### K&C Phase 4 – Status report

# Retrieval of forest biomass and biomass change with spaceborne SAR

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In the ongoing project, seen as a continuation of the K&C Initiative activities performed in the previous Phases 1, 2 and 3, multi-temporal ALOS-1 PALSAR-1 and ALOS-2 PALSAR-2 data are used to further develop and validate methods for large-scale biomass and biomass change mapping.

A biomass map covering all of Sweden will be derived using PALSAR-2 data for the year 2015 and compared to:

i) the PALSAR-1 biomass (stem volume) map derived in Phase 3,

- ii) statistics from the Swedish National Forest Inventory (NFI), and
- iii) the Swedish forest map of 2015 based on airborne laser scanner data.

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To derive the PALSAR-2 biomass map, the previously used algorithm based on the Water Cloud Model in Phase 3 is used and further developed and validated (BIOMASAR algorithm).

By comparing the biomass maps of 2015 and 2010, both loss in biomass (i.e., clear-cuts, thinning cuttings, wind-thrown damages) and forest growth can be studied.

An ongoing pilot study is conducted using L-band data from the BioSAR 2007 and BioSAR 2010 BIOMASS campaigns at the test site Remningstorp in southern Sweden (Ivan Huuva et al.).

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Furthermore, change detection of the forest cover in terms of detecting and delineating clear-felled areas for all of Sweden will be performed using PALSAR-2 data from the years 2015 and 2016. The approach will be to use a similar methodology as developed in Phases 1 and 2.

The clear-felled areas derived from PALSAR-2 data will be compared to clear-cut maps from:

i) the Swedish Forest Agency and

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ii) statistics from the Swedish NFI.

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The project will involve analysis of more than 28 million ha of boreal and hemi-boreal forests in Sweden.

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The differences in weather conditions, topography, forest properties, time of acquisition, number of observations and incidence angle range make it especially important to develop a robust methodology for future operational use.

It is anticipated that the proposed project will advance the knowledge towards an operational use of high-resolution L-band SAR data in forestry applications.

The methods and algorithms that will be developed also aim to demonstrate the large-scale forestry monitoring goals of the JAXA's ALOS K&C Initiative

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The project supports the 4 K&C thematic drivers, i.e. Carbon Cycle Science, Climate Change, International Conventions, Environmental Conservation.

In this context, for example, there is a synergy with the K&C Phase 4 project "Coupling radar-based estimates of forest information with biosphere models for improved carbon flux estimation" by Maurizio Santoro

### **Project outline and objectives**



Left: JAXA ALOS K&C Initiative prototype areas and test sites in Sweden. Right: Stem volume map of Sweden from multi-temporal ALOS-1 PALSAR-1 images (25 m resolution).

# The BIOMASAR approach

Retrieving forest growing stock volume from SAR backscatter



- No in situ data required to train the model

data or PALSAR mosaics

### Water Cloud Model

β

V

 $\sigma_{veg}^0$ 

 $\sigma_{gr}^0$ 

 $\sigma_{for}^0$ 

### Semi-empirical model:

$$\sigma^{\circ}_{for} = \sigma^{\circ}_{gr} \times e^{-\beta V} + \sigma^{\circ}_{veg} \times (1 - e^{-\beta V})$$

# Inverted model for stem volume estimation:

$$\hat{V} = -\frac{1}{\beta} \cdot \ln \left( \frac{\sigma_{veg}^0 - \sigma_{for,meas}^0}{\sigma_{veg}^0 - \sigma_{gr}^0} \right)$$

- attenuation coefficient, depends on forest structure & dielectric props.

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- Stem volume
- Vegetation backscattering coefficient
- Ground backscattering coefficient
- Forest backscatter intensity
- $\sigma^0_{for.meas}$  Measured backscatter



ALOS



Example of a tiled SAR backscatter image 006\_039\_20150205\_193\_FBD\_HV.ortho.norm

### NFI plots available for validation

ALOS

<u>Yellow</u>: permanent plots measured in 2005, 2010 or 2015

<u>Purple</u>: temporary plots measured between 2007 and 2011 (freely available)

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- The size of NFI plots (10 m or 7 m radius) is comparable to the size of an ALOS pixel (25 m)
- A plot, however, may not fall exactly within a pixel
- In addition, the forest represented in a plot does not match with the forest seen by the radar
- <u>Plot vs. pixel</u> assessment is appealing, but bears complications that limit the understanding of the retrieval
- <u>Plot vs. pixel neighborhood</u> assessment is more indicative of the quality of the retrieval, but retrieval statistics need to be well interpreted
- Plots are meant to derive statistics  $\rightarrow$  it is more correct to assess retrieved biomass by looking at spatial averages







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• Note: averaging over 20 plots, means we are virtually validating a ~ 1 ha area

## Retrieval from ALOS-1 PALSAR-1 data: 2010 as of January 2018, not final

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Forest area: 252,415 km<sup>2</sup> (1% of Sweden not covered by ALOS-1 data in 2010)

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- Total volume (m<sup>3</sup>, constrained retrieval): 2,948 m<sup>3</sup>
- Total volume (m<sup>3</sup>, unconstrained retrieval): 3,509 million m<sup>3</sup>

<u>NFI statistics based on plots from 2009-2013</u> (published in Skogsdata 2014)

- Forest land: 280,680 km<sup>2</sup> (including non-productive forest area)
- Total volume: 3,304 million m<sup>3</sup> (living) + 212 million m<sup>3</sup> (dead wood)



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### 20150610\_092\_FBD\_HH

- In total, 218 image strips, acquired between 2014-09-03 and 2017-10-08
- FBD mode (HH and HV)
- Slant range geometry  $\rightarrow$  calibration, terrain geocoding and topographic correction done with GAMMA software
- Artefacts in near range not compensated for

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- Temporal distribution of ALOS-2 data slightly skewed towards winter months
- Only 46% of data acquired during spring-to-fall, i.e. under best conditions for biomass retrieval using L-band backscatter







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## Retrieval from ALOS-2 PALSAR-2 data: 2014-2017 as of January 2018, not final

• Forest area: 254,733 km<sup>2</sup>

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- Total volume (m<sup>3</sup>, constrained retrieval): n/a
- Total volume (m<sup>3</sup>, unconstrained retrieval): 4,024 million m<sup>3</sup>

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## NFI statistics based on plots from 2012-2016 (published in Skogsdata 2017)

- Forest land: 282,630 km<sup>2</sup> (including non-productive forest area)
- Total volume: 3,445 million m<sup>3</sup> (living) + 225 million m<sup>3</sup> (dead wood)



- Larger stem volume predicted with the ALOS-2 dataset than with ALOS-1
- Biomass increase is substantially larger than growth factors (3-10 m<sup>3</sup>/ha × year  $\rightarrow$  15-50 m<sup>3</sup>/ha)
- Reasons: large proportion of winter data used in 2015 and variable incidence angle range  $\rightarrow$  situations probably not yet well modelled in the BIOMASAR algorithm? Need to do a more in depth analysis of signatures

### References

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- Huuva, I., Fransson, J.E.S., Persson, H.J., Wallerman, J., Ulander, L.M.H., Blomberg, E., and Soja, M.J. (2017). Measurements of forest biomass change using L-and P-band SAR backscatter. In Proceedings of IEEE International Geoscience and Remote Sensing Symposium, pp. 5818 - 5821
- Santoro, M., Fransson, J.E.S et al. (2018). Biomass estimation in boreal and tropical forest using multi-temporal L-band backscatter observations.

### **Project milestones**

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- Completion of the biomass map of Sweden 2015 (end of JFY 2017) (biomass map for the year 2010 has been delivered to JAXA at the end of Phase 3).
- Completion of the clear-cut maps of Sweden for the time period 2015-2016 (end of 2018 – extension requested).
- □ Completion of the biomass change map of Sweden for the time period 2010-2015 (end of 2018 extension requested).
- □ Yearly feed-back to JAXA on quality of their data products.

### **Deliverables**

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The following products will be delivered:

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- □ Biomass map of Sweden for year 2015.
- □ Clear-cut maps of Sweden for the time period 2015-2016.
- □ Biomass change map of Sweden for the time period 2010-2015.
- Ground-truth data from the test sites Remningstorp and Krycklan.









Commission

