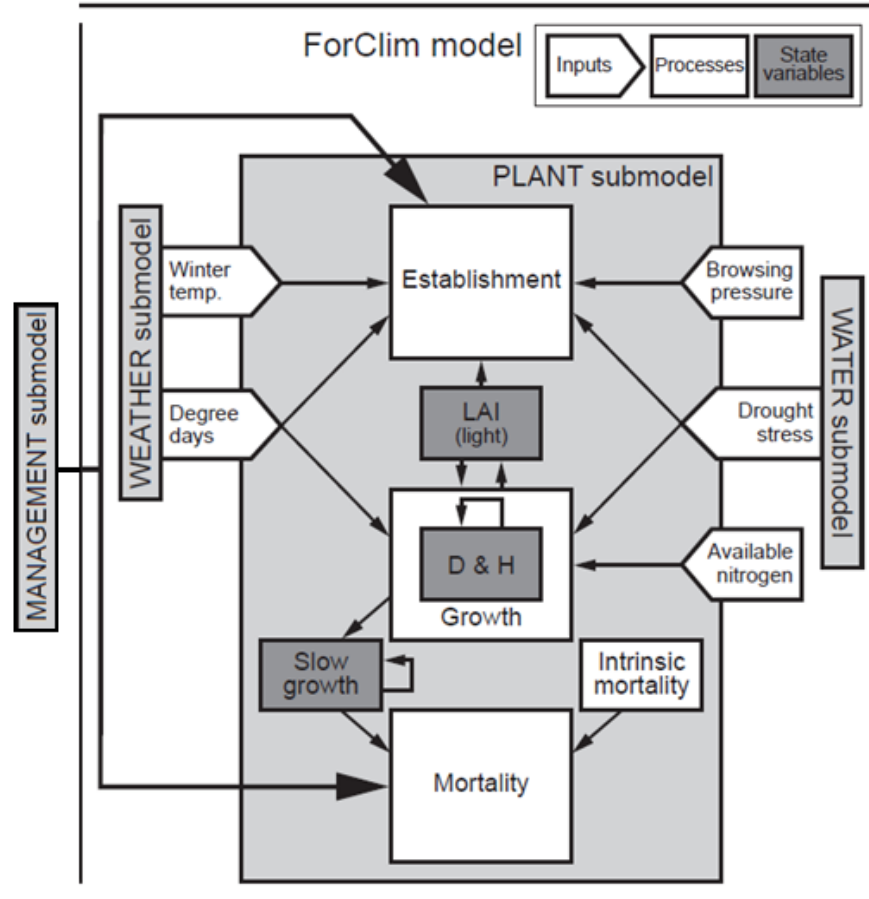
La résistance à la sécheresse et le rétablissement après sécheresse peuvent respectivement être utilisés comme indicateurs du risque de mortalité pour les angiospermes et les gymnospermes

# General empirical and modeling framework



(2) Implementation of tree-ring-based and inventory-based mortality models into ForClim

# The ForClim forest succession model



Bugmann (1996; Ecology)  
Rasche et al. (2012; Ecol. Model.)  
Mina et al. (2017; Reg. Env. Change)

**Output:** Stem number, basal area, biomass... for 30 tree species (in Europe)

# Comparison of different mortality models on spruce

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Theoretical | tree-ring based (TRM) | inventory-based (IM)

ForClim 3.0

---

$$P_{\text{mort}} = \text{fn}(\text{age}_{\text{max}}, \text{RW}_{t,t-1,t-2})$$



# Comparison of different mortality models on spruce

---

Theoretical | tree-ring based (TRM) | inventory-based (IM)

ForClim 3.0



$$P_{\text{mort}} = \text{fn}(\text{age}_{\text{max}}, \text{RW}_{t,t-1,t-2})$$

TRM\_Random



TRM\_threshold



$$P_{\text{mort}} = \text{fn}(\text{BAI}_3, \text{relBAI}, \text{locreg}_5)$$

IM\_Random



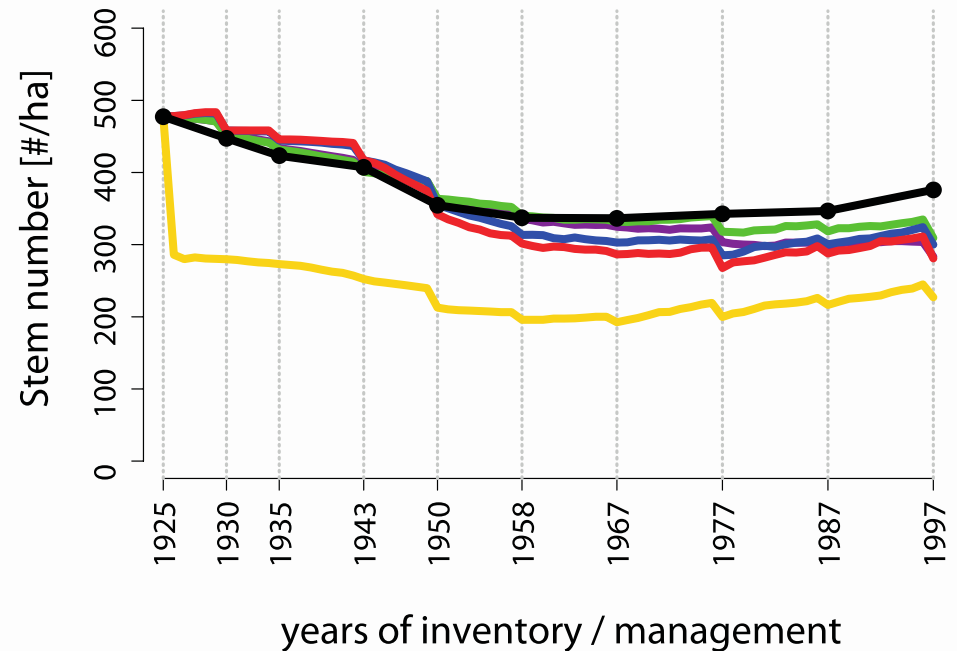
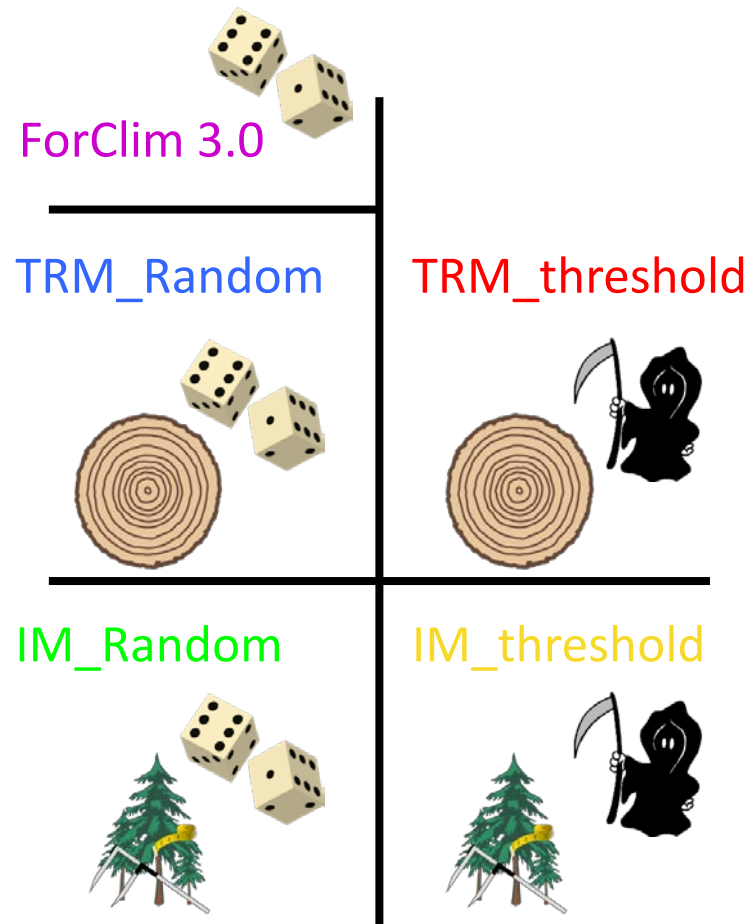
IM\_threshold



$$P_{\text{mort}} = \text{fn}(\text{DBH}, \text{relBAI}, \text{DD})$$

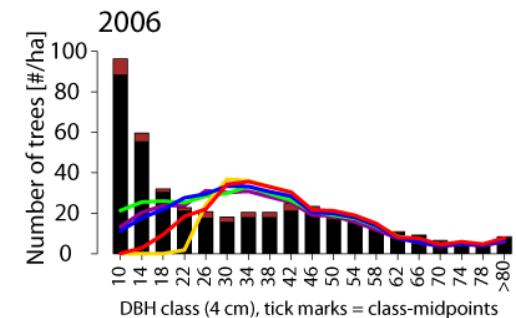
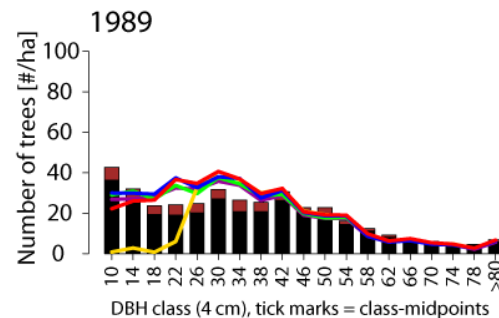
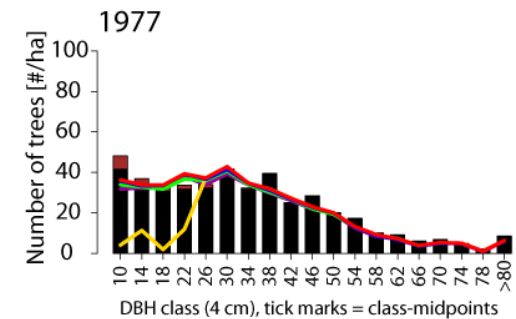
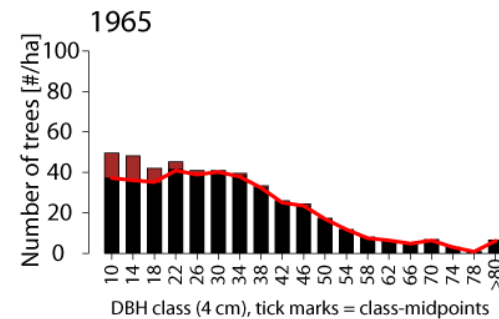
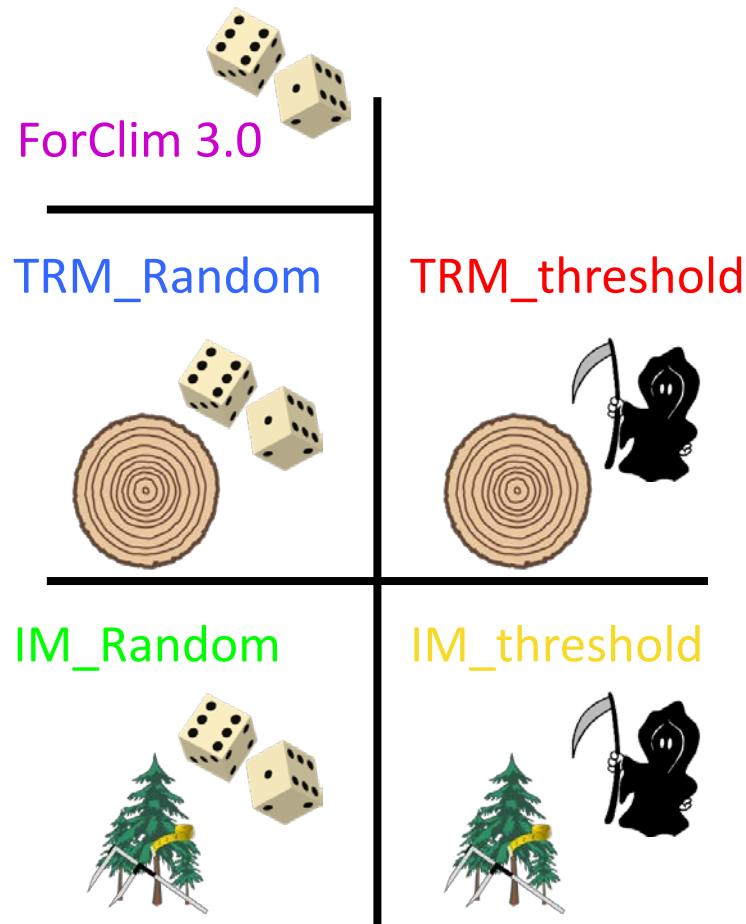
# Comparison of different mortality models on spruce

## Historical simulation in Sigriswil (managed forest)



# Comparison of different mortality models on spruce

## Historical simulation in Scatlè (forest reserve)

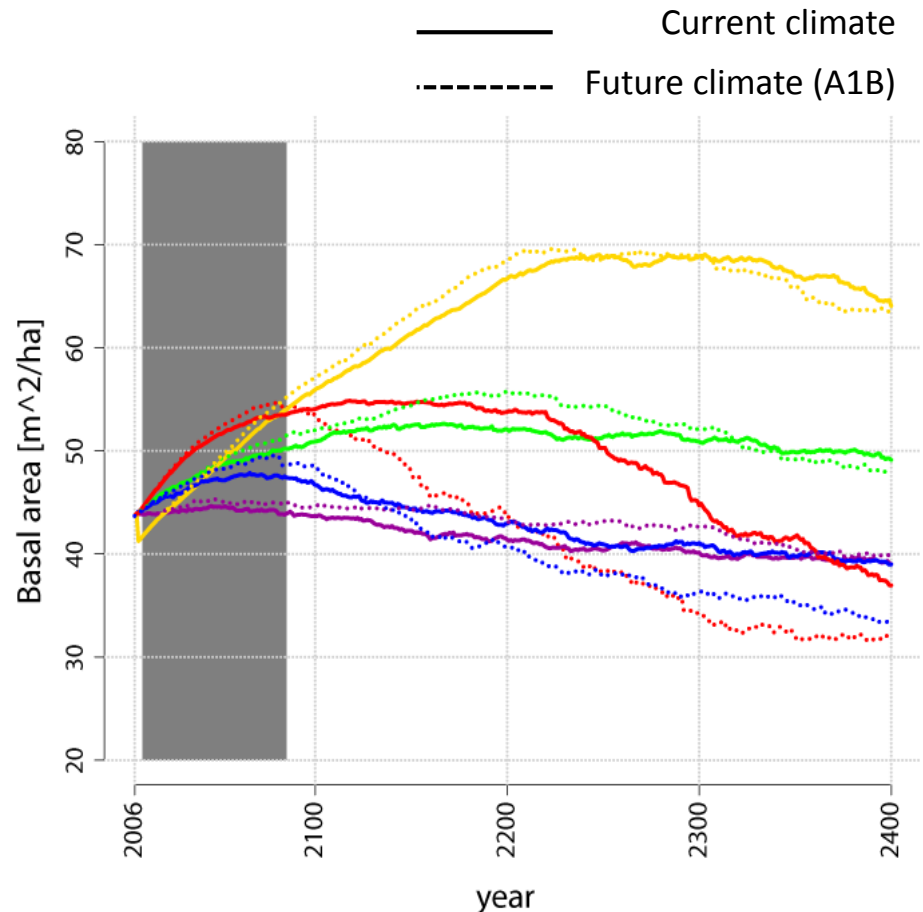
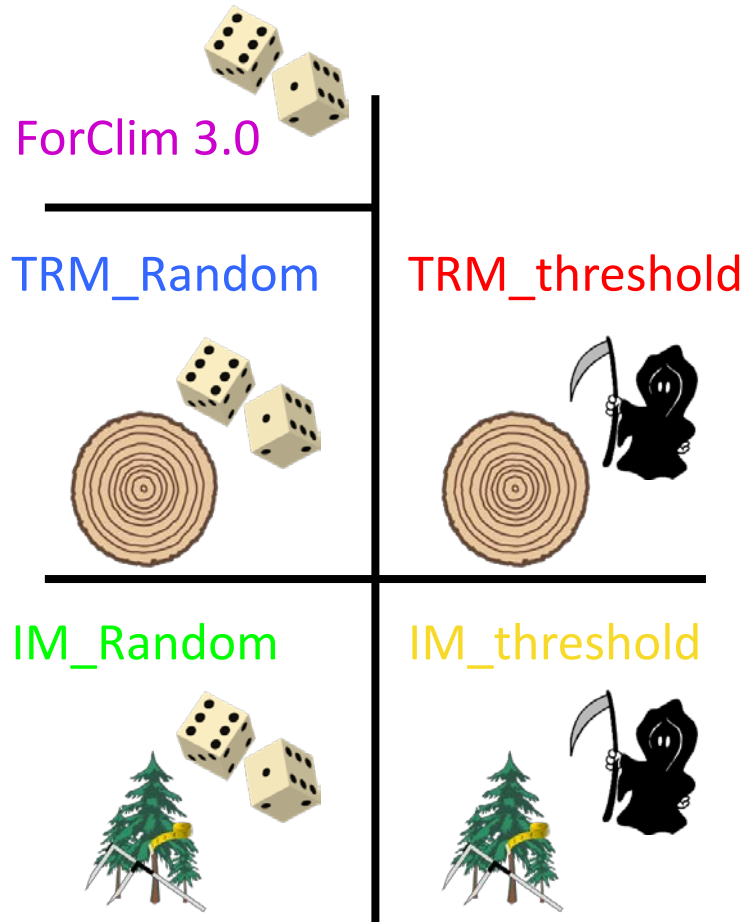


Empirical data

- Living trees
- Dead trees

# Comparison of different mortality models on spruce

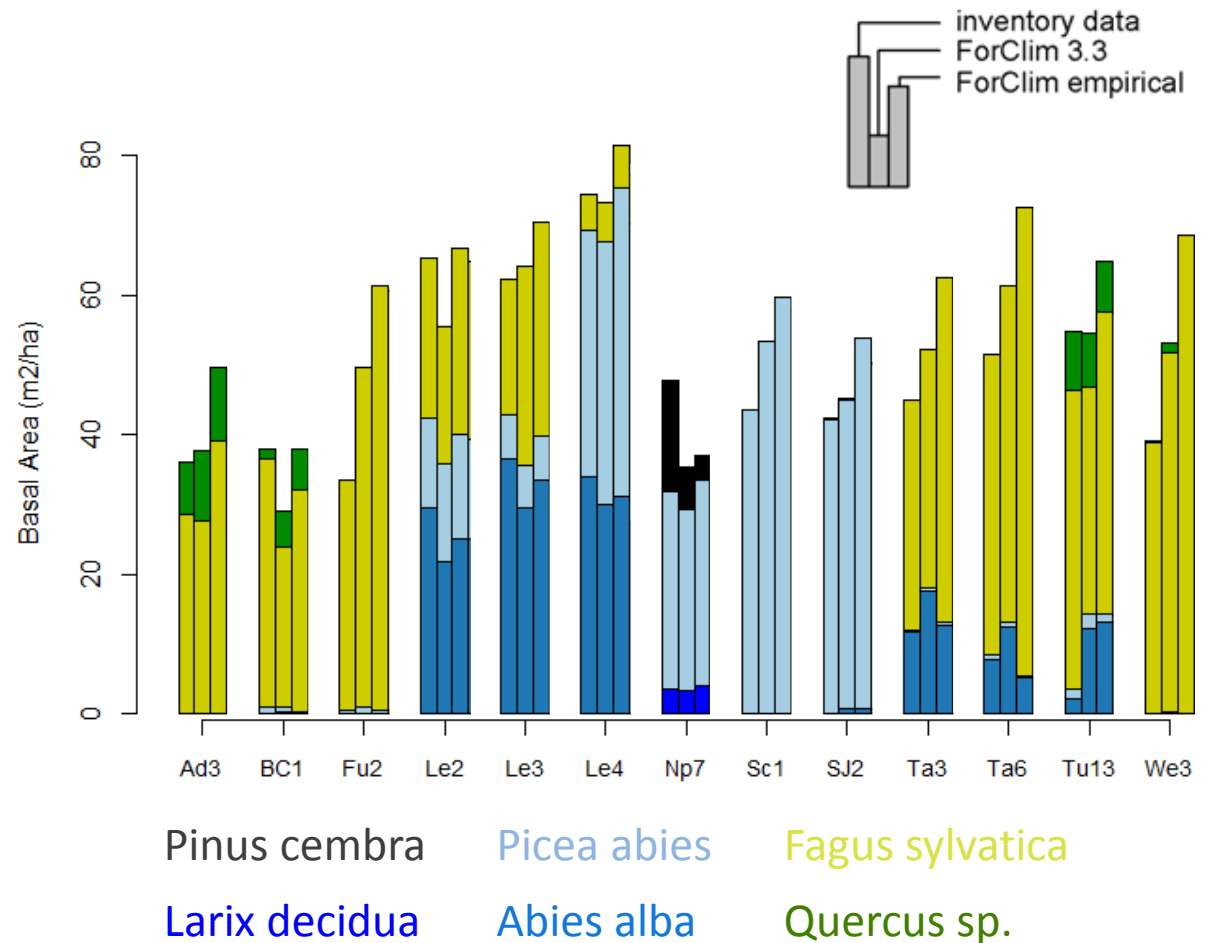
## Long-term simulation in Scatlè



# Empirical model based on inventory and ring-width data

Calibration data:  
12 forest reserves in  
Switzerland  
6 species - 528 trees

Validation 1: Historical  
short-term (30-50 ys)  
simulations



**Predicted survival probability of beech**

