



# Monitoring and Forecasting the Impact of the 2018 Summer Heatwave on Vegetation using a Land Data Assimilation System

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## Study the vegetation and terrestrial water cycles

 Current fleet of Earth Satellite missions holds an unprecedent potential to quantify Land Surface Variables (LSVs)

[Lettenmaier et al., 2015, Balsamo et al., 2018]

- Spatial and temporal gaps & cannot observe all key LSVs (e.g. RZSM)
- Land Surface Models (LSMs) provide LSV estimates at all time/location
   LSMs have uncertainties
- Through a weighted combination of both, LSVs can be better estimated than by either source of information alone [Reichle et al., 2007]

### Data assimilation

Spatially and temporally integrates the observed information into LSMs in a consistent way to unobserved locations, time steps and variables





## Study the vegetation and terrestrial water cycles

LDAS-Monde: global capacity offline integration of satellite observations into a land surface model fully coupled to hydrology

### LDAS-Monde involves

- Land surface model: ISBA-A-gs, simulates the diurnal cycle of water and carbon fluxes, plant growth and key vegetation variables
- **River routing system: CTRIP** (CNRM version of Total Runoff Integrating Pathways)
- Data assimilation routines (SEKF, EnSRF\*, PF)



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#### LDAS-Monde successfully validated

- Agricultural statistics (e.g. Dewaele et al., 2018, HESS)
- River discharge (e.g. Albergel et al., 2017, GMD, 2018, RS)
- In situ measurements of soil moisture (e.g. Albergel et al., 2018, RS)
- Evapotranspiration from GLEAM, Fluxnet2015 (e.g. Albergel et al., 2018, RS)
- Gross Primary Production from FLUXCOM (e.g. Tall et al., 2019)
- Sun-Induced Fluorescence (e.g. Leroux et al., 2018, RS, Tall et al., 2019, RS)



#### \*Bonan et al., EGU2019-14804



## LDAS-Monde experimental set up

Model	Domain	Atm. Forcing	DA Method	Assimilated Obs.	Observation Operator	Control Variables	Additional Option
ISBA Multi-layer soil model CO <sub>2</sub> -responsive version (Interactive vegetation)	Global (2010 – 2018)	ERA-5 Res.: 0.25°x0.25°	SEKF	SSM (CGLS ASCAT SWI + cdf matching) LAI (CGLS GEOV2)	Second layer of soil (1-4cm) LAI	Layers of soil 2 to 8 (1-100cm) LAI	Coupling with CTRIP (0.5°)

ASCAT SSM [m3m-3] mean Obs.: 2010-2018

GEOV2 LAI [m2m-2] mean Obs.: 2010-2018



Control variables (CVs) are directly updated thanks to their sensitivity to the observed variables
Other variables are indirectly modified through biophysical processes and feedbacks in the model





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2 LDAS-ERA5 experiments : Model (no assimilation) and Analysis (assimilation)

RMSD: Model vs. Obs

RMSD: Analysis vs. Obs





## LDAS-Monde goes global

Selection of 19 regions known for being potential hot spots for droughts and heat waves







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Page 7

## **LDAS-Monde goes global**



### Monthly anomalies for 2018 with respect to 2010-2018



The Earth Observations point of view: CGLS GEOV2 and SWI Monthly anomaly (scaled by stdv)







Page 9

LDAS-Monde : Leaf Area Index

### Seasonal cycles, RMSD and Correlations values (Model, Analysis)



- Seasonal cycles:
- → 2018 quite different from 2010-2017
- smaller differences between Model and Analysis for 2018 than for 2010-2017 (True for RMSD and R values as well)
- Analysis improvements over Model simulation







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- 2018 quite different from 2010-2017
- Analysis improvements over Model simulation







#### Such an extreme event needs more attention!

Using ECMWF high resolution operational analysis to force LDAS-Monde (<u>LDAS-HRES</u>, 0.10°x0.10°) and complement the use of ERA5 (<u>LDAS-ERA5</u>, 0.25°x0.25°)



Despite the spatial resolution, ERA5 production cycle (IFS Cycle 41r2) is still close to that of the HRES (IFS Cycle 41r2 to 43r3 from 2016 and 45r1 from June 2018)



### LDAS-ERA5, LDAS-HRES

- 4 experiments: 2 analyses and their 2 openloops
- Seasonal scores over April 2016 to December 2018 : each experiments vs. LAI obs.



- ERA5 (blue) and HRES (cyan) driven open loop are comparable, HRES being better
- Analysis (red and pink) add skill to both which is indication of healthy behaviour





### From monitoring to forecasting using LDAS-HRES (0.1°x0.1°):

LAI forecast up to 8-days ahead (initialised by LDAS-Monde) vs. Openloop



e) RMSD differences :LDAS\_fc\_d8 - Open-loop



49 % of the domain improved by the forecast initialised by an analysis

d) RMSD differences : Analysis - Open-loop



82 % of the domain improved by the analysis

- Forecast experiment with up to 8-day lead time, initialised by the analysis, better than an open-loop!
- Forecast of LSVs is also a matter of initial conditions!



## Conclusions

### LDAS-Monde: combining LSM, satellite EOs and atmospheric forcing

Great potential to monitor and forecast the impact of extreme weather on LSVs

Global LDAS-Monde provides a model climate as reference for anomalies of LSVs
 Significant anomalies trigger more detailed monitoring and forecasting activities

### LDAS-Monde ready for use in various applications

- Reanalyses of land ECVs
- Water resource / drought / vegetation monitoring
- Detection of severe conditions over land and initialisation of LSVs forecast

Open LDAS-Monde freely available:

https://opensource.umr-cnrm.fr/projects/openIdasmonde contact: clement.albergel@meteo.fr **\** @CAlbergel

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## Data Assimilation of Satellite-Based Observations into Land Surface Models

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