

Collection of reference data in the context of remote sensing assisted forest monitoring

Paul Magdon
Geoinformation & Forest Planning
University of Applied Sciences and Arts (HAWK), Göttingen

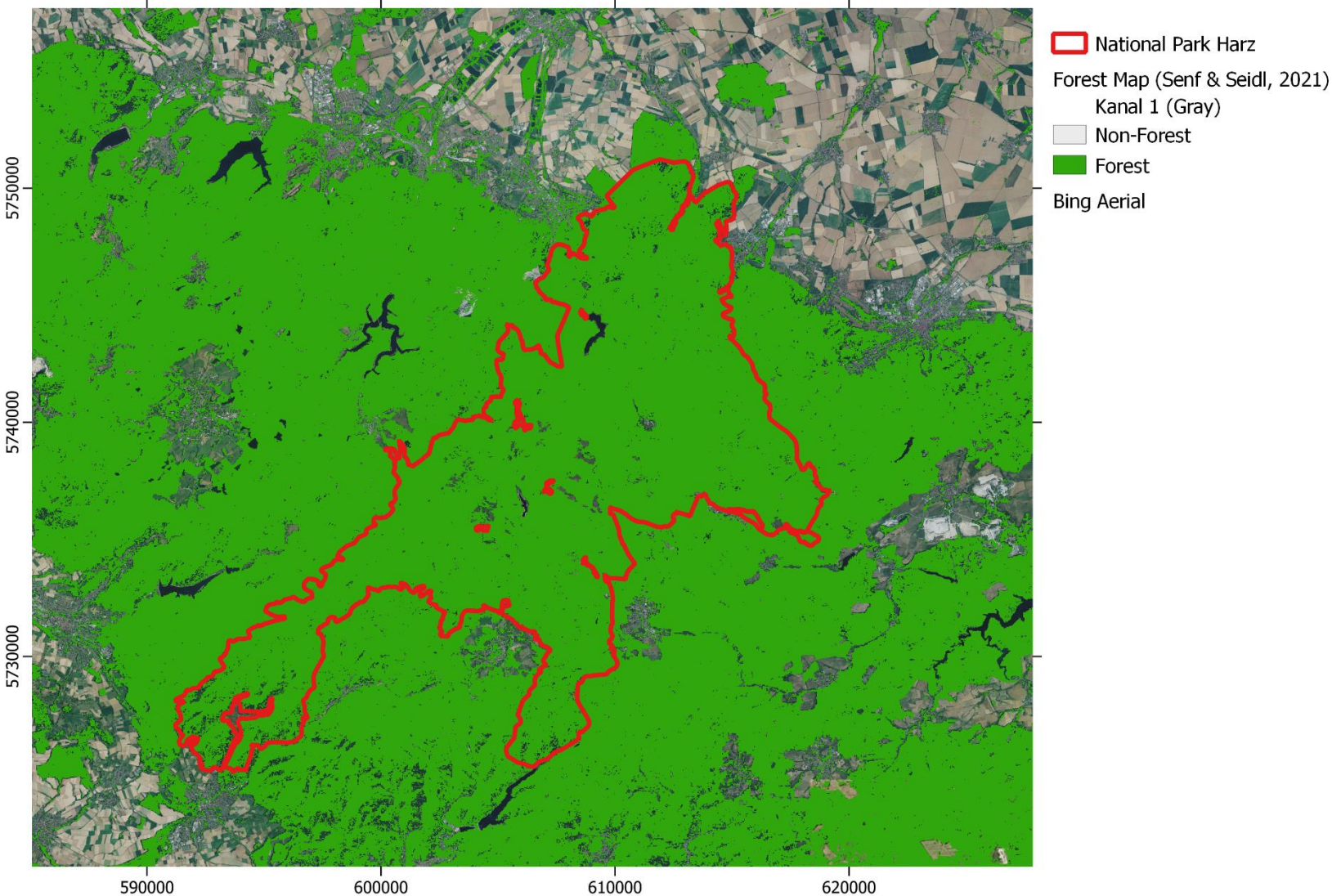
- Why do we need reference data?
- What target variables are relevant in the context of forest monitoring?
- How can such reference data be measured in the field?
- Where to measure the reference data?
- What is the difference between the model and the map accuracy?
- Best practice guidelines for reference data collection and map validations

Tutorials:

1. Collecting reference data based on spectral variability
2. Design-based approaches for map validation of continuous maps

Examples of forest monitoring maps (Categorical)

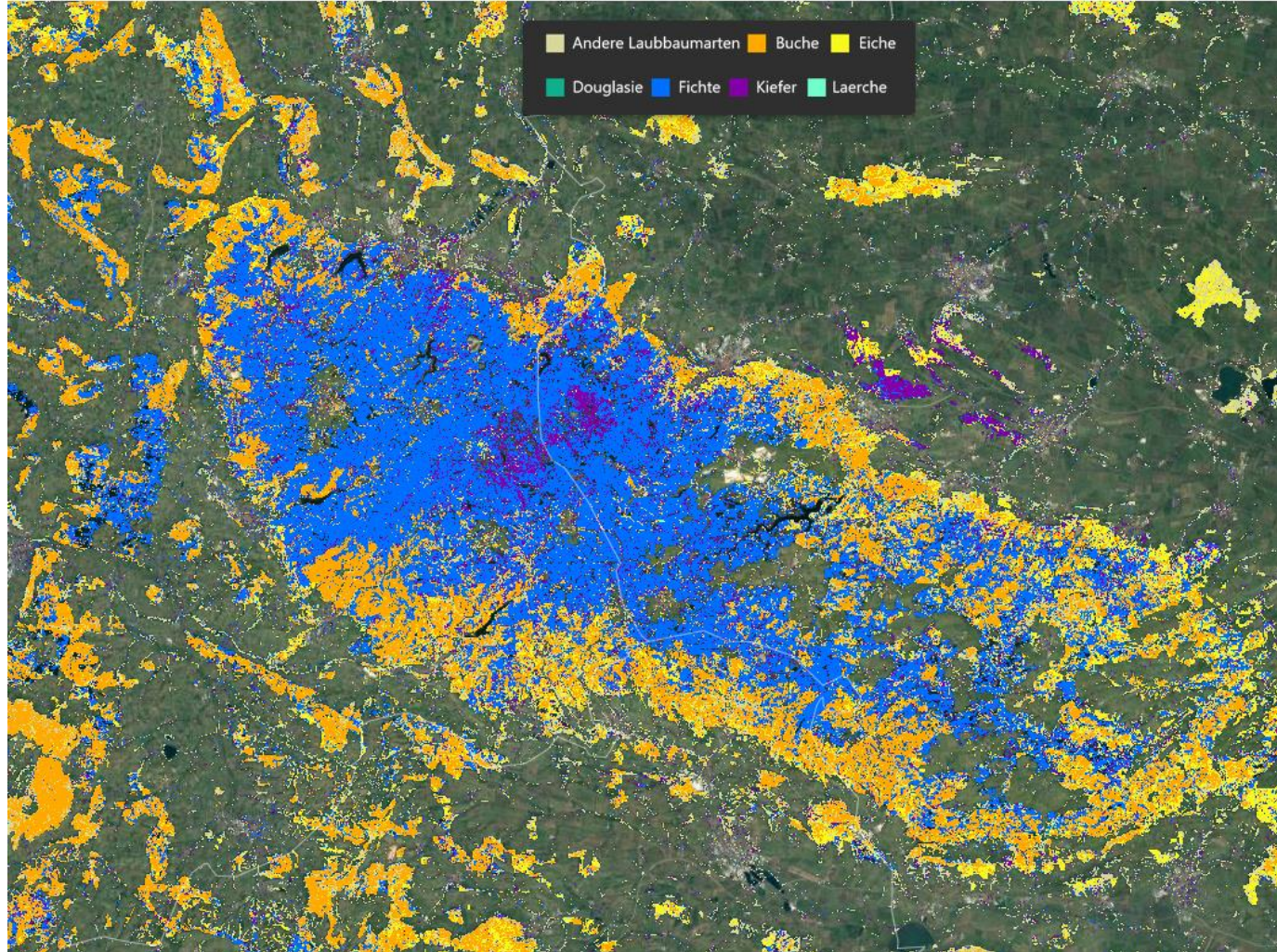
Forest Cover Map



- Forest cover maps are a basic forest monitoring product
- Creating a forest cover map requires a forest definition
- Depending on the forest definitions, high accuracies can be achieved for forest /non-forest classifications
- Important product for the monitoring of forest cover changes in the context of international environmental programs e.g. REDD+& CBD

Data source: Forest cover map based on time series from 1986-2018 (Senf & Seidl, 2021)

Tree species/Forest type maps

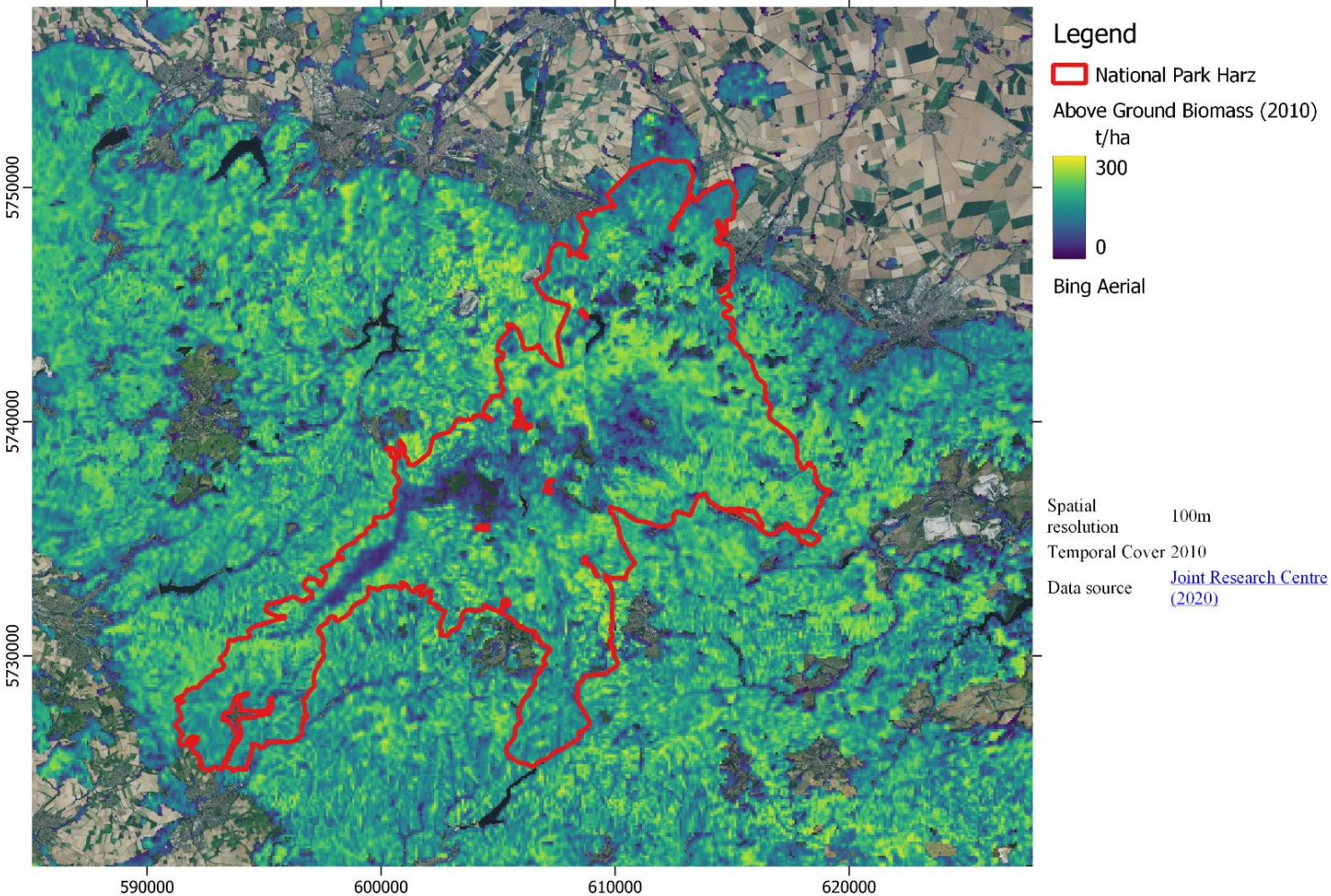


- Forest type and tree species maps are an important forest monitoring product
- Creating forest cover type maps requires a classification key of forest types
- Depending on the classification key/number of species or forest types the classification is quite challenging
- Tree species is one of the most studied variables in forest remote sensing applications
- Separating coniferous and broadleaf tree species often results in high accuracies
- Important product for forest management and nature conservation applications

Data source: Dominant tree species map for Germany, 2017 (Welle et al. 2022)

Examples of forest monitoring maps (Continuous)

Above Ground Biomass (AGB), 2010

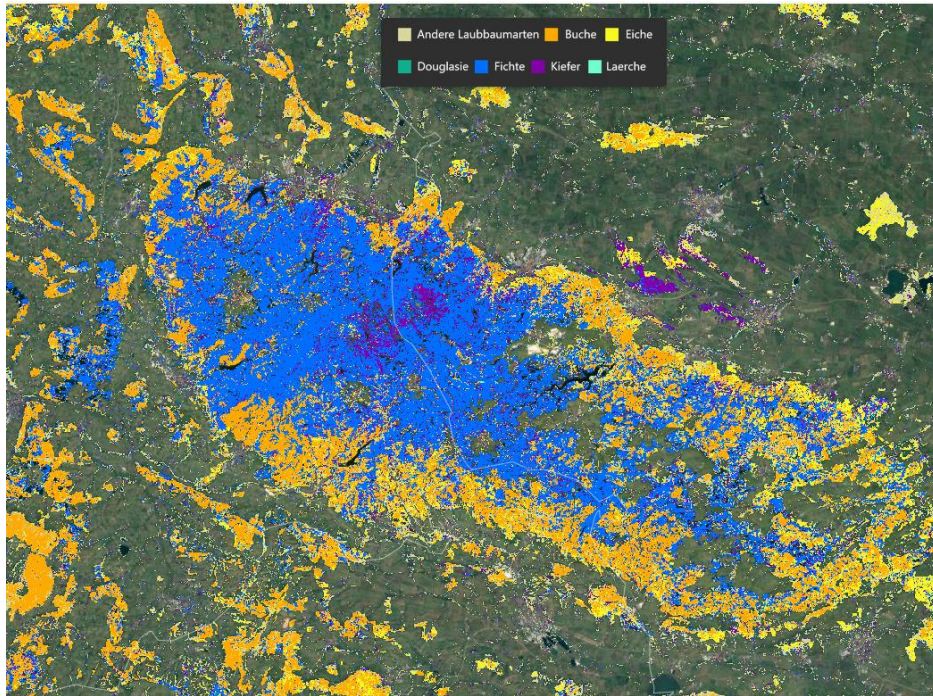


Data source: Above ground biomass, JRC(2020)

- Aboveground biomass provide valuable information on the carbon stock changes of forests -> Unit: t/ha
- Growing stock maps provide important information for forest managers
- Reporting Unit: m³/ha
- Saturation effect for high biomass forests for optical sensors
- Important product in the context of results-based payment schemes for REDD

Introduction/Problem Statement

We are interested in maps depicting relevant environmental information.

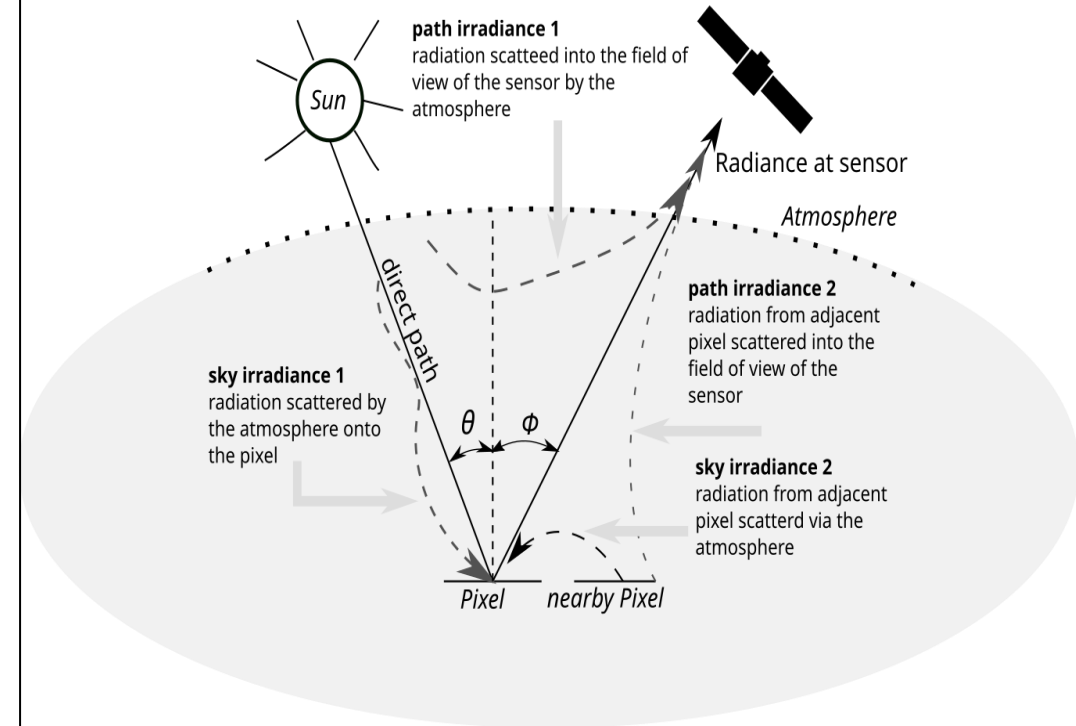


Source: RSS GmbH, <https://www.remote-sensing-solutions.com/waldmonitor-deutschland/#baumartenkarte>



?

We observe reflected electromagnetic radiation.



Often, we cannot observe/measure the target variable directly but we need to predict the values using a model

Reference data

Training data

Used to build the classification model

Requirements:

- Should have high quality
- Need to cover all classes/the value range of the target variables to avoid extrapolation
- Should cover the feature space of the predictor variables

Validation data

Used to validate the model predictions

Requirements:

- Must be different from the training data
- Need to cover the variability of the area where it is applied (AoA)
- Need to be “representative” for the population

How to collect reference data in the context of forest monitoring?

Forest Inventories

How can we compile a reference data set for training a model?

- We need to have field observations at known locations
- But how can we observe/measure e. g. above ground biomass in the field?

Forest Inventory

Scientific discipline:

- Forest mensuration, forest inventory and forest planning are key research areas in forest science and forest ecosystem analysis
- develop methods and models to collect quantitative information on forest ecosystems

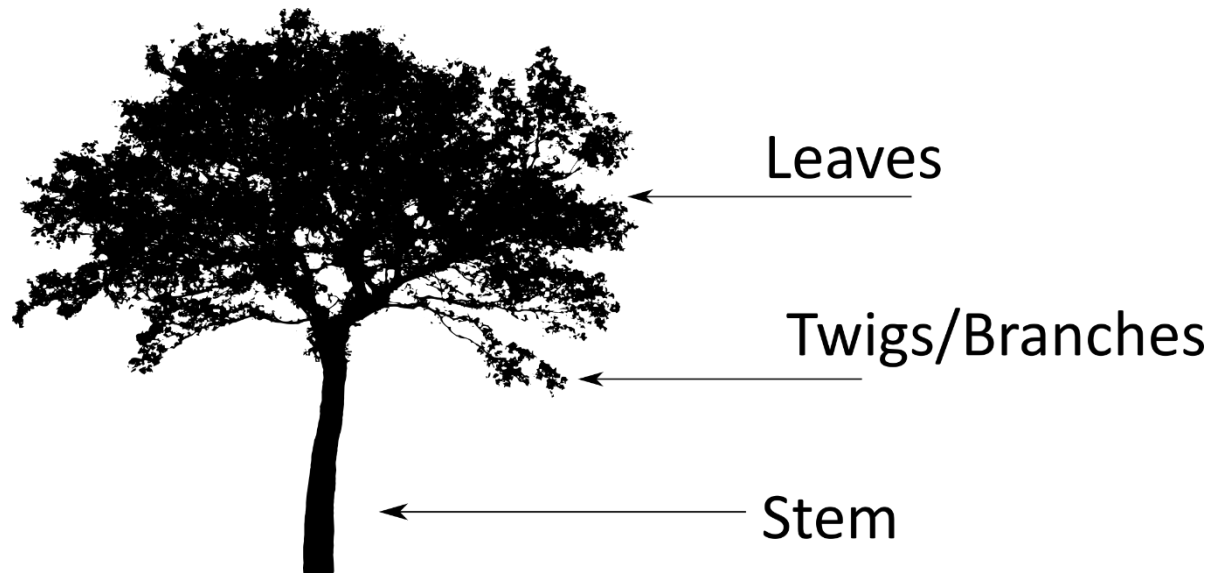
Operational programs:

- Provide information on forest variables such as growing stock, biomass, forest cover or tree species
- Are the basis to implement and enforce sustainable forest management practices
- Support nature conservation programs by the provision of sound information on the effectiveness of conservation strategies



Image: Magdon, P. (2014)

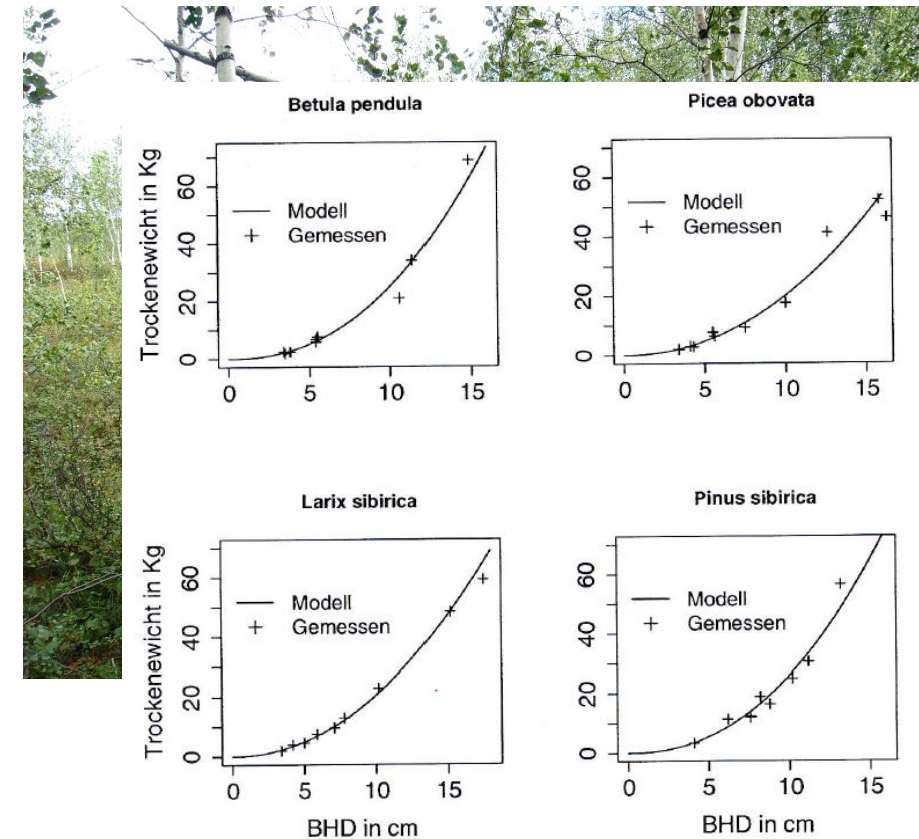
How to „measure“ above ground biomass (t/ha) in the field?



Models are used to predict the single tree biomass based on easy to measure variables like tree height and diameter at breast height (DBH):

- Allometric models, e. g. Chave et al. (2016)
- Conversion factors that convert stem volume to tree biomass

- Can only be measured destructively
- Very laborious and error prone

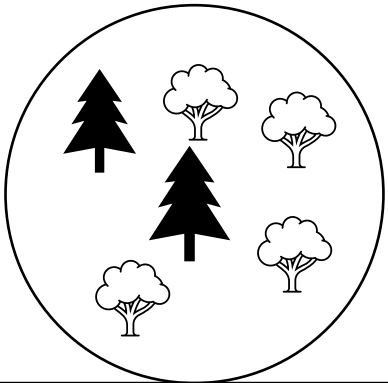
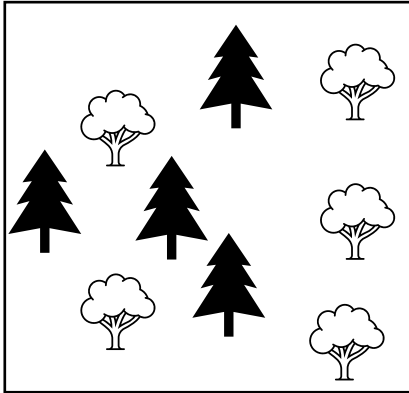


Source: Magdon, P. (2008)

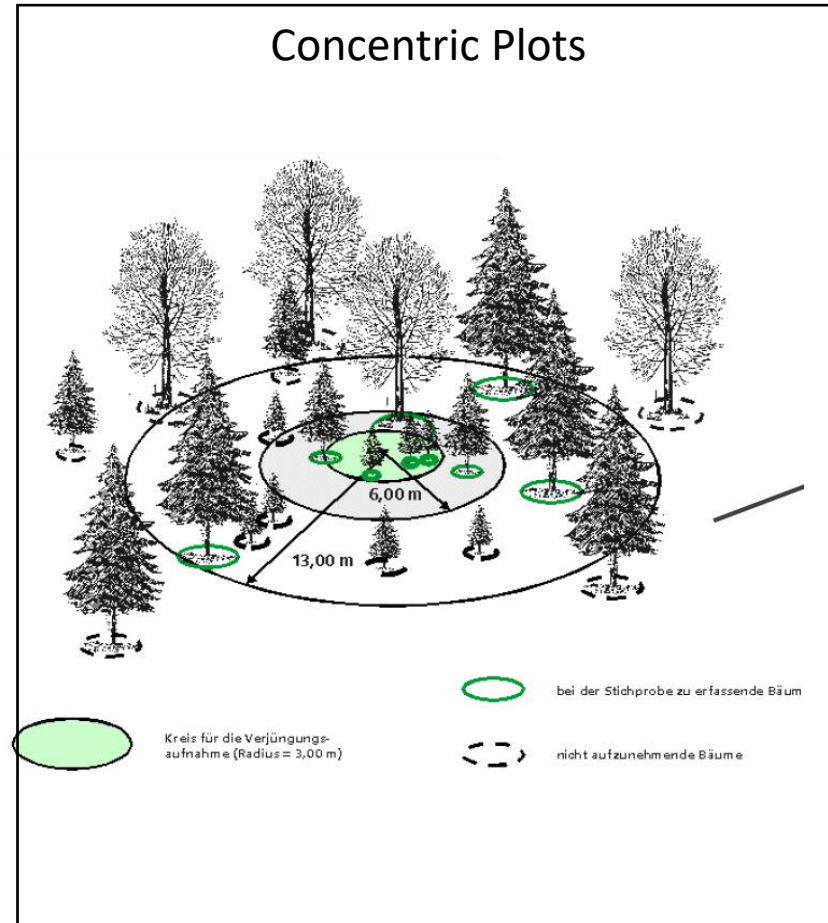
How to select the trees to be measured?

Plot design options:

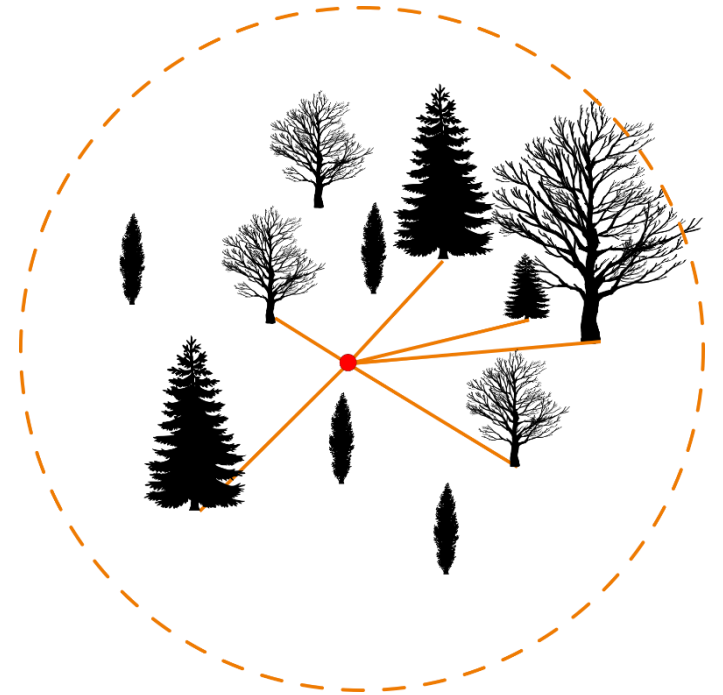
Fixed area plots



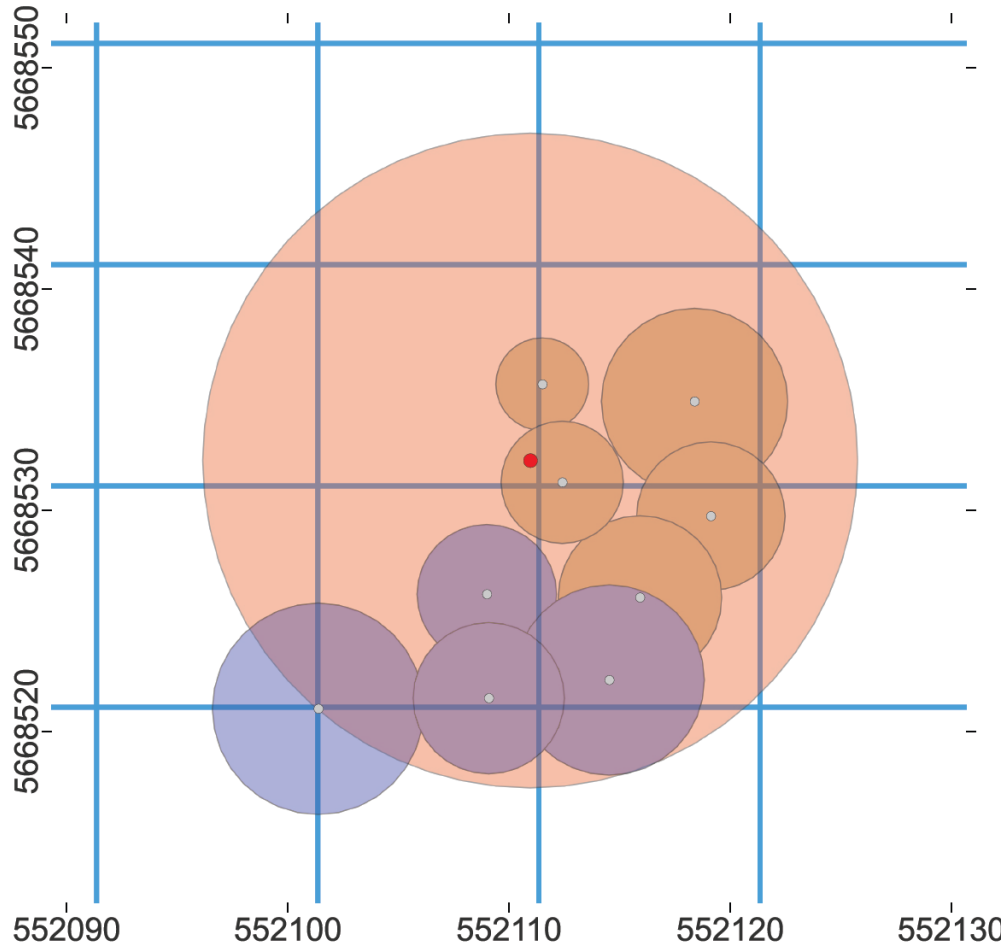
Concentric Plots



Angle count/ Bitterlich sampling



How to link the inventory information to the remote sensing data?



Prerequisite:

Location of the plot center needs to be known precisely -> differential GNSS devices need!

Options:

1. Extract all pixels that are within/touch the fixed area plot and assign a value of the target variable
2. Extract all pixels that are within/touch the fixed area plot calculate aggregated pixel values (*mean, median, sd, min, max, majority, ...*) and assign the plot aggregate of the target variable
3. Calculate the aggregates and assign each pixel that is within/touches the fixed area plot similar values

Compiling a training data set

Where to collect data /Sampling strategies for training data collection?

Requirements towards the training data from a model building perspective:

- Should have high quality
- Need to cover the value range of the predictors
- Need to cover the value range of the target variables
- Should be collected efficiently

Strategies for selecting plot locations for training data collection:

- If information on the spatial distribution of the target variable is available e. g. from existing maps, we can locate plots in every class
- Without such information, we can group according to the pixel values e.g. with PCA & unsupervised clustering
- Additionally, we should check the range of the pixel values between training and image dataset

The screenshot shows a ResearchGate post by Paul Magdon, a researcher at Hochschule für angewandte Wissenschaft und Kunst - Hildesheim. The post title is "What are your strategies for selecting train data for supervised land cover classification?". It was asked on November 13, 2012. The post content describes a common task in remote sensing: producing land cover maps using supervised classifiers, which requires reference data. The author asks for strategies regarding sampling, plot design, and statistical constraints like sample size and efficiency. Below the question, there is a section for "Promote the best answer to your question" and a list of tags: Remote Sensing, Remote Sensing Applications, Classification, Statistical Data Analysis, and Remote Sensing and GIS. The post has 17 recommendations and is followed by two answers. The first answer is from a deleted profile, dated November 13, 2012, advising to check papers by Foody and Stehman. The second answer is from Niklaus E Zimmermann, also dated November 13, 2012.

<https://www.researchgate.net/post/What-are-your-strategies-for-selecting-train-data-for-supervised-land-cover-classification/1>

References

- Senf, C. and Seidl, R. (2021) Mapping the forest disturbance regimes of Europe. *Nature Sustainability*, 4, 63-70. <https://doi.org/10.1038/s41893-020-00609-y>
- Welle, T.; Aschenbrenner, L.; Kuonath, K.; Kirmaier, S.; Franke, J. Mapping Dominant Tree Species of German Forests. *Remote Sens.* 2022, 14, 3330. <https://doi.org/10.3390/rs14143330>
- European Commission, Joint Research Centre (JRC) (2020): Forest Biomass Map of Europe. European Commission, Joint Research Centre (JRC) [Dataset] PID: <http://data.europa.eu/89h/d1fdf7aa-df33-49af-b7d5-40d226ec0da3>
- Chave, J., Réjou-Méchain, M., Búrquez, A., Chidumayo, E., Colgan, M.S., Delitti, W.B., Duque, A., Eid, T., Fearnside, P.M., Goodman, R.C., Henry, M., Martínez-Yrízar, A., Mugasha, W.A., Muller-Landau, H.C., Mencuccini, M., Nelson, B.W., Ngomanda, A., Nogueira, E.M., Ortiz-Malavassi, E., Péliissier, R., Ploton, P., Ryan, C.M., Saldarriaga, J.G. and Vieilledent, G. (2014), Improved allometric models to estimate the aboveground biomass of tropical trees. *Glob Change Biol*, 20: 3177-3190. <https://doi.org/10.1111/gcb.12629>
- Magdon, P. (2008): Erfassung und Analyse der räumlichen Variation von Kohlenstoffvorräten in einem sibirischen Wald-Tundra Ökosystem. , Masterthesis, Faculty of Forest Science and Forest Ecology, University of Göttingen, Germany.