



# *In-Situ soil moisture and its relation to remotely sensed retrievals*

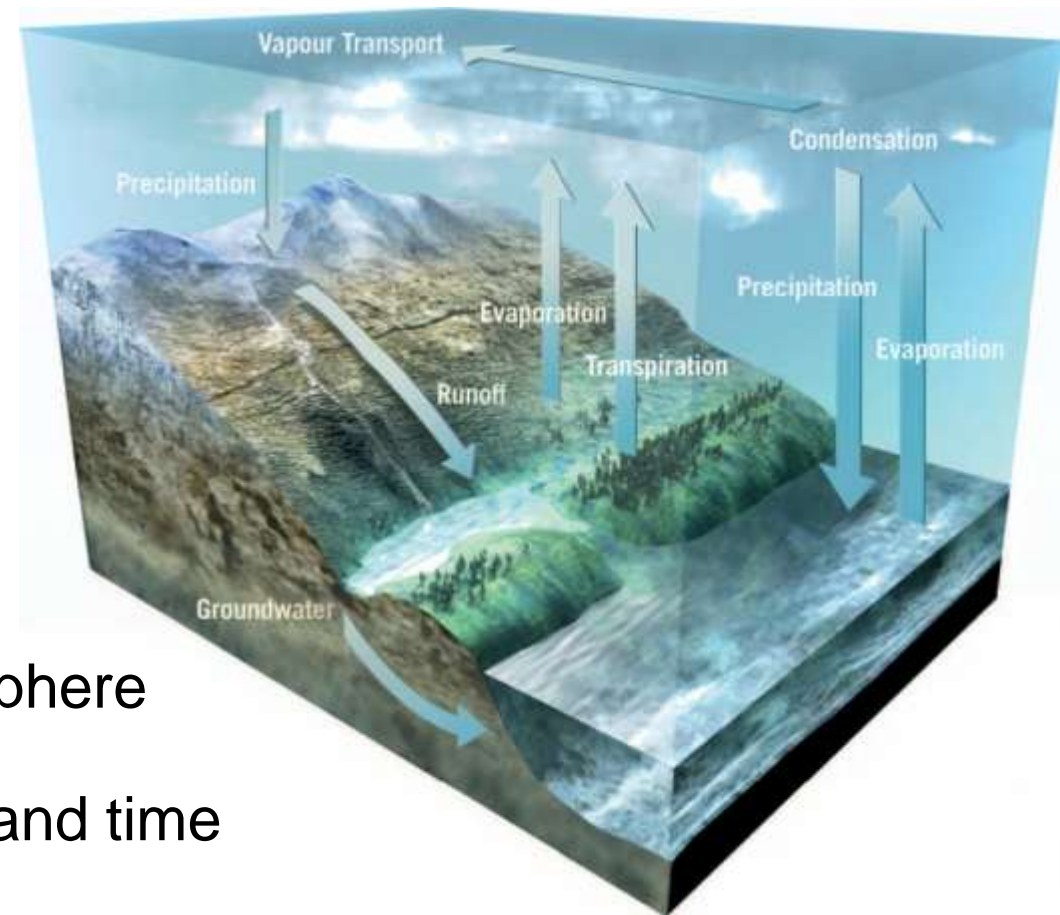
Heye Bogena, Carsten Montzka and Harry Vereecken



# Soil moisture

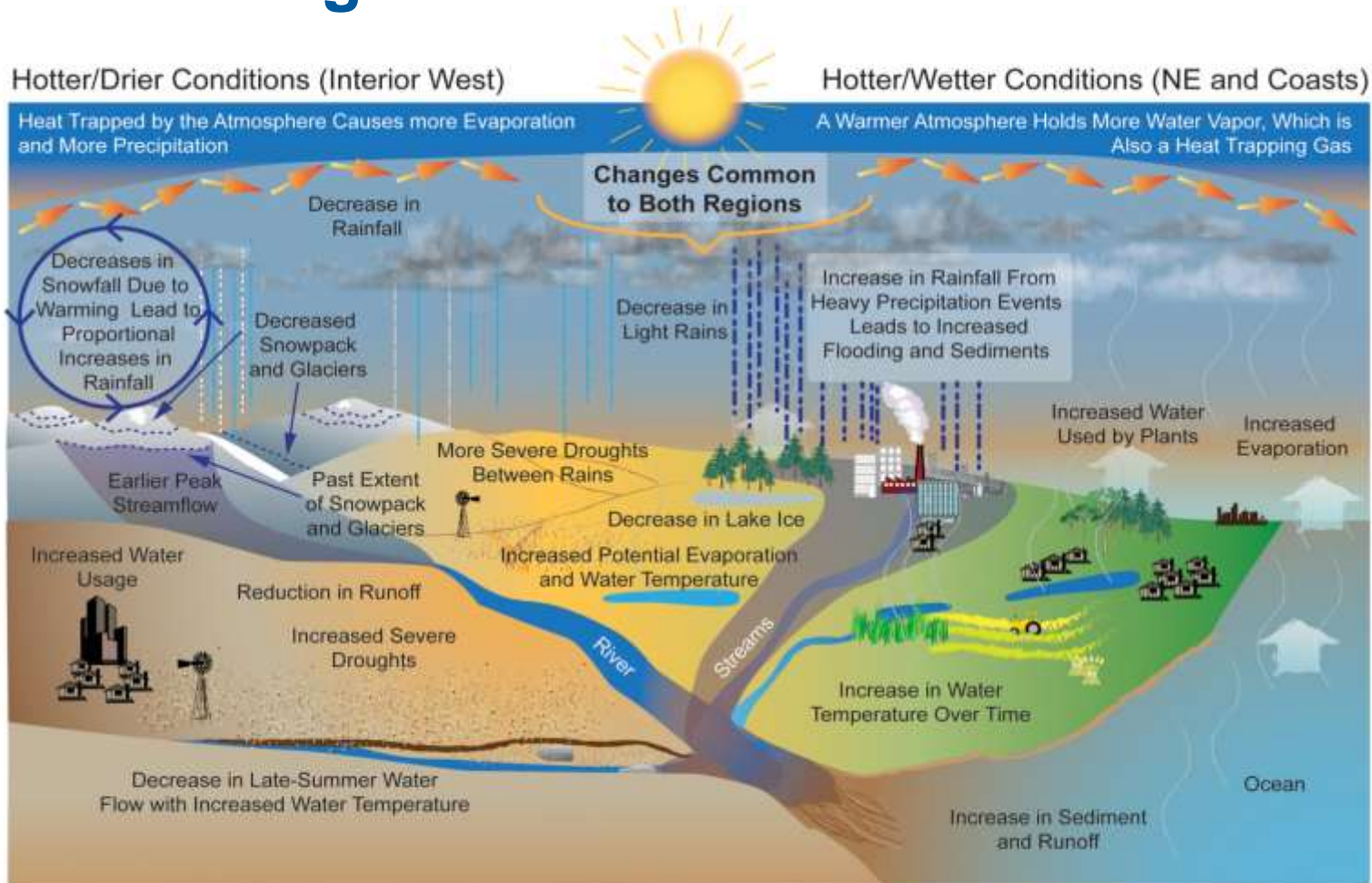
Soil moisture is:

- A key variable in the global water cycle
- Controlling the exchange of water and energy between land and atmosphere
- Highly variable in space and time
- However still not routinely measured (e.g. DWD)





# Global Change Effects

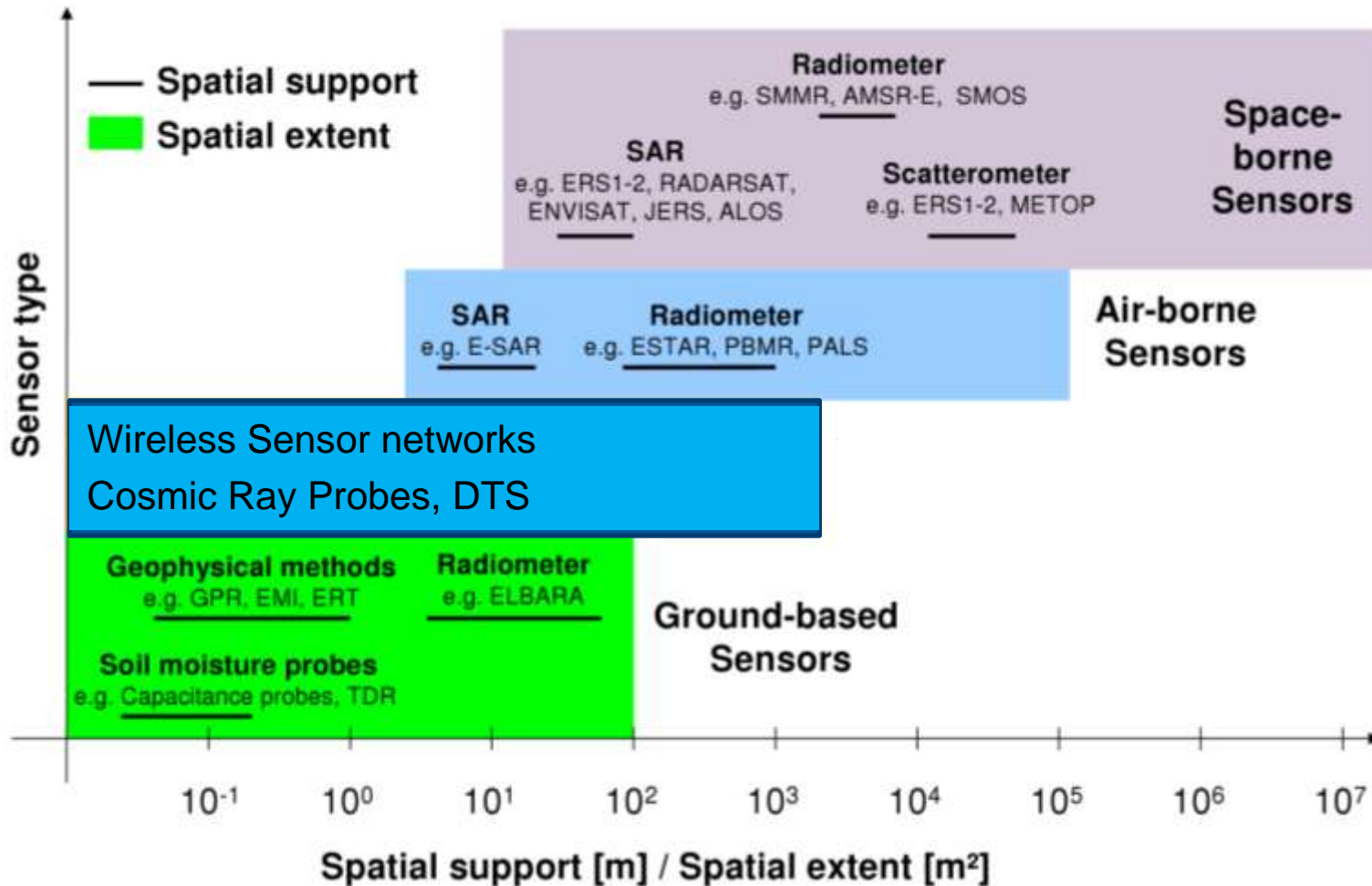


NOAA/NCDC

The water cycle exhibits many changes as the earth warms. Wet and dry areas respond differently.

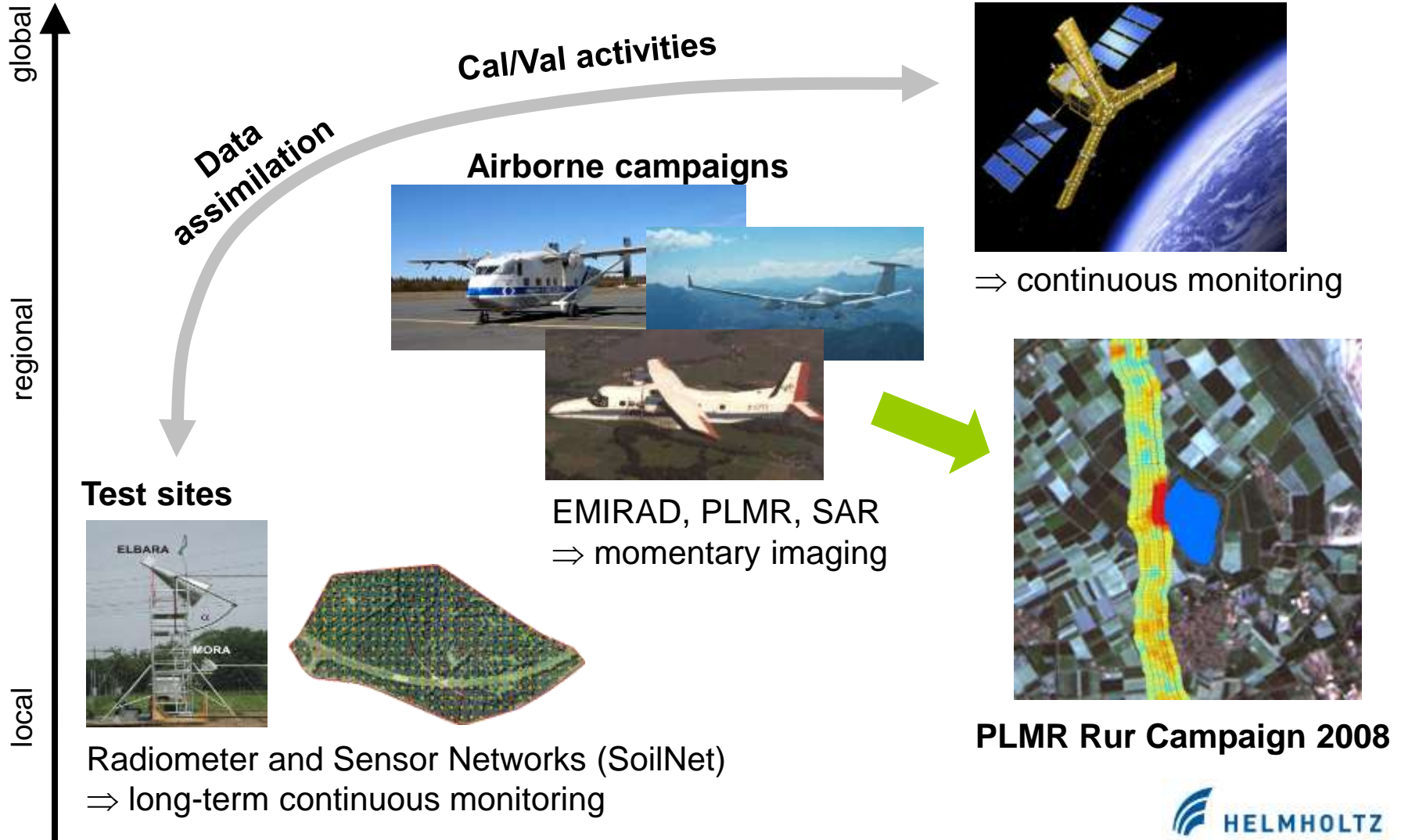


# Available measurement techniques





# Soil moisture remote sensing





# The Rur catchment and its test sites

## Grassland test site „Kall“

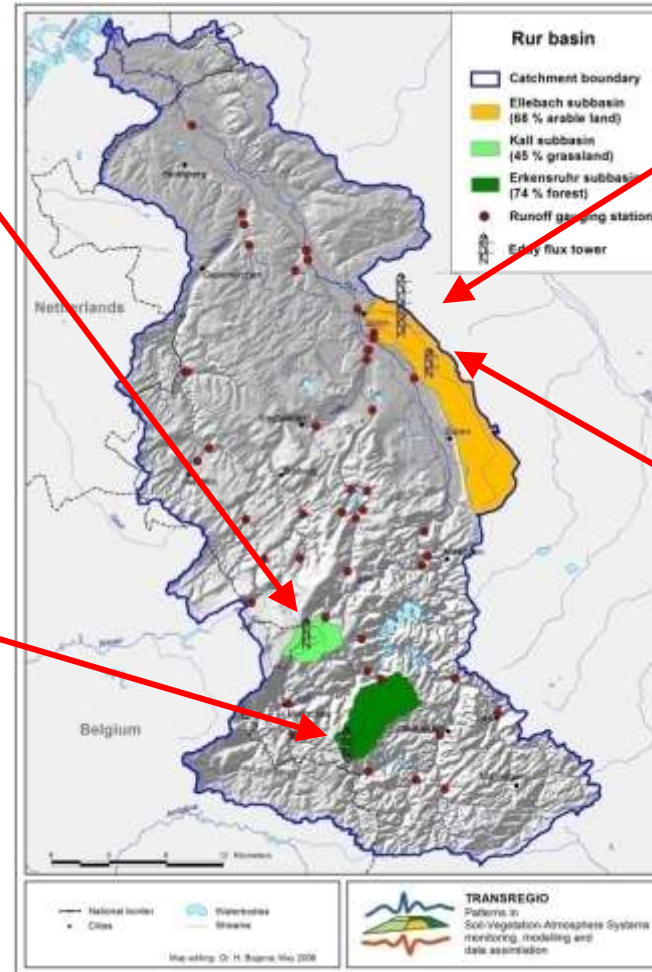


- Eddy Correlation station
- Soil moisture sensor network
- Soil temperature measurements
- Soil CO<sub>2</sub> flux measurements

## Forest test site “Wüstebach”



- Eddy Correlation station
- Soil moisture sensor network
- Soil temperature measurements
- Groundwater monitoring
- Runoff and solute monitoring
- Soil CO<sub>2</sub> Flux measurements



## X-band Doppler Weather Radar



## Agricultural test site „Selhausen“

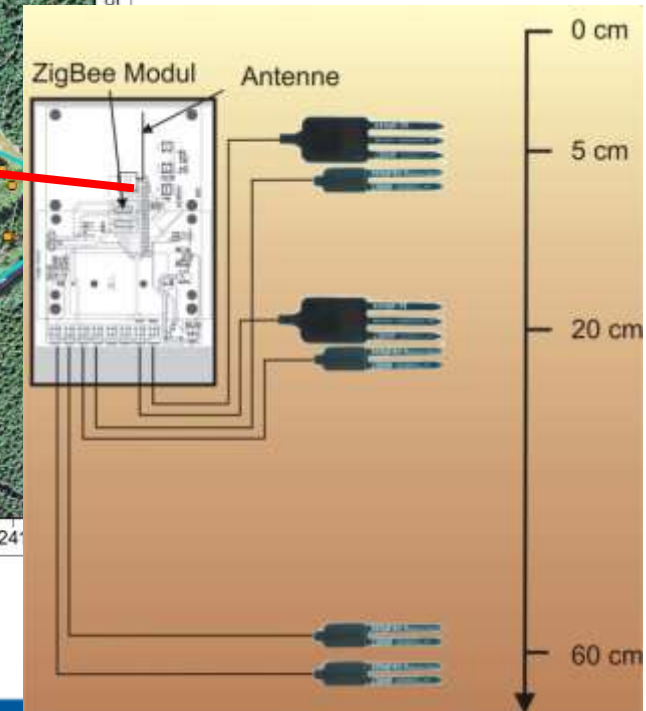
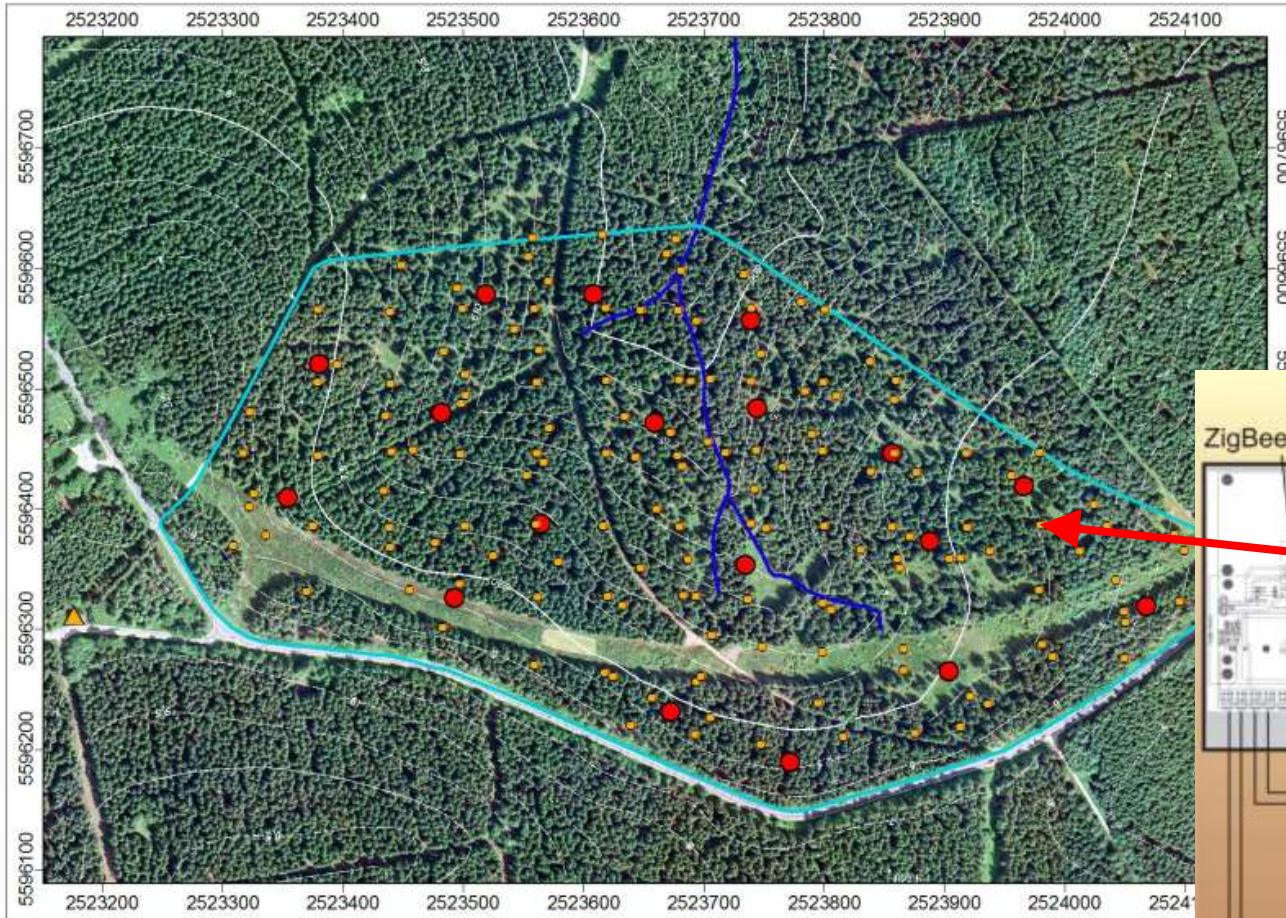


- Eddy Correlation station
- Soil moisture measurements
- Soil temperature measurements
- Soil CO<sub>2</sub> flux measurements
- Ground-based remote sensing
- LIDAR



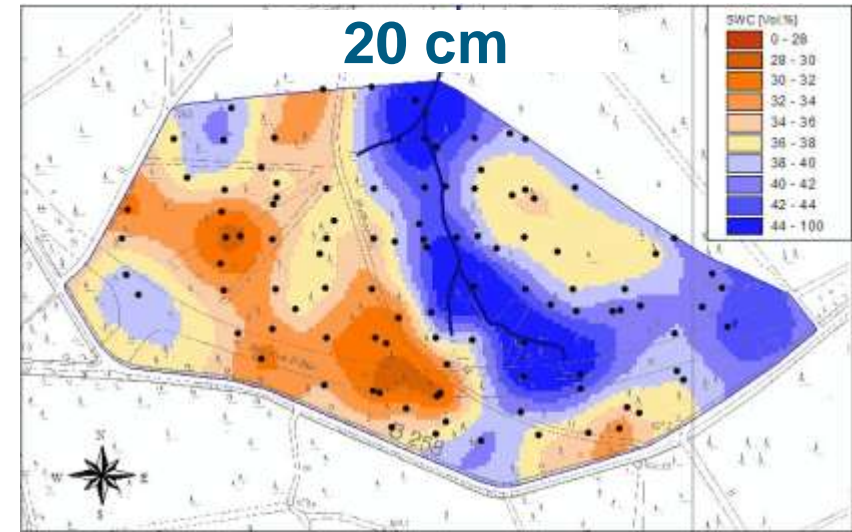
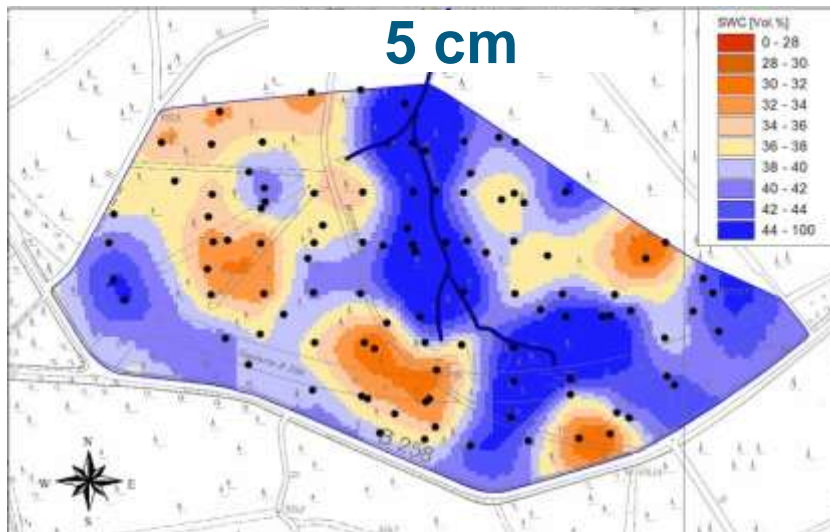
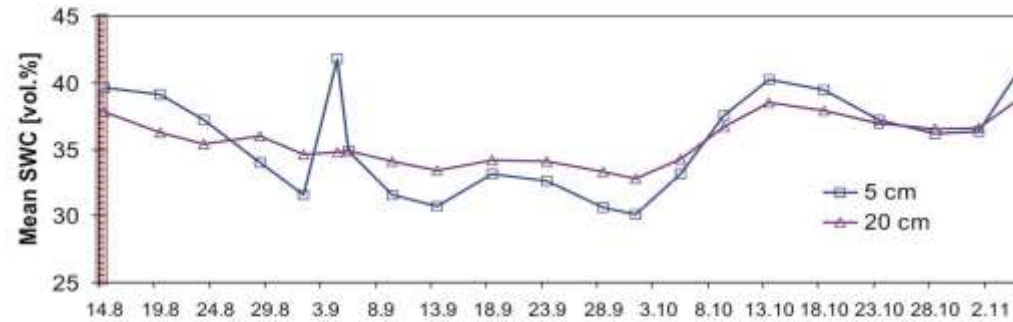
# SoilNet instrumentation at the TERENO research station Wüstebach

- 150** Sensor units
- 18** Router units
- 900** Soil moisture sensors
- 300** Temperature sensors



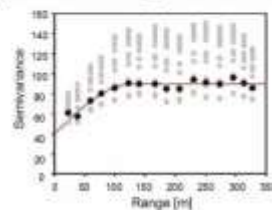


# Soil moisture pattern between August and November 2009



Measurement variable:  
 - Soil water content  
 Measurement date:  
 - 14.08.2009  
 Measurement depth:  
 - 5 cm  
 Sensor type:  
 - EC5  
 Interpolation method:  
 - Ordinary Kriging

Experimental semivariogram and fitted model



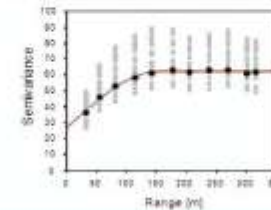
Legend

- SoilNet sensor unit
- ~ Stream
- Catchment boundary



Measurement variable:  
 - Soil water content  
 Measurement date:  
 - 14.08.2009  
 Measurement depth:  
 - 20 cm  
 Sensor type:  
 - EC5  
 Interpolation method:  
 - Ordinary Kriging

Experimental semivariogram and fitted model



Legend

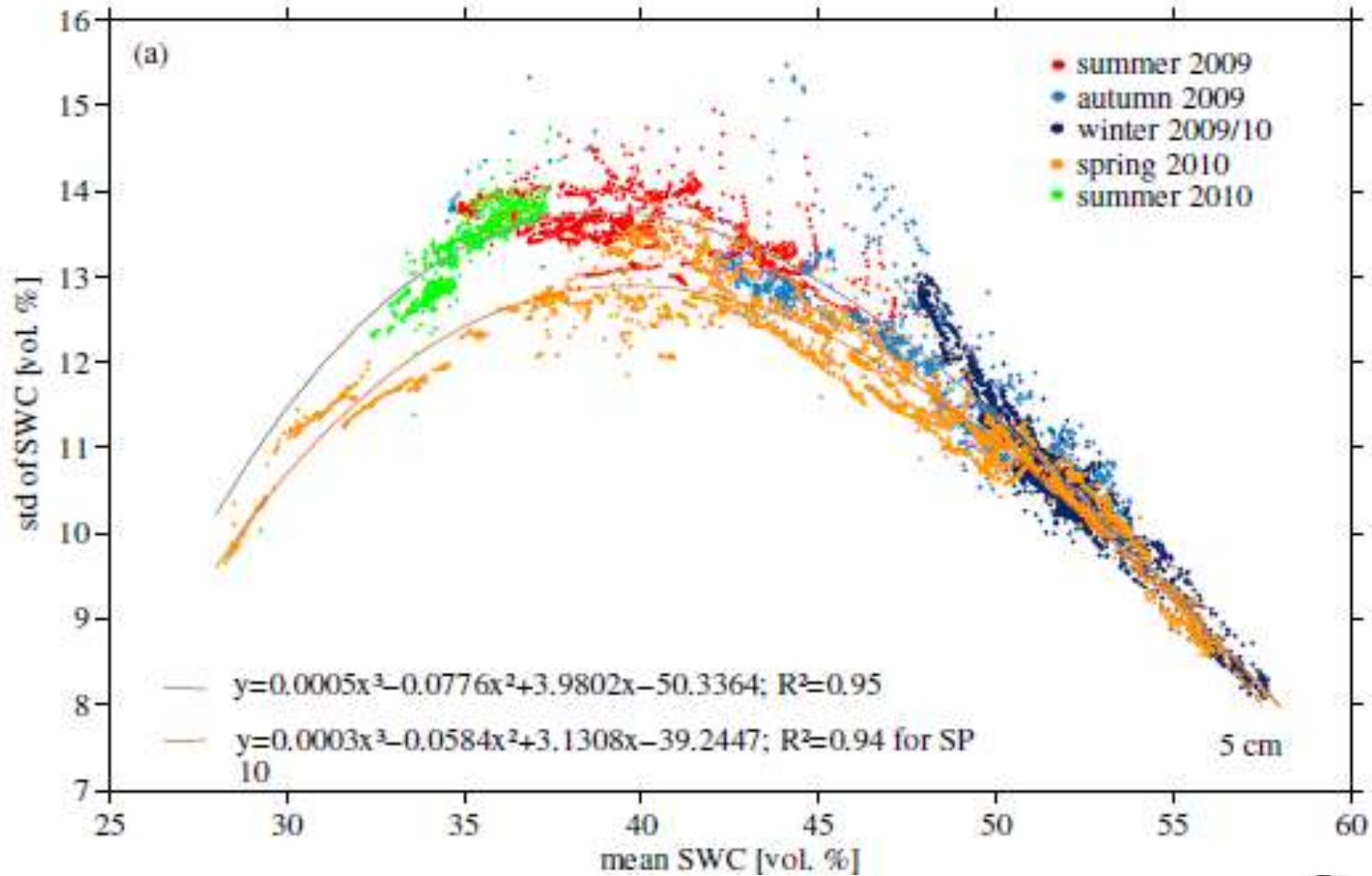
- SoilNet sensor unit
- ~ Stream
- Catchment boundary





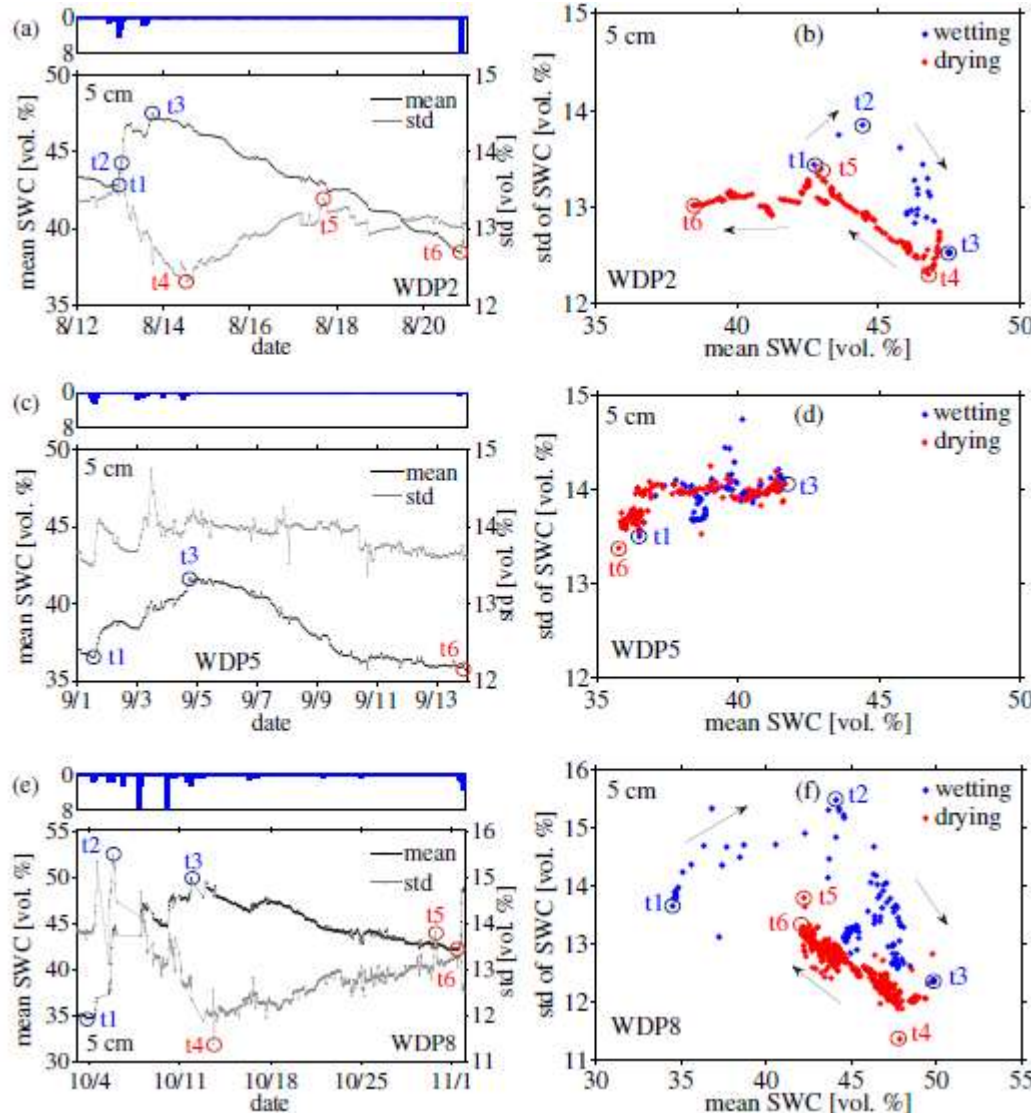


# Relationship between mean soil water content and its standard deviation in 5 cm depth





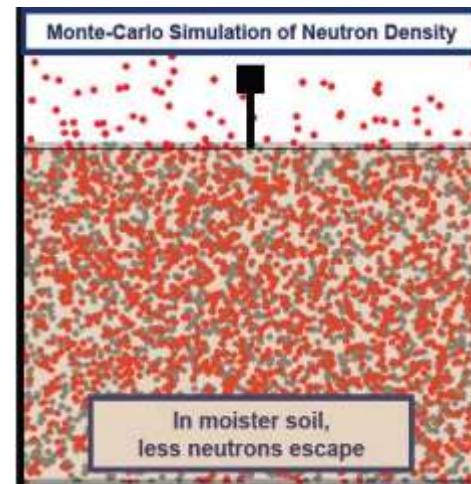
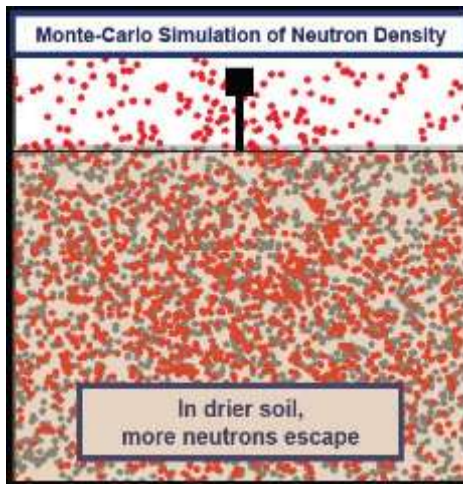
# Event dependent hysteretic behaviour





# Cosmic Ray Probes

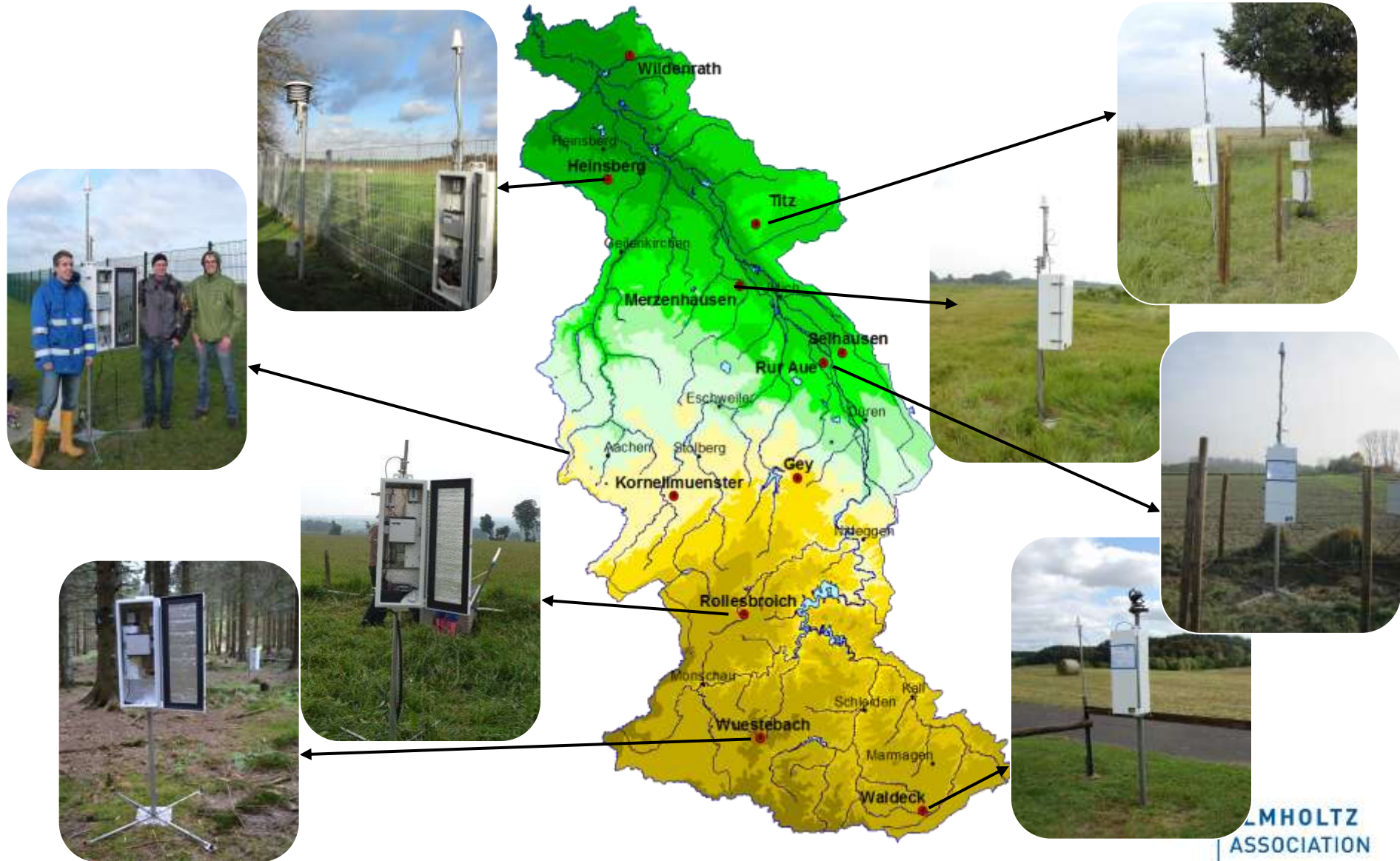
- Cosmic rays lead to emission of neutrons by soil nuclei in the top soil.
- CR Neutrons lose energy primarily through collisions with hydrogen
- Continuous measurement of neutron flux to estimate soil moisture at hourly resolution
- Large Footprint (about 350 m radius)



Cosmic ray probe in the field of Rollesbroich (May 2011)



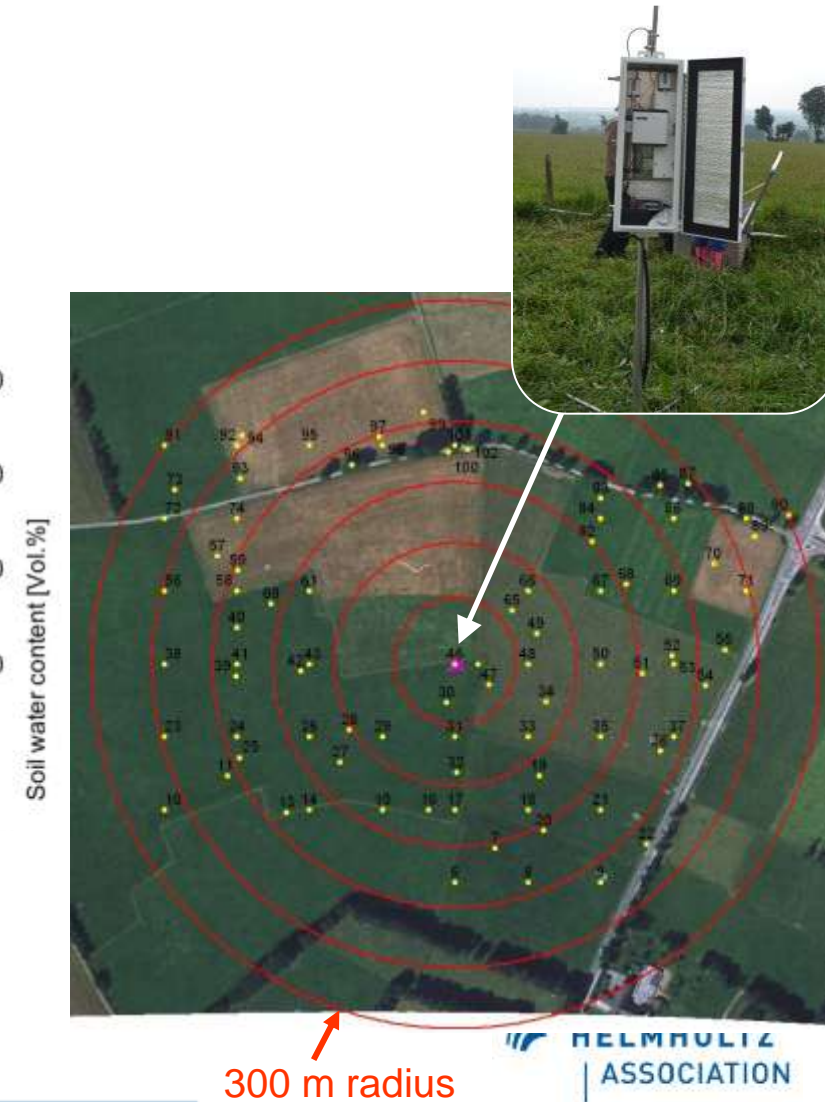
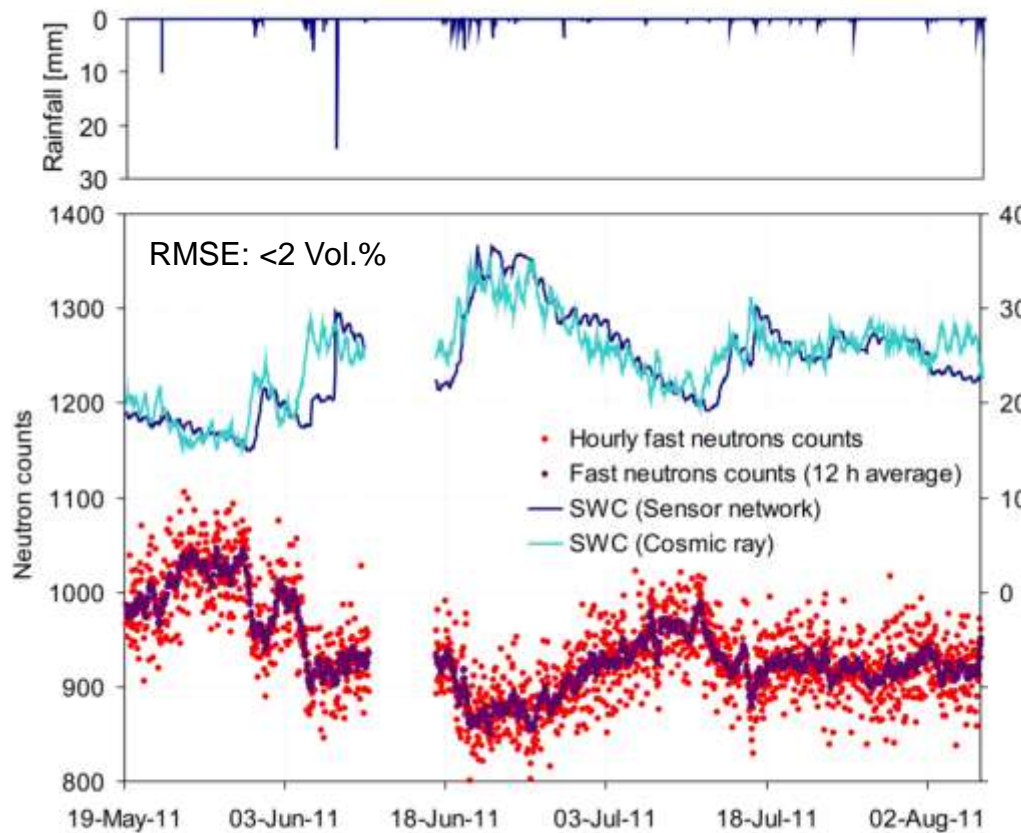
# Cosmic Ray monitoring network in the Rur Catchment





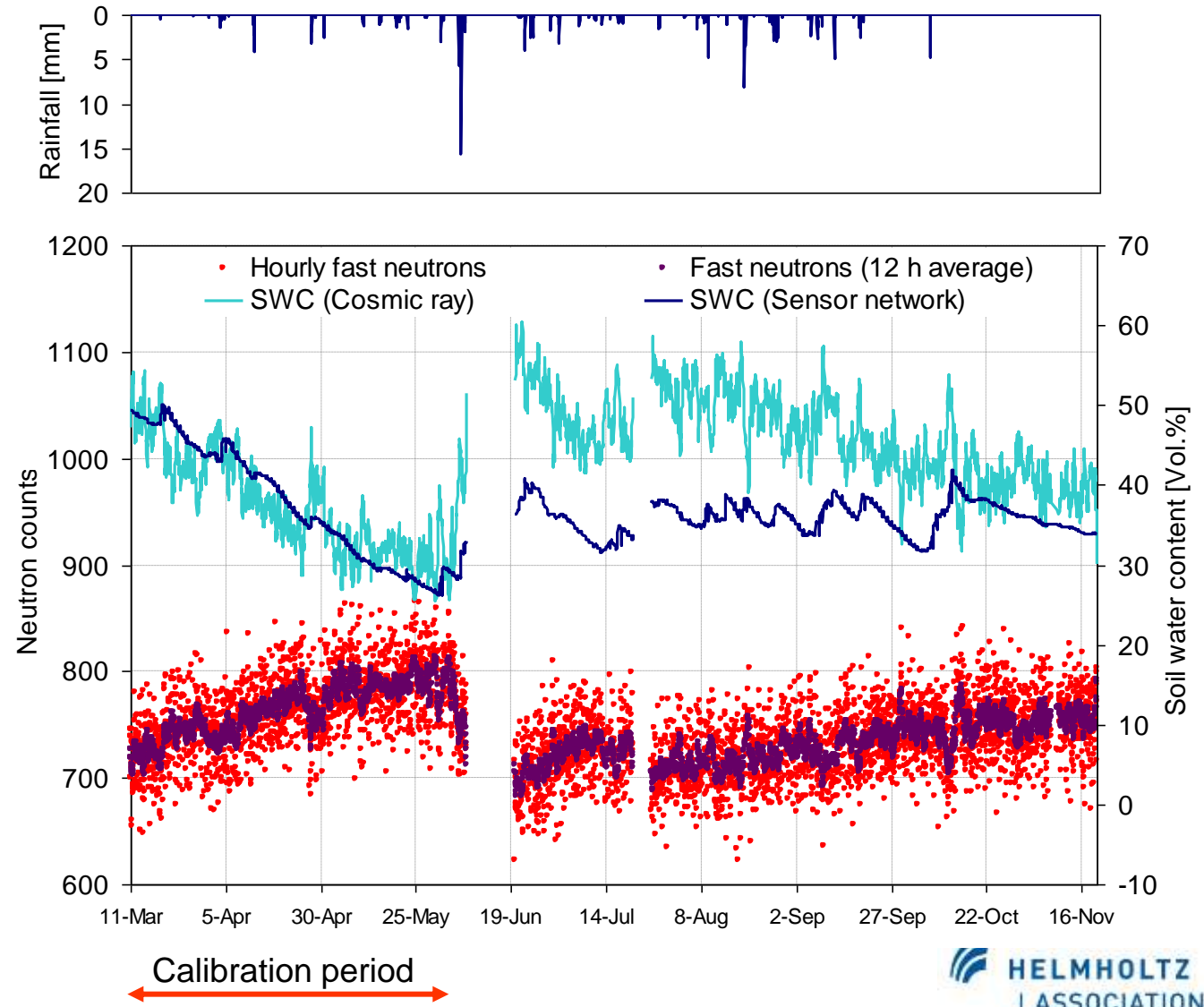
# Calibration results: Grassland test site Rollesbroich

83 soil moisture stations (5, 20 and 50 cm)





# Calibration results: Forest test site Wüstebach



RMSE  
(calibration period):  
2.93 Vol.%

RMSE  
(remaining period)  
9.47 Vol.%



# Passive and active microwave sensors the 2011 campaign



PLMR



F-SAR



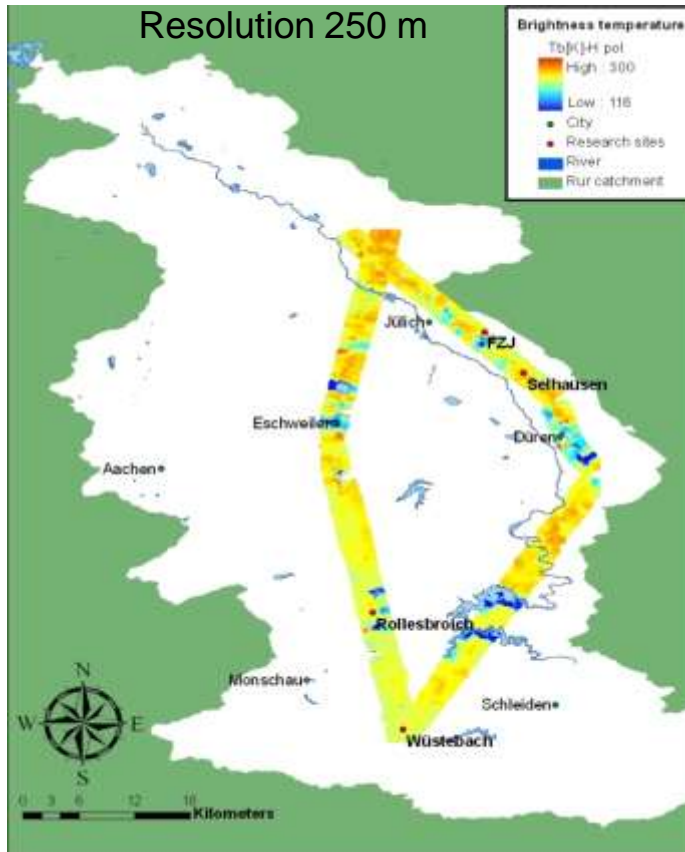
F-SAR overlaid with unprocessed PLMR data



# Multi-resolution TB for the Rur catchment

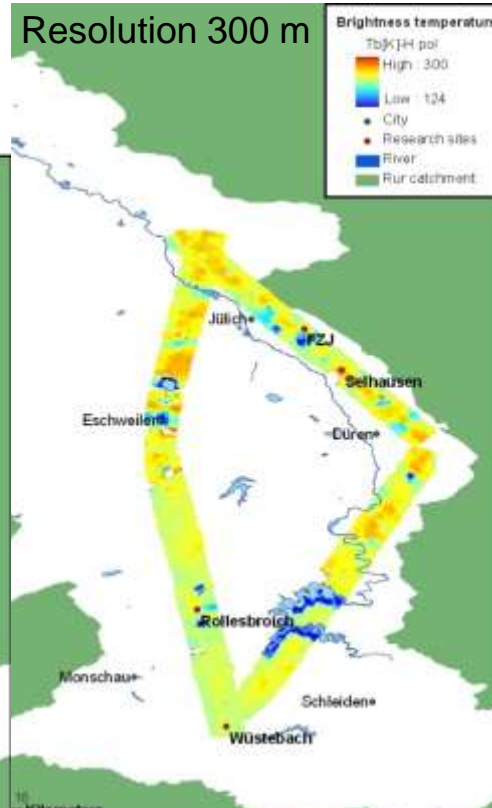
Elevation 700 m

Resolution 250 m



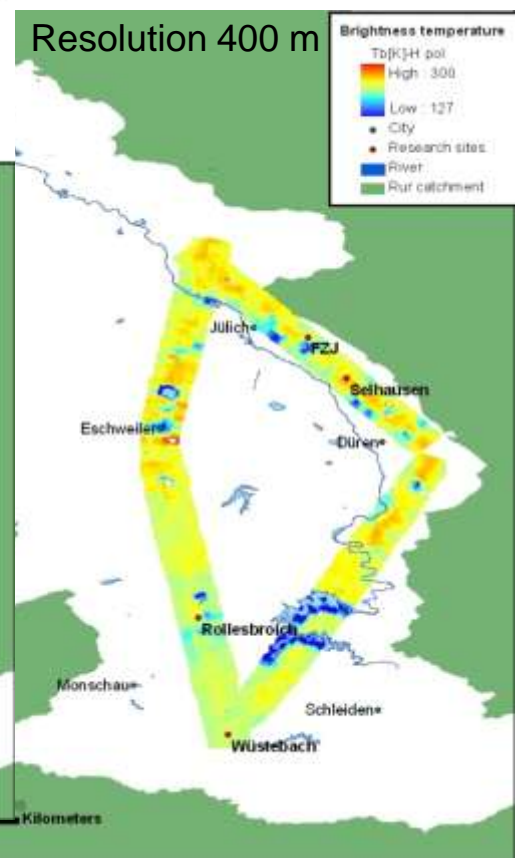
Elevation 1000 m

Resolution 300 m



Elevation 1200 m

Resolution 400 m



horizontal polarization

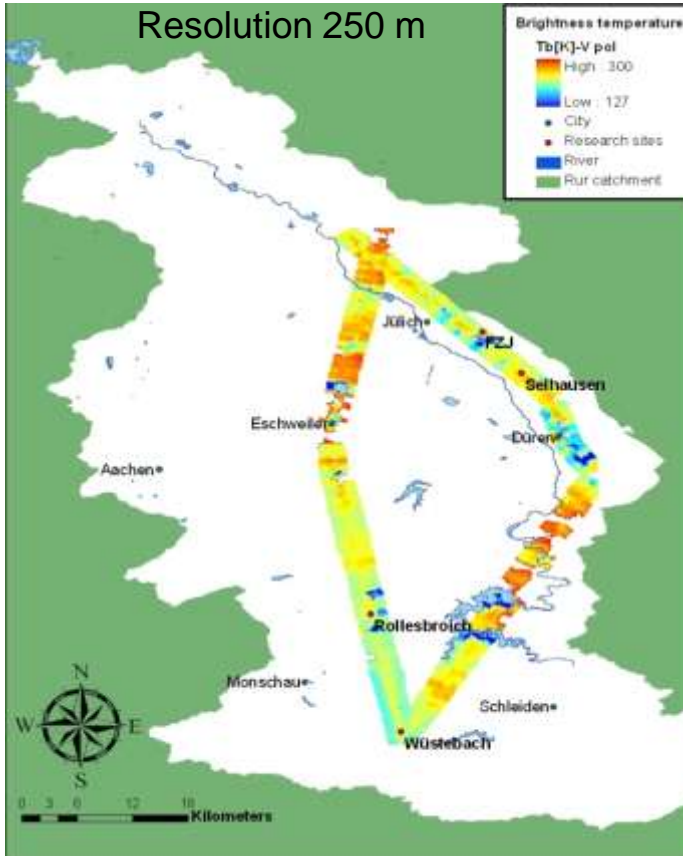




# Multi-resolution TB for the Rur catchment

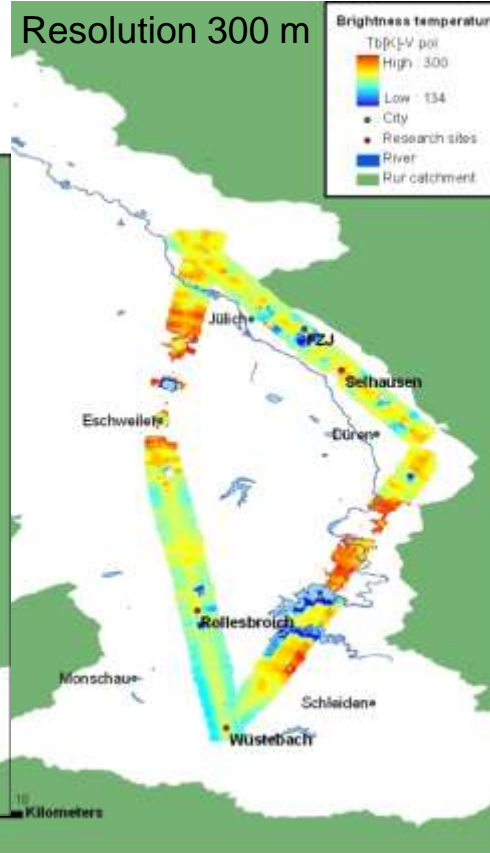
Elevation 700 m

Resolution 250 m



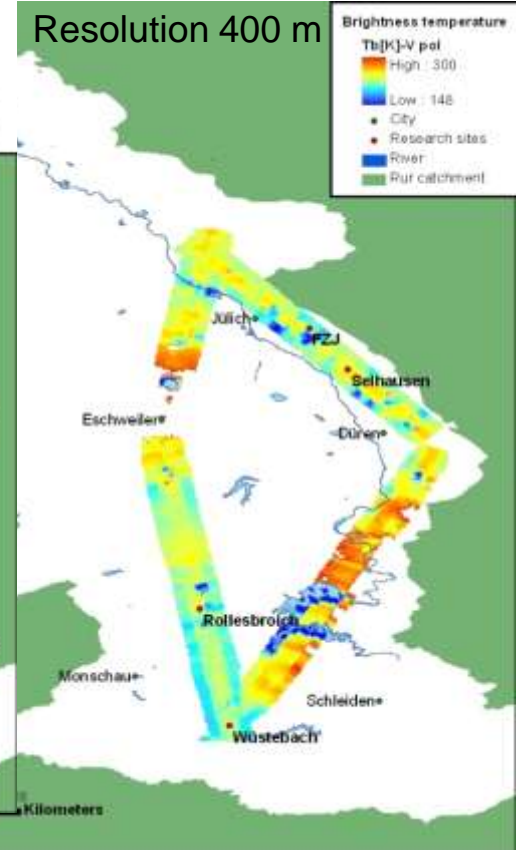
Elevation 1000 m

Resolution 300 m



Elevation 1200 m

Resolution 400 m



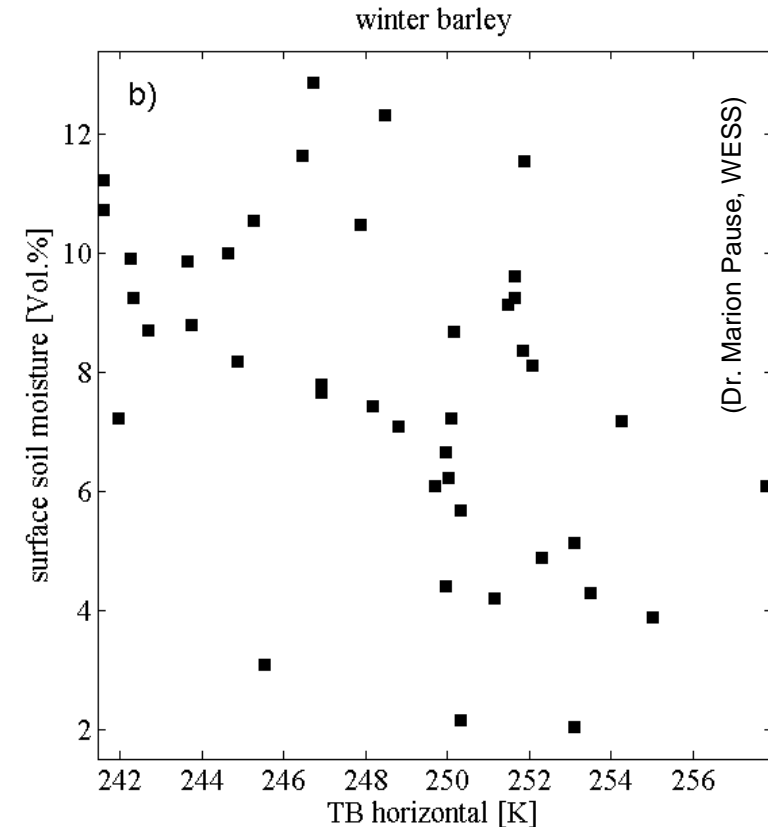
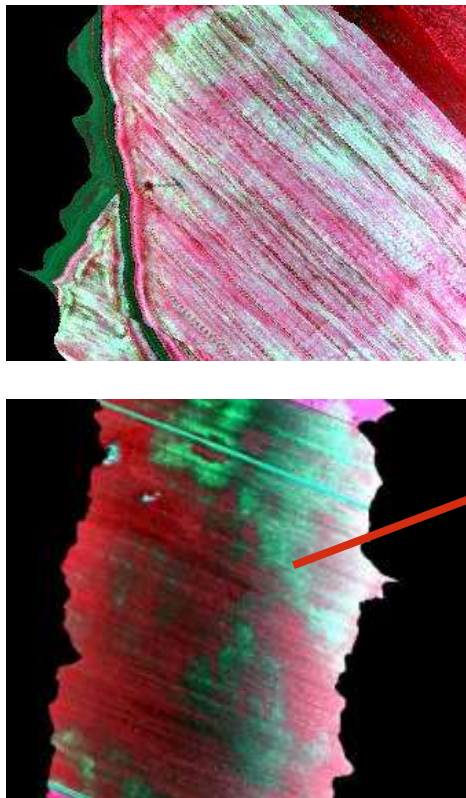
vertical polarization



# PLMR brightness temperature vs. surface soil moisture

Test site: Grossbardau (TERENO Central German Lowland Observatory)

AISA CIR image: Lausch/ Pause UFZ

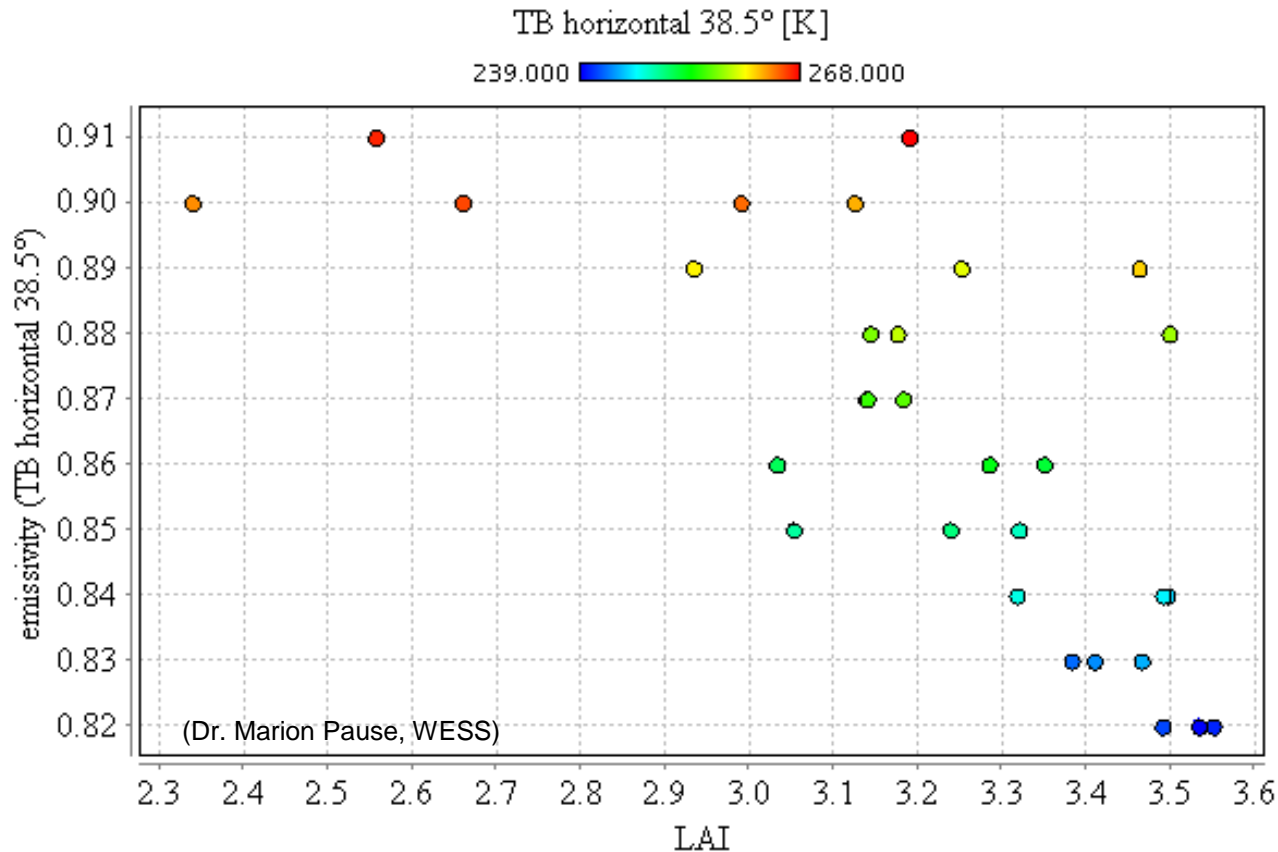


→ Spatial distribution of vegetation parameters from AISA data!



# PLMR brightness temperature vs. LAI

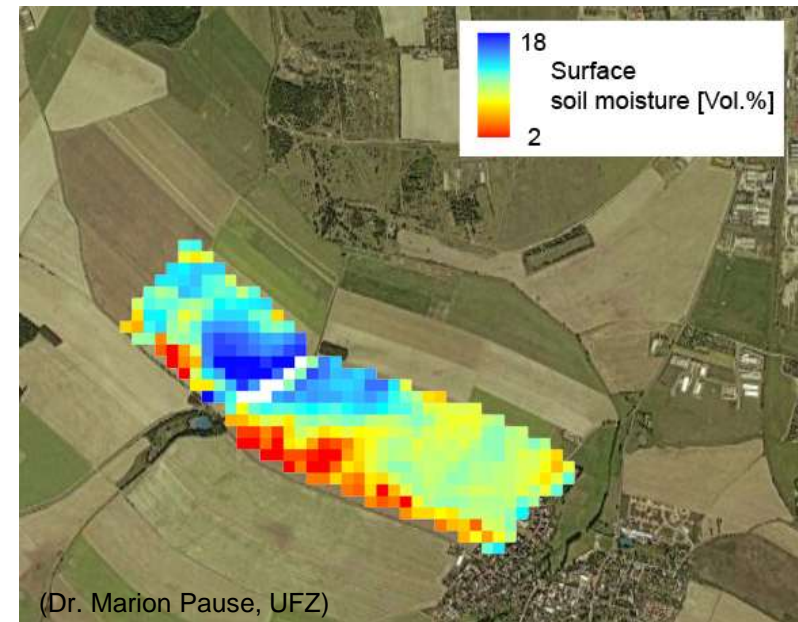
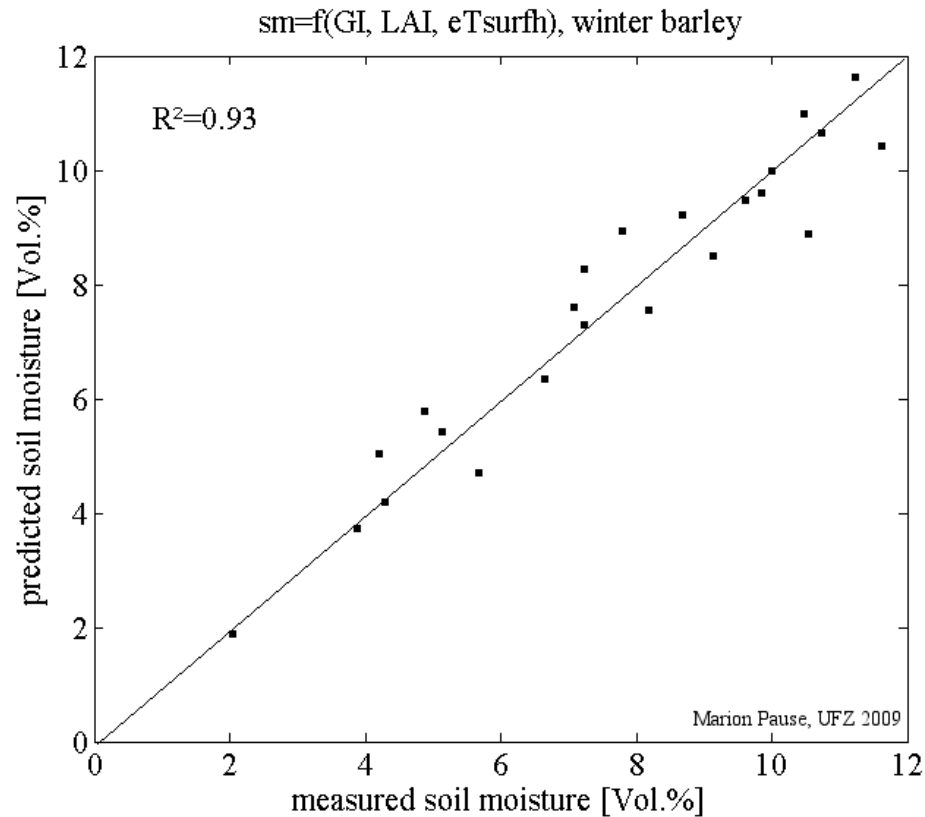
winter barley (fruit development)



Test site: Grossbardau  
(TERENO Central German Lowland Observatory)



# Application of multi-variate regression





## SMAP validation campaign with simultaneous use of passive and active microwave sensors

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



+ IR-camera  
+ Hyperspectral camera



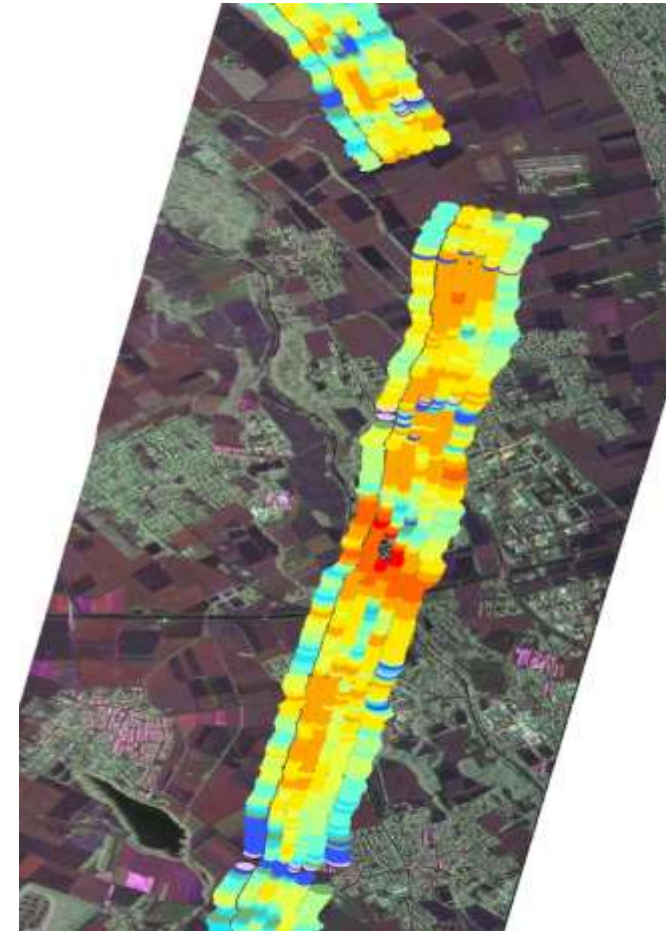
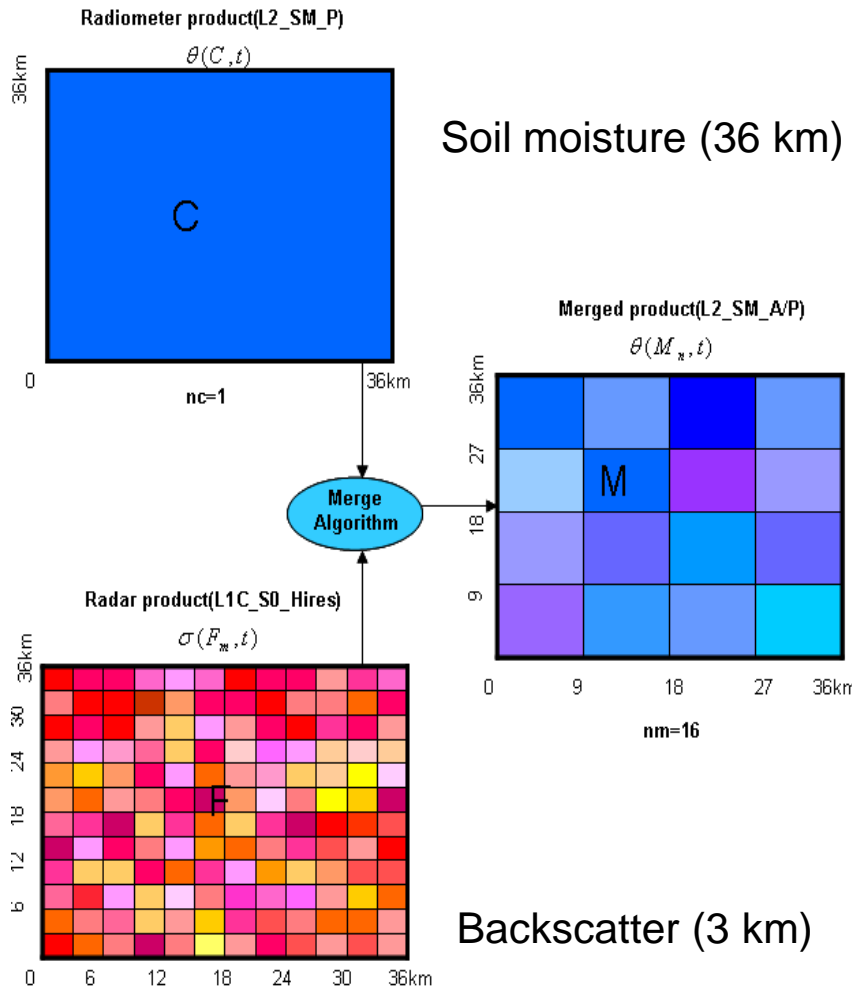
- F-SAR is able to operate in 4 frequency bands (X, C, L and P)
- Dual (F-SAR) channel operation



- Polarisation: Dual linear (V and H)
- Incidence angles:  $\pm 8^\circ$ ,  $\pm 22^\circ$ ,  $\pm 38^\circ$   
@ pushbroom



# PhD study of Sayeh Hasan: Airborne active and passive microwave data fusion for soil moisture retrieval (DFG)



F-SAR overlaid with unprocessed PLMR data

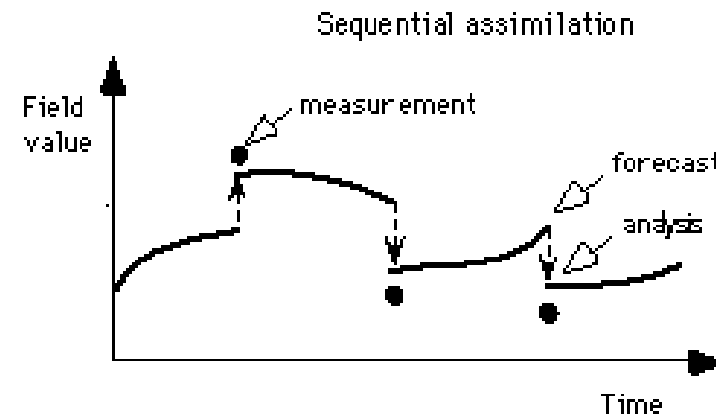


# Data assimilation techniques to predict hydrological fluxes from soil moisture measurements

Optimal combination of observations and model predictions e.g. Ensemble Kalman Filter, Particle Filter

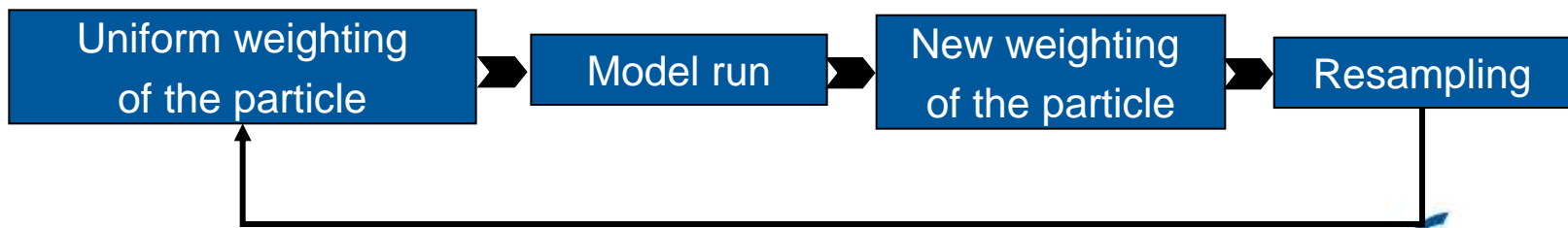
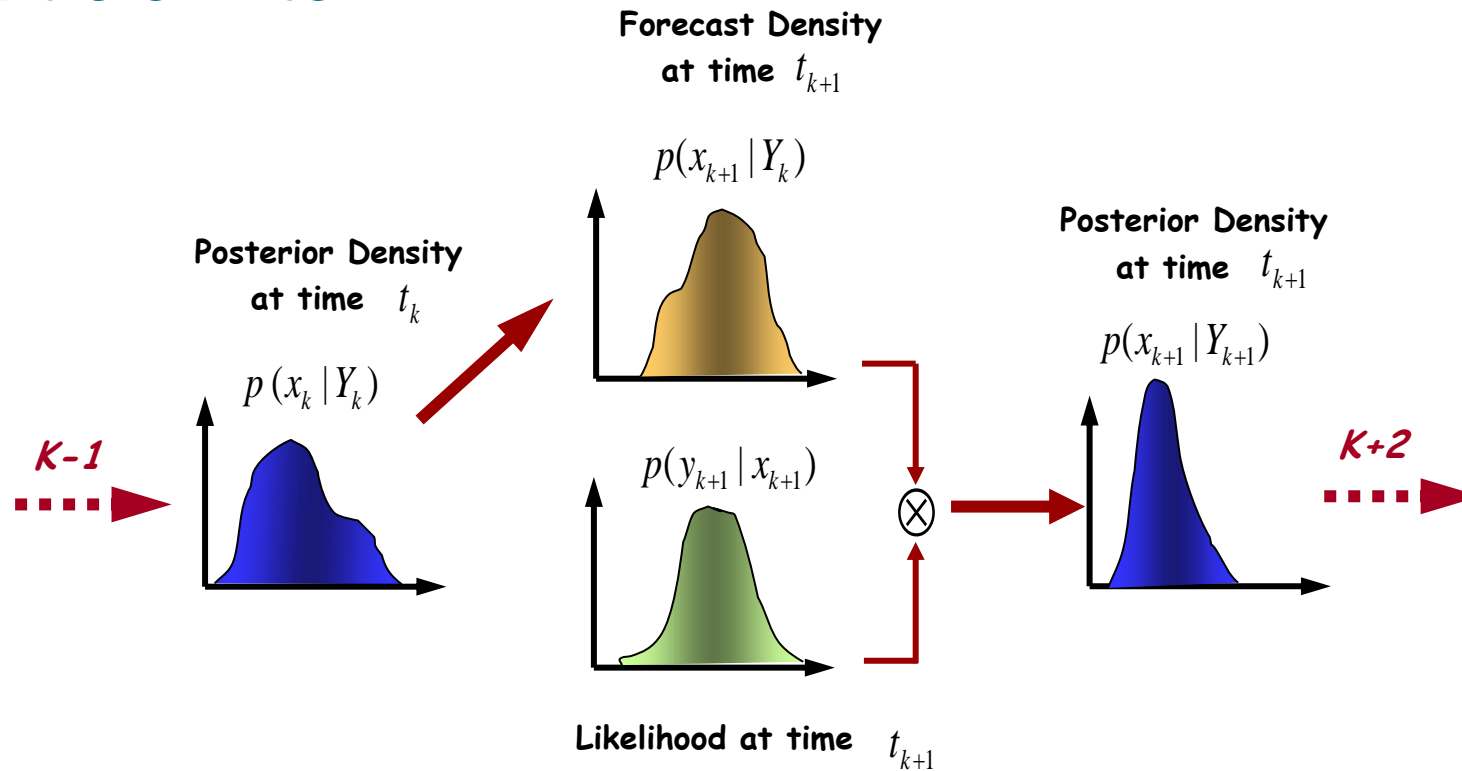
Particle Filter:  
Sequential Monte Carlo

Sequence:





# Particle Filter







# HYDRUS 1D lysimeter experiment

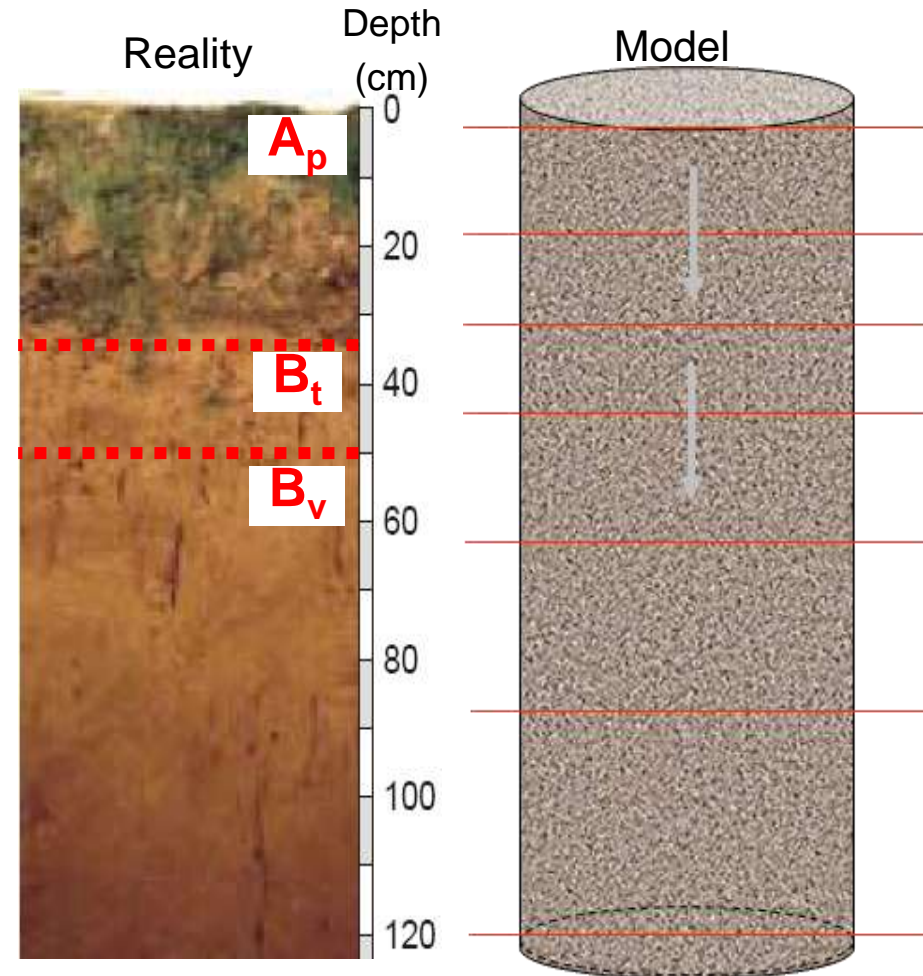
- 1-D physical finite elements model solves Richards equation numerically:

$$\frac{\partial \theta}{\partial t} = \frac{\partial}{\partial z} \left[ k(h) \left( \frac{\partial h}{\partial z} - 1 \right) \right] - Q$$

- Soil hydraulic properties are parameterised using the Mualem-van Genuchten model
- 1 day temporal resolution
- 3 soil layers

## Assumptions:

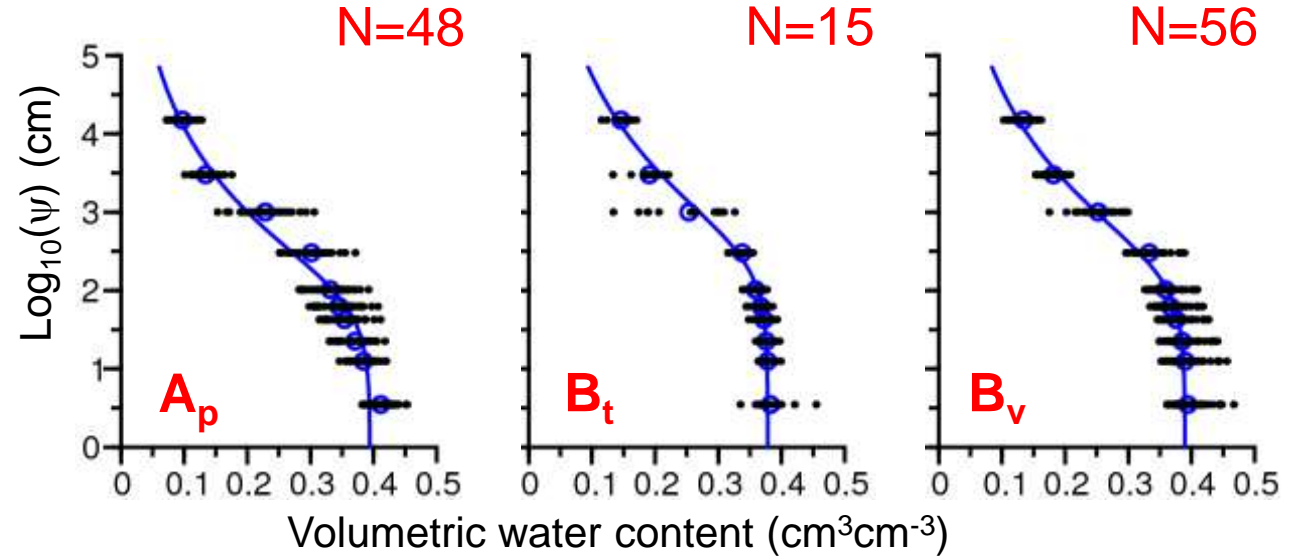
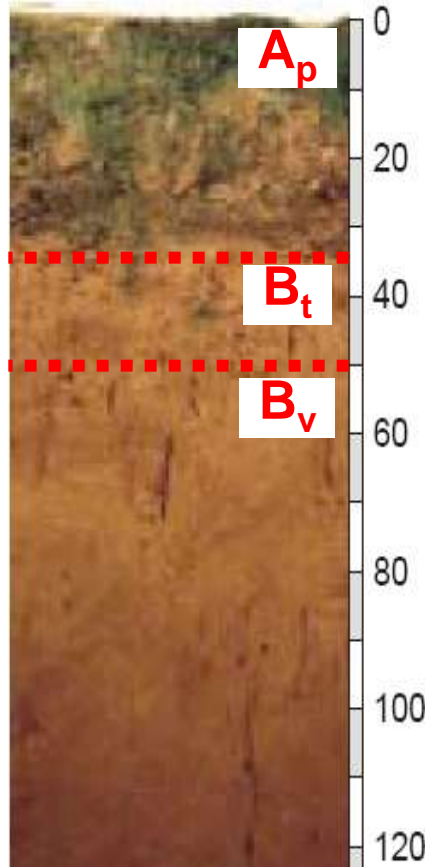
- Vapour flow is negligible
- No macropore flow
- No hysteresis



\*Simunek et al. (2006)



# Soil moisture observations in lysimeters



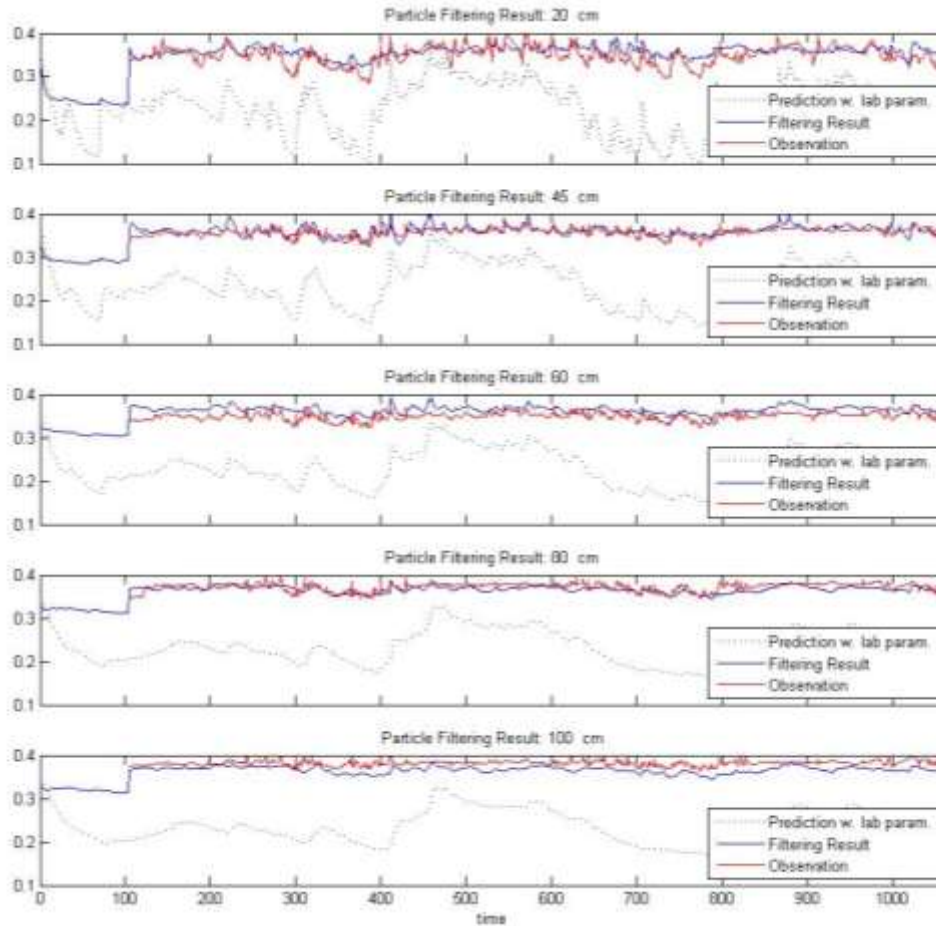
Van Genuchten (1980): 
$$S_e = \left[ 1 + (\alpha |\psi|)^n \right]^{1/n-1}$$

		$\theta_r$	$\theta_s$	$\alpha$	$n$	$Ks$ cm/h
Depth (cm)	A <sub>p</sub>	0	0.394	0.0105	1.28	9.21
	B <sub>t</sub>	0	0.378	0.0031	1.26	0.73
	B <sub>v</sub>	0	0.390	0.0051	1.26	0.36

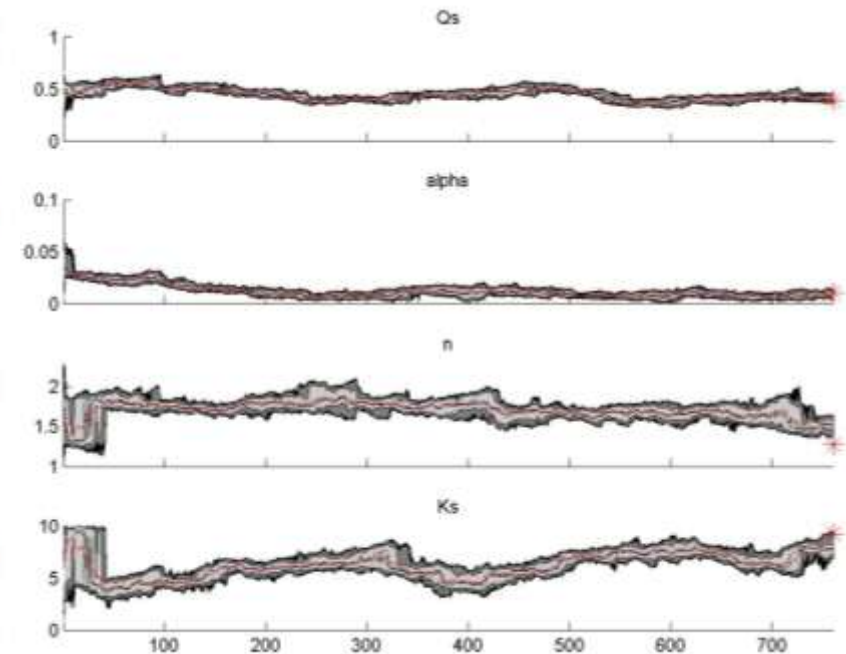


# Particle Filtering – Soil water content

Soil water content

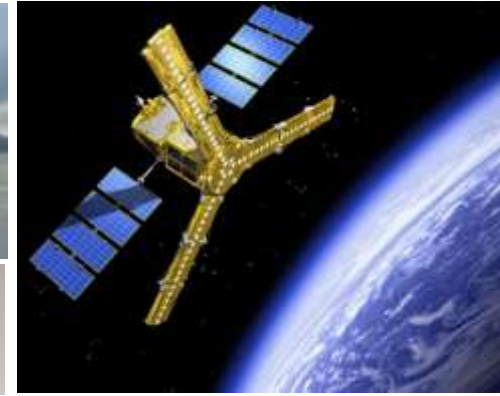


Optimised MvG parameter:





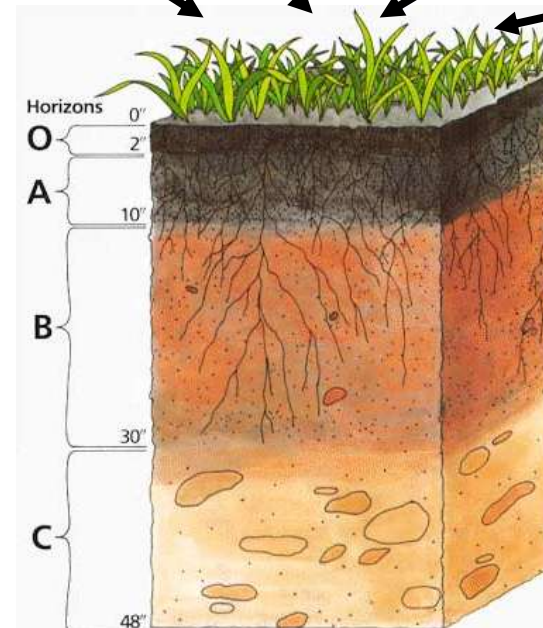
# Soil moisture observations



Measuring a soil volume:

Surface to 5 cm depth

⇒ Assimilation

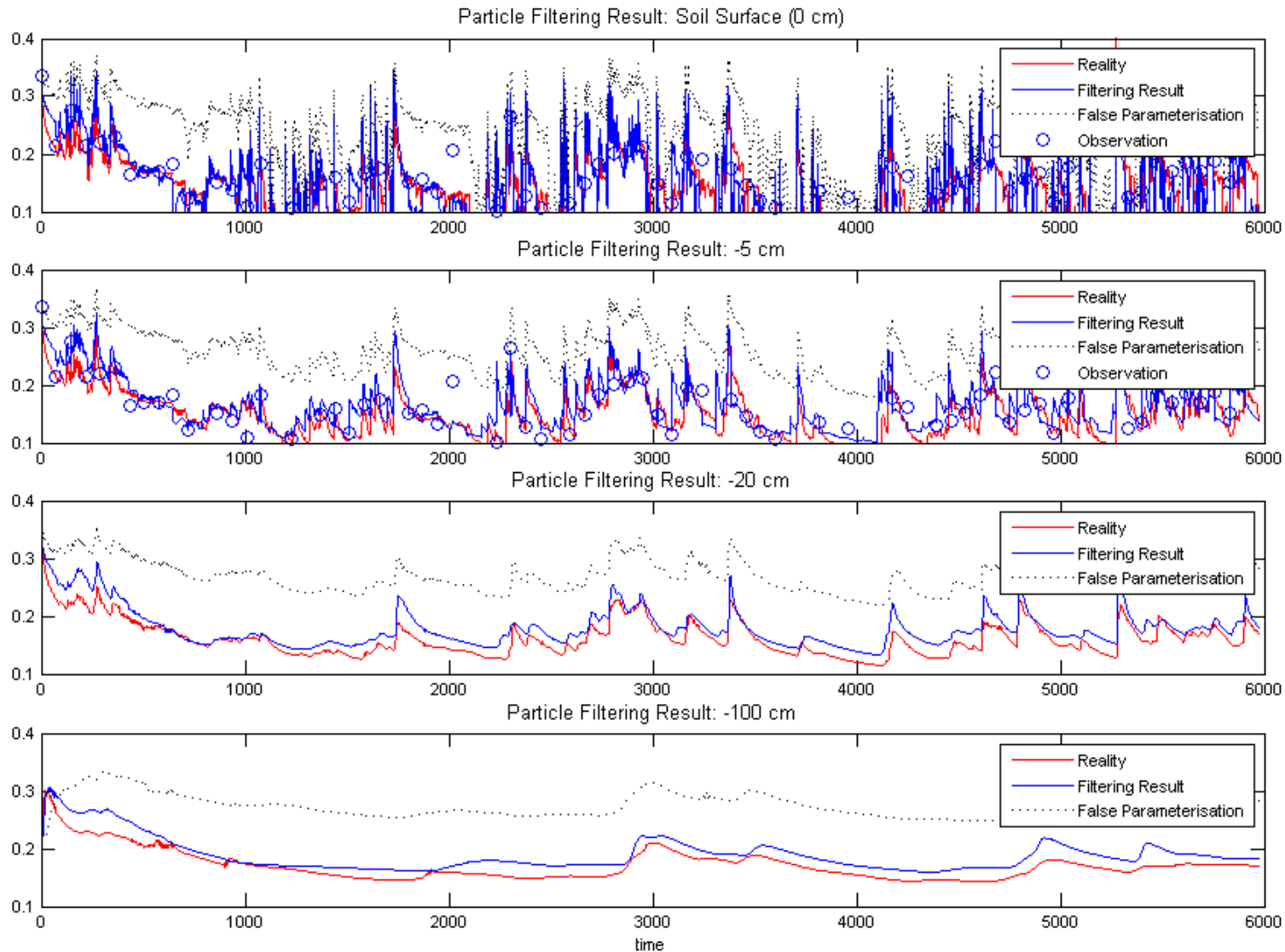


Top soil moisture measurements with microwave radiometry in L-Band (1 - 2,6 GHz)

- groundbased (ELBARA)
- airborne (PLMR, EMIRAD)
- spaceborne (SMOS, ALOS)



# State and param. update (loamy sand)





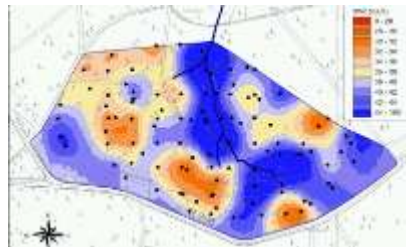
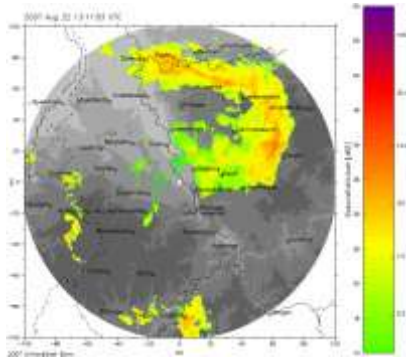
## Conclusions

- Wireless sensor networks can be used to analyse soil moisture variability at the headwater catchment scale
- Wireless sensor network data can be used to analyze Cosmic Ray probe foot print measurements
- Airborne passive radiometer data has to be combined with additional data (e.g. LAI) to increase the quality of soil moisture retrieval
- A active/passive retrieval algorithm helps to increase spatial resolution of radiometer soil moisture data
- Data assimilation methods provide a unique means of combining soil moisture measurements and models to predict soil water fluxes



# Prediction of hydrological states and fluxes

Real-time monitoring



Real-time communication



**Weather model  
(Local model)**

2-way couplig

**Hydrological  
model**



Supercomputer JUROPA/JUGENE

Prediction of hydrological fluxes  
and states

