

# Analyzing SMAP fusion algorithms with airborne active and passive L-band microwave remote sensing

*C. Montzka<sup>(1)</sup>, T. Jagdhuber<sup>(2)</sup>, R. Horn<sup>(2)</sup>, H. Bogená<sup>(1)</sup>, I. Hajnsek<sup>(2,3)</sup>, A. Reigber<sup>(2)</sup>, and H. Vereecken<sup>(1)</sup>*

<sup>(1)</sup>Research Centre Jülich, Institute of Bio- and Geosciences: Agrosphere (IBG 3), Jülich, GERMANY

<sup>(2)</sup>German Aerospace Centre (DLR), Microwaves and Radar Institute, Oberpfaffenhofen, GERMANY

<sup>(3)</sup>ETH Zürich, Institute of Environmental Engineering, Zürich, SWITZERLAND

# Joint active and passive microwave platform development

Combination of PLMR2 and DLR F-SAR onboard the Dornier DO228 aircraft



- F-SAR is able to operate in 4 frequency bands (X, C, L and P)
- Dual (F-SAR) channel operation
- Polarisation: Dual linear (V and H)
- Incidence angles: +/- 8°, +/- 22°, +/- 38° @ pushbroom

# The 2013 campaign

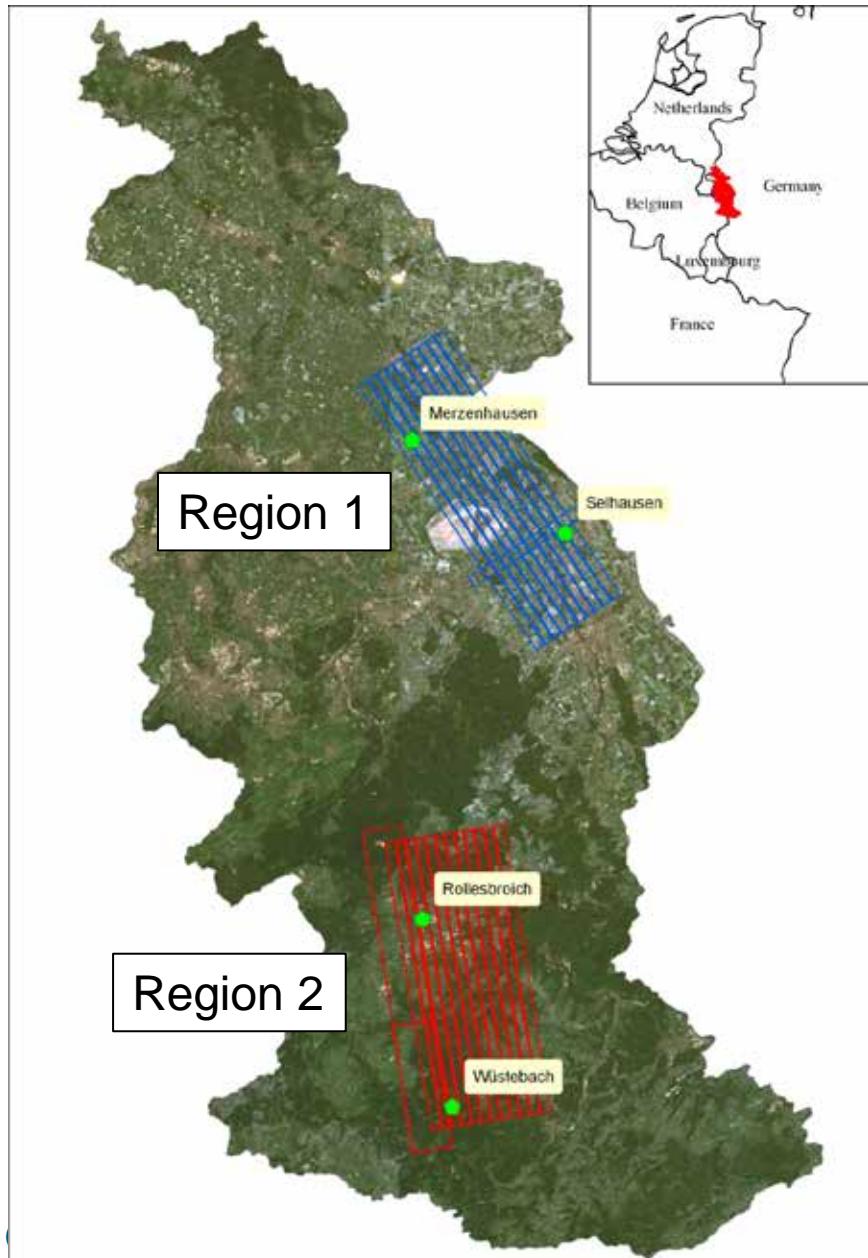
A-P measurements in the very heterogeneous Rur catchment:

Region 1 (agricultural land)

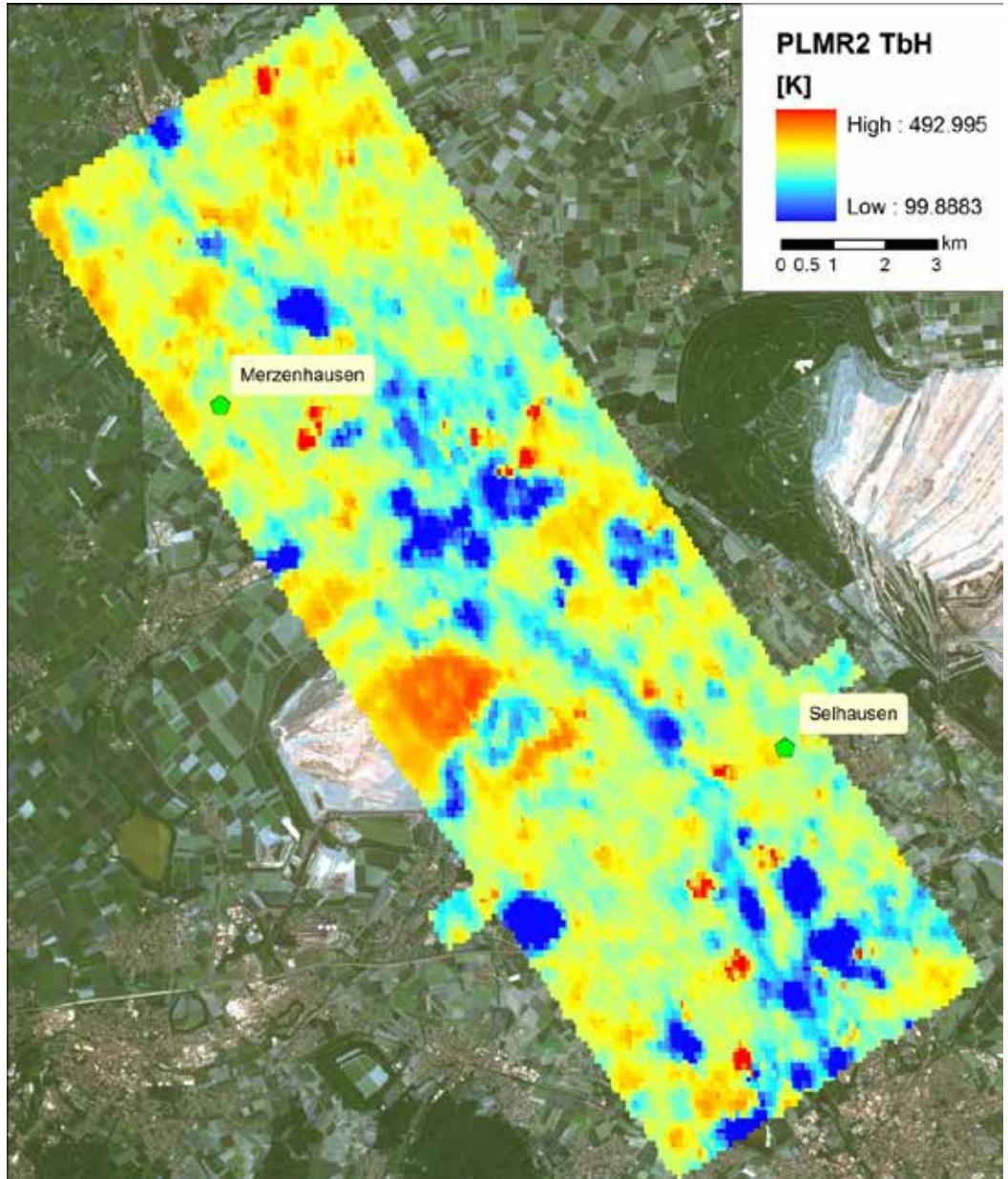
- 2013-04-17
- 2013-04-25
- 2013-05-14

Region 2 (forest, grassland)

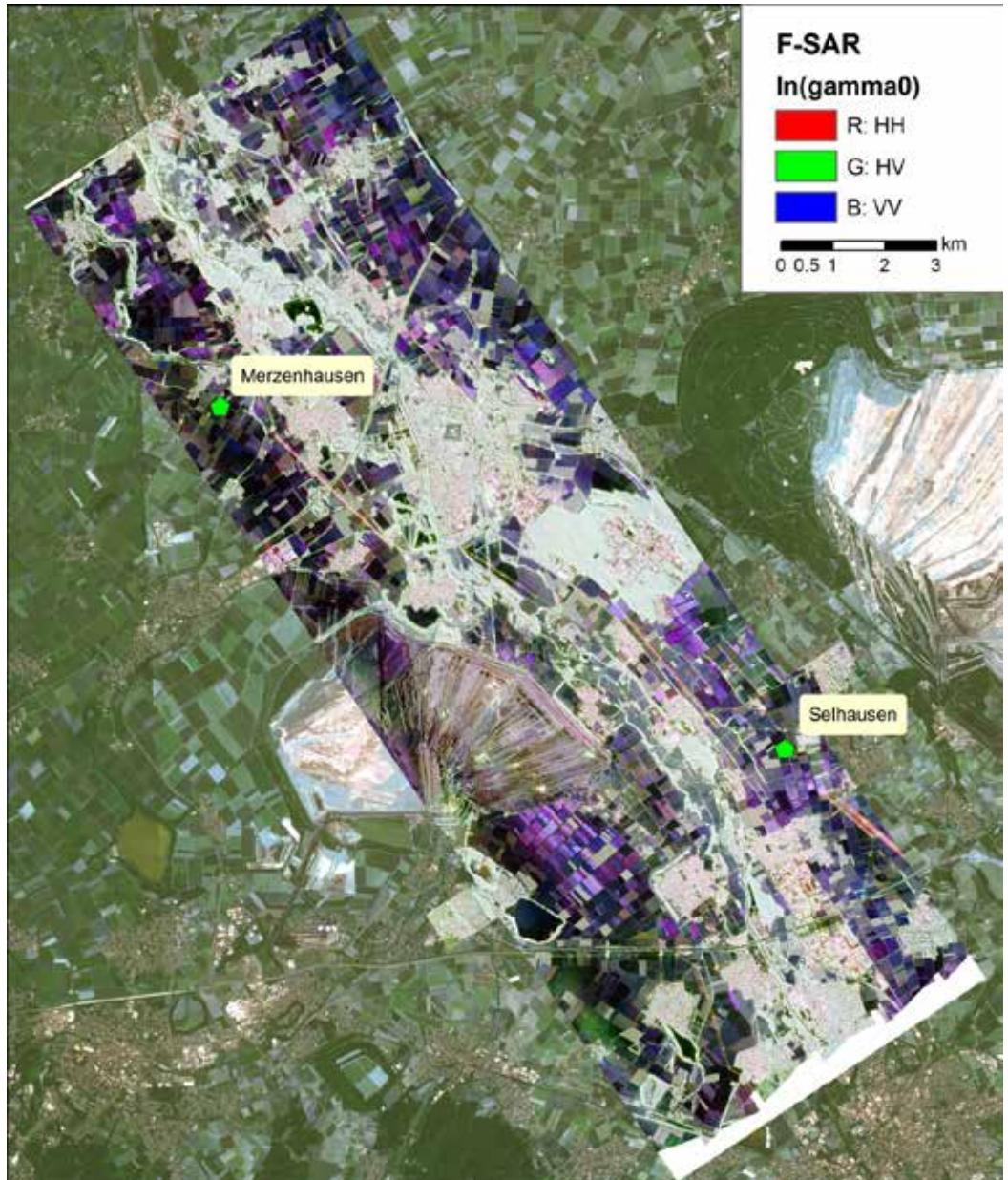
- 2013-04-18
- 2013-04-29
- 2013-05-06



# PLMR2 Tb



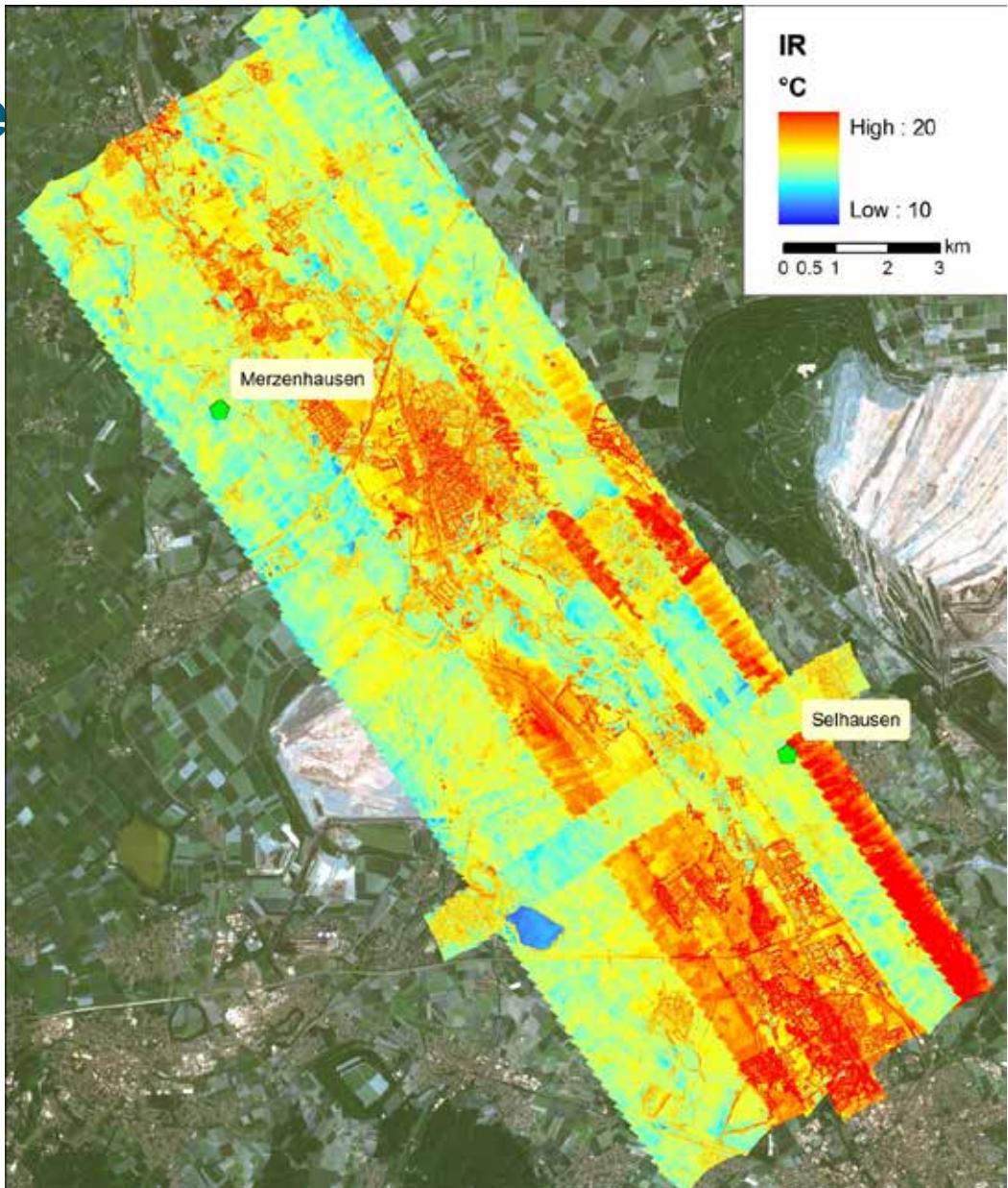
# F-SAR $\ln(\gamma_0)$



# Surface temperature

IGI DigiTerm

Complete solution for automated workflow for the generation of directly georeferenced thermal images



# Landsat-based LAI

LAI estimation:

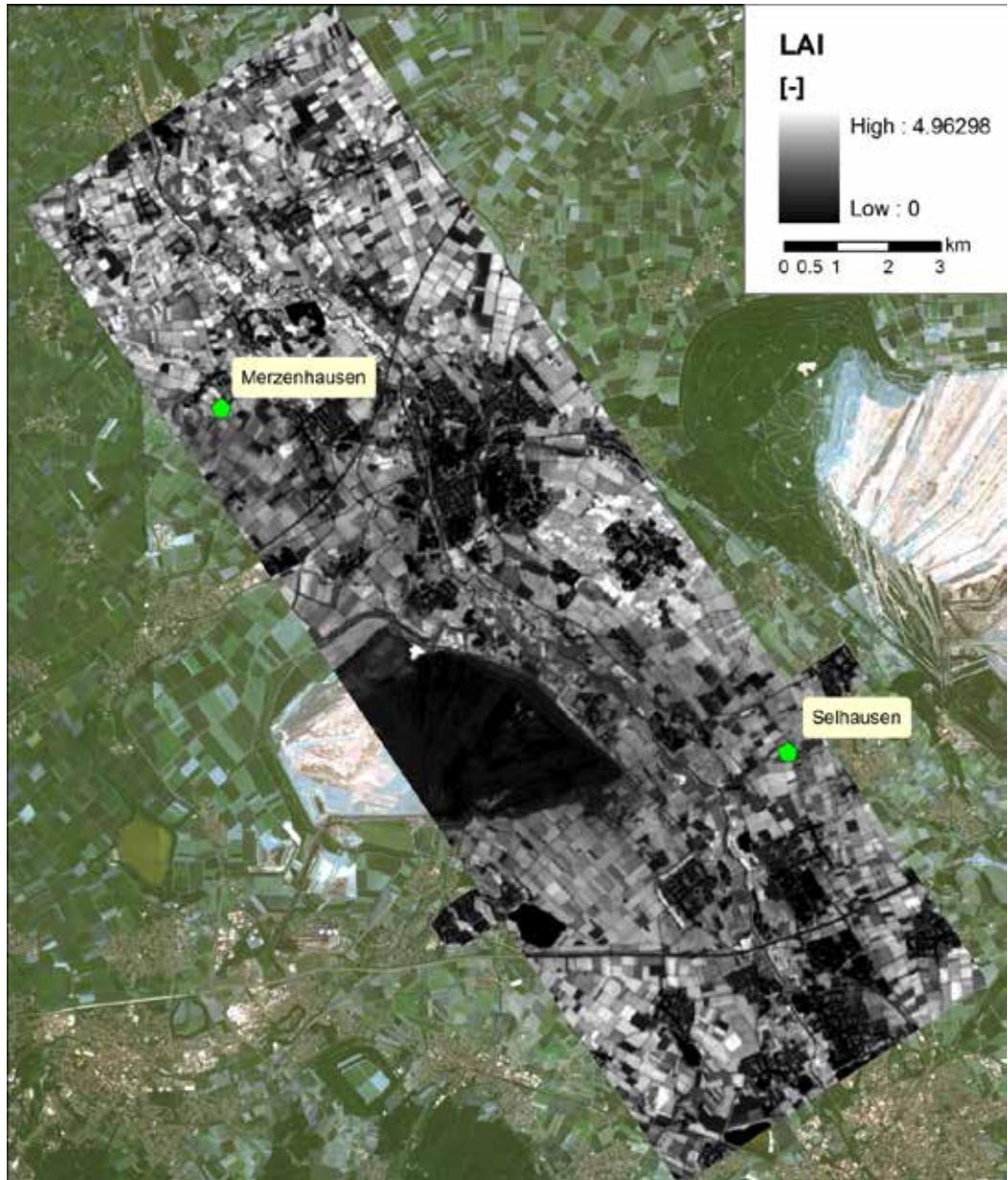
1.  $NDVI = (NIR - Red) / (NIR + Red)$
2.  $FVC = (NDVI - NDVIs) / (NDVIV - NDVIs)$
3.  $LAI = -\ln(1-FVC) / k(\theta)$

**FVC:** Fractional Vegetation Cover

**NDVIs:** NDVI at bare soil

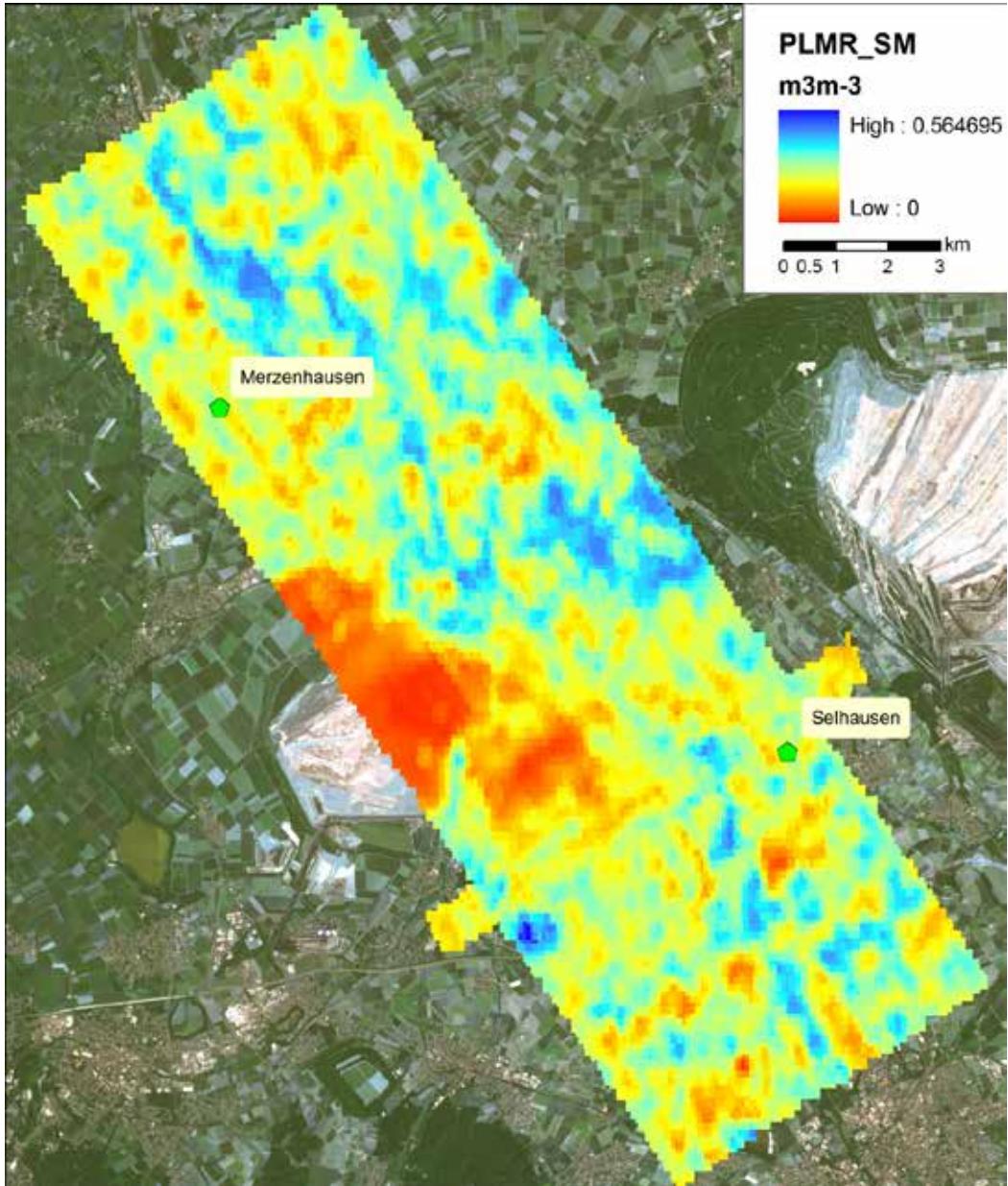
**NDVIV:** NDVI at full vegetation

**k(θ):** Light extinction coefficient



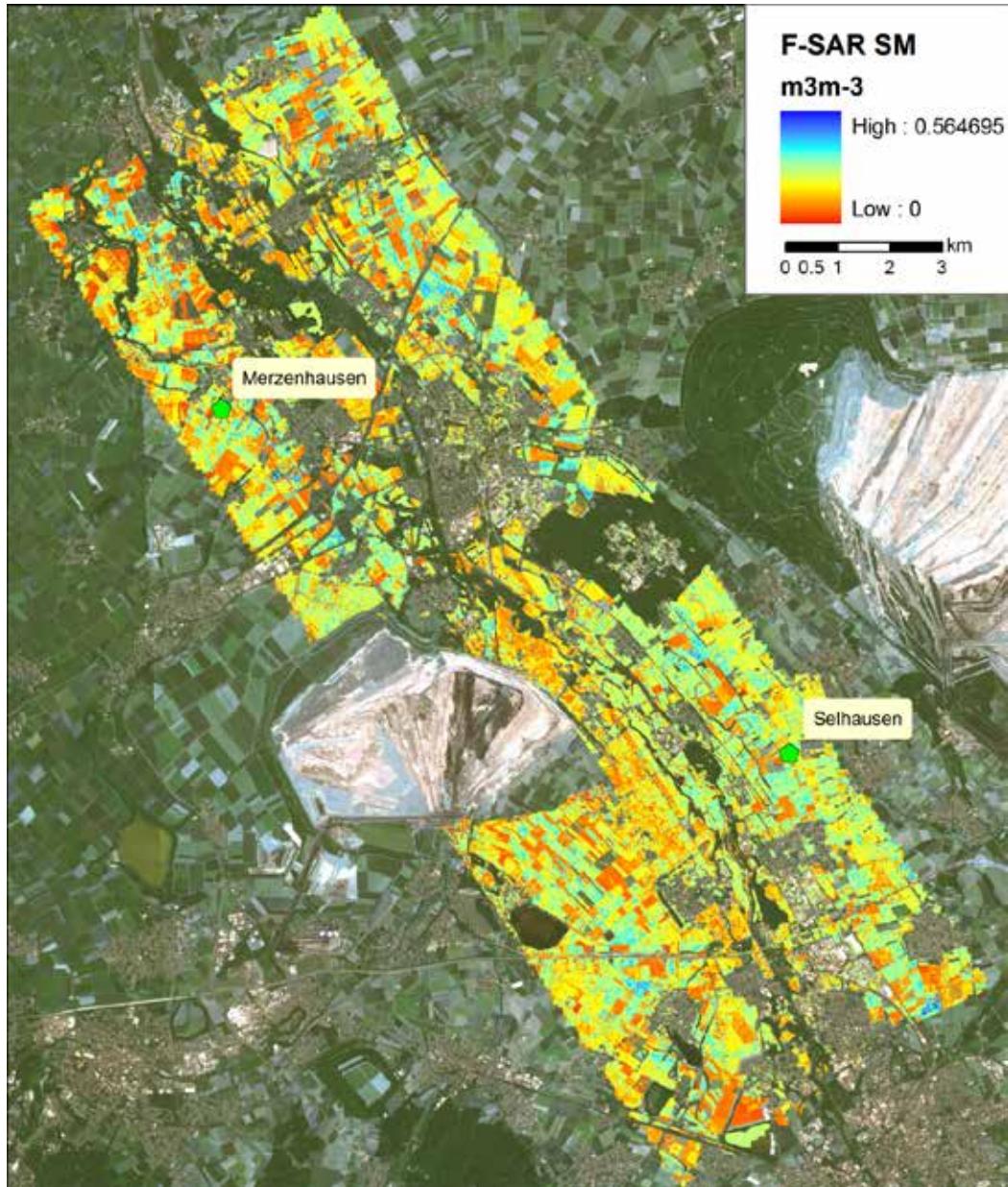
# PLMR2 SM

- L-MEB radiative transfer model
- Utilizing LAI, soil map, surface temperature,  
...
- Calculated on footprint level for different incidence angles with subsequent interpolation



# F-SAR SM

- polarimetric, hybrid decomposition for separating soil and vegetation contributions (Jagdhuber et al., 2013)
- Extracted soil component is inverted for soil moisture using a polarimetric soil scattering model



# Algorithm A SMAP Alternative

Disaggregation of the radiometer soil moisture product

(Das et al. 2011):

$$q_{\text{fuse}}(M) = q_{\text{passive}}(C) + b_1(\ln(s_{\text{active}}(M)) - \ln(\overline{s_{\text{active}}}(M)))$$

C: Coarse scale

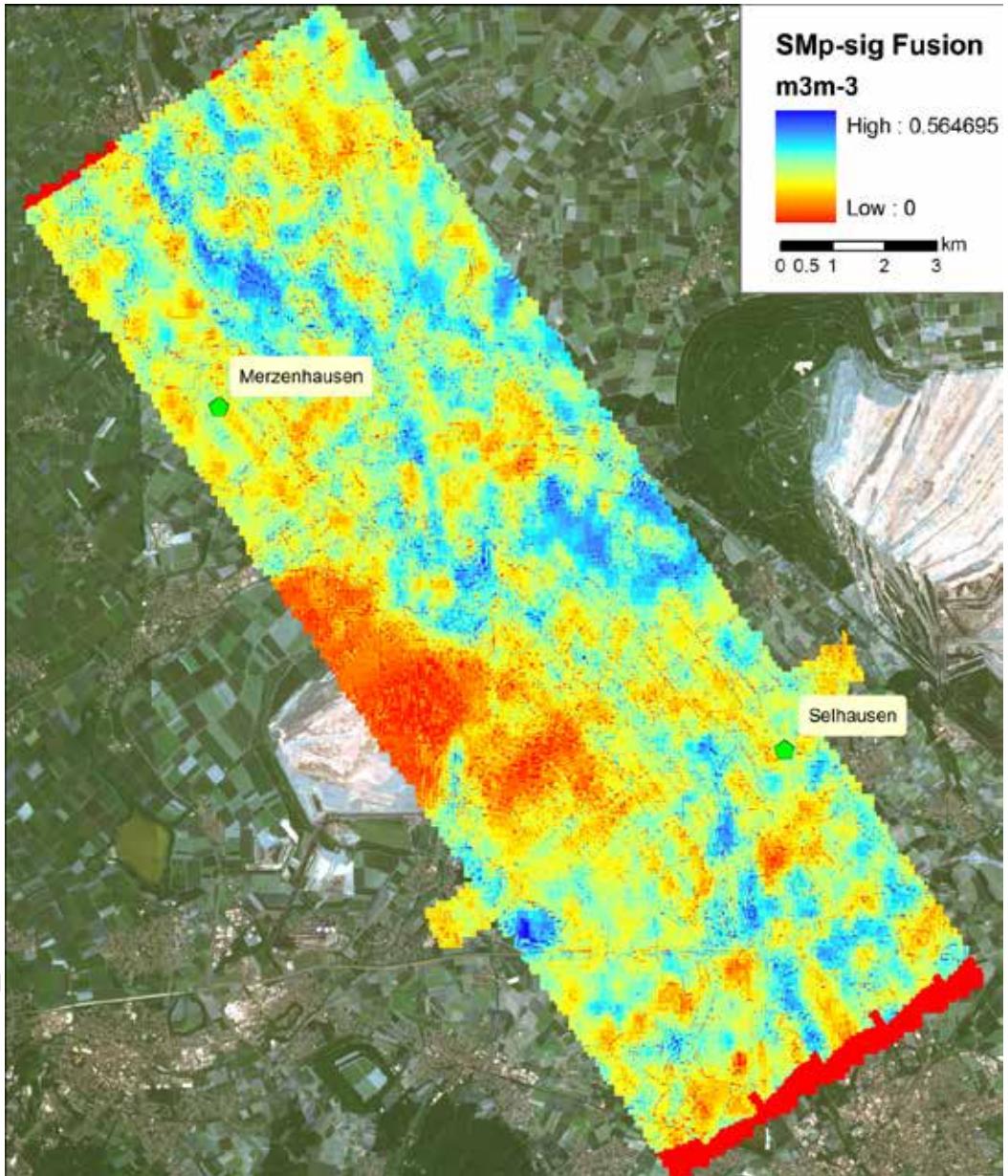
M: Medium scale

$\theta_{\text{fuse}}$ : Fused active-passive sm

$\theta_{\text{passive}}$ : Radiometer sm

$\sigma_{\text{active}}$ : Radar backscatter

$\beta_1$ : Scaling parameter



# Algorithm B SMAP Baseline

Disaggregation of  
radiometer brightness  
temperatures

(Das et al. 2014):

$$Tbv(M) = Tbv(C) + \\ b_2((\sigma_{vv_{active}}(M) - \overline{\sigma_{vv_{active}}(M)}) \\ + G(\overline{shv_{active}(M)} - shv_{active}(M)))$$

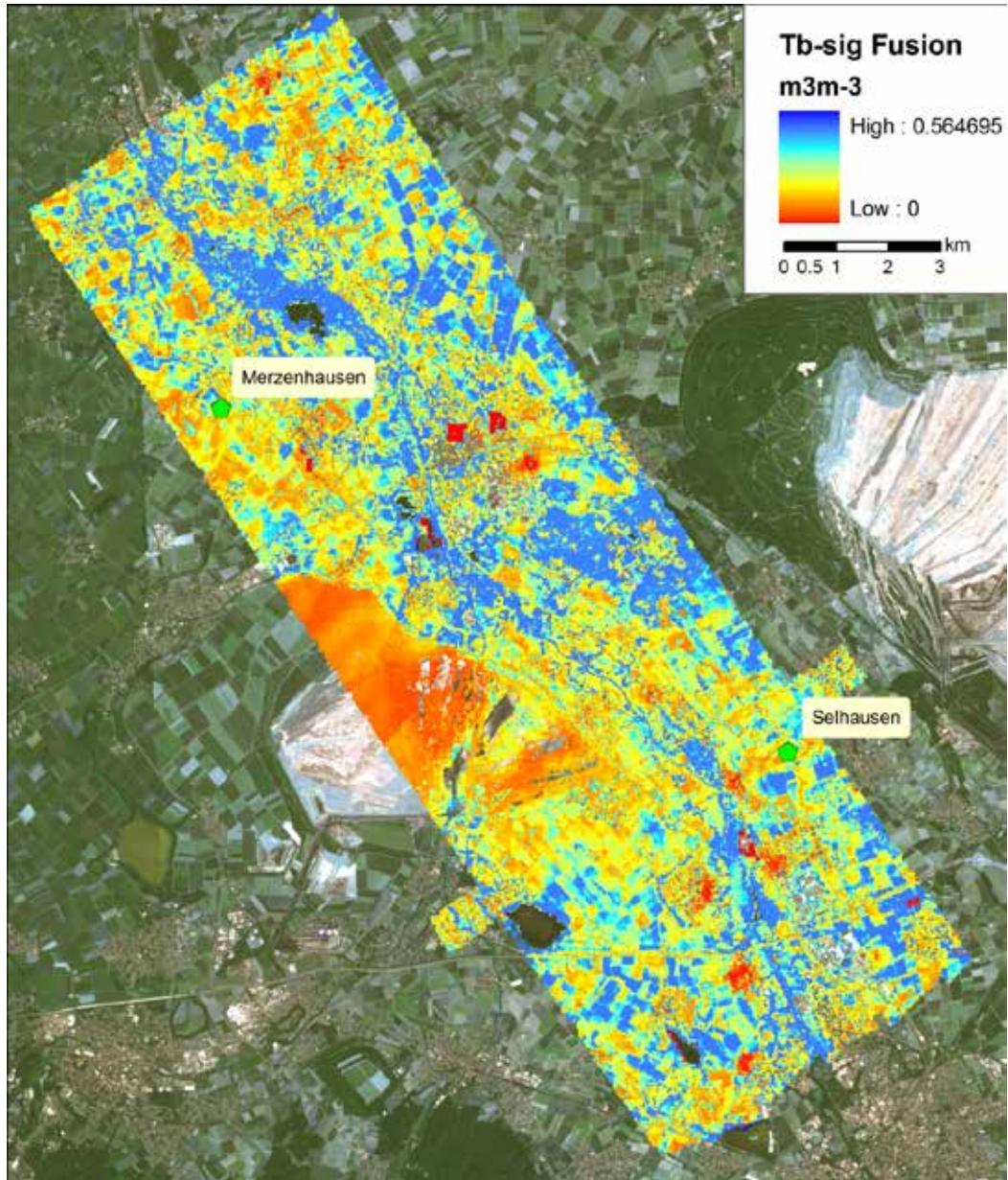
C: Coarse scale

M: Medium scale

Tb: Brightness temperature

$\sigma_{active}$ : Radar backscatter

$\beta_2$ : Scaling parameter



# Algorithm C

Fusion of two soil moisture products:

$$q_{fuse}(M) = q_{passive}(C) + \\ b_3(q_{active}(M) - \overline{q_{active}(M)})$$

C: Coarse scale

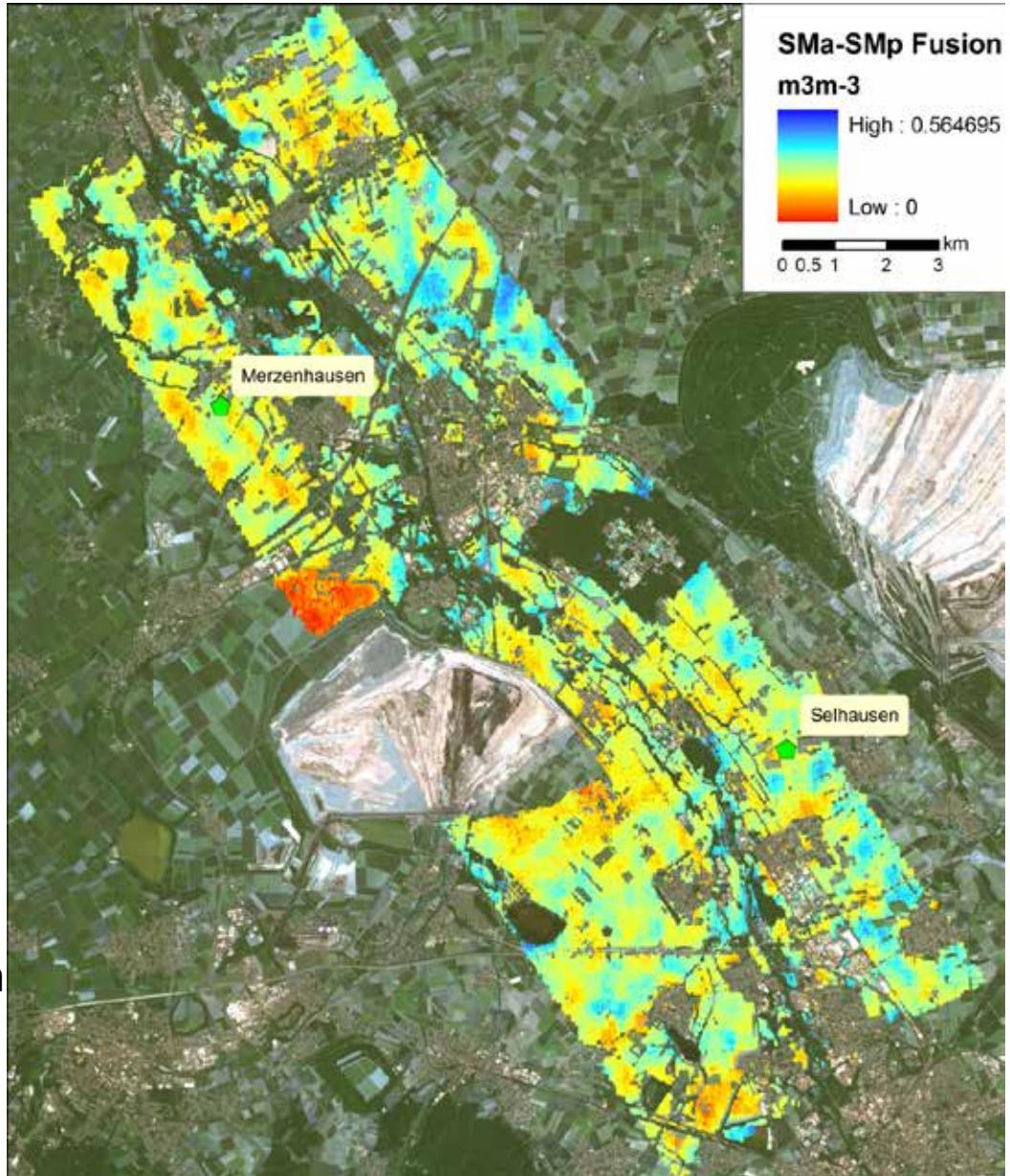
M: Medium scale

$\theta_{fuse}$ : Fused active-passive sm

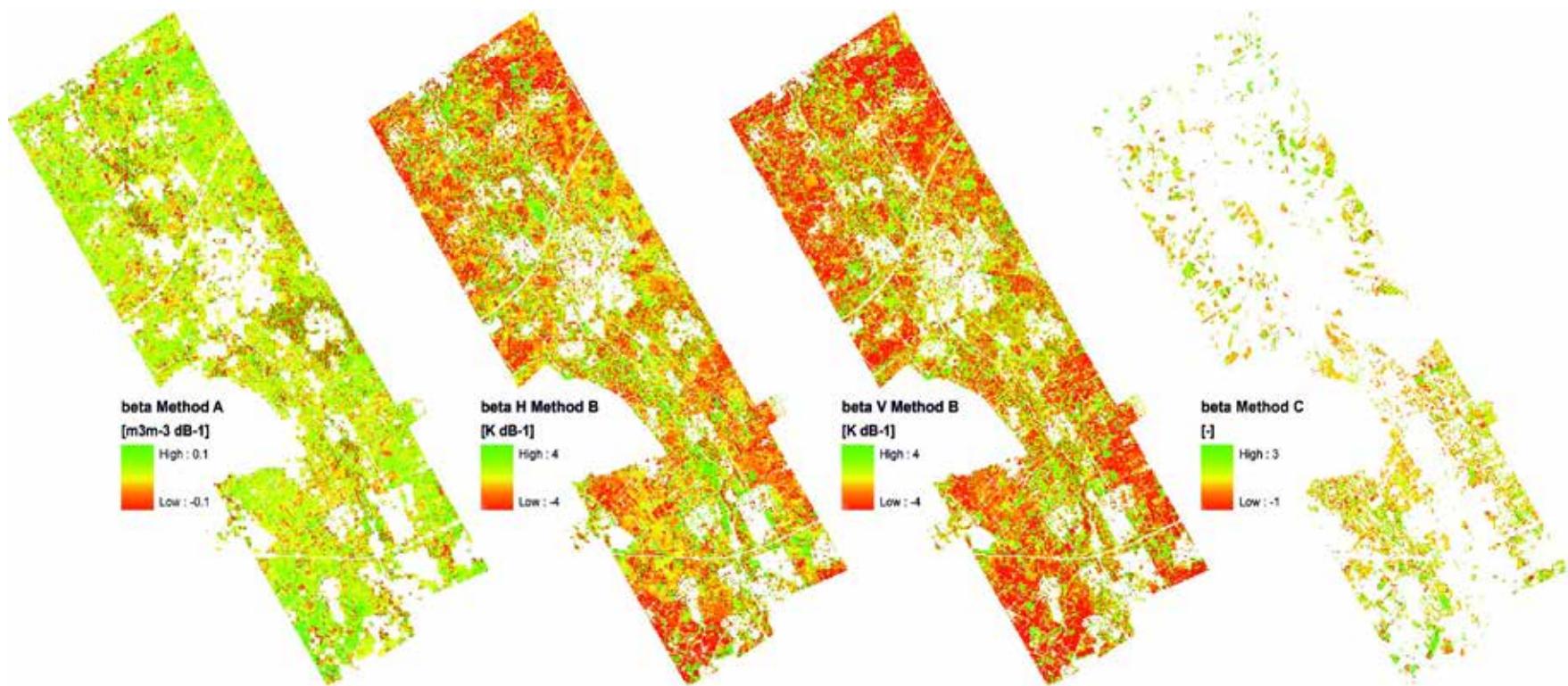
$\theta_{passive}$ : Radiometer sm

$\theta_{active}$ : Radar sm product

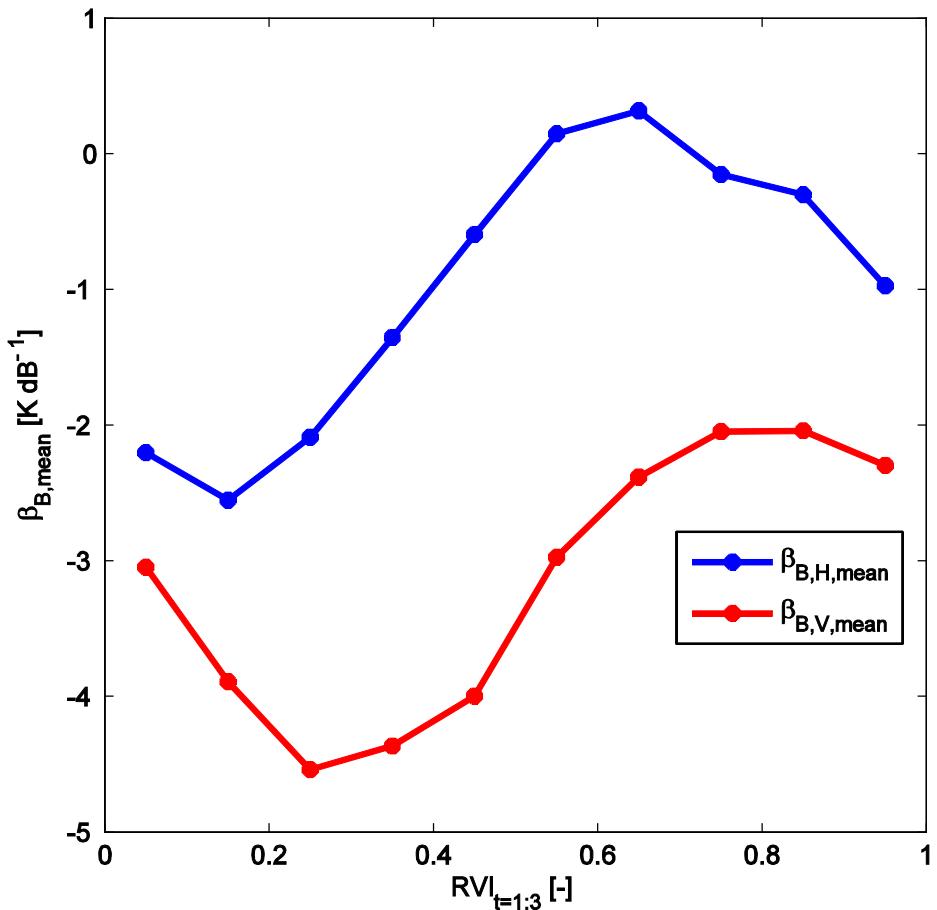
$\beta_3$ : Scaling parameter



# beta estimation

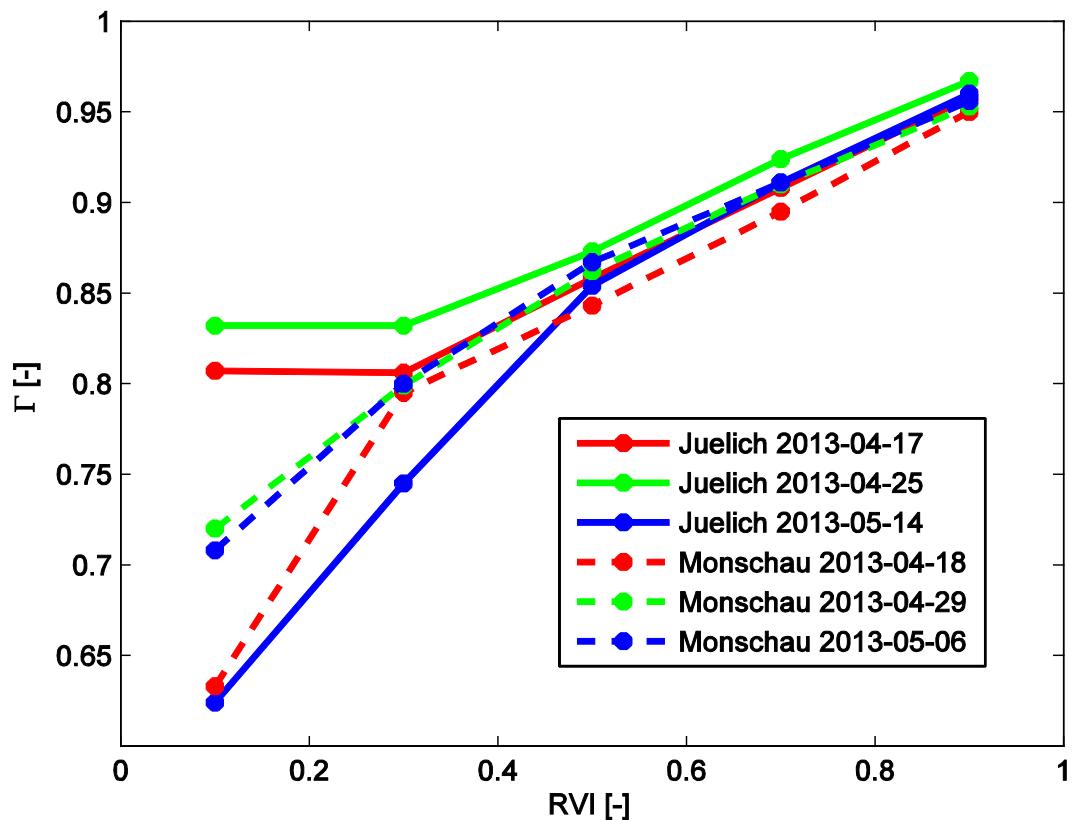


# Relationship of beta with RVI



Similar to studies by  
Wu et al. 2014 and  
Das et al. 2014

# Gamma estimation



$$\begin{aligned}
 Tbv(M) = & Tbv(C) + \\
 & b_2((svv_{active}(M) - \overline{svv_{active}(M)}) \\
 & + G(\overline{shv_{active}(M)} - shv_{active}(M)))
 \end{aligned}$$

# Validation results

		RMSD [ $\text{m}^3\text{m}^{-3}$ ]	
Soil Moisture retrieval method	Scale	Juelich	Monschau
PLMR2 only ( $\theta_{Tb}$ )	$C$	0.0639 (59)	0.0701 (18)
Method A ( $\theta_{\theta,\sigma}$ )	$M$	0.0831 (148)	0.0940 (57)
Method B ( $\theta_{Tb,\sigma}$ )	$M$	0.0655 (162)	0.0771 (98)
Method C ( $\theta_{\theta_{Tb},\theta_\sigma}$ )	$M$	0.0779 (106)	-
FSAR only ( $\theta_\sigma$ )	$M$	0.0796 (116)	-

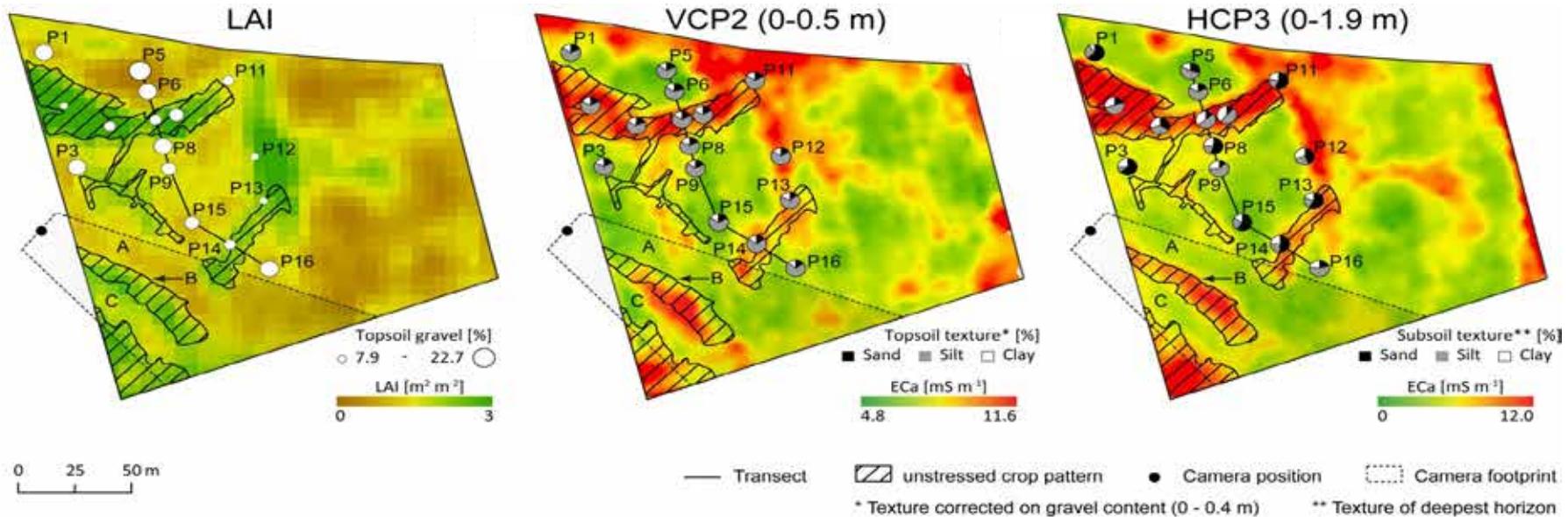
**Soil moisture retrieval accuracy RMSD [ $\text{m}^3\text{m}^{-3}$ ], for different fusion methods and scales over three flights per test region. In brackets the number of pixels used for validation is given.**

# Subsurface heterogeneity observed by RapidEye



# Subsurface heterogeneity observed by EMI

## Electromagnetic Induction (EMI)



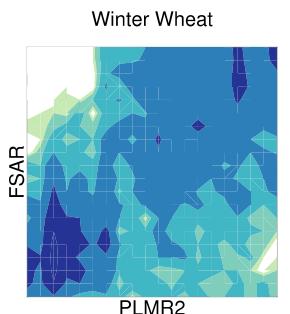
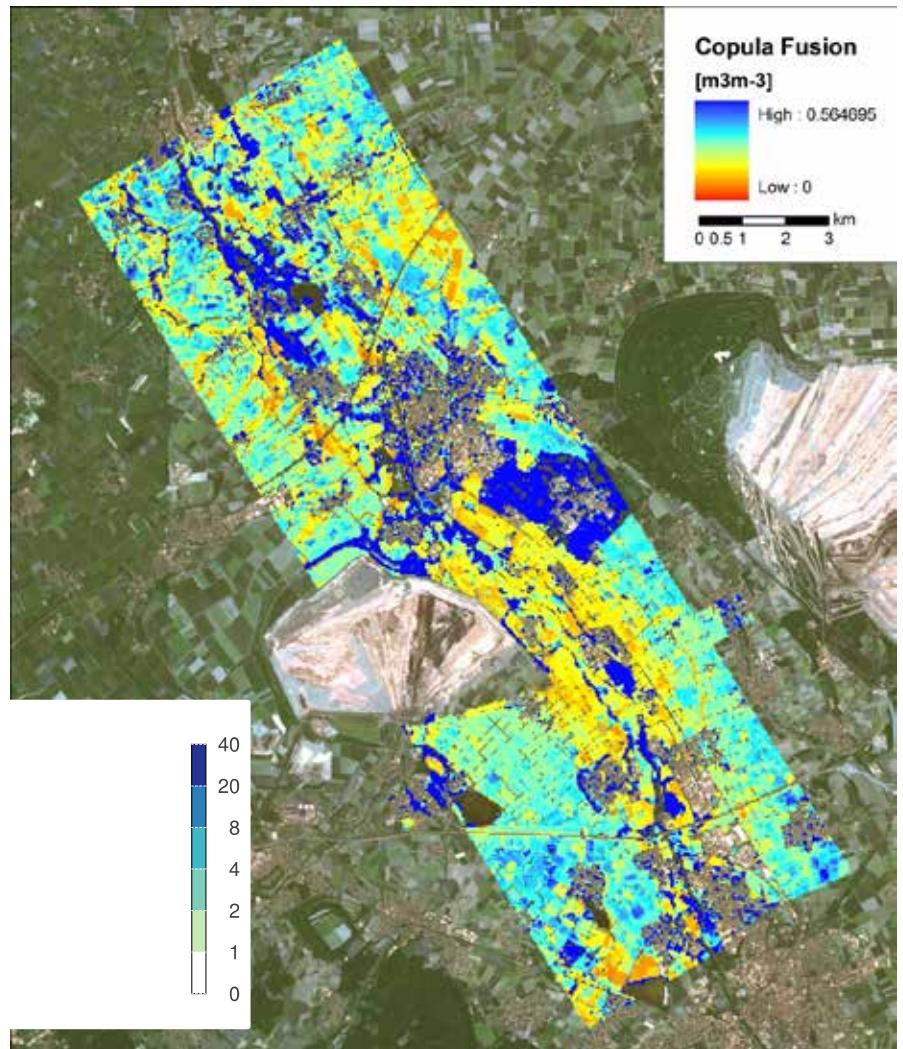
# Conclusions

- SMAP active-passive soil moisture fusion methods were analyzed in a very heterogeneous region
- SMAP Baseline algorithm performs best, also because sm inversion is supported by higher resolution auxiliary data (LAI, soil temperature)
- Fusion methods are able to perform similar on a higher spatial scale as radiometer-only soil moisture products on coarse scale, but not better
- beta and Gamma are linearly related to RVI
- Subsurface heterogeneity needs to be accounted for on this high spatial scale

# Outlook: Copula-based active-passive fusion

Christof Lorenz\*, Carsten Montzka\*\*,  
Thomas Jagdhuber\*\*\*, Patrick Laux\*,  
Dara Entekhabi\*\*\*\*, Harry Vereecken\*\*,  
Harald Kunstmann\*

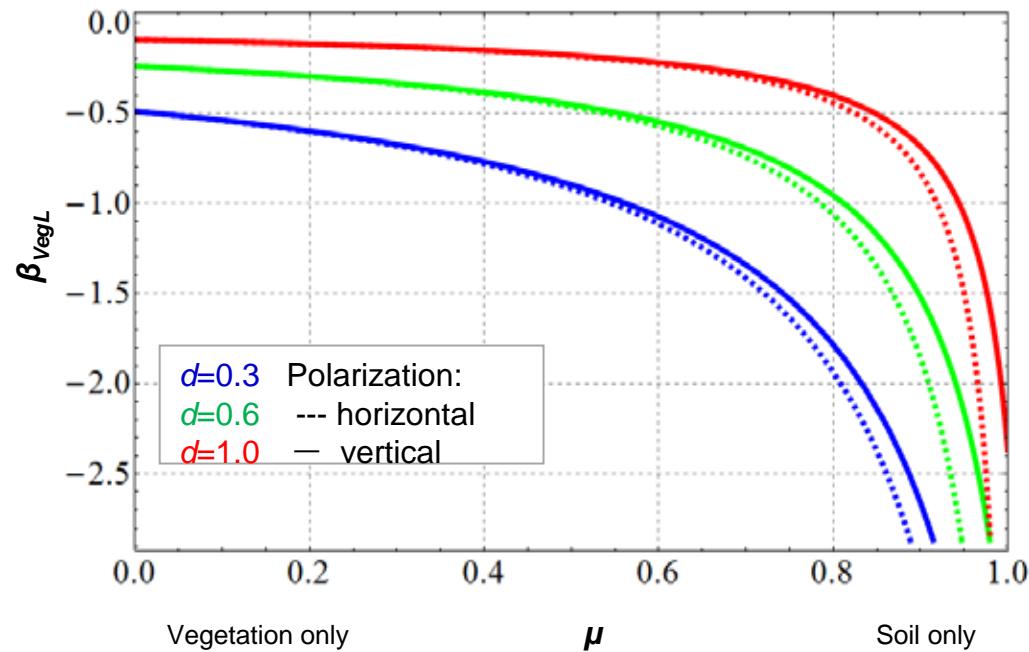
\*KIT, \*\*Jülich, \*\*\*DLR, \*\*\*\*MIT



# Outlook: Forward modeling of beta

Thomas Jagdhuber\*, Dara  
 Entekhabi\*\*, Alexandra  
 Konings\*\*, Kaighin McKoll\*\*,  
 Hamed Alemohammad\*\*,  
 Narendra Das\*\*\*, Carsten  
 Montzka\*\*\*\*,

\*DLR, \*\*MIT, \*\*\*JPL, \*\*\*\*Jülich



Variation of vertically (solid) and horizontally (dashed) polarized  $\beta_{VegL}$  for different vegetation heights ( $d$ ) [m] along the ground-to-volume ratio ( $\mu$ );  $\theta=40^\circ$ ,  $Vol=0.01$ ,  $\epsilon_L''=\epsilon_{St}''=10$ ,  $\epsilon_{St}'=70$ ,  $ks=0.3$ ,  $kl=1.5$ .



Biosphere



Geosphere



Hydrosphere



Cryosphere

The key objective of the Alliance is to prepare Helmholtz centers and science community for the utilization and integration of bio/geo-physical products provided by the next generation radar remote sensing missions (e.g. Tandem-L) into the study of natural and anthropogenic impact on Earth's ecosystems.

<http://hgf-eda.de/>



HelmholtzZentrum münchen  
German Research Center for Environmental Health



Eidgenössische Technische Hochschule Zürich  
Swiss Federal Institute of Technology Zurich



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ERLANGEN-NÜRNBERG



# Further remote sensing activities

Tomorrow 13:30 – 15:30

## Discussion group 2: Remote Sensing

A fully automated Sentinel-1 based flood mapping service

*Sandro Martinis, DLR Oberpfaffenhofen*

Overview on current optical remote sensing sensors for environmental research and future prospects

*Daniel Sprengler, GFZ Potsdam*

Active-Passive Microwave Sensing for Soil Moisture Estimation and Validation: The SMAP Mission

*Thomas Jagdhuber, DLR Oberpfaffenhofen; Carsten Montzka, FZJ Jülich;  
Dara Entekhabi, MIT Cambridge*