# Analyzing time series of tree growth - Concepts, peculiarities and methods

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#### Concepts

- Tree growth and tree growth parameters
- Tree-rings and growth zones
- Cross-dating
- Principles of dendrochronology/-ecology

#### Peculiarities

- Growth trends
- Multiple states
- Sensitive/transient response, autocorrelation

#### Methods

- Detrending
- Chronology building
- Response function

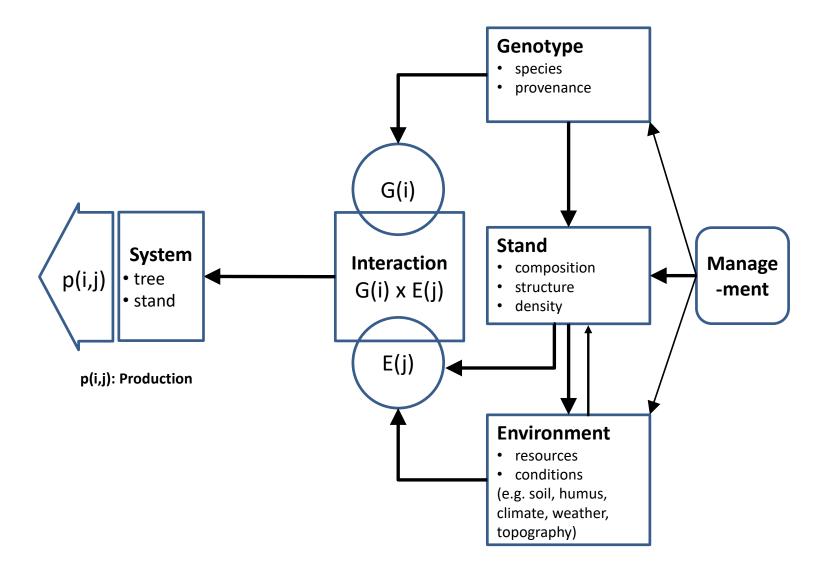
# Tree growth and tree growth parameters

#### Tree growth

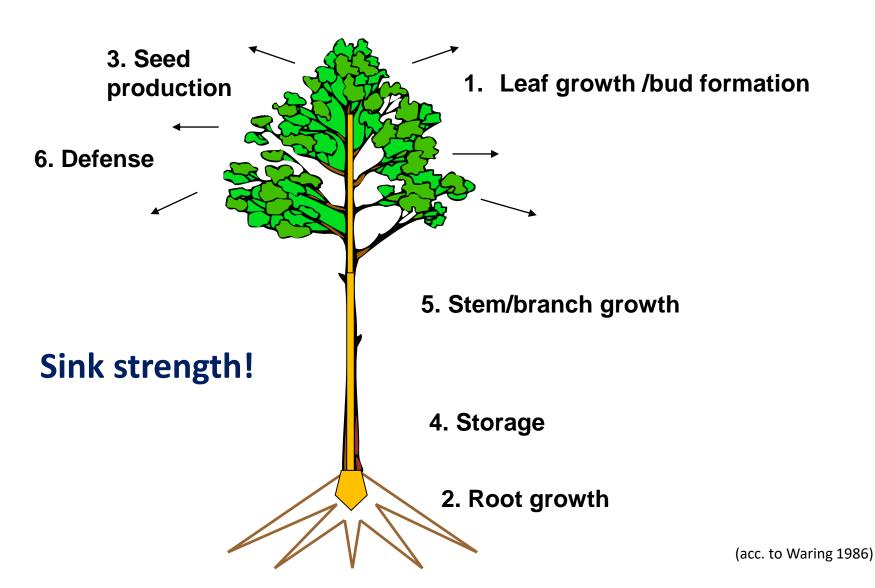
- primary growth/secondary growth
- leaf/needle, branch, stem, bark, root growth



# **System analysis: Production process**



# System analysis: Biomass partitioning in trees



# Tree growth and tree growth parameters

#### Tree growth

- primary growth/secondary growth
- leaf/needle, branch, stem, bark, root growth

#### Tree growth parameters

- diameter growth/diameter increment, e.g., d<sub>age 100</sub>, ir, TRW
- basal area growth/basal area increment, e.g., ig, iG
- height growth/height increment, e.g., h<sub>age 100</sub>, ih
- volume growth/volume increment, e.g., v<sub>age 100</sub>, iv, iV
- biomass growth/biomass increment

#### Analysis of tree growth:

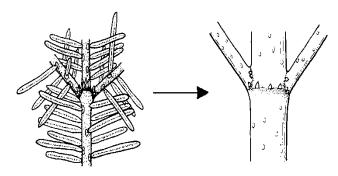
- Retrospective methods
  - Stem analysis
  - Increment cores
- In situ methods
  - Repeated measurements, e.g., long-term forest research plots, inventory
  - Continuous measurements, e.g., point dendrometer, permanent circumference band

# **Stem analysis**

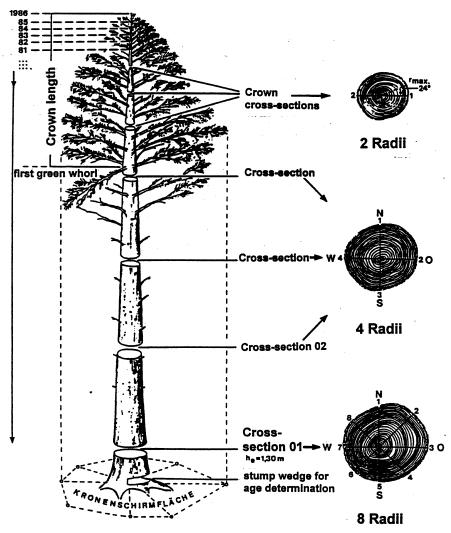
**Height analysis** 

**Analysis of stem cross-sections** 

#### **Traces of bud scales**

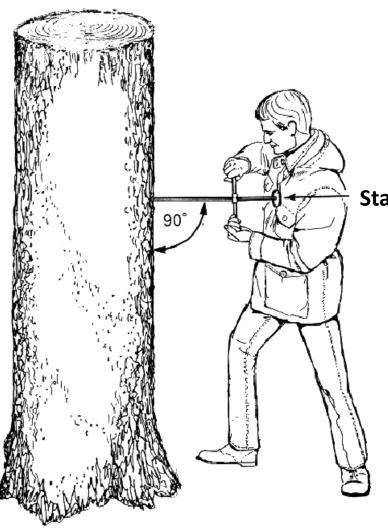


(Roloff 2001)



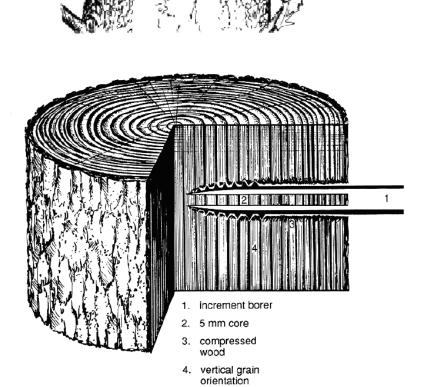
(Gerecke 1988)

**Application of increment borer** 



Hitting the centre

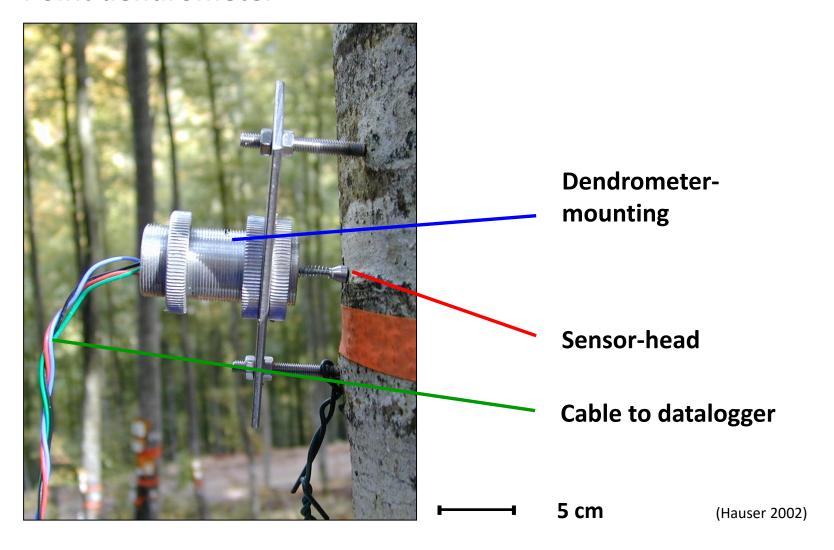
Starter-aid



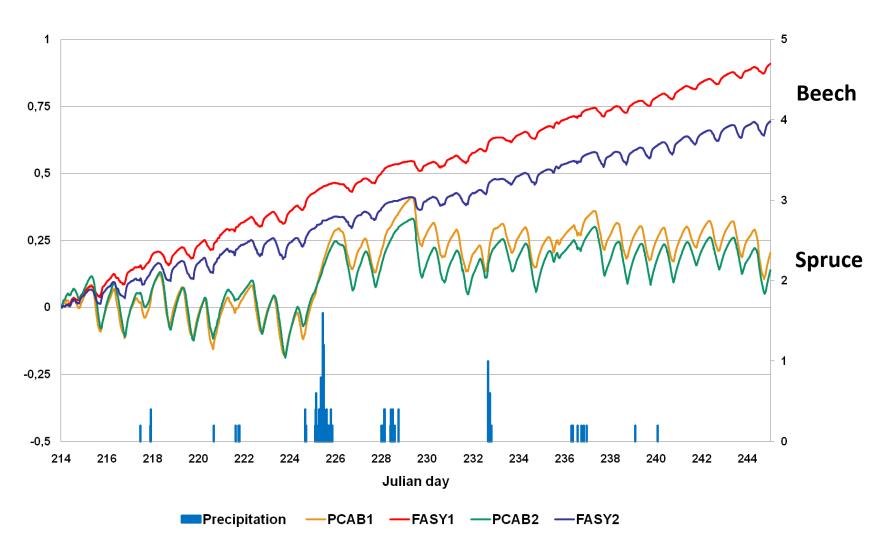
(Jozsa 1988)

## **Dendrometer measurements**

## **Point dendrometer**



## **Dendrometer measurements**

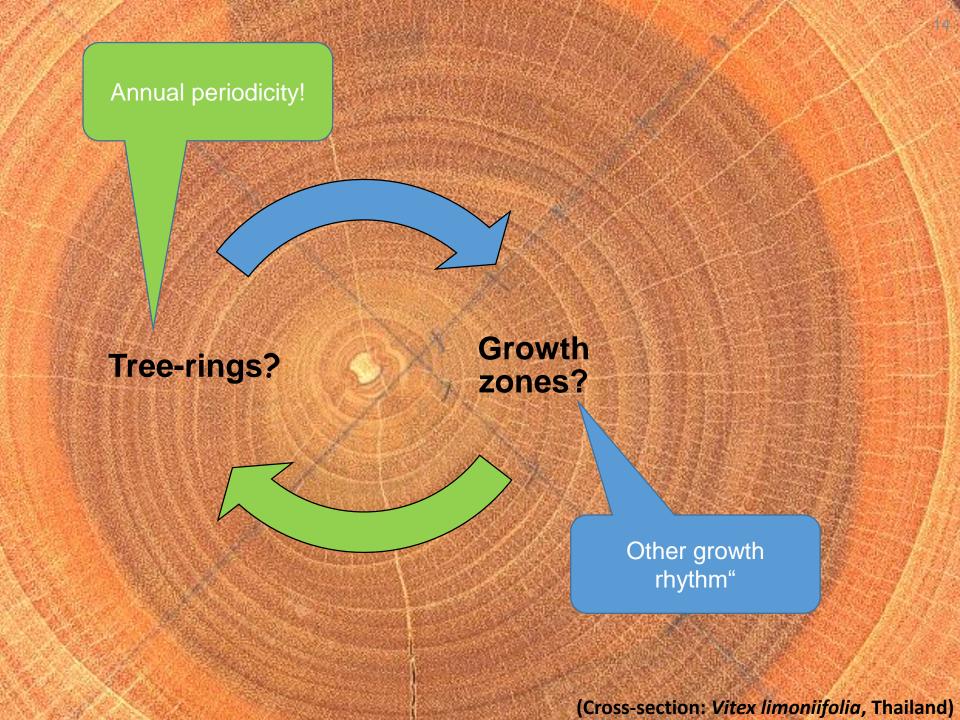


## Concepts

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cold winter: boundary distinct Mild winter: boundary fuzzy

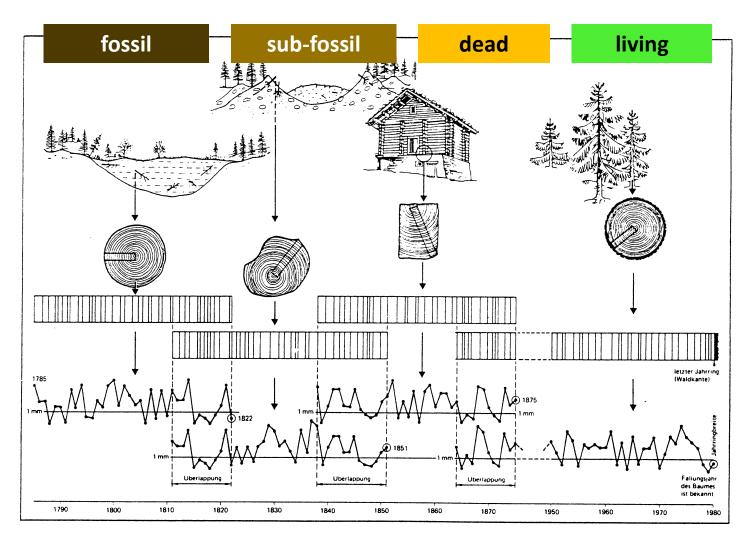
> Pinus taeda, Santa Catarina, Süd-Brasilien (Kahle 2012)



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# **Cross-dating and chronology building**



(Schweingruber 1989)

# Missing rings?

A tree ring which in a sample is absent due to failure of cambial activity.



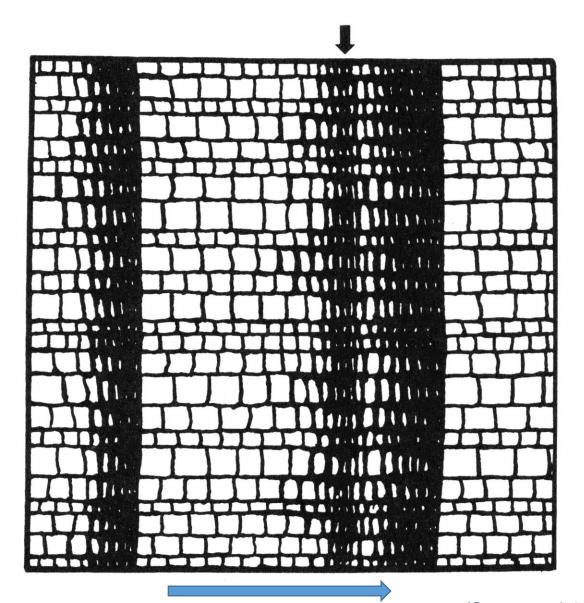
Missing rings can be located by **cross-dating**.

The term "missing ring" is used for tree rings which are absent on the whole sample.

When a tree ring is discontinuous (partial, incomplete), it is a wedging ring.

# False rings?

Cells leading into the false ring will gradually decrease in size and then gradually increase back to earlywood cells.



(Speer et al. 2004)

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- Principles of dendrochronology/-ecology

# Principles of dendrochronology/-ecology

- 1. The principle of aggregate tree growth
- 2. The uniformitarian principle
- 3. The principle of ecological amplitude, and
- 4. The principle of site selection

http://web.utk.edu/~grissino/

# Principles of dendrochronology/-ecology

#### The principle of aggregate tree growth

"Any individual tree growth series can be decomposed into an aggregate of environmental factors that affected the patterns of tree growth over time".

(e.g. web.utk.edu/~grissino/)

$$R_t = A_t + C_t + \delta D 1_t + \delta D 2_t + E_t$$
 (1) (acc. to Cook 1990)

- $R_t$  = growth response variable, e.g. radial increment, in year t
- $A_t$  = age trend component in year t
- $C_t$  = climate factor in year t
- $D1_t$  = tree individual disturbance in year t
- $D2_t$  = stand wide disturbance in year t
- δ = binary indicator (δ = 1: presence, δ = 0: absence)
- $E_t$  = error term (white noise process) in year t

# Principles of dendrochronology/-ecology

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$$R_t = A_t + C_t + \delta D 1_t + \delta D 2_t + E_t$$
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**Dendroclimatology**: "maximize the climate signal by minimizing the other factors through chronology building, *i.e.* (1) detrending/standardization, and (2) aggregation".

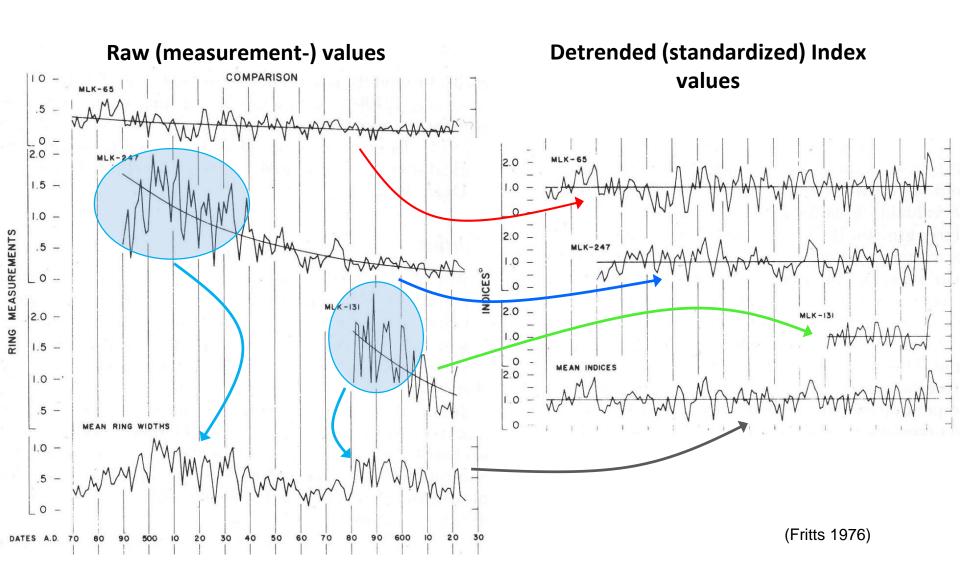
**Trend component:** 

$$G_t = f(A_t, \delta D1_t, \delta D2_t)$$
 (2)

δ = binary indicator (δ = 1: presence, δ = 0: absence)

E<sub>t</sub> = error term (white noise process) in year t

# **Standardization - Detrending**



# **Standardization - Detrending**

## Models for nonstationary series (series with a trending mean):

## **Trend stationarity:**

The mean trend is deterministic, i.e., once the trend is estimated and removed from the data, the residual series is a stationary stochastic process

## **Difference stationarity:**

The mean trend is stochastic, i.e. once the series is differenced D times, the series yields a stationary stochastic process

Concept rarely applied in dendroecology!

# The principle of aggregate tree growth - Critics

$$R_t = A_t + C_t + \delta D 1_t + \delta D 2_t + E_t$$
 (1) (acc. to Cook 1990)

#### "Age trend" component (A<sub>t</sub>) in year t:

The endogenous trend component comprises effects of **chronological AND of physiological age** (i.e. dimension related trend). **Alternative:** e.g., multi-step detrending

#### "Climate factor" (C<sub>t</sub>) in year t:

The climate factor is an amalgamation of effects of **weather** (operating at high frequencies) **AND climate** (operating at low frequencies). Effects can be **delayed and long-lasting** (lag and carry-over effects). **Alternative:** e.g., distributed-lag model

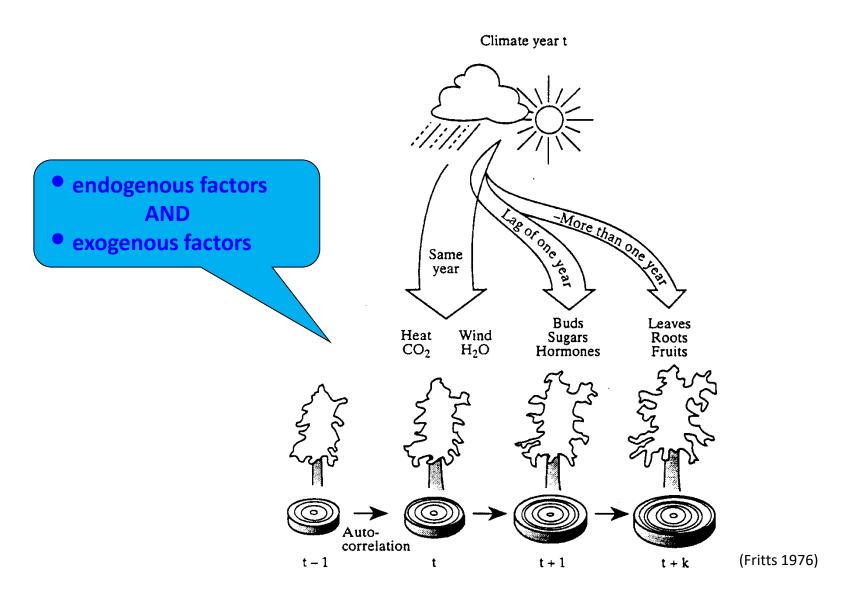
#### **Disturbances:**

Disturbances can have **long-lasting effects**. Weather factors, e.g. late frost, can also cause disturbance. **Alternative:** e.g., threshold autoregression model

#### **Additive aggregation:**

The assumption of **additive linkage without interaction** of components is biologically not meaningful. **Alternative:** multiplicative aggregation

# Time lagged effects: memory/autocorrelation



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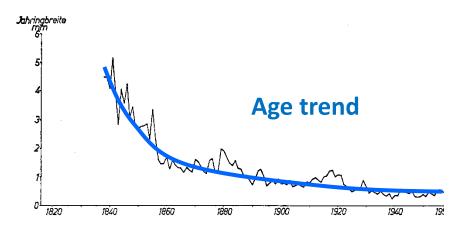
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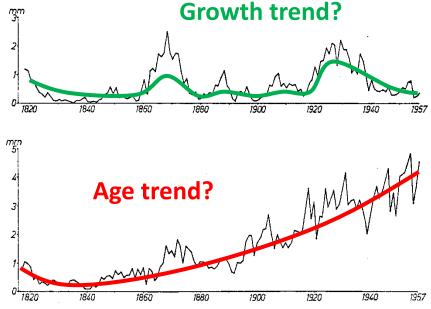


## Radial increment of forest trees in the Black Forest

## Age class forest (Fir)

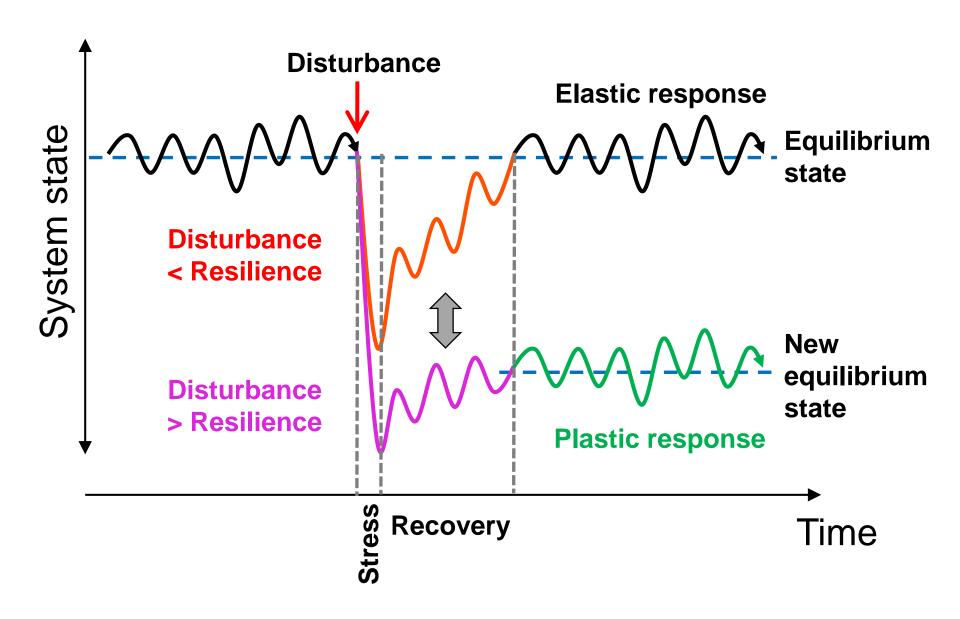
## Plenterwald (Fir)





(acc. to Mitscherlich, 1978)

# Disturbances and resilience of forest ecosystems



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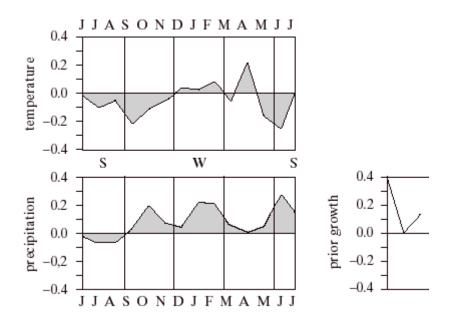
#### Methods

- Detrending
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- Response function

(adapted after Puettmann et al. 2015)

# Response function analysis

- multiple regression technique using the principal components (PCs) of monthly climatic data to estimate indexed values of ring-width growth.
- the regression coefficients are then multiplied by the PCs of climate to obtain a new set of regression coefficients related to the original monthly climatic data variables.



Results from response function analyses (A) for temperature and precipitation (previous June to current July) and autocorrelation analyses (B) for a 3-year period (semi-arid sites in the American Southwest). (Fritts 1976)

(http://www.wsl.ch/dendro/products/dendro glossary)

## **Weblinks**

#### **Ultimate Tree-Ring Web Pages**

http://web.utk.edu/~grissino/

#### **Multilingual Glossary of Dendrochronology**

http://www.wsl.ch/dendro/products/dendro\_glossary

#### **Dendrochronology Program Library**

http://www.ltrr.arizona.edu/pub/dpl/

#### **Dendrochronology Program Library in R**

https://cran.r-project.org/web/packages/dpIR/index.html

#### **Climate explorer**

https://climexp.knmi.nl/start.cgi

#### **International Tree-Ring Data Bank**

http://www.ncdc.noaa.gov/paleo/treering.html

#### **Gesellschaft für Jahrringforschung / Association for Tree-Ring Research**

http://www.tree-ring.org/