

Can we improve the accuracy of the land cover classification by pre-selection of the reference samples and applying DEM in the mountain area in Norway?

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InCoNaDa Project– “Enhancing the user uptake of Land Cover / Land Use information derived from the integration of Copernicus services and national databases”

One of the goals:

- to developed the most accurate land cover map based on a time series of Sentinel-2 data using machine learning approach.

Consortium

- Institute of Geodesy and Cartography (IGiK),
- Norwegian Institute of Bioeconomy Research (NIBIO),
- Institute of Environmental Protection – National Research Institute (IEP-NRI),
- Łódź University of Technology (LUoT),
- Eversis Sp. Z o.o.



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EVERSIS

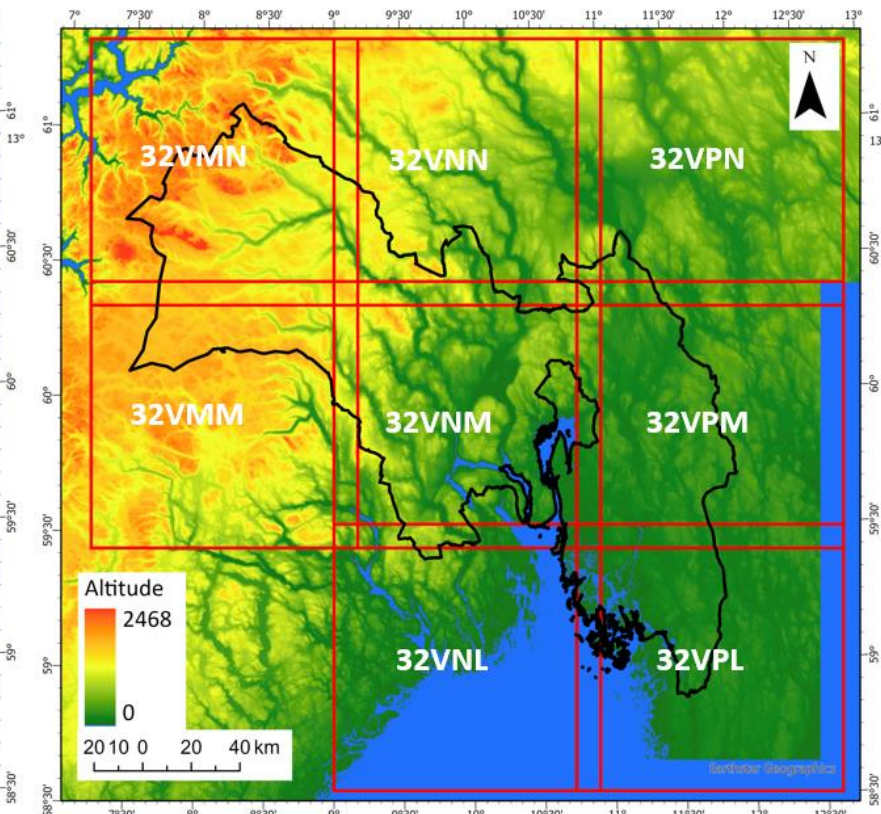
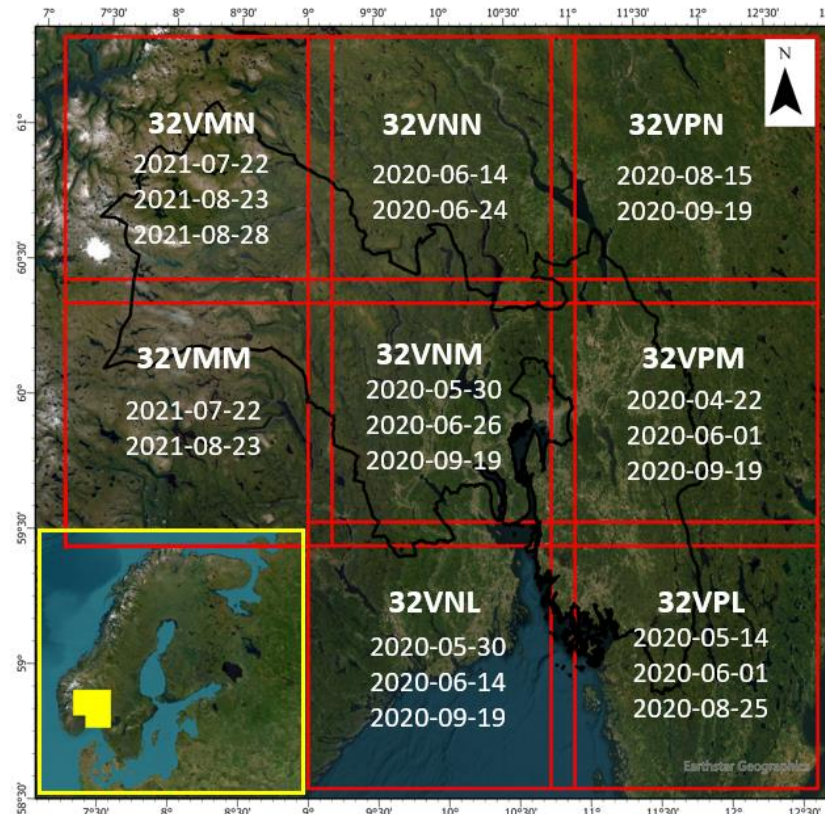
Study area and land cover classes

Objectives:

- to develop land cover map,
- to assess the impact of reference data on the classification result,
- to assess the impact of the Digital Elevation Model on the accuracy of classification.

The land cover classes:

- sealed surfaces,
- woodland coniferous,
- woodlands broadleaved,
- low vegetation,
- permanent herbaceous,
- periodically herbaceous,
- mosses,
- non- and sparse vegetation,
- water,
- snow and ice.



AR50 is the Norwegian medium-resolution land resource dataset, which covers the whole of mainland Norway, scale of 1:50 000. Features in AR50 are polygons with attributes assigned according to the AR50 classification criteria. The primary classification is using nine land types representing a combination of land cover and land use. The primary classes are built-up areas, agriculture, forest, peat bogs, open areas, glaciers, fresh water, oceans and not mapped area. The minimum mapping unit for the primary classes in AR50 is 1.5 hectares.

AR5 is a more detailed version of the AR50 database and includes land cover information below the tree line.

Reference points:

- points created randomly,
- an internal buffer of 10 m and 20 m for water was applied,
- proportions: 2 points per km²,
- minimum of 20 m distance between points,
- minimum of 200 points for one class on one granule,
- points divided into: 60% training and 40% verification.

ARTYPE/arealtype (land type)

Value	Land type
10	Built-up area
20	Agriculture
30	Forest
50	Open land
60	Peat bog
70	Glacier and permanent snow
81	Fresh water
82	Ocean
99	Not mapped

ARSKOGBON/skogbonitet (forest site class)

Value	Forest site class
18	High/particularly high productivity
13	Medium productivity
12	Low productivity
11	Non-productive
98	Not relevant
99	Not recorded

ARJORDBR/jordbruk (agricultural)

Value	Arable land
24	Fully and surface cultivated land
25	Pasture-land
98	Not relevant
99	Not recorded

ARVEGET/vegetasjonsdekke (open land)

Value	Open land
51	Not vegetated
52	Sparse vegetation
53	Lichen
54	Intermediate vegetation
55	Vigorous vegetation
98	Not relevant
99	Not recorded

ARTRESLAG/treslag (tree type)

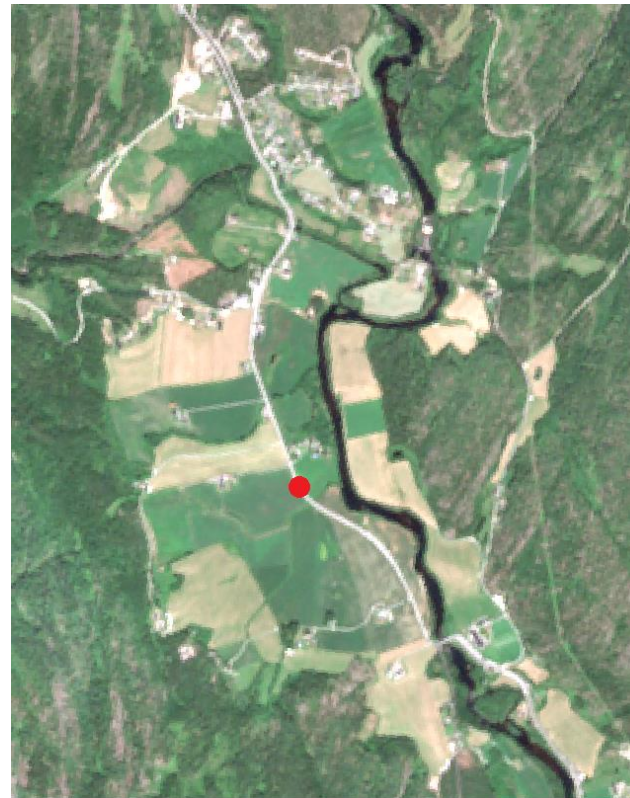
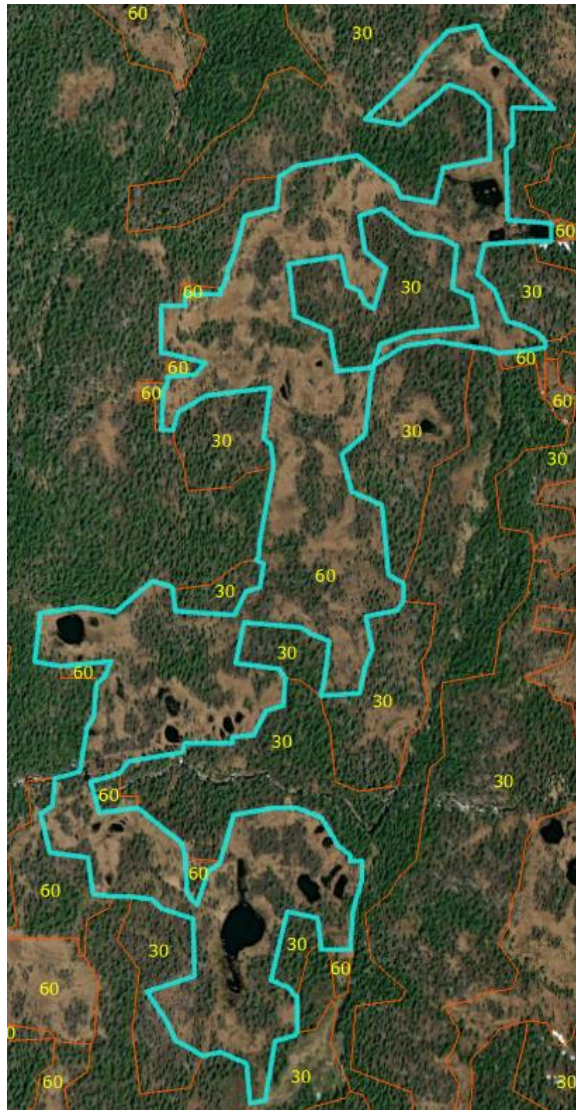
Value	Tree type
31	Coniferous forest
32	Deciduous forest
33	Mixed forest
39	Not forested
98	Not relevant
99	Not recorded

ARDYRKING/dyrkbarjord (arable land)

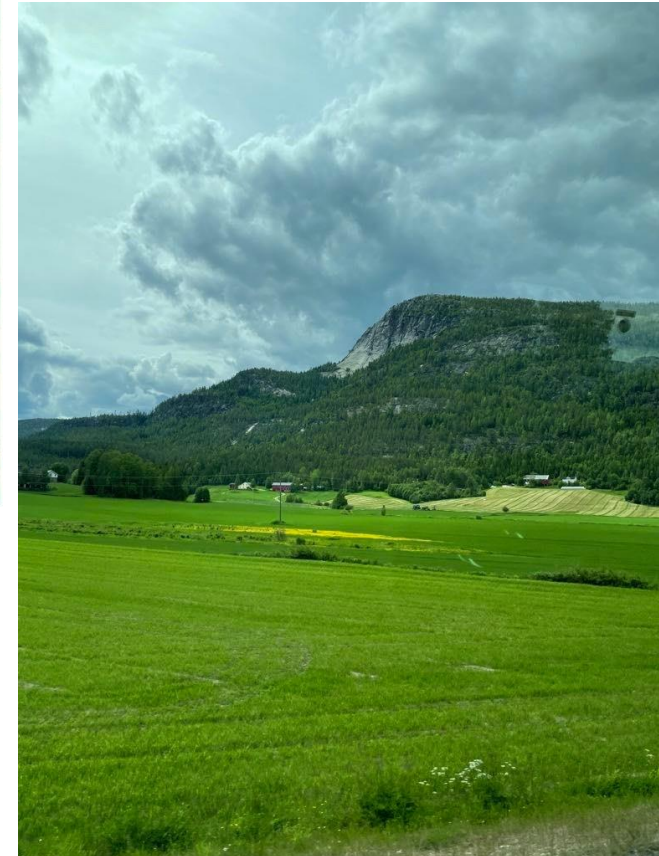
Value	Arable land
81	Non-cultivable soil
82	Cultivable soil
98	Not relevant
99	Not recorded

Problematic land cover classes

Mosses



Permanent herbaceous



Land cover classification:

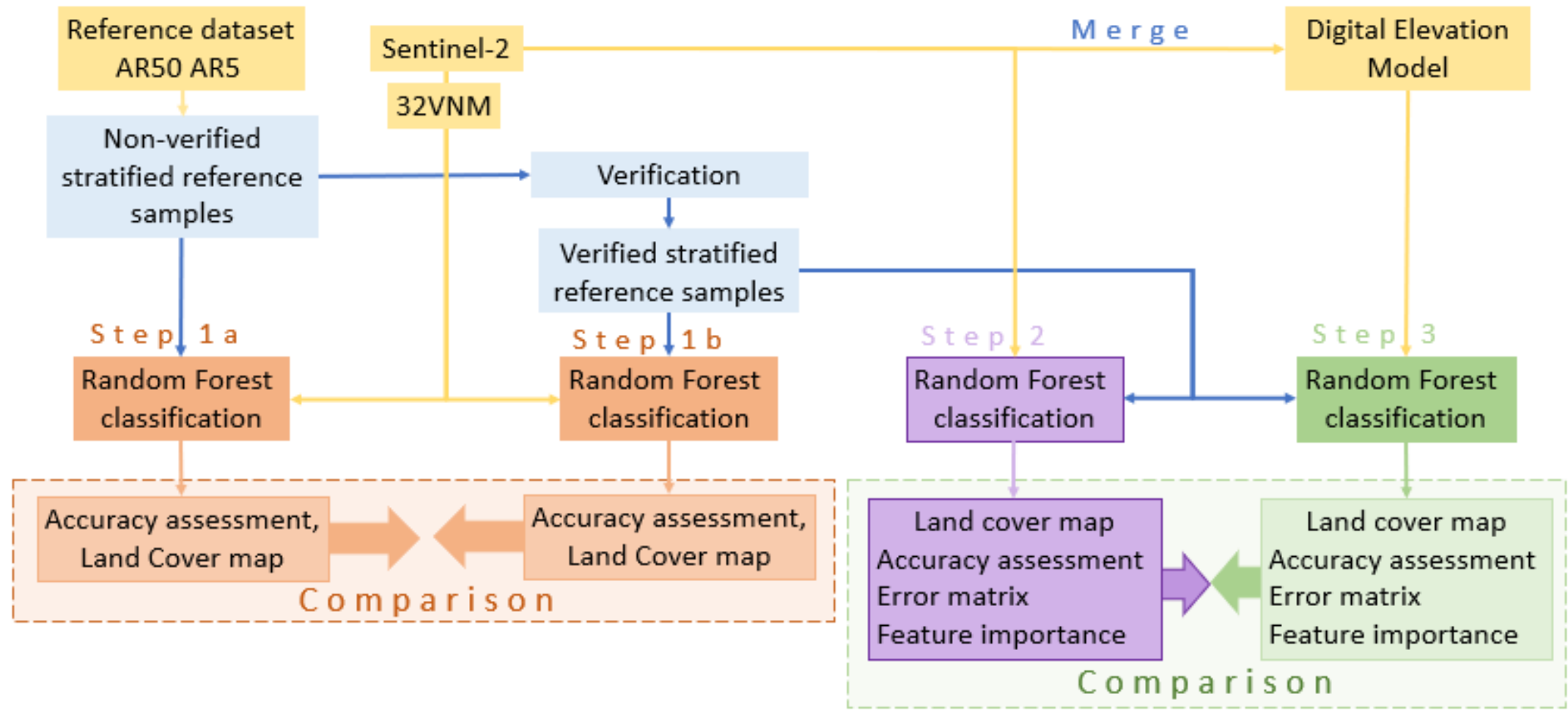
- Data – set of cloud free Sentinel-2A and -2B images captured between end of April and September 2018 and 2020.
- Clarification was carried out using the Random Forest machine learning algorithm.
- The analyses were carried out in the Python programming environment.
- The stability of the classification model was assessed using iterative accuracy assessment (iteration 100 times).
- Analyses were performed in cloud computing environment Amazon Web Services (AWS).
- After preliminary analyses, a Digital Elevation Model was included in the classification.



Digital Elevation Model:

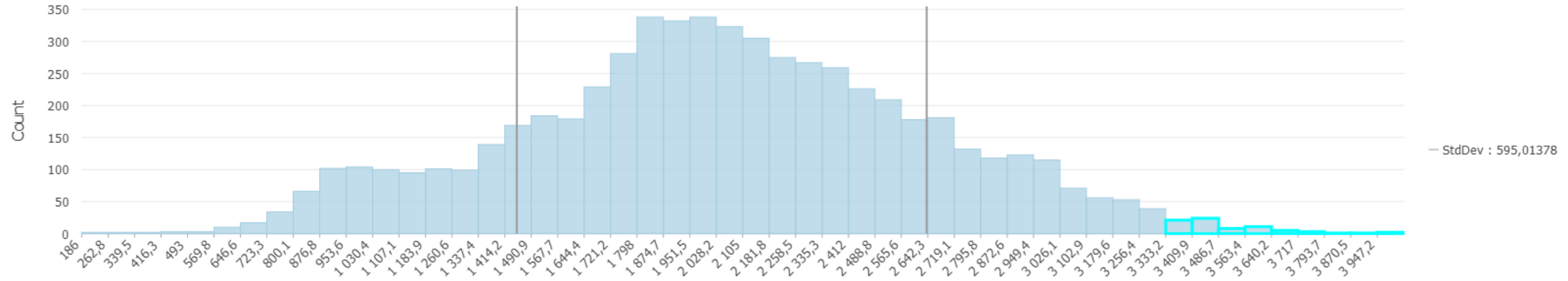
- Shuttle Radar Topography Mission data (SRTM) is available from 56°S to 60°N.
- The freely available Digital Elevation Model was used for continental Norway with a spatial resolution of 10 meters, provided at geonorge.no.

Methodology scheme



Histogram analysis – locating and removing points

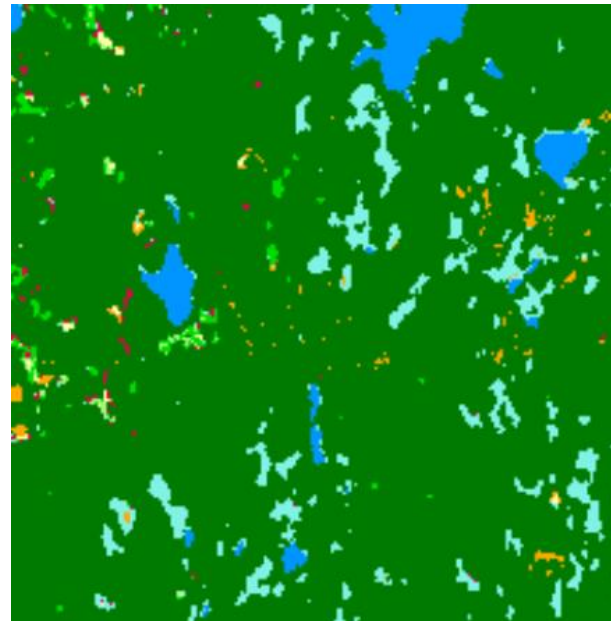
Distribution of s8



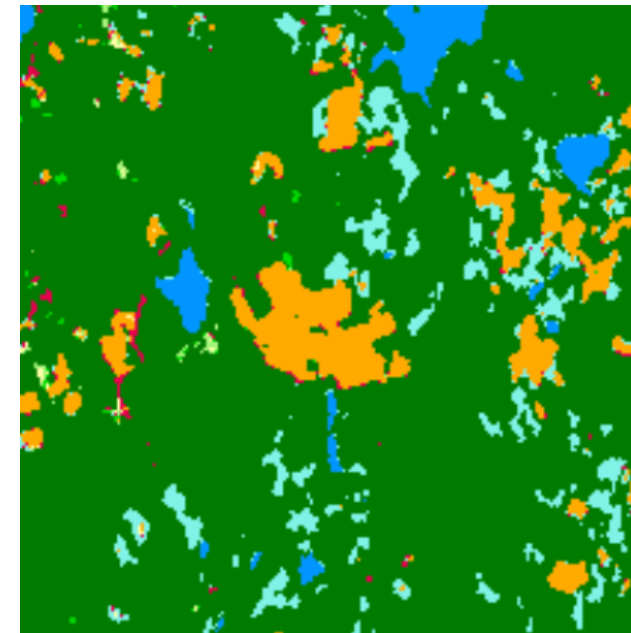
Locating points on clear-cuts



Classification result before removing points

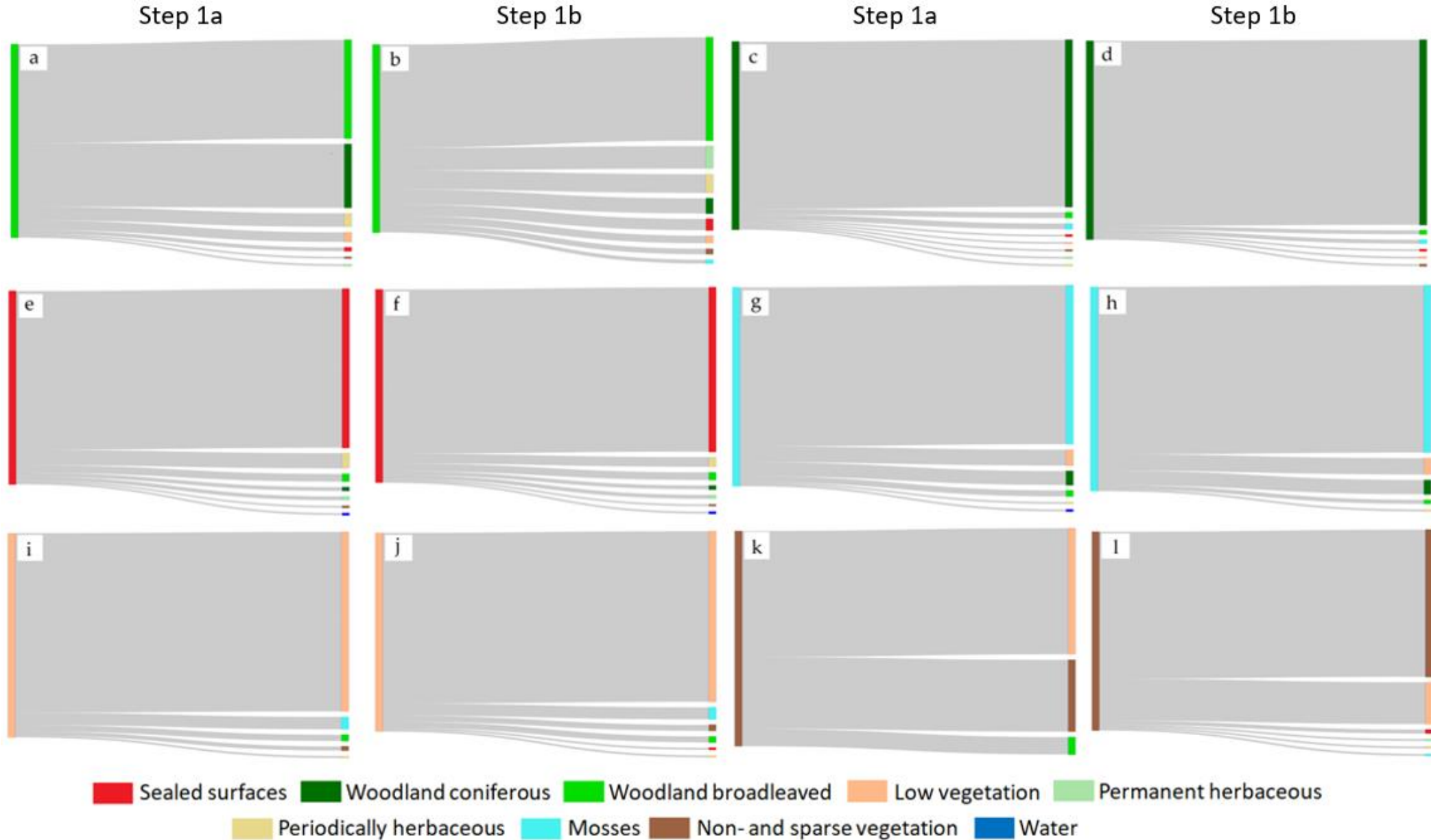


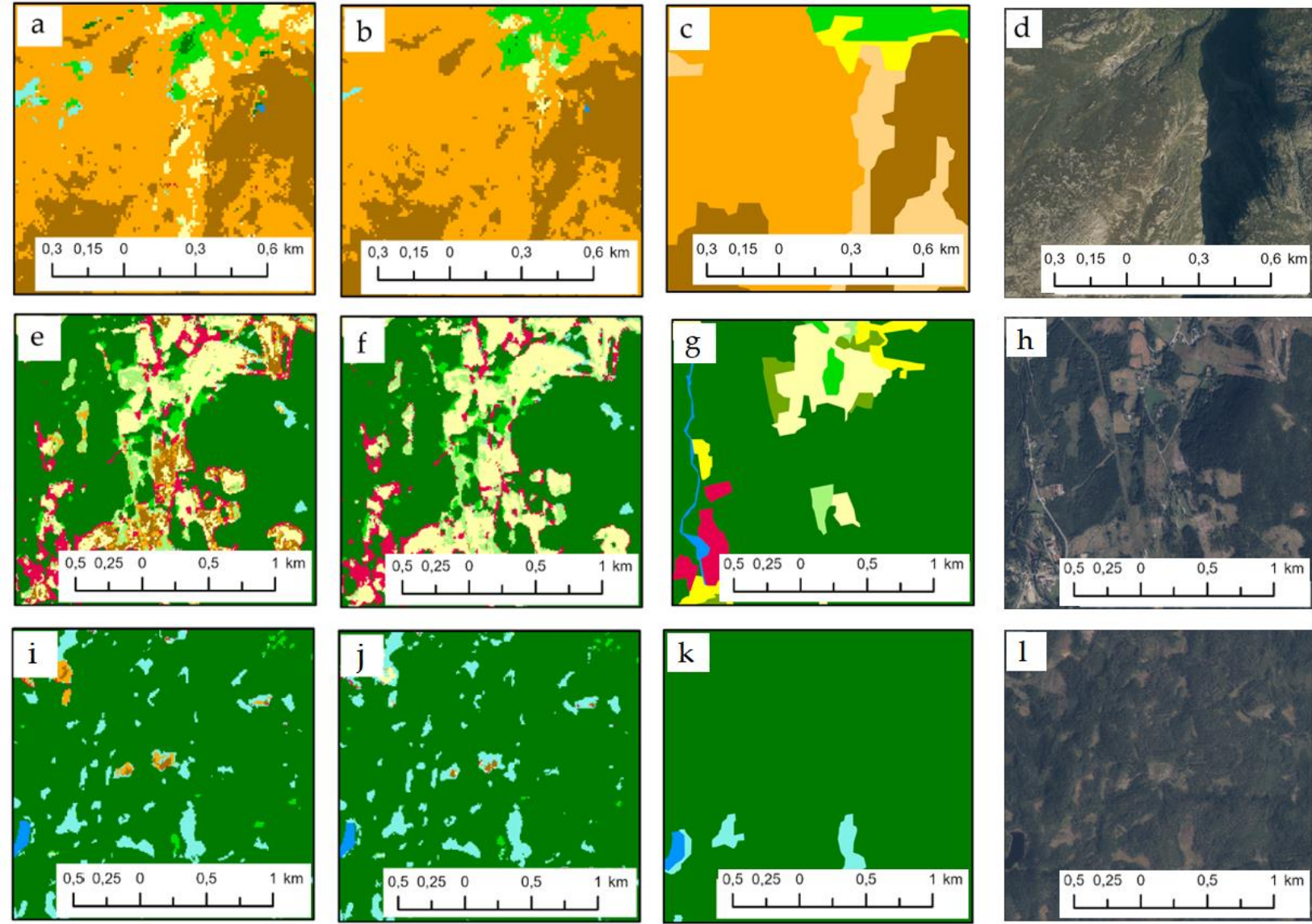
Classification results after removing points



-  Viken county
-  Sealed surfaces
-  Woodland coniferous
-  Woodland broadleaved
-  Low vegetation
-  Permanent herbaceous
-  Periodically herbaceous
-  Mosses
-  Non- sparse vegetation
-  Water
-  Snow and ice

Impact of reference samples


















a, e, i – Non-verified stratified reference samples (step 1a)

b, f, j – Verified stratified reference samples (step 1b)

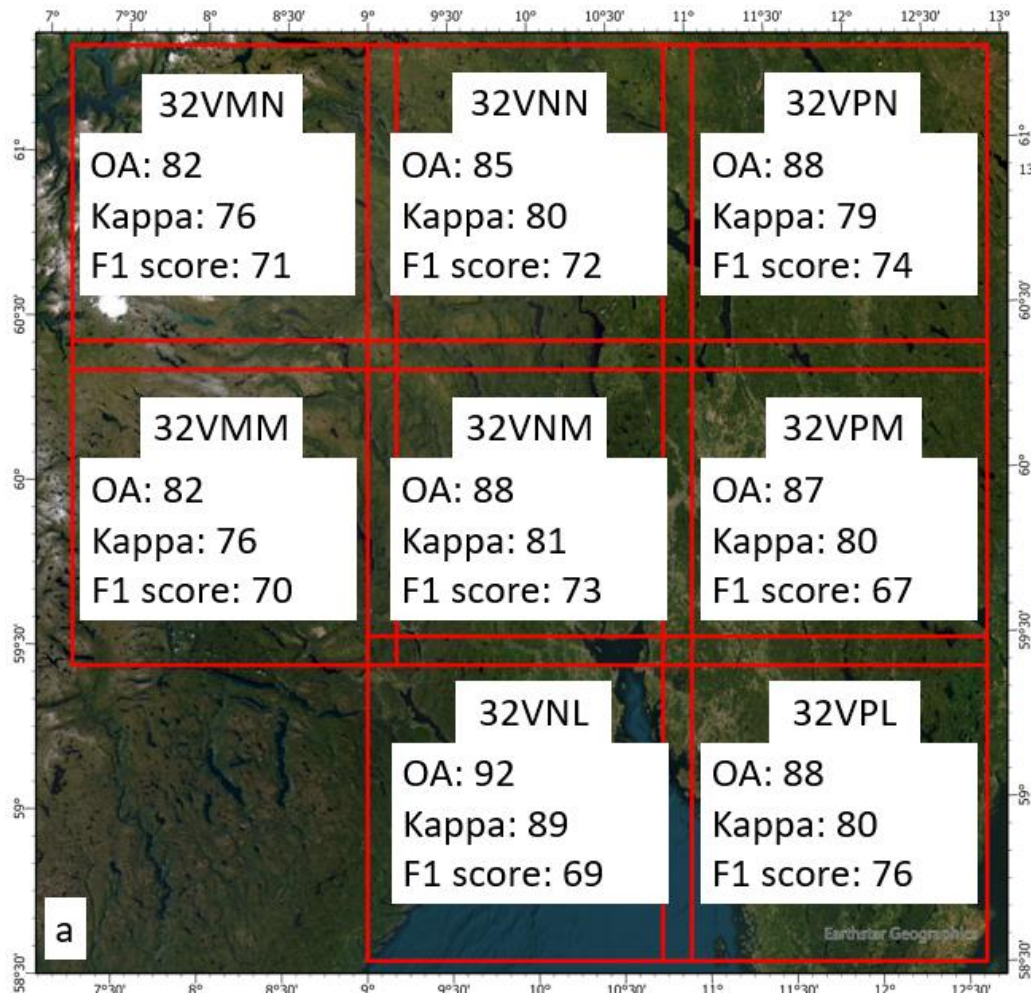
c, g, k - AR50

d, h, l - Ortophoto © Norge digitalt

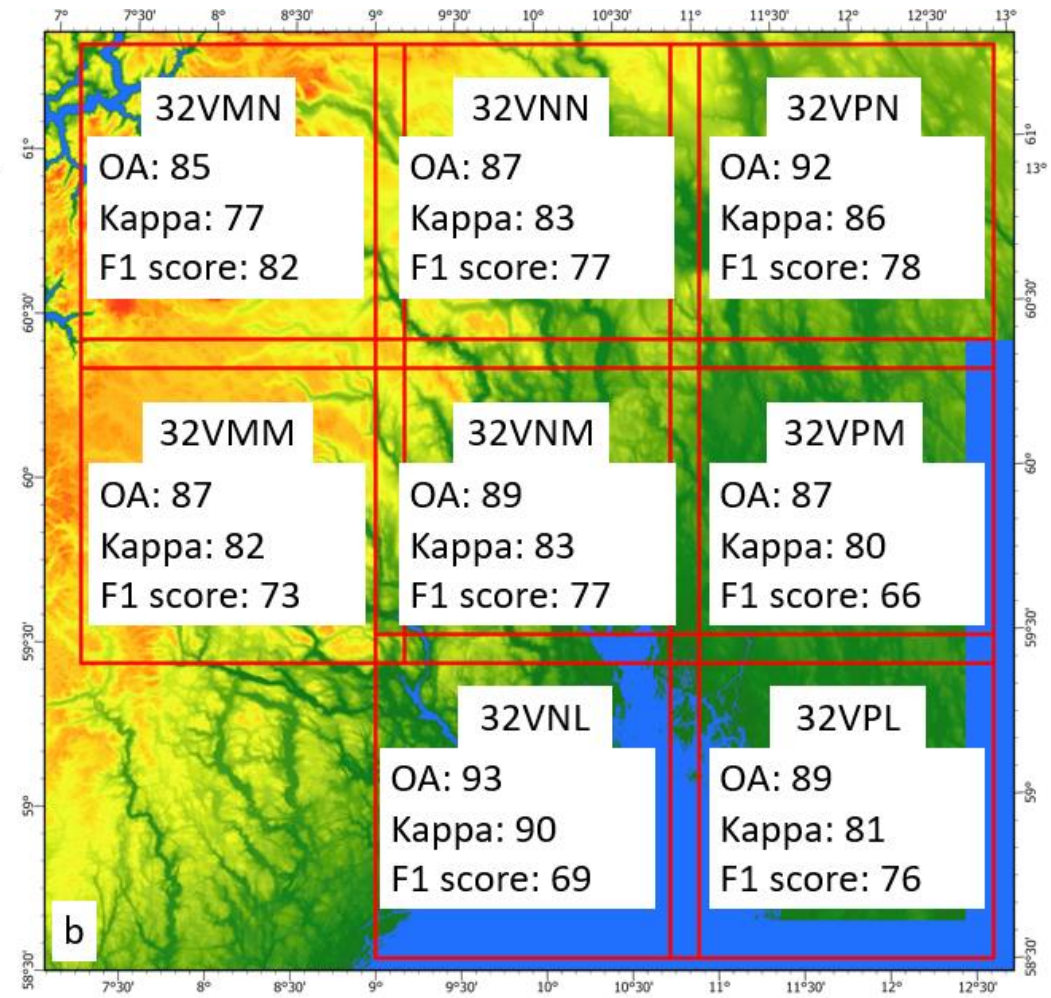
AR50 legend

- | | | |
|-------------------------------------------------------------------------------------------------------|-----------------------------------------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------------------------|
|  Built-up area |  Intermediate vegetation |  Other open land |
|  Coniferous forest |  Vigorous vegetation |  Peat bog |
|  Deciduous forest |  Pasture-land |  Lichen |
|  Mixed forest |  Fully and surface cultivated land |  Sparse vegetation |
| | |  Fresh water |

Sentinel-2



Sentinel-2 + DEM

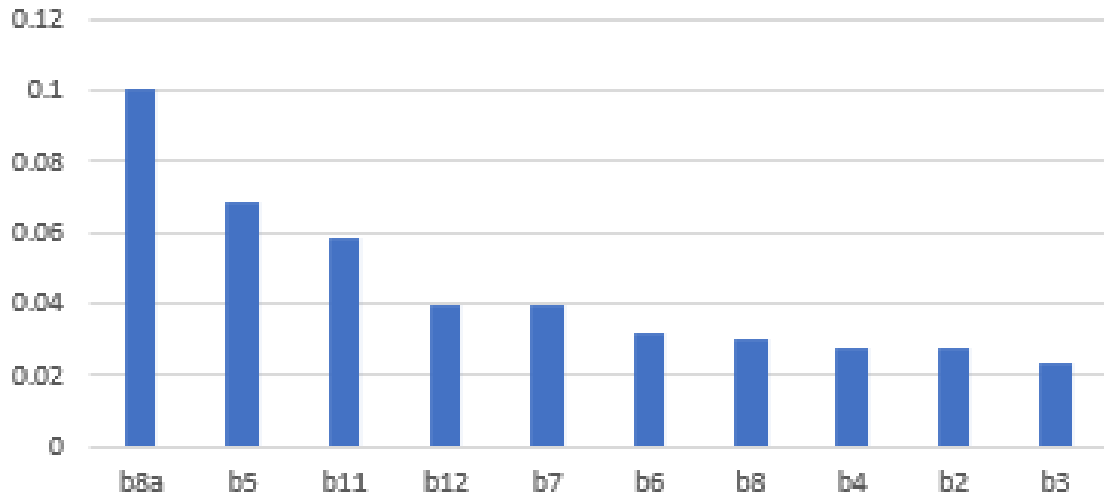


Variable importance

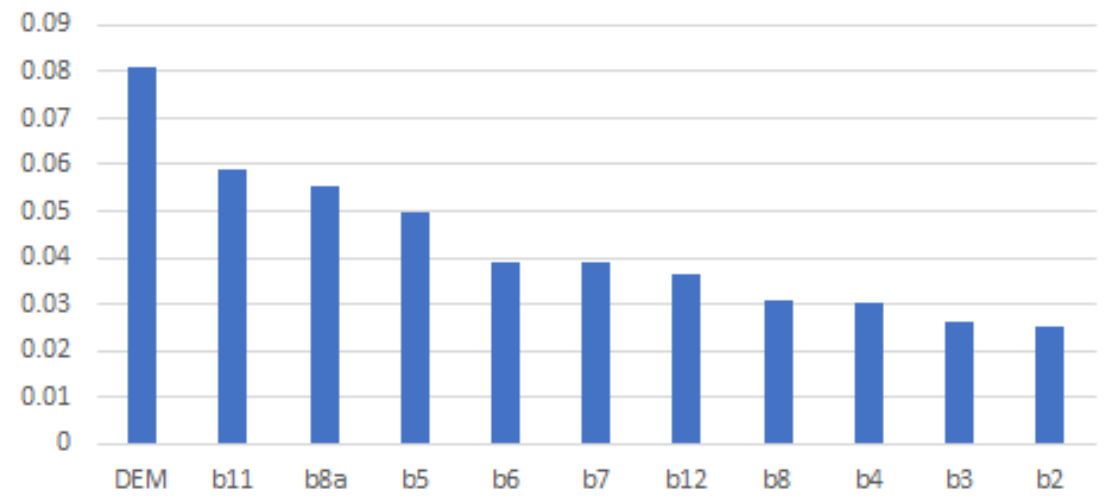
Stability of each classification model varied from 1 to 3 percentage points.

Mean variable importance from all classifications

Sentinel-2



Sentinel-2 + DEM



- The smaller the scale of the reference data, the less accurately the reference points will be located.
- The rate of generalization of reference data affects the accuracy of classification.
- It is important to know the land characteristics and land cover class definitions in the reference databases.
- During Sentinel-2 data selection the phenology should be taken into consideration.
- Heterogeneous classes are more difficult to classify.
- Eliminating mislocated points increases the overall accuracy of the classification.
- DEM increases the accuracy of the classification and is the most informative variable used in classification.
- By adding DEM the accuracy for classes located at higher altitudes increased from 4 to 8 percentage points.

The impact of selection of reference samples and DEM on the accuracy of land cover classification based on Sentinel-2 data

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Remote Sensing Applications: Society and Environment

Thank you

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More information: <https://inconada.eu/>



Enhancing the user uptake of Land Cover / Land Use information derived from the integration of Copernicus services and national databases (InCoNaDa)

