

Modelling the probability of incorrect harvest decisions due to errors in stand characteristics

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Outline of the presentation

Introduction

Material and methods

Results

Discussion

Forest planning in Finland

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 - ▶ A tree-level growth simulator,
 - ▶ Rules determining maturity for different treatments (mainly thinnings and final cuts),
 - ▶ Simulated harvests
- ▶ The forest plan is the combination of these harvest schedules that maximizes the utility to the forest owner, or at least satisfies her.

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 - ▶ Answers could be searched for by using the cost-plus-loss approach or the value of information (VOI) approach
- ▶ Practitioners could formulate the question as:
How much errors can be allowed in stand characteristics if the aim is to end up to a schedule that does not essentially differ from the correct schedule?

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- ▶ The probability of correct decision was modeled on stand characteristics and the realized errors.

Data

- ▶ 157 spruce-dominated stands from Southern Finland

	G, m ² /ha	D, cm	Site type
min	5	6	2
median	22	19	3
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- ▶ Simulating the erroneous schedules
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- ▶ Schedules were simulated using the SIMO software developed at the University of Helsinki.

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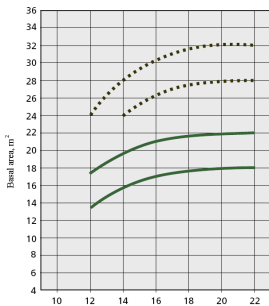
- ▶ Final felling
 - ▶ The maturity for final felling is defined based primarily on mean diameter (limit 26-28 cm) and secondarily on stand age (limit 70).
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- ▶ Later thinning
 - ▶ Based on the thinning model



The logistic model for incorrect decisions

Let random variable OK_{ki} specify whether schedule i for stand k was correct ($OK_{ki} = 1$) or incorrect ($OK_{ki} = 0$). Assume that

$$OK_{ki} \sim \text{Bernoulli}(\pi),$$

where

$$\ln \left(\frac{\pi}{1 - \pi} \right) = \beta_0 + \beta_1 x_{1ki} + \dots + \beta_p x_{pki}.$$

The predictors x_{1ki}, \dots, x_{pki} include the stand characteristics, relative errors and their interactions.

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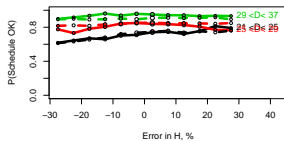
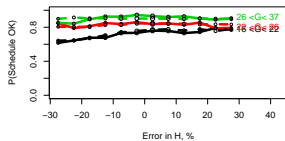
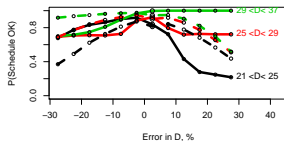
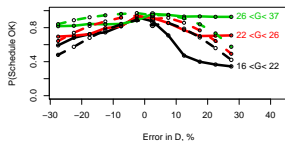
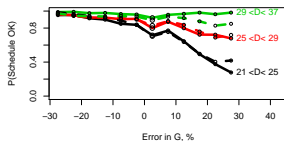
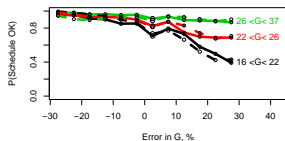
- ▶ Positive and negative errors are anticipated to have different effects – separate terms for positive and negative errors are needed.
- ▶ The trends are curvilinear – several transformations are needed
- ▶ The effect of errors depends on stand properties, e.g., overestimation of mean diameter in a stand with $D = 26\text{cm}$ has different effect than in a stand with $D = 20\text{cm}$ – interactions between errors and stand characteristics are needed.

The set of predictors in our tentative models

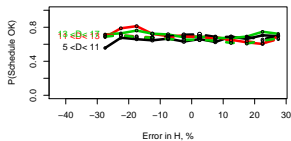
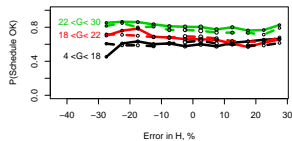
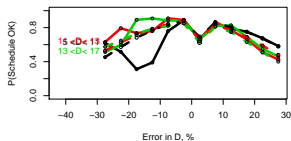
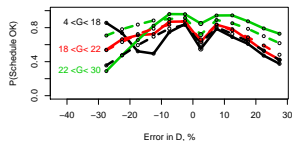
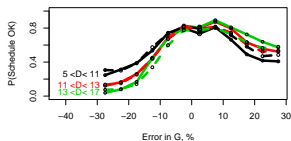
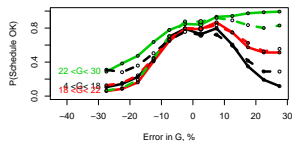
G	$eGneg^2$	$D*eGneg$	later thinning* $eGpos$
D	$eGneg^3$	$D*eGpos$	first thinning* $eGneg$
eST	$eDneg$	$eGpos*eDpos$	later thinning* $eGneg$
ST3	$eDpos$	$eGpos*eDneg$	first thinning* $eDpos$
ST4	$eHneg$	$eGneg*eDpos$	later thinning* $eDpos$
first thinning	$eHpos$	$eGneg*eDneg$	first thinning:* $eDneg$
later thinning	$D*eDneg$	$ST2*eG$	later thinning* $eDneg$
eGpos	$D*eDpos$	$ST3*eG$	$G*first\ thinning$
$eGpos^2$	$G*eHneg$	clearcut* eH	$G*later\ thinning$
$eGpos^3$	$G*eGpos$	first thinning* eH	$D*first\ thinning$
$eGneg$	$G*eGneg$	first thinning* $eGpos$	$D*later\ thinning$

- ▶ We are not yet satisfied with the model

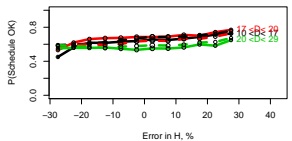
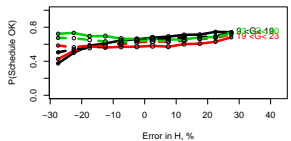
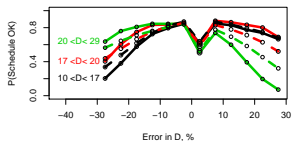
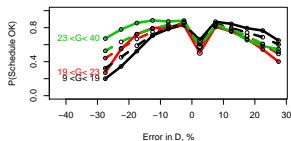
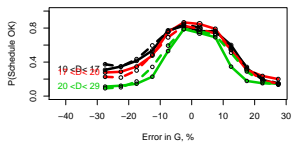
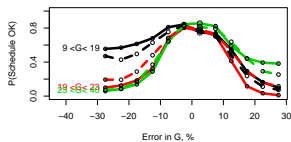
True (solid) and modelled (dashed) proportion in final felling stands



True (solid) and modelled (dashed) proportion in first thinning stands



True (solid) and modelled (dashed) proportion in later thinning stands



Discussion

- ▶ The models could be used to compute the error level which gives the specified probability for correct schedule as

$$1 - \alpha = \hat{\pi} = \frac{\exp\left(\hat{\beta}_0 + \hat{\beta}_1 x_1 + \dots + \hat{\beta}_p x_p\right)}{1 + \exp\left(\hat{\beta}_0 + \hat{\beta}_1 x_1 + \dots + \hat{\beta}_p x_p\right)}$$

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- ▶ Could also be used in finding stands where good-quality data is most important
- ▶ Does not provide information about how severely the schedule is incorrect (i.e., no prize for the failure to find correct schedule)
- ▶ Finding flexible enough functions for our models was found problematic. Final models might be based on spline regression.

THANK YOU!