



**soil moisture**  
cci

climate change initiative

European Space Agency

# Soil moisture

## Product and science update

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2 June 2013



# Soil moisture is getting mature

## The use of Earth observation satellites for soil moisture monitoring

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Soil moisture strongly influences the exchange of water and energy between the land surface and the atmosphere and is thus a key variable of the climate system. While many of its effects on the climate system, such as the role of soil moisture deficits in the occurrence of heatwaves, are reasonably well understood, progress in the scientific understanding of soil moisture-climate interaction has so far been hampered by the lack of soil moisture observations. Fortunately, this situation has improved significantly in the last few years thanks to the increasing availability of in situ (for example, through the International Soil Moisture Network – see [www.ipf.tuwien.ac.at/insitu/](http://www.ipf.tuwien.ac.at/insitu/)) and satellite-based soil moisture observations.

### MICROWAVE REMOTE-SENSING OF SOIL MOISTURE

Many Earth observation satellites carry micro-

in order to maximize the sensitivity to soil moisture, but without negative repercussions on the spatial resolution and coverage. Scientifically, the task has been to develop algorithms that single out the soil moisture signal from a host of other parameters affecting the microwave observations, such as the vegetation cover or the roughness of the soil surface. While many scientific questions are still only partially answered, the retrieval algorithms have matured up to a point where global-scale processing has become feasible.

### A VIRTUAL CONSTELLATION OF SOIL MOISTURE SATELLITES

So far only one Earth observation satellite has been built and launched for the primary purpose of measuring soil moisture over land, namely the Soil Moisture and Ocean Salinity (SMOS) satellite launched by the European Space Agency

## WMO statement on the status of the global climate in 2012



World  
Meteorological  
Organization  
Weather · Climate · Water

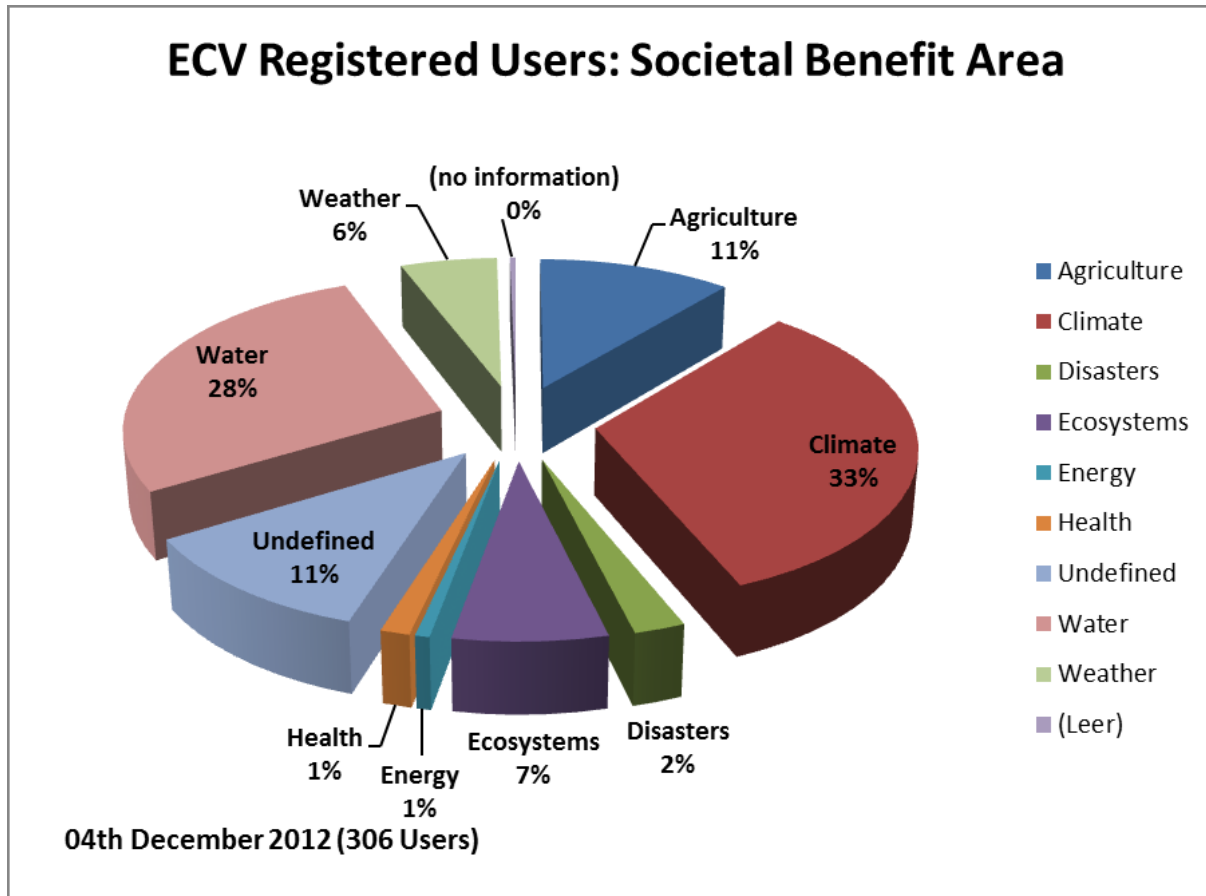
WMO-No. 1108



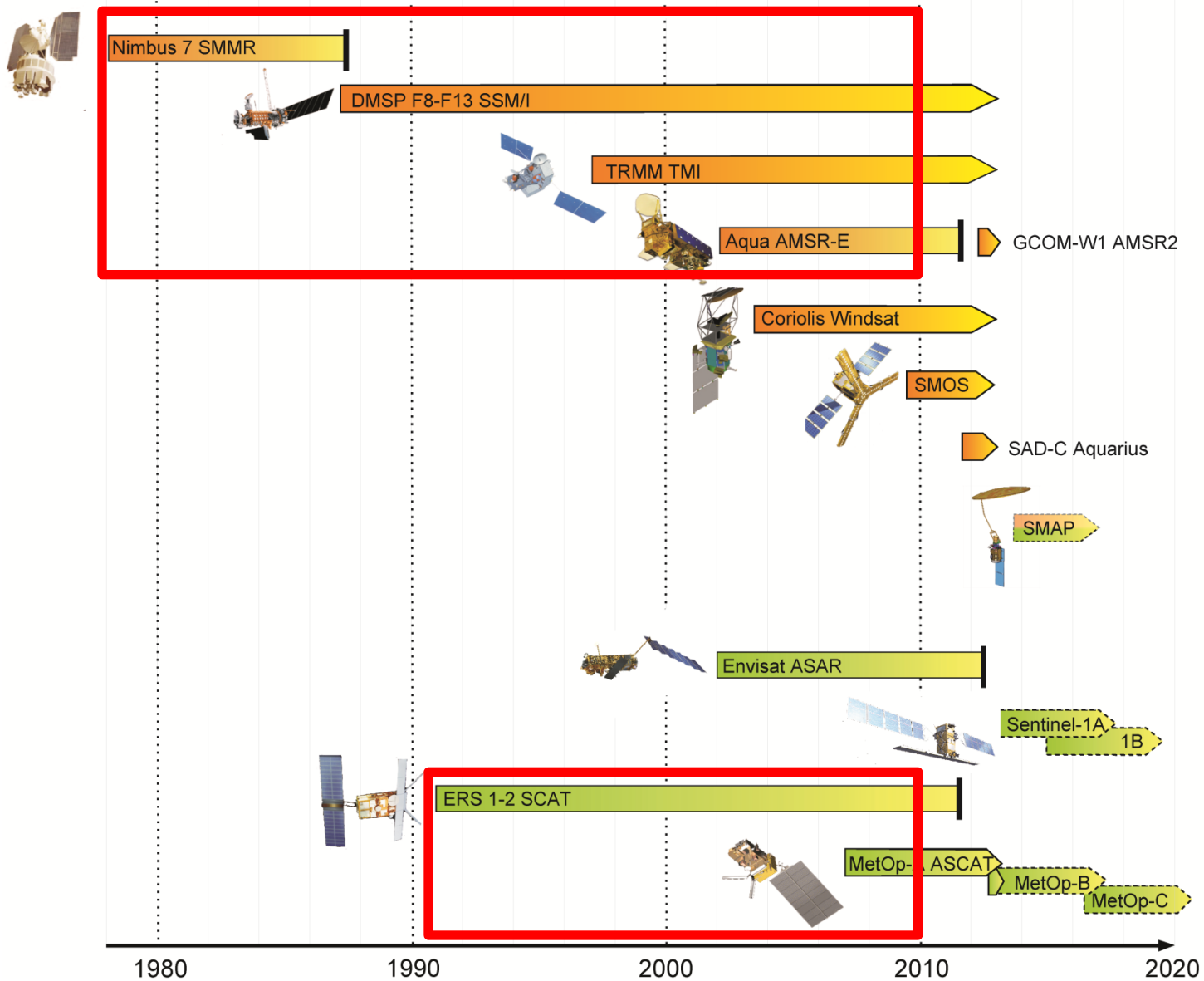


# Data set release

- ECV\_SM v0.1 issued in June 2012
- >600 registered users



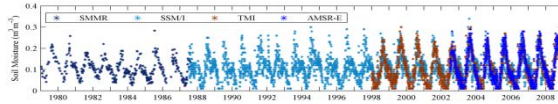
# Microwave missions for soil moisture



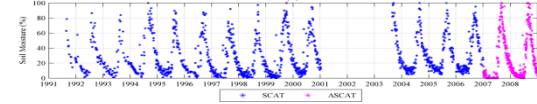


# Methodology in a nut shell

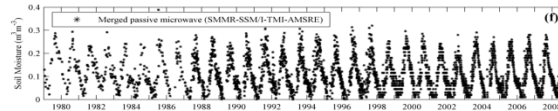
## 1. Individual radiometer products



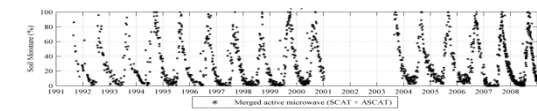
## 2. Individual scatterometer products



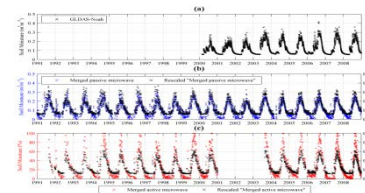
## 3. Scaling and merging passive products to climatology AMSR-E



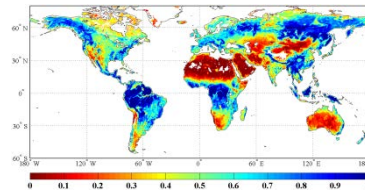
## 4. Scaling and merging active products to climatology ASCAT



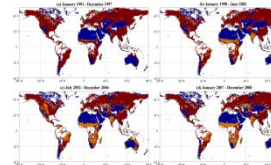
## 5. Rescale active and passive to GLDAS-Noah reference



## 6. Test sensitivity to vegetation density



## 7. Blend rescaled active and passive datasets

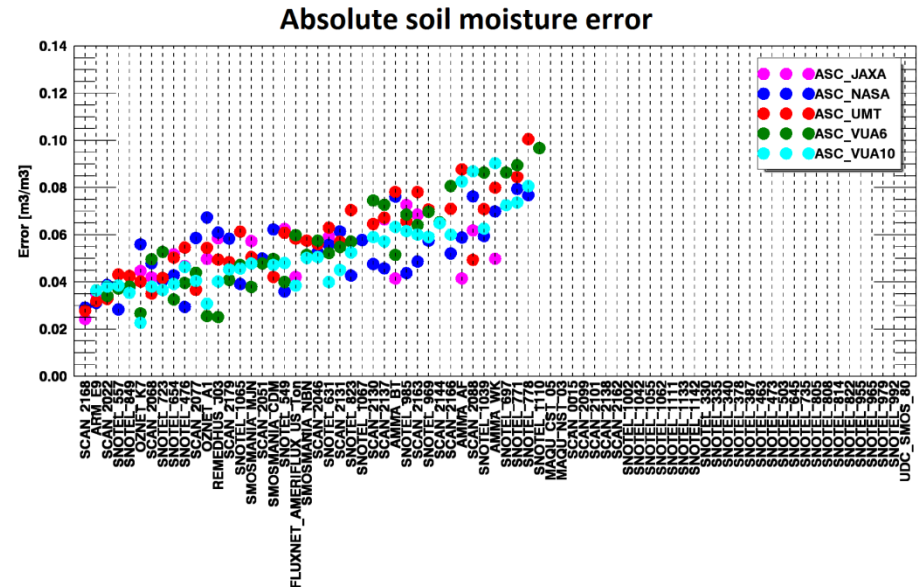




# Round Robin Exercise AMSR-E

- 4 algorithms from 4 different groups (+1 joined later +1 still interested to join)
- Classical error metrics
- Triple collocation
  - Comparable performance
  - Descending (night) > Ascending (day)
  - 10 GHz > 6.9 GHz (USA, RFI)

ASCENDING	JAXA	NASA	UMT	VUA 6 GHz	VUA 10 GHz
absolute	<b>0.051</b>	0.052	0.058	0.054	0.052
anomaly	0.037	0.035	0.036	0.035	<b>0.034</b>
DESCENDING					
absolute	0.043	0.047	0.045	0.041	<b>0.036</b>
anomaly	0.034	0.036	0.033	0.030	<b>0.028</b>



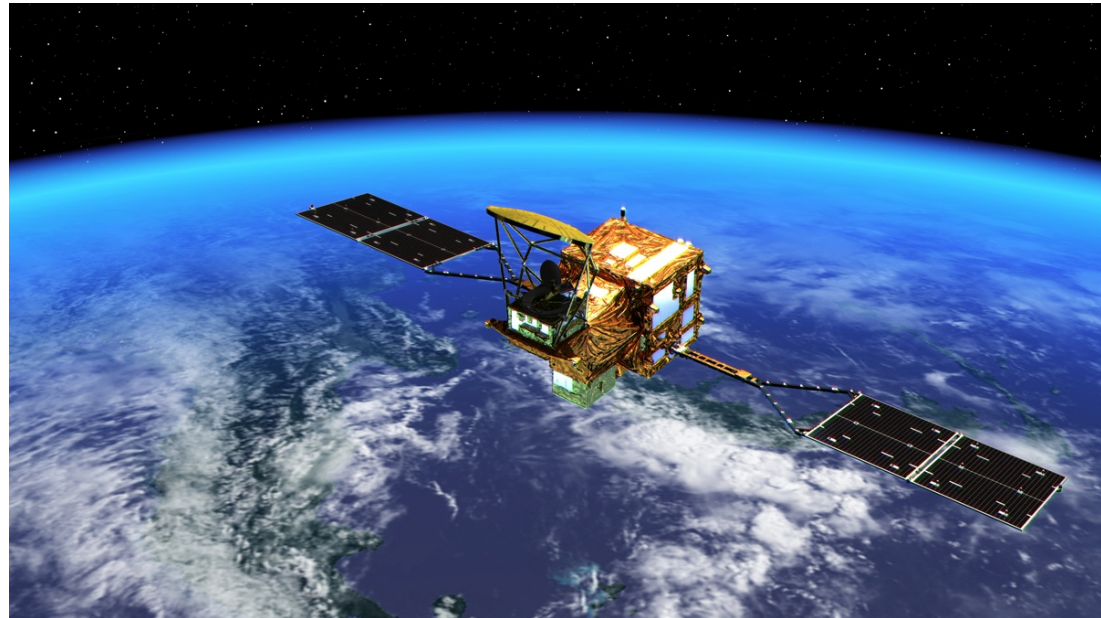






# Data updates – radiometer products

- Updated version of LPRM (e.g. improved RFI-flagging)
- LPRM applied to WindSat: important for continuation of C-band observations and intercalibration of AMSR-E and AMSR-2



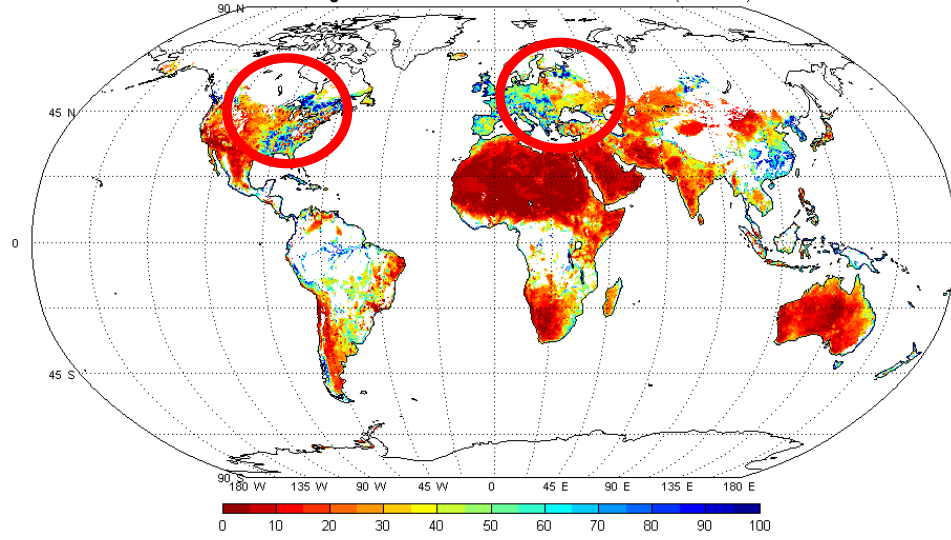




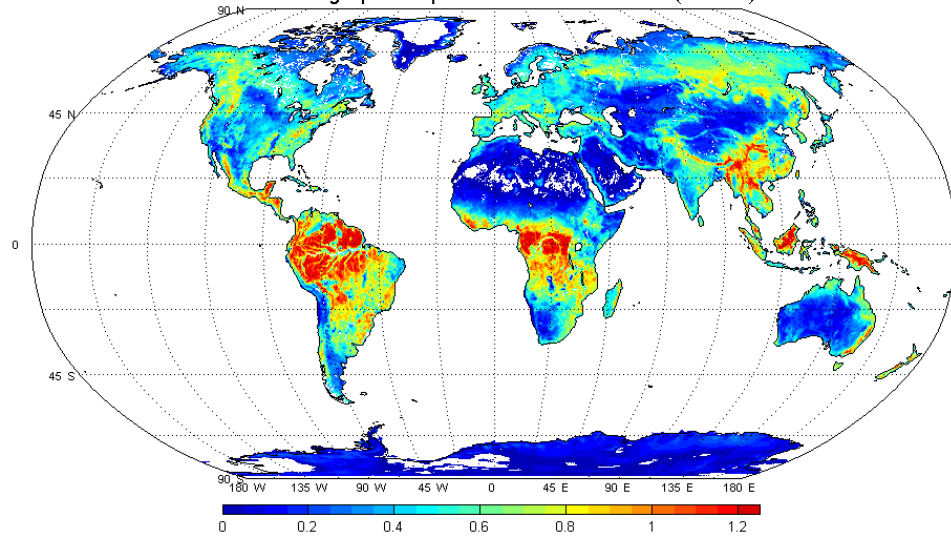
# Data updates – radiometer products

- LPRM applied to AMSR-2

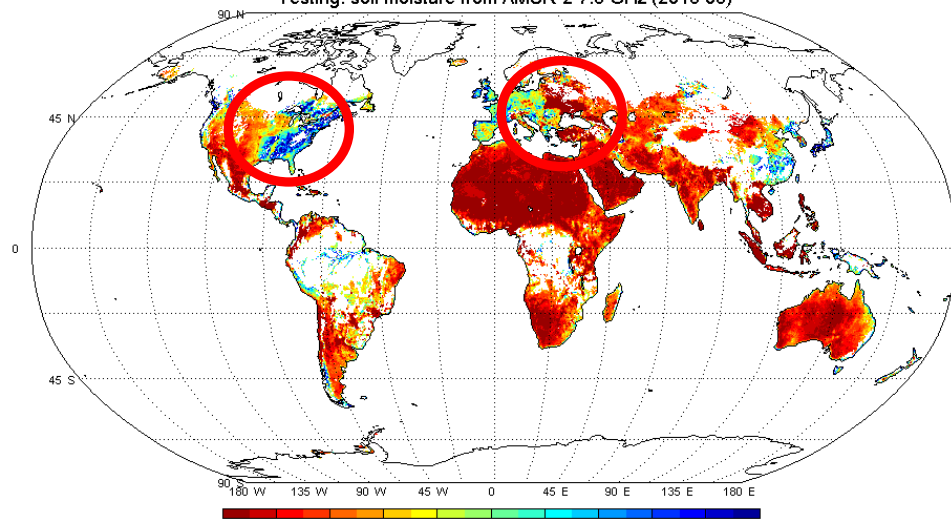
Testing: soil moisture from AMSR-2 6.925 GHz (2013 03)



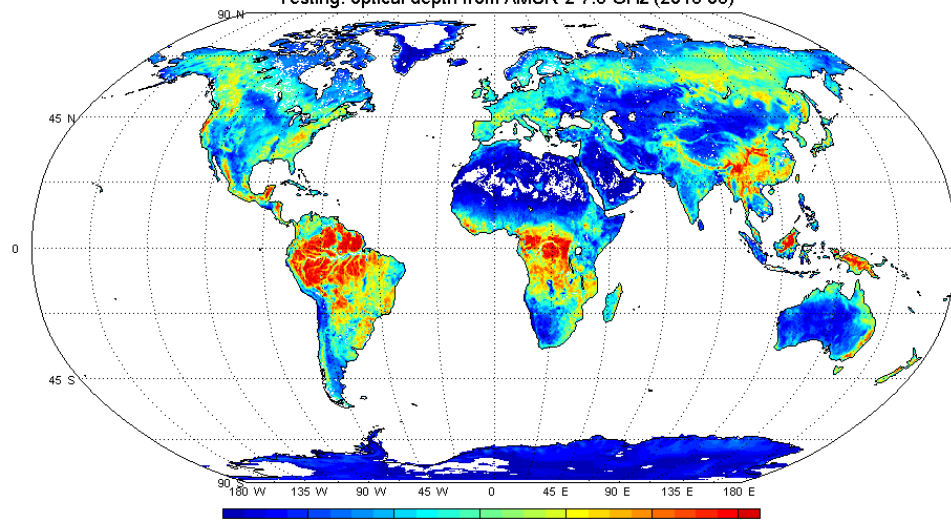
Testing: optical depth from AMSR-2 6.925 GHz (2013 03)



Testing: soil moisture from AMSR-2 7.3 GHz (2013 03)



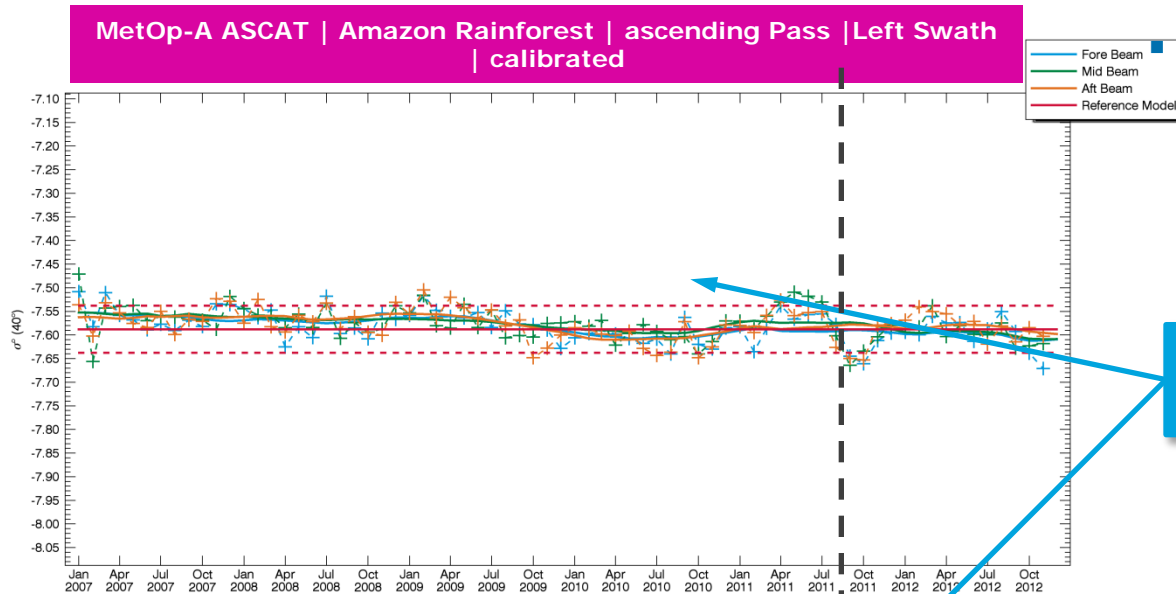
Testing: optical depth from AMSR-2 7.3 GHz (2013 03)



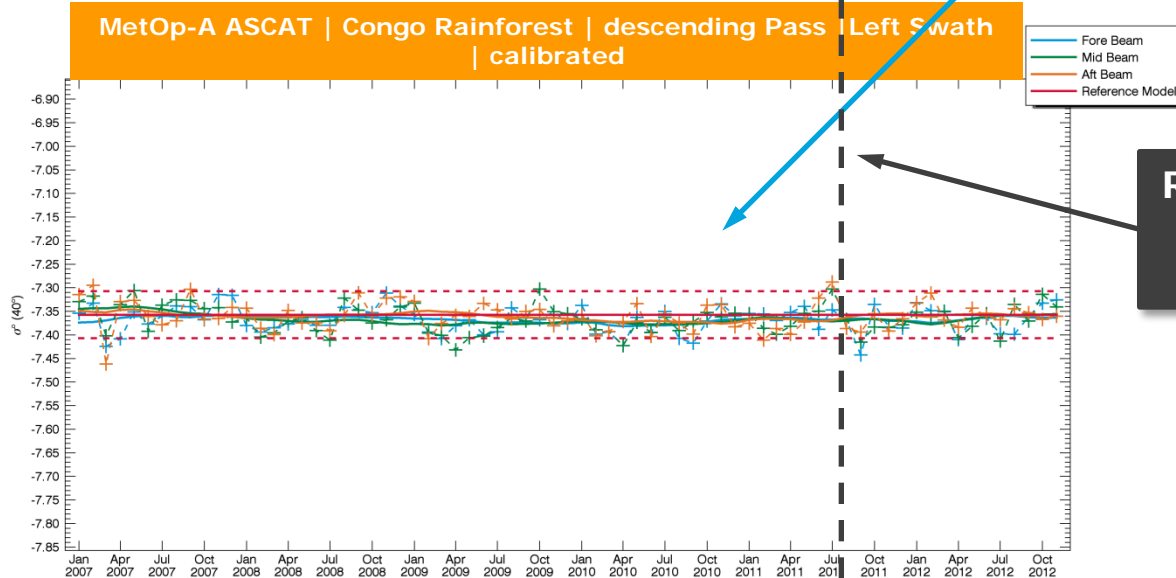


# Data updates - scatterometers

Reprocessing of complete METOP ASCAT (2007-2012) and ERS Scatterometer (1991-2007) Level 1 backscatter data archive



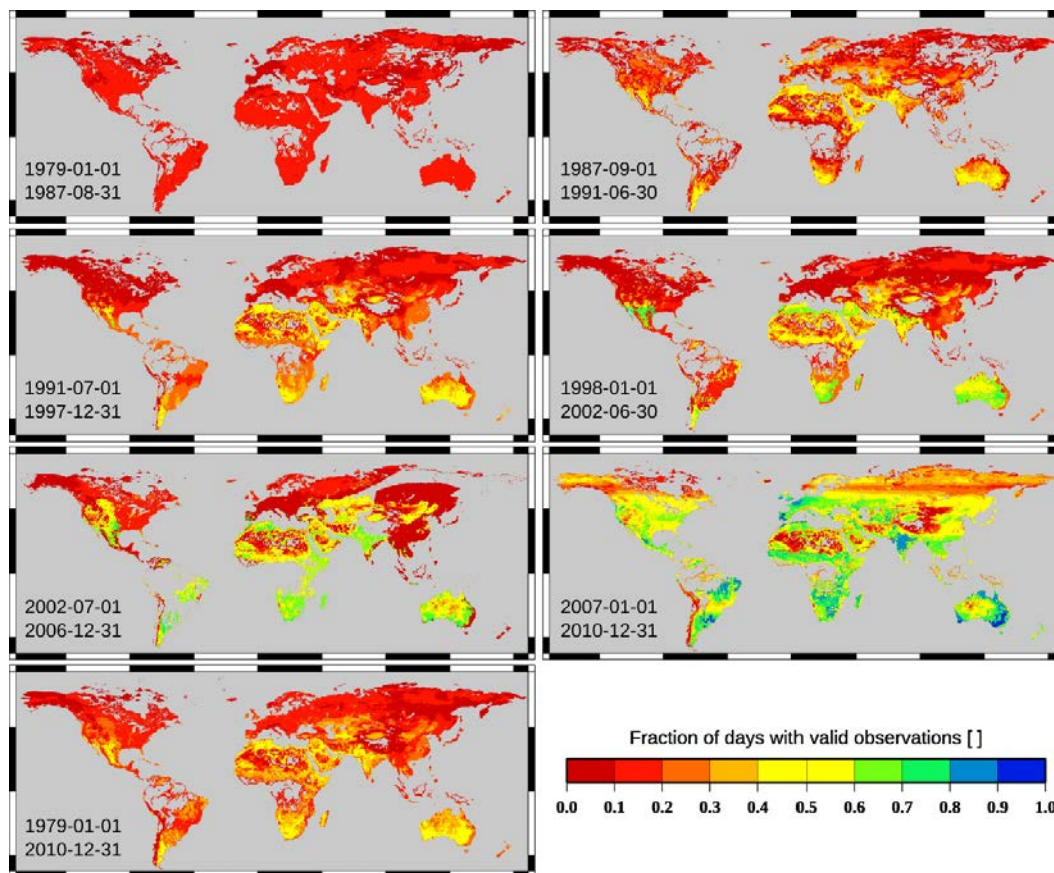
RCS increase in Left Mid Beam July 2009



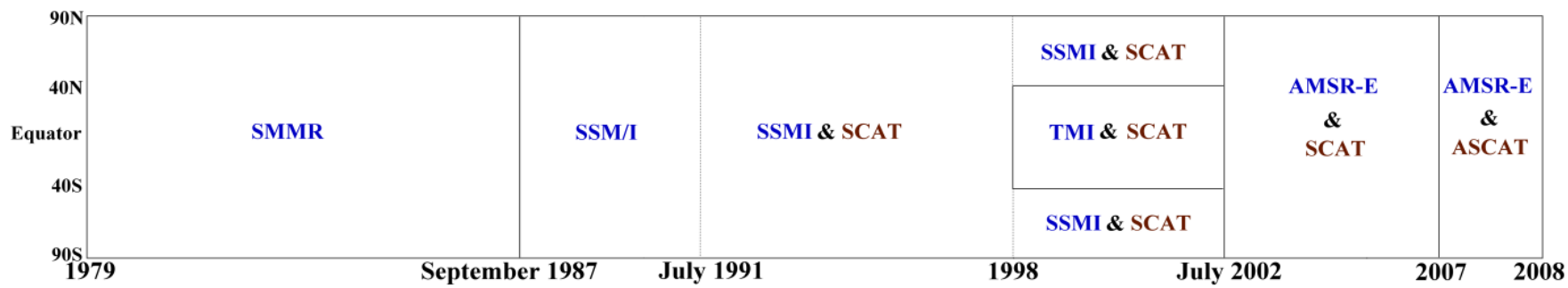
RCS drop, new calibration table introduced by EUMETSAT in August 2011



# Data density over time



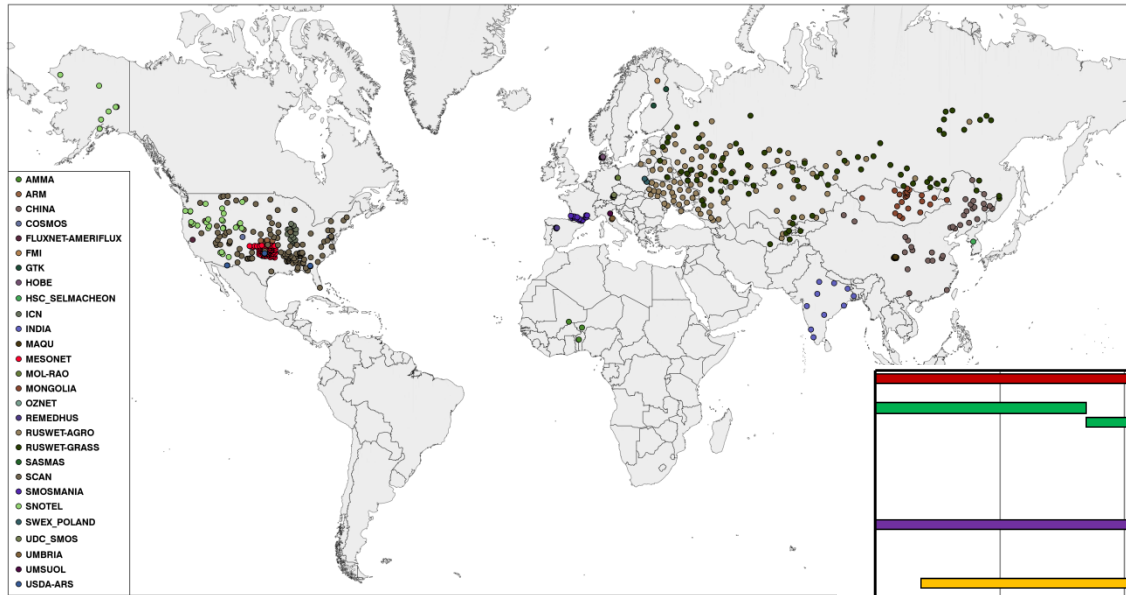
*Dorigo et al., 2013,  
RSE*



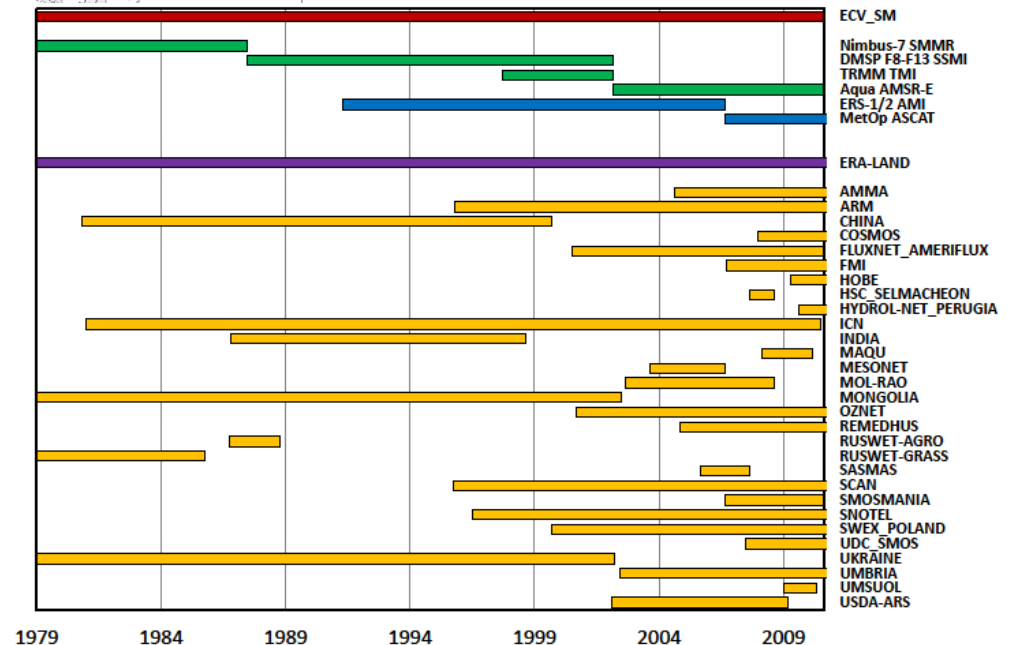


# Validation using in-situ data

## In-situ data from the International Soil Moisture Network



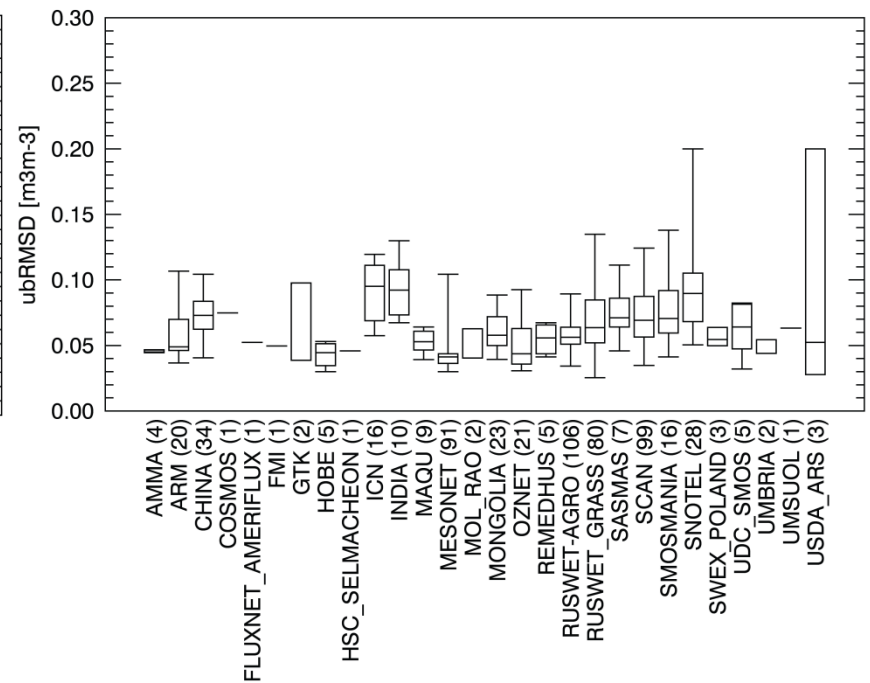
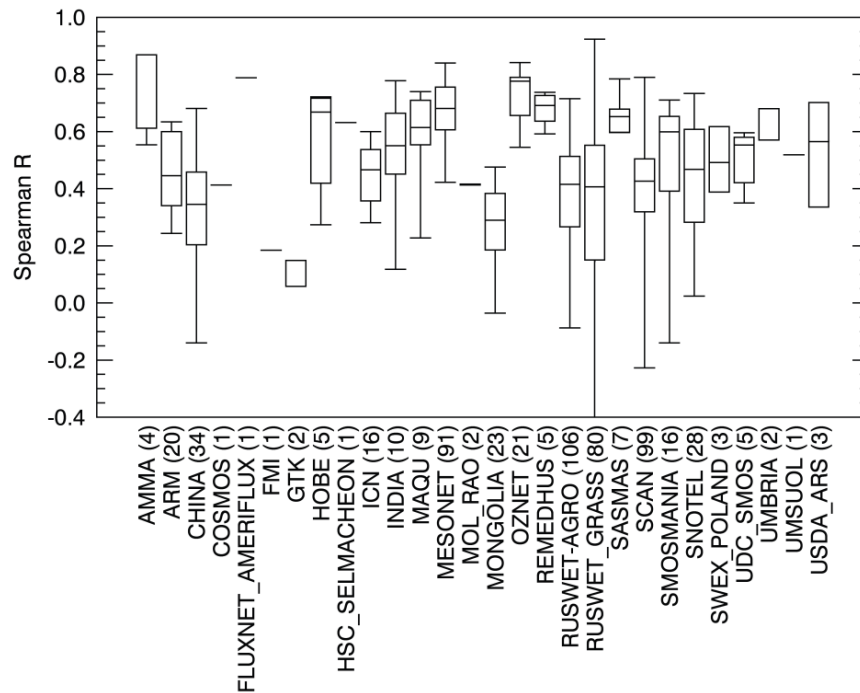
- AMMA
- ARM
- CHINA
- COSMOS
- FLUXNET-AMERIFLUX
- FMI
- GTK
- HOBE
- HSC\_SELMAHEON
- ICN
- INDIA
- MAQU
- MESONET
- MOL-RAO
- MONGOLIA
- OZNET
- REMEDHUS
- RUSWET-AGRO
- RUSWET-GRASS
- SASMAS
- SCAN
- SMOSMANIA
- SNOTEL
- SWEX\_POLAND
- UDC\_SMOS
- UMBRIA
- UMSUOL
- USDA-ARS





# Validation using in-situ data

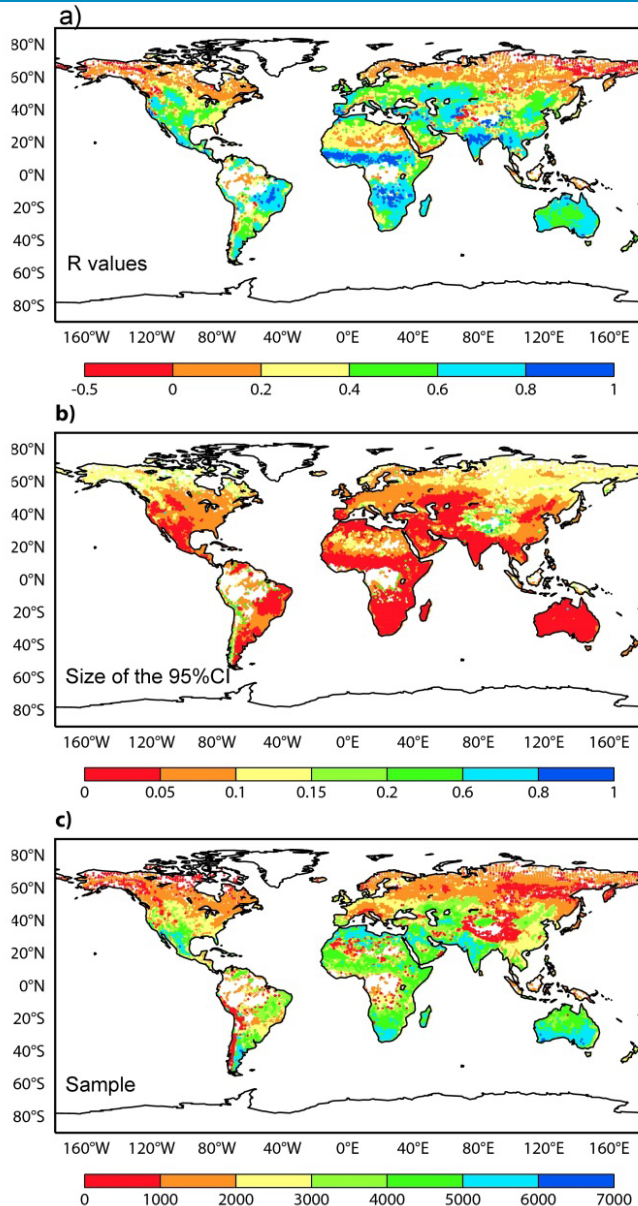
- Large variability within and between networks







# Validation using ERA-Land SM estimates



poor scores at high latitudes, altitude and in arid areas, good scores obtained in the tropics and close to the Equator, and over Australia (strong seasonal cycle)

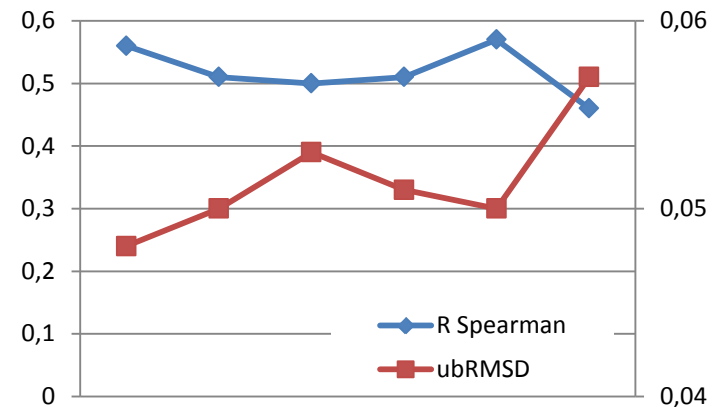
- a) Correlation values between ECV\_SM and ERA-Land over 1980-2010 ( $p$ -value $<0.05$ ),
- b) size of the 95% confidence interval
- c) number of observations used for the comparison



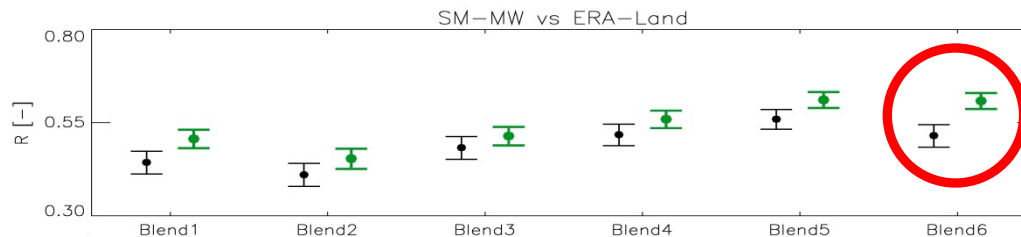
# Monitoring stability

- Binning in-situ results per blending period we see a drop in performance for the last period:
  - Influence of station composition (more challenging areas like sub-arctic)?
  - Product degradation?

*Dorigo et al., 2013, RSE*



- Alternative: use ERA-Land SM estimates as baseline for stability



*Albergel et al., in rev., RSE*

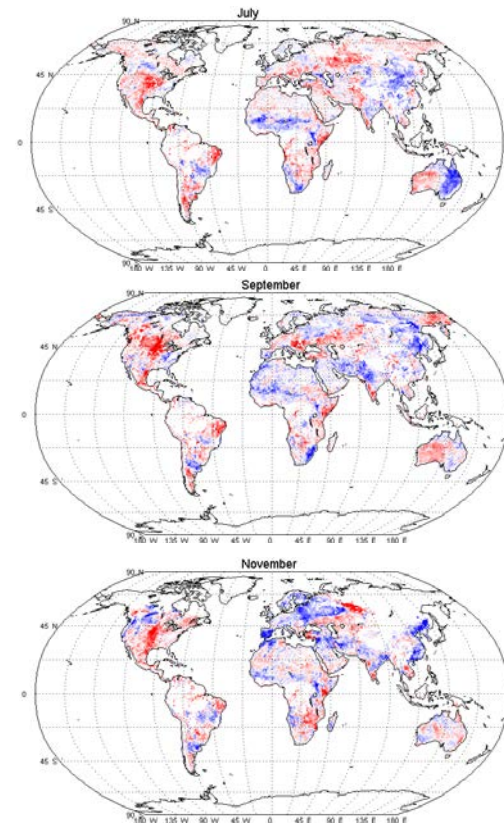
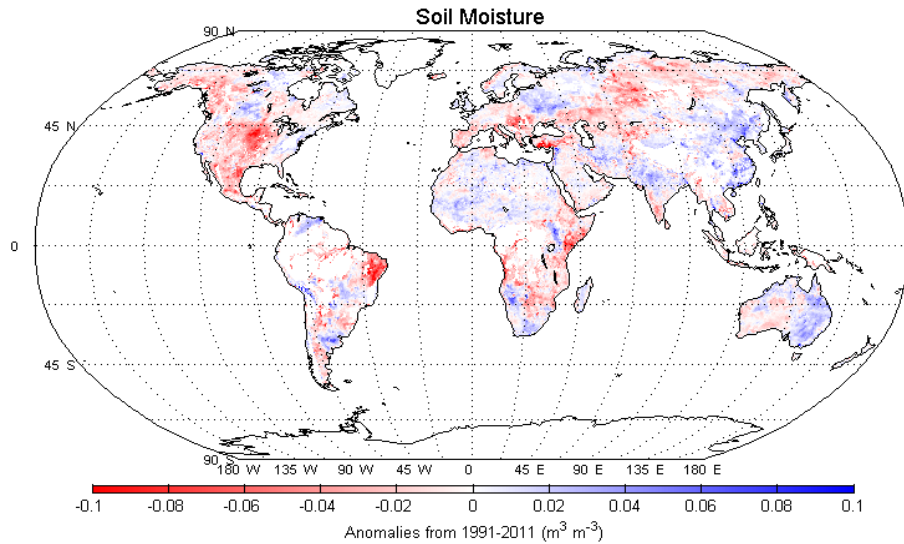
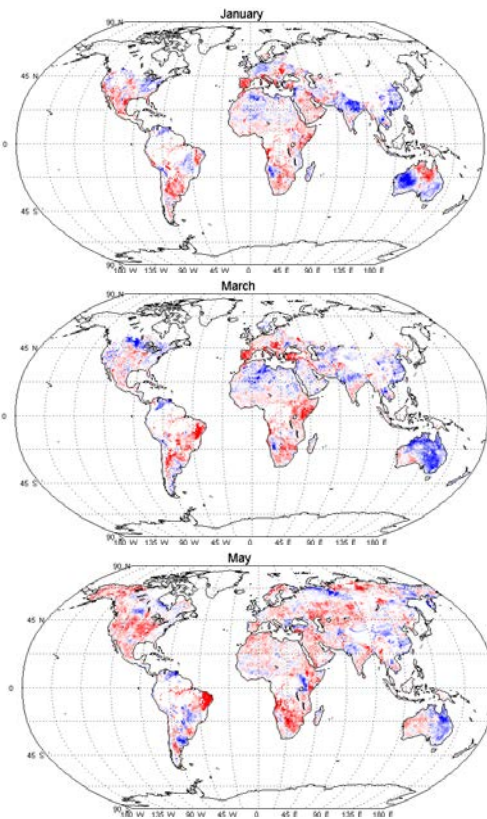
Black: taking all pixels available in period

Green: taking only pixels that have retrievals in all periods



# Global anomalies

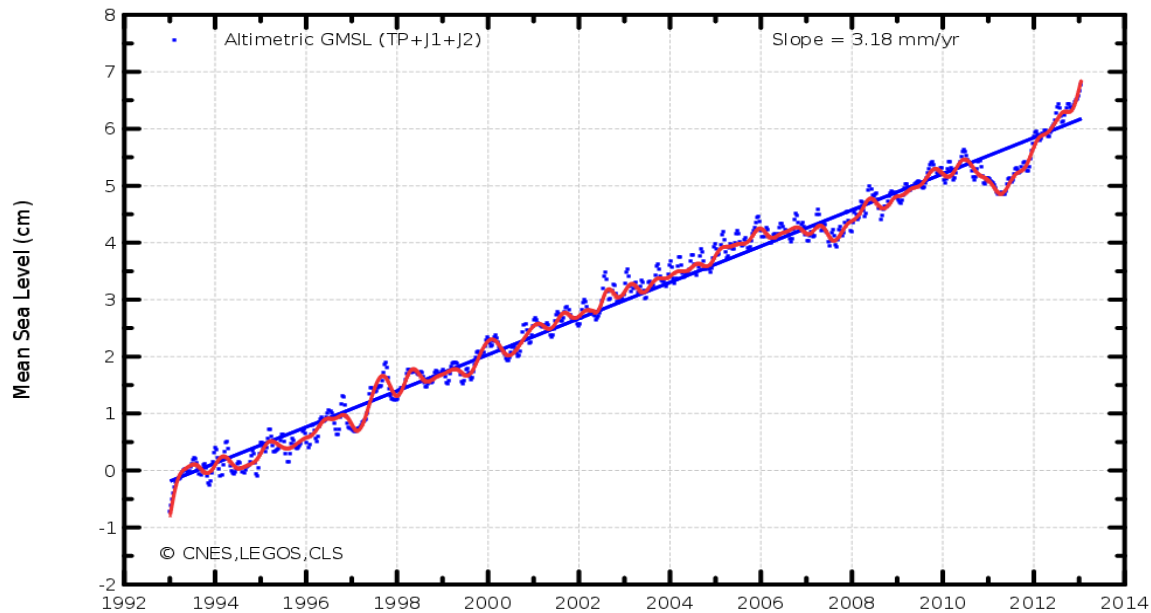
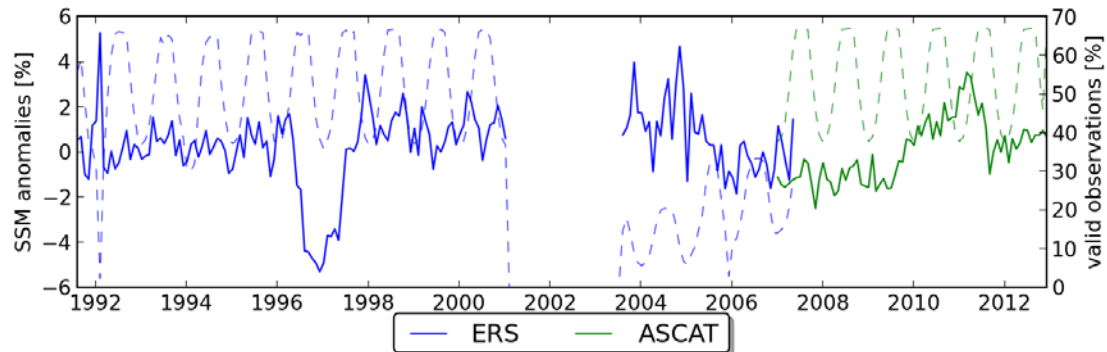
- Anomalies 2012 wrt ECV\_SM climatology 1991-2011



*Parinussa et al., 2013, BAMS*

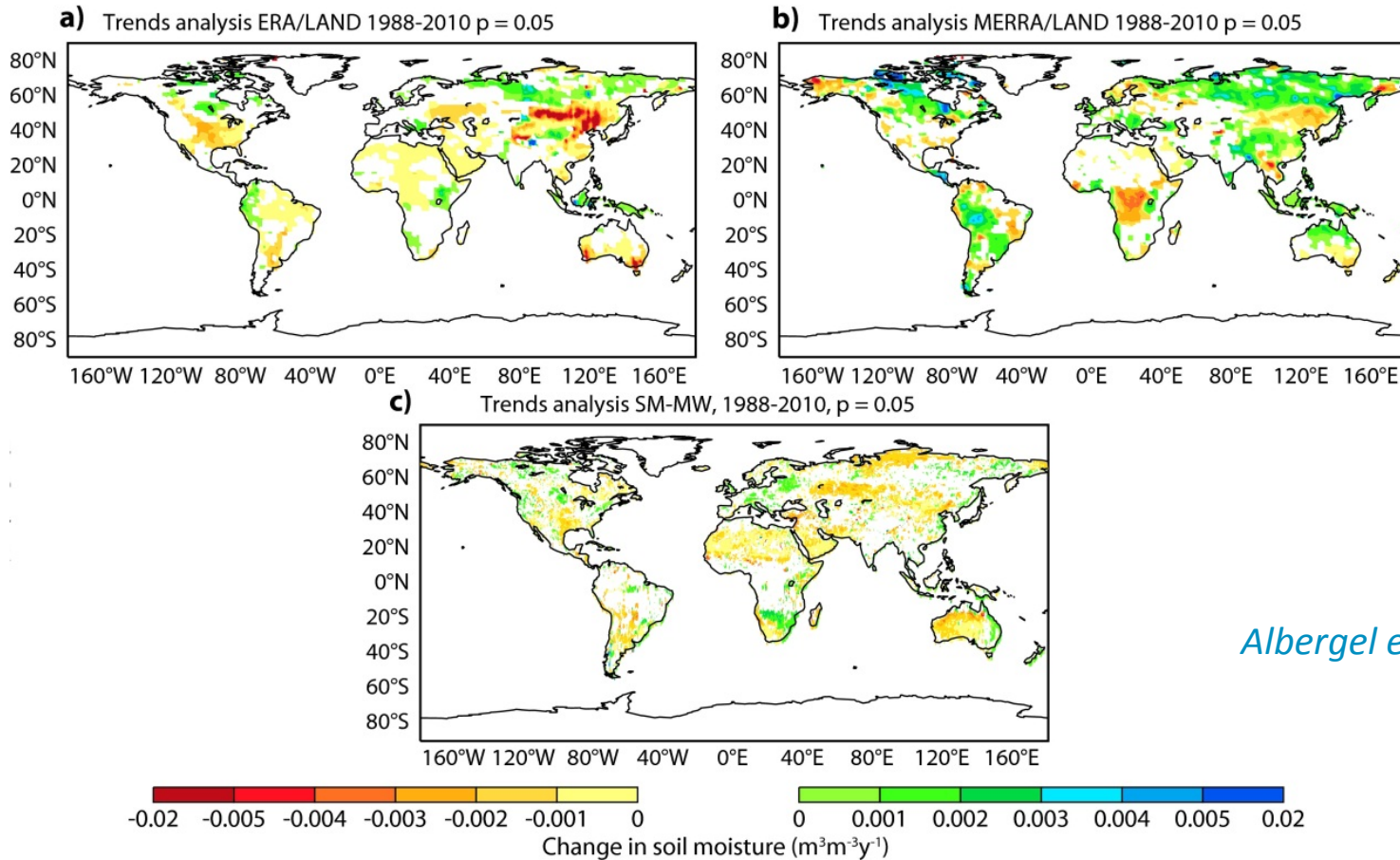


# Global anomalies





# Is ECV\_SM good enough to capture trends?



*Albergel et al., 2013, JHM*

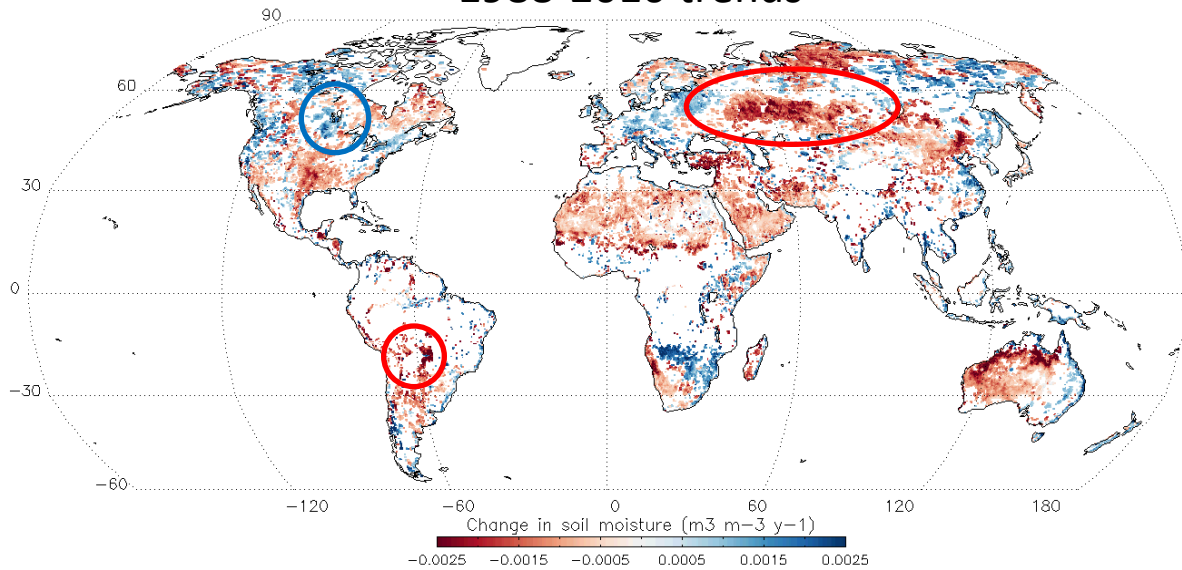
1988-2010 trends in monthly surface soil moisture ( $\text{m}^3\text{m}^{-3}\text{y}^{-1}$ ) for a) ERA-Land, b) MERRA-Land and c) SM-MW (adapted from Dorigo et al. 2012, GRL). Only significant trends ( $p=0.05$ ) based on the Mann-Kendall test are shown.



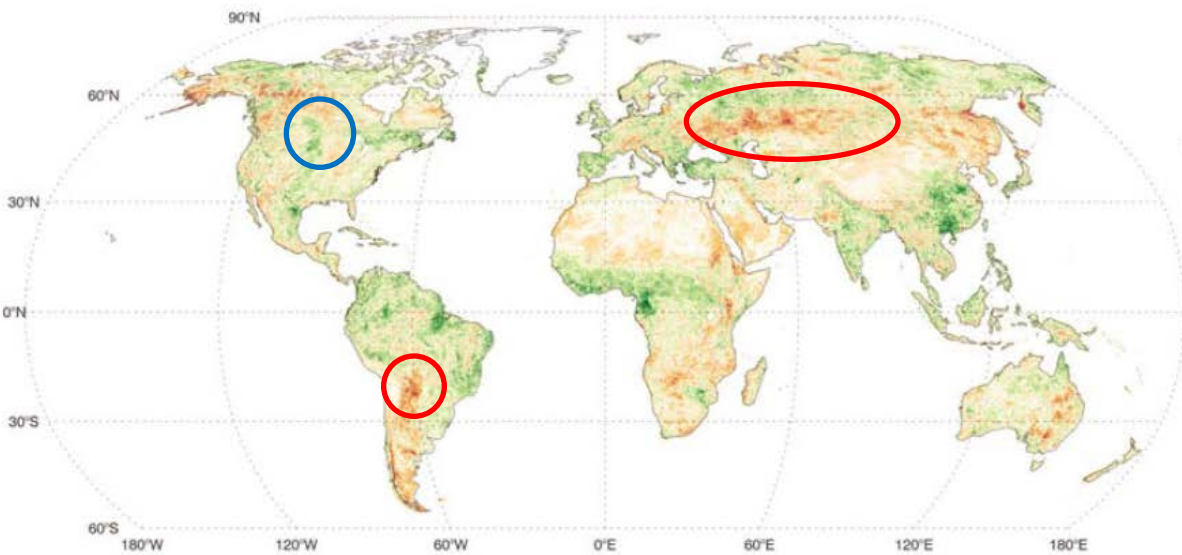


# Is ECV\_SM good enough to capture trends?

1988-2010 trends



CCI ECV\_SM



NDVI GIMMS 3g

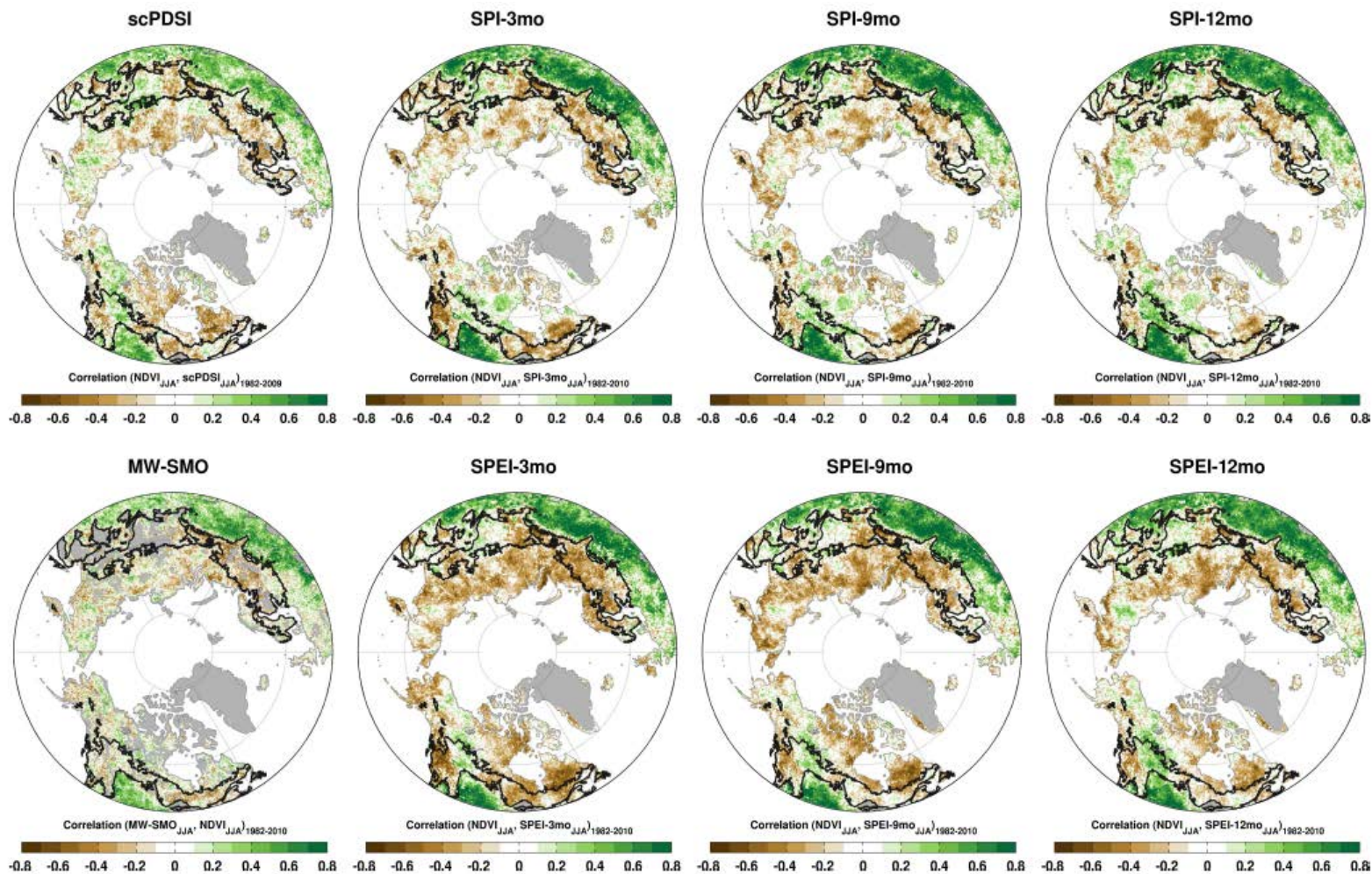
*Dorigo, et al. (2012), GRL*



# Linking soil moisture with the carbon cycle

Sensitivity of summer NDVI to soil moisture based on correlations with multiple moisture indices over the last 30 years.

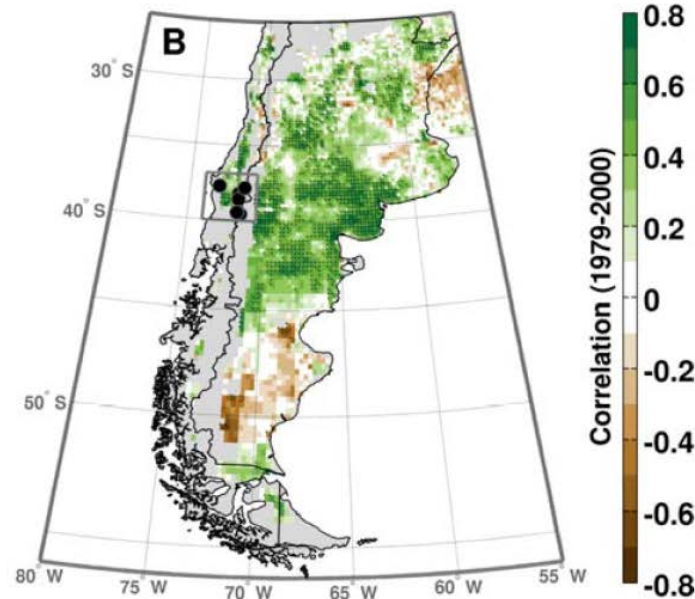
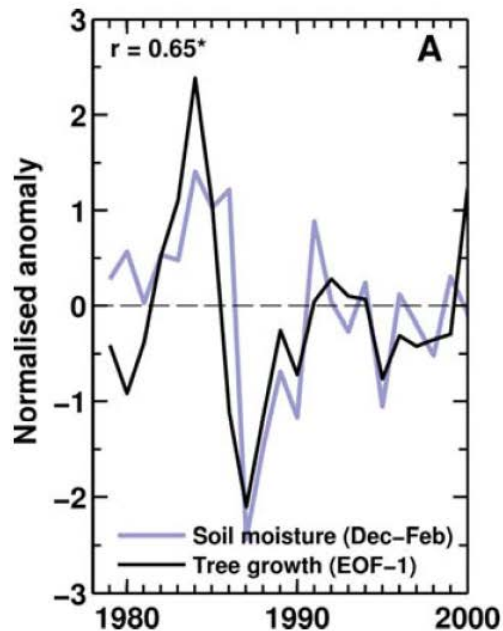
*Barichivich et al. (in prep)*







# Linking soil moisture with the carbon cycle



*Muñoz et al. (2013),  
Austral Ecology*

Comparison of the leading Empirical Orthogonal Function (EOF) of six updated tree-ring chronologies of *Araucaria* with (A) regional satellite-observed summer (Dec–Feb) soil moisture and (B) correlation field between this EOF and summer soil moisture variability across southern South America from 1979 to 2000.



# Summary

- Validation based on in-situ data appears to be an extremely delicate task. Land surface models can support.
- Good correlations with in-situ data and reanalysis in areas with strong seasonal cycle (close to the Equator, Australia, central Asia)
- Quality CCI ECV\_SM is consistent over time with respect to ERA-Land with slight increase in performance towards recent periods for  $p < 0.05$  for all periods.
- CCI ECV\_SM is far from perfect but we get an increasingly better understanding of flaws.
- CCI ECV\_SM seems to be useful for a better understanding of vegetation activity
- We wish to understand the driving mechanisms of soil moisture variability and vice versa. Links to:
  - SST
  - Sea Level
  - Land cover (change)
  - Fires
  - ...



# Thank you for your attention

- Albergel, C, Dorigo W., Reichle R. H., Balsamo G., de Rosnay P., Muñoz- Sabater J., Isaksen L., de Jeu R. & Wagner W.: Skill and global trend analysis of soil moisture from reanalyses and microwave remote sensing. Accepted to *J. Hydrometeor*, JHM-D-12-0161.
- Albergel, C, Dorigo W., Balsamo G., Muñoz- Sabater J., de Rosnay P., Isaksen L., Brocca L., de Jeu R. & Wagner W.: Monitoring the consistency of earth observation soil moisture data through land surface modelling: An example for multi-decadal soil moisture, *Remote Sensing of Environment*, in rev.
- Dorigo, W.A., De Jeu, R.A.M., Chung, D., Parinussa, R.M., Liu, Y.Y., Wagner, W., Fernández-Prieto, D. (2012). Evaluating global trends (1988-2010) in harmonized multi-satellite surface soil moisture. *Geophysical Research Letters*, 39, L18405. doi:10.1029/2012GL052988
- Dorigo, W.A., Gruber, A., De Jeu, R.A.M., Wagner, W., Stacke, T., Loew, A., Albergel, C., Brocca, L., Chung, D., Parinussa, R.M., & Kidd, R.. Evaluation of the ESA CCI soil moisture product using ground-based observations. *Remote Sensing of Environment*, in rev.
- Muñoz, A. A., Barichivich, J., Christie, D. A., Dorigo, W., González-Reyes, A., González, M. E., Lara, A., Sauchyn, D., Villalba, R. (2013). Patterns and drivers of *Araucaria araucana* forest growth along a biophysical gradient in the northern Patagonian Andes: linking tree rings with satellite observations of soil moisture. *Austral Ecology*, accepted
- Parinussa, R.M., De Jeu, R., Wagner, W., Dorigo, W., Fang, F., Teng, W., & Liu, Y.Y. (2013). [Global Climate] Soil Moisture [in: State of the Climate in 2012]. *Bulletin of the American Meteorological Society*, accepted