



# The use of H SAF soil moisture products for event-based hydrological modelling in Liguria (north of Italy)

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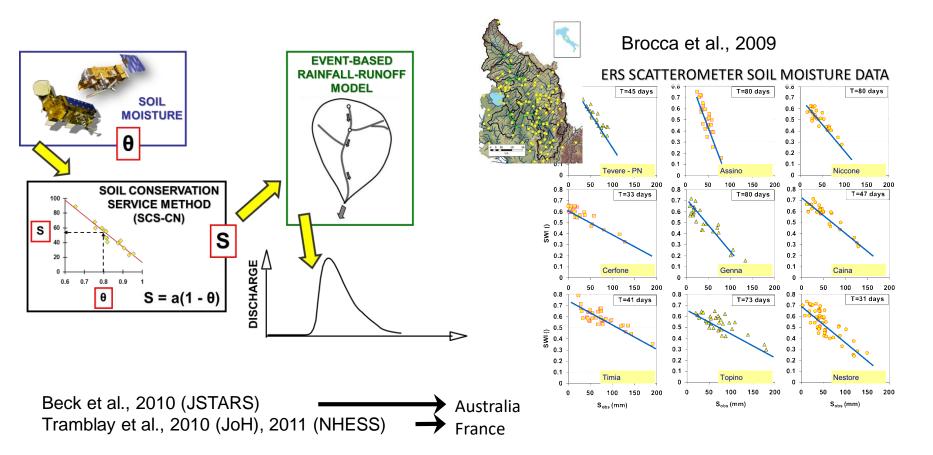
# Objective

Investigate whether satellite data can improve soil moisture estimation for operational hydrological forecast purposes in Liguria, particularly given the lack of soil moisture ground sensors





# Objective







#### CMI – ARPAL

• The <u>Clima – Meteo – Hydro operative unit</u> of the Regional Environmental Protection Agency of Liguria (CMI – ARPAL) is the institutional regional office working for flood forecast and for <u>operational meteo-hydrological alert</u>. It has been working since 1995 concurring to design the system of the regional Functional Centres for Civil Protection, concluded with the publication of the Italian law DPCM 27/02/2004.

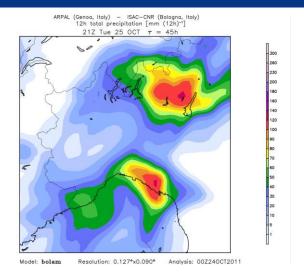
#### Some numbers

... about office: 8 hydrologists, 10 meteorologists, 10 technicians for observational network, software and hardware maintenance, 1 manager ... about job: daily meteorological and hydrological forecast, in-event monitoring, discharge measurements, publication of the hydrological time series, maintenance and development of the operative instruments, meteorological and hydrological models, hydro-meteorological public disclosure





Meteorological evaluation on the models on the window of the next 48-72h on the Liguria, quantifying QPF (Quantitative Precipitation Forecast) on warning areas

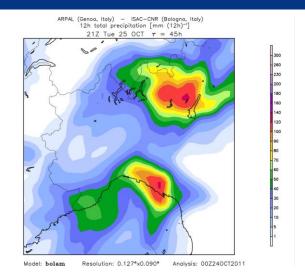






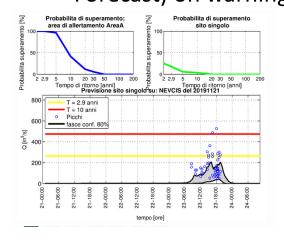
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Disaggregation (RainFarm)

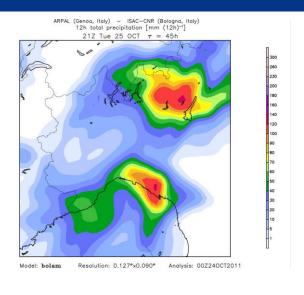




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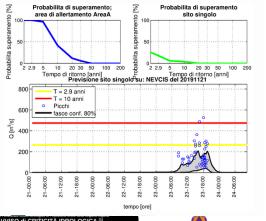


Evaluation of the **hydrological response** of ligurian rivers to rainfall, mainly supported by the event-based hydrological model DRiFt

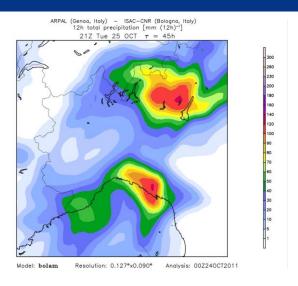




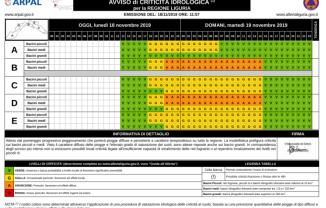
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Evaluation of the hydrological response of ligurian rivers to rainfall, mainly supported by the event-based hydrological model **DRiFt** 





(RainFarm)

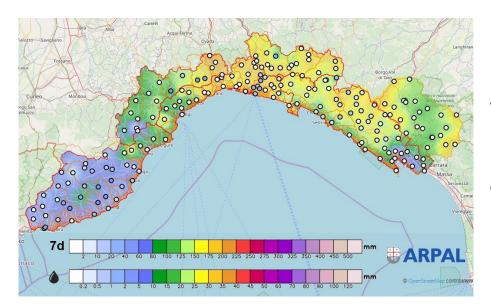
Evaluation of the hydrogeological alert on warning areas







#### DRiFt initialization with CPI method



$$H = \sum_{t=1}^{D} h_t e^{\alpha t} \qquad \forall pluviometer$$

Weighted precipitation, spatially interpolated on the DRiFt model domain and related to  $V_{max}(CN)$ , provides the initial condition of the soil saturation degree for the model

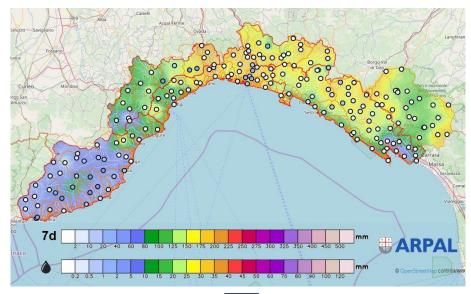
- *t*: antecedent day [days]
- *D*: antecedent period duration [days]
- $h_t$ : cumulated precipitation [mm] during the last 24 h of day t
- $\alpha$ : exponential decay factor [1/day]

D,  $\alpha$  variable on spatial and temporal scale (season, warning areas)

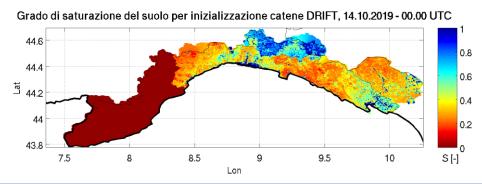




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$$\triangle$$



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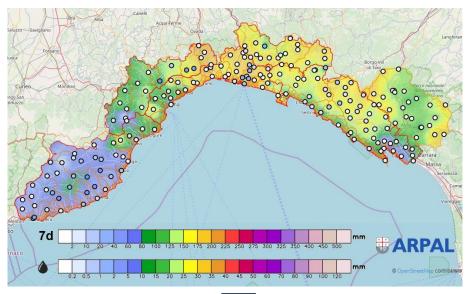
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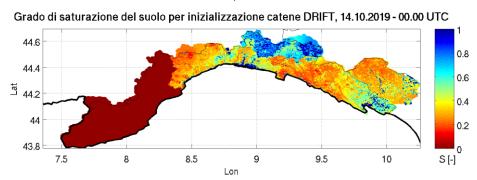




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D,  $\alpha$  variable on spatial and temporal scale (season, warning areas)

Can HSAF soil moisture satellite data improve DRiFt initialization?
Are they a valid alternative?

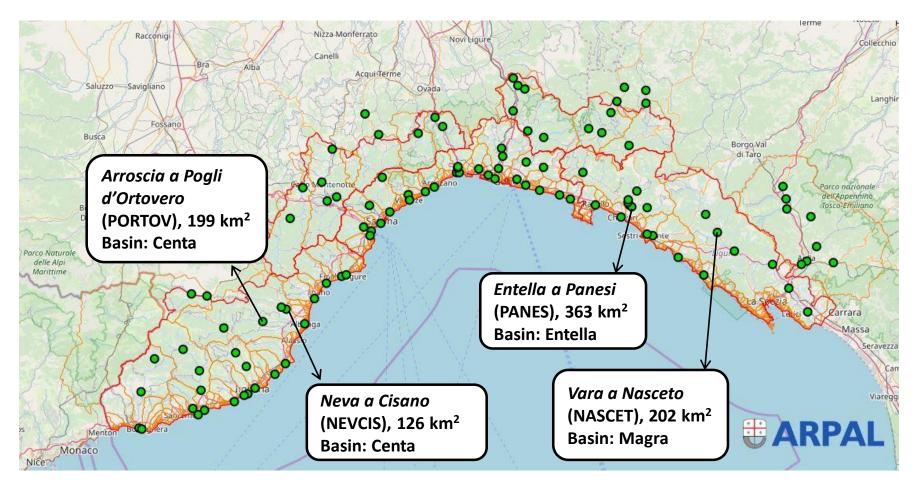






# Study area

#### Modelled cross sections selected as study case





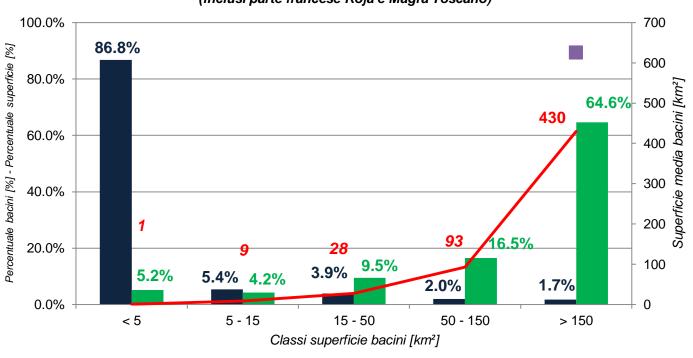


# Study area

#### **Bacini Liguria**

(inclusi parte francese Roja e Magra Toscano)

Drainage areas
vs.
spatial
resolution of satellite data









#### **Events**

#### **Autumn**

03/11/2012 09/11/2012 20/10/2013 24/12/2013 07/10/2014 03/11/2014 10/11/2014 14/11/2014 19/11/2016 22/11/2016 10/12/2017 25/12/2017 09/10/2018 27/10/2018 31/10/2018

**Spring** 07/06/2011 14/05/2013

#### Winter

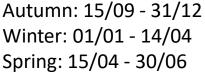
03/01/2014 15/01/2014 06/02/2016 27/02/2016 03/03/2016 02/02/2017 09/03/2018 14/03/2018 31/01/2019 02/04/2019 31/01/2019

**Summer** 12/09/2015 03/09/2011

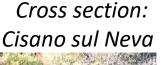


Cross section:
Panesi





Summer: 01/07 - 14/09









## Best SO

DRiFt model

Output hydrographs

Select best fits --- S0 cost





## Best SO

$$S0 = 0:0.01:1$$

**\** 

DRiFt model



Output hydrographs



Select best fits —— S0 cost

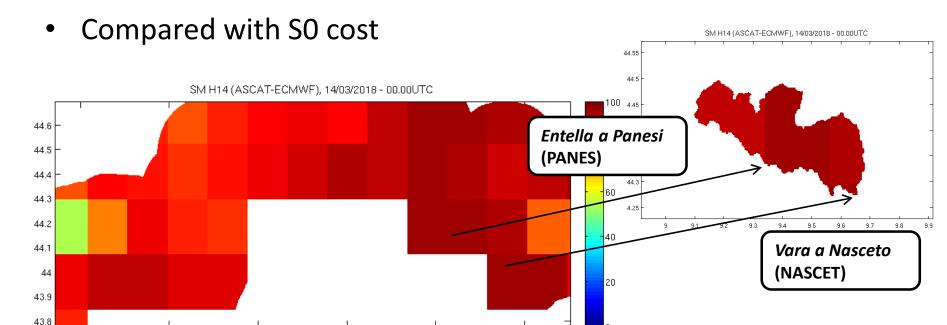




# SM H14 (ASCAT-ECMWF)

8.5

- H14 pre-processed to obtain layers 0-7 cm and 0-28 cm from the surface – obtain values comparable with operational model input
- Masked on the selected basin drainage areas daily maps extracted from the time series





7.5



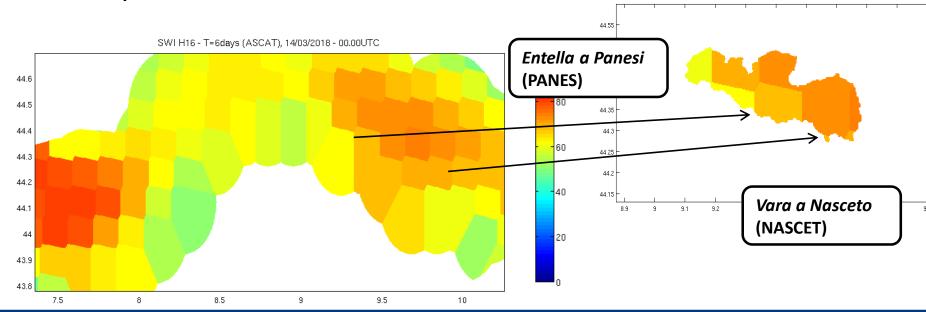
10

9.5

# SWIT6 H16 (ASCAT)

- H16 pre-processed with exponential filter to obtain SWI obtain values comparable with operational model input
- Masked on the selected basin drainage areas maps composed with the SWI values detected between initialization DRiFt model date and 48 hours before

Compared with S0 cost

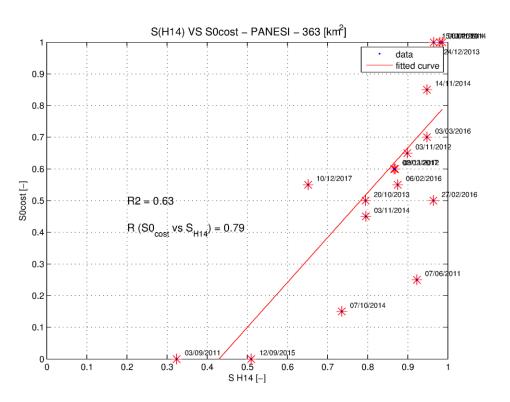






SWI H16 - T=6days (ASCAT), 14/03/2018 - 00.00UTC

# Regression curves



SO cost vs. satellite data-derived S

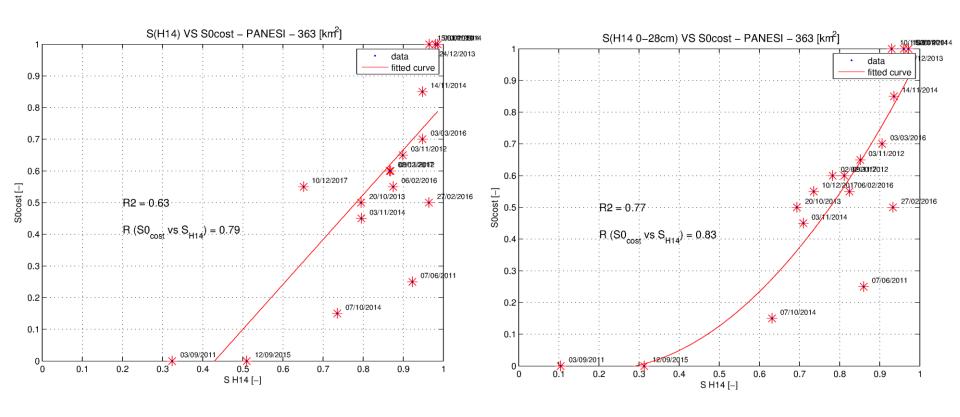


1° or 2° order polynomial relationship





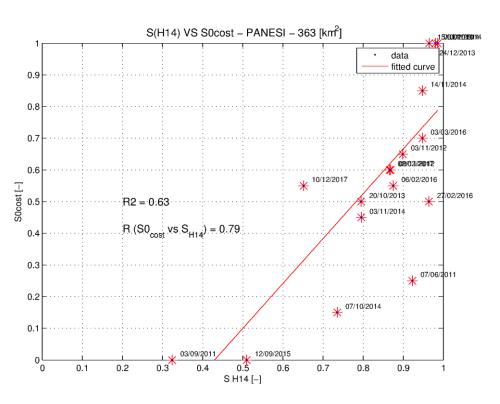
# Regression curves

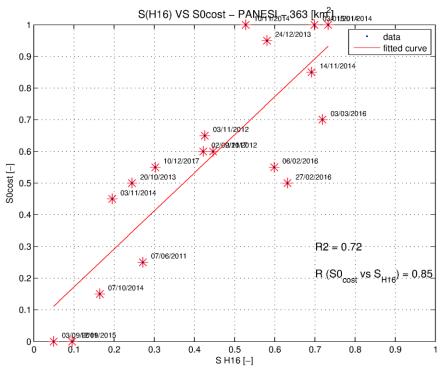






# Regression curves

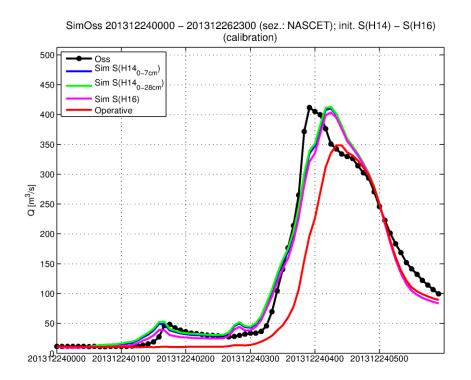


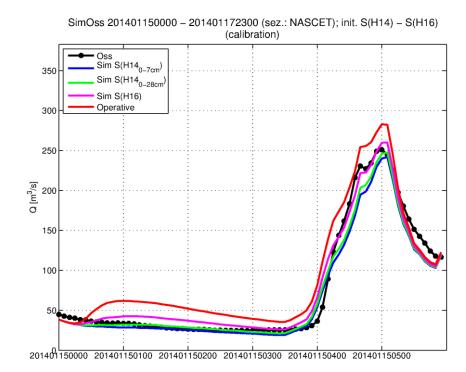






## Results – events in calibration

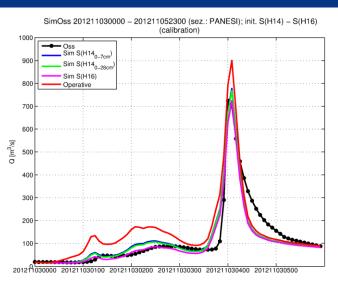


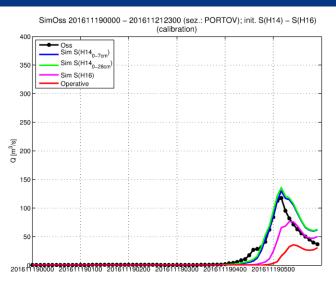


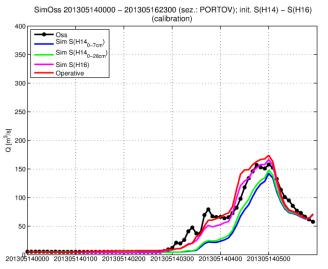


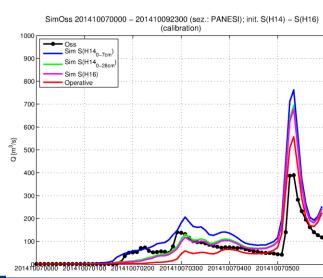


# Results – events in calibration





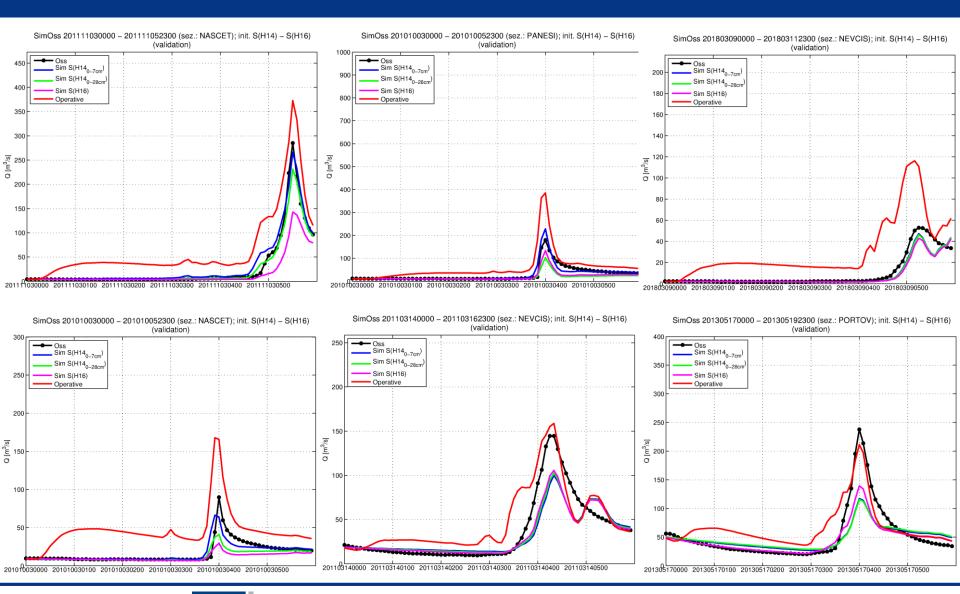








## Results – events in validation







#### **GOF** criteria

PBIAS  $[-\infty; +\infty]$ 

$$PBIAS = 100 * \frac{\sum_{i=1}^{n} (Sim_i - Oss_i)}{\sum_{i=1}^{n} Oss_i}$$

Nash-Sutcliffe  $[-\infty;1]$ 

$$NSE = 1 - \frac{\sum_{i=1}^{n} (Sim_i - Oss_i)^2}{\sum_{i=1}^{n} (Oss_i - \overline{Oss})^2}$$

MAE  $[0; +\infty]$  m<sup>3</sup>/s

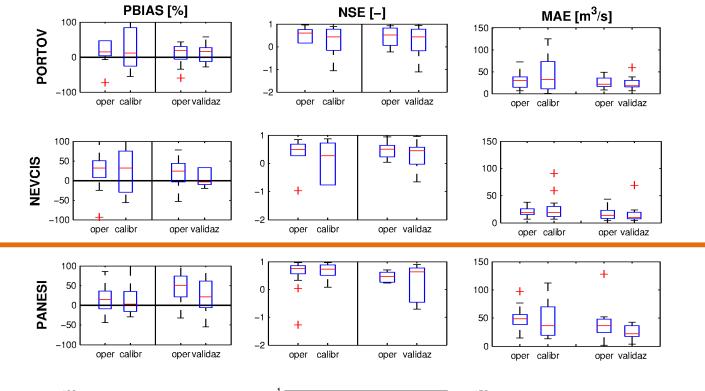
$$MAE = \frac{\sum_{i=1}^{n} |Sim_i - Oss_i|}{n}$$



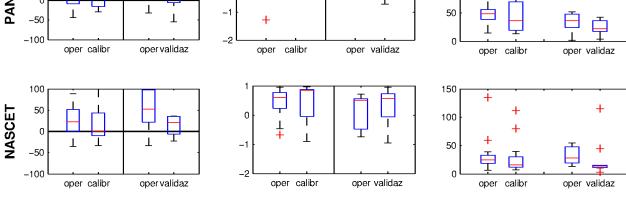


# GOF init. SM H14 (layer 0-7cm)

WEST modelling sections



EAST modelling sections





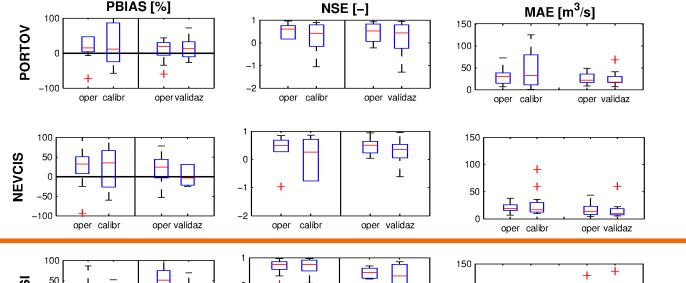




# GOF init. SM H14 (layer 0-28cm)

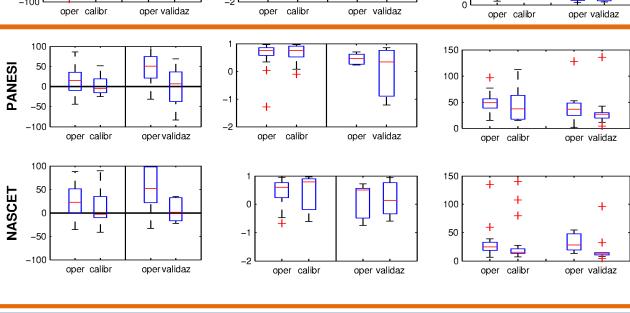
PBIAS [%]

WEST modelling sections



NSE [-]

**EAST** modelling sections







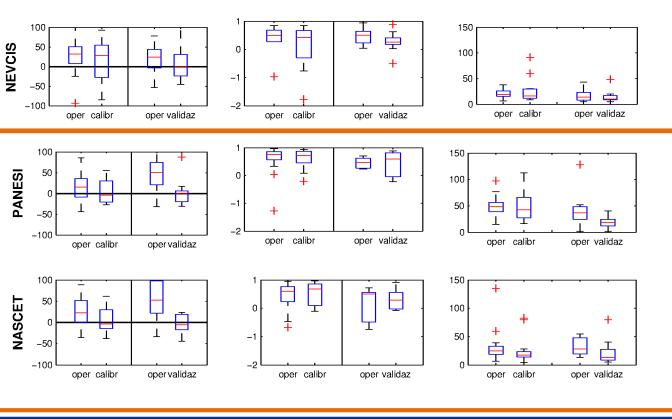


## GOF init. SWI T6 H16

WEST modelling sections PORTOV

PBIAS [%] NSE [-] MAE [m<sup>3</sup>/s] 150 100 50 -100 oper calibr oper validaz oper calibr oper validaz oper calibr oper validaz 150 50 100 -1 50

EAST modelling sections









#### Further remarks

- Operational aspects: few study cases (4 basins) vs need to achieve satisfactory results on several cross sections, many of which not provided with observations
- DRiFt is event-based, cannot compare time series of satellite data with modelled time series of S, as in continuous models



#### Outlook

- Consider further research with use of higher resolution data - when available – and keep a distributed initial moisture instead of SO
- 2. CN-derived SO (from observed P and R)
- 3. Deeper seasonal analysis is there a clear seasonal trend?
- 4. Install ground station for satellite data validation



### Conclusions

- Potential to improve SM estimation for model initialization, but limitation related to spatial data availability for H14 and temporal for H16, which hinder operative use.
  - This limitation may be solved in case of future HSAF SM data distribution with finer spatial resolution (need for further investigation)
- Satellite data alone can not provide an alternative to operational CPI model initialization, but it could be used to correct it
- Useful for other hydrological evaluations during the operative phase, too, not only for the purely modelling aspect







# Thank you for your attention

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