

# **Evaluation of remotely sensed and modelled soil moisture products using global ground-based in situ observations**

**C. Albergel, P. de Rosnay, C. Gruhier, J. Muñoz-Sabater,  
S. Hasenauer, L. Isaksen, Y. Kerr, W. Wagner**

**Context of the study: H-SAF Visiting Scientist program (June-December 2011)**

**→ Collaboration ECMWF, CESBIO, IPF Vienna**

**Part-1: Evaluation against ground data (Albergel et al.)**

**Part-2: Global map comparison (Gruhier et al.) (ongoing)**

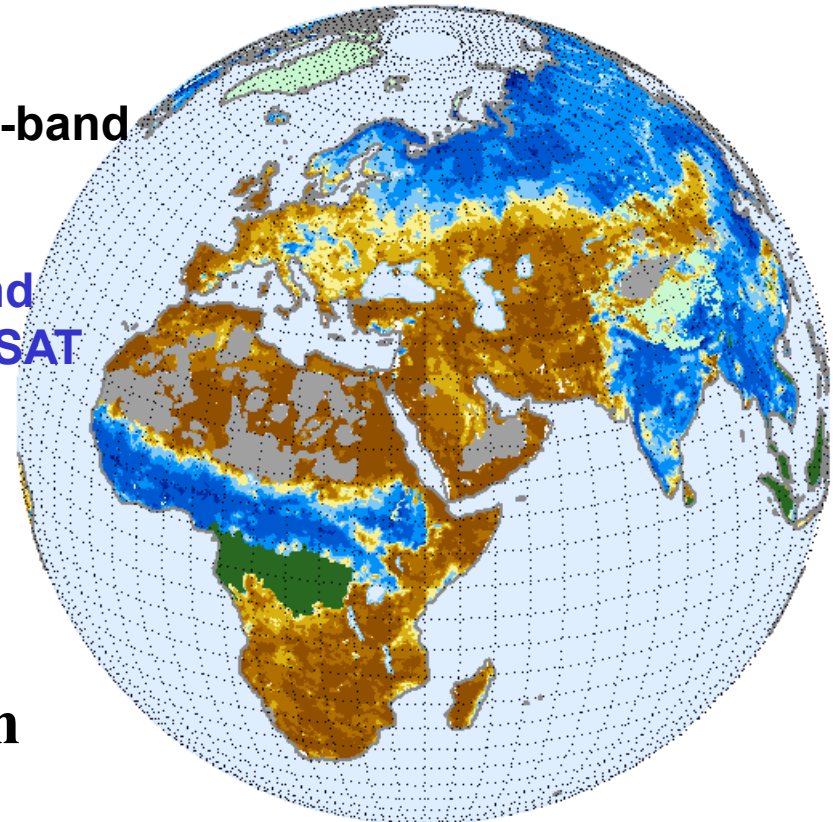
# Evaluation of soil moisture : ASCAT

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**Advanced Scatterometer on MetOP  
(launched in 2006)**

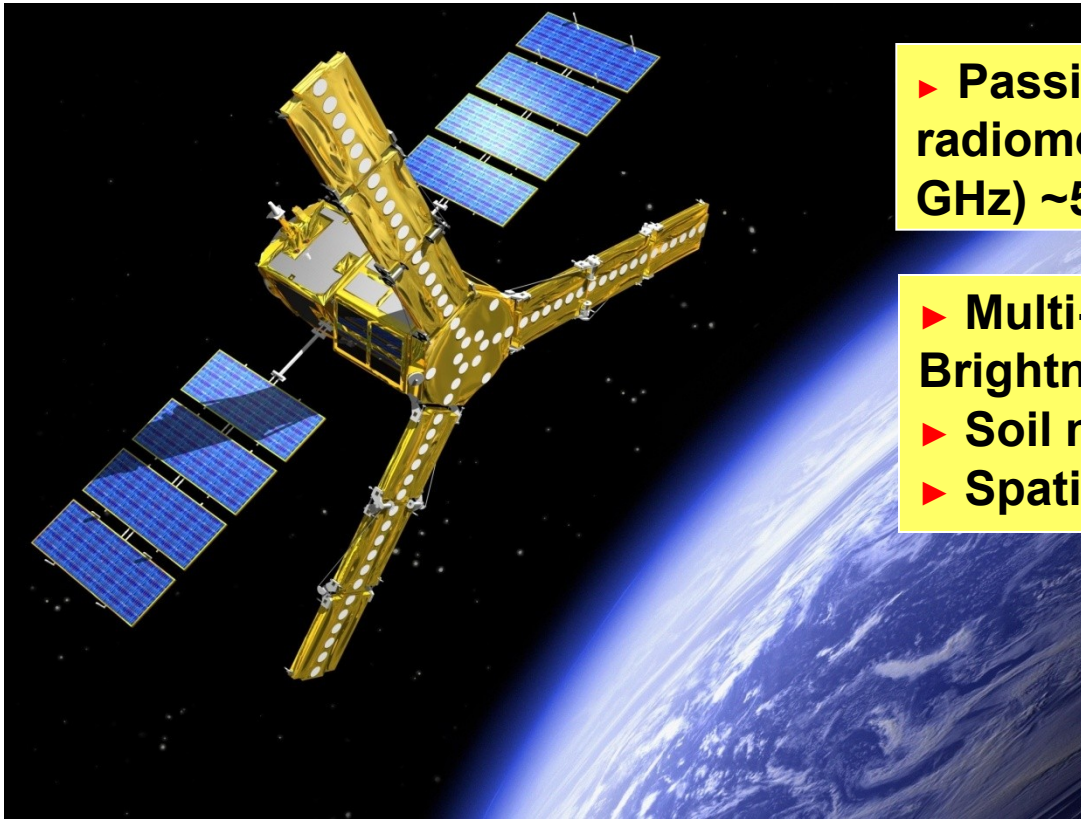
**Active microwave instruments operating at C-band  
(5.6GHz) ~0.5-2 cm**

**ASCAT operational SM product : NRT data and  
disseminated to NWP community via EUMETSAT**



Global Soil Moisture Map (August 1995)

# Evaluation of soil moisture : SMOS



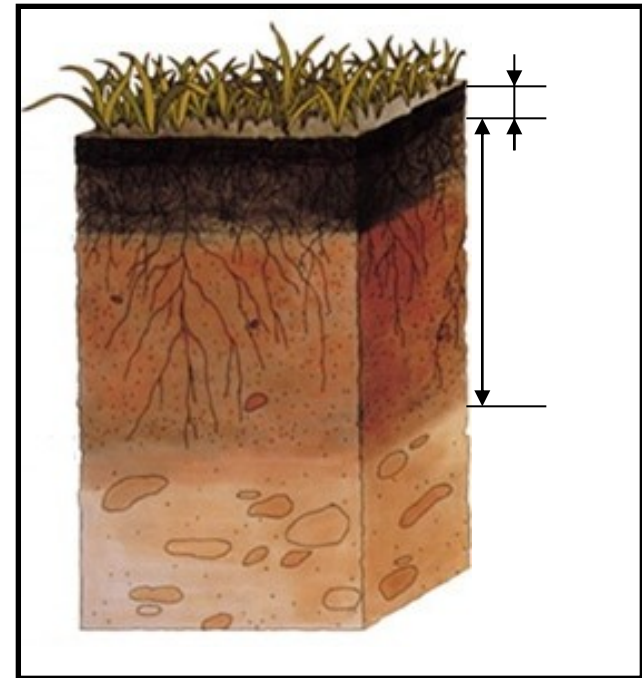
▶ Passive microwave interferometric radiometer operating at L-band (1.4 GHz) ~5cm (Kerr et al., 2010)

- ▶ Multi-angular measurements of Brightness Temperature
- ▶ Soil moisture accuracy: 4%
- ▶ Spatial resolution: ~40 km

**In this study : level 2 product, i.e. SSM, produces at CESBIO**

# Soil moisture from remote sensing

- Remote Sensing : Provides quantitative information about the water content of a **shallow near surface layer** (e.g. ASCAT, SMOS)
  - Main variable of interest for applications such as meteorological modelling and hydrological studies is the **root-zone soil moisture**
- ➔ Accurate retrieval requires to account for physical processes



**SM-DAS-2 : Root zone retrieval based on Data Assimilation**

# ASCAT SM data assimilation : SM-DAS-2

## H-SAF CDOP: SM-DAS-2 Production chain

ECMWF Atmospheric conditions



SYNOP  
T2m RH2m



EKF  
Soil Moisture  
Analysis



**SM-DAS-2:  
Soil Moisture  
Profile**

**SM-OBS:  
ASCAT  
Surface SM**

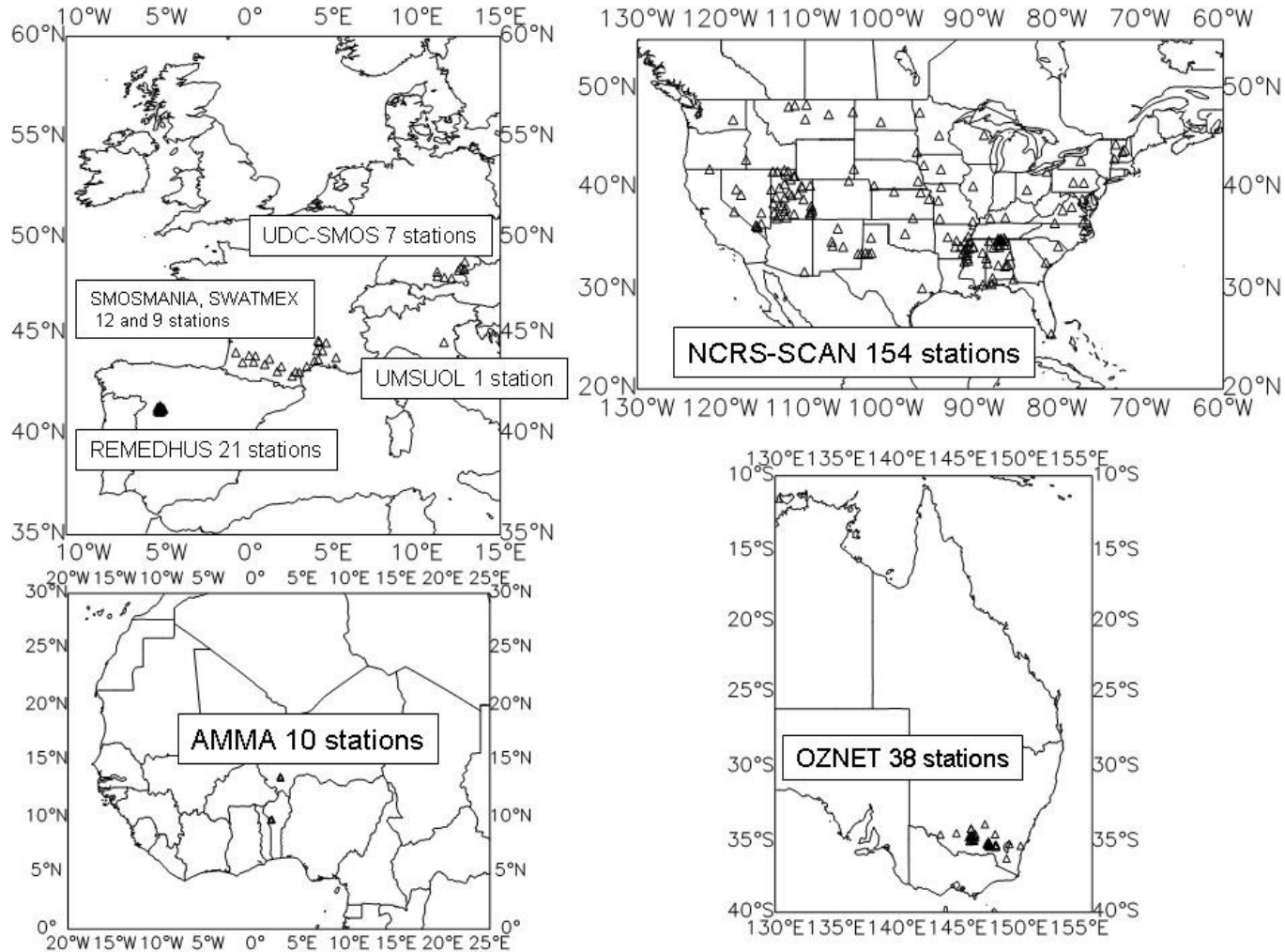


4 layers : **0-7cm**, 7-28 cm, 28-100 cm & 100-289cm

**consistent 2008- 2010 ... NRT in 2012**



# In situ SSM : 252 stations available in 2010

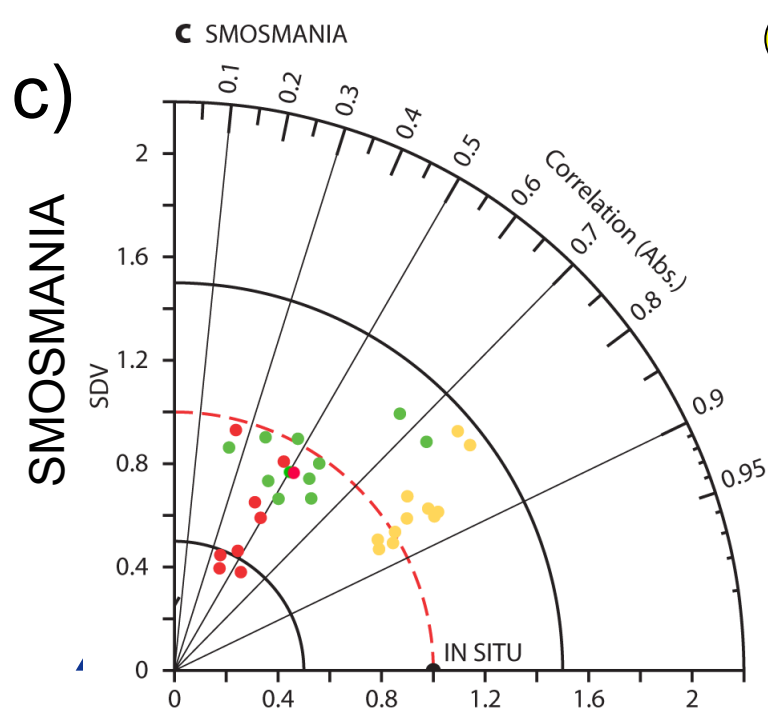
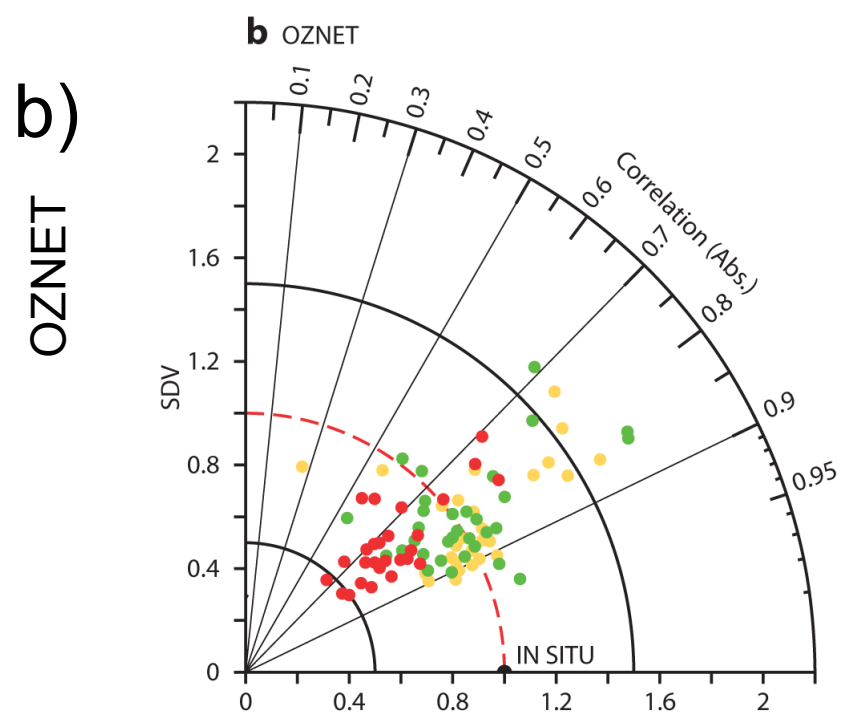
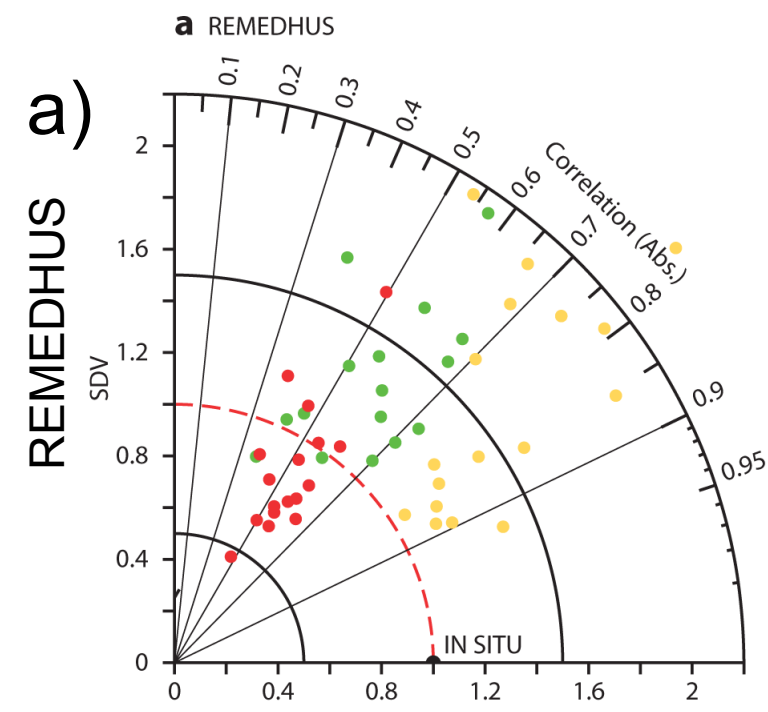


# Data Preparation

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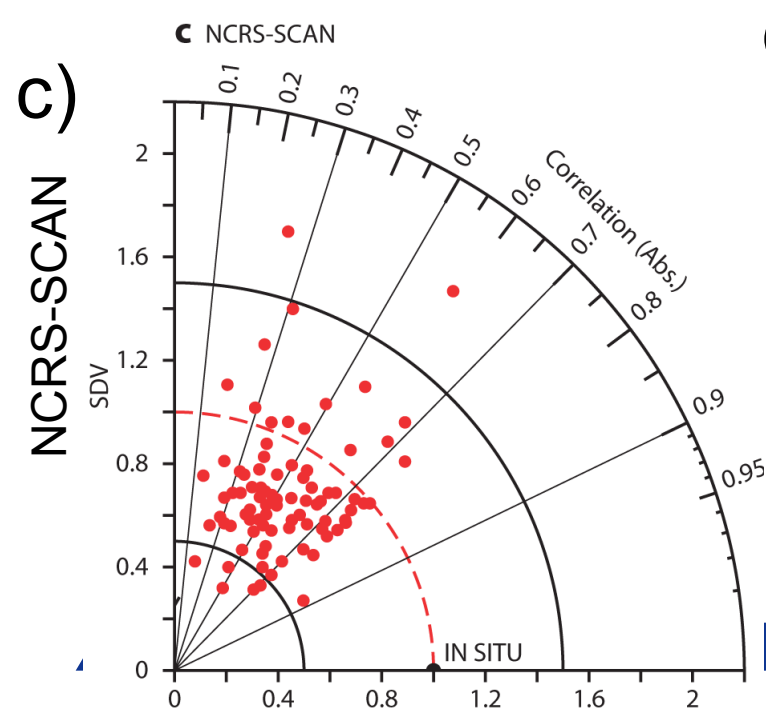
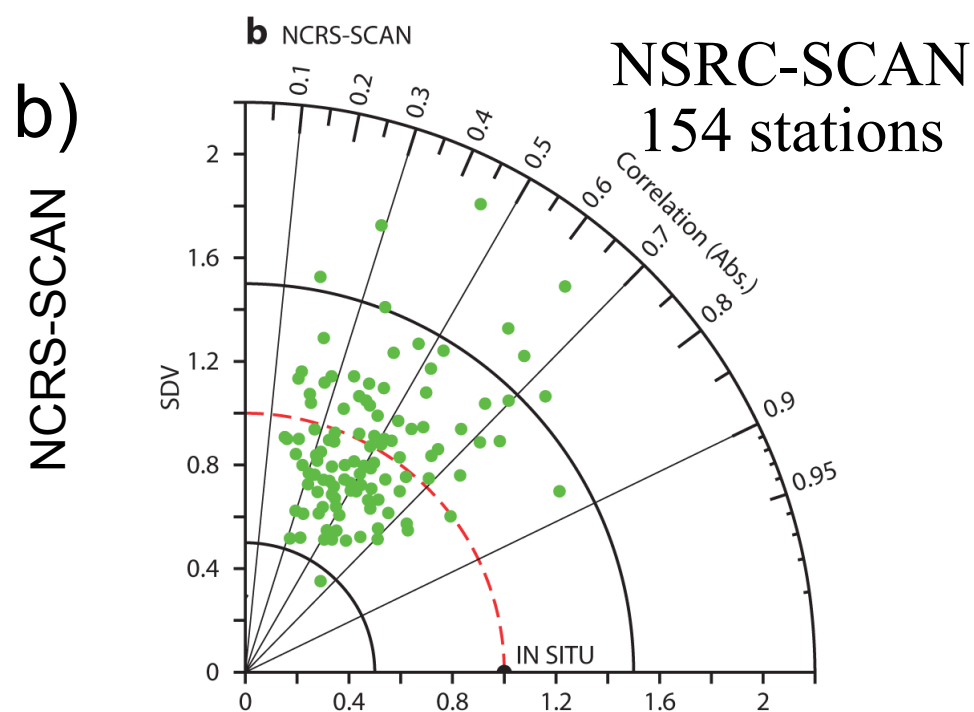
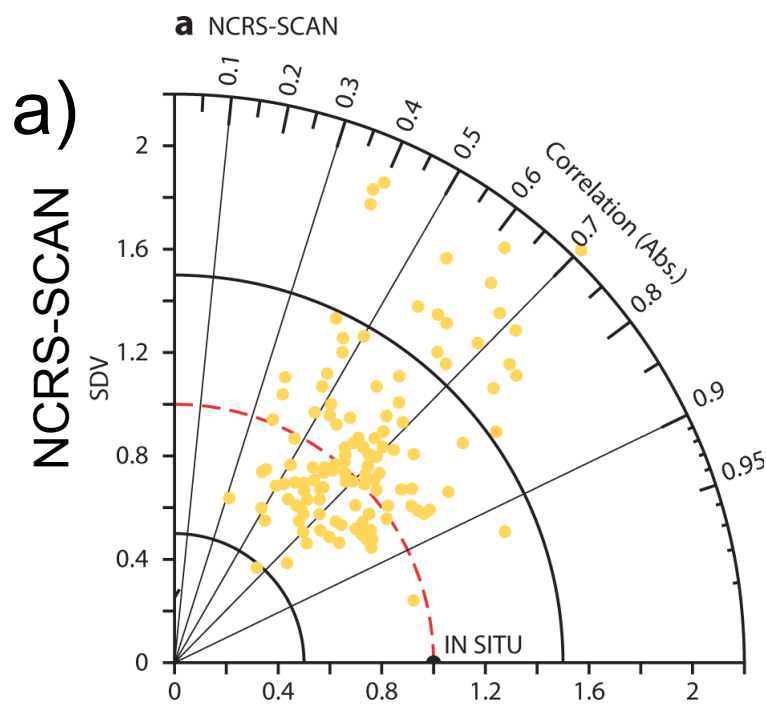
- 2010 times series of SMOS, ASCAT, ECMWF SM-DAS-2 and in situ SSM
- 3 products and in situ data : SSM in different units ( $\text{m}^3\text{m}^{-3}$ , [-])
  - ➔ Fair comparison between : each product is normalized using its own min and max of the time series
- Metrics used : RMSD, R, Bias (significant level of R,  $p\text{-value} < 0.05$ )

(R is of particular interest for NWP applications , Koster et al. 2009)



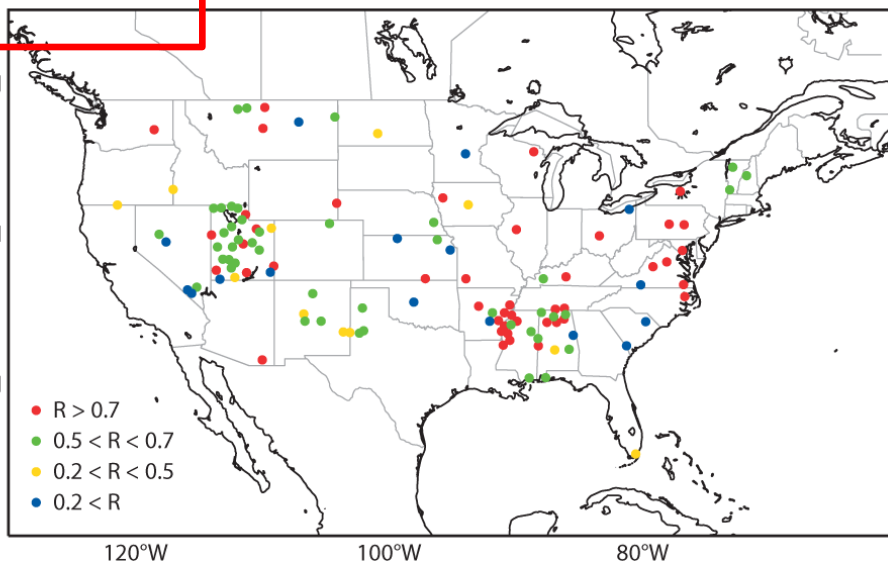
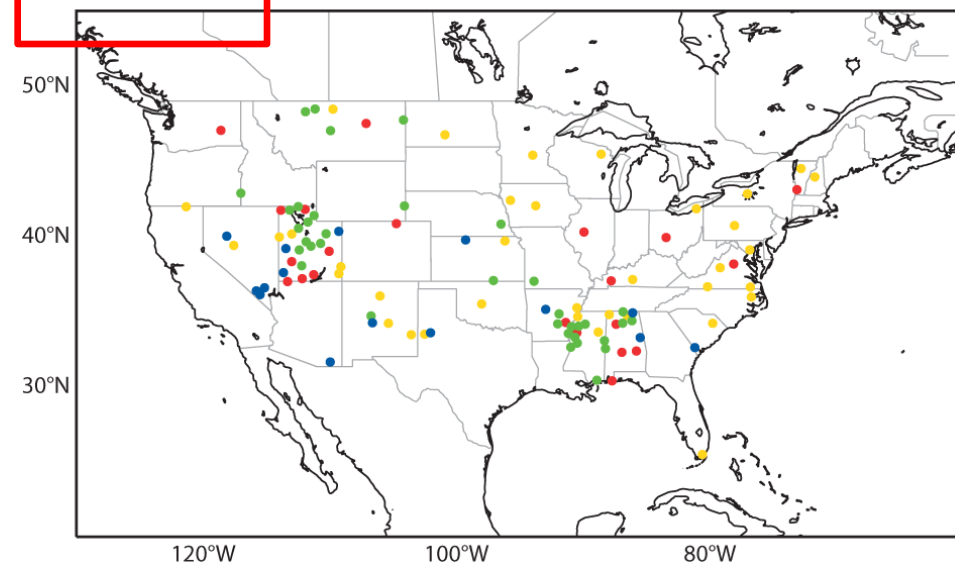
● SM-DAS-2     
 ● ASCAT     
 ● SMOS

Network	Mean Correlation [-] (for stations with significant values)		
	ECMWF	ASCAT	SMOS
<b>REMEDHUS</b> (nb stations)	<b>0.79</b> (17)	<b>0.57</b> (17)	<b>0.52</b> (17)
<b>OZNET</b> (nb stations)	<b>0.82</b> (36)	<b>0.80</b> (34)	<b>0.74</b> (30)
<b>SMOSMANIA</b> (nb stations)	<b>0.83</b> (11)	<b>0.52</b> (11)	<b>0.44</b> (10)



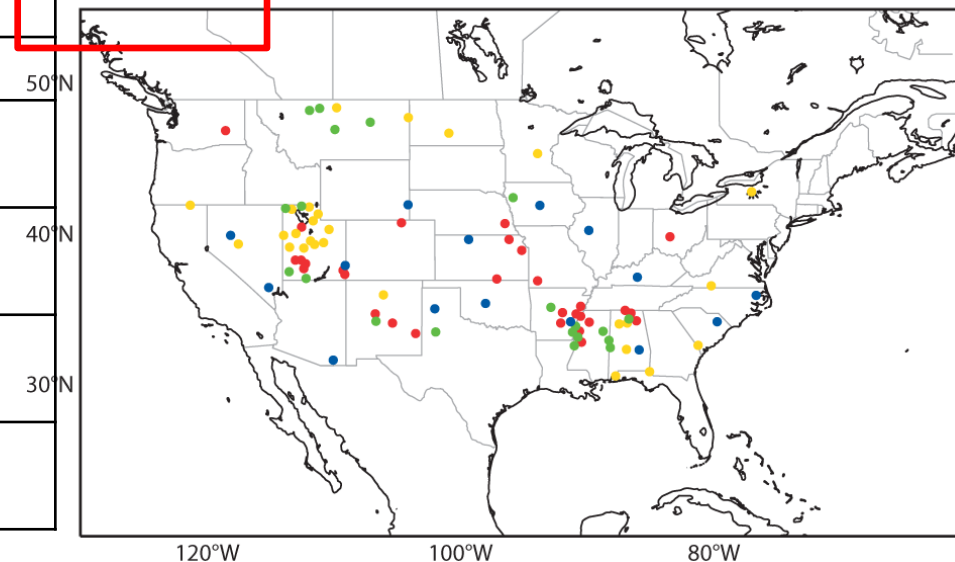
● SM-DAS-2 ● ASCAT ● SMOS

Correlation [-] (for stations with significant values)		
ECMWF	ASCAT	SMOS
<b>0.65</b> (131 stations)	<b>0.48</b> (125 stations)	<b>0.51</b> (106 stations)

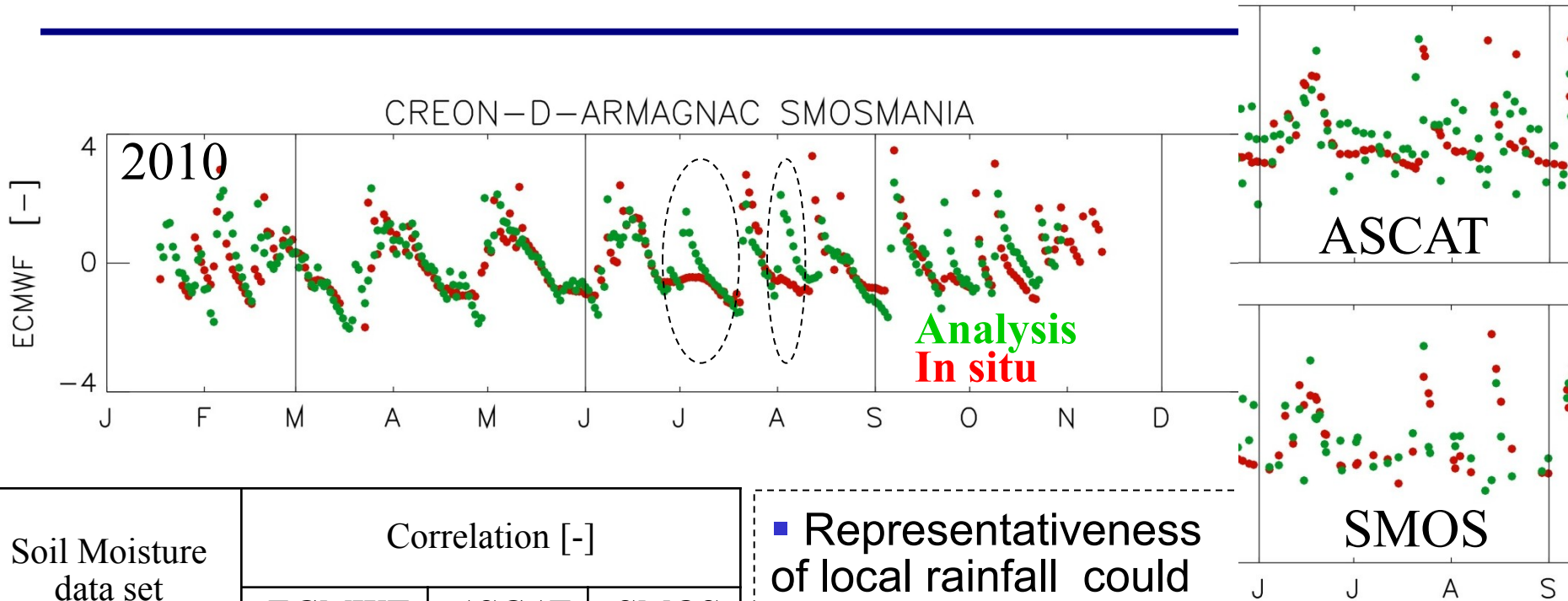
**a** SM-DAS-2**b** ASCAT

## Distribution (%) of correlation values

Correlation	NCRS-SCAN		
	ECMWF	ASCAT	SMOS
<b>Inadequate</b> $R < 0.2$	2	7	3
<b>Poor</b> $0.2 < R < 0.5$	14	47	48
<b>Fair</b> $0.5 < R < 0.7$	50	39	32
<b>Good</b> $R > 0.7$	34	7	17
	100%	100%	100%

**c** SMOS

# Comparison of the Anomaly time-series



- Representativeness of local rainfall could induce discrepancies when compared to coarse resolution products
- Assimilation of rain-gauge rainfall accumulation is an ongoing activity

Soil Moisture data set	Correlation [-]		
	<i>ECMWF</i>	<i>ASCAT</i>	<i>SMOS</i>
Winter	0.70	0.71	0.55
Spring	0.65	0.56	0.51
Summer	0.53	0.46	0.46
Autumn	0.62	0.50	0.45

# Global evaluation

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- Good performances of the three products to capture surface soil moisture annual cycle as well as short term variability
- Results particularly encouraging over the Oznet network
  - does not seem to be affected by RFI
  - dense vegetation canopies → reduced sensitivity to soil moisture
  - land use is predominantly agricultural → significant fraction of bare soil and/or of dry vegetation

Normalized Product (nb stations with significant R)	ECMWF (219)	ASCAT (208)	SMOS (180)
Correlation	0.70	0.53	0.54
Bias (index) (In Situ - Product)	- 0.05	- 0.07	0.12
RMSE (index)	0.235	0.255	0.243

## **Towards a root zone soil moisture product**

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- **ECMWF SSM, good correlations, high biases and RMSD**
- **Spatial variability of in situ SSM very high and differences in soil properties could imply difference in the mean and the variance on SSM**
- ➔ **The true information content of modelled SSM not relies in their absolute magnitudes but in their time variation, i.e. the time-integrated impact of antecedent meteorological forcing**

**Good level of correlation of ECMWF SSM is supportive of the development of a root zone soil moisture index**

# Summary

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- **ASCAT and SMOS product :**
  - similar performances in terms of correlation
  - particularly good scores in Australia, western Africa
- **SMOS in better agreement with NCRS-SCAN than ASCAT**
- **SM-DAS-2 product best performances (R, Bias, RMSD)**
- **Albergel et al., submitted to RSE, 2011**

(Also ECMWF Tech Memo, No652 :

<http://www.ecmwf.int/publications/library/do/references/list/14> )

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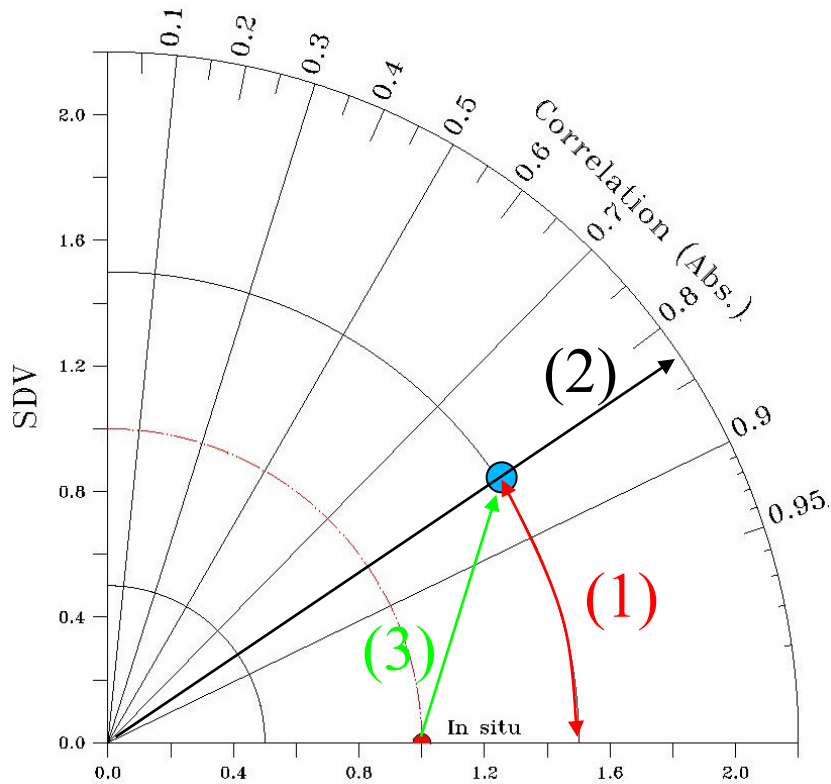
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# Taylor Diagram



- SDV is displayed as a radial distance (1)
- R as an angle in the polar plot (2)
- E is the distance to the 'In situ' point (3)

# Statistical comparison

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- ‘Classic’ scores: R, bias, RMSD
- Normalised standard deviation  $SDV = \sigma_{analyse} / \sigma_{in\ situ}$
- Centred RMSD normalised by in situ standard deviation  $E^2 = (rmsd^2 - Bias^2) / \sigma^2_{in\ situ}$
- R, SDV and E are usually represented on Taylor diagram

(Taylor, 2001)

# Land surface model evolution

2000/06

## TESSEL

Van den Hurk et al. (2000)  
 Viterbo and Beljaars (1995)  
 Viterbo et al (1999)  
 Up to 8 tiles (binary Land-Sea mask)  
 GLCC veg. (BATS-like)  
ERA-40 and ERA-I scheme

2007/11

## Hydrology-**TESSEL**

Balsamo et al. (2009)  
 van den Hurk and Viterbo (2003)  
 Global Soil Texture (FAO)  
 New hydraulic properties  
 Variable Infiltration capacity & surface runoff revision

2009/03

## **NEW SNOW**

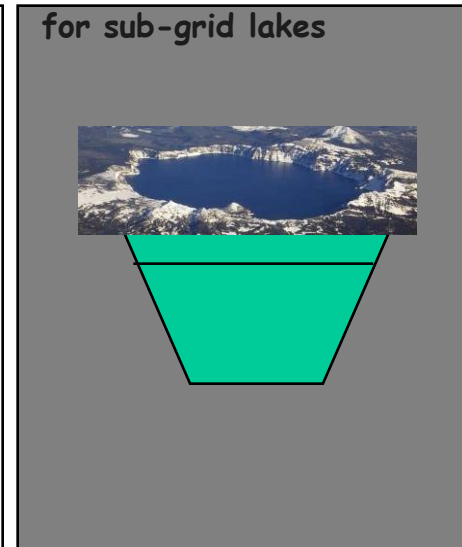
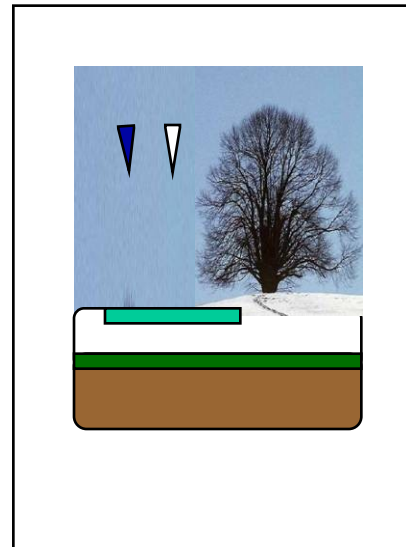
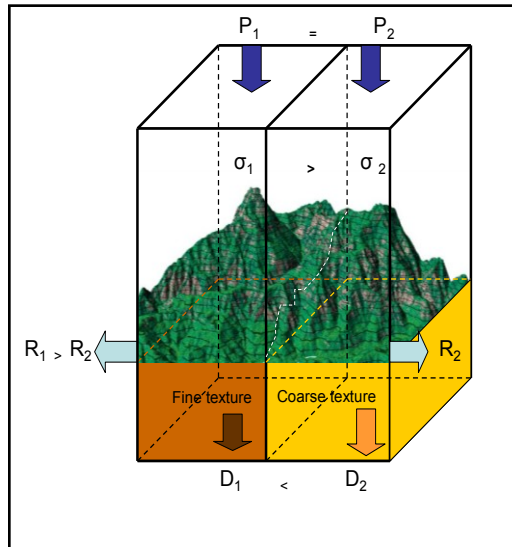
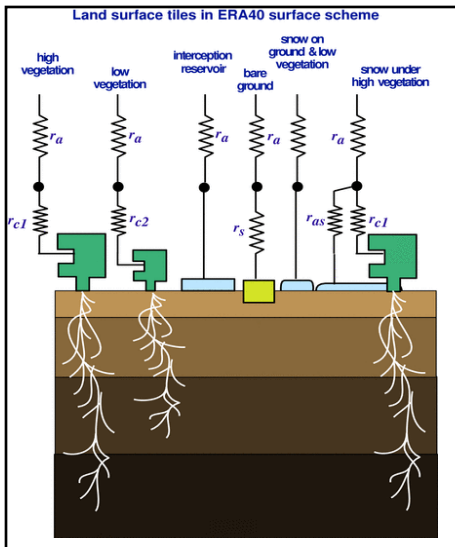
Dutra et al. (2010)  
 Revised snow density  
 Liquid water reservoir  
 Revision of Albedo and sub-grid snow cover

2009/09

2010/2011

## **NEW LAI**

Boussetta et al. (2010)  
**BARE GROUND**  
**EVAPORATION**  
**FLAKE**  
 Mironov et al (2010),  
 Dutra et al. (2010),  
 Balsamo et al. (2010)  
 Extra tile (9) to account for sub-grid lakes



# Land surface data assimilation evolution

1999/07	2004/03	2008/09	2010/2011
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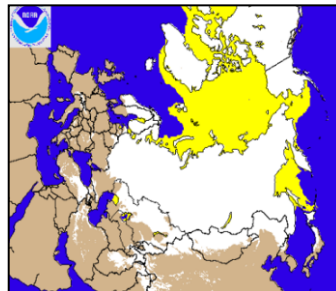
## OI screen level analysis

Douville et al. (2000)  
 Mahfouf et al. (2000)  
 Soil moisture analysis based on  
 Temperature and relative humidity  
 analysis



## Revised snow analysis

Drusch et al. (2004)  
 Cressman snow depth analysis using  
 SYNOP data improved by using  
 NOAA / NESDIS Snow cover  
 extend data



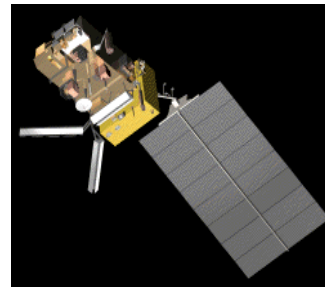
## Structure Surface Analysis

OI snow analysis and high resolution NESDIS  
 data (4km)

### SEKF Soil Moisture analysis

Simplified Extended Kalman Filter  
 Drusch et al. (2009), de Rosnay et al.  
 (2011)

METOP-ASCAT



SMOS



- SEKF (Simplified Extended Kalman Filter) surface analysis
- Use of active microwave data (ASCAT soil moisture product)
- Use of passive microwave SMOS data (Brightness Temperature product)
- New snow analysis and use of NOAA/NESDIS 4km snow cover product