



## **SURFEX** Users Workshop

CIC meetings

Centre International de Conférences - Météo-France - Toulouse - France    February 27<sup>th</sup> - March 1<sup>st</sup> 2017

# **Integration of satellite data into SURFEX for better monitoring agricultural droughts**

Calvet J.-C., Albergel C., Barbu A., Carrer D., Dewaele H., Fairbairn D., Leroux D., Mahfouf J.-F., Munier S.

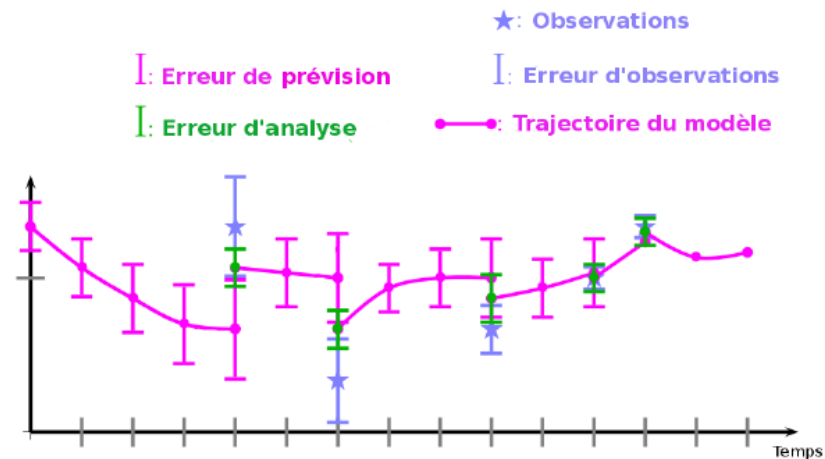
*CNRM, Toulouse, France*

## Heritage

- 1990's: Météo-France implements sequential assimilation of in situ T2m, HU2m observations to analyze soil moisture in weather forecast models
- 2000's: SMOSREX field experiment (L-band radiometry, sequential assimilation of surface soil moisture and LAI)
- 2010's: Land Data Assimilation System contributing to Copernicus Global Land Service (cross-cutting monitoring)

## Sequential assimilation

- Model trajectory is driven by observations
- Better than model calibration:
  - all kinds of errors can be accounted for
  - near real-time operation is possible
  - key parameters can be efficiently tuned minimizing analysis increments

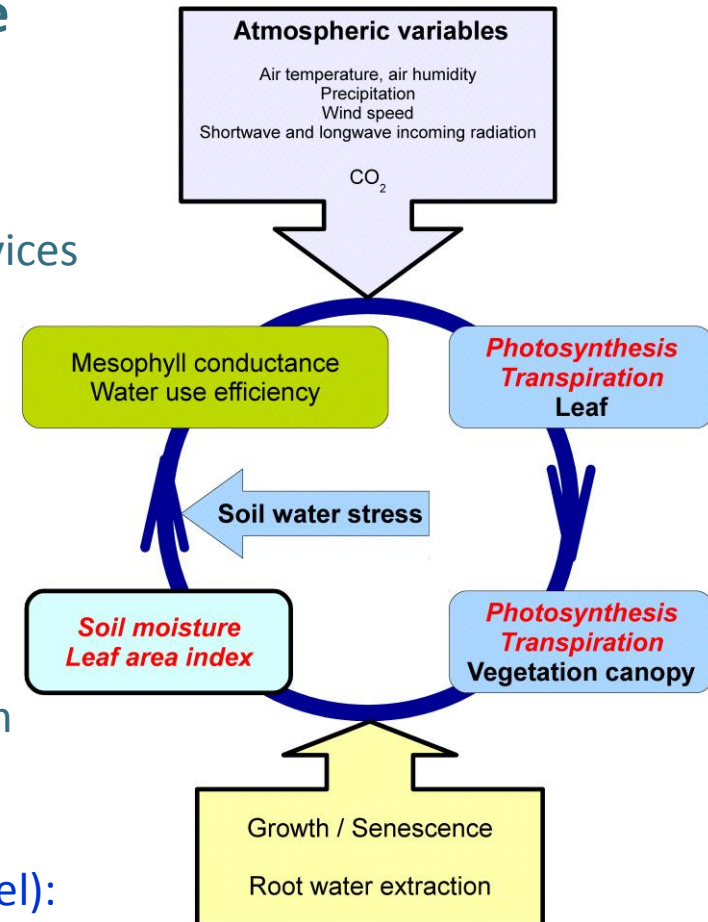


## SURFEX modeling platform of Meteo-France

- Operational applications: weather forecast, hydrology, IPCC simulations (CNRM-ARPEGE)
- Open-source. Used by many meteorological services in Europe and North Africa

## ISBA land surface model

- LAI, FAPAR, SA, LST, SSM are modeled
- Evapotranspiration, CO<sub>2</sub> fluxes
- Implicit representation of N cycle
- Simulates the impact on vegetation of long-term changes of atmospheric CO<sub>2</sub>
- A-gs approach (not the Farquhar model)
- Photosynthesis-driven phenology (no GDD model):  
***LAI is flexible and can be analyzed at a given time***



## Data assimilation in SURFEX

### LDAS-France (Barbu et al. HESS 2014)

- ISBA model forced by SAFRAN
- 8 km x 8 km

### LDAS-Monde

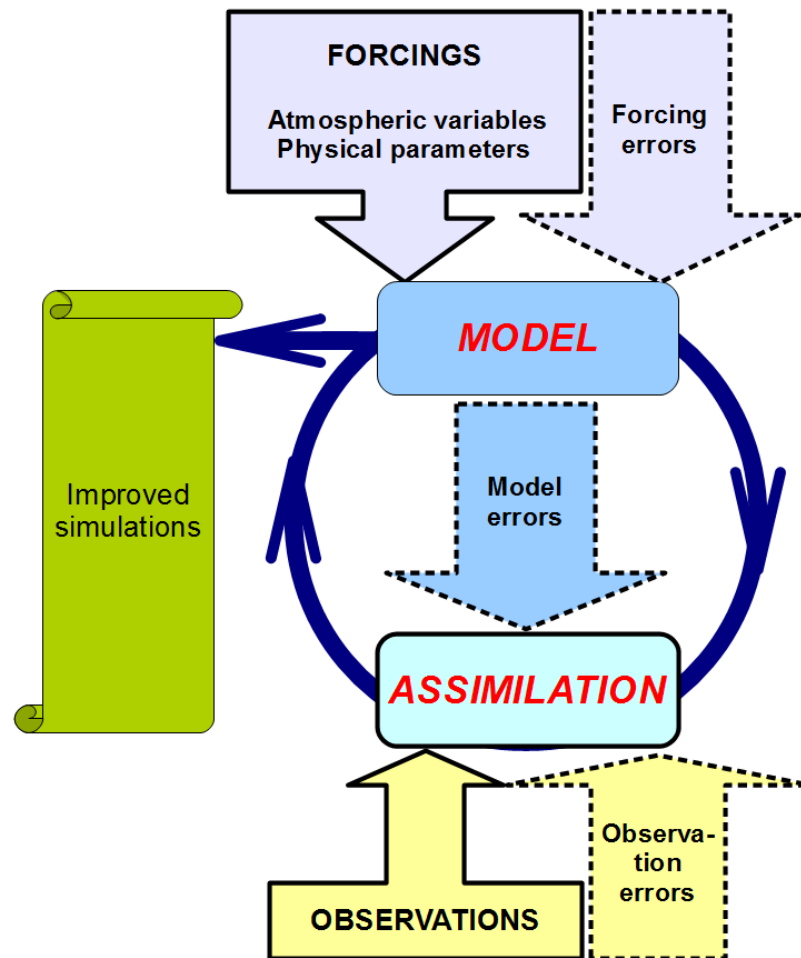
- ISBA model forced by ERA-Interim
- $0.5^\circ \times 0.5^\circ$

### Assimilation (active monitoring) of

- Copernicus GLS LAI
- Copernicus GLS surface soil moisture

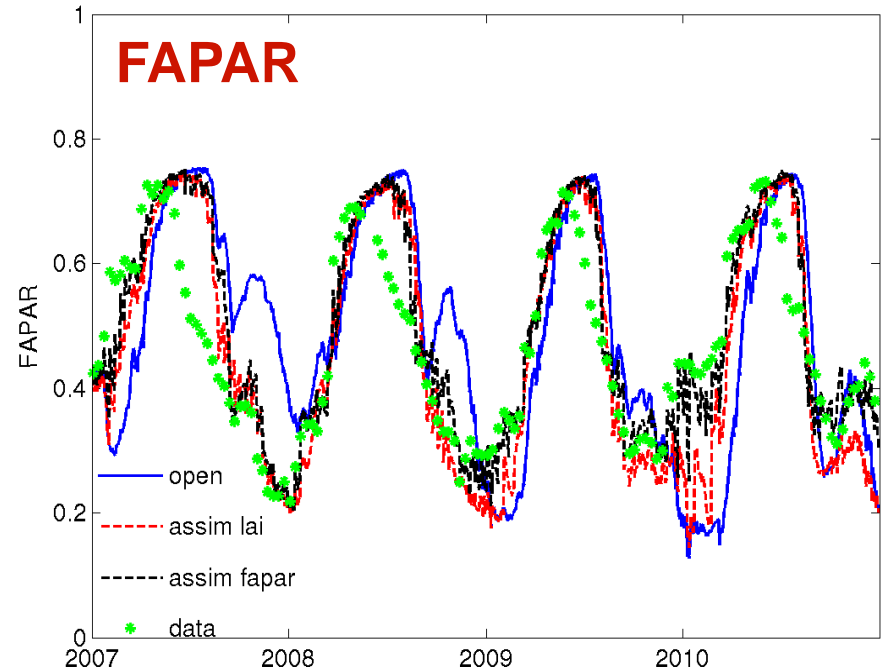
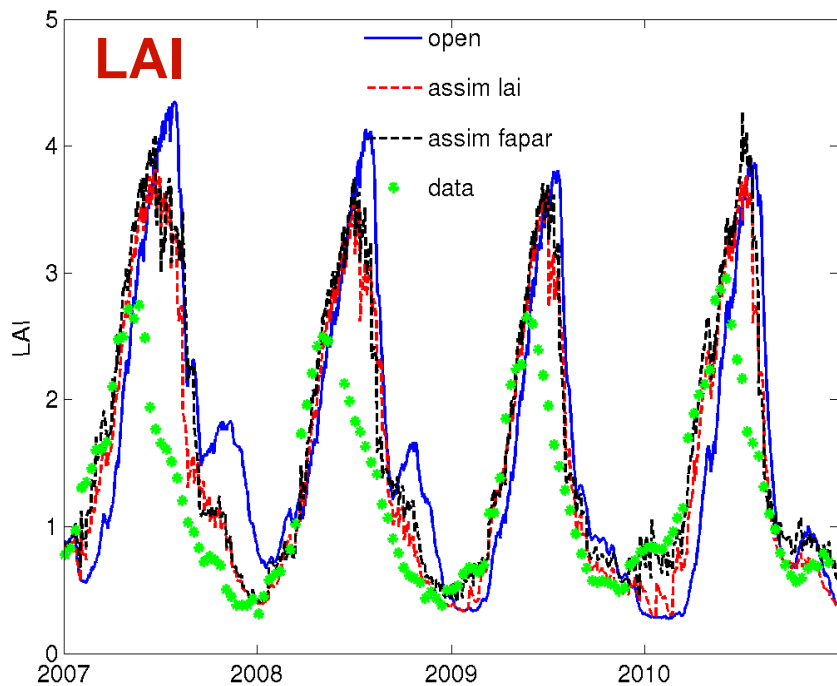
### Passive monitoring of

- FAPAR
- SA
- LST



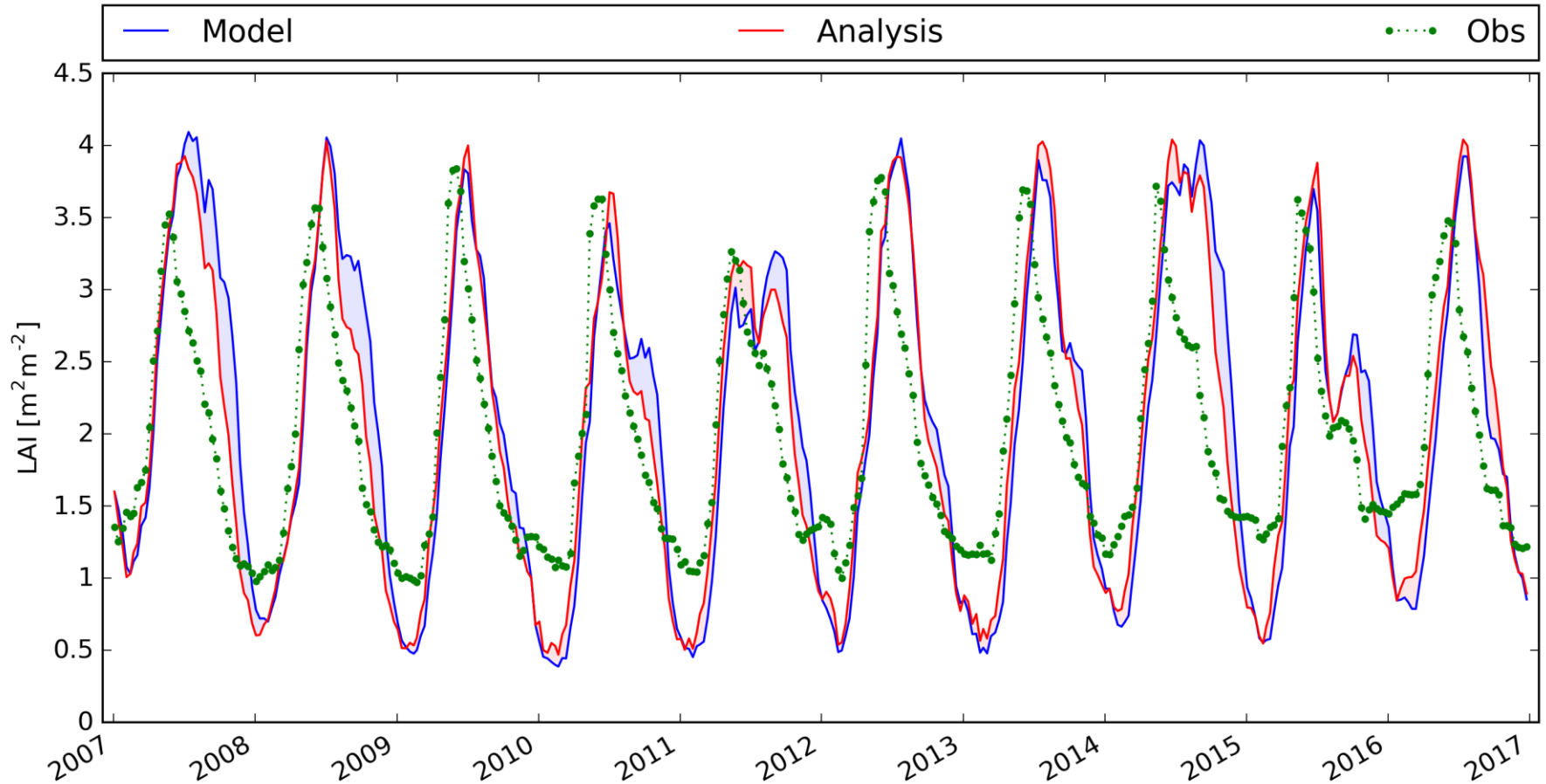
## Assimilating LAI or FAPAR ?

$$\sigma_{LAI}^b = 0.2, \sigma_{LAI}^o = 0.2, \sigma_{FAPAR}^o = 0.02$$

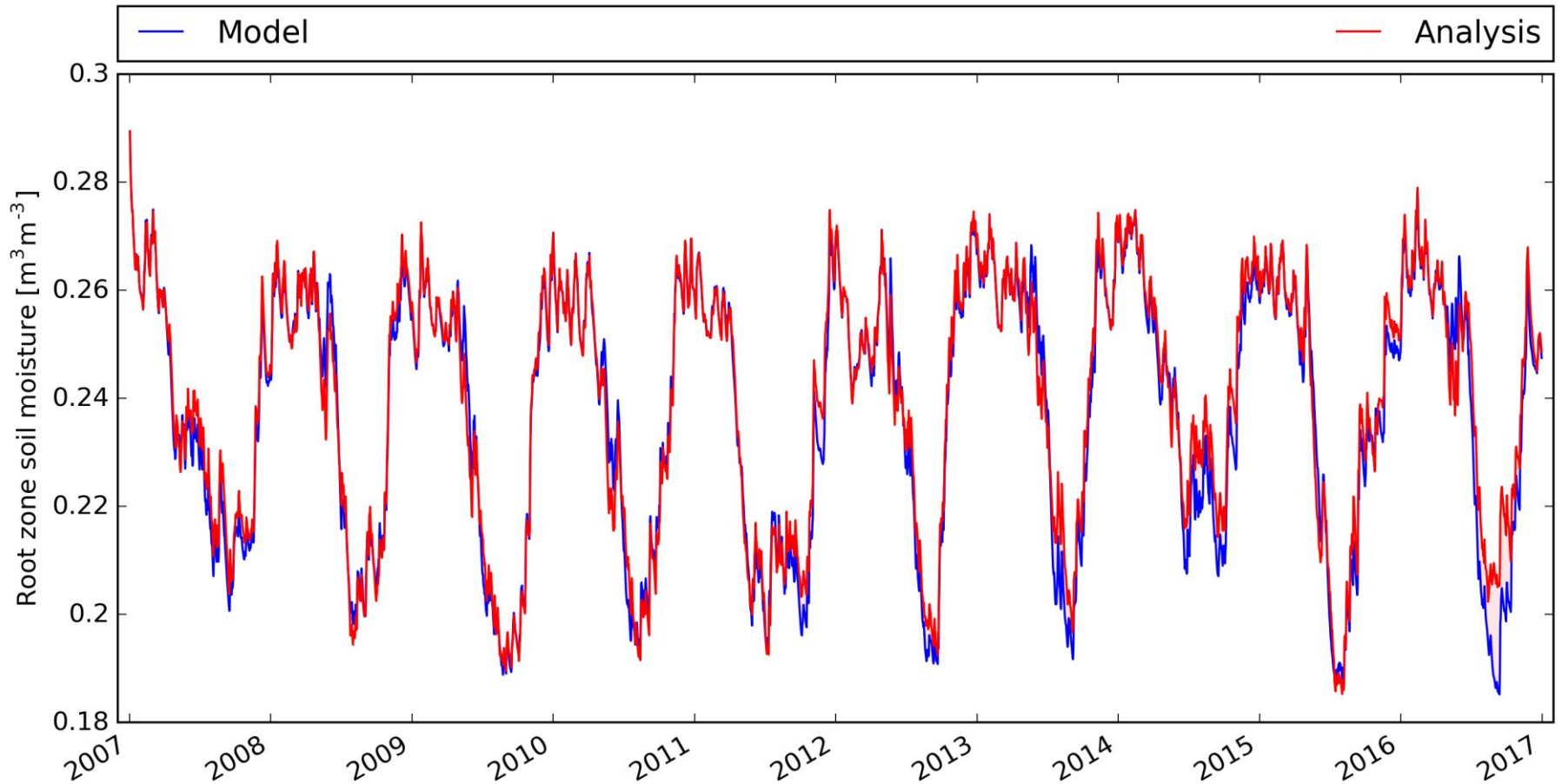


Explicit FAPAR (Carrer et al. 2013, JGR-B)

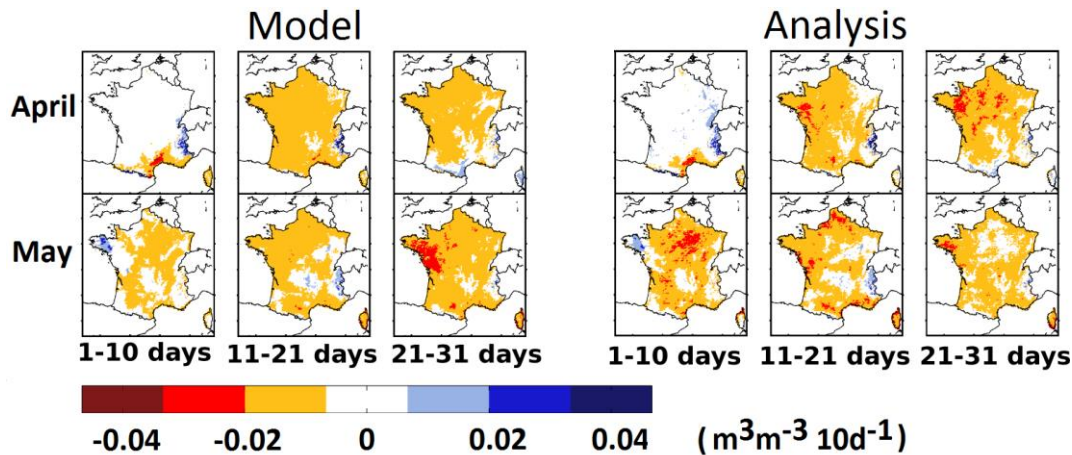
## LAI (mean monthly values for France)



## Surface soil moisture (mean monthly values for France)

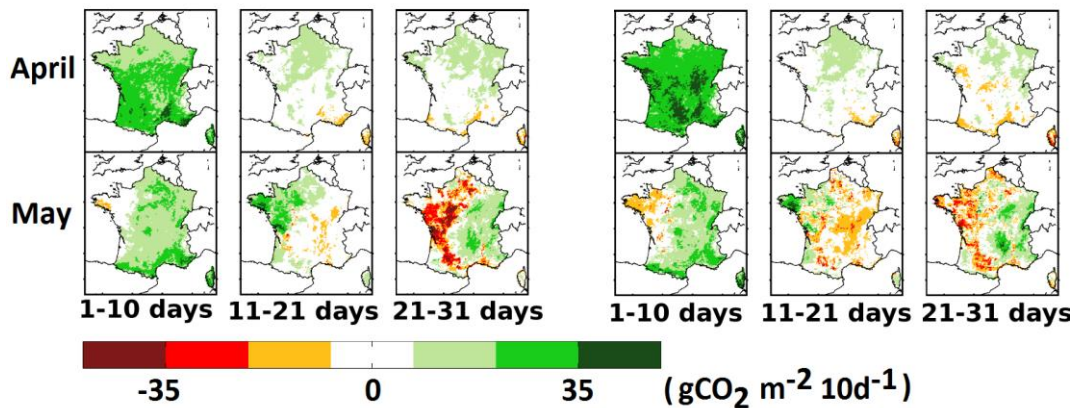


## Enhanced representation of agricultural droughts: spring 2011 Soil moisture and photosynthesis: 10-day changes in 2011 (spring drought)



**SOIL MOISTURE**

Assimilation reinforces the drought signal



**GPP**

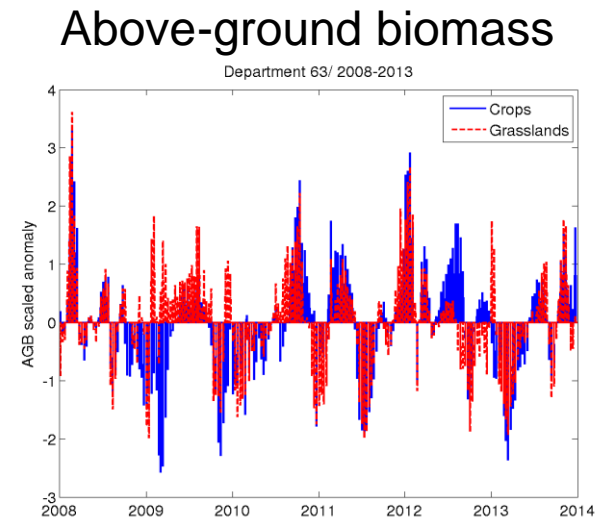
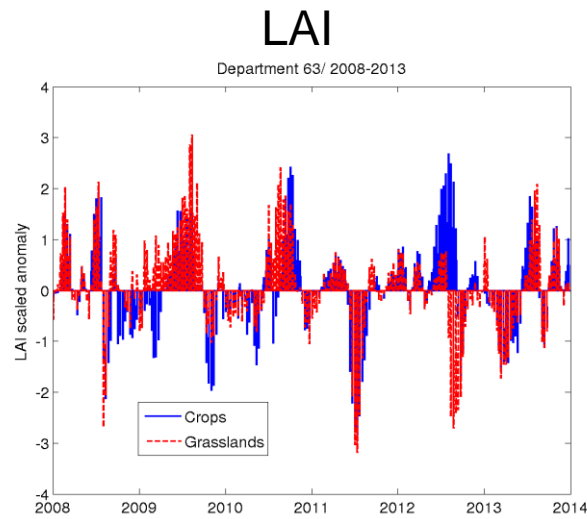
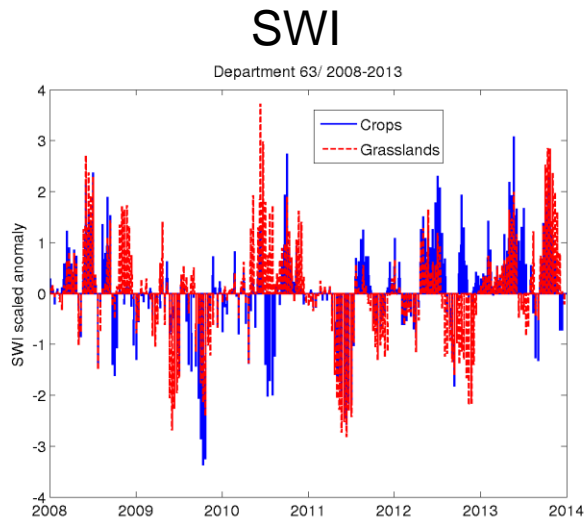
Barbu et al. 2014, HESS



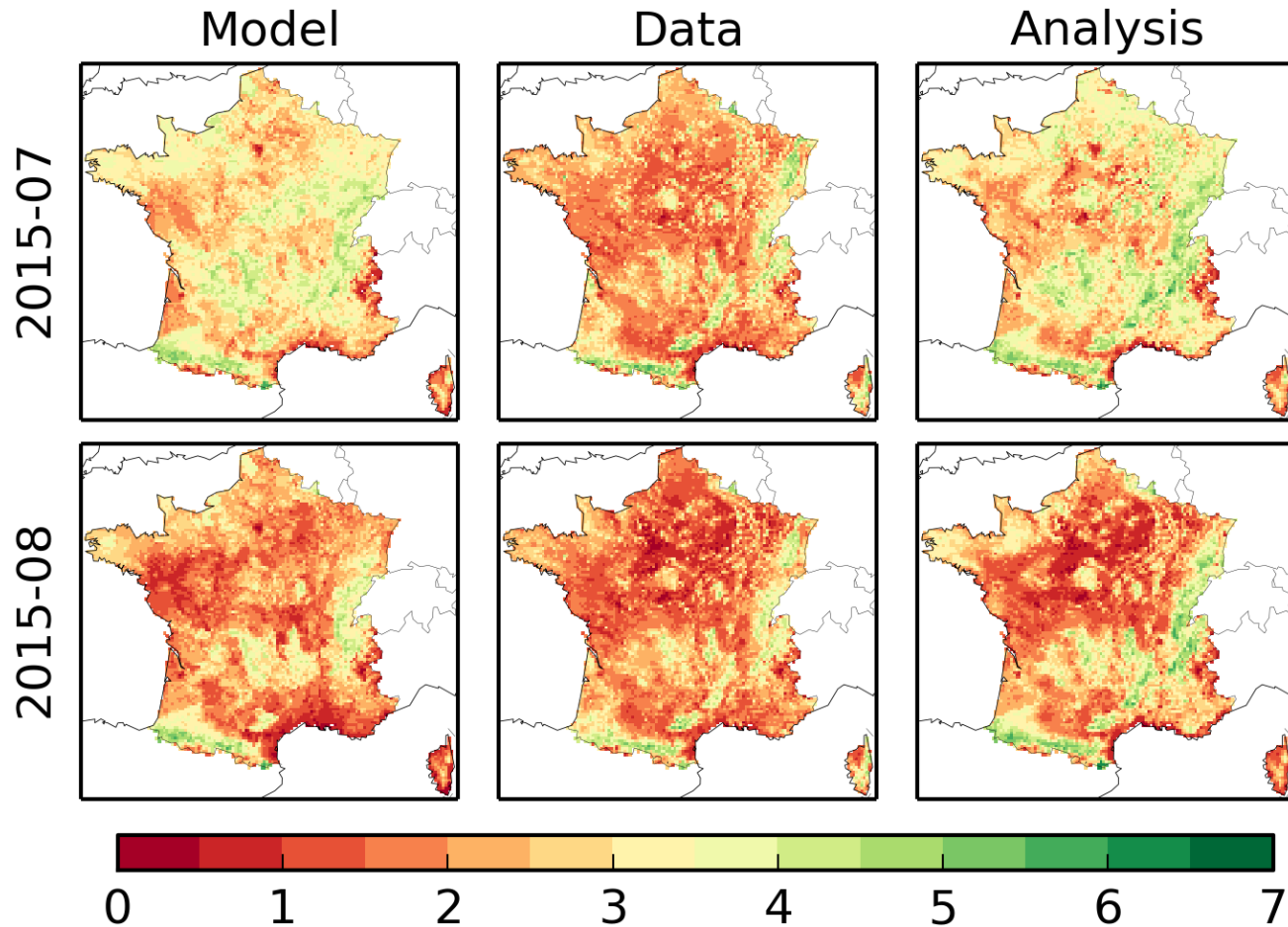
## Enhanced representation of agricultural droughts: spring 2011 Agricultural drought indicators, example of Puy de Dôme (France)

LAI and biomass anomalies are less erratic than SWI anomalies  
Complementary information content

10-day scaled anomalies:

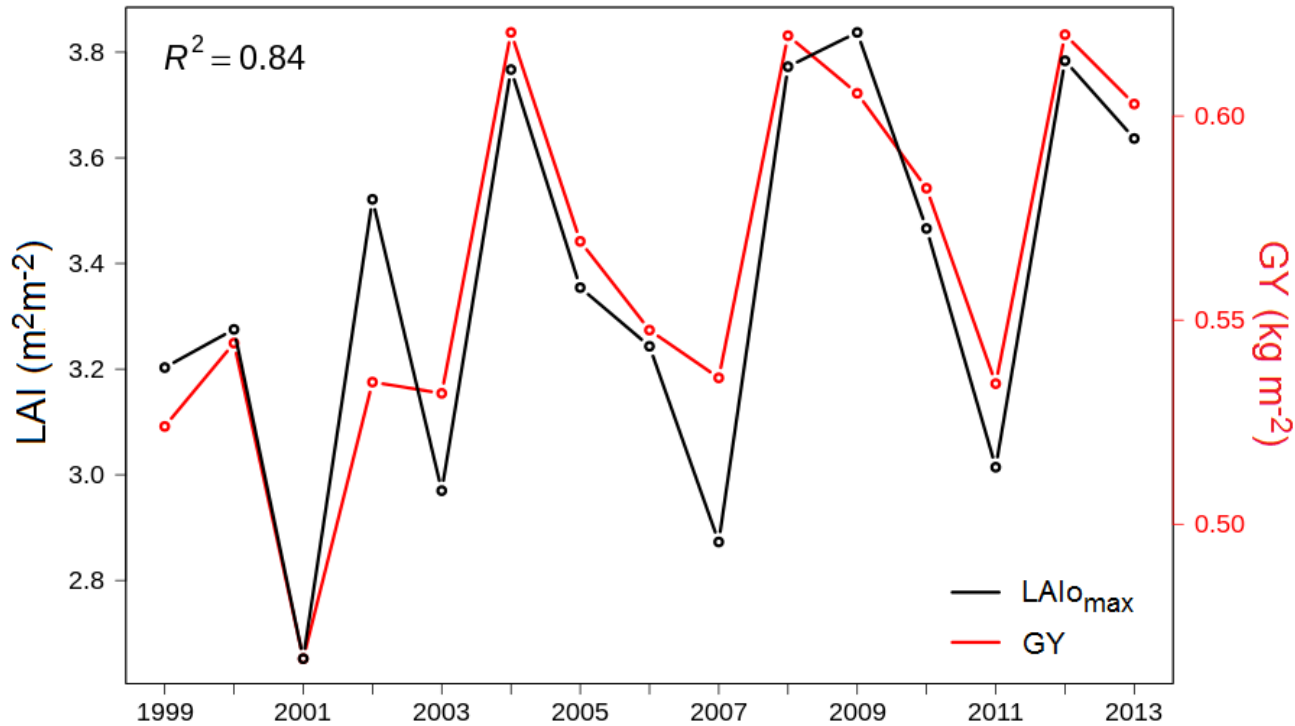
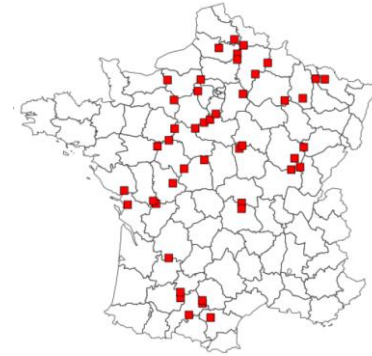


## Enhanced representation of agricultural droughts: summer 2015



## Validation: wheat yields in France

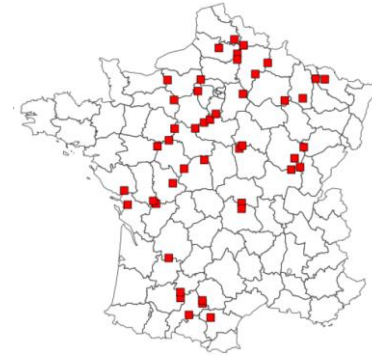
Disaggregated Copernicus GLS LAI correlates with wheat yield



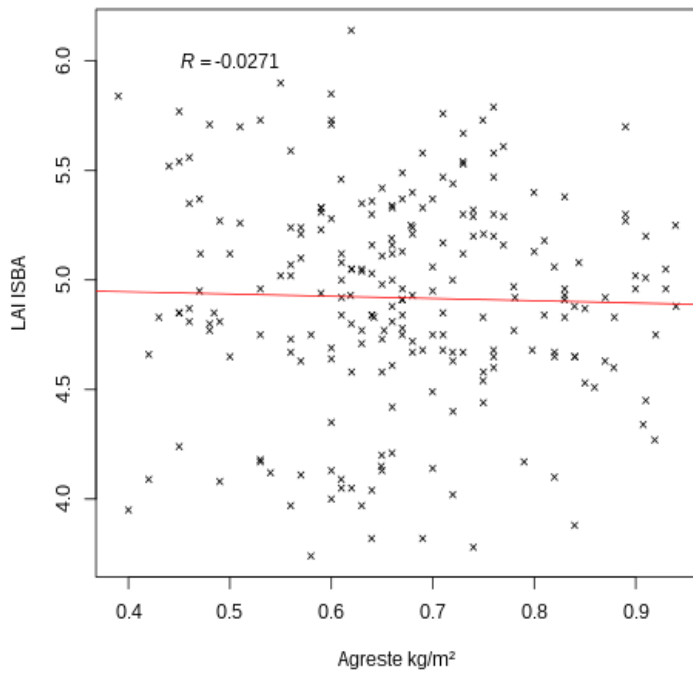
Dewaele et al. 2017

## Validation: wheat yields in France

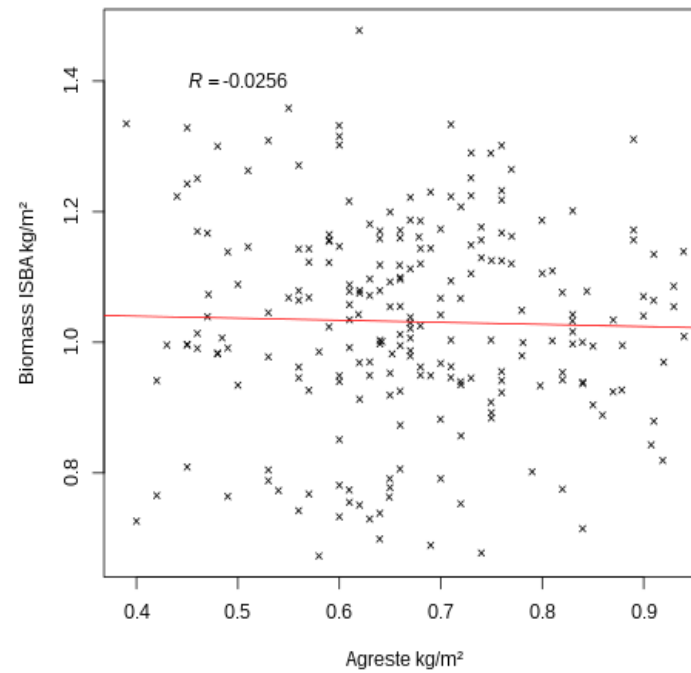
**WITHOUT ASSIMILATION OF LAI**



LAI

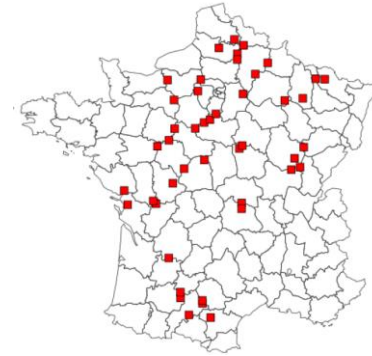


Above-ground biomass

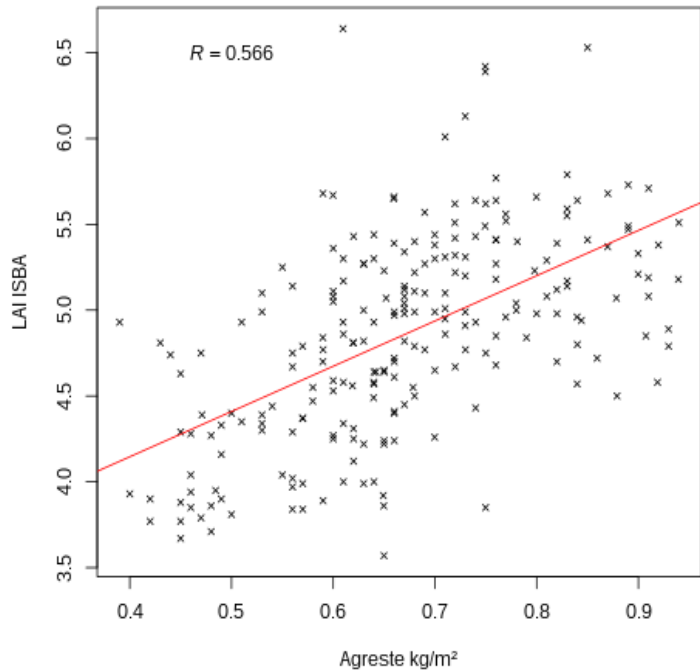


## Validation: wheat yields in France

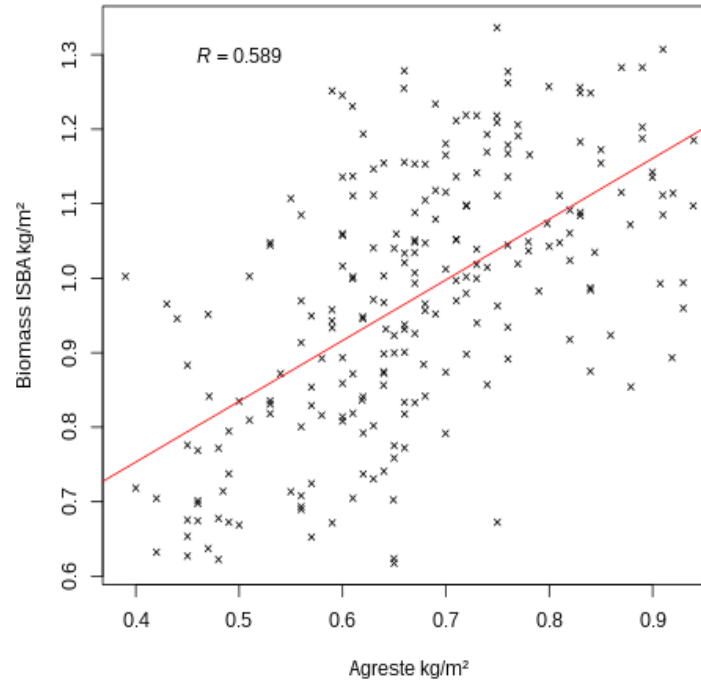
### WITH ASSIMILATION OF LAI



### LAI



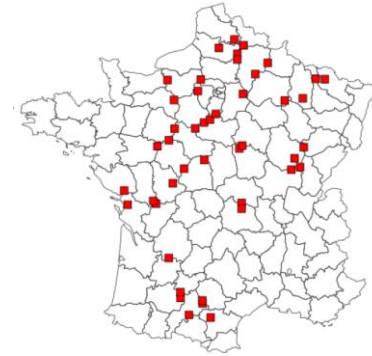
### Above-ground biomass



## Validation: wheat yields in France

Consistency can be improved further tuning  
a key model parameter: **MaxAWC**

(maximum available soil water content for plant transpiration)



## Two methods:

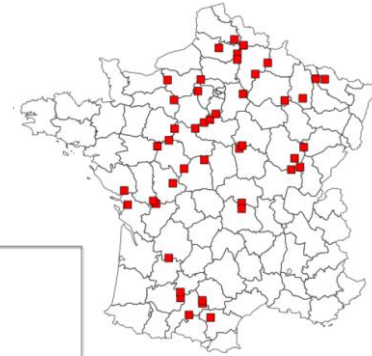
- **Inverse modeling (parameter tuning minimizing RMSE)**
- **LDAS tuning (minimizing LAI increments in sequential assimilation)**

# LDAS-Monde

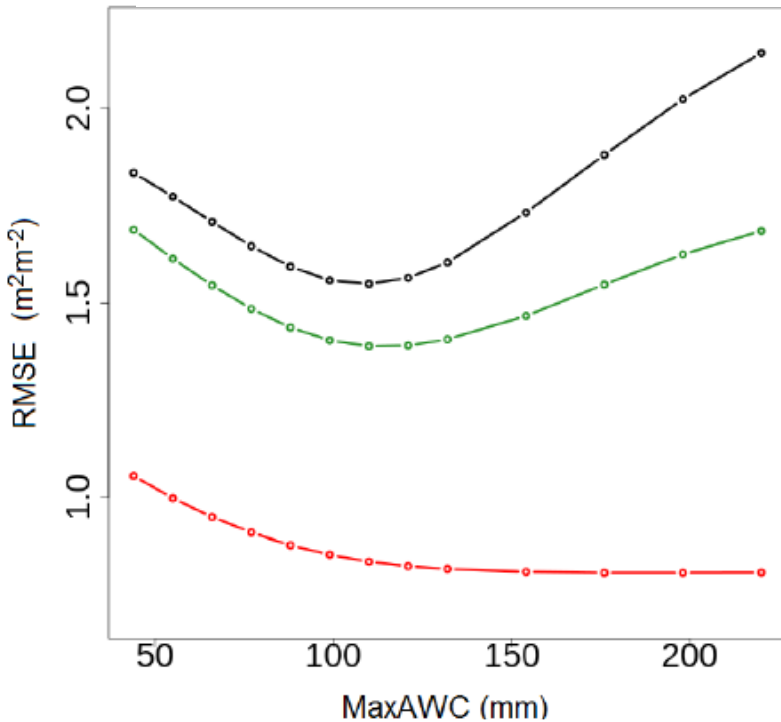


Validation: wheat yields in France

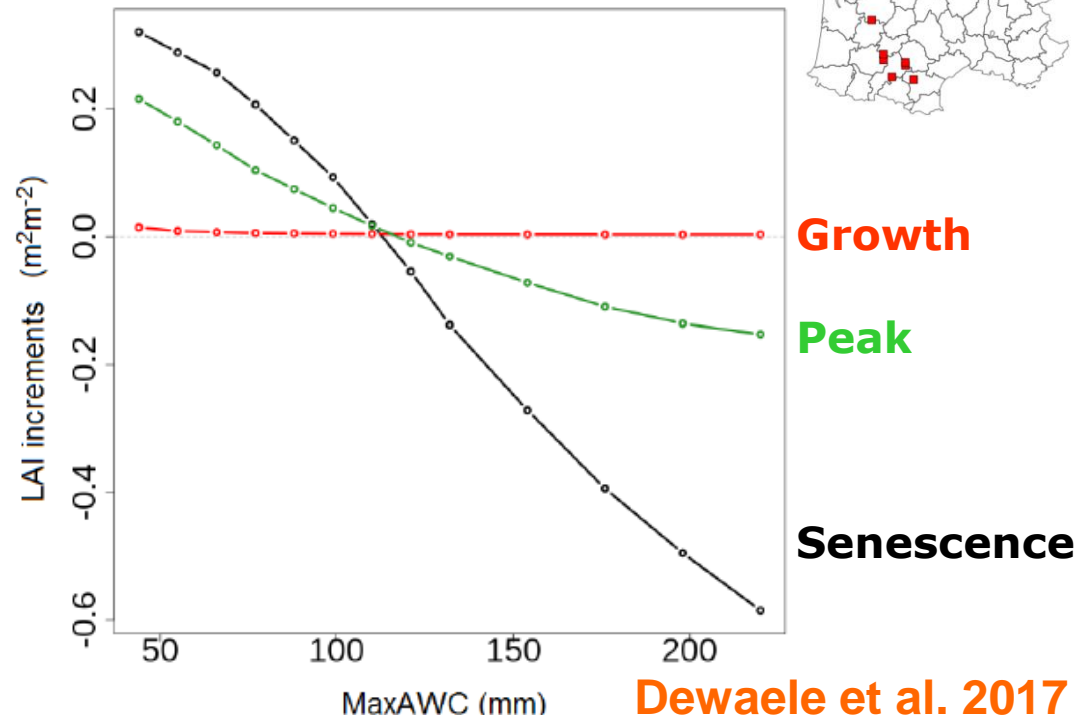
MaxAWC retrieval: LDAS tuning (minimize LAI increments)  
is better than inverse modeling (minimize LAI RMSE)



Inverse modeling

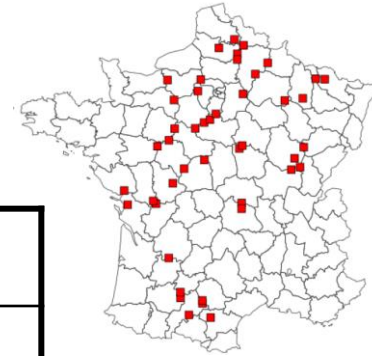


LDAS tuning



## Validation: wheat yields in France

MaxAWC retrieval: LDAS tuning (minimize LAI increments)  
is better than inverse modeling (minimize LAI RMSE)



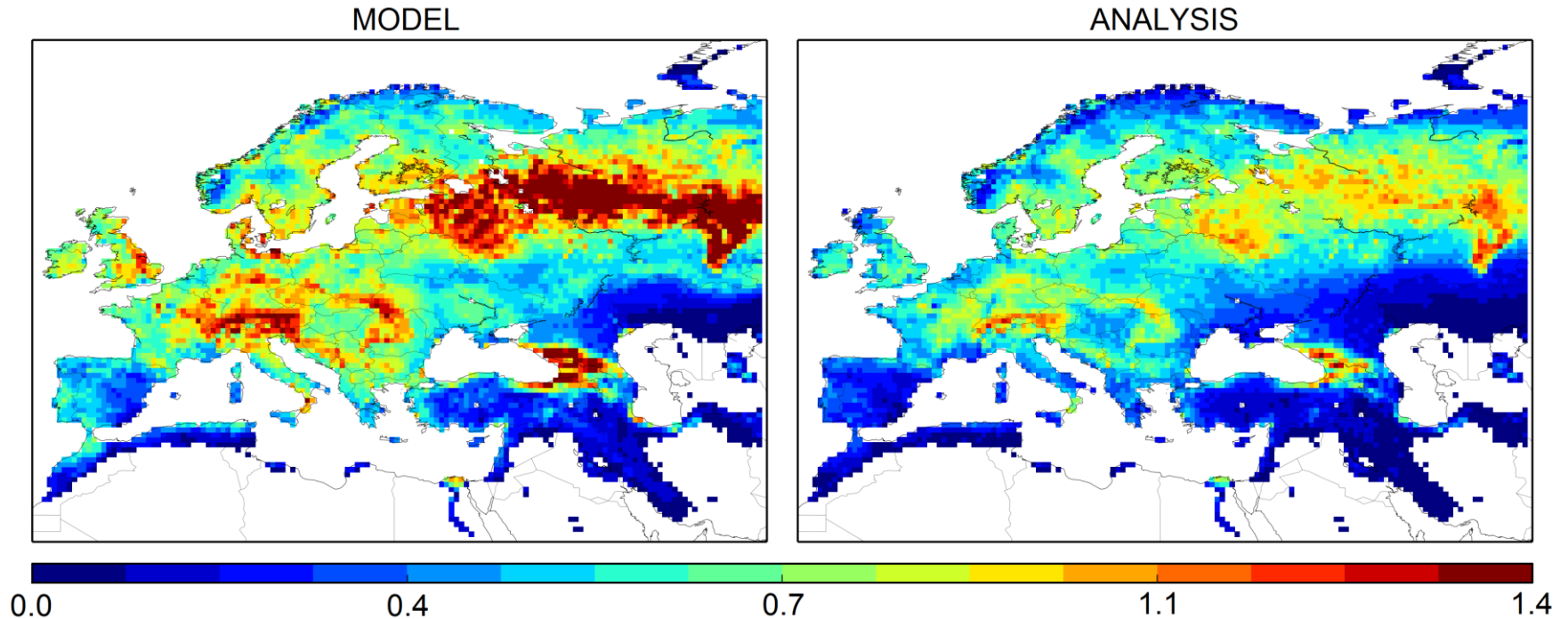
	Inverse modeling	LDAS tuning
Fraction of administrative units with significant correlation (p-value < 0.01)	36 %	<b>53 %</b>
LAI RMSE	1.2 m <sup>2</sup> m <sup>-2</sup>	<b>1.1 m<sup>2</sup>m<sup>-2</sup></b>
Median MawAWC	111 mm	<b>129 mm</b>

**More realistic !**

**Dewaele et al. 2017**



Can be applied to any region of the world. E.g. Euro-Mediterranean LAI standard deviation of differences from 2007 to 2015



## Conclusion

- Integration of satellite observations into SURFEX
- Fully coupled to hydrology (CTRIP model)
- Now the only system able to sequentially assimilate vegetation products (together with soil moisture observations)
- A powerful tool to monitor droughts
- Validation
  - using agricultural yield statistics
  - using SIF data

## Prospects

Observation operator for surface albedo, ASCAT sigma0, LST, ... and SIF

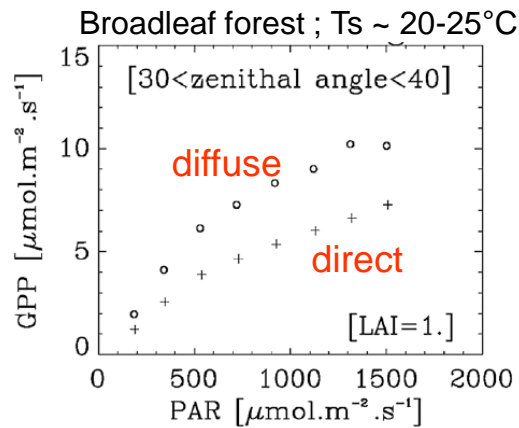
# Thank you for your attention !

**Contact:**

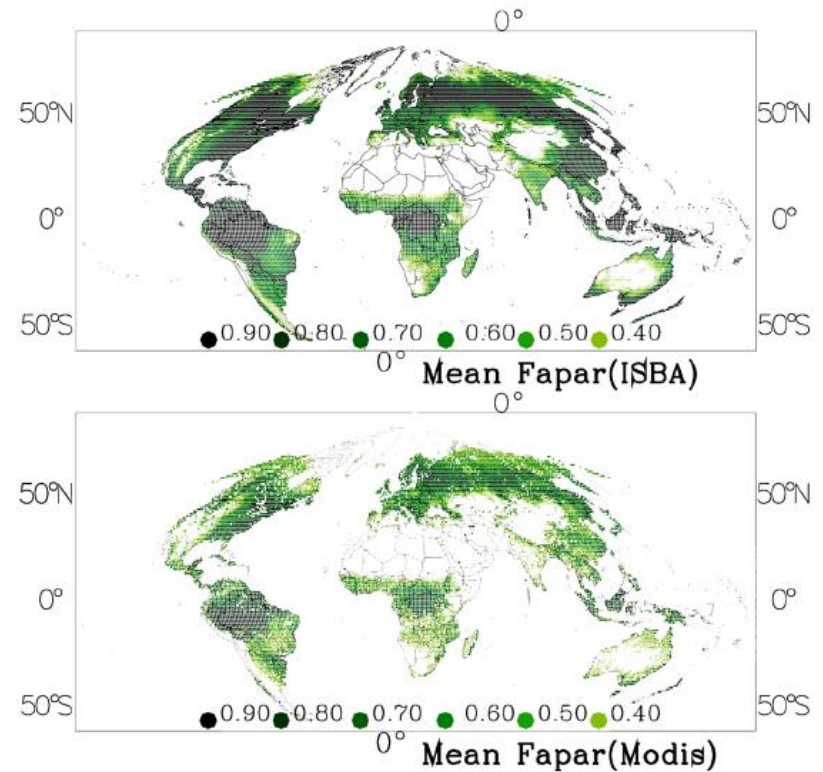
[jean-christophe.calvet@meteo.fr](mailto:jean-christophe.calvet@meteo.fr)

Canopy scale: radiative transfer model (10 layers, sunlit/shaded leaves)

## Multilayer photosynthesis model representing the absorption of direct/diffuse solar radiation



## Prognostic FAPAR



## Explicit FAPAR (Carrer et al. 2013, JGR-B)

# LDAS-Monde: Extra slides

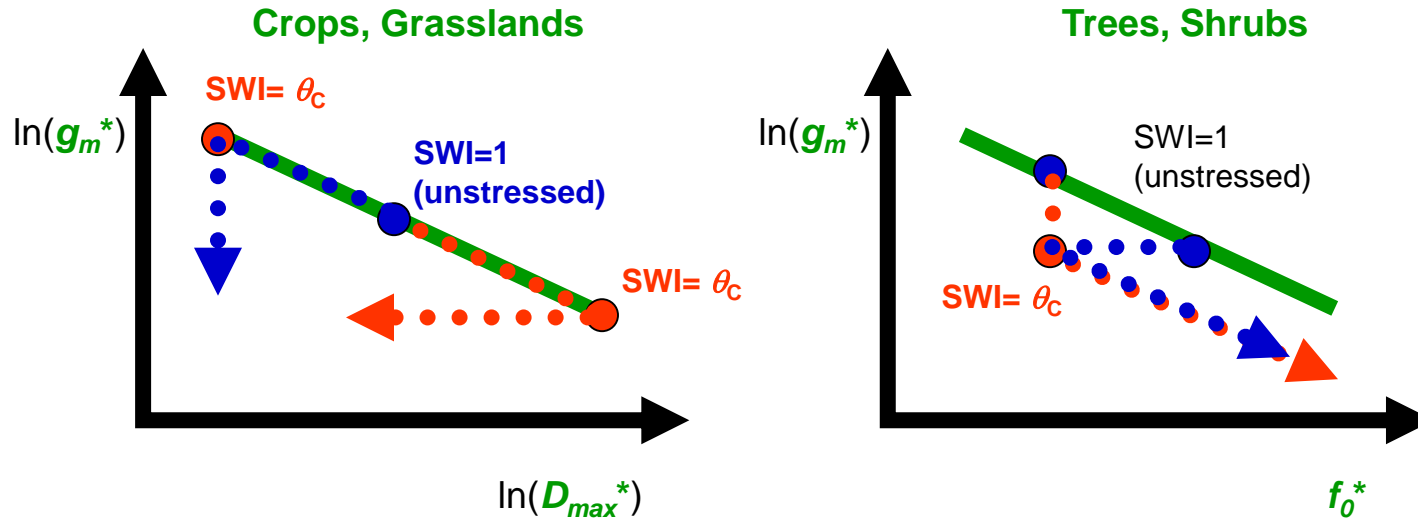
## Enhanced representation of drought

Key parameters of the photosynthesis model are affected by drought:

the well-watered value are adjusted by using the Soil Wetness Index (SWI)

Two possible strategies: **drought-avoiding** / **drought-tolerant**

Important parameter:  $\theta_c$  critical extractable soil moisture content, below which severe soil moisture stress is observed



Calvet 2000, Calvet et al. 2004