



# Satellite data and ISBA: Assimilation

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Jean-Christophe Calvet

*with contributions from Clément Albergel, Alina Barbu, Hélène Dewaele,  
Delphine Leroux, Marie Parrens*

A TRIBUTE TO JOEL NOILHAN, Toulouse, 22 March 2019

# Why land data assimilation?

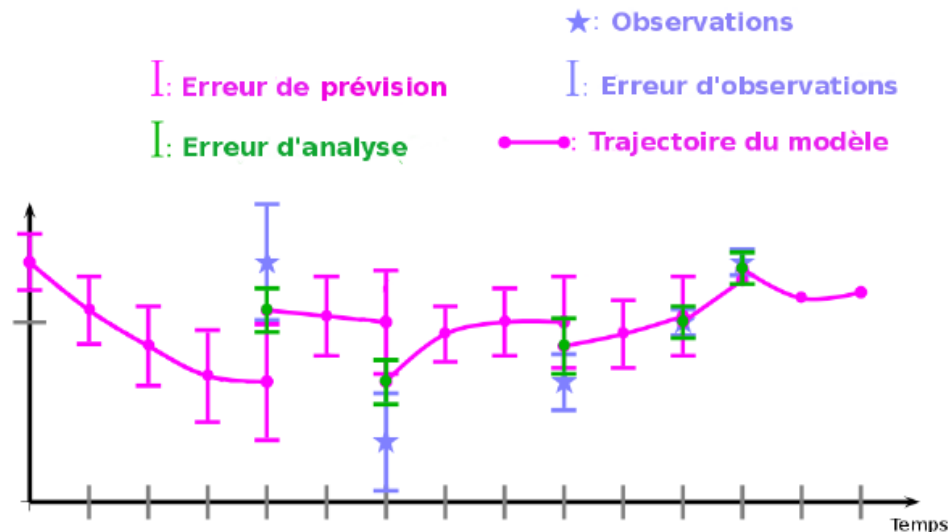
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- Land surface models are not perfect !
  - Lack of knowledge: assumptions / simplifications
  - Uncertainties in forcings (e.g. atmospheric variables)
  - Uncertainties in model parameter values
  - Uncertainties in initial conditions
- Integrating observations into models can enhance realism of simulations
- Current values of key land surface variables can impact future surface states
  - Root-zone soil moisture
  - Vegetation leaf biomass
- Analyzing these variables is needed to forecast land surface variables
  - Satellite remote sensing can be used

# Why land data assimilation?

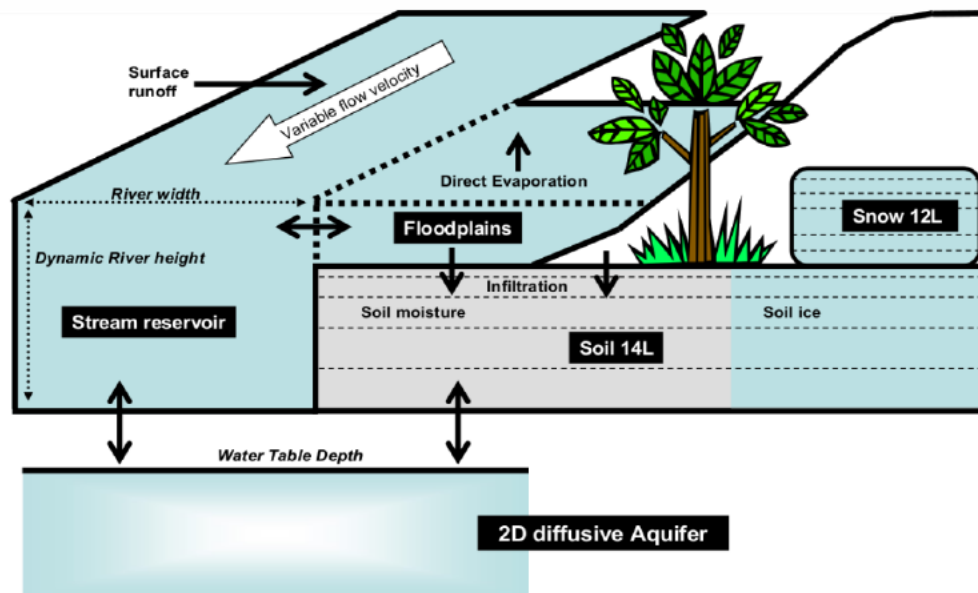
## Sequential assimilation

- **Model trajectory is driven by observations**  
e.g. Kalman Filtering approach
- **More suited to monitoring applications than model calibration**
  - **permits a better monitoring of unusual / extreme / poorly modeled events**
  - all kinds of errors can be accounted for
  - near real-time operation is possible
  - key parameters can be efficiently tuned by minimizing analysis increments



# LDAS-Monde: a European global LDAS

- Integration of satellite observations into the ISBA model
- Fully coupled to hydrology within SURFEX



- **ISBA**: simulates the diurnal cycle of water and carbon fluxes, plant growth and key vegetation variables on a daily basis (Calvet et al., 1998, 2007, Gibelin et al., 2006)

- **CTRIP**: TRIP based river routing system with CNRM developments for global hydrological applications (Oki and Sud, 1998, Decharme et al., 2008, 2010)

ISBA to CTRIP:

*runoff, drainage, groundwater and floodplain recharges*

CTRIP to ISBA:

*water table depth/rise, floodplain fraction, flood potential infiltration*

# LDAS-Monde: a European global LDAS

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- **Sequential assimilation of vegetation products**

Thanks to flexible LAI simulated by the ISBA model

**Photosynthesis-driven phenology, no GDD phenology sub-model**

- **Joint assimilation of LAI and surface soil moisture**

<http://land.copernicus.eu/global>

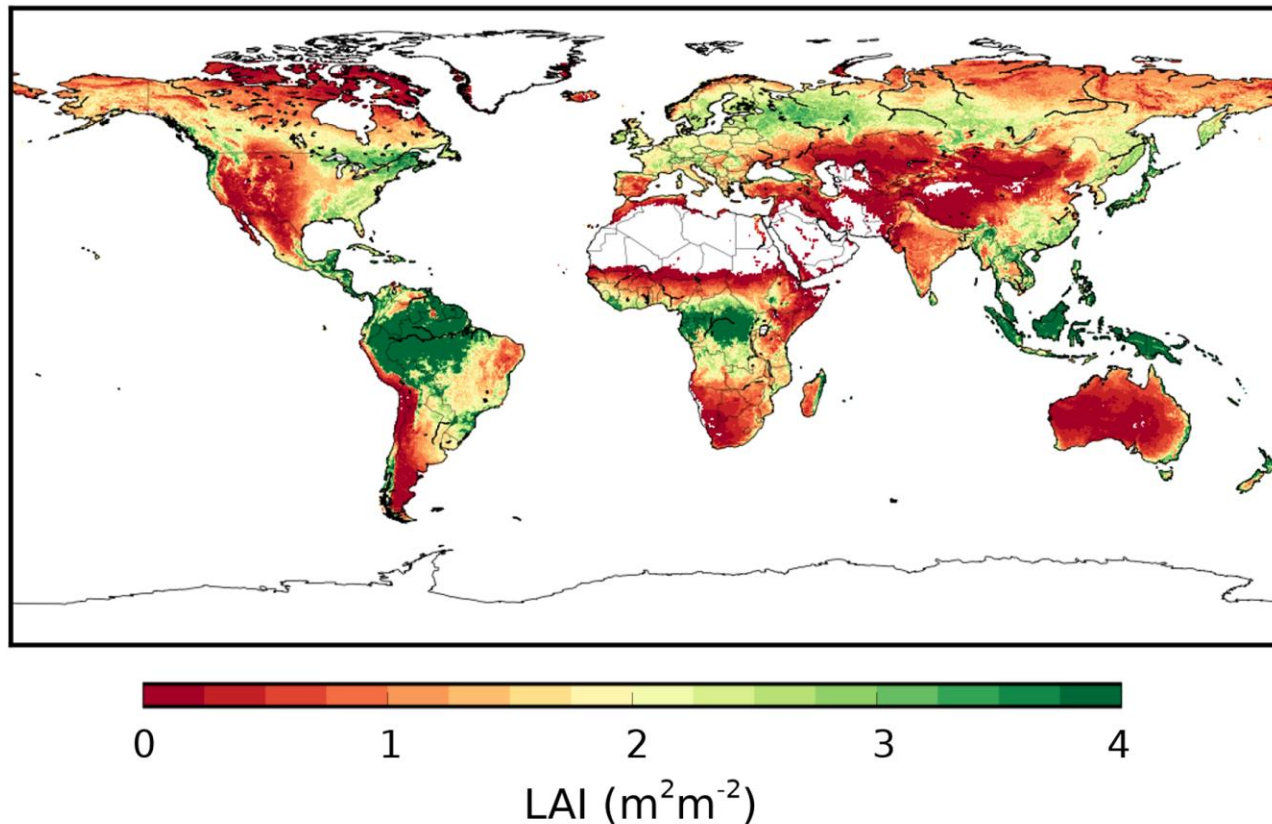
- **Disaggregation of satellite-derived LAI (Munier et al. Remote Sensing 2018)**

Kalman filter based on SURFEX static proxy  
(ECOCLIMAP, Faroux et al. GMD 2013)

# LDAS-Monde: a European global LDAS

- Leaf Area Index (2010-2018): observations

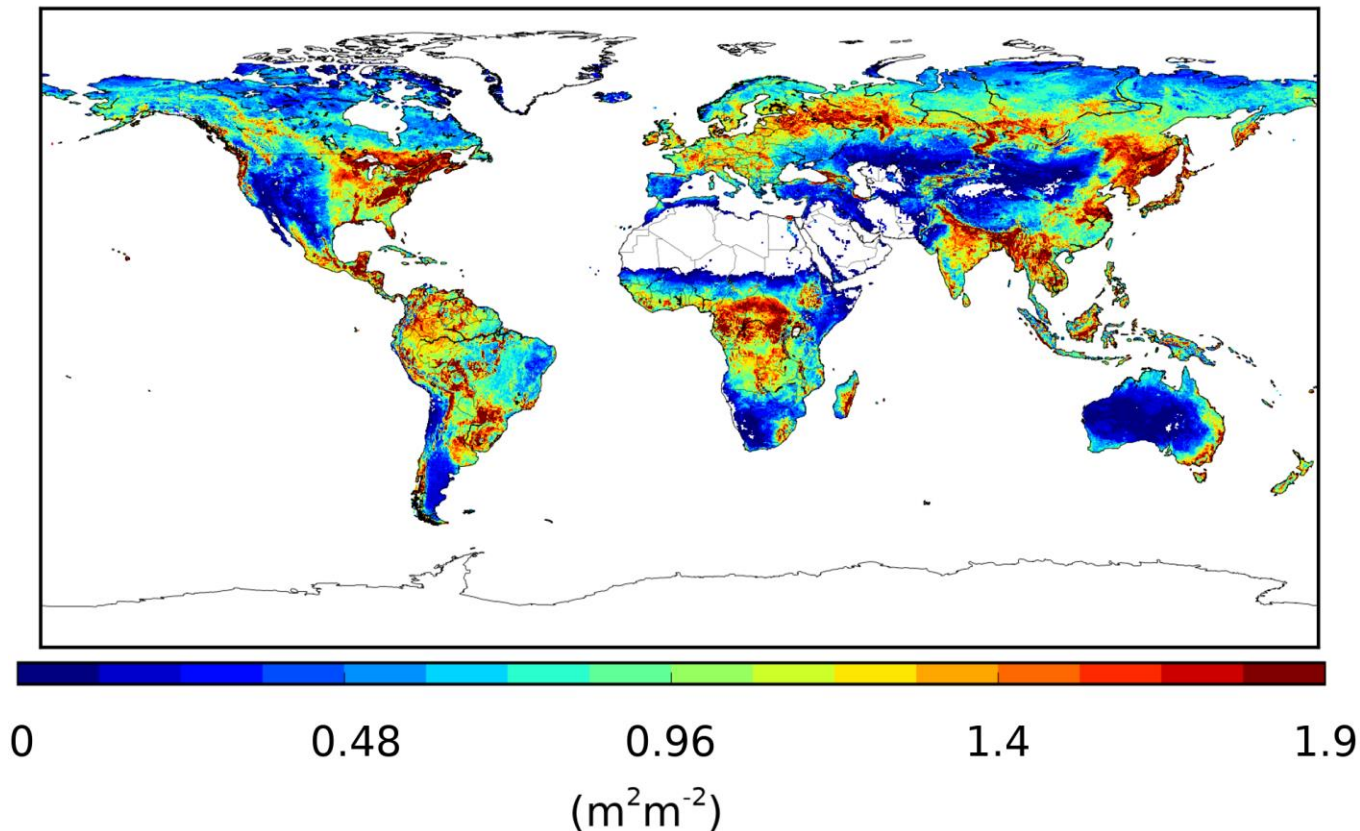
LAI CGLS GEOV1



# LDAS-Monde: a European global LDAS

- Leaf Area Index (2010-2018): simulations vs. observations

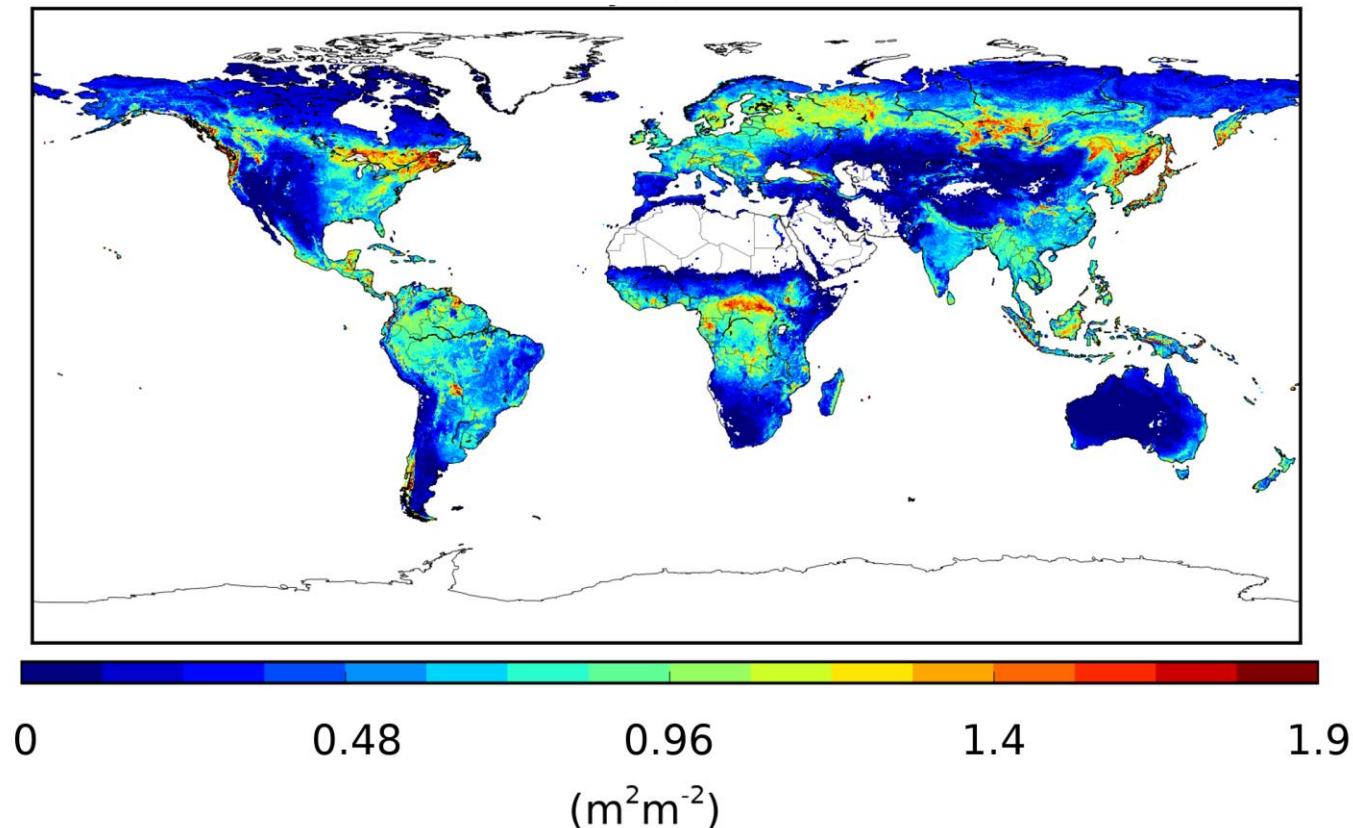
RMSD: Model vs Obs.



# LDAS-Monde: a European global LDAS

- Leaf Area Index (2010-2018): analysis vs. observations

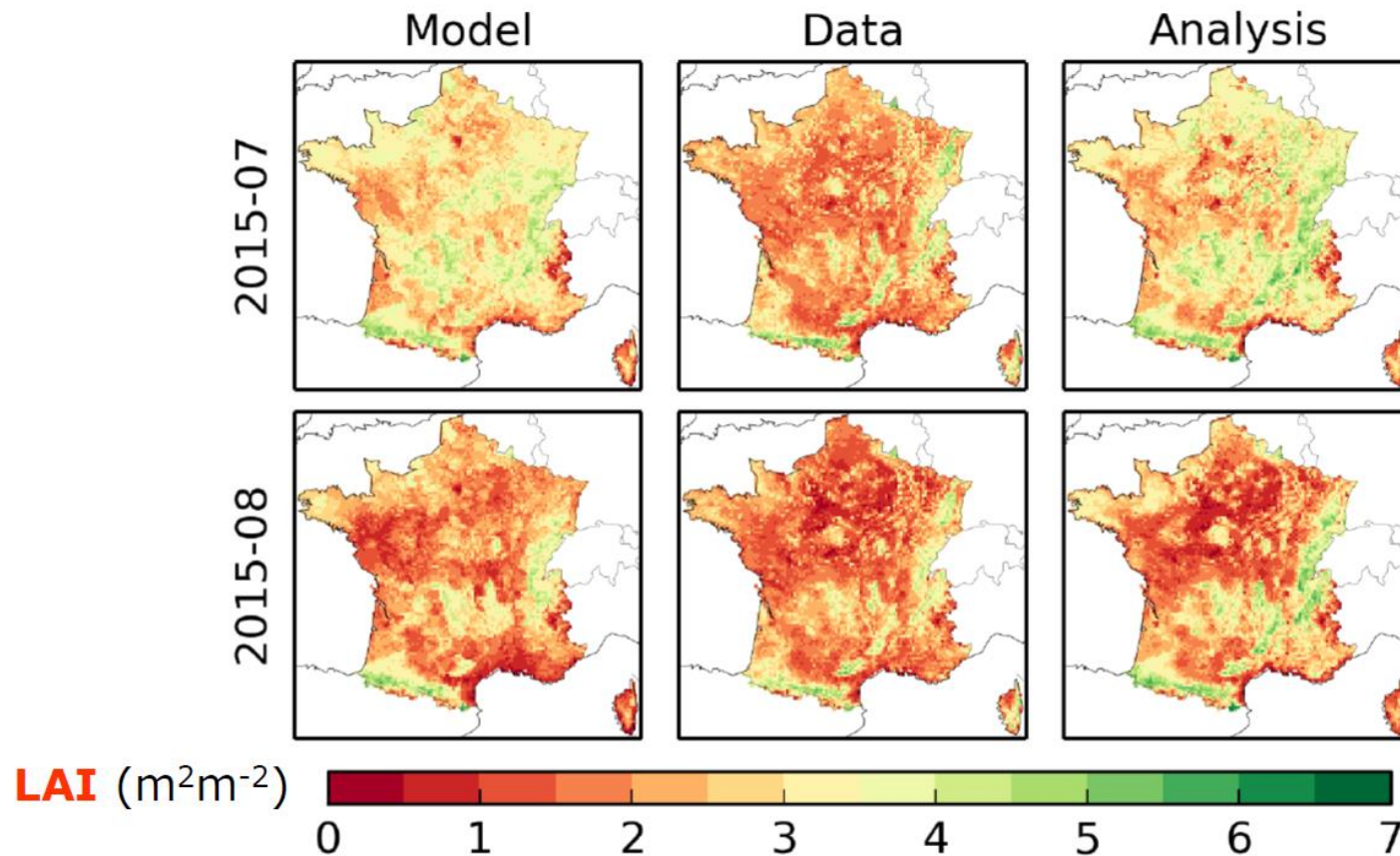
RMSD: Analysis vs Obs.





# LDAS-Monde: a European global LDAS

- Incorporation of geographic information into land surface models
- Example: France



# LDAS-Monde: a long heritage of research

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- **1989-1993: assimilation of T2m, HU2m in NWP models**
- **1995-2005: soil moisture field campaigns (MUREX, SMOSREX)**
- **1998: ISBA-A-gs (Calvet, Noilhan, et al. 1998)**
- **2004-2017: PhD theses on data assimilation**
  - 2007: Joaquin Munoz-Sabater
  - 2010: Clément Albergel
  - 2014: Marie Parrens
  - 2017: Hélène Dewaele
- **2001-2017: European projects developing data assimilation**
  - 2001-2004: FP5-ELDAS
  - 2004-2007: FP6-GEOLAND
  - 2008-2012: FP7-GEOLAND2
  - 2012-2016: FP7-IMAGINES
  - 2014-2017: FP7-earthH2Observe
- **2013-2019: used for the validation of the Copernicus Global Land service**

# Assimilation of T2m, HU2m in NWP models

## **Analysis of Soil Moisture from Near-Surface Parameters: A Feasibility Study**

**JEAN-FRANÇOIS MAHFOUF**

*Météo-France/CNRM, Toulouse Cedex, France*

(Manuscript received 6 September 1990, in final form 20 March 1991)

(**J. Applied Meteorology, 1991**)

- **Principles still in operations today**
- **Contributed to initiate research on the assimilation of land satellite remotely sensed observations**

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# MUREX soil moisture field campaign

## Retrieving the Root-Zone Soil Moisture from Surface Soil Moisture or Temperature Estimates: A Feasibility Study Based on Field Measurements

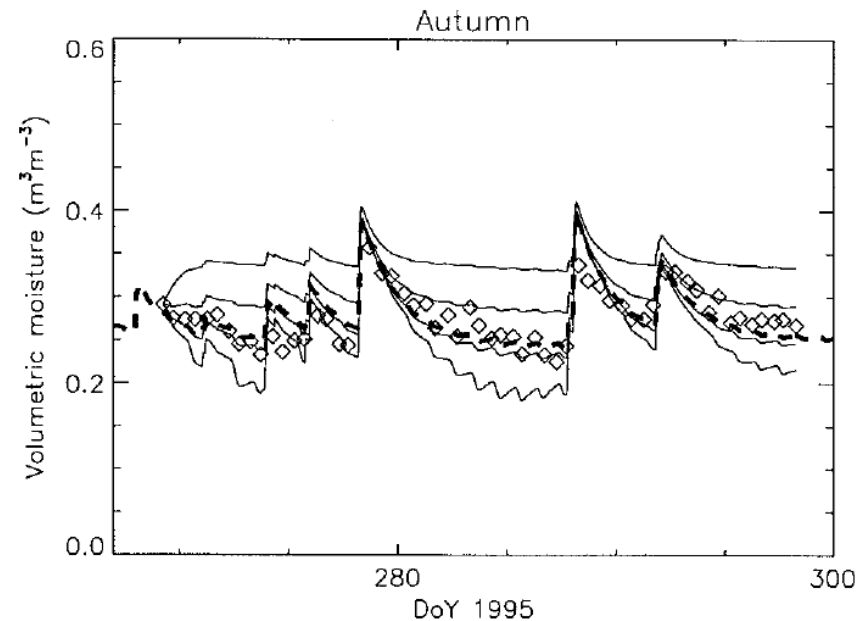
J.-C. CALVET, J. NOILHAN, AND P. BESSEMOULIN

*Météo-France/CNRM, Toulouse, France*

(Manuscript received 19 March 1997, in final form 31 July 1997)

(J. Applied Meteorology, 1998)

- « Four or five estimations of the surface soil moisture at low temporal resolution (one every 4 days for example) are enough to retrieve the total soil water content by inverting ISBA »
- Was a key argument to initiate the ESA SMOS satellite programme (launched in 2009)



# MUREX soil moisture field campaign

## From Near-Surface to Root-Zone Soil Moisture Using Year-Round Data

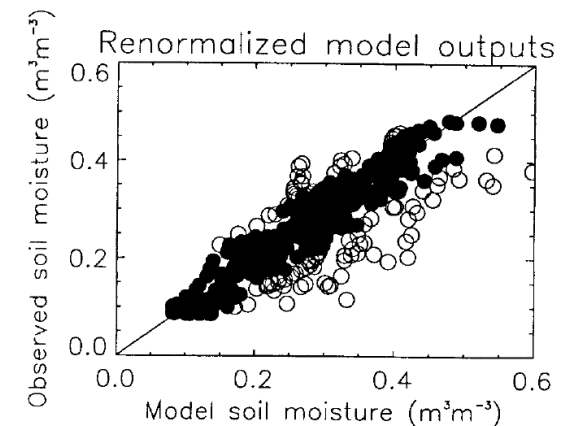
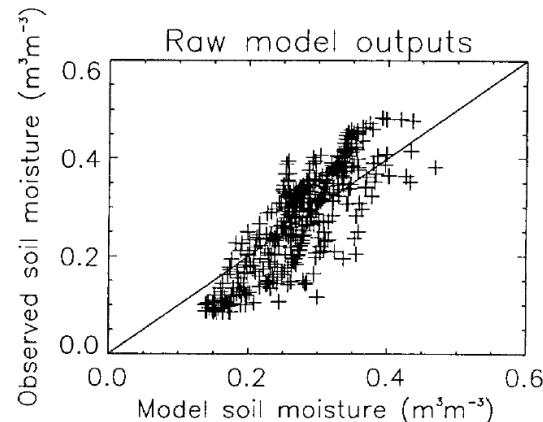
JEAN-CHRISTOPHE CALVET AND JOËL NOILHAN

*Météo-France/CNRM, Toulouse, France*

(Manuscript received 9 August 1999, in final form 15 May 2000)

(J. Hydrometeorology, 2000)

- « Renormalization method »  
to cope for model parameter errors
- A precursor of the use of CDF-matching



## An interactive vegetation SVAT model tested against data from six contrasting sites

Jean-Christophe Calvet<sup>a,\*</sup>, Joël Noilhan<sup>a</sup>, Jean-Louis Roujean<sup>a</sup>, Pierre Bessemoulin<sup>a</sup>, Maurice Cabelguenne<sup>b</sup>, Albert Olioso<sup>c</sup>, Jean-Pierre Wigneron<sup>c</sup>

<sup>a</sup> Météo-France/CNRM, 42 Av. Coriolis, F-31057 Toulouse Cedex 1, France

<sup>b</sup> INRA/Agronomie, BP27 Auzeville, F-31326 Castanet Tolosan, France

<sup>c</sup> INRA/Bioclimatologie, Agroparc, F-84914 Avignon Cedex 9, France

Received 19 December 1997; received in revised form 2 May 1998; accepted 22 May 1998

(Agric. Forest Meteorol., 1998)

- WMO NORBERT-GERBIER-MUMM award 2000
- Photosynthesis-driven phenology
- Flexible LAI
- Sequential assimilation of vegetation products is possible



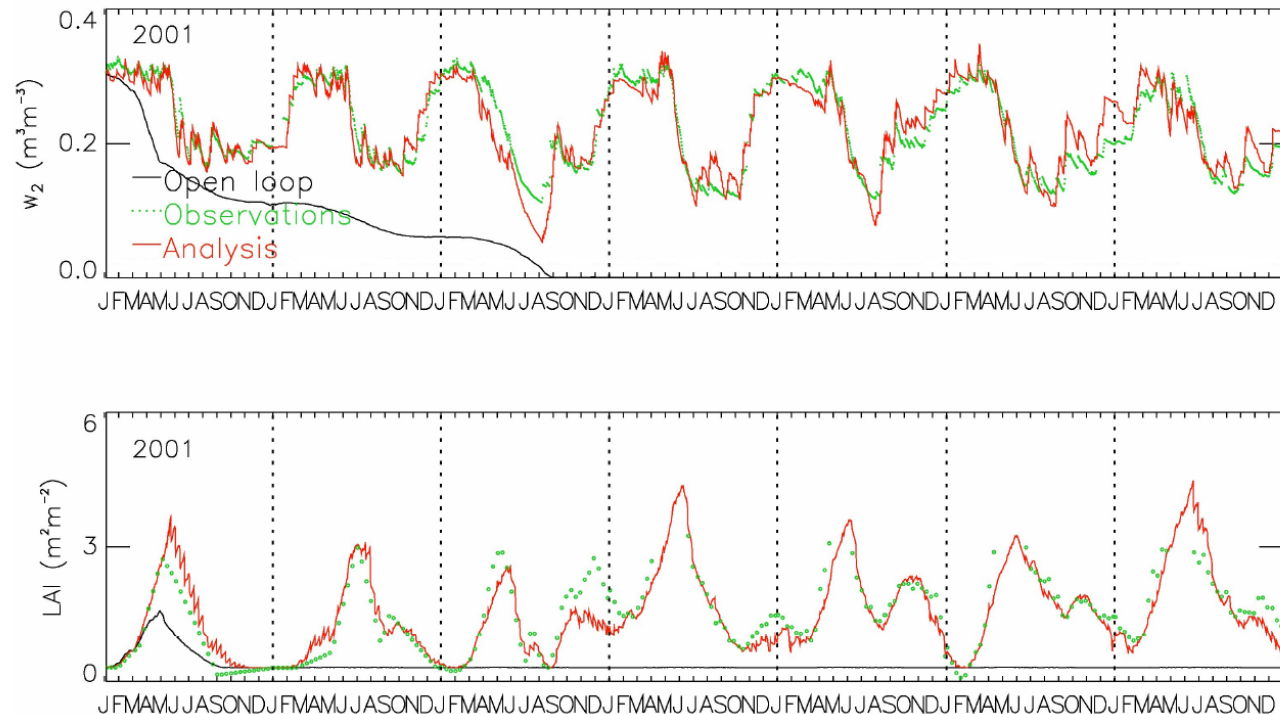
# SMOSREX soil moisture field campaign

## Monitoring of water and carbon fluxes using a land data assimilation system: a case study for southwestern France

C. Albergel<sup>1</sup>, J.-C. Calvet<sup>1</sup>, J.-F. Mahfouf<sup>1</sup>, C. Rüdiger<sup>1,\*</sup>, A. L. Barbu<sup>1</sup>, S. Lafont<sup>1</sup>, J.-L. Roujean<sup>1</sup>, J. P. Walker<sup>2,\*</sup>, M. Crapeau<sup>3,\*\*</sup>, and J.-P. Wigneron<sup>3</sup>

(Hydrol. Earth Syst. Sci., 2010)

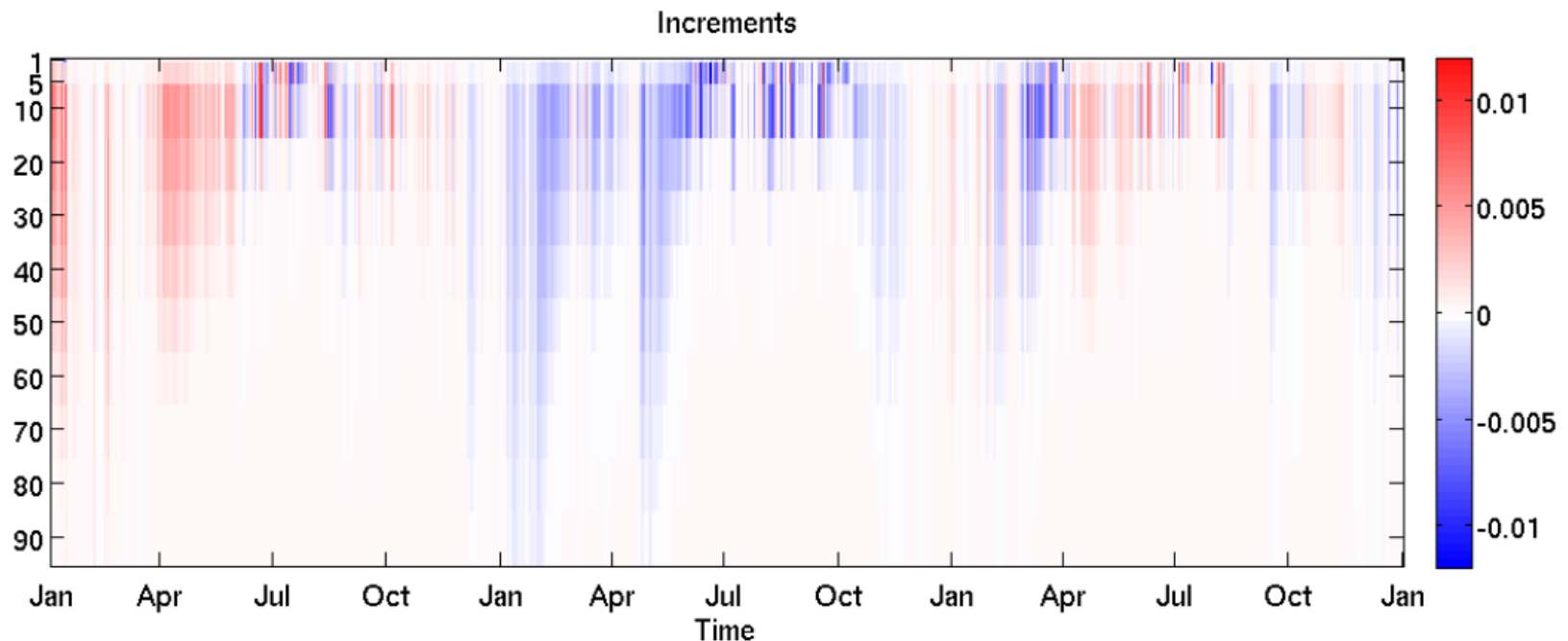
- Joint soil moisture and vegetation analysis





# SMOSREX soil moisture field campaign

- From a single root-zone soil moisture layer to multiple soil layers
  - Decoupling between surface and deep soil moisture in dry conditions

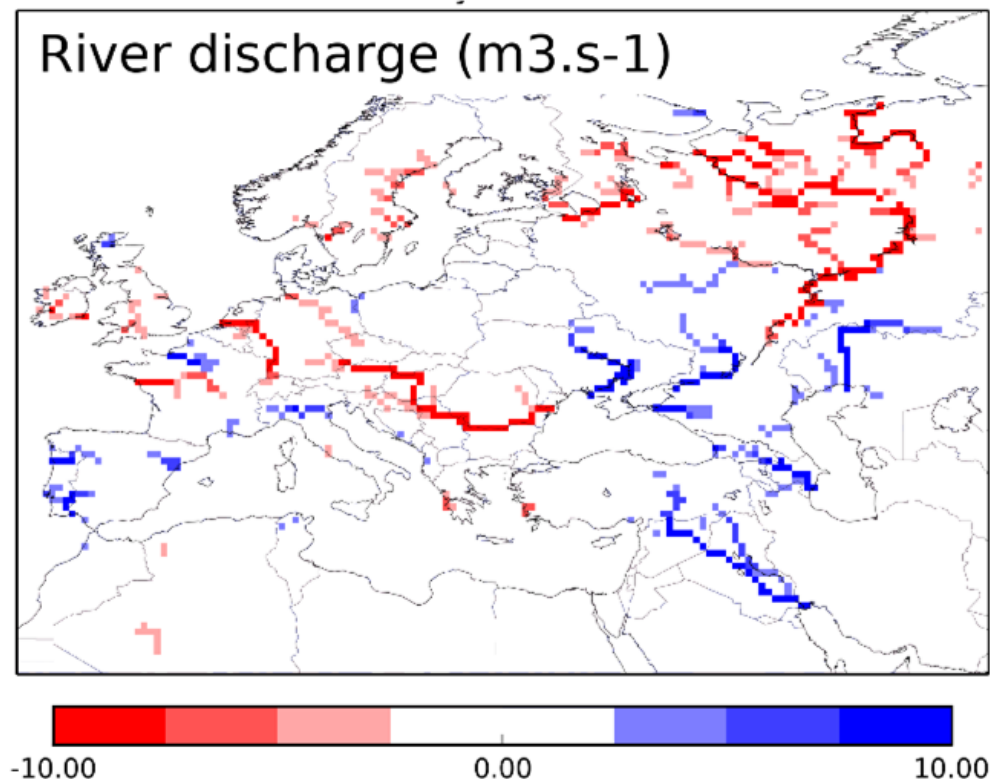


Parrens et al. HESS 2014



# Validation: hydrology

- Example: Impact of vegetation and soil moisture analysis on river discharge



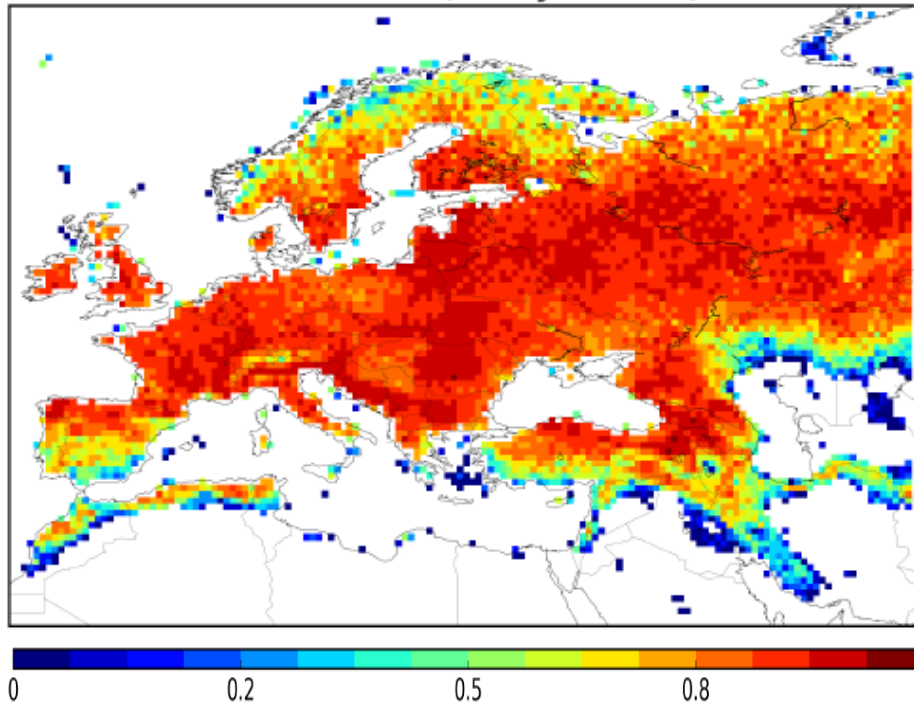
Mean analysis impact  
on river discharge  
over the  
2000-2012 period

Albergel et al. GMD 2017

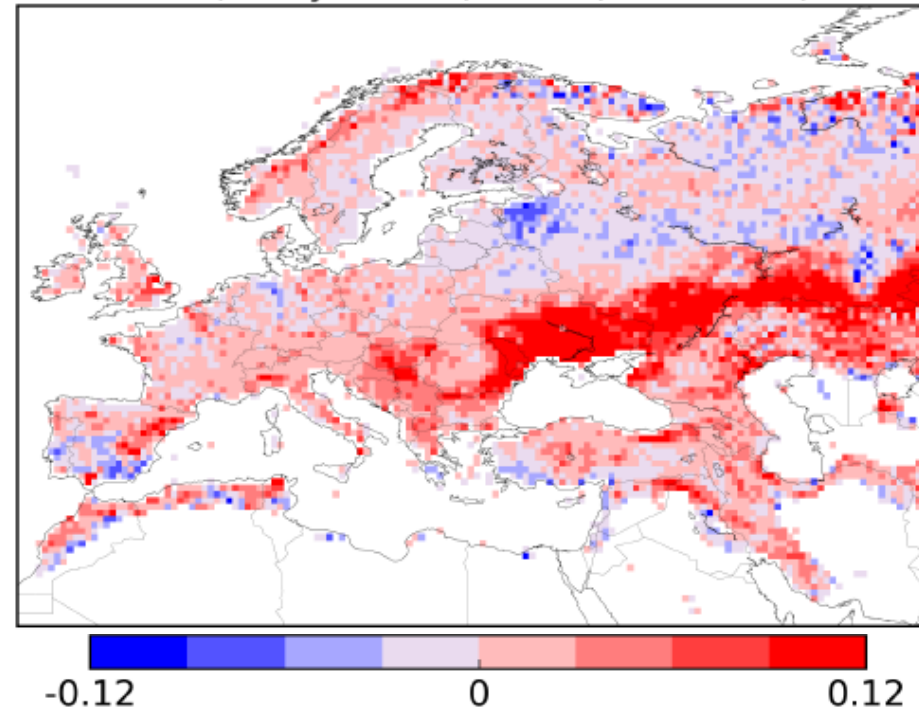
# Validation: natural CO<sub>2</sub> fluxes

- Example: GPP vs. GOME-2 SIF product (2007-2015)

Correlation (Analysis,Obs)



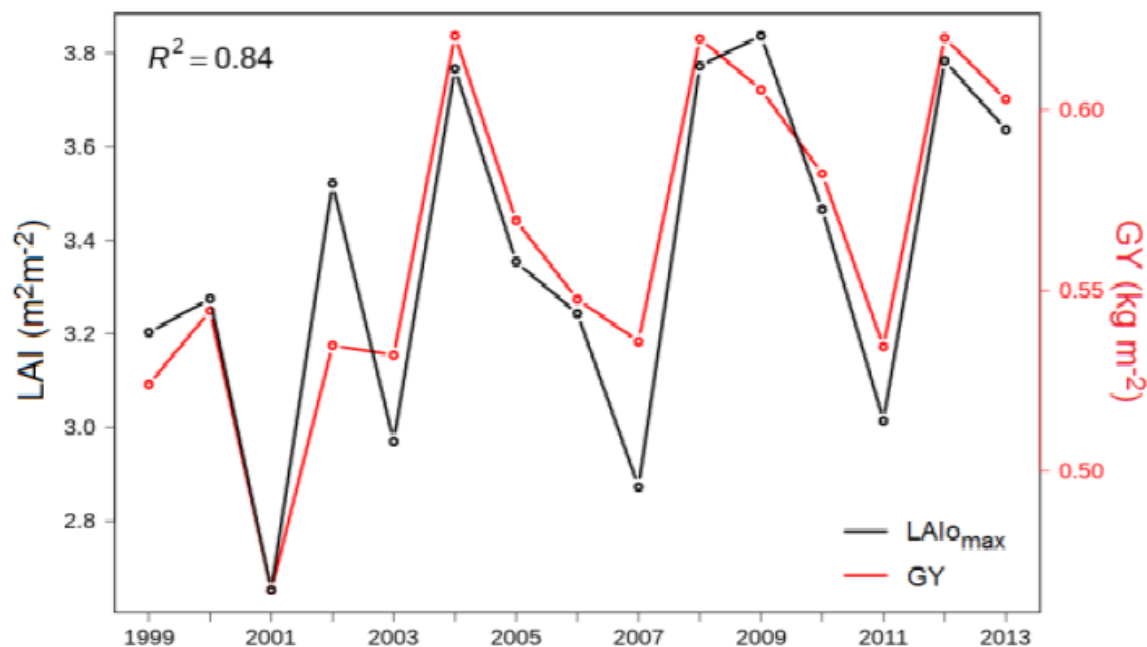
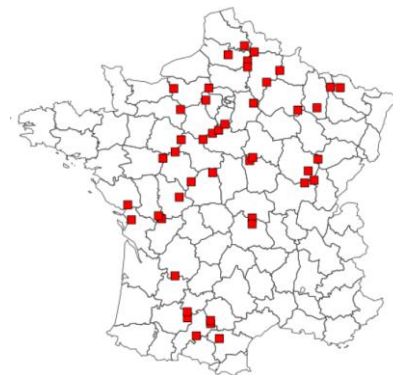
$\text{Corr}(\text{Analysis,Obs}) - \text{Corr}(\text{Model,Obs})$



Leroux et al. Remote Sensing 2018

# Validation: crop yields

- Example: wheat yields in France (1999-2013)
- Disaggregated Copernicus GLS LAI correlates with wheat yields

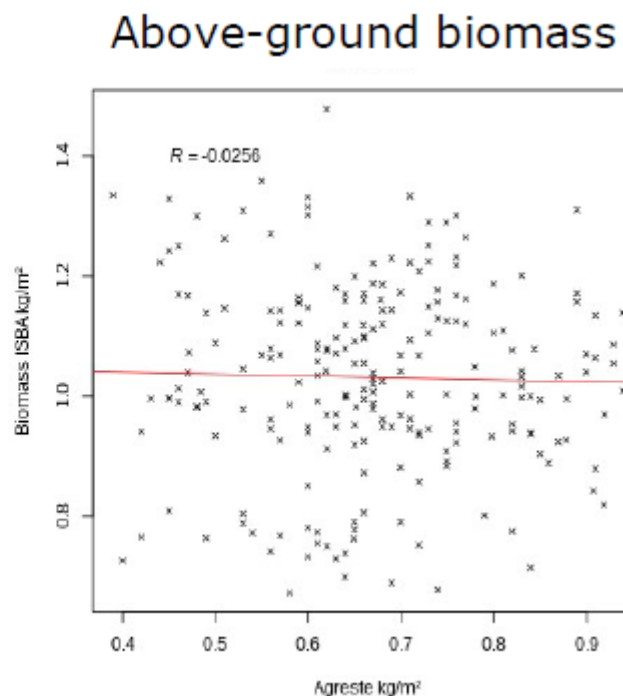
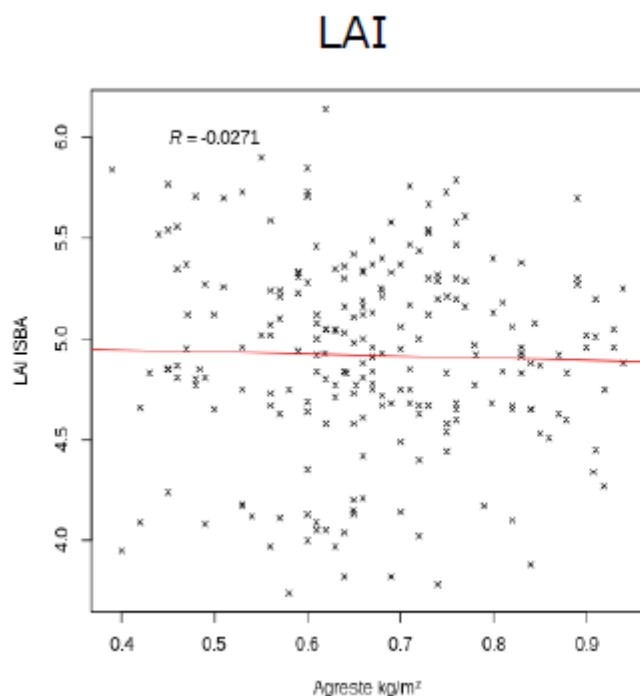
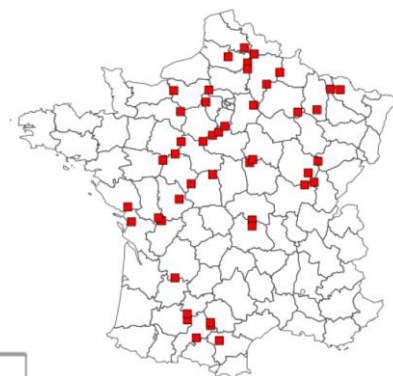


Dewaele et al. HESS 2017

# Validation: crop yields

- Example: wheat yields in France (1999-2013)

## ISBA MODEL WITHOUT ASSIMILATION

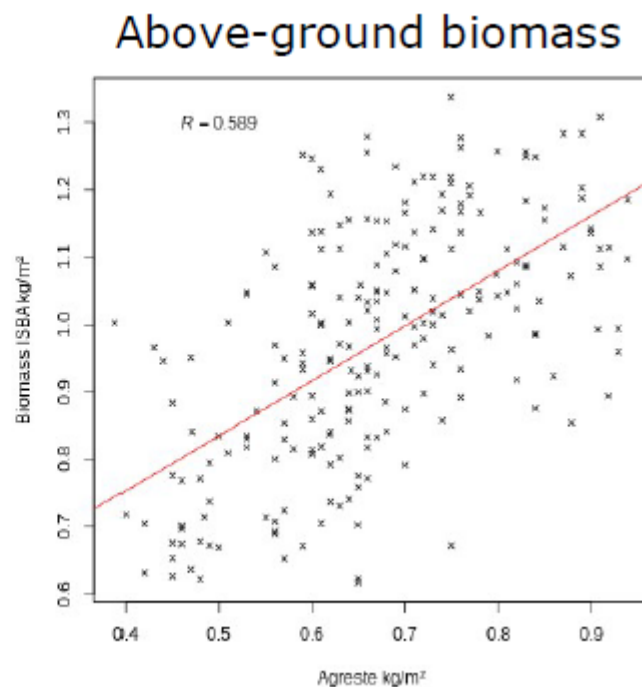
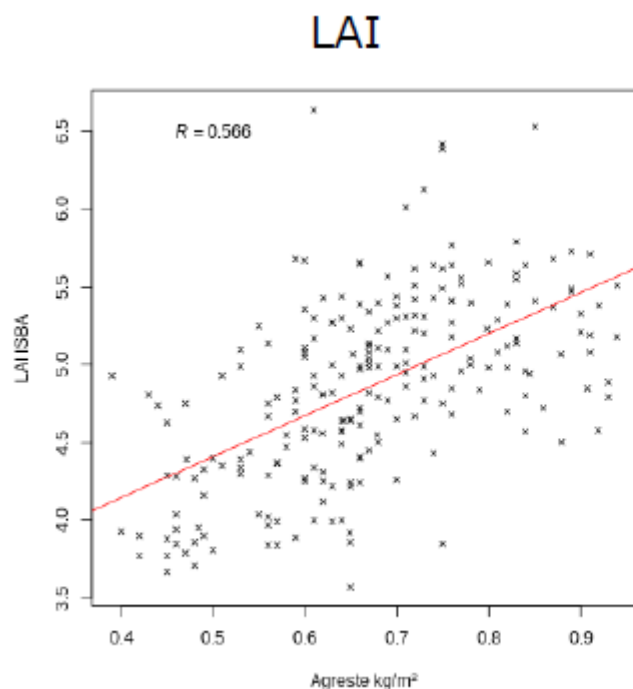
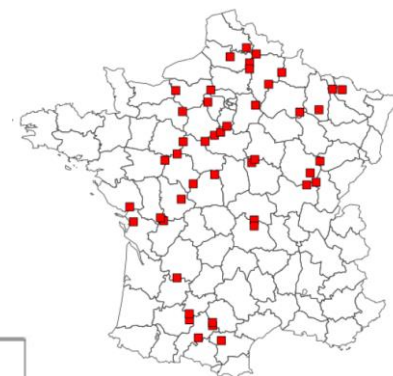


Dewaele et al. PhD 2017

# Validation: crop yields

- Example: wheat yields in France (1999-2013)

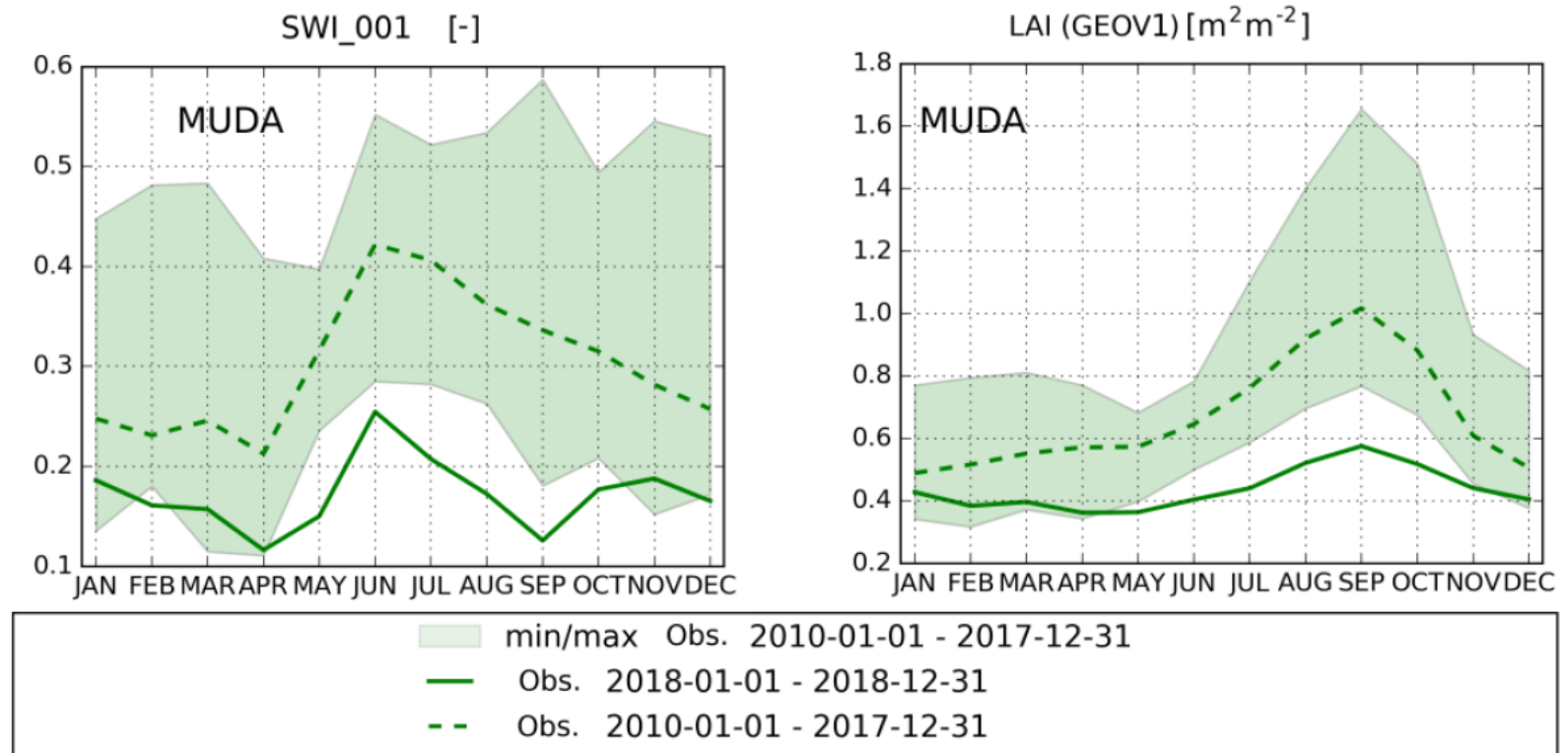
## ISBA MODEL WITH ASSIMILATION



Dewaele et al. PhD 2017

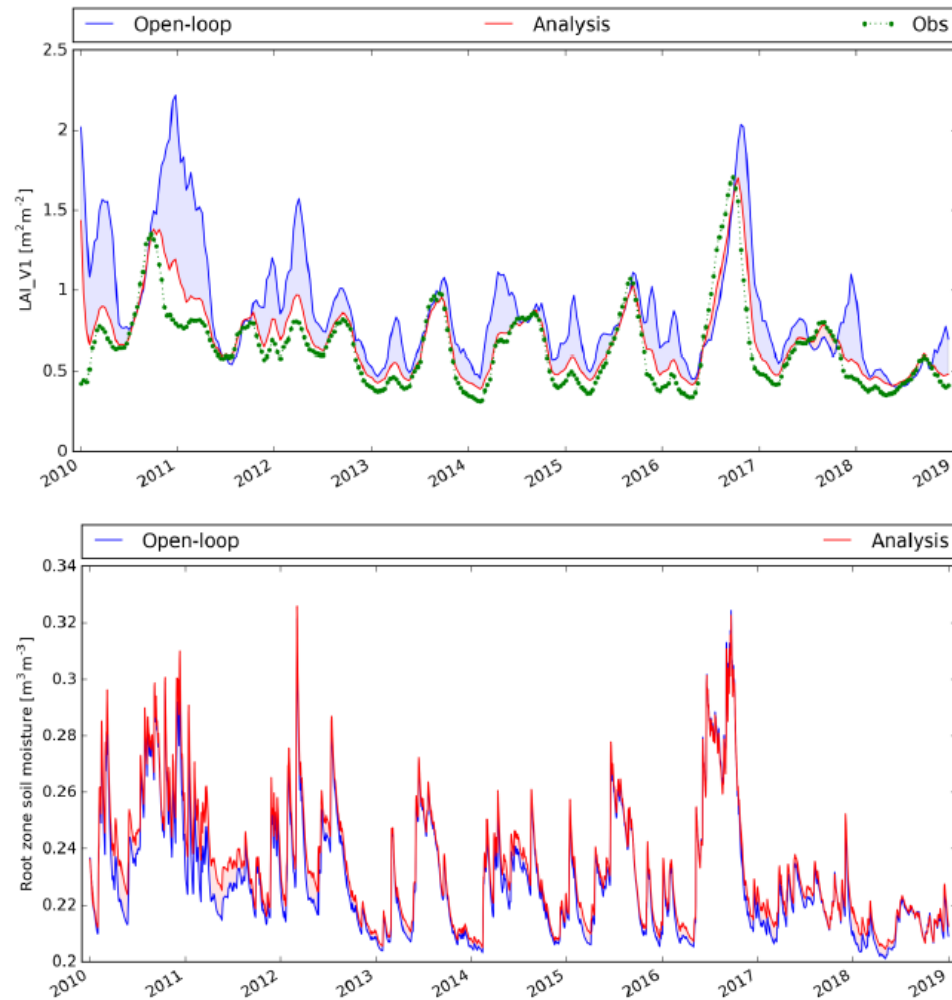
# Applications: monitoring severe conditions

- 2018 drought in Australia (Murray-darling basin)



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- 2018 drought in Australia (Murray-darling basin)



JC Calvet – March 2019

# LDAS-Monde now

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- Global (« LDAS-Monde »): see papers on <https://www.umr-cnrm.fr/spip.php?article1022>
- Global atmospheric forcings: ERA5 (25km), HRES (9km)
- Land satellite products assimilated by LDAS-Monde (active monitoring)
  - LAI (Copernicus Global Land Service)
  - SSM (Copernicus Global Land Service)
- Monitoring of many other land variables (passive monitoring)
  - Surface temperature
  - Surface albedo, FAPAR
  - Surface fluxes: evapotranspiration, heat, carbon dioxide
  - Root-zone soil moisture
  - River discharge, inundation plains
- Initialisation of **forecasts** of land variables



# LDAS-Monde in the near future

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- **Prospects**

- **High spatial resolution : ~1km on areas of interest**
- **Observation operators: sigma0 at C-band, surface albedo**
- **Assimilation of snow cover extent**
- **Modeling: multiple energy budgets, irrigation**

- **Towards applications**

- **Reanalyses of land essential climate variables**
- **Water resource / drought / vegetation monitoring**
- **Detection of severe conditions over land**