## Report on Kyoto & Carbon Initiative Project National clear-cut mapping in Sweden with ALOS PALSAR

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#### Introduction

#### Project objective

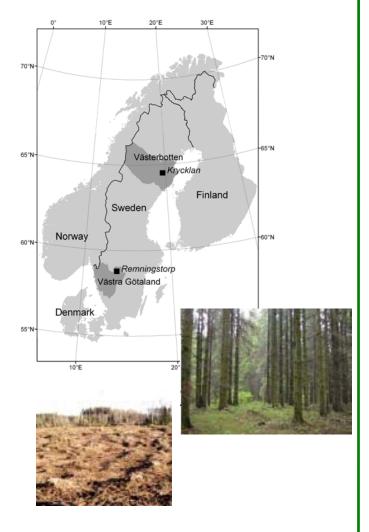
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To further develop and evaluate methods for nation-wide mapping and monitoring of clear-cuts for the entire Sweden using PALSAR data

Project region

Sweden

NOTE: Sweden + Norway + Denmark + Finland + would have been nicer in view of targeting a geographic region but not feasible  $\rightarrow$  PALSAR data are delivered though for this area



#### **Schedule – completed**

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The objective was achieved by refining the methodology developed in Phase 1 and by performing a scientific evaluation of clear-cut detection of Sweden

- Refinement of the developed methodology in Phase 1

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- Adaptation of processing chain from regional to national level mapping
- Testing of methodology for change detection at different spatial scales
- Production of yearly clear-cut maps of Sweden from 2008, 2009 and 2010
- Assessment of PALSAR clear-cut detection vs. available databases of clear-felled areas
- Final delivery of the product with a written report to JAXA

### ALOS PALSAR mosaic over Scandinavia and Finland

ALOS PALSAR data used Fine Beam Dual (FBD34) 63 strips from

43 orbital tracks

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June – October 2009

Other data sources Digital Elevation Model



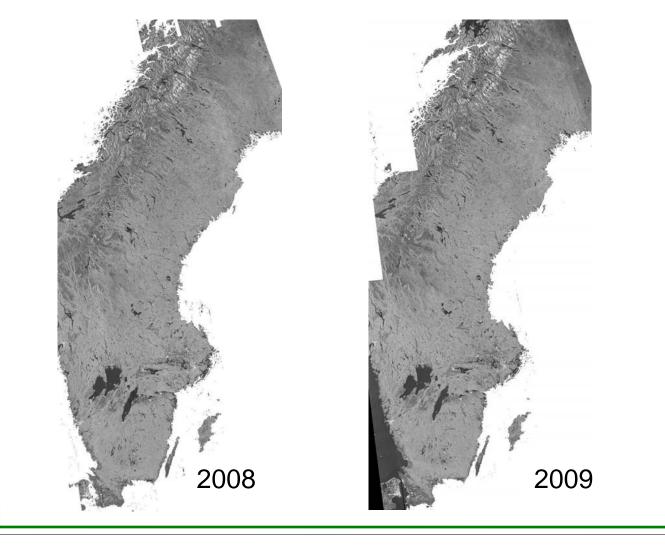
#### **PALSAR strip dataset**

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|     | 2008     |       |     | 2009     |       |     | 2010     |       |
|-----|----------|-------|-----|----------|-------|-----|----------|-------|
| RSP | Date     | Cycle | RSP | Date     | Cycle | RSP | Date     | Cycle |
| 613 | 20080622 | 20    | 615 | 20090613 | 28    | 615 | 20100801 | 37    |
| 615 | 20080726 | 21    | 633 | 20090713 | 28    | 634 | 20100802 | 37    |
| 634 | 20080727 | 21    | 625 | 20090715 | 28    | 607 | 20100803 | 37    |
| 607 | 20080728 | 21    | 631 | 20090725 | 28    | 626 | 20100804 | 37    |
| 626 | 20080729 | 21    | 634 | 20090730 | 29    | 618 | 20100806 | 37    |
| 629 | 20080803 | 21    | 626 | 20090801 | 29    | 629 | 20100809 | 37    |
| 621 | 20080805 | 21    | 621 | 20090808 | 29    | 621 | 20100811 | 37    |
| 605 | 20080809 | 21    | 613 | 20090810 | 29    | 613 | 20100813 | 37    |
| 624 | 20080810 | 21    | 632 | 20090811 | 29    | 632 | 20100814 | 37    |
| 627 | 20080815 | 21    | 605 | 20090812 | 29    | 605 | 20100815 | 37    |
| 619 | 20080817 | 21    | 624 | 20090813 | 29    | 635 | 20100819 | 37    |
| 611 | 20080819 | 21    | 619 | 20090820 | 29    | 627 | 20100821 | 37    |
| 630 | 20080820 | 21    | 611 | 20090822 | 29    | 619 | 20100823 | 37    |
| 603 | 20080821 | 21    | 622 | 20090825 | 29    | 611 | 20100825 | 37    |
| 622 | 20080822 | 21    | 617 | 20090901 | 29    | 630 | 20100826 | 37    |
| 633 | 20080825 | 21    | 609 | 20090903 | 29    | 622 | 20100828 | 37    |
| 625 | 20080827 | 21    | 628 | 20090904 | 29    | 633 | 20100831 | 37    |
| 617 | 20080829 | 21    | 620 | 20090906 | 29    | 625 | 20100902 | 37    |
| 609 | 20080831 | 21    | 623 | 20090911 | 29    | 617 | 20100904 | 37    |
| 620 | 20080903 | 21    | 607 | 20090915 | 30    | 609 | 20100906 | 37    |
| 631 | 20080906 | 21    | 629 | 20090921 | 30    | 628 | 20100907 | 37    |
| 623 | 20080908 | 21    | 627 | 20091003 | 30    | 631 | 20100912 | 37    |
| 632 | 20080923 | 22    | 630 | 20091008 | 30    | 624 | 20101001 | 38    |
| 628 | 20081017 | 22    | 603 | 20091009 | 30    | 623 | 20101030 | 38    |

#### Yearly mosaics of PALSAR strip images covering Sweden



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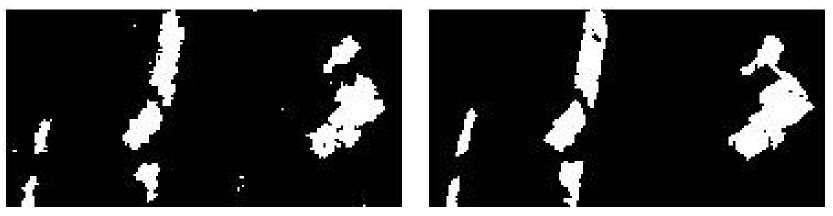
#### Improved change detection algorithm

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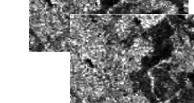
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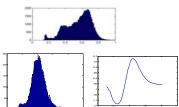
Radiometric normalization and initial change/no change classification were achieved using **histogram matching and automatic image ratio thresholding (GKIT)** (Moser & Serpico, IEEE TGRS, 2006) combined in an iterative manner. As an optional final change/no change classification step the **data fusion based multi-channel change detection** (MCD) method proposed in (Moser & Serpico, IEEE TGRS, 2009) was used. This method is based on Markov random fields and can take into account the spatial contextual information from one or multiple SAR channels.

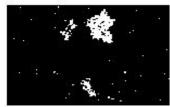


Left: HV channel change map from GKIT+MCD, and right: reference map derived using SPOT-5 SWIR images

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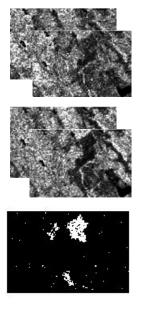






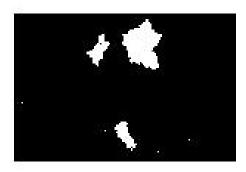
### Change detection approach, part 2





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- Spatial contextual information from one or multiple SAR channels
- Markov random fields
- "Energy functions"



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G. Moser and S. B. Serpico, "Unsupervised change detection from multichannel SAR data by Markovian data fusion," *IEEE Transactions on Geoscience and Remote Sensing*, vol. 47, no. 7, pp. 2114-2128, Jul. 2009.

# Testing of methodology for change detection at different spatial scales

10 m

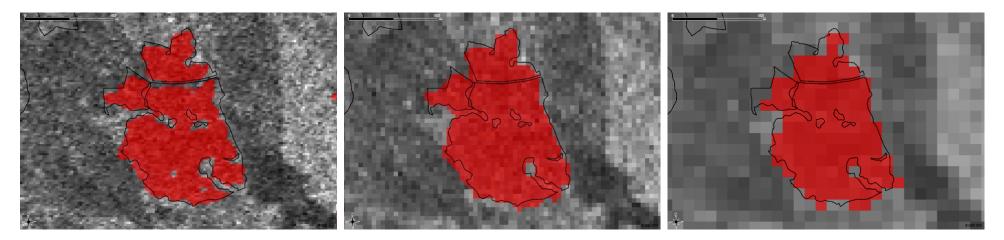
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20 m

50 m

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Example of a detected clear-cut using PALSAR data (red) at 10 m, 20 m and 50 m pixel size. For reference, the border of the clear-felled area is outlined as reported in a GIS database provided by the forest company Sveaskog. As background, the PALSAR image acquired after clear-felling has been used.

# Testing of methodology for change detection at different spatial scales

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| Pixel size | Correctly detected pixels<br>(original / edge-eroded) |  |  |  |
|------------|---|--|--|--|
| (m)        | Average   | 10 <sup>th</sup> and 90 <sup>th</sup> percentile |  |  |
|            | (%)   | (%)  |  |  |
| 10         | 62.7 / 71.5   | 34-87 / 38-95                                    |  |  |
| 20         | 79.4 / 90.6   | 56-96 / 67-100                                   |  |  |
| 50         | 72.5 / 85.9   | 33-98 / 52-100                                   |  |  |
| 50*        | 58.0 / 78.8   | 22-88 / 41-100                                   |  |  |

## **Clear-cuts detected in an PALSAR strip image pair (red)**

### Likeliness of agreement between pixels detected as change from PALSAR images and Swedish Forest Agency's clear-cut polygons

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|         | County          | Likeliness of detection |         |         |  |
|---------|-----------------|-------------------------|---------|---------|--|
| Tile ID |                 | Not                     | Errone- | Correct |  |
|         |                 | verifiable              | ous     |         |  |
|         |                 | (%)                     | (%)     | (%)     |  |
| 130 640 | Västra Götaland | 11                      | 10      | 79      |  |
| 165 715 | Västerbotten    | 12                      | 12      | 76      |  |
| 150 690 | Gävleborg       | 18                      | 9       | 73      |  |
| 165 735 | Norrbotten      | 20                      | 8       | 72      |  |
| 160 670 | Uppsala         | 17                      | 14      | 69      |  |
| 135 680 | Dalarna         | 31                      | 15      | 54      |  |

# County-wise statistics of clear-felled areas between 2008 and 2009 in Sweden

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| County          | Swedish Forest Agency<br>(ha) | Swedish National Forest<br>Inventory<br>(ha) | ALOS PALSAR<br>(ha) | Notified areas of final<br>fellings<br>(ha) |
|-----------------|-------------------------------|--|---------------------|---|
| Stockholm       | 1,568                         | 0  | 2,209               | 1,488                                       |
| Uppsala         | 2,997                         | 10,688                                       | 5,383               | 5,520                                       |
| Södermanland    | 811                           | 4,288  | 1,427               | 2,930                                       |
| Jönköping       | 1,693                         | 5,125  | 3,708               | 9,623                                       |
| Halland         | 690                           | 0  | 891                 | 3,518                                       |
| Västra Götaland | 6,430                         | 13,041                                       | 6,400               | 17,306                                      |
| Värmland        | 5,218                         | 6,750  | 7,750               | 15,295                                      |
| Örebro          | 2,880                         | 1,838  | 5,235               | 7,868                                       |
| Västmanland     | 3,205                         | 876  | 2,585               | 4,173                                       |
| Dalarna         | 12,107                        | 5,836  | 17,503              | 18,313                                      |
| Gävleborg       | 14,804                        | 3,531  | 15,282              | 17,356                                      |
| Västernorrland  | 5,647                         | 14,136                                       | 15,536              | 20,412                                      |
| Jämtland        | 24,412                        | 19,665                                       | 19,077              | 20,435                                      |
| Västerbotten    | 23,046                        | 38,305                                       | 26,649              | 20,394                                      |
| Norrbotten      | 15,424                        | 16,509                                       | 25,355              | 15,804                                      |
| Total           | 120,931                       | 140,590                                      | 154,990             | 180,435                                     |

### Total area detected as clear-felled per growing season from PALSAR and the Swedish National Forest Inventory

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| Time      | ALOS PALSAR | Swedish National Forest |
|-----------|-------------|-------------------------|
| period    |             | Inventory               |
|           | (ha)        | (ha)                    |
| 2008-2009 | 168,279     | 168,645* (170,000)      |
| 2009-2010 | 156,910     | Not available           |

\* In the counties of Stockholm, Halland and Skåne, no field plots were registered as harvested at the time of field inventory

### Conclusions

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- The PALSAR strip dataset is of high quality and has been timely delivered for the completion of the project
- Yearly full coverage of Sweden has been achieved for the period 2008-2010

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- An improved change detection algorithm has been developed and the performance was proven to be superior to the former algorithm developed in Phase 1

-Yearly maps of clear-cuts for entire Sweden during the period 2008-2010 were produced using PALSAR FBD34 HV-polarized backscatter

- It took about 90 minutes to run the algorithm on a standard computer to produce a clear-cut map over Sweden with 50 m pixel size

- For the period spanning the growing season of 2008-2009, a total of **168,279 ha** were detected as clear-cuts using PALSAR. For the same period, the Swedish National Forest Inventory reported **168,645 ha** 

## **Conclusions (cont.)**

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- The results highlight the usefulness of ALOS PALSAR strip data in an operational scenario for clear-cut mapping at a national level.

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## **List of publications**

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#### **International Journals**

LOS

- Santoro, M., Fransson, J.E.S., Eriksson, L.E.B., Magnusson, M., Ulander, L.M.H., and Olsson, H. 2009. Signatures of ALOS PALSAR L-band backscatter in Swedish forest. *IEEE Transactions on Geoscience and Remote Sensing* 47(12), 4001-4019.

- Santoro, M., Fransson, J.E.S., Eriksson, L.E.B., and Ulander L.M.H. 2010. Clear-cut detection in Swedish boreal forest using multi-temporal ALOS PALSAR backscatter data. *IEEE Journal of Selected Topics in Applied Earth Observations and Remote Sensing 3(4)*, 618-631.

#### Proceedings

- Pantze, A., Krantz, A.H., Fransson, J.E.S., Olsson, H., Santoro, M., Eriksson, L.E.B., and Ulander, L.M.H. 2009. Mapping and monitoring clear-cuts in Swedish forest using ALOS PALSAR satellite images. In *Proceedings of IGARSS 2009 Symposium, Earth Observation – Origins to Applications, Cape Town, South Africa, 13-17 July, 2009*, vol. III, pp. 589-592.

- Pantze, A., Fransson, J.E.S., and Santoro, M. 2010. Forest change detection from L-band satellite SAR images using iterative histogram matching and thresholding together with data fusion. In *Proceedings of IGARSS 2010 Symposium, Remote Sensing: Global Vision for Local Action, 30th Anniversary, Honolulu, Hawaii, USA, 25-30 July, 2010*, pp. 1226-1229.

#### Reports

- Fransson, J.E.S., Olsson, H., Eriksson, L.E.B., Ulander, L.M.H., and Santoro, M., "K&C Science Report – Phase 1, Detection of deforestation in Swedish forest", In "The ALOS Kyoto & Carbon Initiative, Science Team Reports, Phase 1 (2006-2008)", Japan Aerospace Exploration Agency, Earth Observation Research Center, 2-1-1 Sengen, Tsukuba-shi, Ibaraki 305-8505, Japan, JAXA EORC, NDX-100003, pp. 58-68, 2010.

- Fransson, J.E.S., Santoro, M., Pantze, A., Olsson, H., Eriksson, L.E.B., Ulander, L.M.H., and A. Persson, "K&C Science Report – Phase 2, National clear-cut mapping in Sweden with ALOS PALSAR". Submitted.

#### Booklet

- Fransson, J., and Santoro M. 2010. National clear-cut mapping in Sweden. In Global Environmental Monitoring by ALOS PALSAR, Science Results from the ALOS Kyoto & Carbon Initiative, Edited by A. Rosenqvist and M. Shimada, Japan Aerospace Exploration Agency (JAXA reference: NDX-100004), Tsukuba Space Center, 2-1-1 Sengen, Tsukuba, Ibaraki 305-8505, Japan, pp. 44-45.

#### Manuscript

- Pantze, A., Santoro, M., and Fransson, J.E.S. 2011. Forest change detection from L-band satellite SAR images using histogram intense methods and data fusion. Manuscript.

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- Forestry Society's Estate Management Company (Skogssällskapet)
- Swedish Meteorological and Hydrological Institute (SMHI)
- Svartberget's research station, SLU
- Swedish National Land Survey
- Sveaskog (Swedish forest company)