

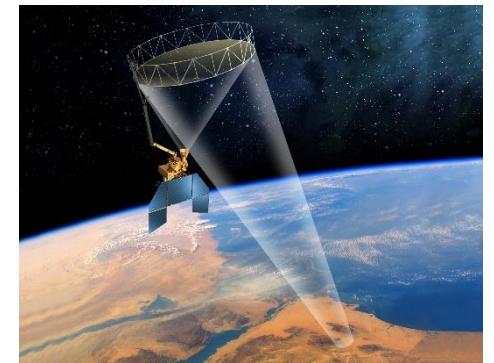
Potential of satellite surface soil moisture products for spatially calibrating distributed eco-hydrological models

José Gomis-Cebolla, Alicia García-Arias, Martí Perpinyà-Vallès, Félix Francés

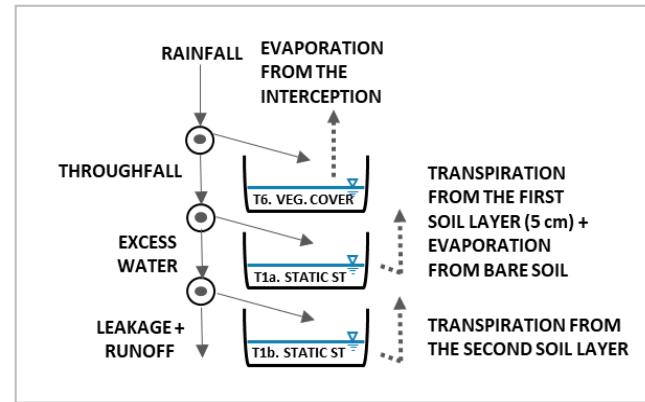
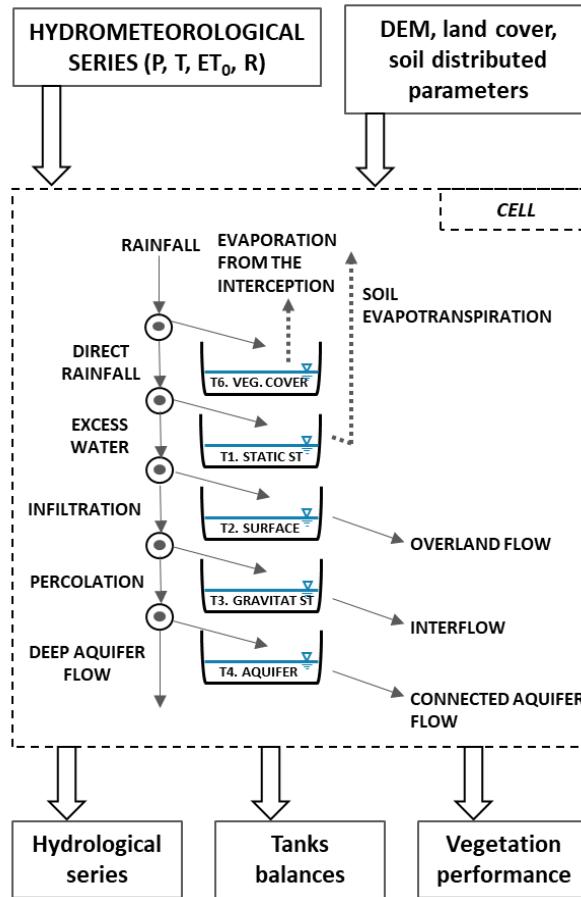
Research Group of Hydrological and Environmental Modelling (GIMHA)



- Distributed eco-hydrological models (DEHM) can provide spatial description of hydrological processes
- Satellite information can be used for the spatial calibration of DEHM (*Ruiz-Pérez et al., 2017; Echeverría et al., 2019*)
- Sentinel-1, SMAP and SMOS surface soil moisture (SSM) products are available at 1km. However, they are not free from errors
- Research questions:
 - **How well do SSM products agree with DEHM?**
 - **Could they be useful for DEHM calibration?**



□ Hydrological sub-model



Hydrological Correction factors	
FC1 - Maximum Static storage	
FC2 - Vegetation factor evapotranspiration	
FC3 - Infiltration capacity	
FC4 - Slope velocity	
FC5 - Percolation capacity	
FC6 - Interflow hydraulic capacity	
FC7 - Deep aquifer percolation capacity	
FC8 - Connected aquifer hydraulic conductivity	
FC9 - Kinematic Geomorphological Wave	

□ Dynamic vegetation sub-model

$$\frac{dB_l}{dt} = (LUE \cdot \varepsilon \cdot PAR \cdot fPAR - Re) \cdot \varphi_l(B_l) - k_l B_l$$

✓ State variable: leaf biomass ✓ Based on LUE

Vegetation Parameters

β (-) Exponent in the soil water limitation function

ξ (-) Exponent in the vegetation water stress function

I_{max} (mm) Maximum leaf interception storage

R_d (%) Root distribution

k_l (-) Light extinction coefficient

T_{opt} ($^{\circ}$ C) Optimum temperature

Vegetation Parameters

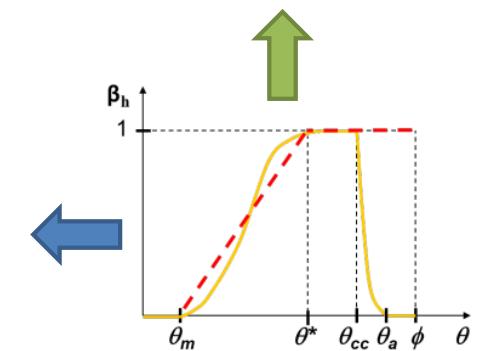
LUE (gC/MJd) Light Use Efficiency

r_r (gC/gN d) Respiration rate

k_d (-) Leaf natural decay factor

SLA (m^2/gC) Specific leaf area

LAI_{max} (m^2/m^2) Maximum LAI



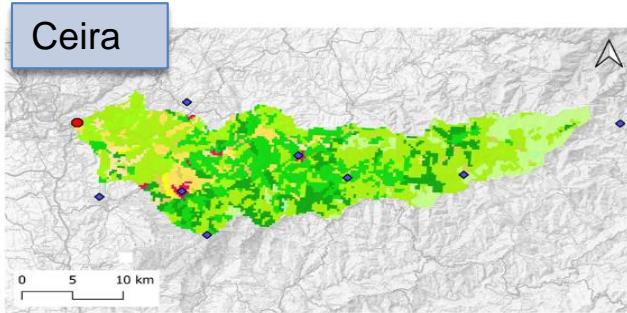
✓ ε : stress factor including water

✓ $T_i = ET_0 \cdot f_c \cdot \min(1, LAI) \cdot \beta(H_i)$

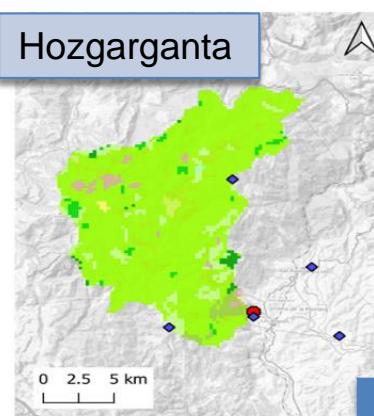
Iberian Mediterranean basins

- ✓ Representative of the climatology and hydrology of the Mediterranean Bio-geographical in the Iberian Peninsula

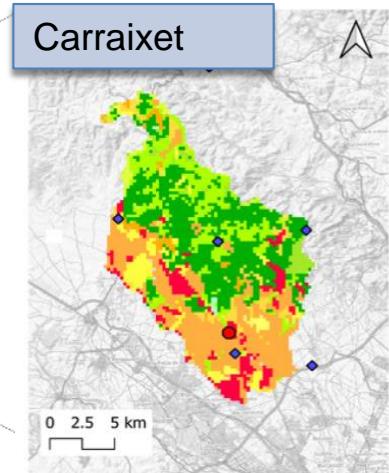
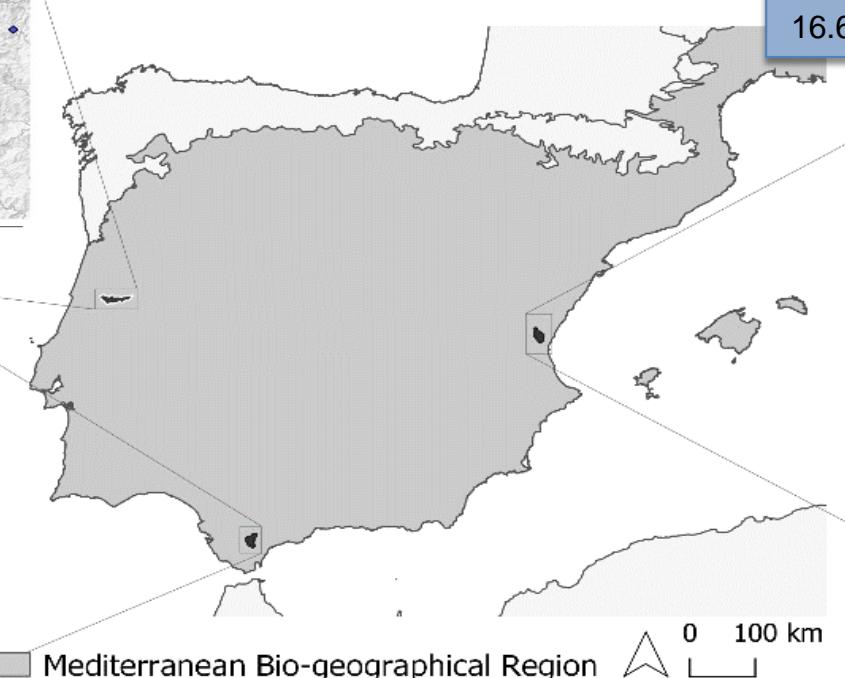
- 496.89 km²
- 62-1380 m.a.s.l
- Forestry
- Dense vegetation +



T (°C)	P (mm)	ETO (mm)
16.6 ± 0.1	373 ± 108	1142 ± 11



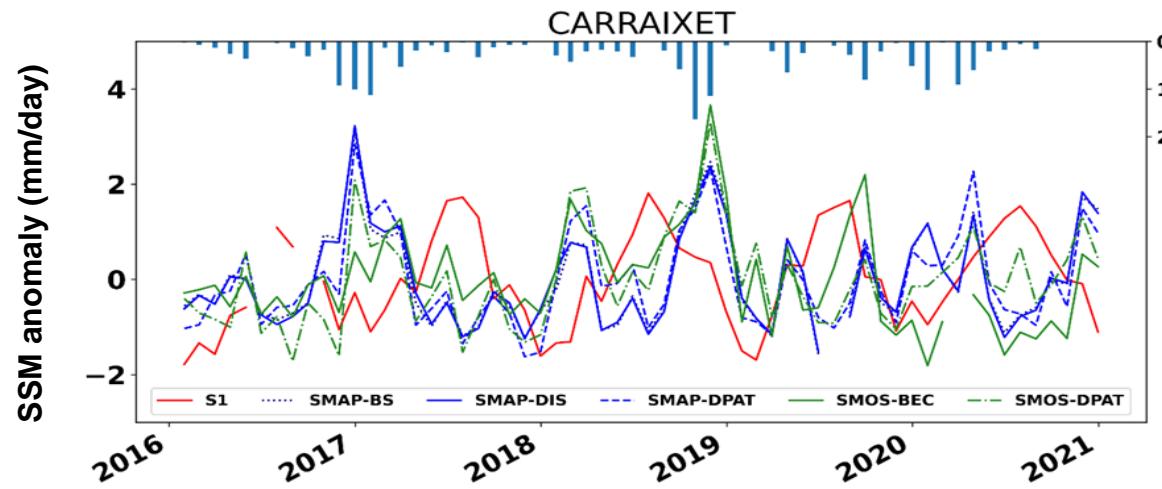
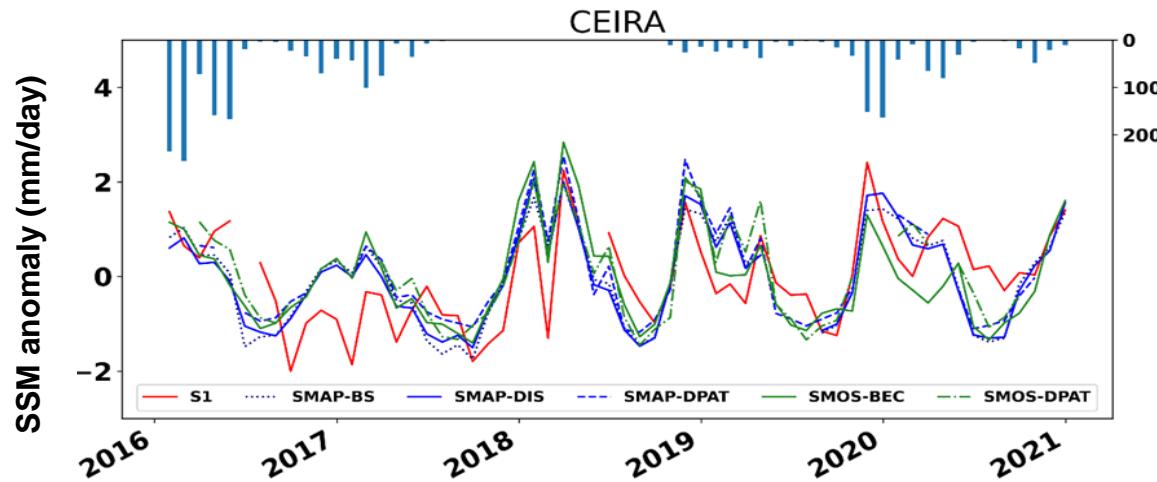
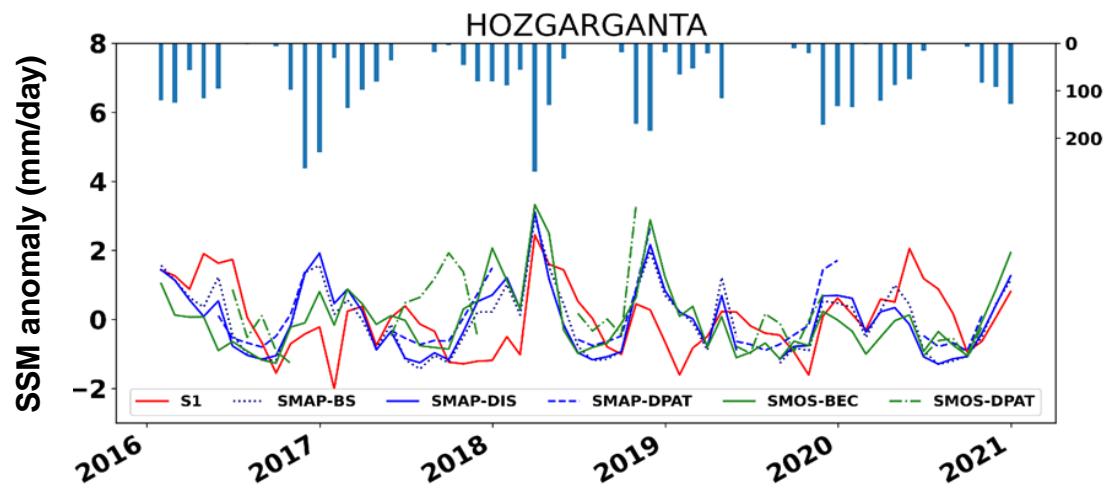
T (°C)	P (mm)	ETO (mm)
17.7 ± 0.4	826 ± 278	1212 ± 41



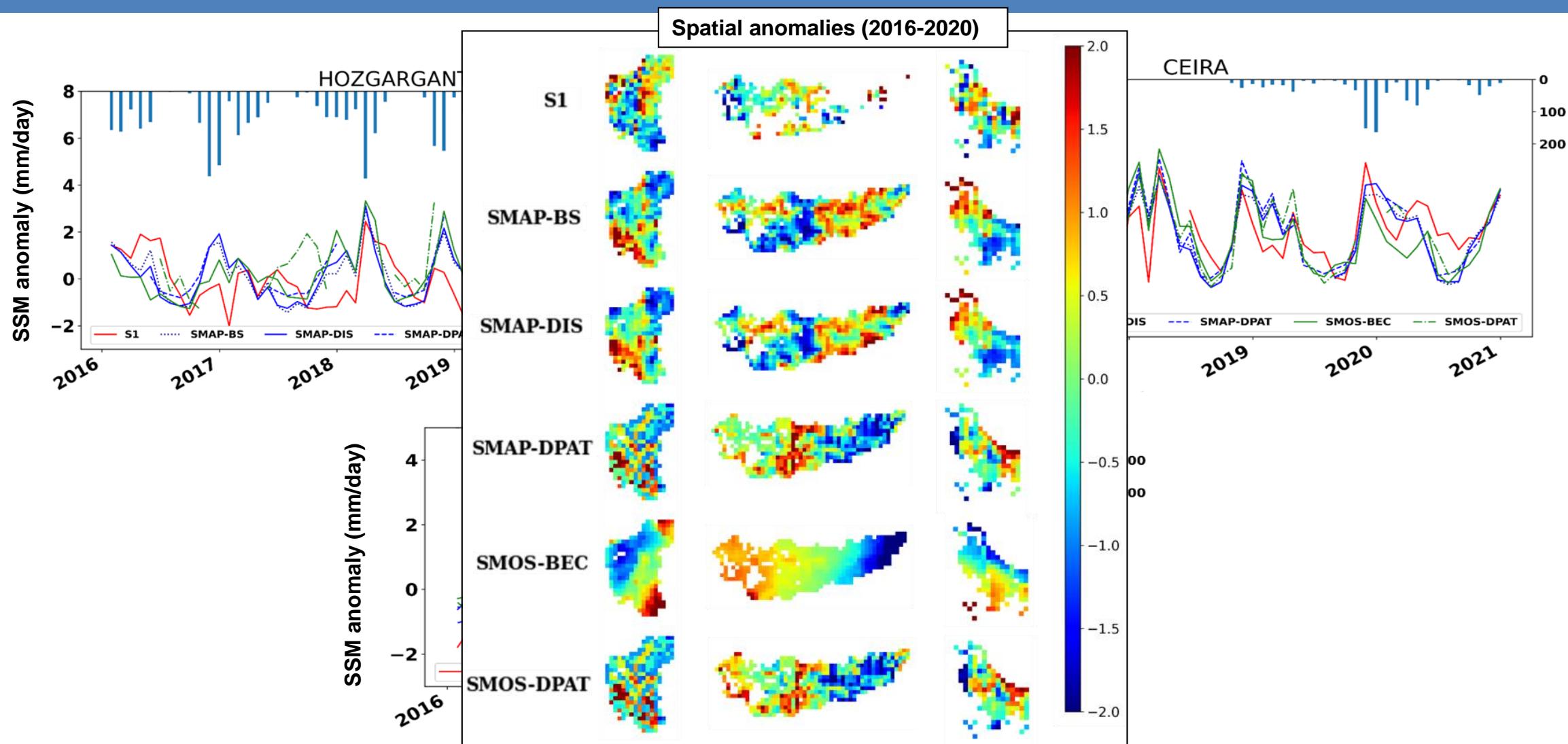
SSM is for first 5cm!

	Band	Spatial resolution	Retrieval method
Sentinel-1 (S1)	C	1 km	TU-Wien change detection method (Wagner, 1998)
SMAP/S1 (SMAP-BS & SMAP-DIS)	L+C	1 km	Passive (SMAP) + active (Sentinel-1) downscaling (Das et al., 2017)
SMOS-BEC	L	1 km	SMOS disaggregation using LST and NDVI (Piles et al., 2011-2012).
SMAP-Dispatch (SMAP-DPAT)	L	1 km	SMAP and SMOS disaggregation of SSM using the soil evaporative efficiency (SEE). LST and NDVI are used as inputs (Merlin et al., 2013).
SMOS-Dispatch (SMOS-DPAT)	L	1 km	

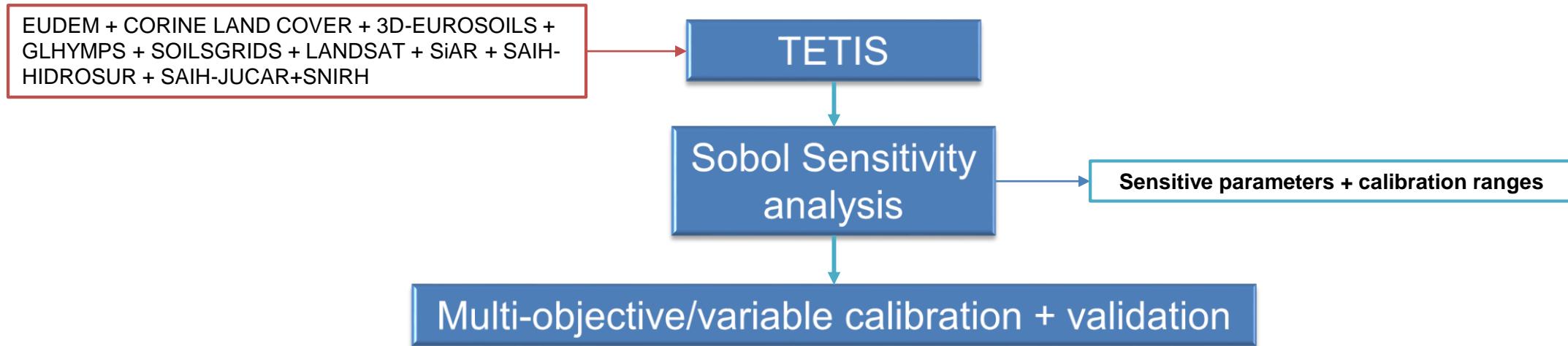
SSM products assessment



SSM products assessment



Multi-objective calibration (Q and SSM)



OF for Q:

$$NSE = 1 - \frac{\sum_{i=1}^n (Q_{si} - Q_{oi})}{\sum_{i=1}^n (Q_{oi} - \bar{Q}_o)}$$



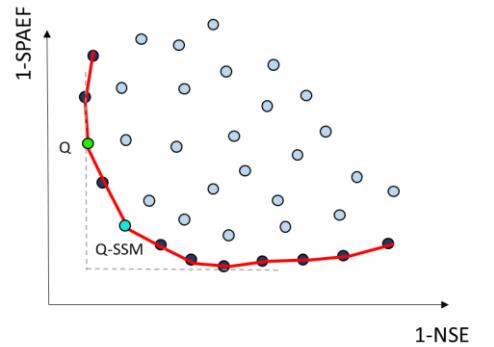
$$SPAEF = 1 - \sqrt{(\alpha - 1)^2 + (\beta - 1)^2 + (\gamma - 1)^2}$$

$$\alpha = \rho(\text{obs}, \text{sim}), \beta = \left(\frac{\sigma_{\text{sim}}}{\mu_{\text{sim}}} \right) / \left(\frac{\sigma_{\text{obs}}}{\mu_{\text{obs}}} \right) \text{ and } \gamma = \frac{\sum_{j=1}^n \min(K_j, L_j)}{\sum_{j=1}^n K_j}$$

- ✓ Hoz+Carraixet: 2016-2017 (CAL) + 2018-2019 (VAL)
- ✓ Ceira: 08-2015/07-2017 (CAL) + 03-2019/07-2020 (VAL)
- ✓ NSE (1day) + SPAEF (1month)
- ✓ TETIS is run in natural mode (250 m)

OF for satellite SSM:

MOSCEM-UA
(Vrugt et al. 2003)



- ✓ Optimum point: minimum Euclidean distance to the reference point

Multi-objective calibration (Q and SSM)

EUDEM + CORINE LAND COVER + 3D-EUROSOILS + GLHYMPS + SOILSGRID + LANDSAT + SiAR + SAIH-HIDROSUR + SAIH-JUCAR+SNIRH



OF for Q:

$$NSE = 1 - \frac{\sum_{i=1}^n (Q_{si} - Q_{oi})}{\sum_{i=1}^n (Q_{oi} - \bar{Q}_o)}$$

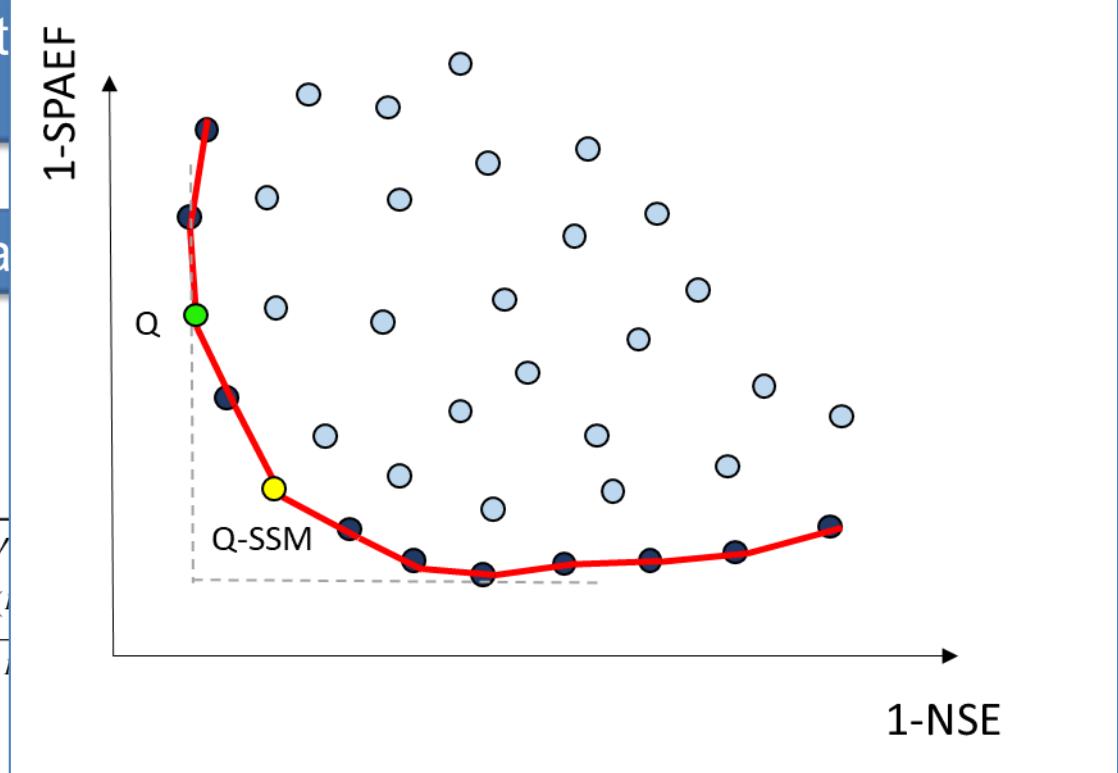


$$SPAEF = 1 - \sqrt{(\alpha - 1)^2 + (\beta - 1)^2 + (\gamma - 1)^2}$$

$$\alpha = \rho(\text{obs}, \text{sim}), \beta = \left(\frac{\sigma_{\text{sim}}}{\mu_{\text{sim}}} \right) / \left(\frac{\sigma_{\text{obs}}}{\mu_{\text{obs}}} \right) \text{ and } \gamma = \frac{\sum_{j=1}^n \min(Q_{sj}, Q_{oj})}{\sum_{j=1}^n Q_{oj}}$$

- ✓ Hoz+Carraixet: 2016-2017 (CAL) + 2018-2019 (VAL)
- ✓ Ceira: 08-2015/07-2017 (CAL) + 03-2019/07-2020 (VAL)
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OF for satellite SSM:



- ✓ Optimum point: minimum Euclidean distance to the reference point

Results: SSM products comparison

CALIBRATION

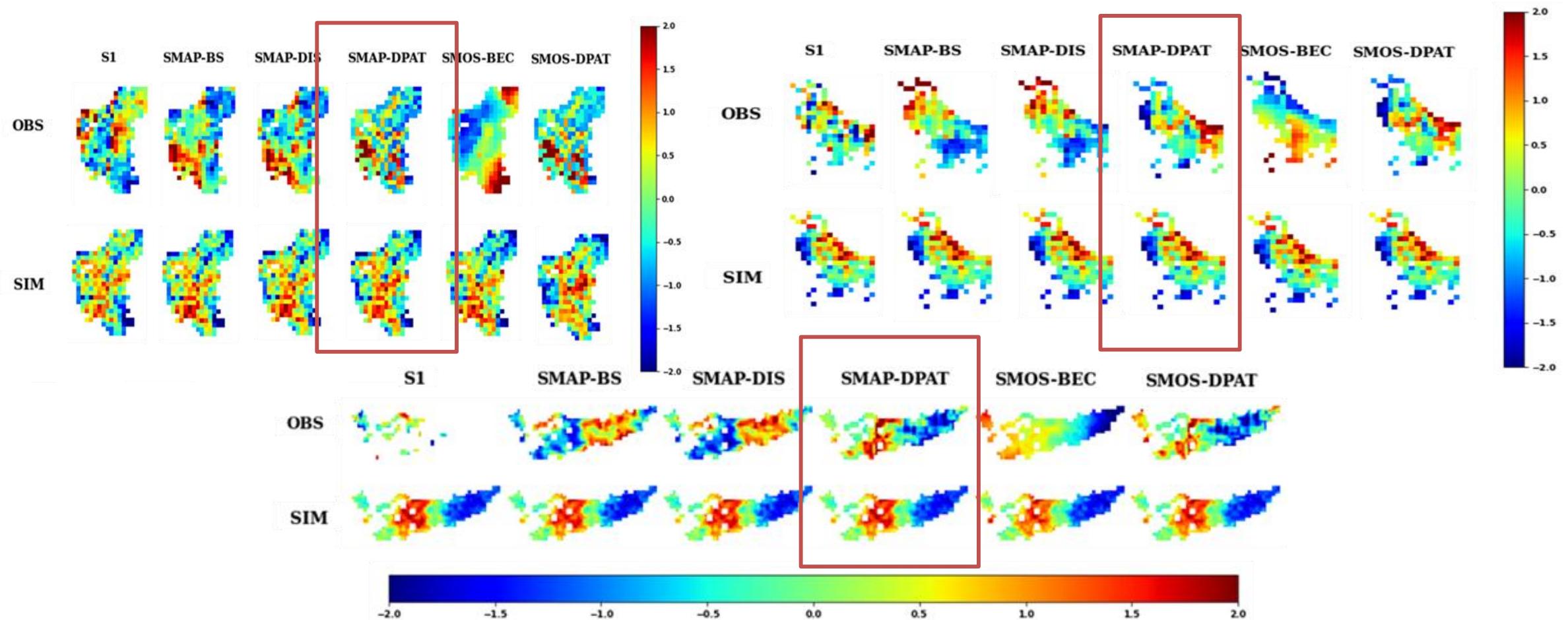
	HOZ			CEI			CAR		
	NSE	SPAEOF	R	NSE	SPAEOF	R	NSE	SPAEOF	R
S1	++	-	-	+++	++	-	++	+++	-
SMAP-DIS	+++	-	+++	+++	-	+++	++	+	+++
SMAP-BS	+++	+	++	+++	-	+	++	+	+++
SMAP-DPAT	+++	+	+++	++	+	+++	++	+++	+++
SMOS-BEC	+++	-	++	++	++	+++	+++	-	+
SMOS-DPAT	+++	+	-	++	++	+++	++	+++	++

VALIDATION

	HOZ			CEI			CAR		
	NSE	SPAEOF	R	NSE	SPAEOF	R	NSE	SPAEOF	R
S1	+	-	-	+	+	++	++	+++	-
SMAP-DIS	+++	-	+++	++	-	+++	+	+	+++
SMAP-BS	++	+	++	+	-	++	++	++	+++
SMAP-DPAT	++	+	++	++	+++	+++	+	+++	+++
SMOS-BEC	+	+	+++	+	+	++	++	-	++
SMOS-DPAT	++	-	+	++	+++	++	+	+++	++

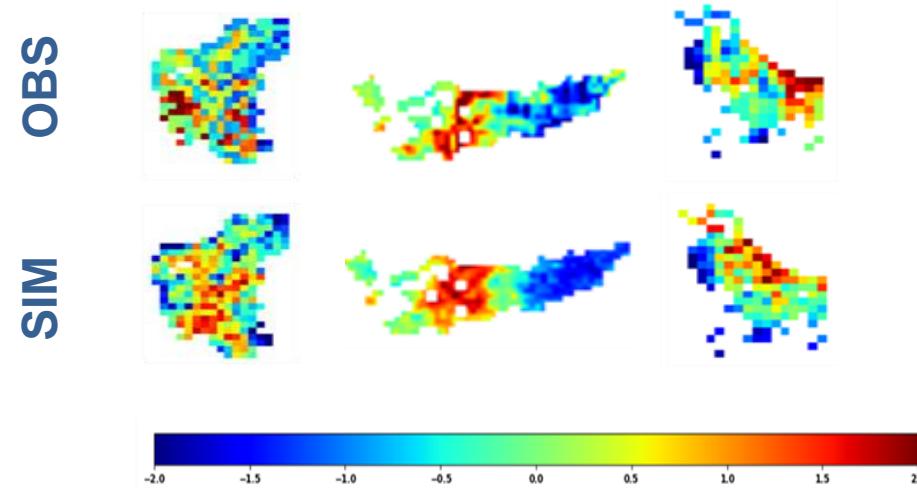
Results: SSM products comparison

Spatial anomalies Validation

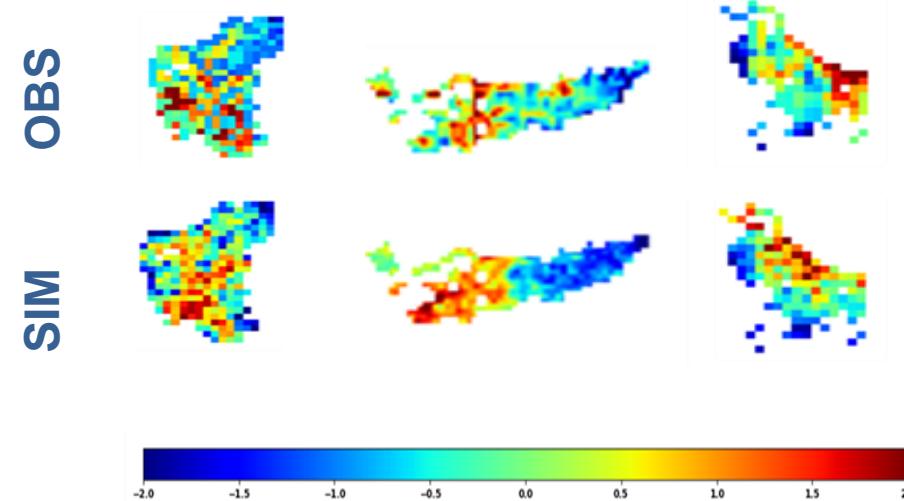


Spatial anomalies

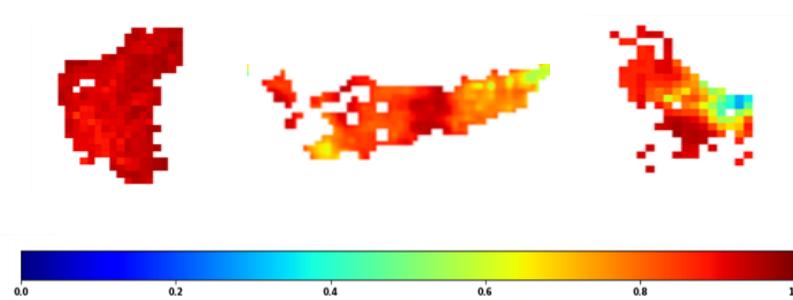
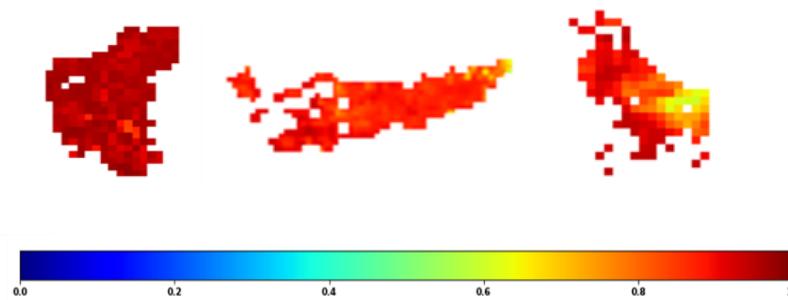
CALIBRATION



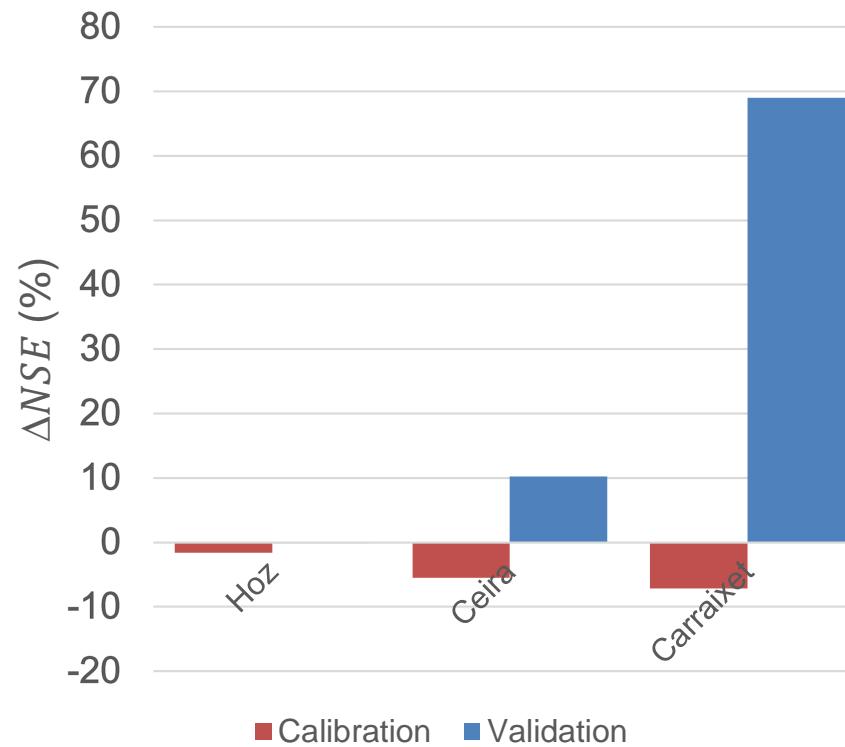
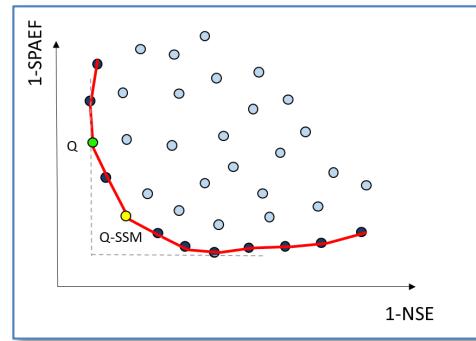
VALIDATION



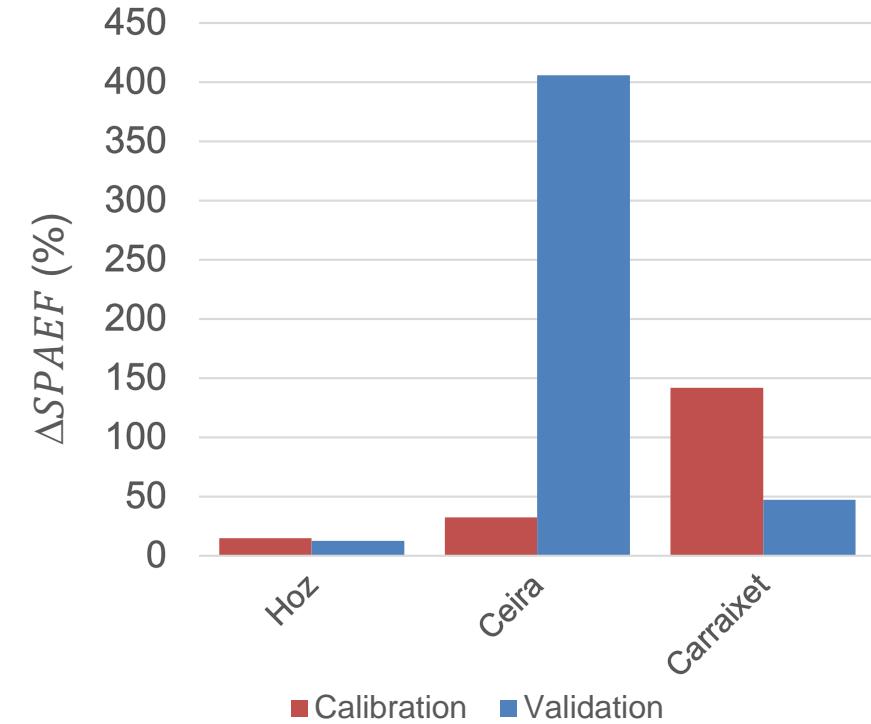
Temporal correlation



Results: influence of SSM



$$\Delta NSE = \frac{NSE_{Q-SSM} - NSE_Q}{NSE_Q}$$



$$\Delta SPAEF = \frac{SPAEF_{Q-SSM} - SPAEF_Q}{SPAEF_Q}$$

- We found **significant differences** in **temporal and spatial dynamics** of **SSM** products
- **Best SSM products** can be identified by the **spatial agreement** with **eco-hydrological modelling** estimates
 - **SMAP-Dispatch** provided the best spatial agreement with TETIS in the 3 study cases
- **Multi-objective calibration** (Q and SSM) in eco-hydrological modelling

