



Data assimilation in forest inventory: First empirical results using ALS data

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Co authors:

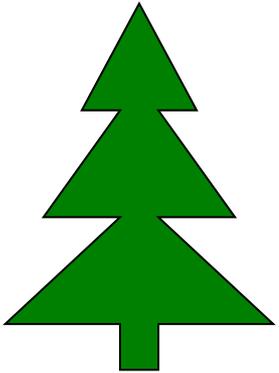
Nils Lindgren, Jörgen Wallerman, Anton Grafström, Anders Muszta, Kenneth Nyström, Göran Ståhl, Håkan Olsson

Background

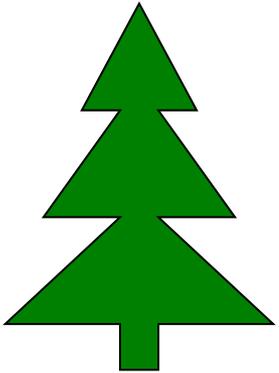
- Remote sensing is now giving a flow of data
 - How do we take care of all that?
- How to combine many data sources?
- How do we maintain accurate and up-to-date data?
- Data assimilation is one possible solution

Data assimilation in forest inventory

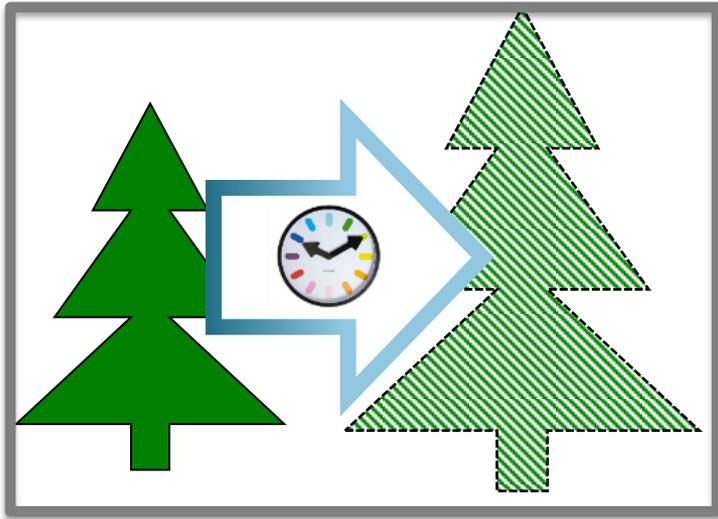
Data assimilation in forest inventory



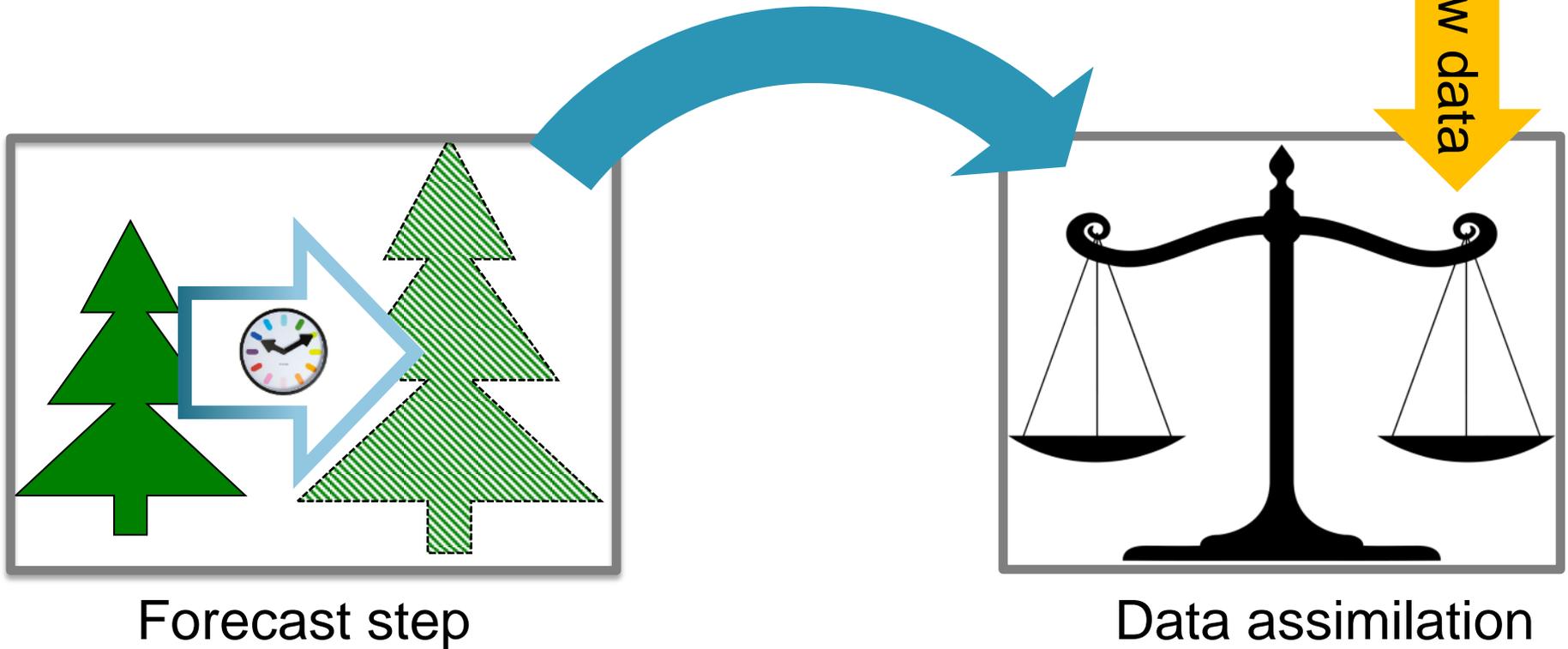
Data assimilation in forest inventory



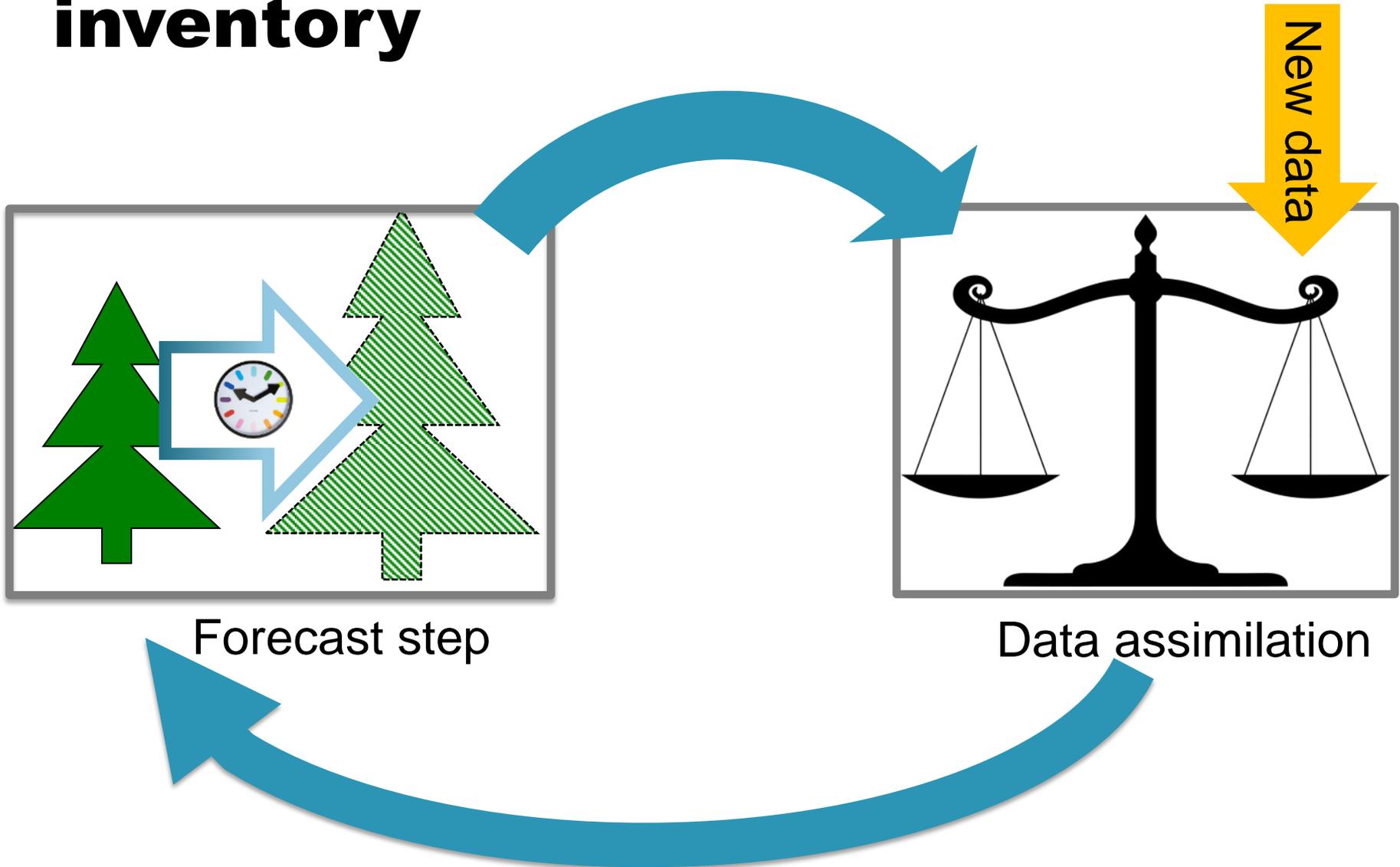
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Studies

- This is one of many case studies in a research program about data assimilation
 - Simulation study (published, Ehlers *et al* 2013)
 - Digital photogrammetry (submitted case study)
 - **ALS (presented here)**
 - InSAR (just started)

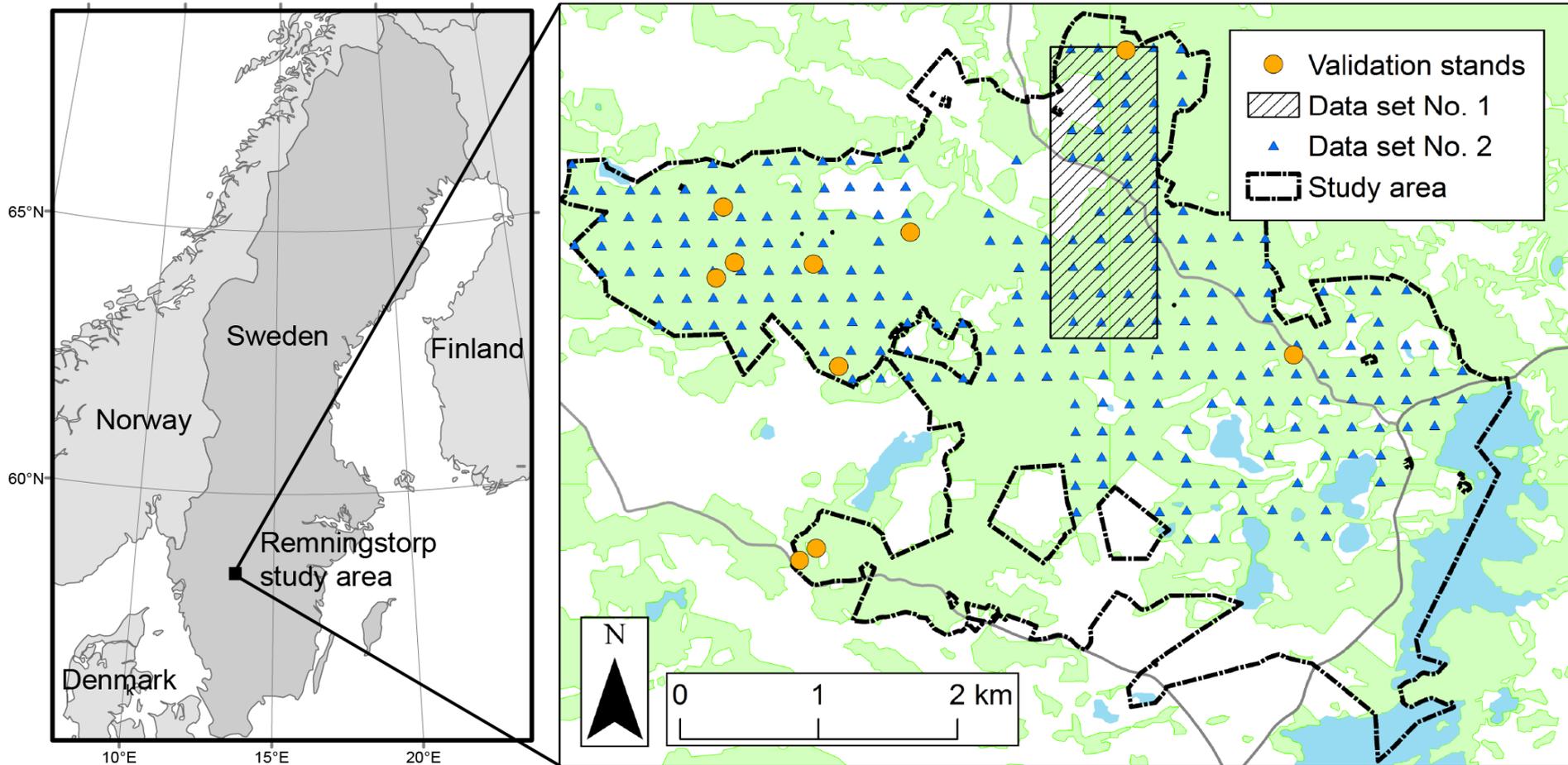
Objective

- Apply data assimilation to forest stand data using remote sensing data from ALS
- Studied variables:
 - Stem volume
 - Basal area
 - Lorey's mean height

The case study

- Using the extended Kalman Filter for assimilation
- ALS data from 2003, 2004, 2007, 2008, 2010, 2011
 - But all validation plots are not covered every year (on average 3.7 acquisitions/plot)

Study area / field data



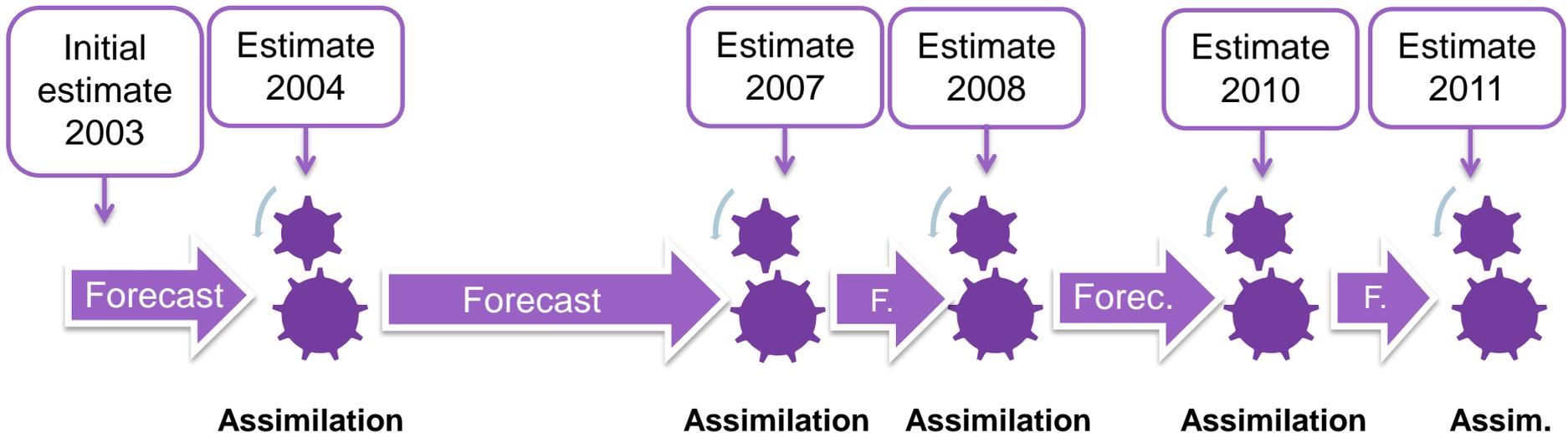
Study area

- Productive forest. Spruce, pine, deciduous (mainly birch)



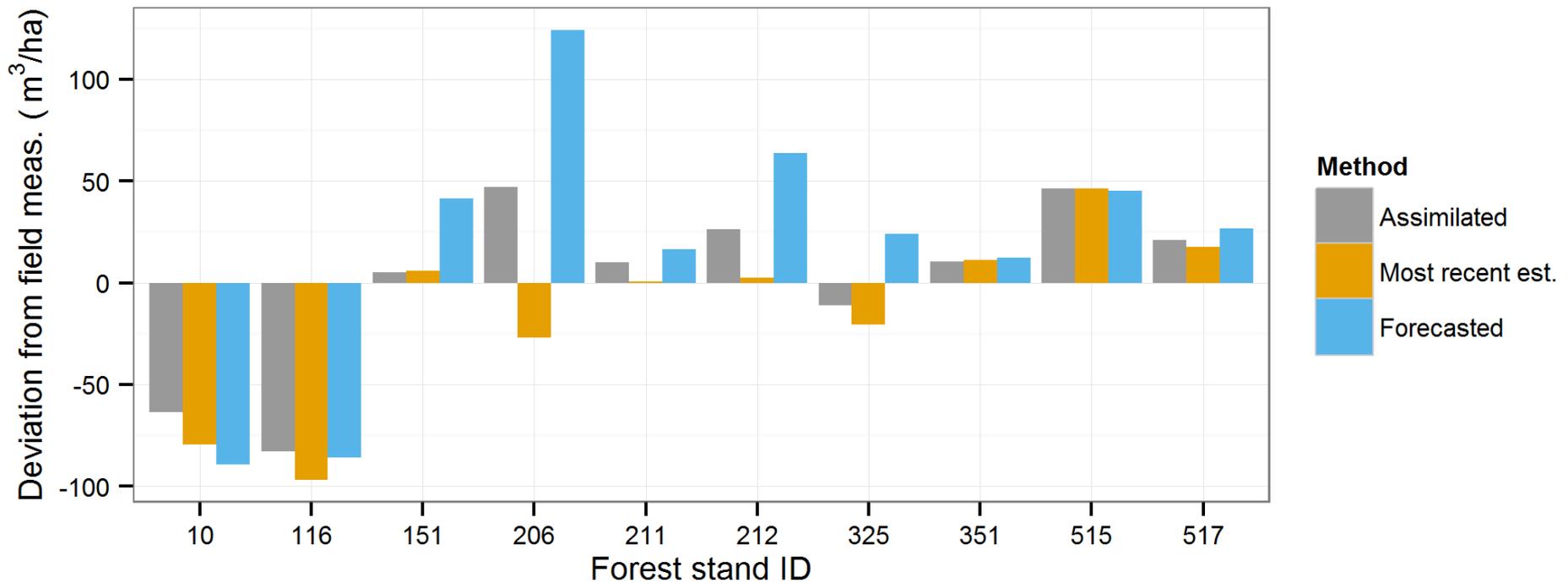
Method

- Area based approach to create estimates
- Assimilation performed on ten 40m radius sample plots
- Comparing assimilation to:
 - Forecasting from the initial estimate (2003)
 - Only using the most recent ALS acquisition (2011)



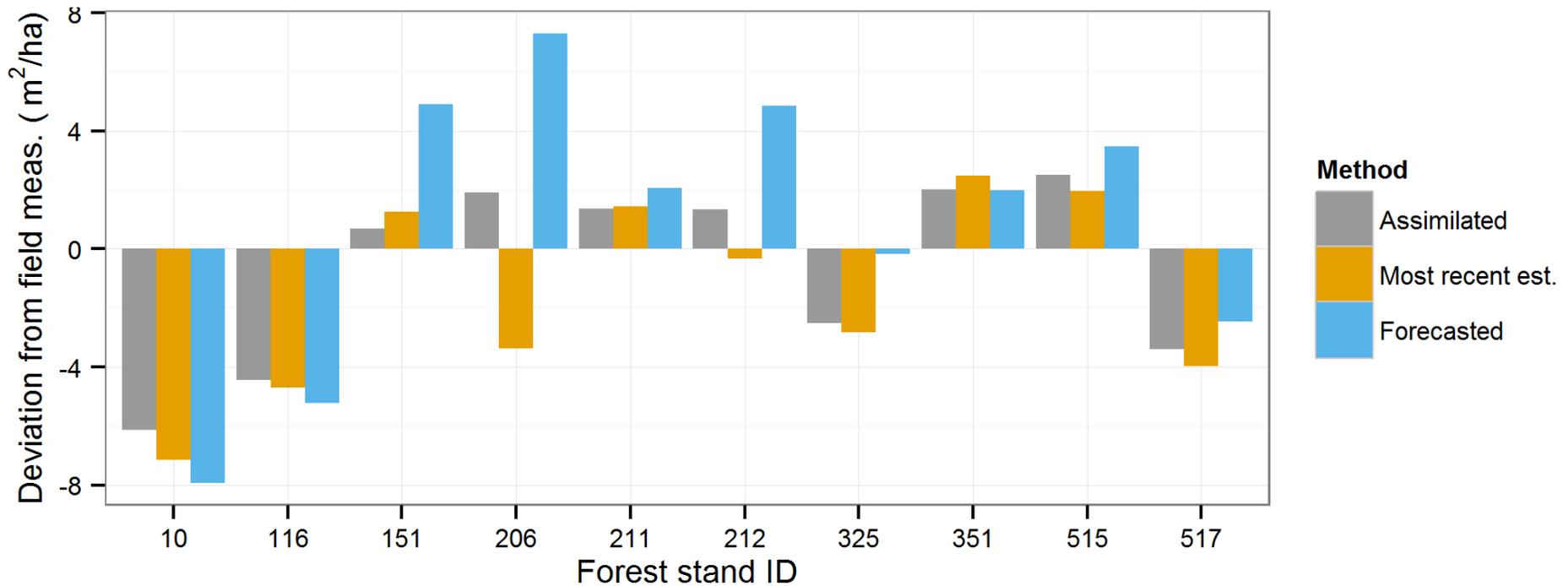
Results

- Deviation from field-measured **stem volume**, plot wise



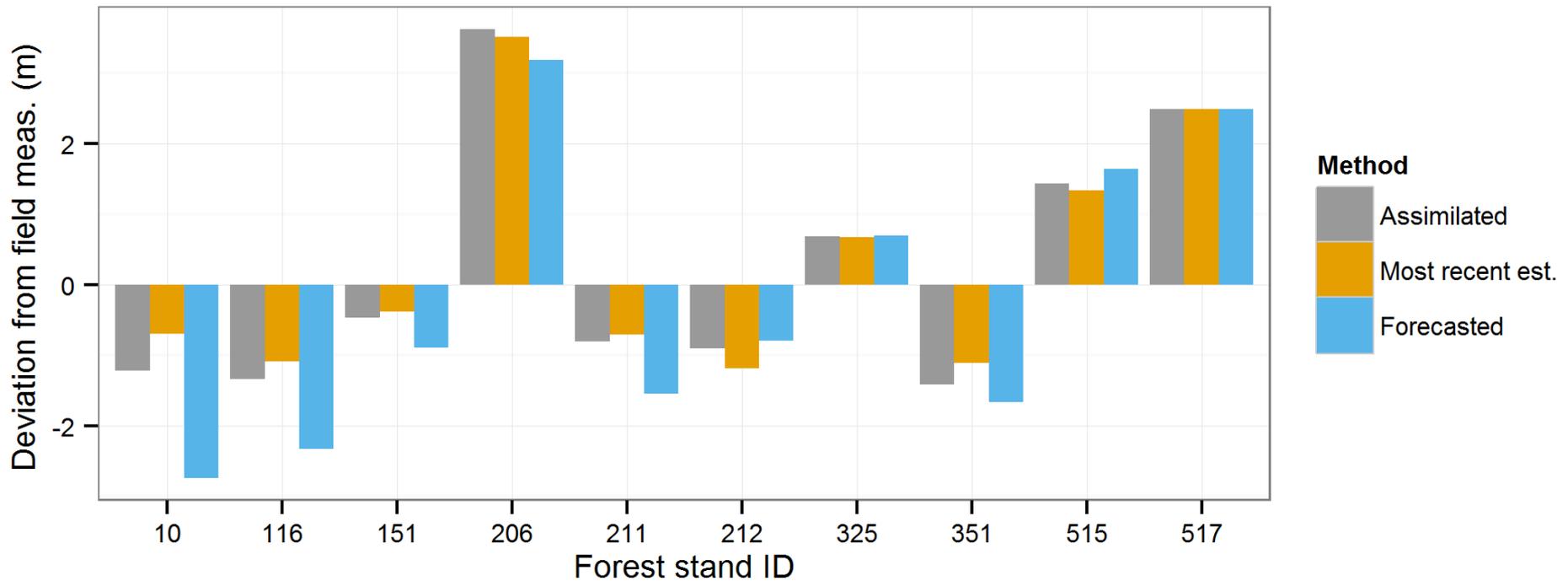
Results

- Deviation from field measured **basal area**, plot by plot



Results

- Deviation from field measured **Lorey's mean height**, plot by plot



Results

- Relative RMSE of the ten assimilated plots

Target variable	Assimilated	Last ALS	Forecast from first ALS
Lorey's mean height	8.5%	8.0%	9.9%
Basal area	9.5%	10.8%	14.5%
Stem volume	13.3%	14.3%	20.6%

The comparison is to the field measured values for the plots

Discussion / conclusions

- Successfully developed a data assimilation framework for forestry data
- The case study with image matching resulted in higher RMSE
- Similar RMSE as using only the most recent remote sensing data
- 9 years is a short time-period in Swedish forestry

Future

- Combination of data sources, e.g. ALS, aerial images, satellite data
- At which unit should we perform the assimilation? Pixels? Stands?
- Comments from the audience?

