



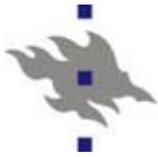
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# An assessment of multiangular MISR data for tree cover and height mapping in the tundra–taiga transition zone

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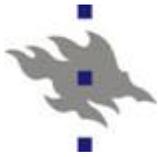
9th Bi-Annual Circumpolar Remote Sensing Symposium, May 15–19 2006, Seward, Alaska



## Introduction



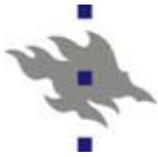
- Accurate and repeatable land cover characterization is required over the tundra–taiga transition zone
- Low spatial resolution instruments (e.g. MODIS) allow mapping of the whole transition zone regularly
- Tree cover and height are important variables to characterize the ecotone
- The continuous fields of these variables would, for example, enable the delineation of the forest extent according to the different criterion and provide valuable data for monitoring land cover change



## Introduction



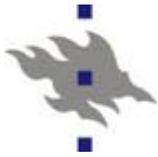
- The applicability of VIS–NIR remote sensing data has been typically hampered by the pronounced reflectance of undergrowth vegetation and by the spectral confusion of the forest and non-forest vegetation
- Directional information (multiangular observations) provides one additional data source that has been used only a little in the land cover mapping
- The sensitivity of BRDF to the canopy- and landscape-level structural variability suggest that multiangular data could be useful in the characterization of tundra–taiga boundary



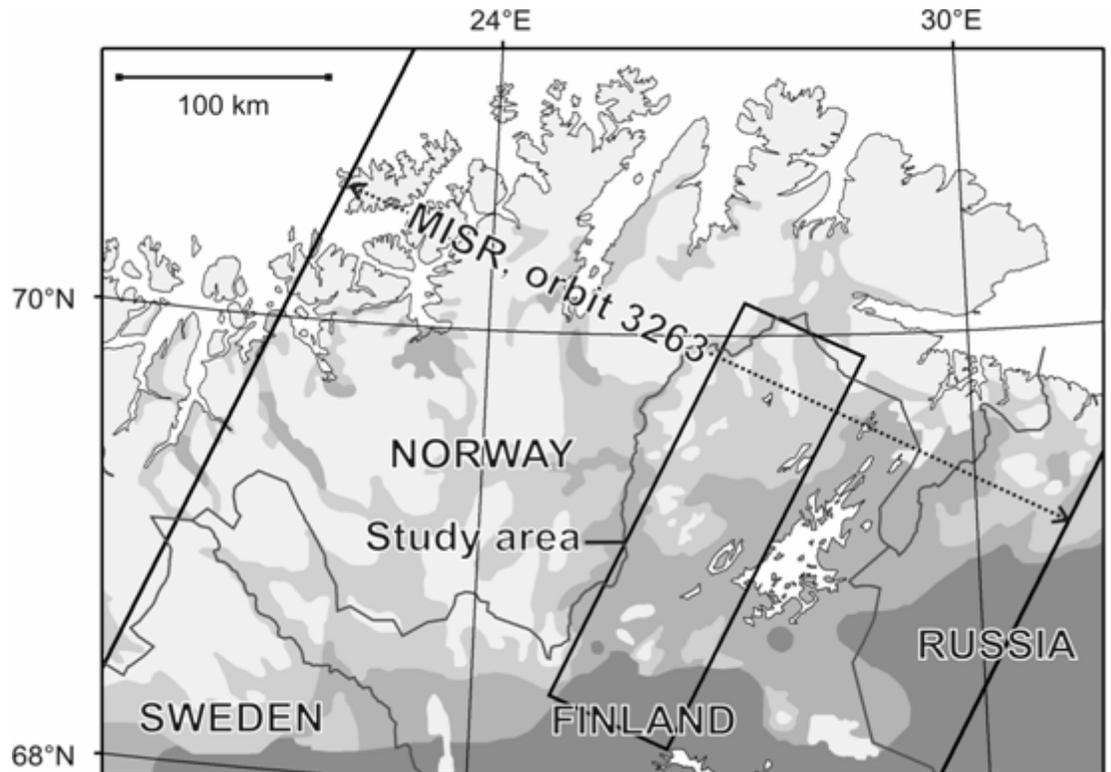
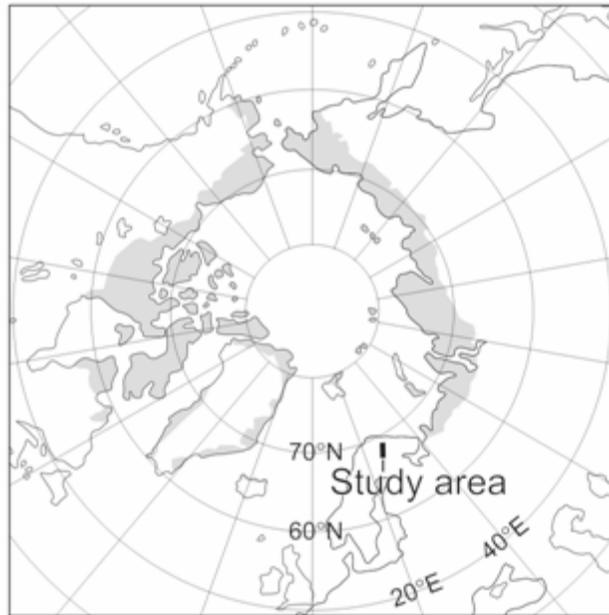
## Aim of the study

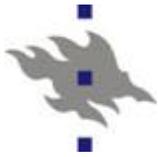


- To examine how sensitive MISR reflectance is to the variability in tree cover and height
- To examine how the spectral-angular band combination of MISR data affect to the estimation accuracy of tree cover and height
- The results were compared to the global MODIS continuous fields of tree cover product at 500 m resolution (MOD44B)
- The estimation accuracy was also studied in relation to shrub cover and fractional cover of mire



## Location of the study area

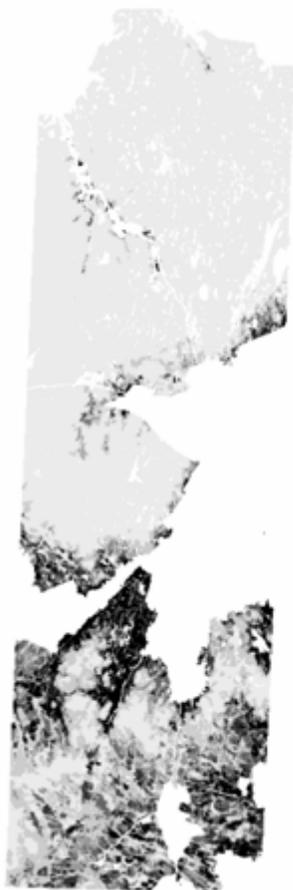




## Biotope inventory data

- The reference data consisted of biotope inventory of northernmost Finland that was made between 1996–1999 by Metsähallitus
- Based on colour-infrared aerial photographs and interpretation keys collected in the field
- GIS-database includes also stand-wise forest inventory data, like tree crown cover (also species specific fractions) and tree height
- The data covers only nature reserves, wilderness areas and national parks

Coniferous  
tree cover



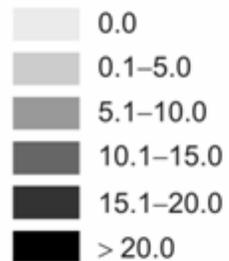
Broadleaved  
tree cover



Shrub cover



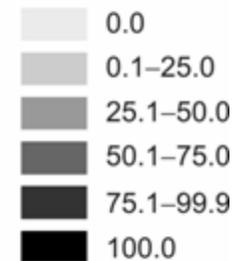
%



Fractional cover  
of mire



%

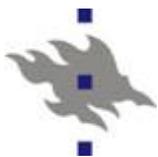


30 km

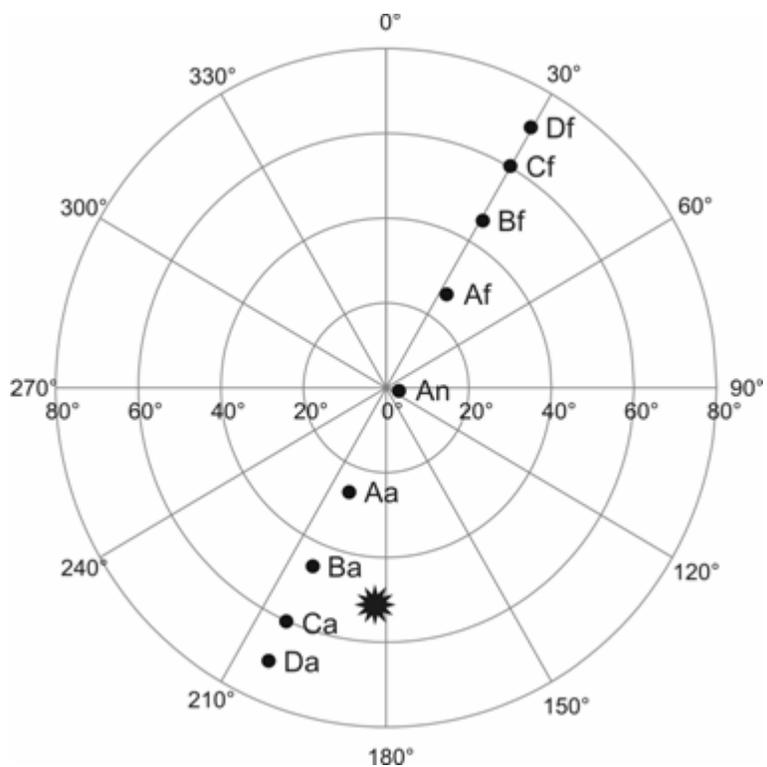


## Multiangle Imaging SpectroRadiometer (MISR)

- Nine cameras:  $0^{\circ}$ ,  $\pm 26.1^{\circ}$ ,  $\pm 45.6^{\circ}$ ,  $\pm 60.0^{\circ}$  and  $\pm 70.5^{\circ}$
- Four spectral bands: blue (446 nm), green (558 nm), red (672 nm) and NIR (866 nm)
- In the global mode the red bands and nadir camera are at 275 m resolution, the other bands are averaged to the 1.1 km resolution
- Acquisition date: 29 July 2000 (path 193 and orbit 3263)
- MISR Level 1B2 Terrain data (TOA BRF) and Level 2 Land Surface data (surface BRF) were used
- Da camera was excluded due to coregistration problems



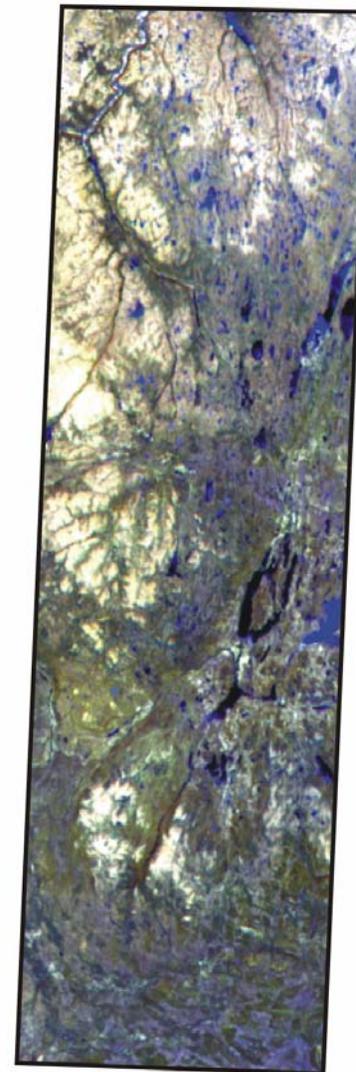
## Mean viewing angles of the MISR cameras and Sun position during the acquisition



Nadir  
NIR, red, green



60°, nadir, -60°  
Red



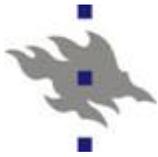
30 km





## Data analysis

- Mean tree cover, coniferous and broadleaved tree cover, and tree height were calculated for MISR pixels
- The target variables were estimated by feed-forward multilayer neural networks using different spectral-angular band combinations
- Training was performed by Levenberg-Marquardt algorithm and early stopping was used in order to avoid overfitting
- Half of all the data were allocated to the training set and half to the testing set by random sampling
- The estimates were assessed by RMSE and bias statistics



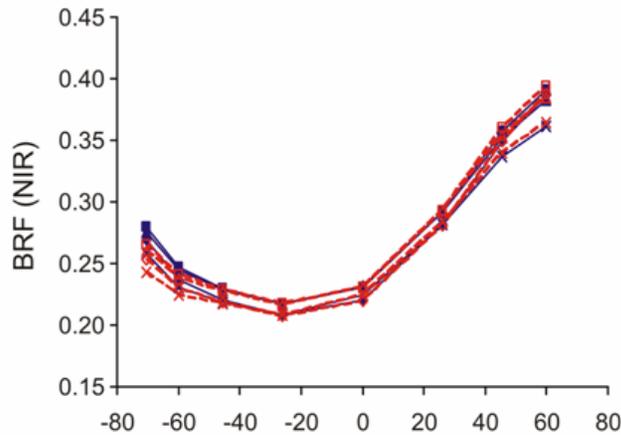
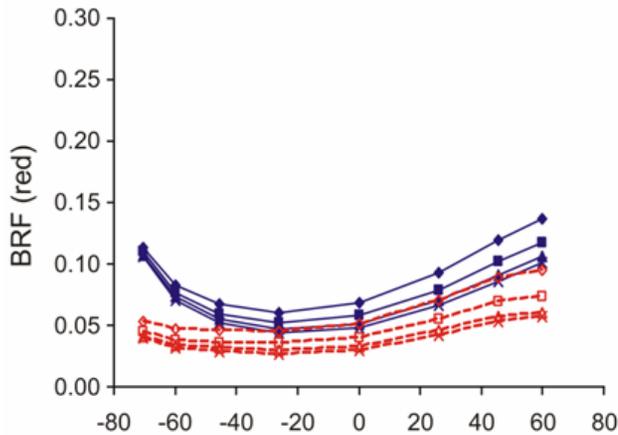
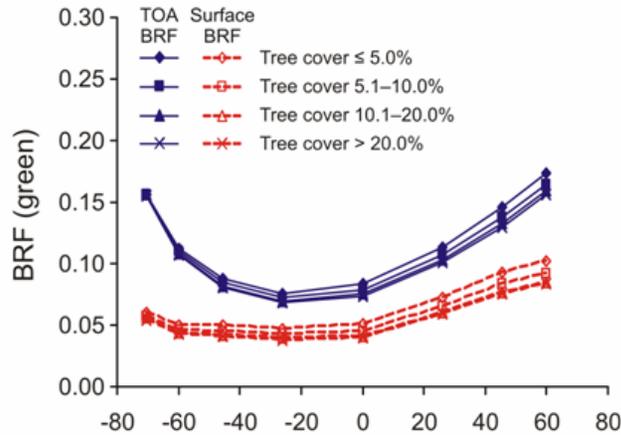
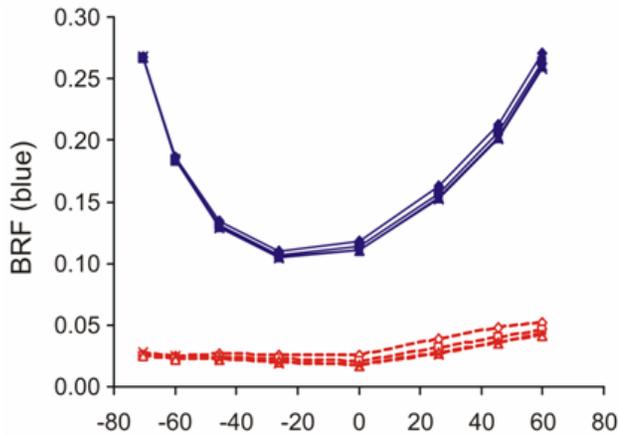
## Descriptive statistics

Variable	Resolution	n	Range	Mean	Median	S.D.
Tree cover (%)	275 m	123512	0.0–79.1	11.5	8.5	11.4
	1.1 km (TOA BRF)	6998	0.0–47.9	11.0	9.6	9.3
	1.1 km (surface BRF)	5760	0.0–47.9	11.6	10.8	9.6
Coniferous tree cover (%)	275 m	123512	0.0–50.0	3.6	0.0	7.0
	1.1 km (TOA BRF)	6998	0.0–38.4	3.4	0.0	6.0
	1.1 km (surface BRF)	5760	0.0–38.4	4.0	0.0	6.3
Broadleaved tree cover (%)	275 m	123512	0.0–76.8	7.7	4.4	9.0
	1.1 km (TOA BRF)	6998	0.0–46.6	7.4	5.9	6.8
	1.1 km (surface BRF)	5760	0.0–46.6	7.4	5.8	6.9
Tree height (m)	275 m	123512	0.0–17.8	5.3	4.3	3.7
	1.1 km (TOA BRF)	6998	0.0–16.0	5.1	4.3	3.3
	1.1 km (surface BRF)	5760	0.0–16.0	5.4	4.4	3.5

■ Shrub cover and fractional cover of mire were used as ancillary data



# Mean BRFs of the tree cover classes in MISR viewing angles (-70.5–60.0°)

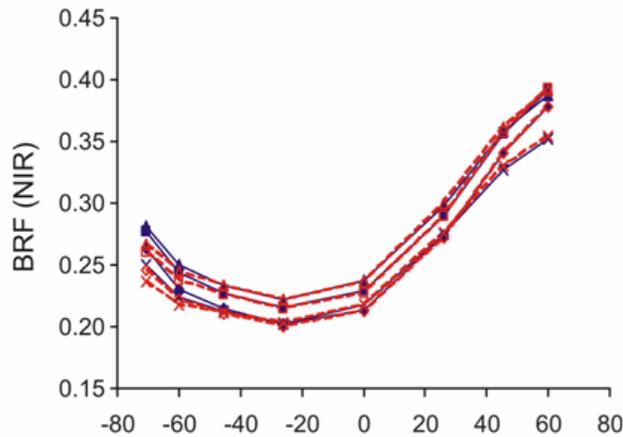
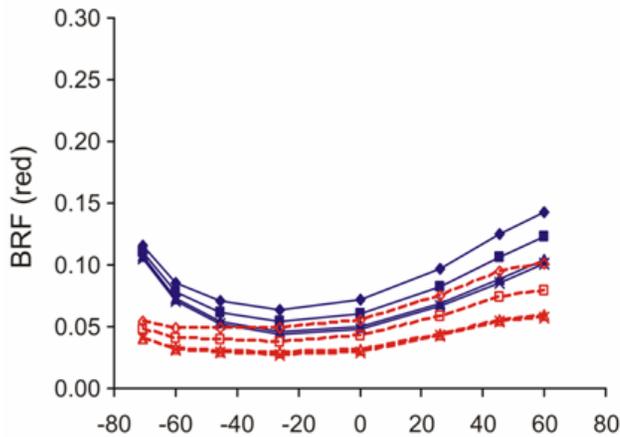
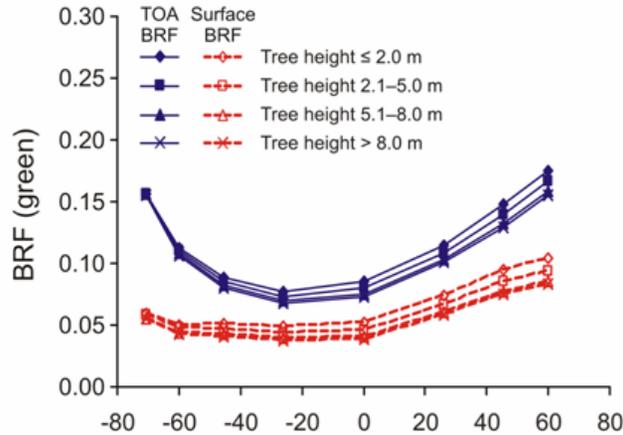
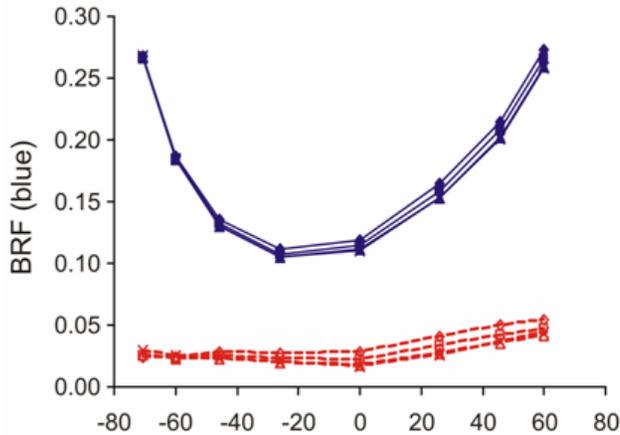


View zenith angle (°)

- Strong dependence of BRF on the view zenith angle
- The atmospheric correction has a major effect, particularly in the shorter wavelengths and in the largest off-nadir view angles
- However, differences between the classes are approximately equal



# Mean BRFs of the tree height classes in MISR viewing angles (-70.5–60.0°)



View zenith angle (°)

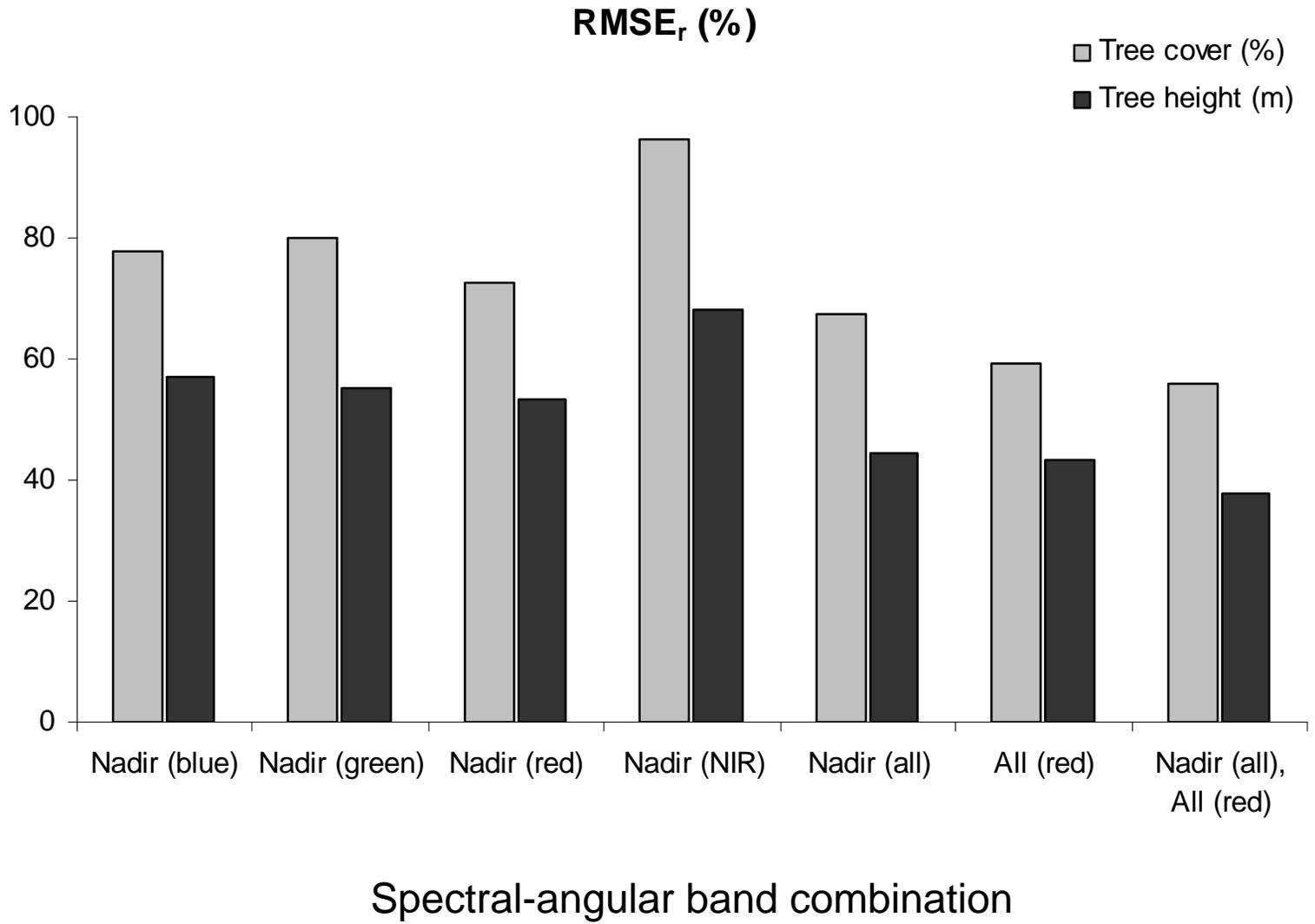
- Red band seem to be the most sensitive band to the tree cover and tree height
- Differences between the classes are greatest in the backscattering direction

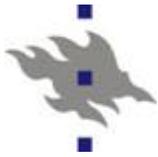


# Accuracy of the tree cover and height estimates at 275 m resolution

Target variable	View-angle (spectral band)	Number of bands	RMSE	RMSE <sub>r</sub> (%)	Bias	Bias <sub>r</sub> (%)	r
Tree cover (%)	Nadir (red)	1	8.41	72.7	<b>-0.08</b>	-0.7	0.67
	Nadir (all)	4	7.80	67.4	-0.11	-1.0	0.73
	All (red)	8	6.85	59.2	-0.03	-0.3	0.80
	Nadir (all), All (red)	11	6.49	56.1	-0.05	-0.4	0.82
Tree height (m)	Nadir (red)	1	2.81	53.3	0.00	0.0	0.64
	Nadir (all)	4	2.33	44.3	0.00	0.0	0.77
	All (red)	8	2.29	43.5	0.02	0.4	0.78
	Nadir (all), All (red)	11	1.98	37.6	0.01	0.2	0.84

- RMSE of the best coniferous tree cover estimates was 3.85% (RMSE<sub>r</sub> 106.5%)
- RMSE of the best broadleaved tree cover estimates was 6.43% (RMSE<sub>r</sub> 83.2%)





# Accuracy of the tree cover and height estimates at 1.1 km resolution (TOA BRF)

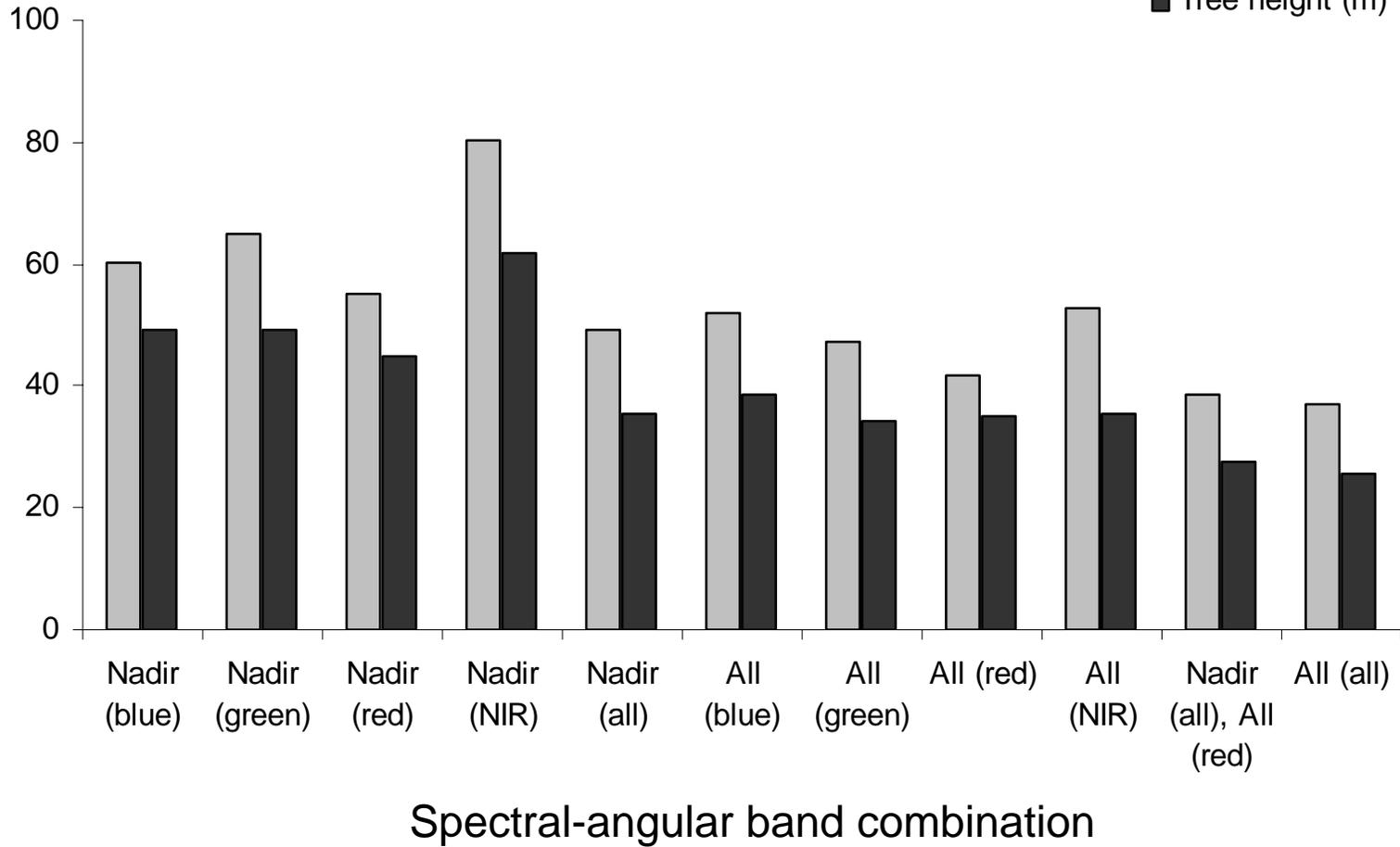
Variable	View-angle (spectral band)	Number of bands	RMSE	RMSE <sub>r</sub> (%)	Bias	Bias <sub>r</sub> (%)	r
Tree cover (%)	Nadir (red)	1	6.07	55.0	0.07	0.6	0.75
	Nadir (all)	4	5.42	49.2	-0.14	-1.3	0.81
	All (blue)	8	5.74	52.0	<b>-0.26</b>	-2.4	0.78
	All (green)	8	5.21	47.2	-0.09	-0.8	0.83
	All (red)	8	4.62	41.9	0.05	0.4	0.87
	All (NIR)	8	5.80	52.6	-0.21	-1.9	0.78
	Nadir (all), All (red)	11	4.27	38.7	-0.07	-0.6	0.89
	All (all)	32	4.06	36.9	-0.11	-1.0	0.90
Tree height (m)	Nadir (red)	1	2.28	44.7	0.03	0.6	0.70
	Nadir (all)	4	1.80	35.4	-0.02	-0.4	0.83
	All (blue)	8	1.96	38.5	0.01	0.1	0.79
	All (green)	8	1.74	34.1	0.00	-0.1	0.84
	All (red)	8	1.80	35.2	0.06	1.2	0.83
	All (NIR)	8	1.81	35.6	-0.07	-1.3	0.83
	Nadir (all), All (red)	11	1.40	27.5	0.00	0.1	0.90
	All (all)	32	1.29	25.4	-0.01	-0.2	0.91

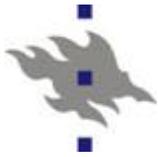
- Smaller errors than at 275 m resolution
- RMSE of the best coniferous tree cover estimates was 2.23% (RMSE<sub>r</sub> 68.9%)
- RMSE of the best deciduous tree cover estimates was 3.96% (RMSE<sub>r</sub> 52.5%)



### RMSE<sub>r</sub> (%)

- Tree cover (%)
- Tree height (m)



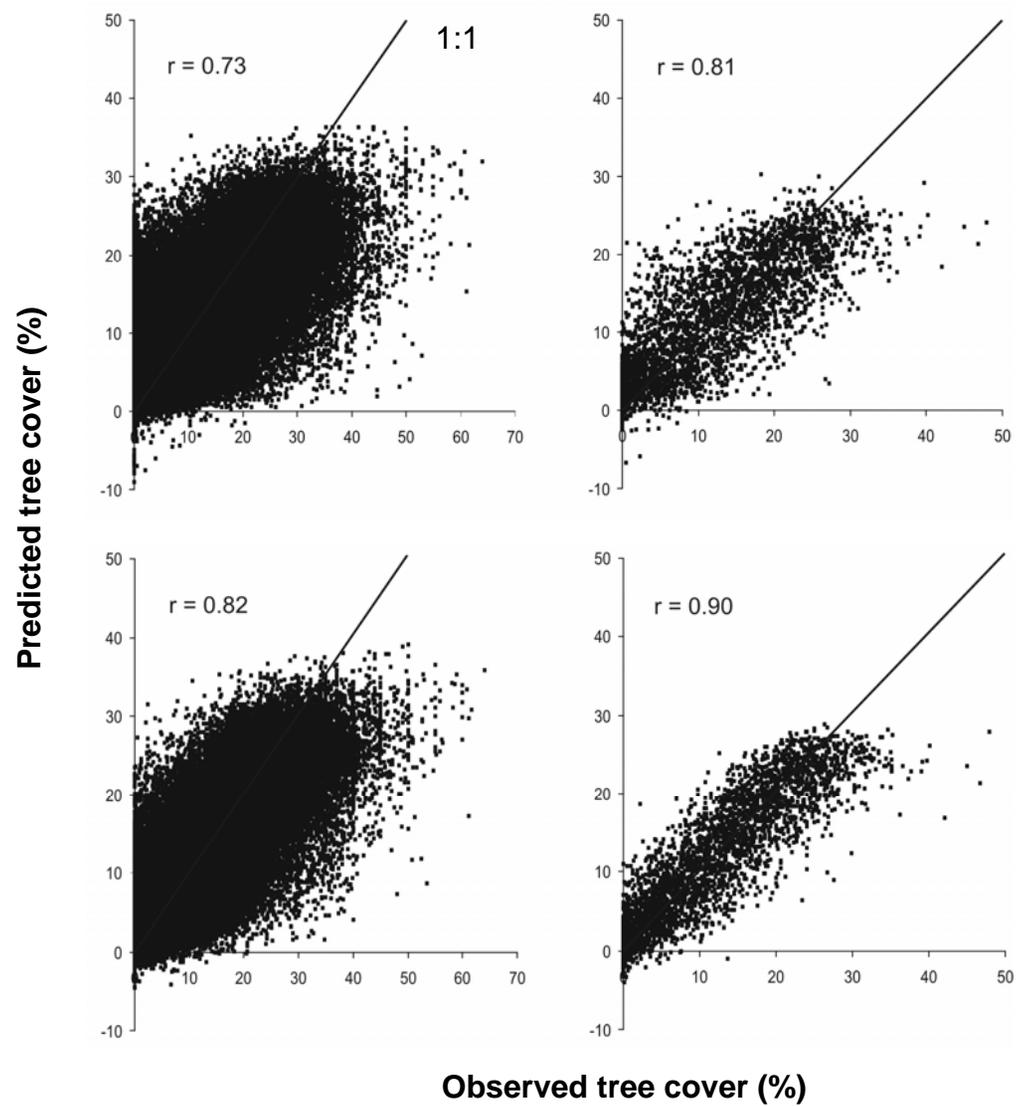


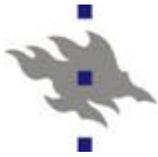
Nadir bands

All bands

275 m resolution

1.1 km resolution



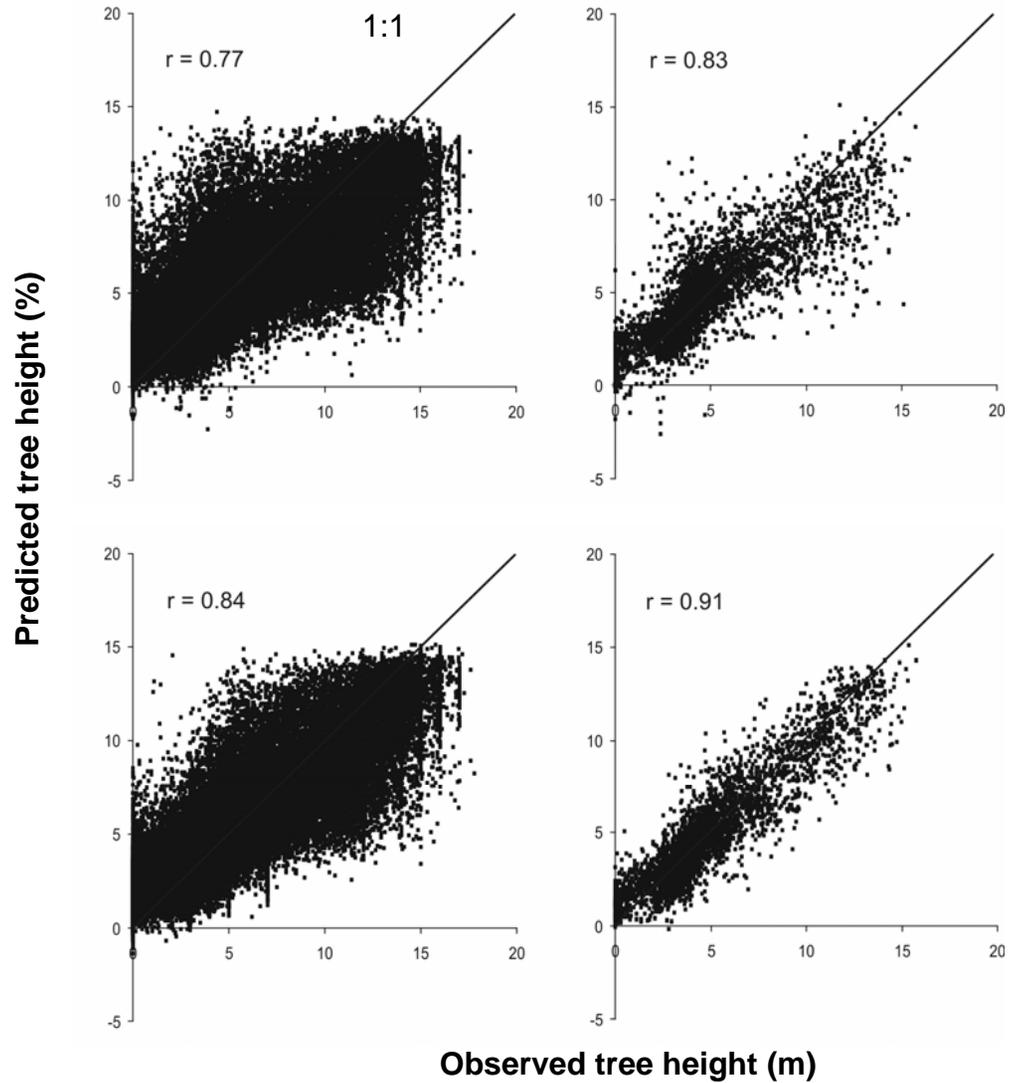


Nadir bands

All bands

275 m resolution

1.1 km resolution





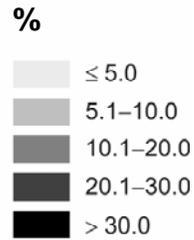
# Tree cover surfaces

Observed

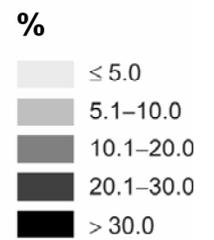
Predicted

Observed

Predicted



30 km



30 km

275 m resolution

1.1 km resolution



# Tree height surfaces

Observed

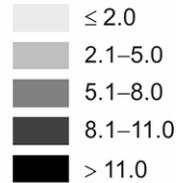
Predicted

Observed

Predicted



**m**

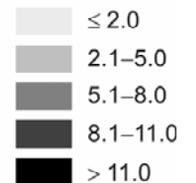


30 km

275 m resolution

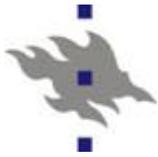


**m**

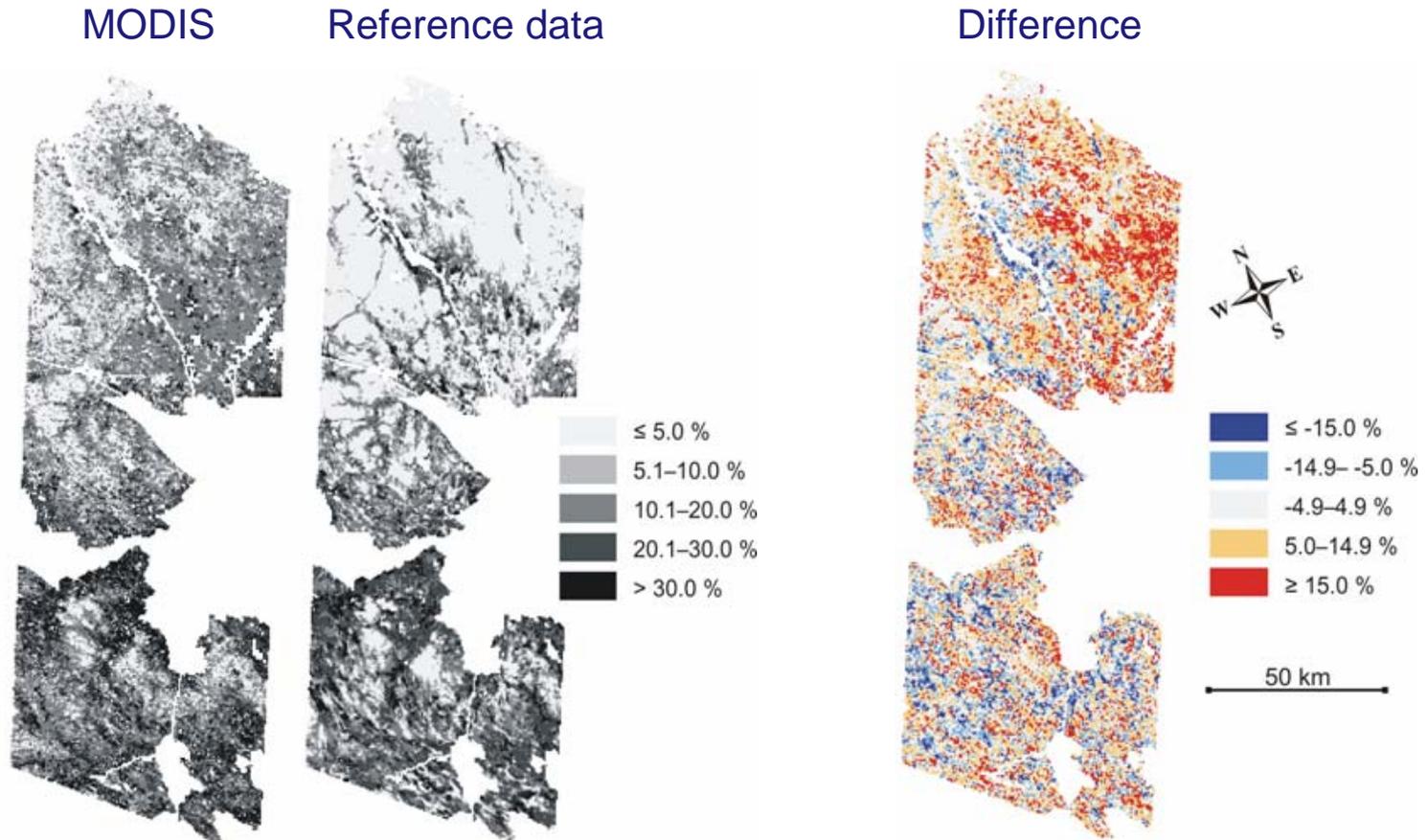


30 km

1.1 km resolution



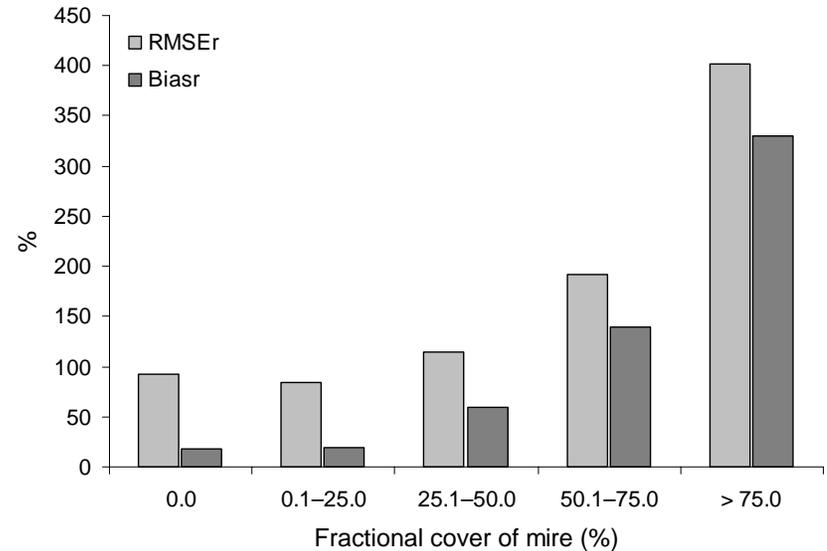
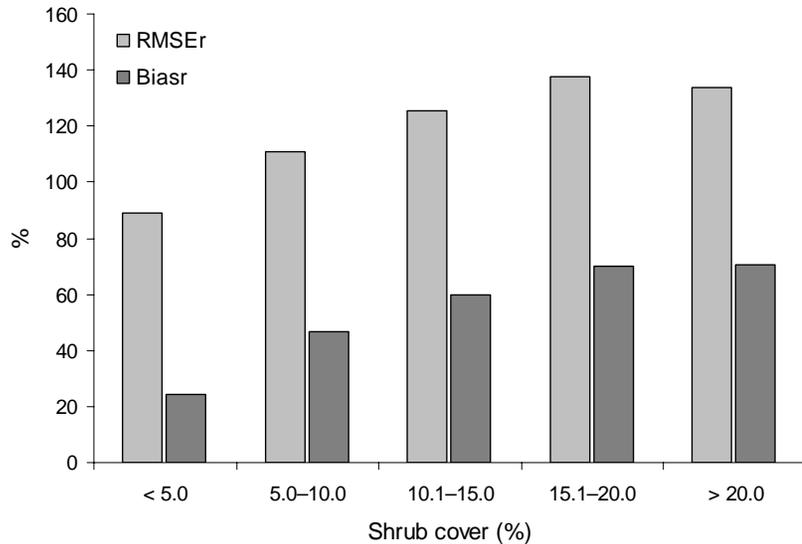
# MODIS continuous fields of tree cover



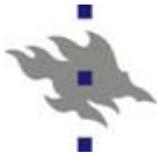
n	RMSE	RMSE <sub>r</sub> (%)	Bias	Bias <sub>r</sub> (%)	r
43631	11.36	101.9	4.13	37.0	0.474



## MODIS continuous fields of tree cover

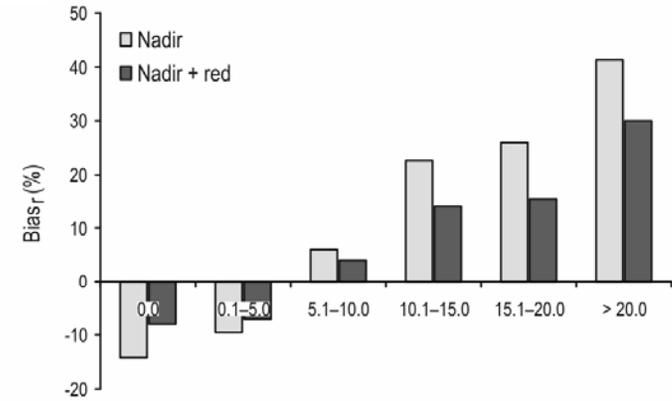
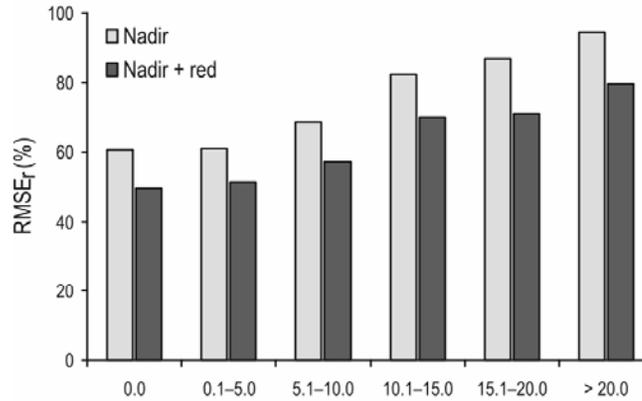


- Tree cover is overestimated in the areas of dense shrub cover and in the mires

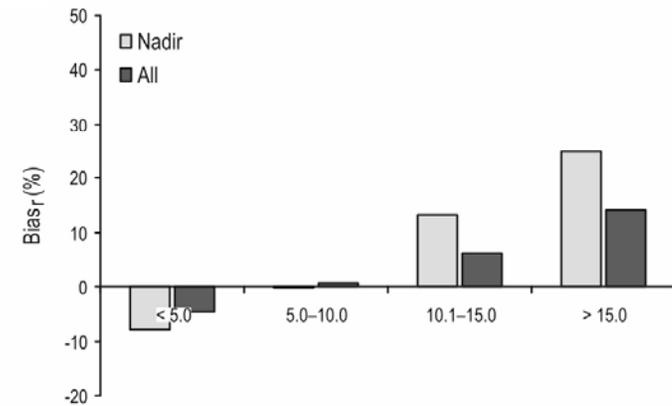
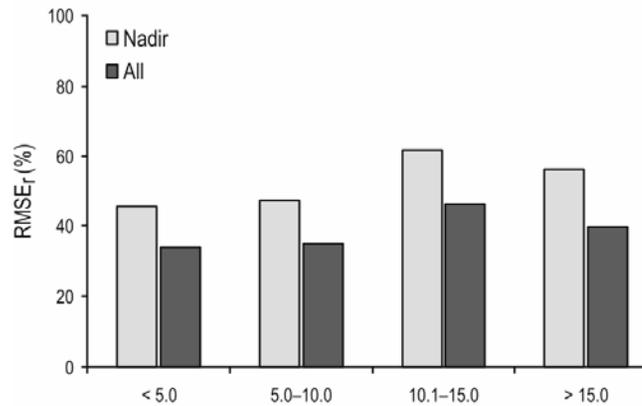


# Accuracy of the tree cover estimates in relation to shrub cover

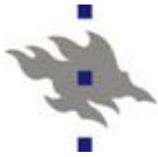
275 m



1.1 km

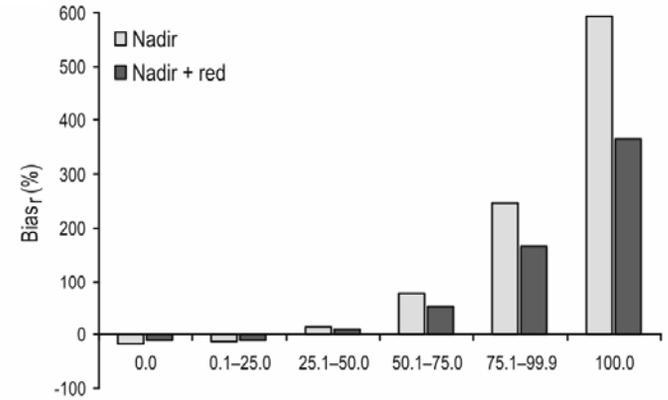
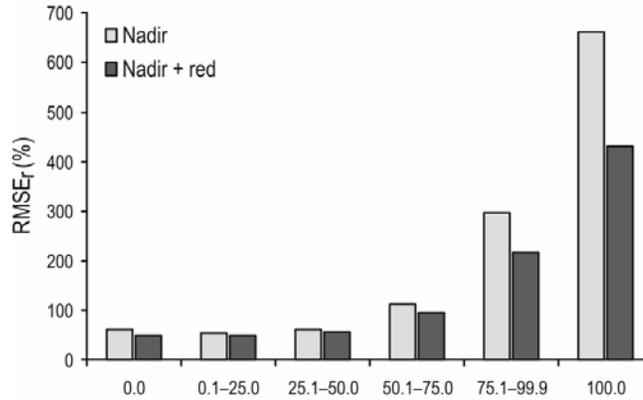


Shrub cover (%)

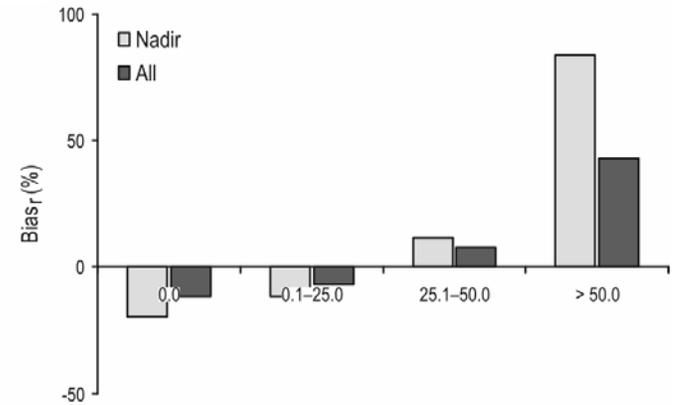
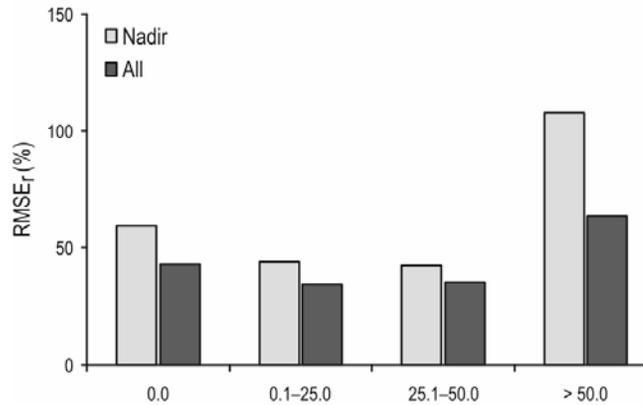


# Accuracy of the tree cover estimates in relation fractional cover of mire

275 m



1.1 km

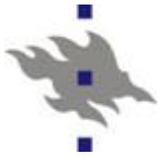


Fractional cover of mire (%)



## Conclusions

- The results suggest that directional information has potential to improve the tree cover and height estimates over the tundra–taiga transition zone in comparison to VIS–NIR nadir-view data only
- The multiangular data seem to increase sensitivity to the vegetation structure and reduce the effects of undergrowth vegetation
- The largest errors occurred when shrub cover was dense and in mires, but the inclusion of multiangular data improved estimates also in those areas



## Conclusions

- So far the use of multiangular data has been somewhat limited in land cover mapping in tundra–taiga transition zone
- For mapping large areas, the atmospheric correction of MISR data and application of an appropriate BRDF model would be necessary

**Thank you!**

