

# The estimation of periodic volume increment from permanent inventories with pps-sampling design

or: What is this thing called growth?  
(Gilbert 1954)

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## Overview

- Introduction: terminology & definitions
- Methods
  - pps-Sampling
  - Alternative estimators of growth
  - Model for diameter and height growth
- Application: comparison of different estimators
- Explaining the difference
- Conclusions

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## A note on terminology

### Growth, increment, change

- Growth (rate): increase in size (= increment )  
 $Y = f(t); dY/dt = f(Y, t)$
- Forest = population
  - Growth
  - Depletion (loss, drain) due to management (harvest, cut) and natural mortality
  - Ingrowth due to regeneration
  - (area change due to deforestation and/or afforestation)

## A note on terminology

### Change

- Individual growth = increase in size = positive change
- Forest population aggregate size
  - Net change of growing stock ( $dV = V_2 - V_1$ ) can be negative!

## Components of growth

Growth and loss (drain) in a period  $t_1$  to  $t_2$

Subpopulations (domains)

- Survivor trees
- Ingrowth trees
- Loss (trees harvested or naturally died: cut and mortality)

## Assumptions

- Two consecutive surveys with a common set of  $m$  sample plots
- A pps-sampling design by relascope (Bitterlich ACS) with the same basal area factor
- Diameter (d.b.h.) threshold  $d_k$
- Sample trees mapped  
... at both occasions.

Variable of interest: periodic volume increment  
("gross annual increment") per hectare and year  
[m<sup>3</sup>ha<sup>-1</sup>a<sup>-1</sup>]

## pps-sampling

### Angle count sampling (ACS):

- Inclusion probability depends on individual basal area  $b_k$  and basal area factor  $F$ : = pps
- **Horwitz-Thompson** is an unbiased estimator:

$$\hat{Y}_s = \sum_{U_k \in s} \frac{y_k}{\pi_k}; \pi_k = \frac{FA}{b_k}$$

$$\hat{Y}_s = FA \sum_{U_k \in s} \frac{y_k}{b_k} = A \sum_{U_k \in s} y_k \frac{F}{b_k} = A \sum_{U_k \in s} y_k w_k$$

## Growth components with repeated pps-sampling

### Subsequent survey on permanent plots identifies:

- Survivor trees (re-measured)
- Newly qualified trees
- Cut and mortality trees (measured once at t1)

Growth components with repeated pps-sampling: **survivor trees**

Growth ( $y_2 - y_1$ ) measurable on repeatedly measured **survivors** only

pps-sampling:

$$w_{1.k} = \frac{F}{b_{1.k}}; w_{2.k} = \frac{F}{b_{2.k}}$$
$$b_{2.k} > b_{1.k} \Rightarrow w_{2.k} < w_{1.k}$$

“Recalibration effect”

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Growth components with repeated pps-sampling: **newly qualified**

**Newly qualified** sample trees measured at subsequent survey only

Regarding the (unobserved) initial diameter  $d_1$  distinction of two subdomains:

- $d_1 < d_k$  : “true” ingrowth: domain  $I_t$
- $d_1 \geq d_k$  : ingrowth due to sampling (“nongrowth”): actually survivor trees (“recalibration effect”): domain  $S_n$

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## Growth components

### Increment balance equation with *complete* information

$$iV = V_{D^*} + V_2 - V_1$$

$V_{D^*}$  : cut and mortality = drain (depletion)

$V_2 - V_1$  : growing stock net change

$$V_1 = V_{S1} + V_{D1}$$

$$V_2 = V_{S2} + V_I$$

$$iV = V_{D^*} + V_{S2} + V_I - V_{S1} - V_{D1}$$

$$iV = \Delta V_D + \Delta V_S + V_I$$

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## Growth components with repeated pps-sampling

### Growth balance equation with *incomplete* information

$$iV = \Delta V_D + \Delta V_S + V_I$$

1. Component: **growth of depletion trees** (cut & mortality)

$$\Delta V_D = V_{D^*} - V_{D1}$$

Estimator:

$$\Delta \hat{V}_D = \sum_{U_k \in D} (\hat{v}_{*k} - v_{1.k}) \cdot w_{1.k}$$

Volume at time of removal  $\mathbf{v}_*$  is unknown!

→ we need a growth model!

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## Growth model

### Trend function (Sloboda 1971)

$$y(t_2) = c \cdot \left( \frac{y(t_1)}{c} \right)^{e^{-\frac{b}{1-a} (t_2^{1-a} - t_1^{1-a})}}$$

derived from the differential equation:

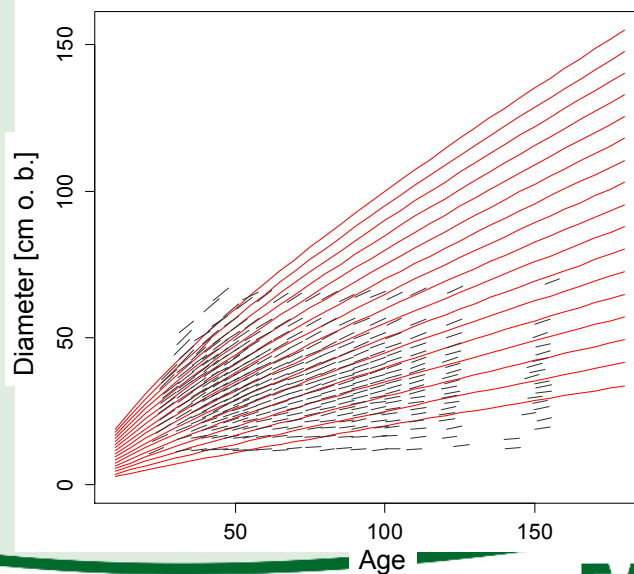
$$\frac{\partial y}{\partial t} = b \cdot \frac{y}{t^a} \cdot \ln \left( \frac{c}{y} \right)$$

$y$  = diameter or height ;  $t$  = age

Differential equation fitted on survivors

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## Sloboda trend function: diameter = f(Age) for N. spruce



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## Growth components with repeated pps-sampling

### Estimator of growth of depletion trees

$$\Delta \hat{V}_D = \sum_{U_k \in D} (\hat{v}_{*k} - v_{1,k}) \cdot w_{1,k}$$

Volume at time of removal (= mid of period)  $\hat{v}_{*}$   
estimated based on predicted diameter and height  
using the Sloboda trend function fitted on the survivor  
trees observed at  $t_1$  and  $t_2$

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## Growth components: **Ingrowth**

$$i\hat{V} = \hat{\Delta}V_D + \hat{\Delta}V_S + \boxed{\hat{V}_I}$$

$$\hat{V}_I = \sum_{U_k \in I} v_{2k} \cdot w_{2k}$$

Model-based identification:

$$i \in I_t : \hat{d}_{1,i} < d_k$$

$$i \in S_I : \hat{d}_{1,i} \geq d_k$$

Or based on distances:

$$i \in I_t : dist \leq \frac{d_k}{2\sqrt{F}}; F = \text{basal area factor}$$

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## Growth components: estimators of **survivor-growth**

$$i\hat{V} = \hat{\Delta}V_D + \hat{\Delta}V_S + \hat{V}_I$$

(1) Grosenbaugh (1958)

$$\hat{\Delta}V_S = \sum_{i \in S_r} v_{2,i} \cdot w_{1,i} - \sum_{i \in S_r} v_{1,i} \cdot w_{1,i}$$

(2) Roesch et al. (1989)

$$\hat{\Delta}V_S = \sum_{i \in S_r} v_{2,i} \cdot w_{2,i} - \sum_{i \in S_r} v_{1,i} \cdot w_{2,i} + \sum_{i \in S_n} v_{2,i} \cdot w_{2,i} - \sum_{i \in S_n} \hat{v}_{1,i} \cdot w_{2,i}$$

$\hat{v}_{1,i}$  = model - based estimated initial volume

(3) Compatible estimator (van Deusen et al. 1986)

$$\hat{\Delta}V_S = \sum_{i \in S_r} v_{2,i} \cdot w_{2,i} - \sum_{i \in S_r} v_{1,i} \cdot w_{1,i} + \sum_{i \in S_n} v_{2,i} \cdot w_{2,i}$$

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## The issue of **additivity**

### Net change $\Delta V$

$$\Delta V = V_2 - V_1$$

$$iV = V_{D^*} + V_2 - V_1$$

$$V_2 - V_1 = iV - V_{D^*}$$

$$i\hat{V} = \hat{\Delta}V_S + \hat{\Delta}V_D + \hat{V}_I$$

$$\Delta\hat{V} = i\hat{V} - \hat{V}_{D^*}$$

$$\Delta\hat{V} = \sum_{i \in S_r \cup i \in S_n} v_{2,i} \cdot w_{2,i} - \sum_{i \in S_r} v_{1,i} \cdot w_{1,i} - \sum_{i \in D} v_{1,i} \cdot w_{1,i} + \sum_{i \in I_n} v_{2,i} \cdot w_{2,i}$$

Compatible survivor-growth estimator

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Application: German NFI in Baden-Württemberg

Estimation of **periodic annual volume increment** per hectare (= gross annual increment G.A.I.) 2002-2012

Estimation is based on survivor-growth estimator according to Roesch et al. (1989)

**Net change of ...**

Survivors	Depletion	Ingrowth	G.A.I.
[m <sup>3</sup> ha <sup>-1</sup> yr <sup>-1</sup> ]			
10.25	1.73	0.31	<b>12.29 ± 0.08</b>
83.4%	14.0%	2.5%	

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Gross annual increment

**Comparison** of estimators differing with regard to survivor-growth component

Estimator	G.A.I [m <sup>3</sup> ha <sup>-1</sup> a <sup>-1</sup> ]
Grosenbaugh	12.16
Roesch et al.	12.29 ± 0.08
van Deusen	13.21

Striking difference!

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## Explaining the differences

### Hypothesis 1

Incomplete sampling at initial survey (overlooked trees): initial growing stock underestimated

Correction: identification of newly qualified trees which might have been overlooked at  $t_1$ :

a part of newly qualified trees ( $S_N$ ) is re-classified as “to-be-repeatedly-measured” survivor trees based on their distances and estimated initial diameters (probably overlooked trees)

(2 variants A and B regarding proportion of reclassified  $S_N$  trees)

## Correction of initial growing stock

Estimator	G.A.I [m <sup>3</sup> ha <sup>-1</sup> a <sup>-1</sup> ]		
	original	with correction	
		A	B
Grosenbaugh	12.16	12.33	12.51
Roesch et al.	12.29	12.29	12.29
van Deusen	13.21	12.83	12.54

## Correction of initial growing stock: explanation

Initial volume increases as a subset of survivors newly qualified at  $t_2$  (“non-growth”) are now added to initial survivors (with modelled volume and weights calculated from the modelled initial diameters)

Effect on Grosenbaugh: survivor growth increases

Effect on van Deusen: difference between  $V_2$  and  $V_1$  decreases:

No effect on Roesch et al. (re-classification does not affect survivor growth estimate)

## Explaining the differences

### Hypothesis 2

Diameter growth is underestimated by the model (trend function)

Correction:

Initial diameters of newly qualified survivors (“backwards” predicted by the growth model) are increased (restricted to trees with a diameter at  $t_2 \leq 30$  cm)

## Correction of initial growing stock and diameter growth

Estimator	G.A.I [m <sup>3</sup> ha <sup>-1</sup> a <sup>-1</sup> ]		
	original	with correction	
		A	B
Grosenbaugh	12.16	12.43	12.56
Roesch et al.	12.29	12.62	12.62
van Deusen	13.21	12.90	12.65

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## Correction of diameter growth: explanation

Significant effect on Roesch et al. estimator of survivor growth as it depends on modelled growth of newly qualified survivors

Minor effect on Grosenbaugh- and van Deusen-estimator: due to increased ingrowth volume as ingrowth trees are determined by estimated initial diameters: increased diameter growth leads to a higher proportion of trees with initial diameter below diameter threshold  $d_k$

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## Conclusions

- pps-sampling
  - Inclusion probabilities of repeatedly measured trees change and newly qualified trees appear at subsequent survey (**recalibration** effect -> inflation of variance)
  - ... allows different unbiased estimators of survivor growth
- Growth is a **susceptible** variable: difference of large quantities; strongly depends on correct (complete) sampling; however, ... no survey is perfect!
- Estimator depending on model may be affected by model bias

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## Conclusions

- **Additivity** (“compatibility”) depends on survivor-growth estimator used (but, is additivity necessary?)
- German NFI: “Roesch”-estimator without correction for additivity:
  - Pro: independent of initial measurements, mainly relies on current ( $t_2$ ) survey
  - Contra:
    - depends on (unbiased) diameter growth model
    - not compatible (additive) with net volume change

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