

Hydras+

Multisource data assimilation
into land surface models for
soil moisture monitoring

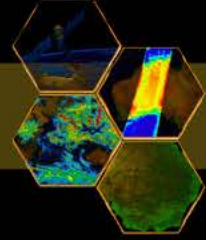


Dominik.Rains@ugent.be



LUXEMBOURG
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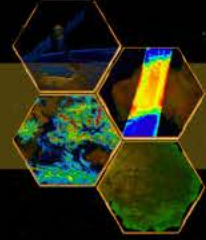
Challenge

Managing hydrological extreme events requires accurate data ...

Hydras+ focuses on improving soil moisture monitoring

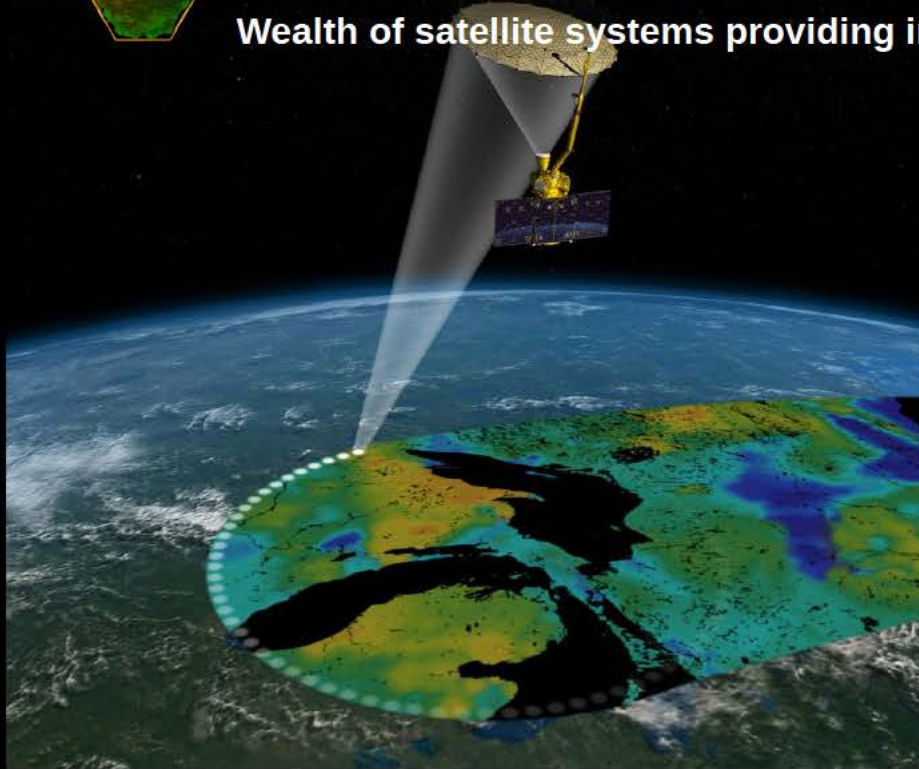


- Soil moisture deficit precedes vegetation reaction and plays a vital role in the evolution of a drought, i.e. further heating of the land surface
- Soil moisture is of great importance for agricultural productivity
- accurate information also improves flood forecasting

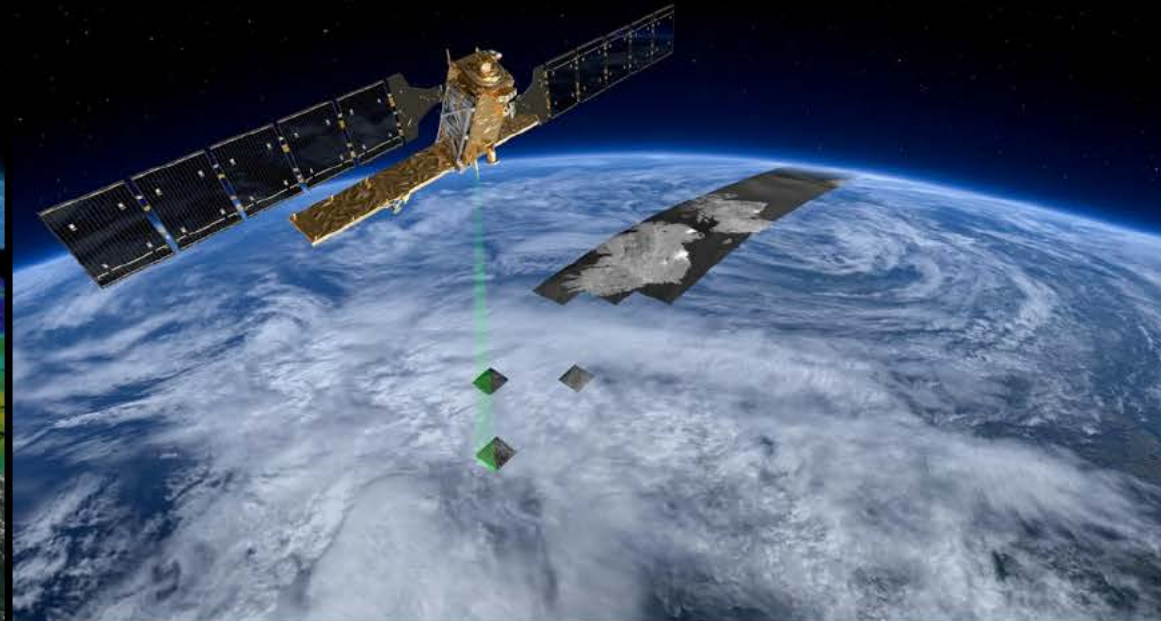


Opportunity

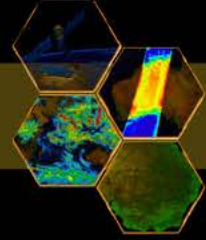
Wealth of satellite systems providing information for land surface conditions...



Passive systems (Radiometers),
e.g. SMOS and SMAP
measuring brightness temperatures



Active systems (SAR or Scatterometers),
e.g. Sentinel 1 and ASCAT
measuring backscatter

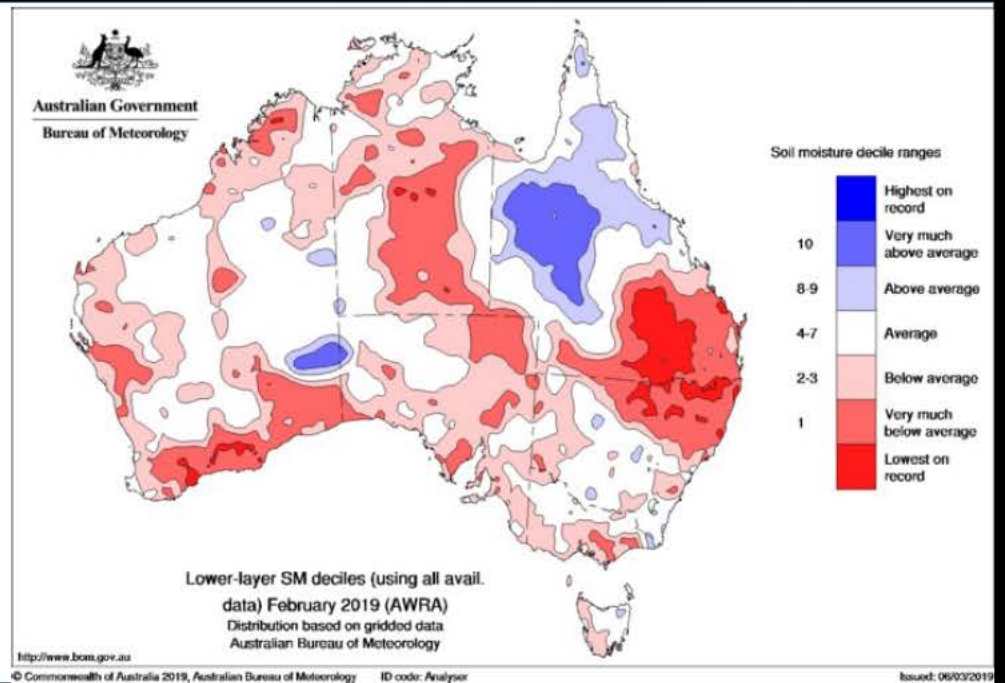
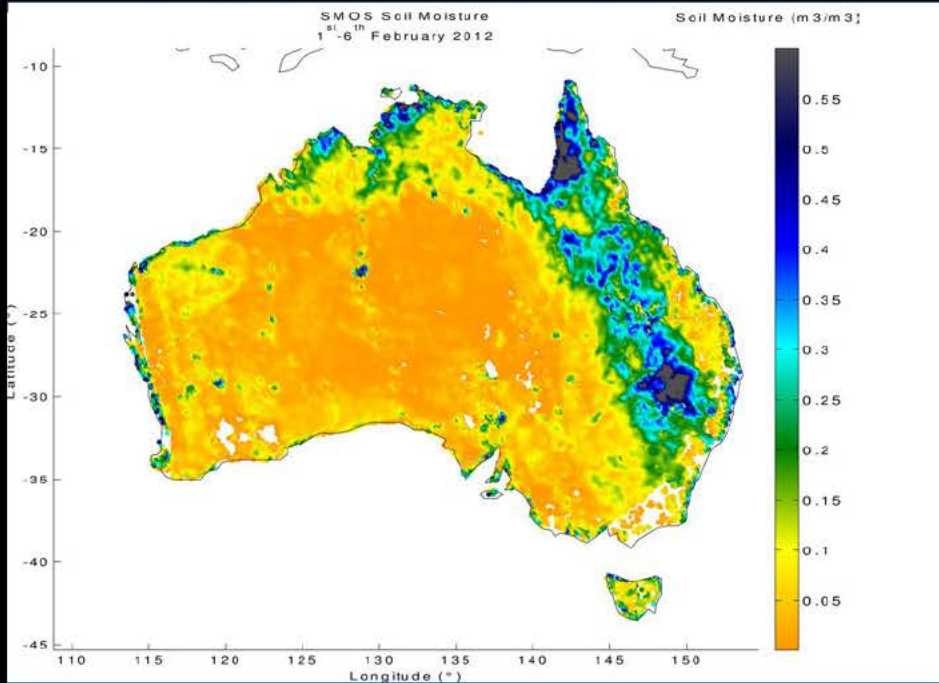


Shortcomings



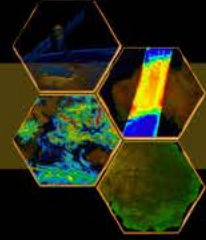
Geophysical retrievals of soil moisture

Requirements from stakeholders



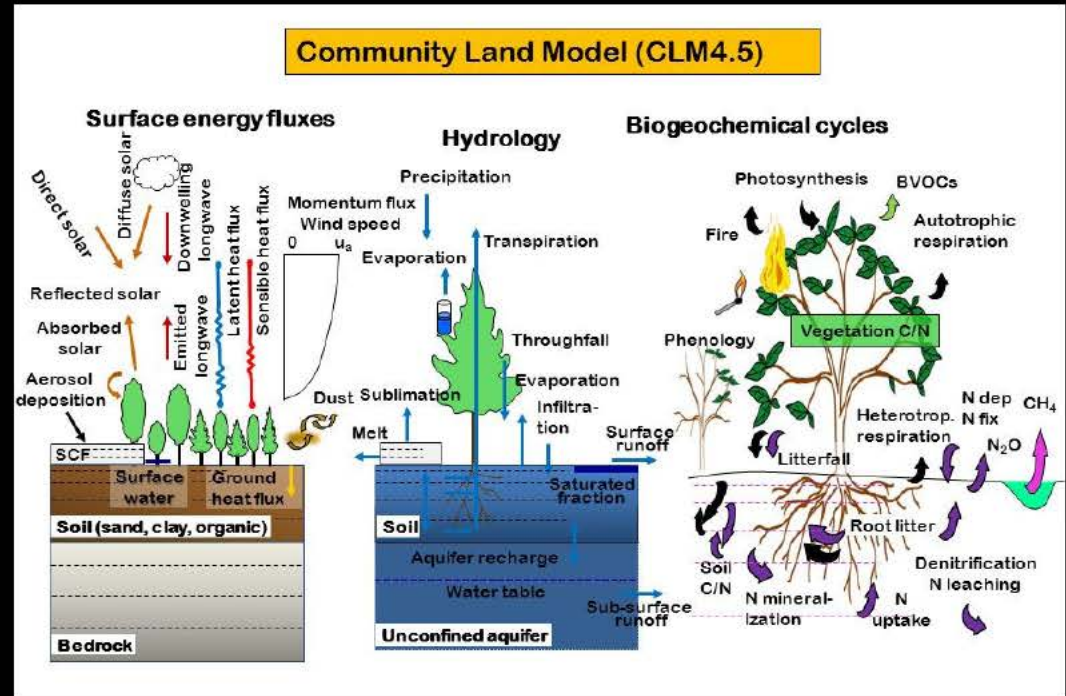
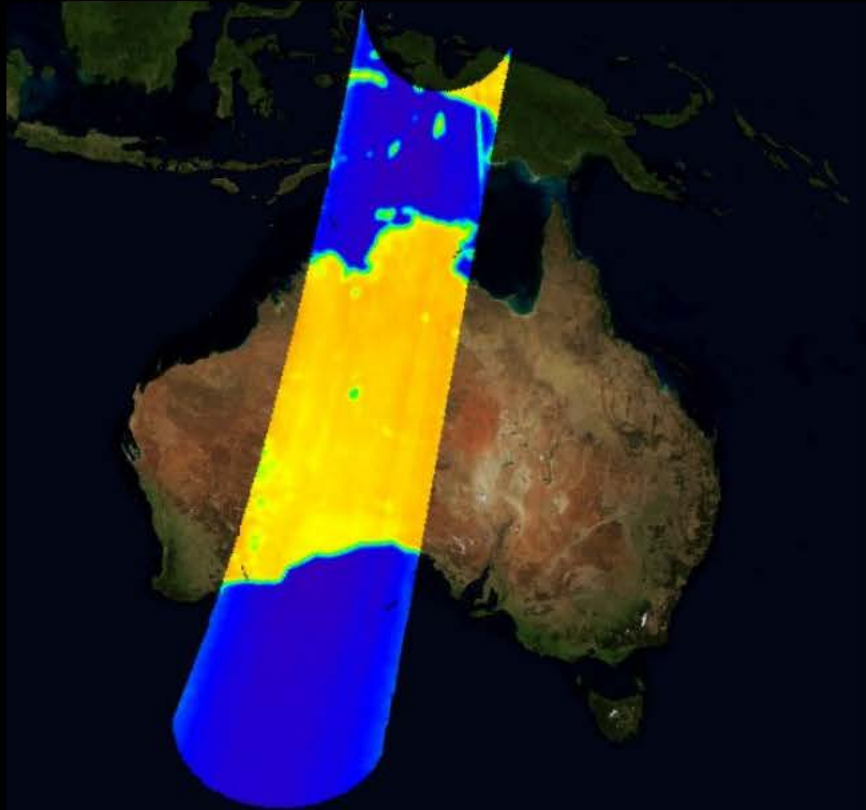
- complex and require ancillary data (vegetation, temperature etc..)
- limited to space and time of satellite overpass
- often don't come with uncertainties

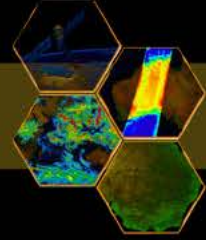
- Continuous data required for robust statistics (probabilities)
- Information on uncertainty useful
- forecasts should be possible



Methodology

Assimilation of Level 1 observations into land surface models





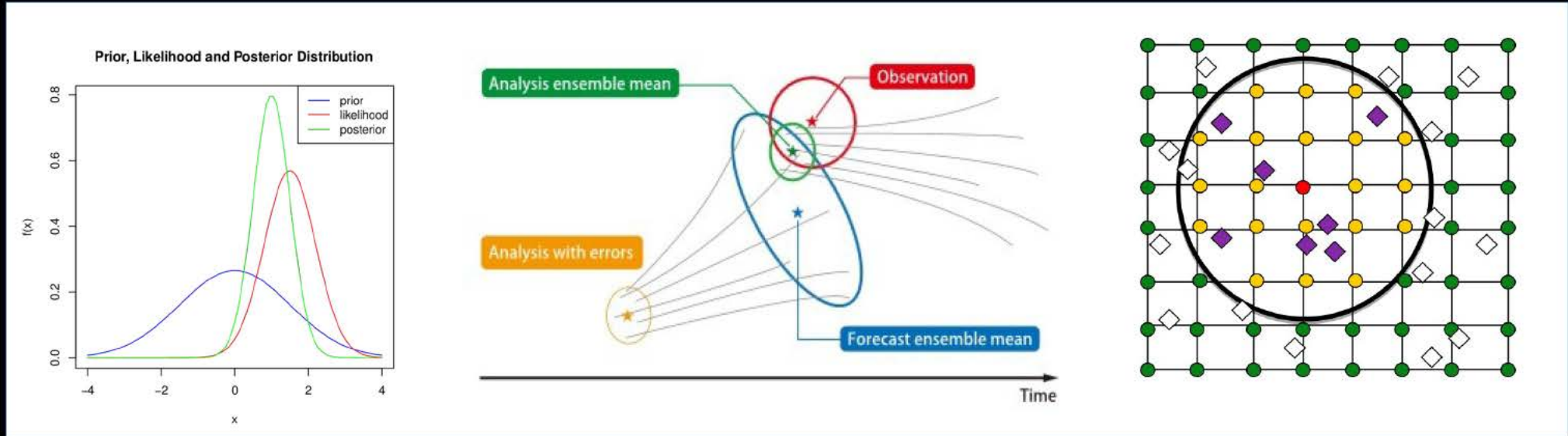
Methodology

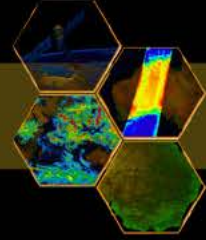
Data assimilation tackles some important issues ...

1. Uncertainty of observation and model is taken into account

2. Because model is used data is spatially and temporally continuous

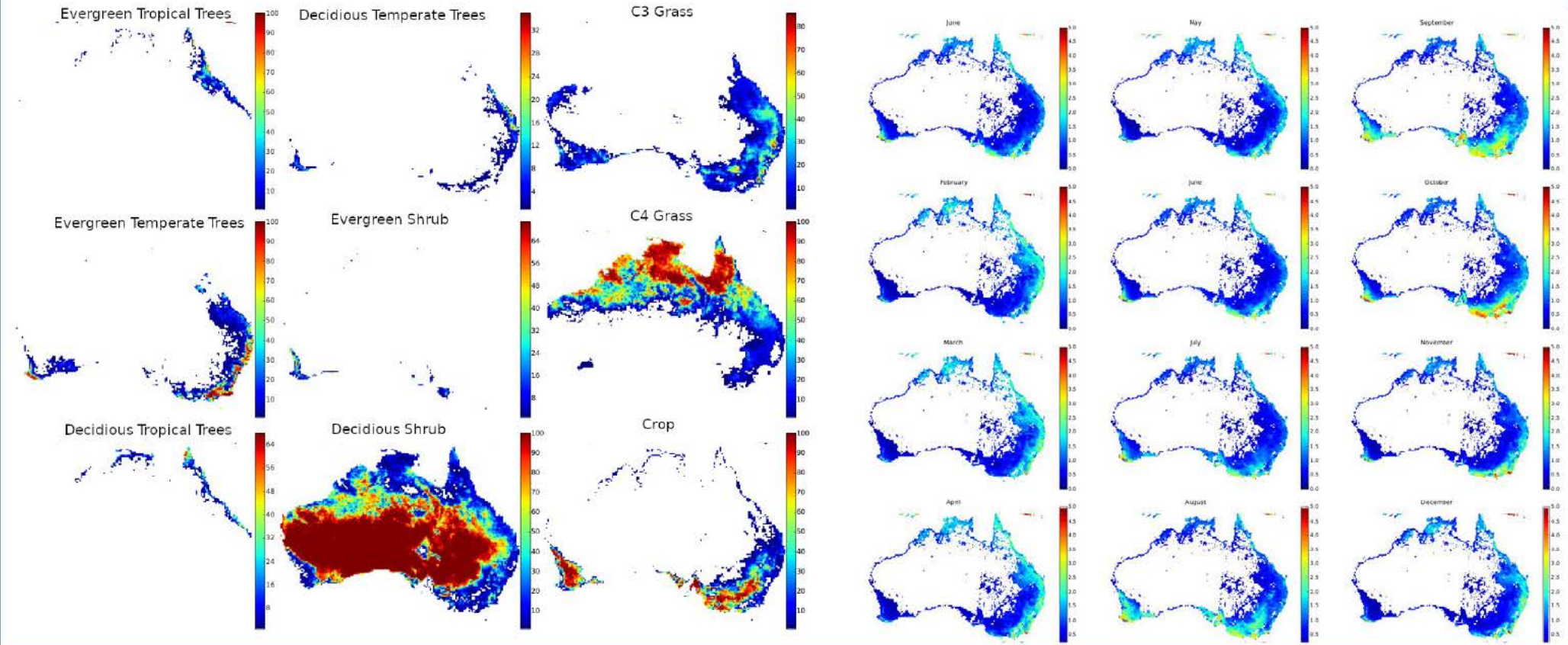
3. Multiple observations can be used to update model making analysis more robust, gaps can be filled

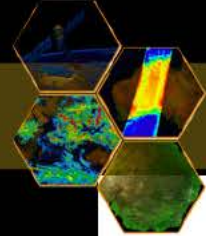




Methodology

Land surface requires precise description

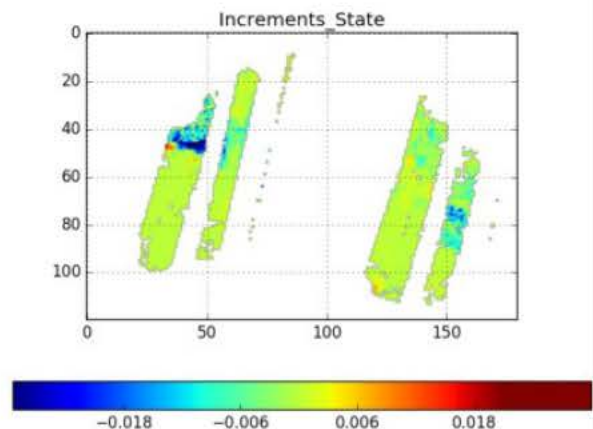
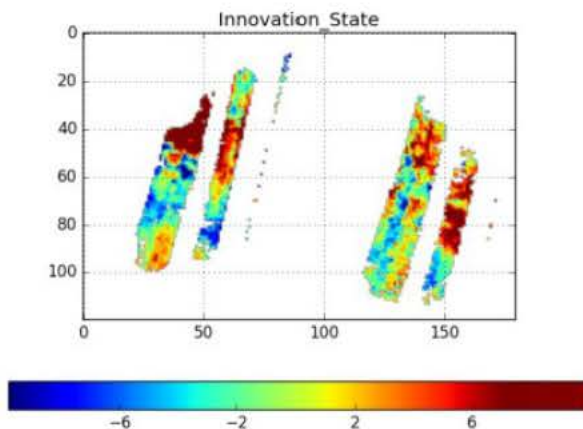
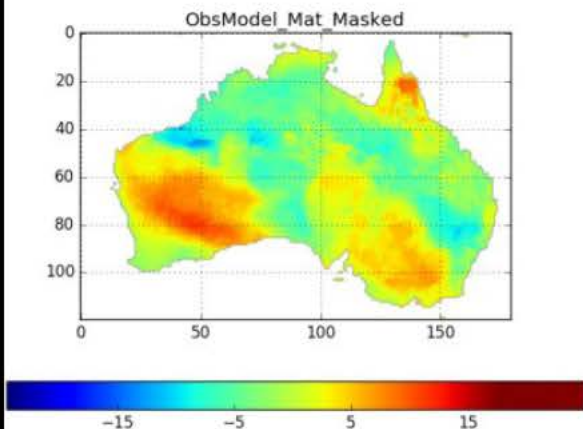
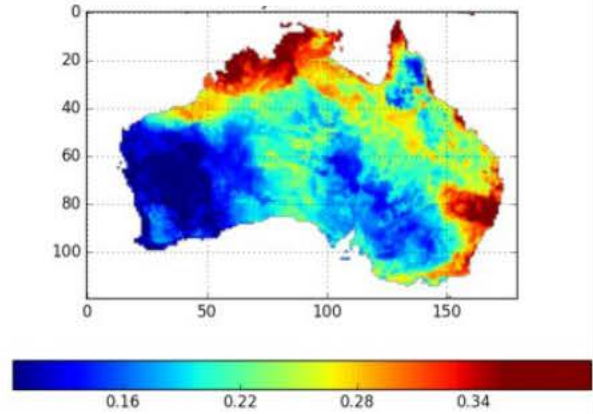
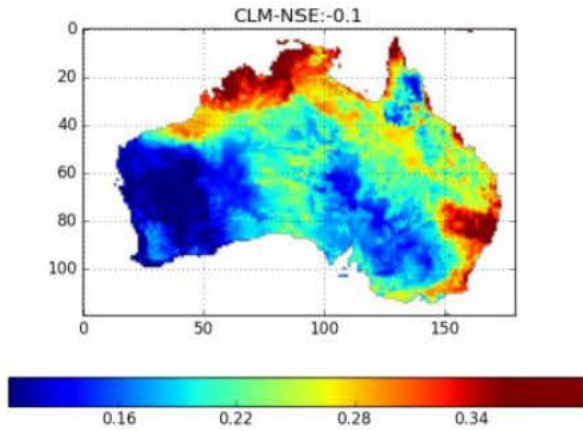
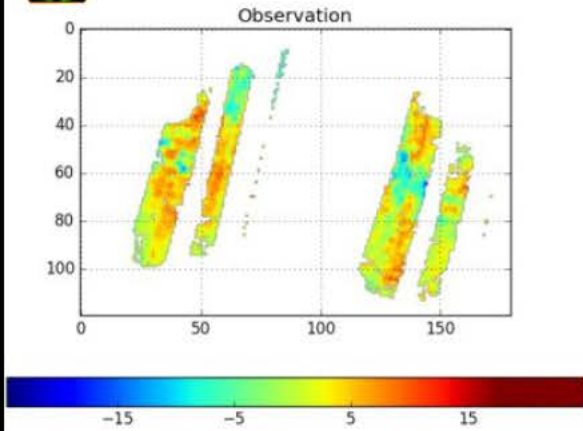


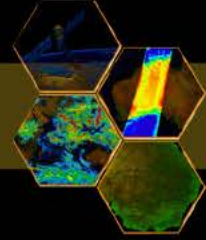


Methodology

Soil Moisture-2010-01-15-08

Rains et al., 2017, 2018

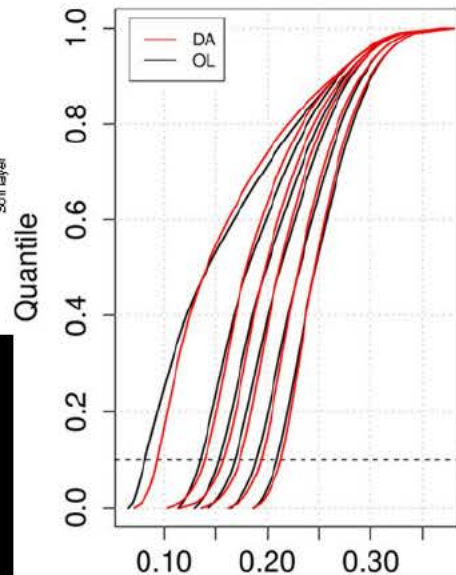
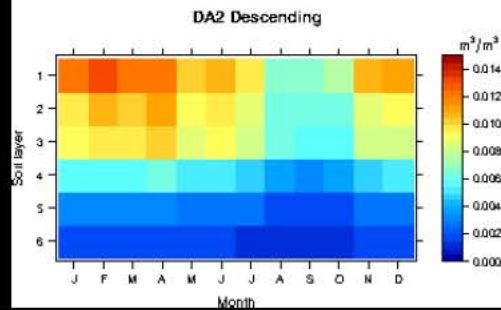
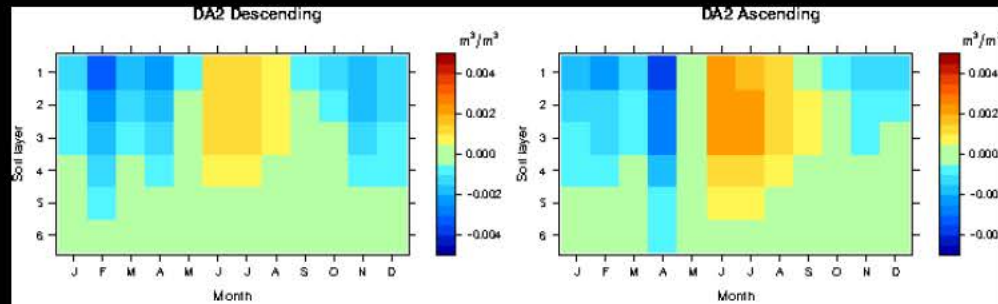




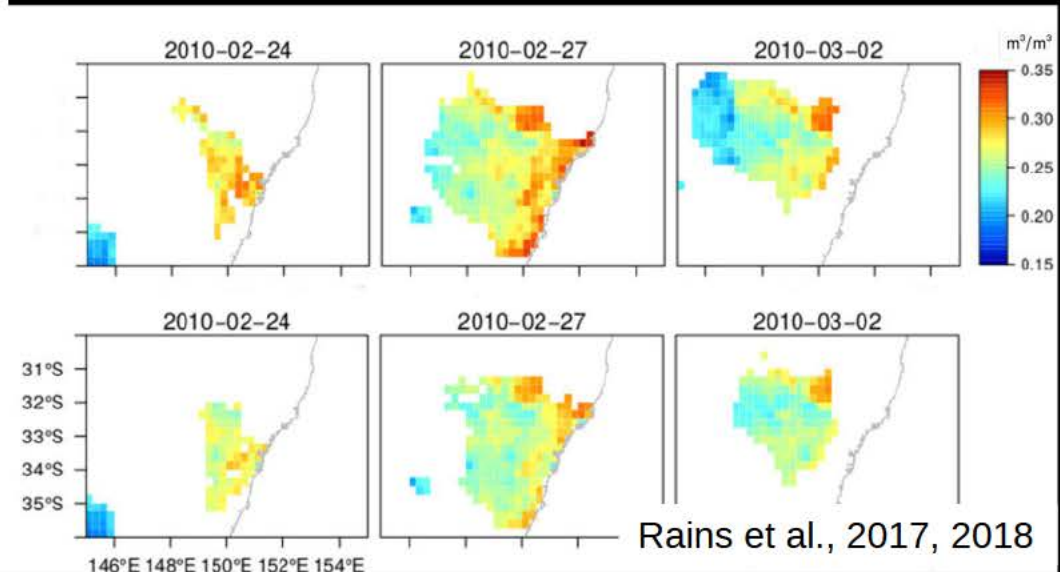
Results



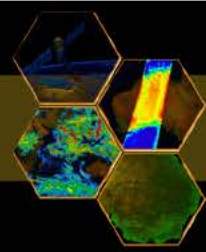
Long-term assimilation of SMOS brightness temperatures into CLM over Australia



Long-term effects on soil moisture quantiles and root-zone soil moisture relevant for monitoring applications



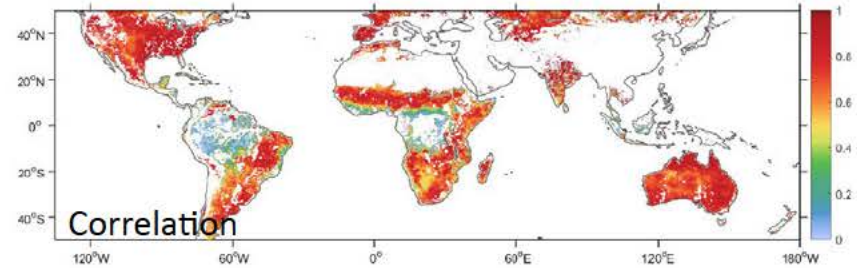
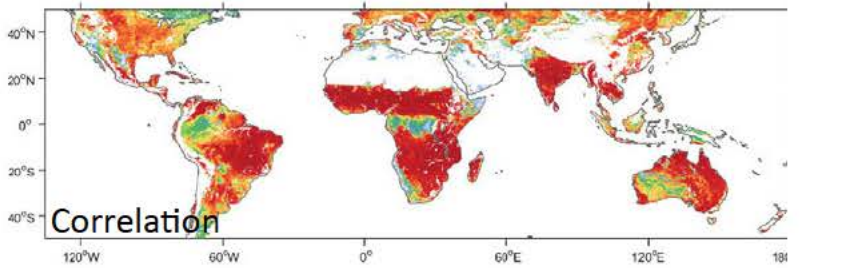
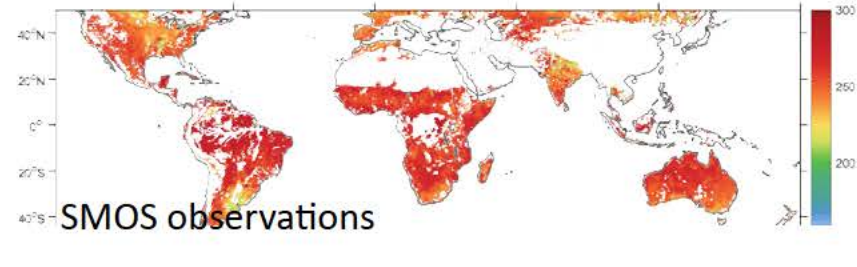
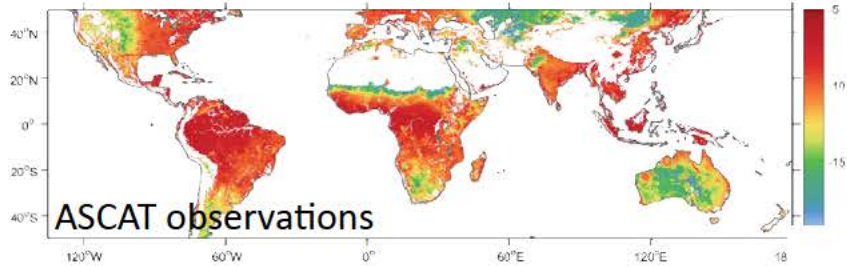
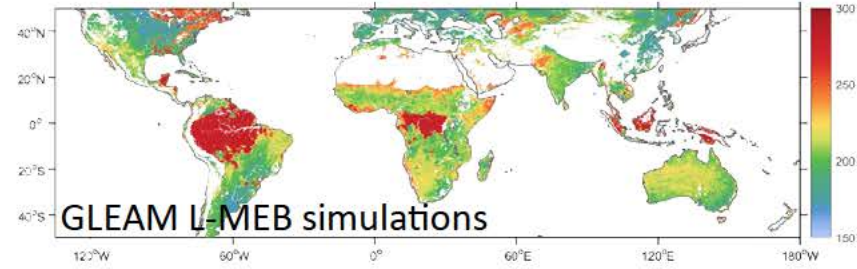
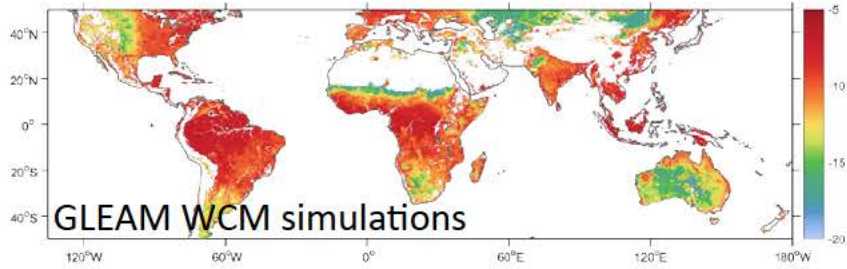
Rains et al., 2017, 2018

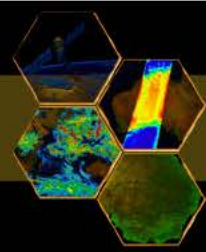


Results

Simultaneous assimilation of ASCAT and SMOS into GLEAM

Lievens et al., 2017



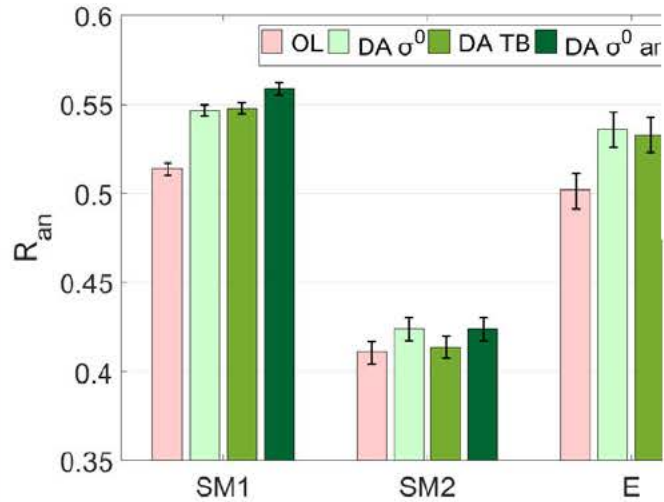


Results

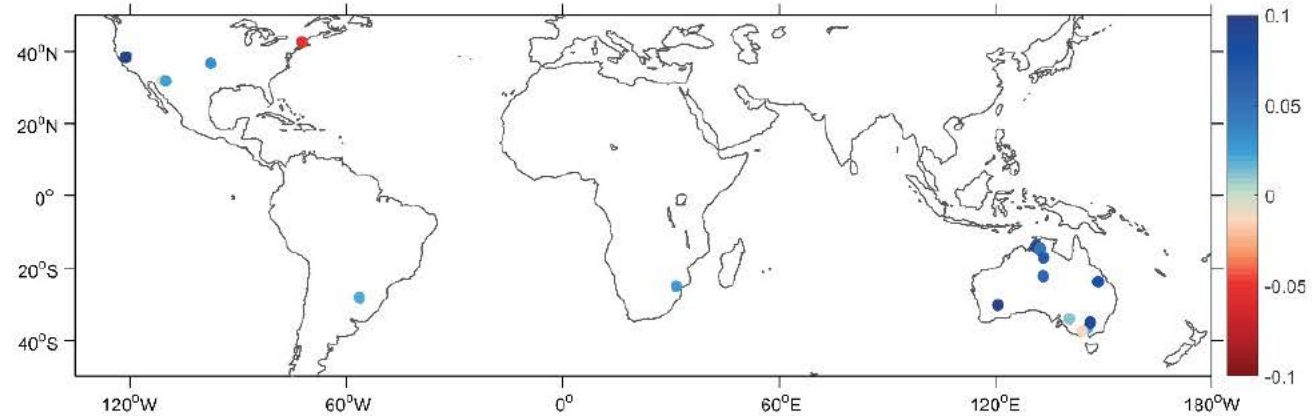
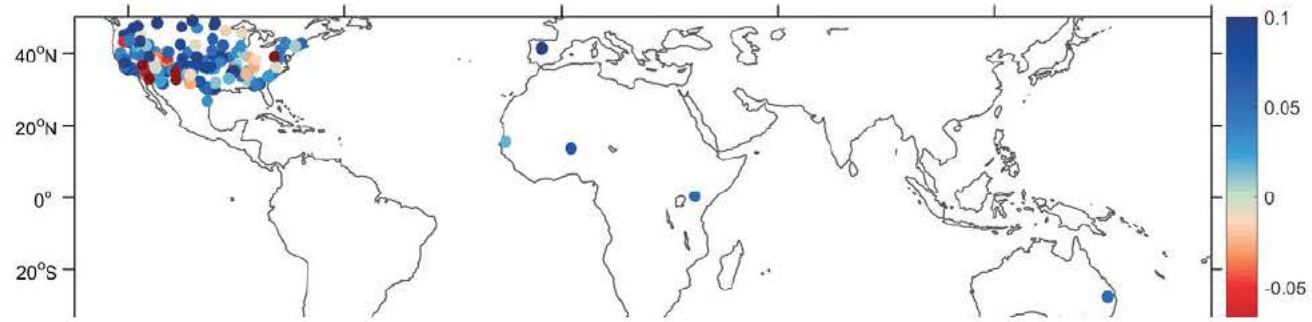


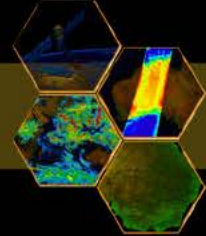
Simultaneous assimilation of ASCAT and SMOS into CLEAM

Added value of assimilating two types of observations:
brightness temperatures and backscatter



Lievens et al., 2017





Results

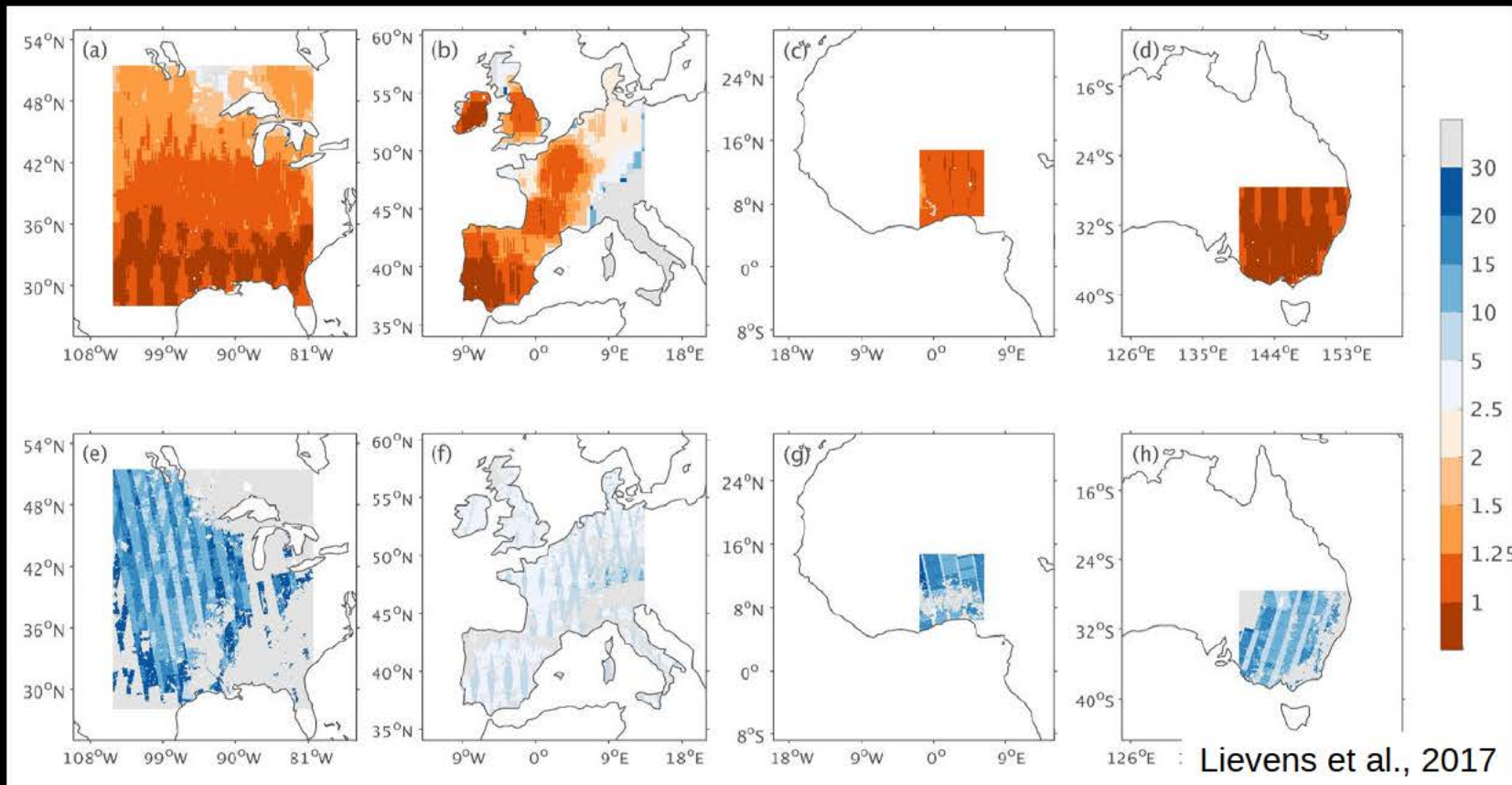


Simultaneous assimilation of Sentinel 1 and SMAP into CLSM

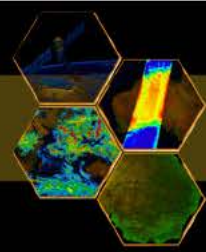
Number of observations

SMAP TB

Sentinel-1 σ^0



Lievens et al., 2017



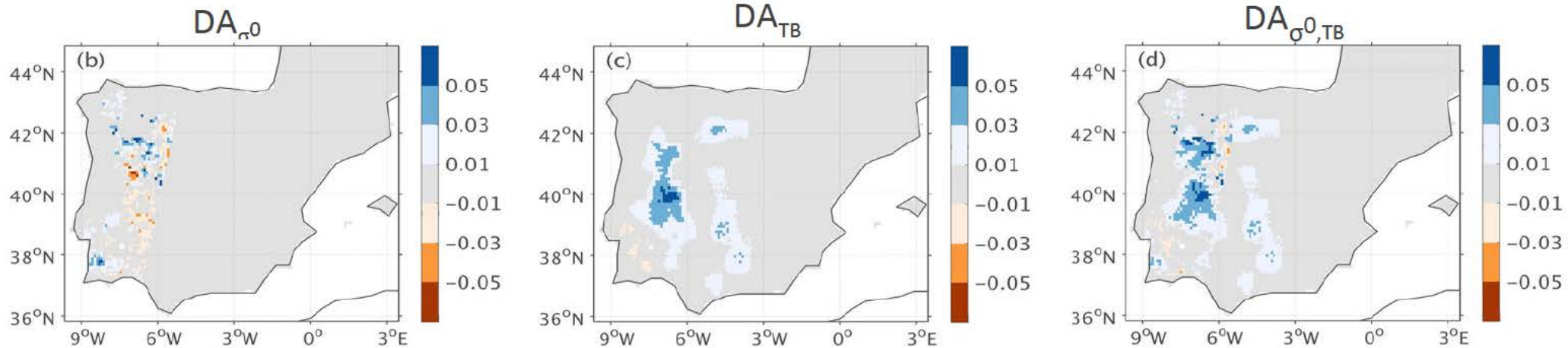
Results

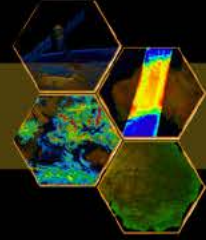
Simultaneous assimilation of Sentinel 1 and SMAP into CLSM

DA_{σ_0} in 1D has more spatial detail (local hydrologic conditions)

DA_{TB} in 3D is smoother and extra/interpolated over unobserved grid cells

$DA_{\sigma_0, TB}$ in 1D & 3D combines assets of both



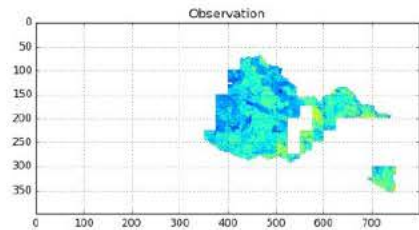


Results

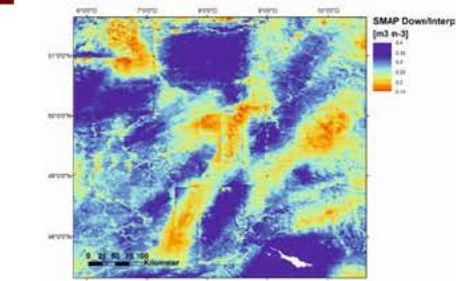
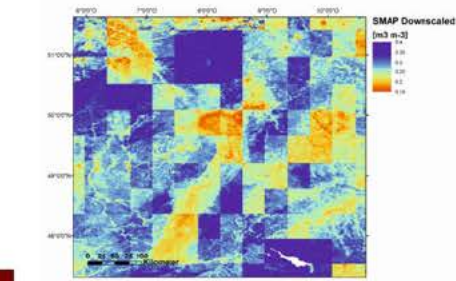
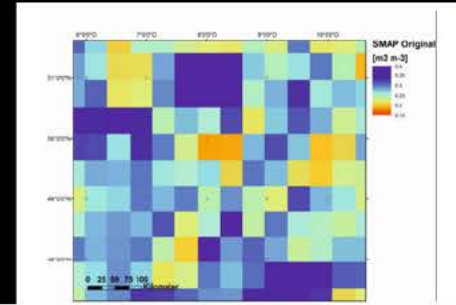
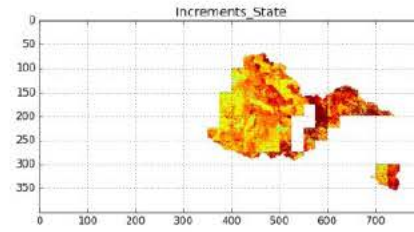
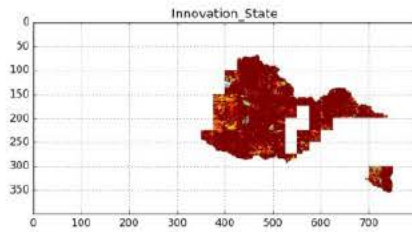
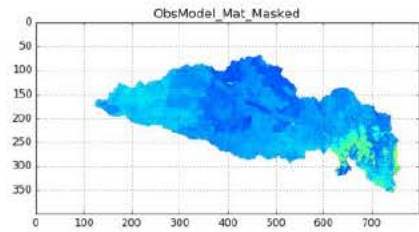
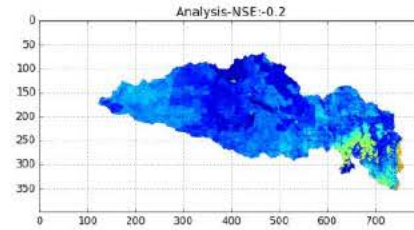
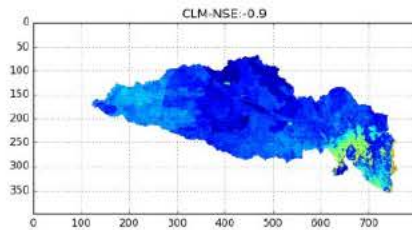
Downscaling of coarse-scale observations

Coarse-scale observations are downscaled using fine resolution information from land surface model, e.g. either soil moisture or simulated brightness temperatures

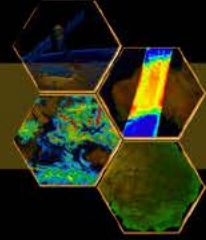
→ downscaled observations can then be assimilated



Soil Moisture-2014-01-01-08



Montzka et al., 2018

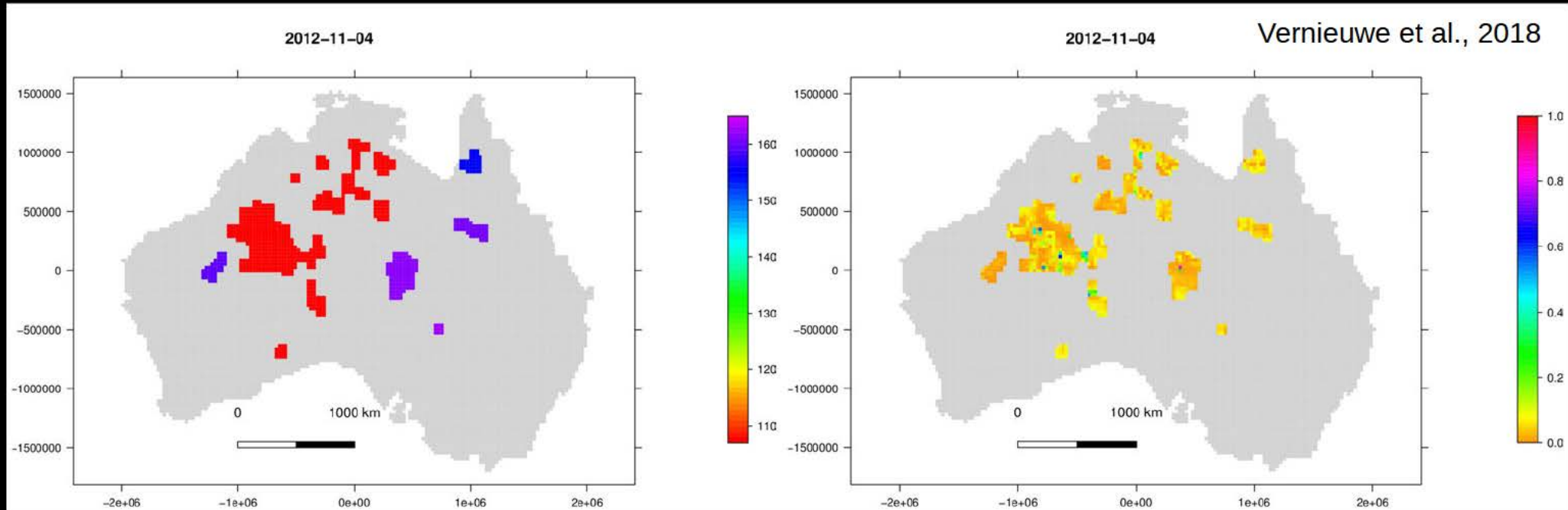


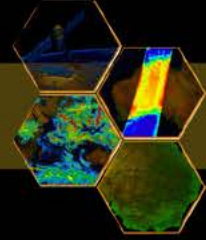
Results



Drought clustering and classification with Copula approach

Droughts, such as defined at a specific quantile level, can be tracked over space and time.
→ Classification using intensity, duration and spatial extent.

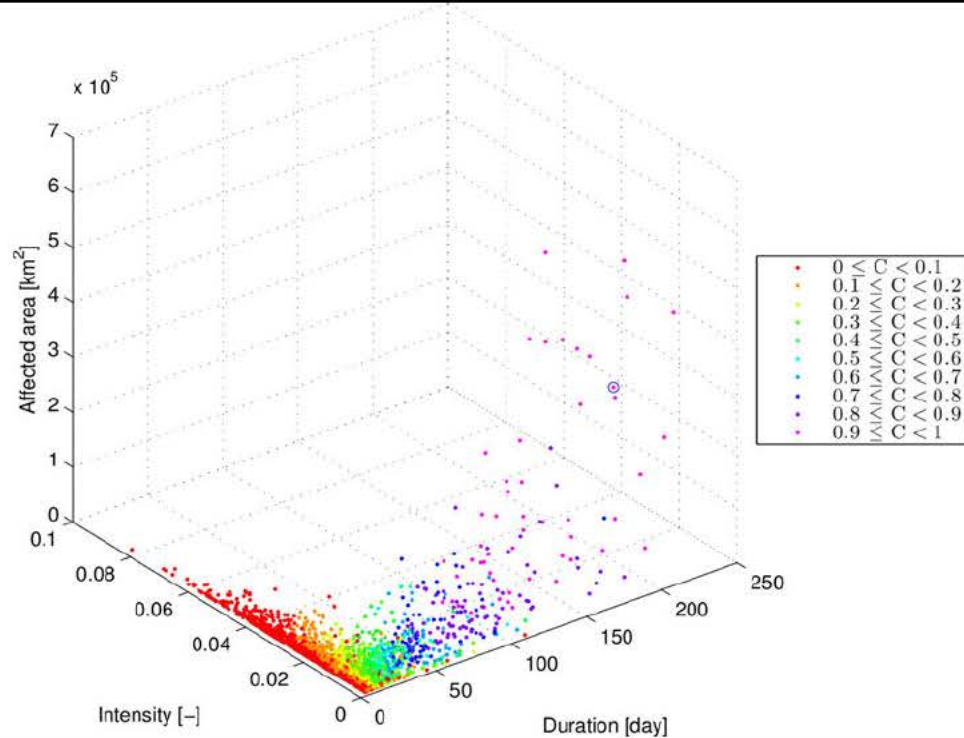




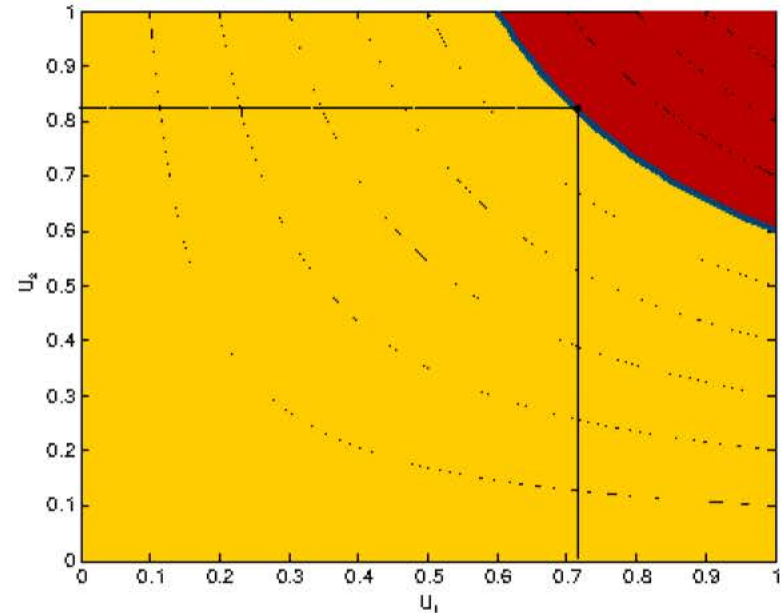
Results

Drought clustering and classification with Copula approach

Different applications possible, such as computing the likelihood of a super-critical event.



Vernieuwe et al., 2018



Publications:

- Baghdadi N., Choker M., El-hajj M., Paloscia S., Verhoest N.E.C., Lievens H., Baup F., Mattia F., Zribi M., A new empirical model for radar scattering from bare soil surfaces, *Remote Sensing*, 8(11), 920, 2016.
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- Lievens H., Al Bitar A., Verhoest N.E.C., Cabot F., De Lannoy G.J.M., Drusch M., Dumedah G., Hendricks-Franssen H.J., Kerr Y., Kumar Tomer S., Martens B., Merlin O., Pan M., van den Berg M.J., Vereecken H., Walker J., Wood E.F., Pauwels V.R.N., Optimization of a radiative transfer forward operator for simulating SMOS brightness temperatures over the Upper Mississippi Basin, USA, *Journal of Hydrometeorology*, 16(3), 1109-1134, 2015.
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- Montzka, C., K. Rötzer, H.R. Bogena, N. Sanchez, Vereecken H., A new soil moisture downscaling approach for SMAP, SMOS and ASCAT by predicting sub-grid variability. *Remote Sensing* 10(3), 427, 2018.
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- Verhoest N.E.C., van den Berg M.J., Martens B., Lievens H., Wood E.F., Pan M., Kerr Y., Al Bitar A., Tomer S.K., Drusch M., Vernieuwe H., De Baets B., Walker J., Dumedah G., Pauwels V.R.N., Copula-based downscaling of coarse-scale soil moisture observations with implicit bias correction, *IEEE Transactions on Geoscience and Remote Sensing*, 53(6), 3507-3521, 2015

Thank you.