



# Research group SiMPL

## Soil Modelling and Prediction on Land

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# Research objectives

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Investigate the spatial distribution of soil properties in Norway

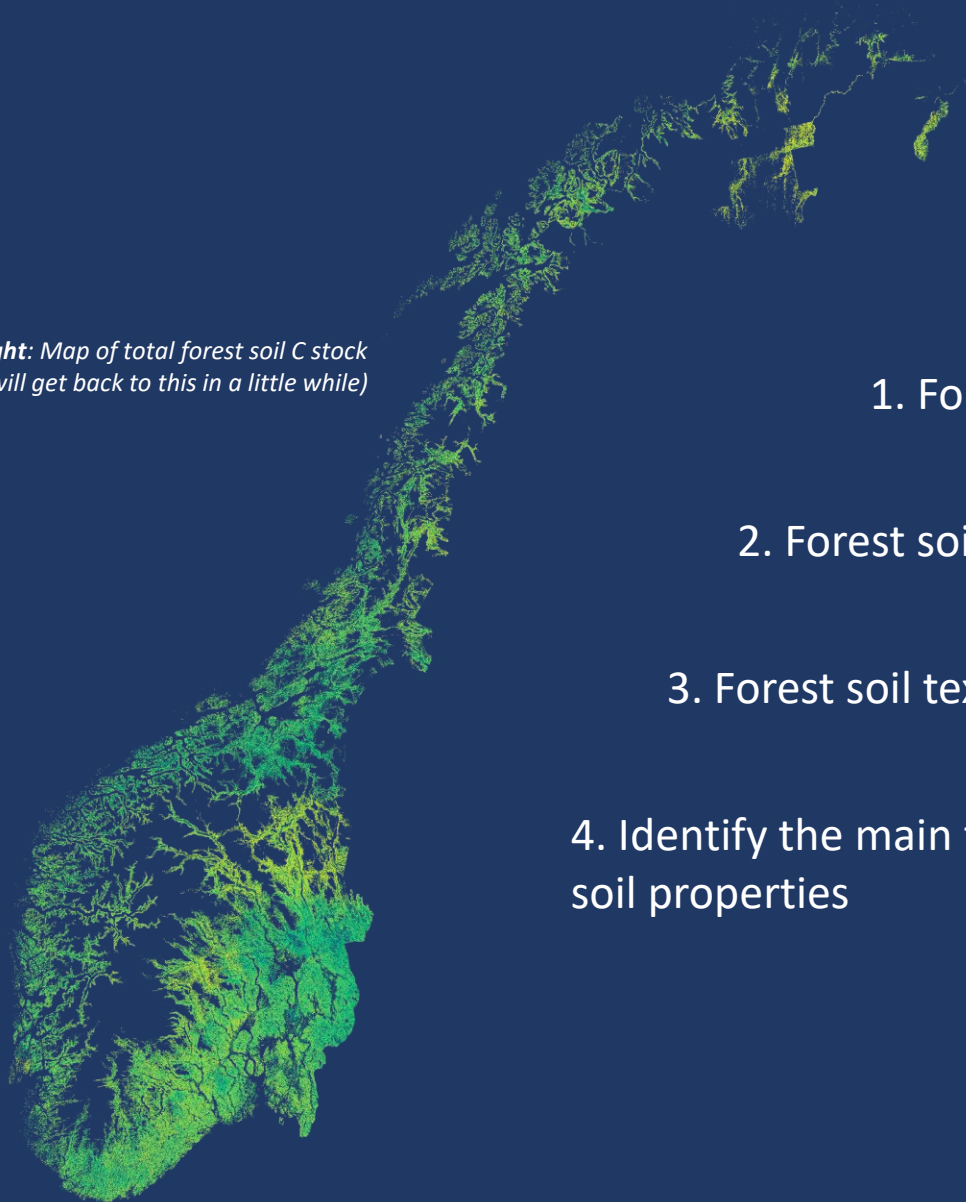
1. Forest Soil C stocks

2. Forest soil depth

3. Forest soil texture

4. Identify the main factors related to variation in the various soil properties

*Right: Map of total forest soil C stock  
(I will get back to this in a little while)*



# Method – response variables

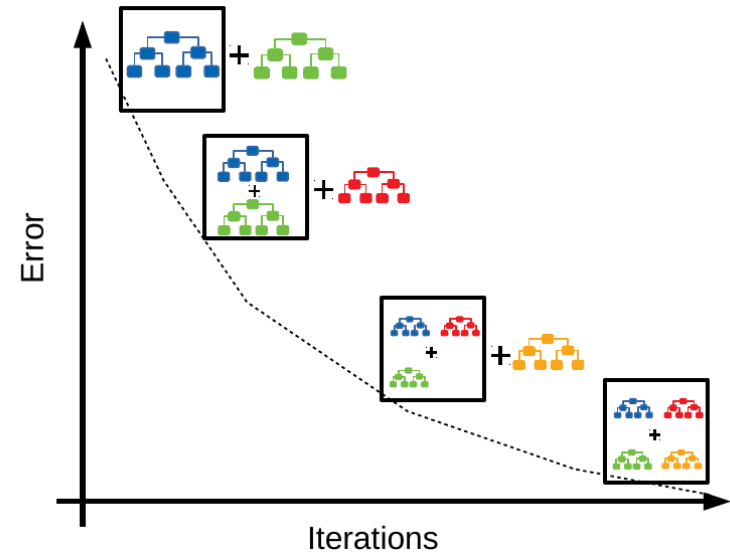
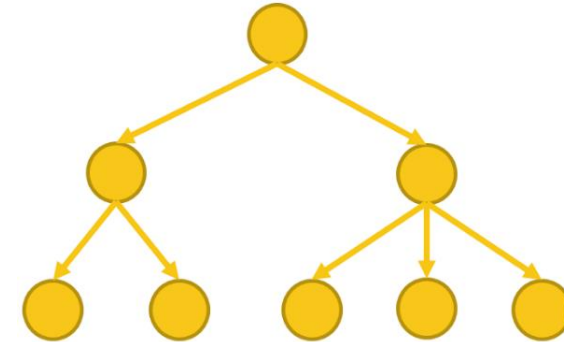
## Boosted regression tree (BRT) models

*Allows for the predictive modelling of highly non-linear systems where casual mechanisms are poorly understood, such as soils*

### Response variables from ICP forest level 1:

- Soil C contents (across five different soil layers)
  1. Total soil C
  2. Soil C stock between 0 – 1 m
  3. Soil C stock between 0 – 30 cm
  4. LFH horizon C
  5. Mineral horizon C stock, 0 – 30 cm
- Soil depth
- Soil texture frequency of sand, silt and clay + occurrence of rock and gravel. Grouped into 30 texture categories:
  - 5 levels of sand (33% to 92%)
  - 4 levels of silt (6% to 58%)
  - 3 levels of clay (3 to 15%)
  - 4 levels of stone and gravel (vol%: 16% to 76%)

Single Decision Tree



# Method – explanatory variables

## Two different types of BRT models with two different sets of variables:

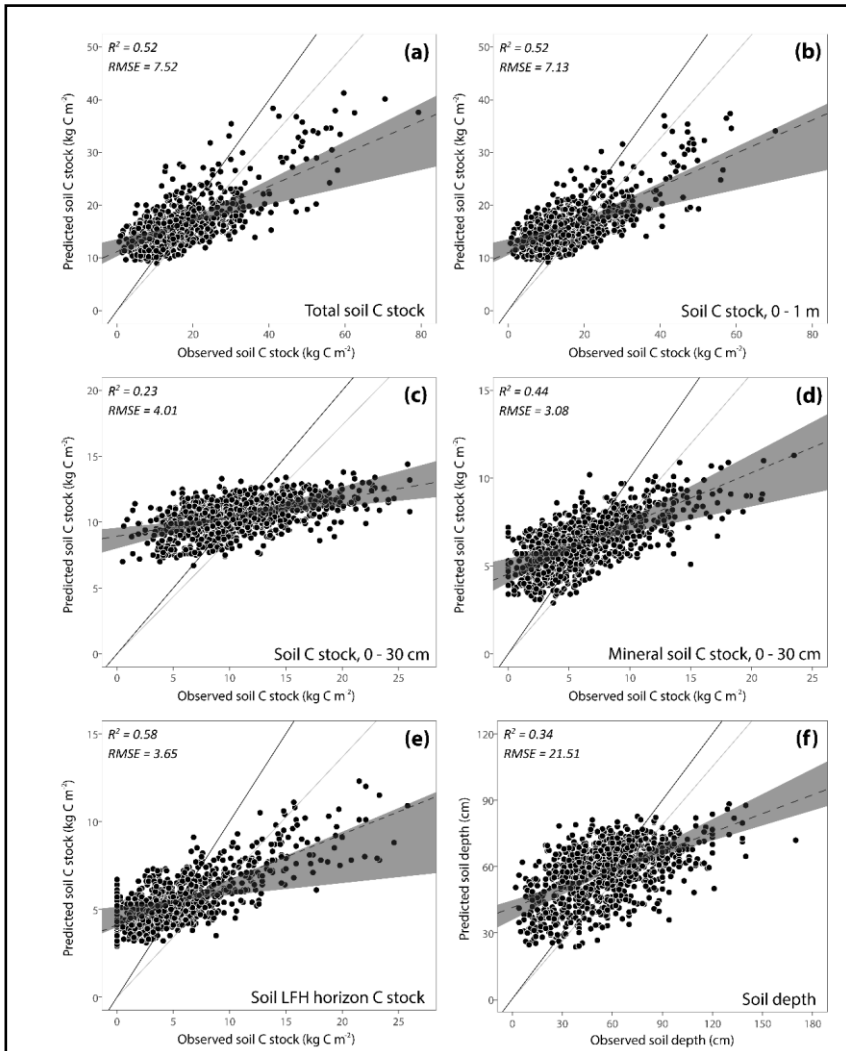
### *1) Mapping models – used to generate maps of soil properties:*

**Geographical variables** (coordinates), **terrain variables** (e.g. slope, depth to water), **forest properties** (e.g. tree crown cover, stand height), **monthly precipitation**, **monthly temperature**, **remote sensing data from Sentinel 2** (e.g. NDVI), **categorical variables** (AR5, soil parent material)

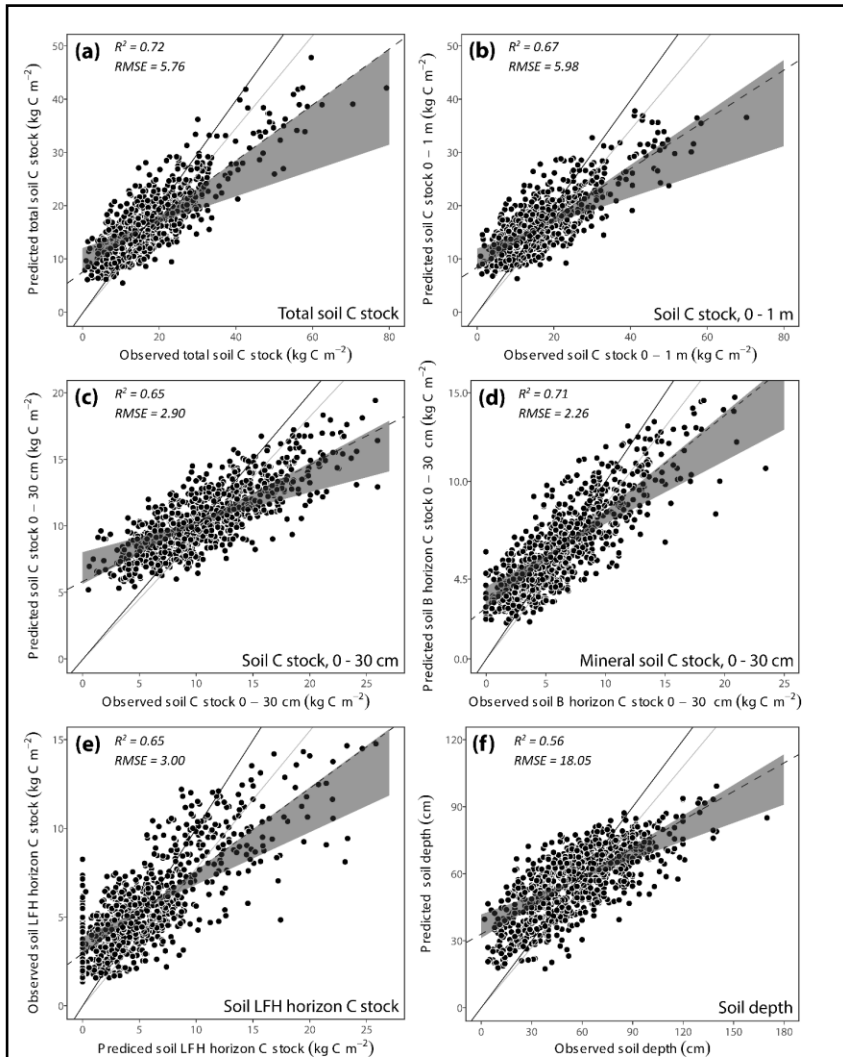
### *2) Maximum prediction models – used to assess the maximal predictive capacity we can achieve with the BRT model approach*

**Mappin variables + variables of soil chemistry** (e.g. kjeldahl N, Olsen P, pH, Al, Mn, S, Zn, etc...) for different depths between 5-15 cm in humus and 5 – 15 in mineral soil layers

# Predictions of soil C stocks and depth



**Mapping models**  
*Used for generating maps*



**Maximum prediction models**  
*Used to investigating the drivers of soil C*

## Mapping models

$R^2$  ranging from 0.58 – 0.34

## Maximum prediction models

$R^2$  ranging from 0.73 – 0.56

# Soil C predictions

## Means

Total soil C: **15.5** kg C m<sup>-2</sup> (**155** ton C ha<sup>-2</sup>)

Soil C stock 0 – 1 m: **15.6** kg C m<sup>-2</sup>

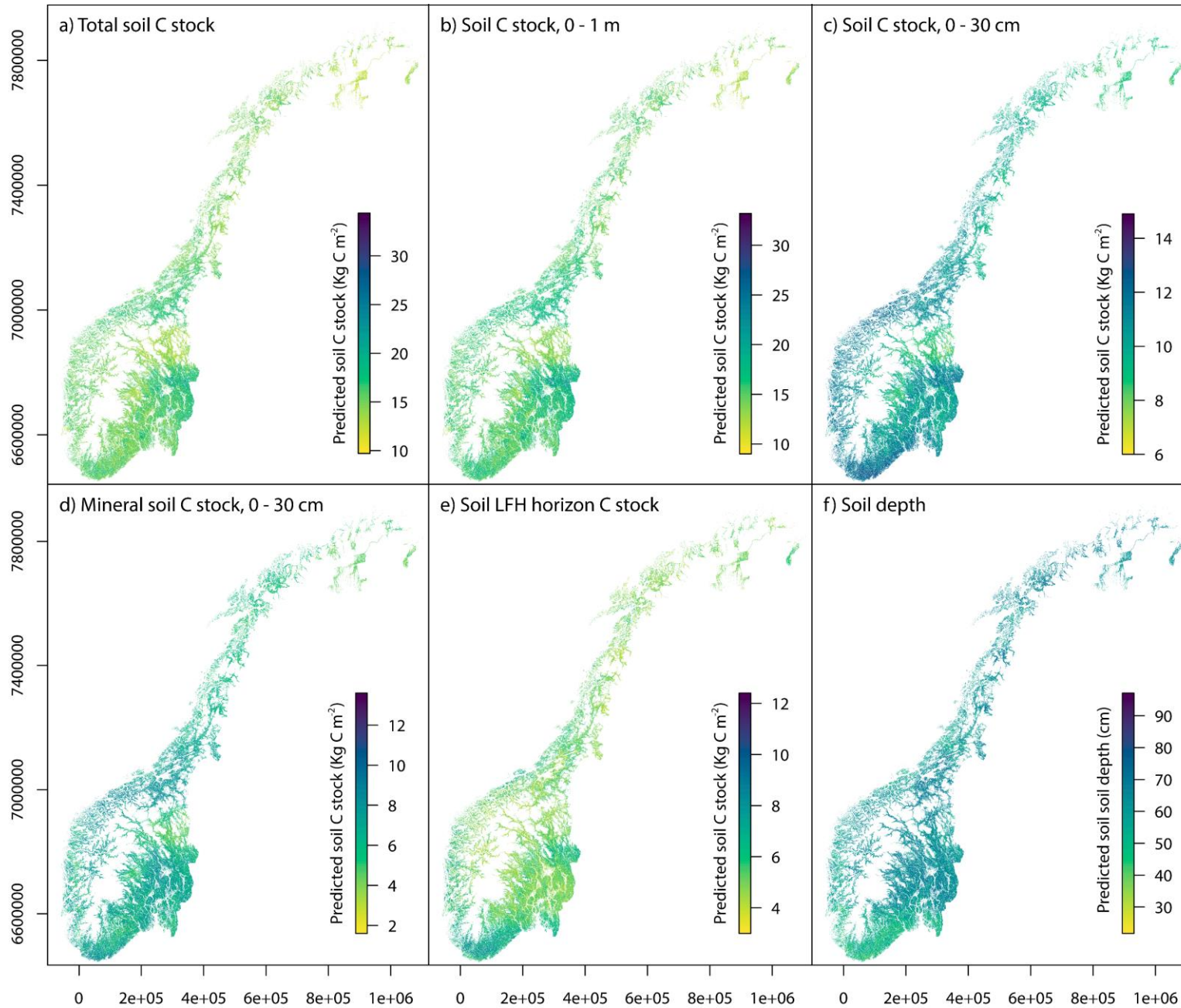
Soil C stock 0 – 30 cm: **10.4** kg C m<sup>-2</sup>

## Means

Mineral soil C stock 0 – 30 cm: **6.6** kg C m<sup>-2</sup>

LFH horizon C stock: **5.4** kg C kg C m<sup>-2</sup>

Soil depth: **60.7** cm



# Norwegian forest soils C stock

Mean total soil C: **15.5** kg C m<sup>-2</sup> (**155** ton C ha<sup>-2</sup>)

Sum total soil C stock: **1.47** Pg C

## In perspective:

- C stock in tree living biomass in Norway is about 0.5 Pg C
- **Thus, up to 66% of the total forest C stock is in soil**  
*Similar to the results of previous studies; 70% (Pan et al. 2011)*

## Did you know?

1.47 Pg C is similar to the the annual emission from tropical land-use (1.3 Pg C yr<sup>-1</sup>; Pan et al. 2011)...

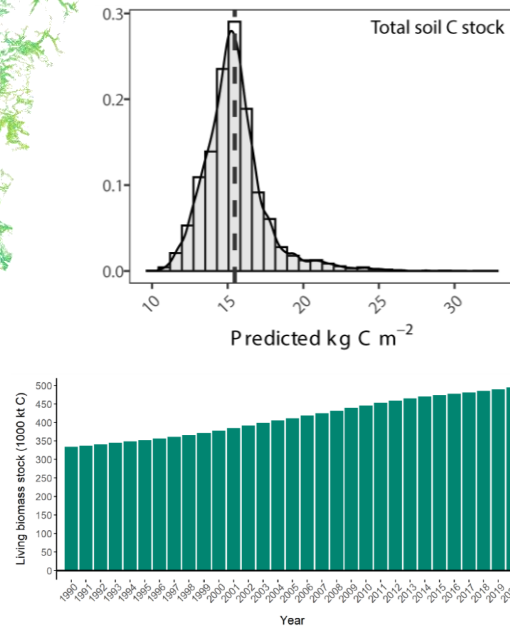
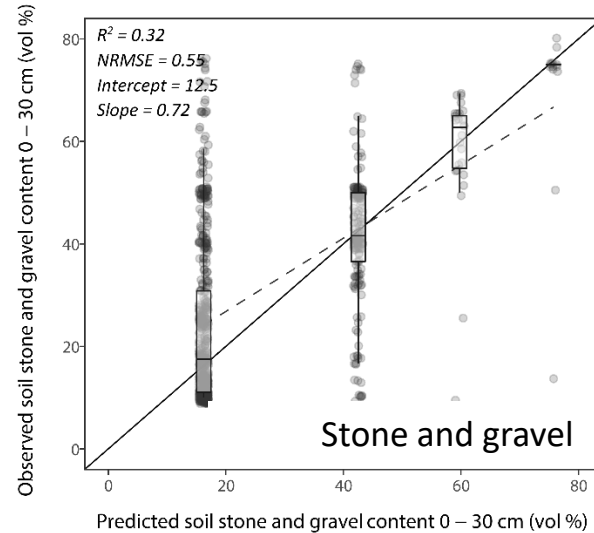
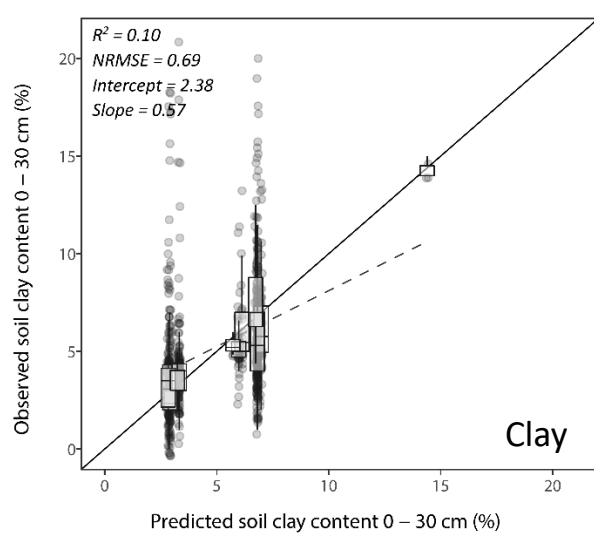
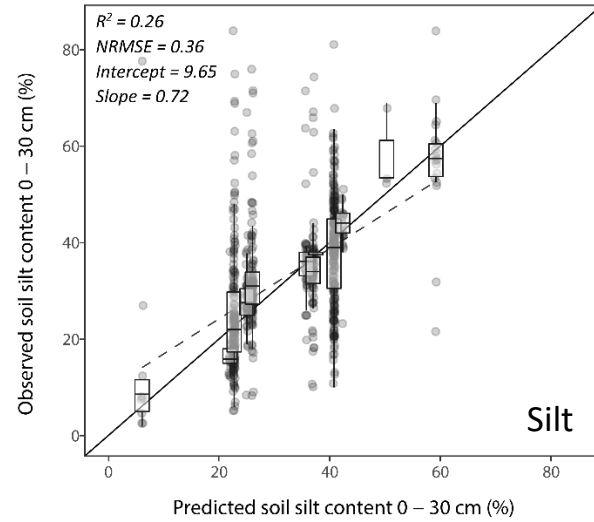
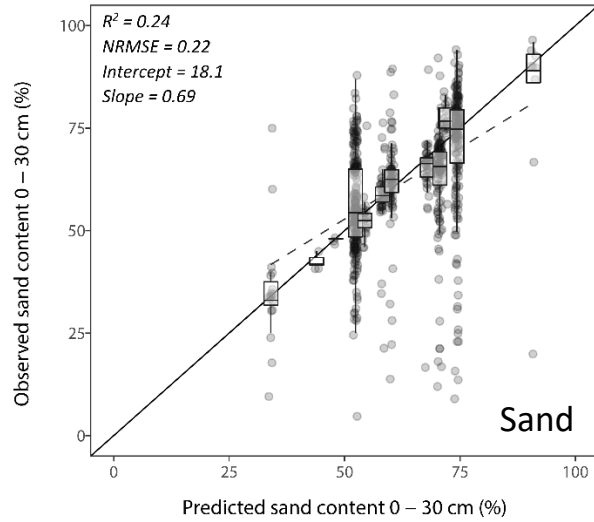


Figure 6.3 Development of the C stock in tree living biomass on forest land from 1990-2020. Source: Norwegian Institute of Bioeconomy Research.

# Predictions of soil texture

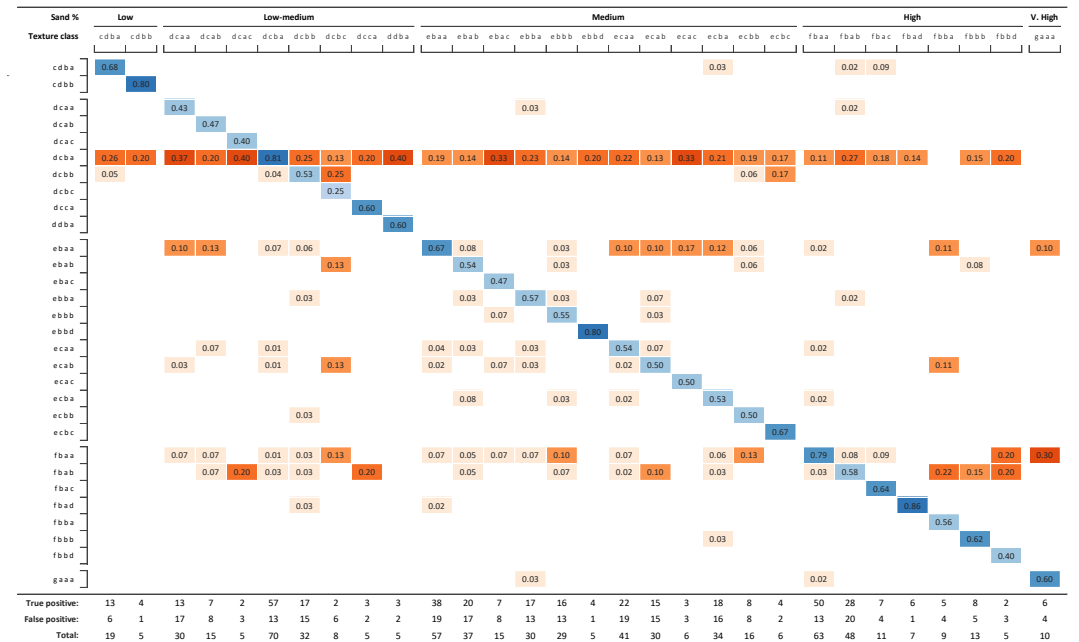


## Mapping models

61% success rate in selecting the correct class

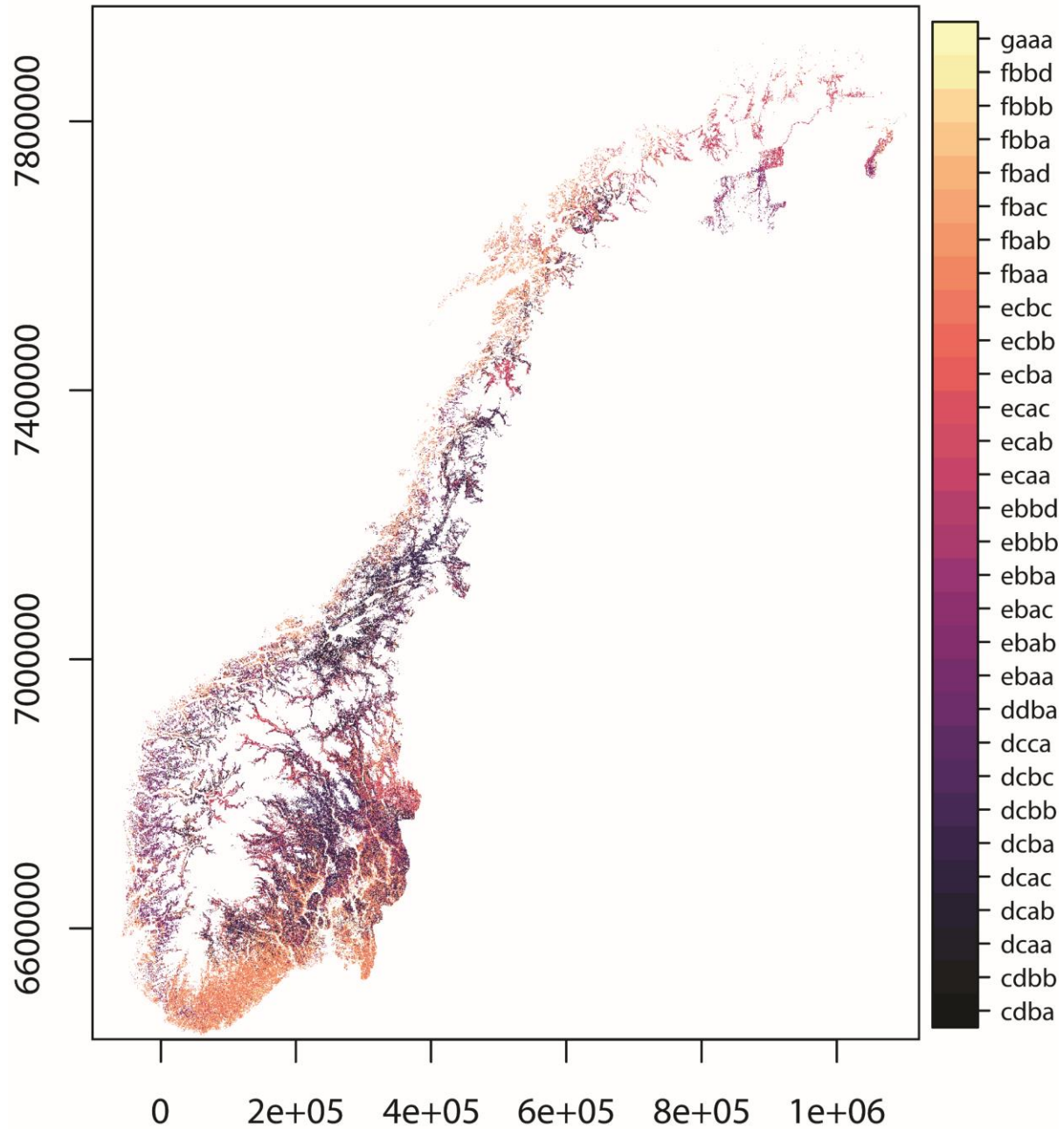
$R^2$  ranging from 0.10 – 0.32

Most of the error stems from the model incorrectly selecting the most common texture class in the data-set



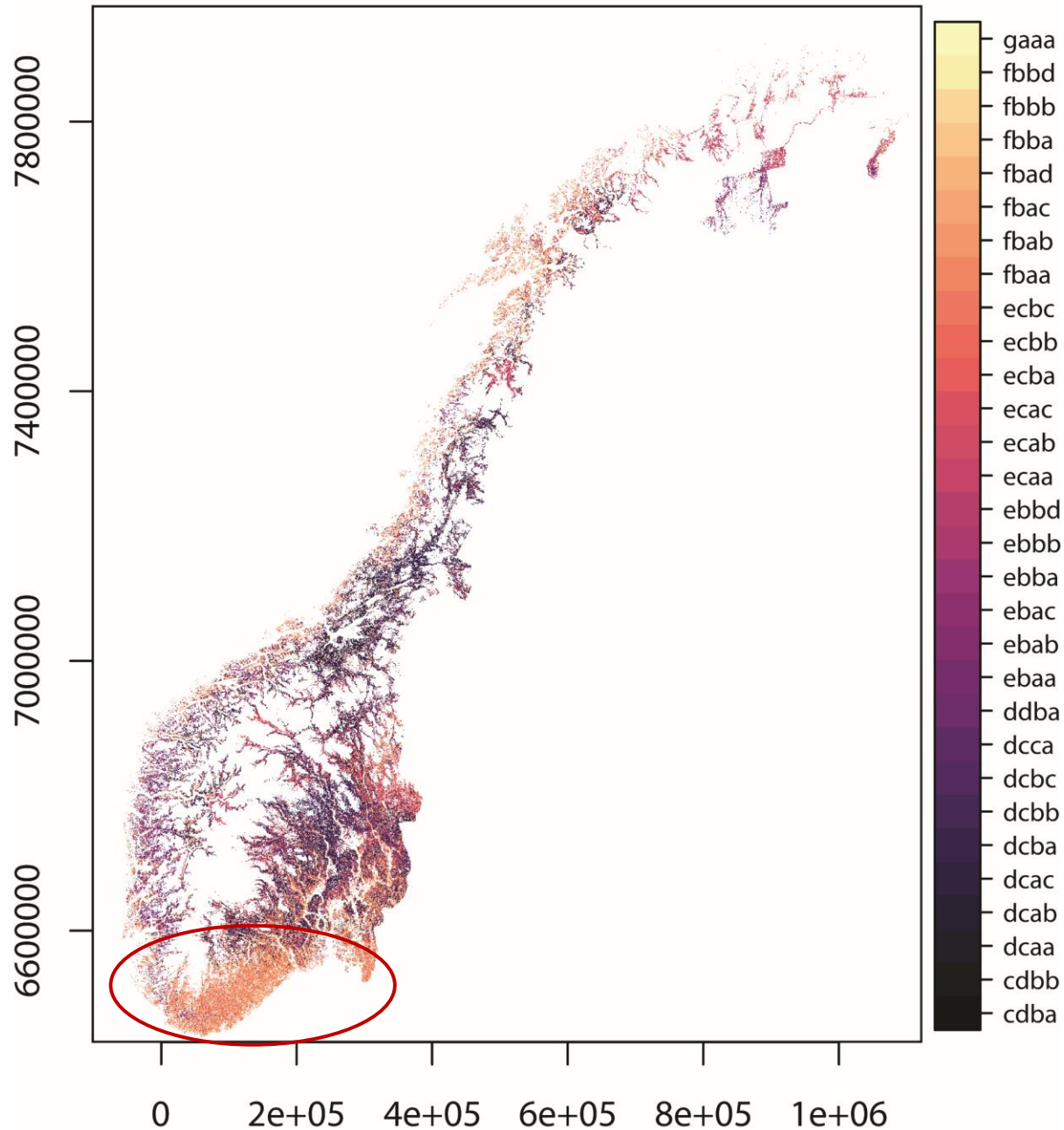


# Forest soil texture



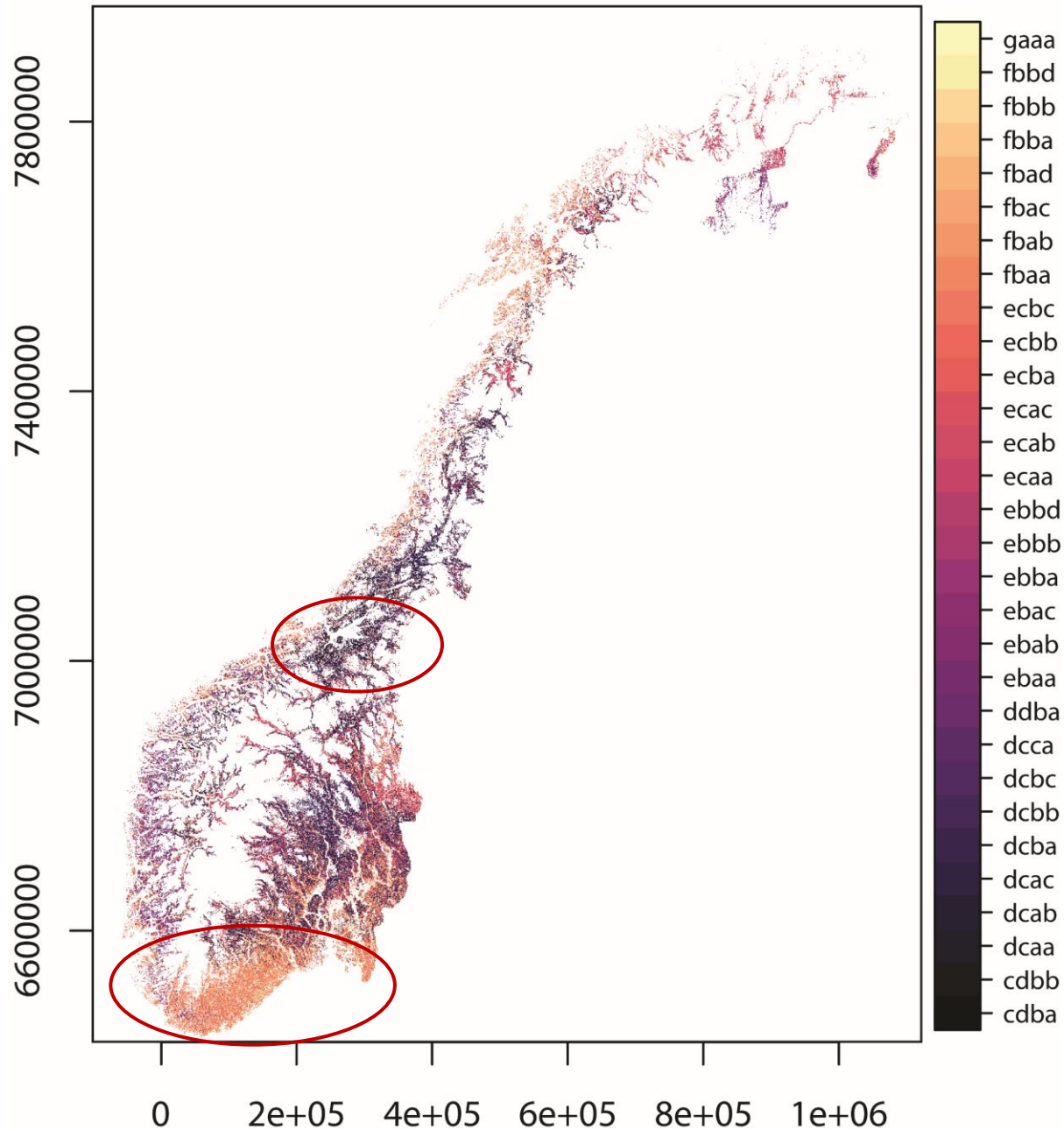
- 30 different soil texture classes
- 16 x 16 m resolution

# Forest soil texture



- 30 different soil texture classes
- 16 x 16 m resolution
- Sandy soils frequent at the southern coast

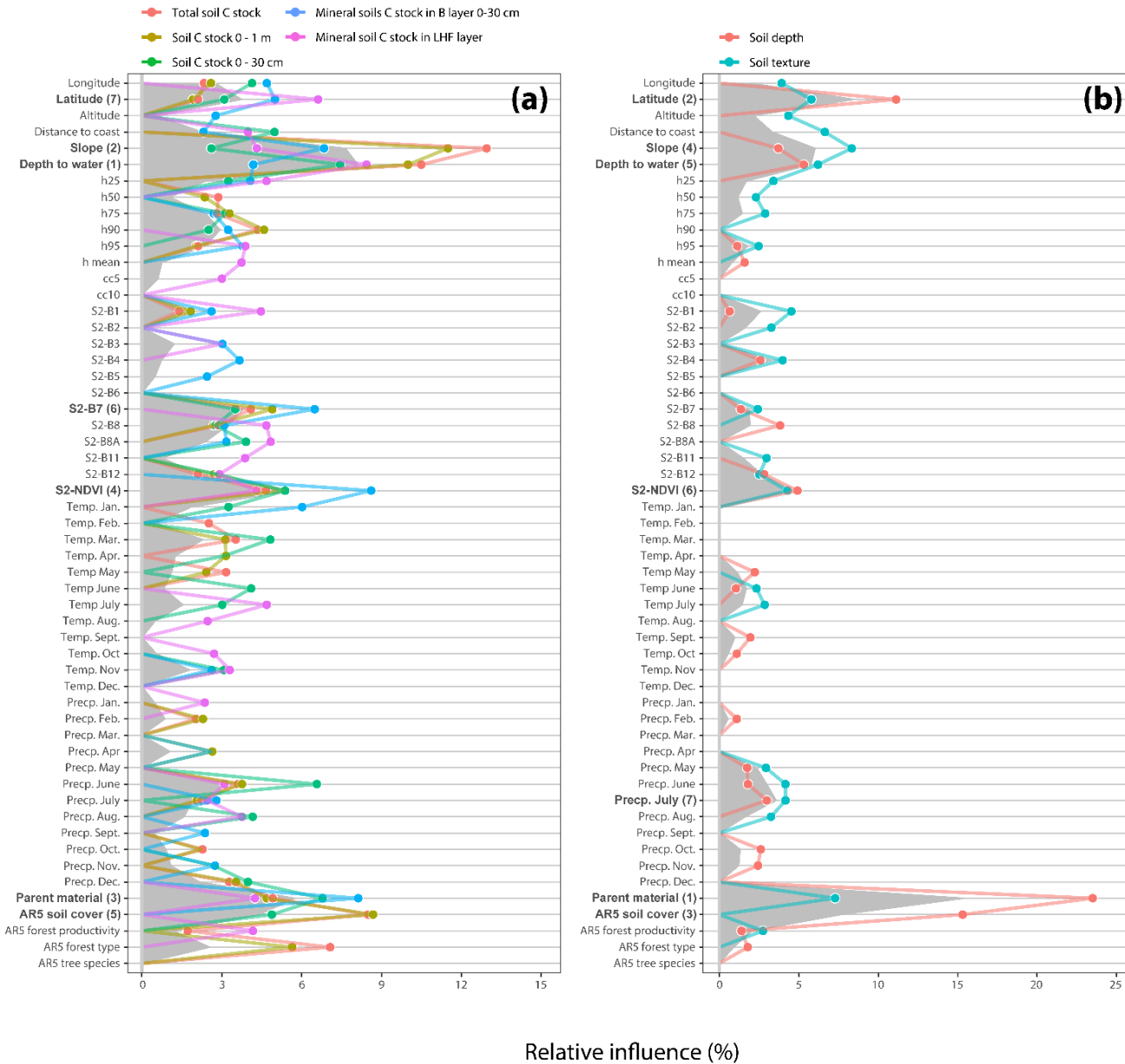
# Forest soil texture



- 30 different soil texture classes
- 16 x 16 m resolution
- Sandy soils frequent at the southern coast
- Low sand content in southern Trøndelag (thus more silt and clay)

# Relative influence of variables

## BRT models used for mapping



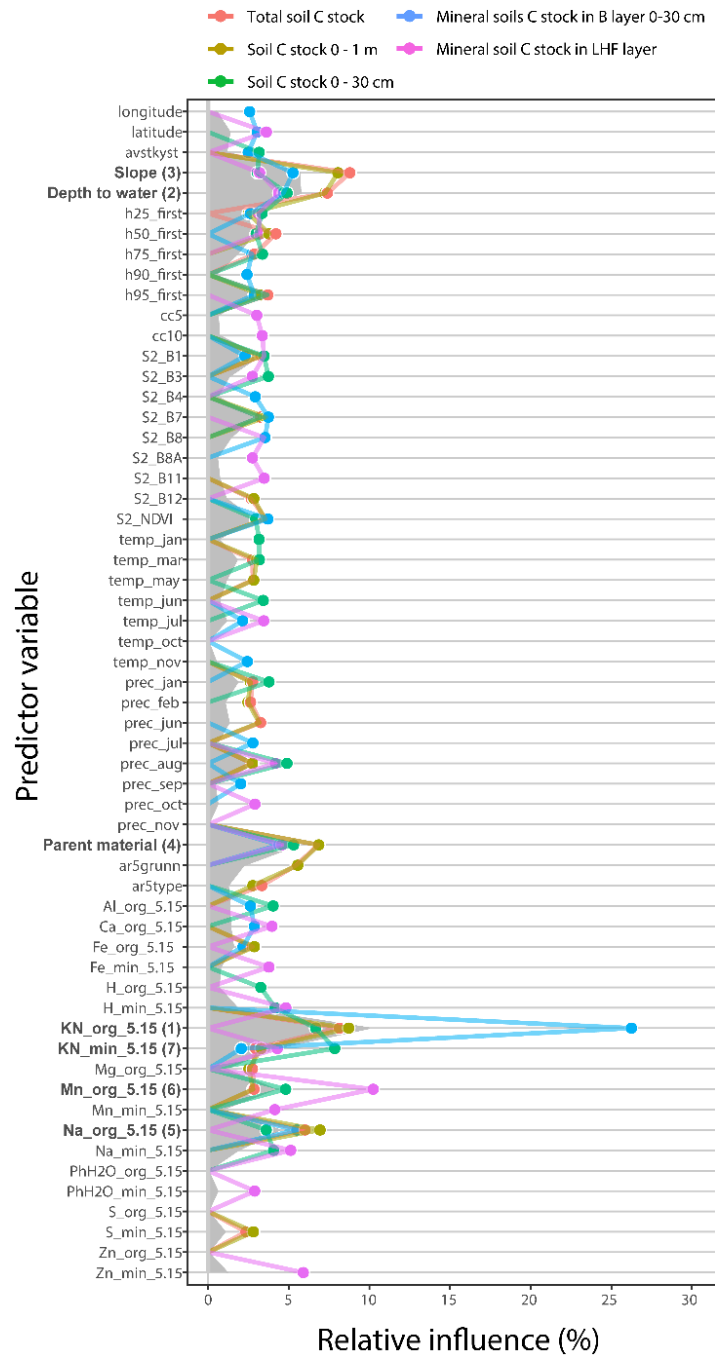
### a) Soil C stocks

1. Depth to water
2. Slope
3. Parent material
4. NDVI (veg. index)
5. Soil cover
6. Band 7 (NIR)
7. Latitude

### b) Soil depth & texture

1. Parent material
2. Latitude
3. Soil cover
4. Slope
5. Depth to water
6. NDVI
7. July precipitation

*Depth to water, slope, NDVI and parent material are important predictors in the mapping models.*



# Relative influence of variables BRT models with soil chem. var.

## Soil C stocks

1. Humus layer Kjeldahl N (+)
2. Depth to water (-)
3. Slope (-)
4. Parent material
5. Humus Na content (+)
6. Humus Mn content (-)
7. Miner layer Kjeldahl N (+)

*Depth to water, slope, and parent material are still strong predictors, but content of N and Mn are also important.*

*Increase in soil C with Kjeldahl N  
Decrease in C with Mn*

# Summary of results

## **Forest soil C stocks**

Total forest soil C stock is predicted at 1.47 Pg C, about 66% of the total forest C stock

Depth to water and slope are the strongest predictors, inclusion of data of soil chemistry improve the predictions, but all models display calibration issues.

**Nice to have maps of soil C, but one must consider their restricted predictive performance...**