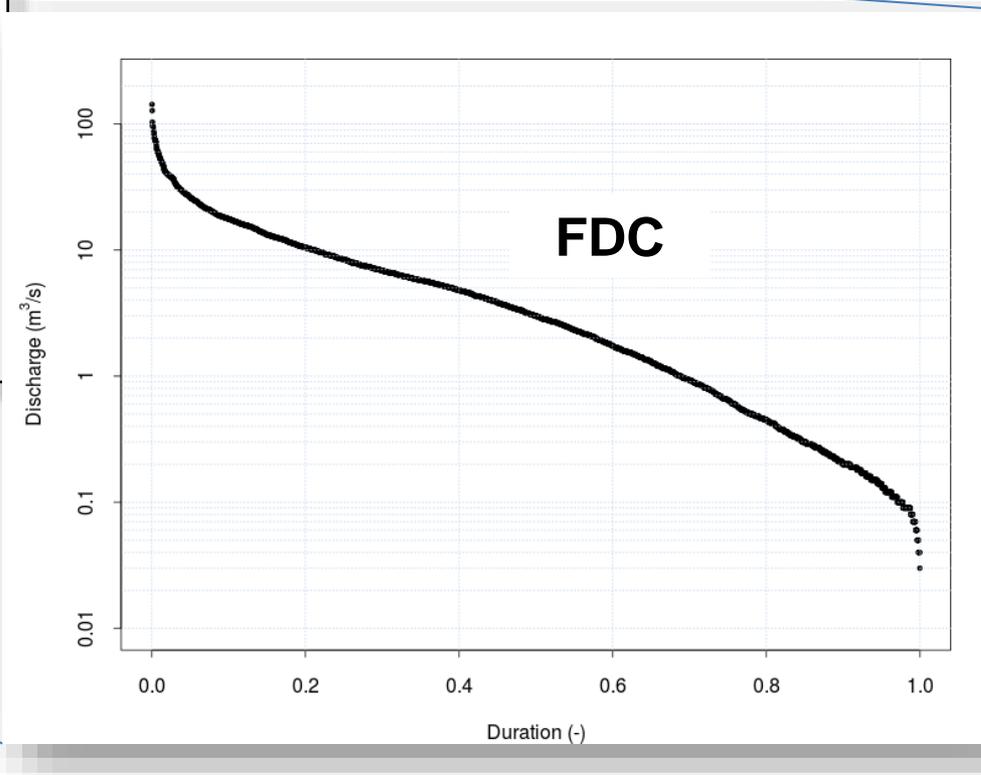
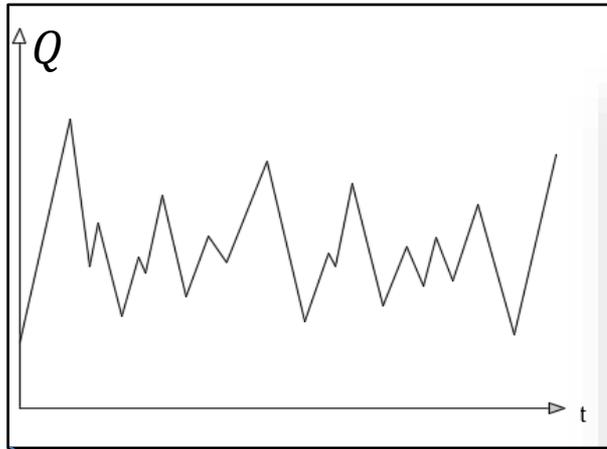


# SWOT Mission Capabilities for the Prediction of Flow-Duration Curves: A Global Scale Assessment

Alessio Domeneghetti, Alessio Pugliese, Attilio Castellarin  
and Armando Brath

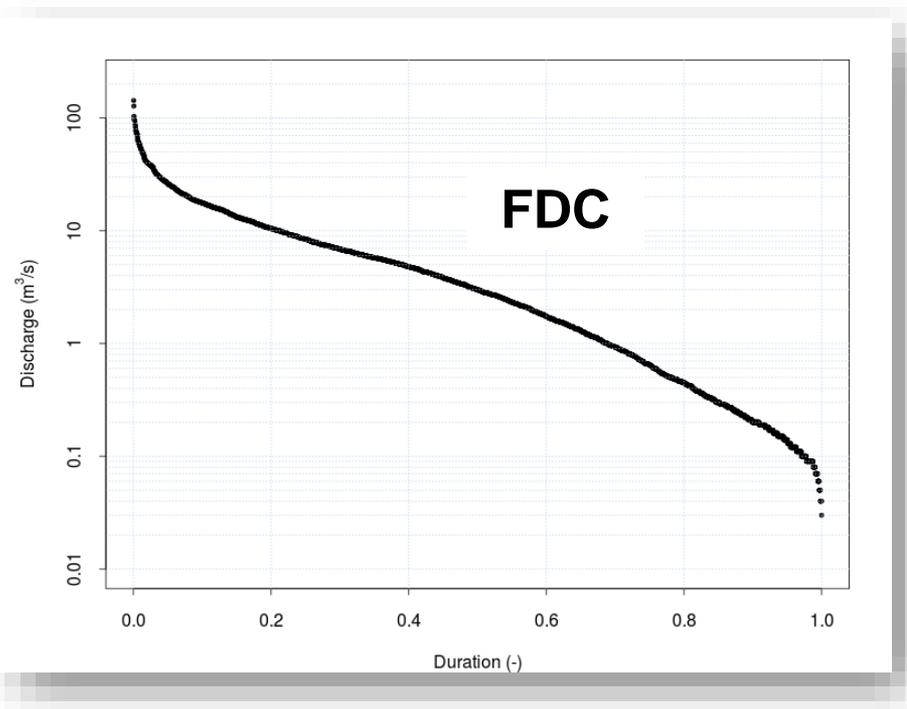
DICAM – Dep. of Civil, Chemical, Environmental and Materials Engineering  
*Alma Mater Studiorum - University of Bologna, Italy*

# Flow Duration Curves (FDCs)



A Period of Record Flow-Duration Curve (POR FDC) represents the percent of time (duration) in which a given streamflow  $Q^*$  is equaled or exceeded ( $Q$  vs. %time  $\geq Q^*$ ) over an historical period of time (Vogel and Fennessey, 1994).

# Flow Duration Curves (FDCs)



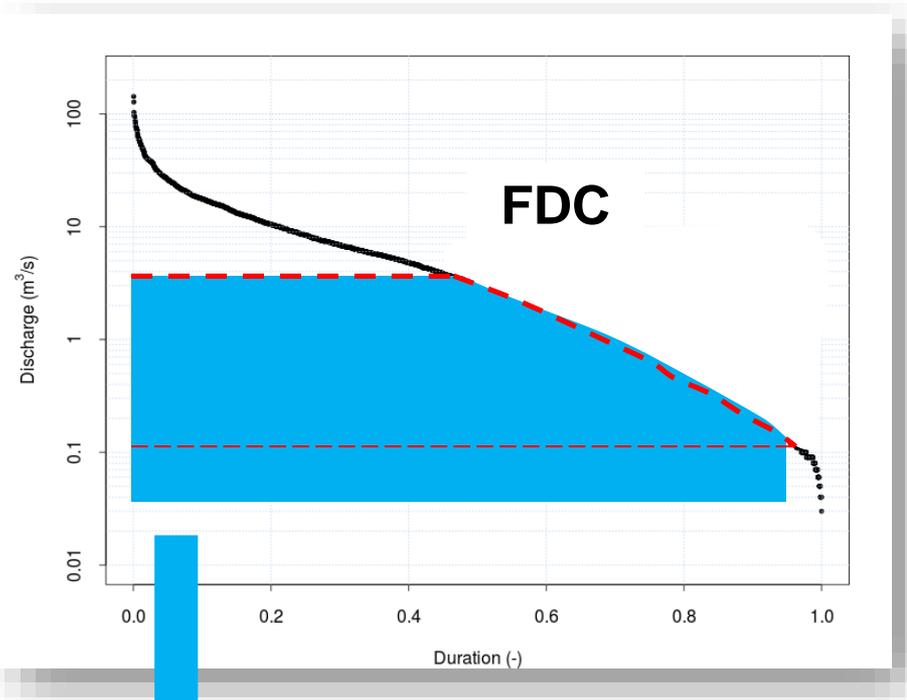
- Reservoir management and optimisation



(Ridracoli Dam, Emilia-Romagna, Italy)

- *Hydropower*
- *Irrigation*
- *Drinking water*
- *...others*

# Flow Duration Curves (FDCs)



Total water volume exploited for hydro-power production

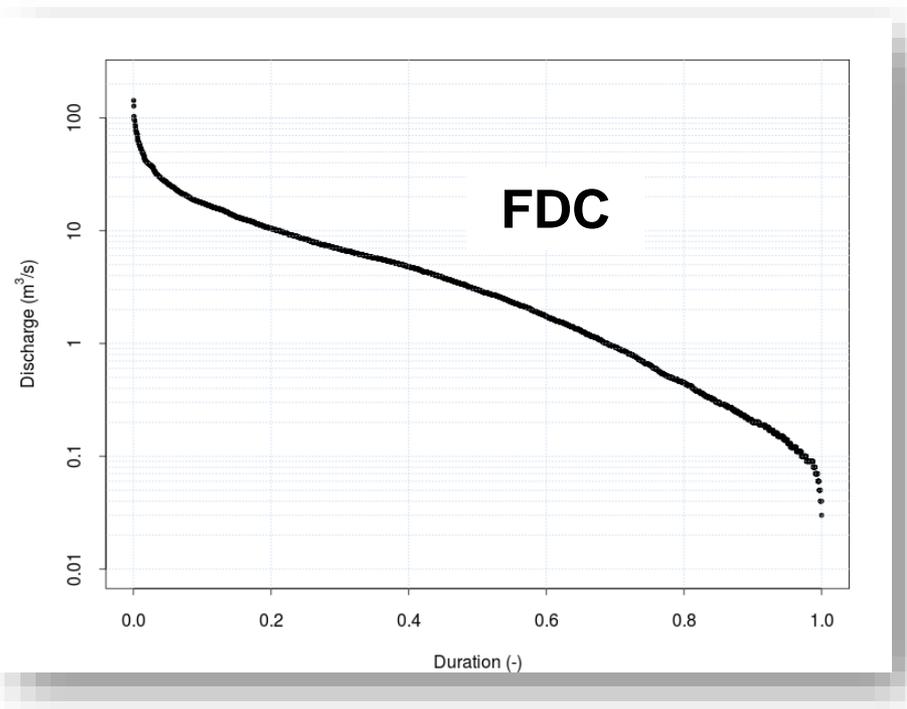
- Reservoir management and optimisation



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- *Hydropower*
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# Flow Duration Curves (FDCs)

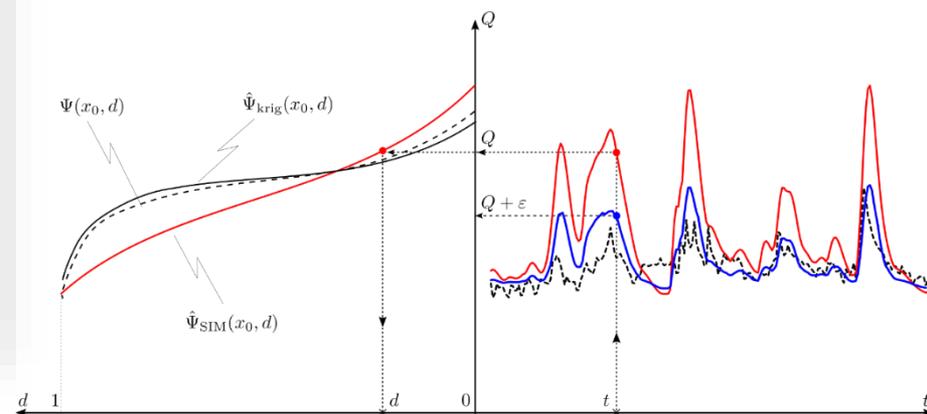


- Streamflow series reconstruction in ungauged locations

(Smakhtin & Masse, *HYP*, 2000)

(Farmer et al, *HESS*, 2018)

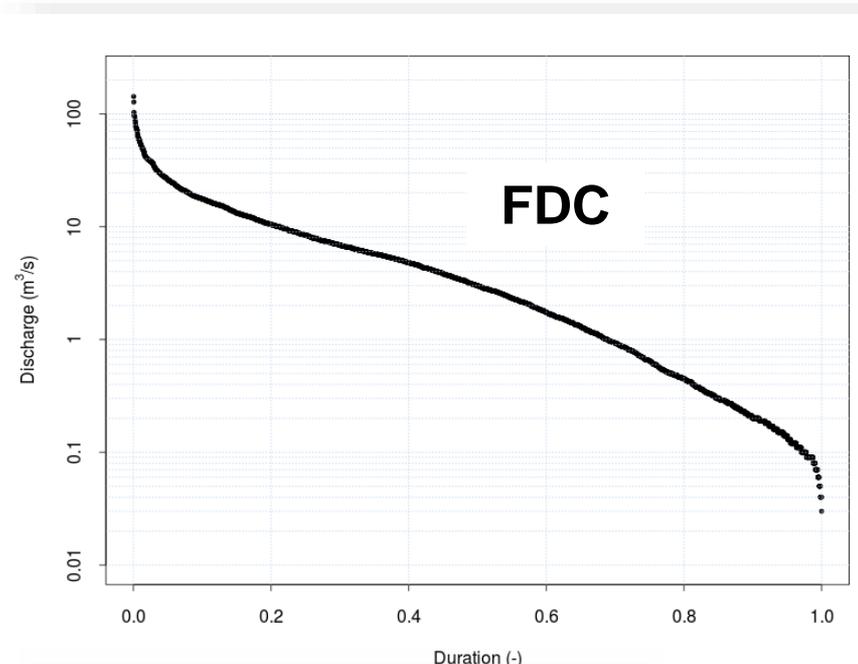
(Pugliese et al., *HESS*, 2018)



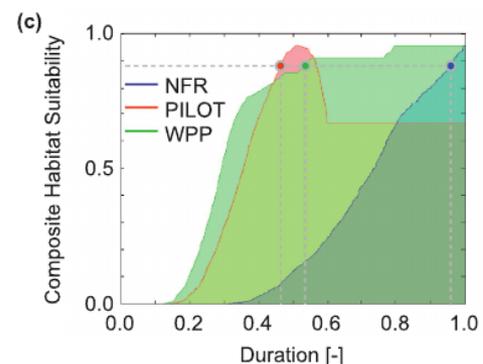
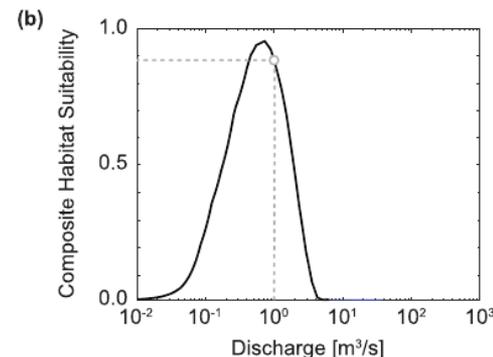
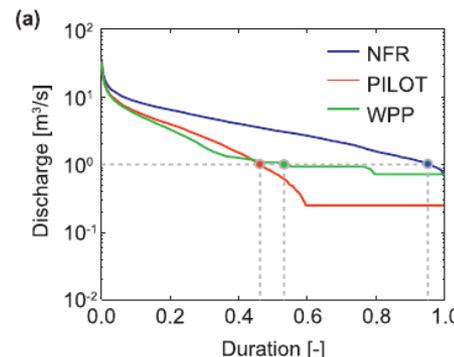
Pugliese, A., Persiano, S., Bagli, S., Mazzoli, P., Parajka, J., Arheimer, B., Capell, R., Montanari, A., Blöschl, G., Castellarin, A., 2018. A geostatistical data-assimilation technique for enhancing macro-scale rainfall-runoff simulations. *Hydrol. Earth Syst. Sci.* 22, 4633–4648. <https://doi.org/10.5194/hess-22-4633-2018>

Farmer, W. H., Over, T. M., and Kiang, J. E.: Bias correction of simulated historical daily streamflow at ungauged locations by using independently estimated flow duration curves, *Hydrol. Earth Syst. Sci.*, 22, 5741-5758, <https://doi.org/10.5194/hess-22-5741-2018>, 2018.

# Flow Duration Curves (FDCs)

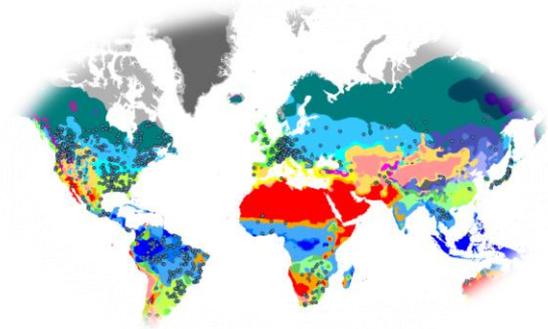


- Eco-Habitat Suitability
- Environmental flow requirements



(Ceola et al., AWR, 2018)

# Global scale prediction of FDCs



## Research questions:

1. Are SWOT data capable to compensate the lack of streamflow records in remote areas/ungauged basins?
2. How well the SWOT mission can contribute to handle the request of FDCs from practitioners where streamflow measurements are missing?
3. Is SWOT lifetime suitable for FDC estimation?
4. How much climatic patterns might influence satellite-based FDCs?

# The SWOT mission

NASA/CNES - CSA/UKSA

**SWOT** (Surface Water and Ocean Topography)

- **Data quality**

Main scientific goals:

- ❖ 90% coverage of terrestrial surface water (oceans, rivers, lakes):

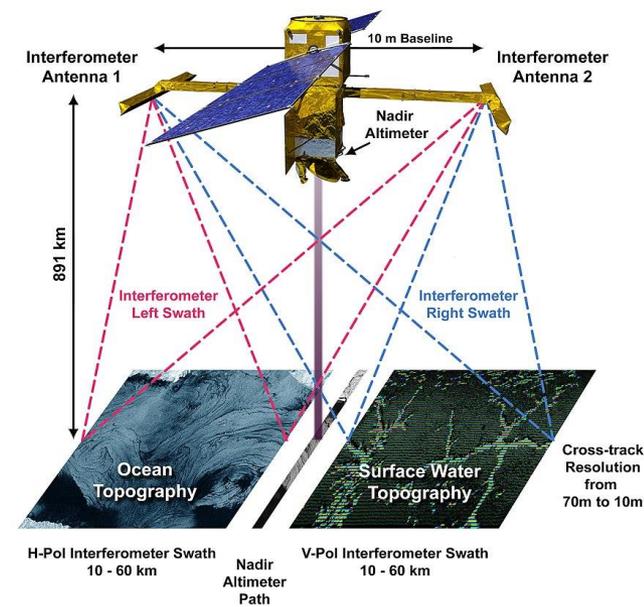
Hydrological data from radar images for rivers with  $w \geq 100$  m (hopefully 50 m)

1. water surface elevations;
2. surface profile slope;
3. water surface area;



River discharge estimation algorithms

**Streamflow series  $Q(t)$**



Credit: Yeosang Yoon with images from NASA

The expected river discharge errors are(\*):

< 35% RRMSE

(Durand et al. 2016, WRR)

(\* non-braided rivers)

# The SWOT mission

## • Data frequency

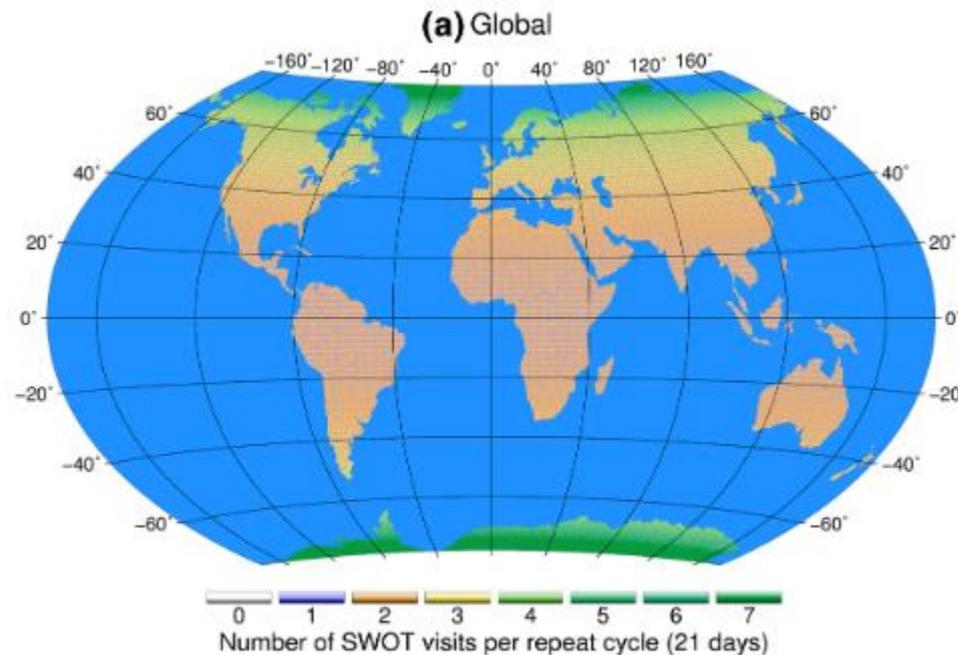
SWOT spatial coverage and revisit times per orbit repeat period (~21 days) depend on orbit characteristics, instrument swath width, nadir gap width and the latitude (Biancamaria et al., 2016).

SWOT would observe most areas between 2 and 8 times over each 21-day period, depending on distance from the equator

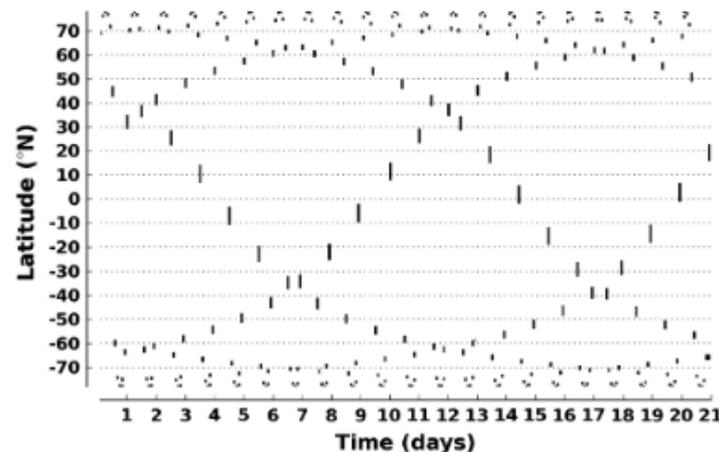
In the analysis we consider:

- 1 observations/10 days
- 3 yrs. time frame (mission lifetime)

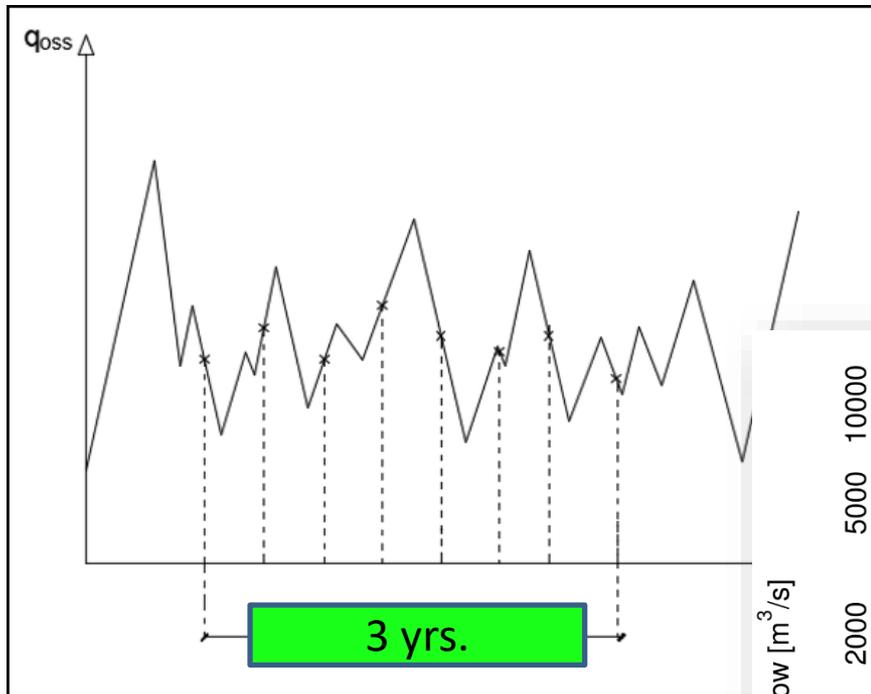
Credit: Biancamaria et al., 2016



Credit: Biancamaria et al., 2016

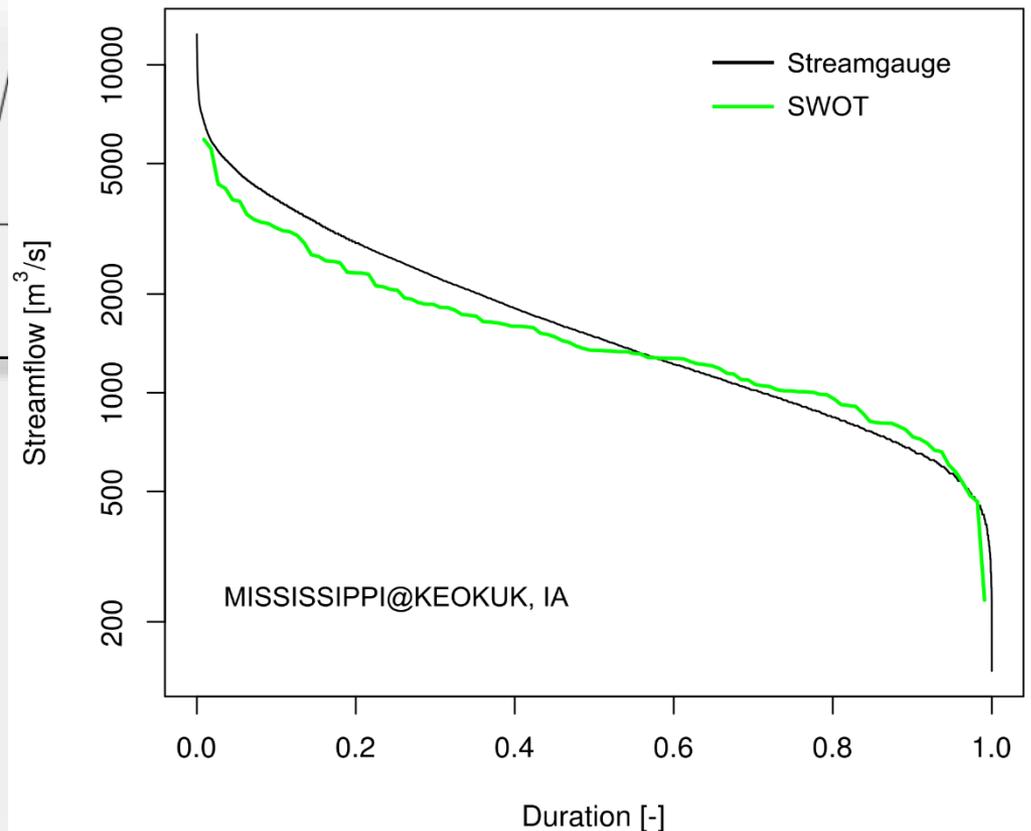


# SWOT FDCs estimates



In order to assess SWOT capabilities multiple realizations of the curve during the period of record of a given streamgauge are needed to understand what can be “seen” from the satellite.

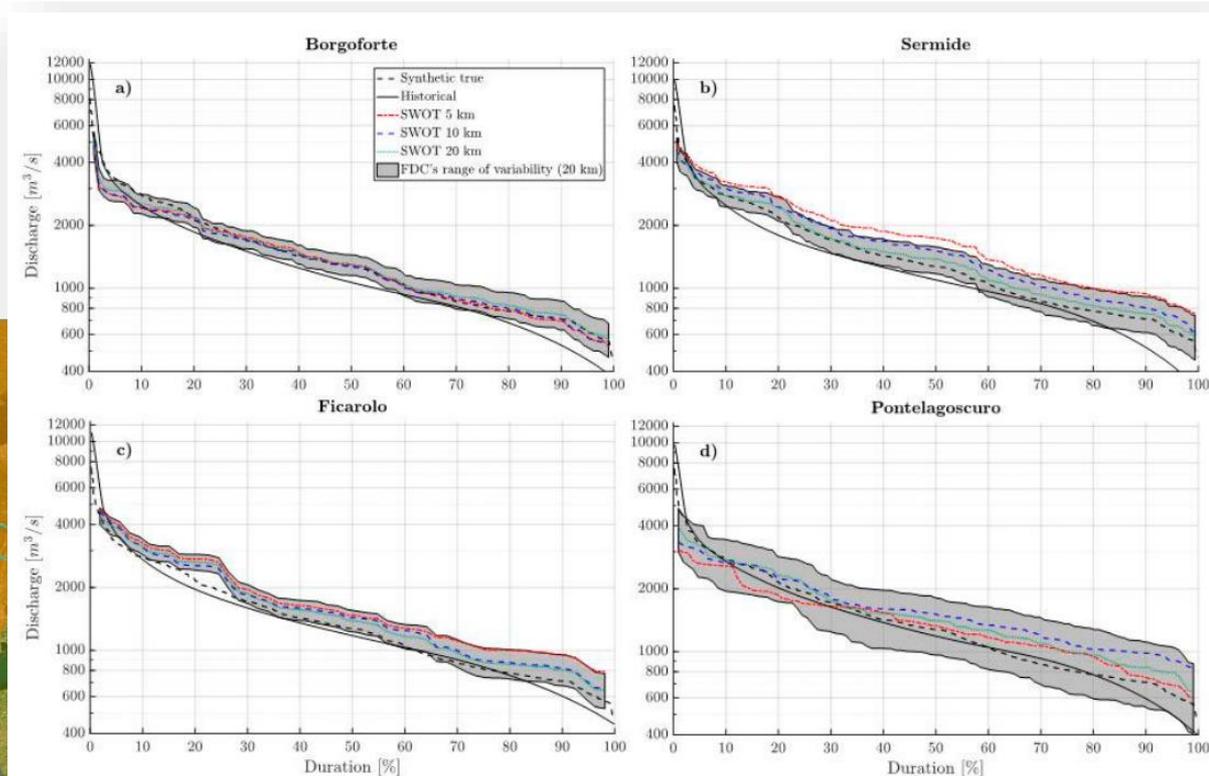
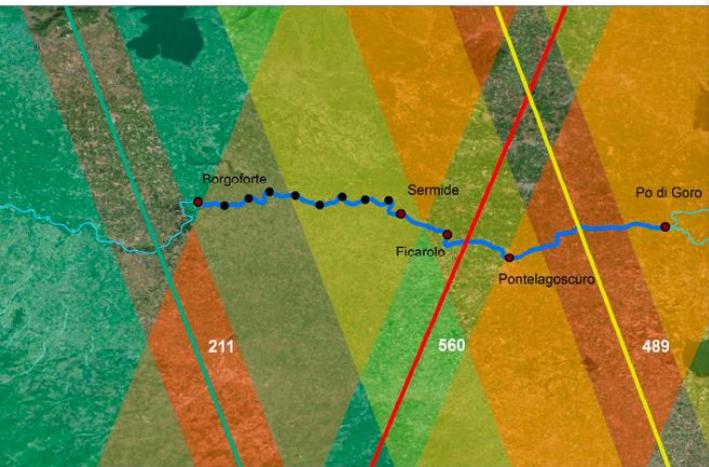
How well 3 yrs. of SWOT observations will perform compared to streamgauge ones for predicting empirical FDCs?



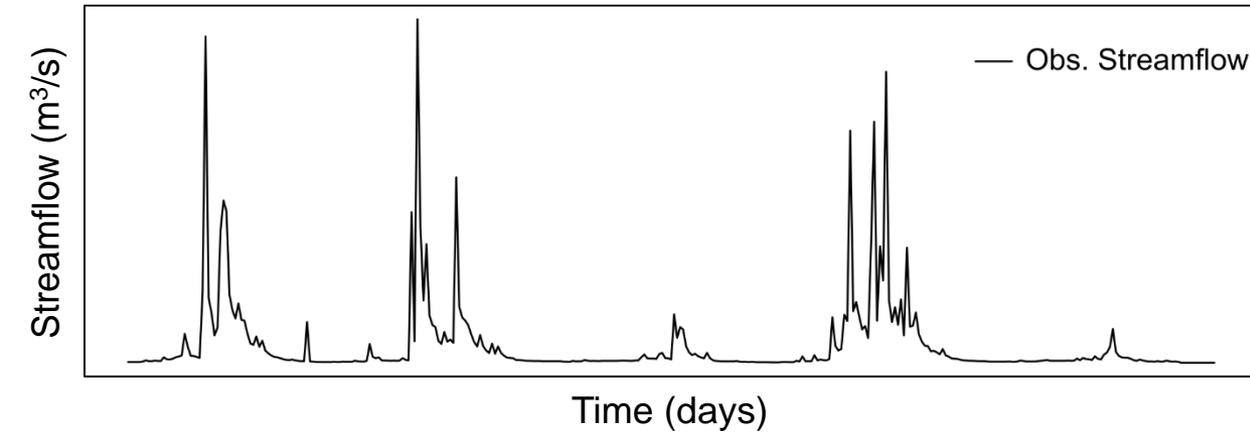
# Pioneer study at local scale on the Po river, Italy

- considers the mission lifetime (3 yrs)
- 3 satellite orbits (i.e., 211, 489, 560) in the Po River, Italy
- Higher errors are obtained at the FDC tails, where very low or high flows have lower likelihood of being observed

(Domeneghetti et al., RS, 2018)

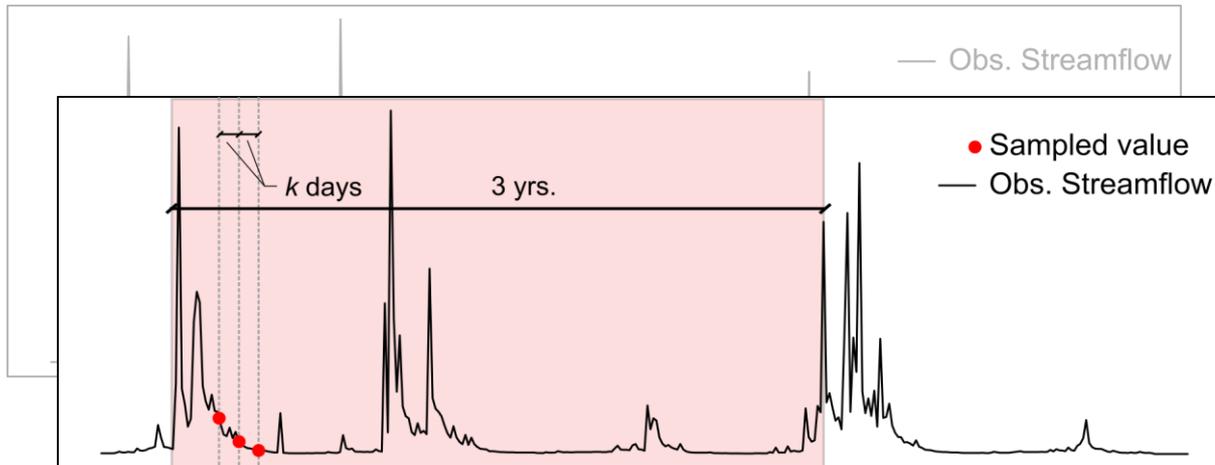


# Methodology: mimicking SWOT FDCs



# Methodology: mimicking SWOT FDCs

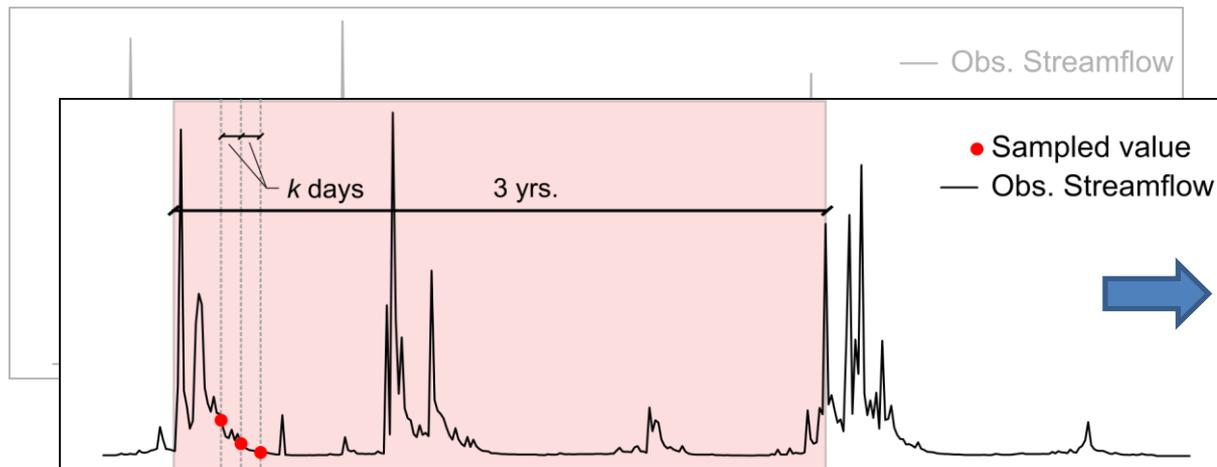
## 1) Time sampling, $k$ variable sampling rate (in days)



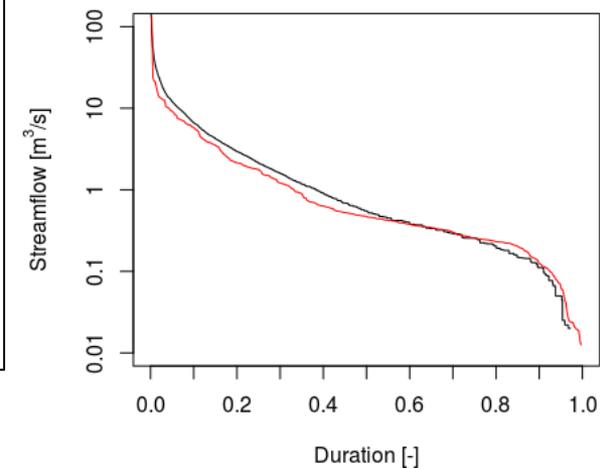
1st sampled SWOT FDC

# Methodology: mimicking SWOT FDCs

## 1) Time sampling, $k$ variable sampling rate (in days)

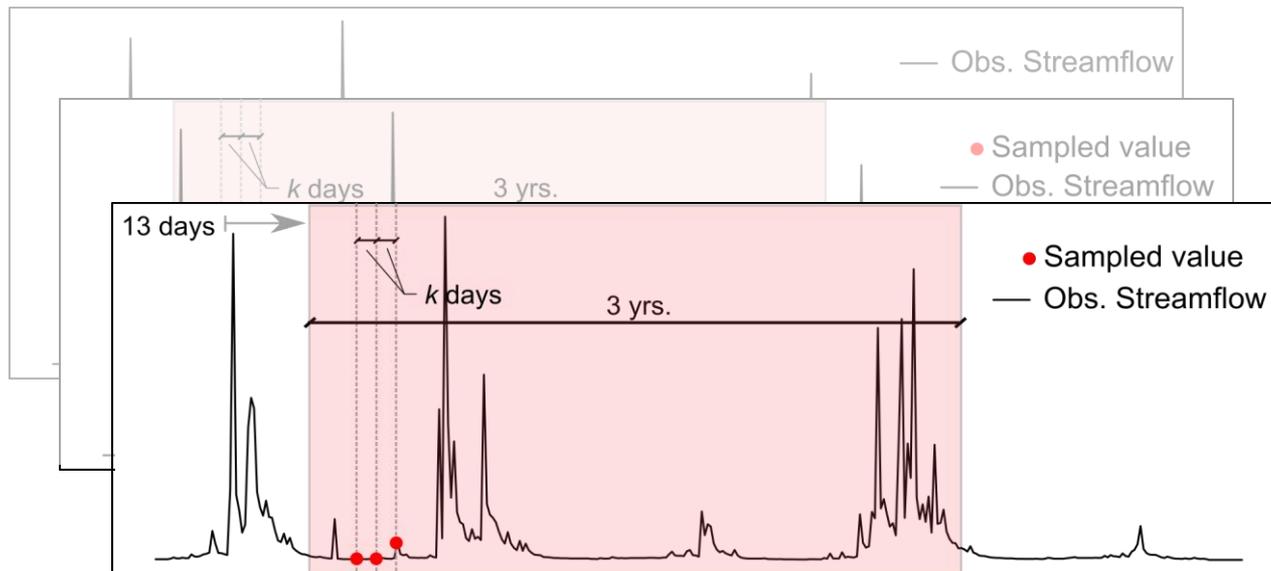


1st sampled SWOT FDC



# Methodology: mimicking SWOT FDCs

## 1) Time sampling, $k$ variable sampling rate (in days)

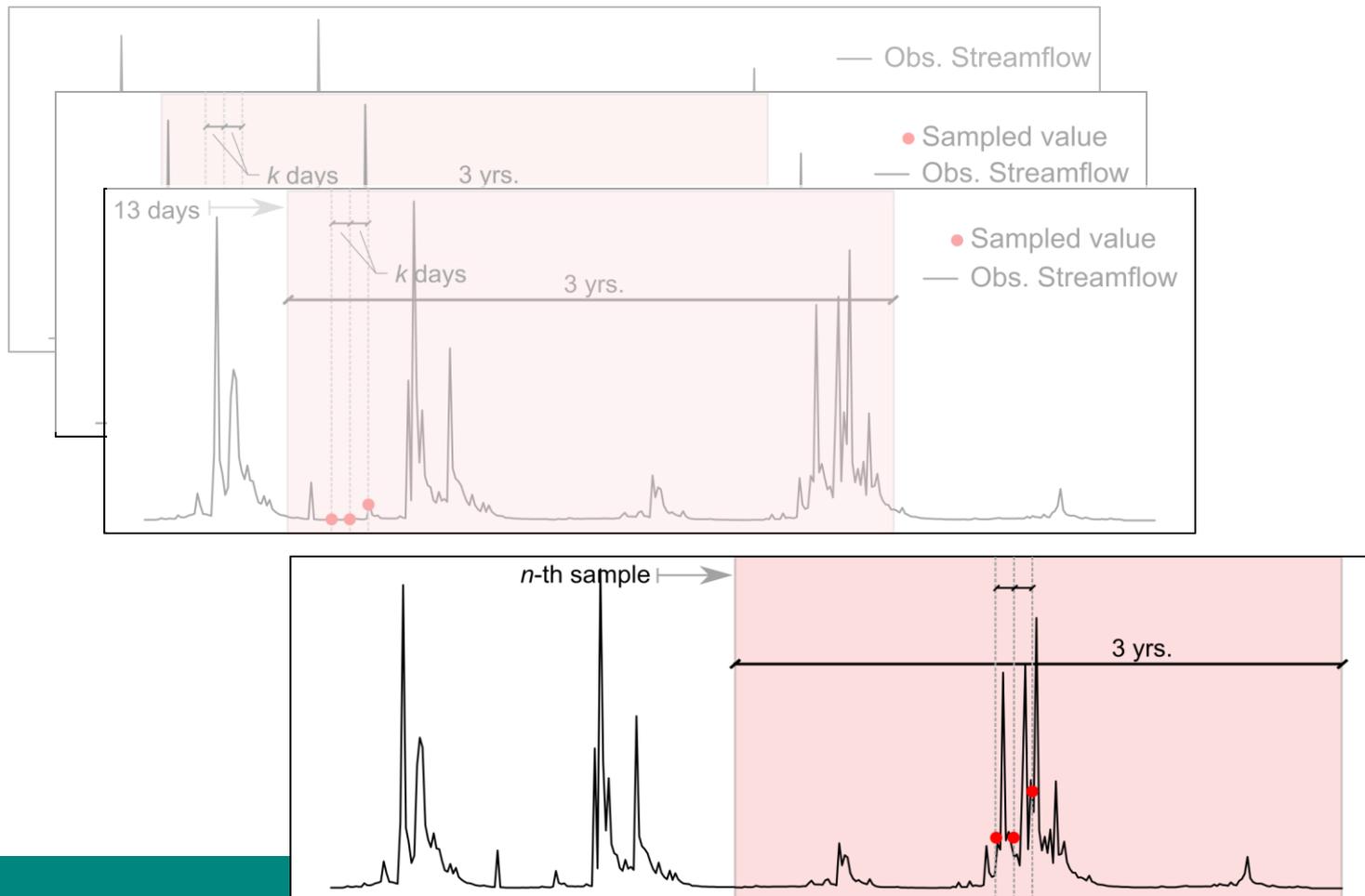


2nd sampled SWOT FDC

...

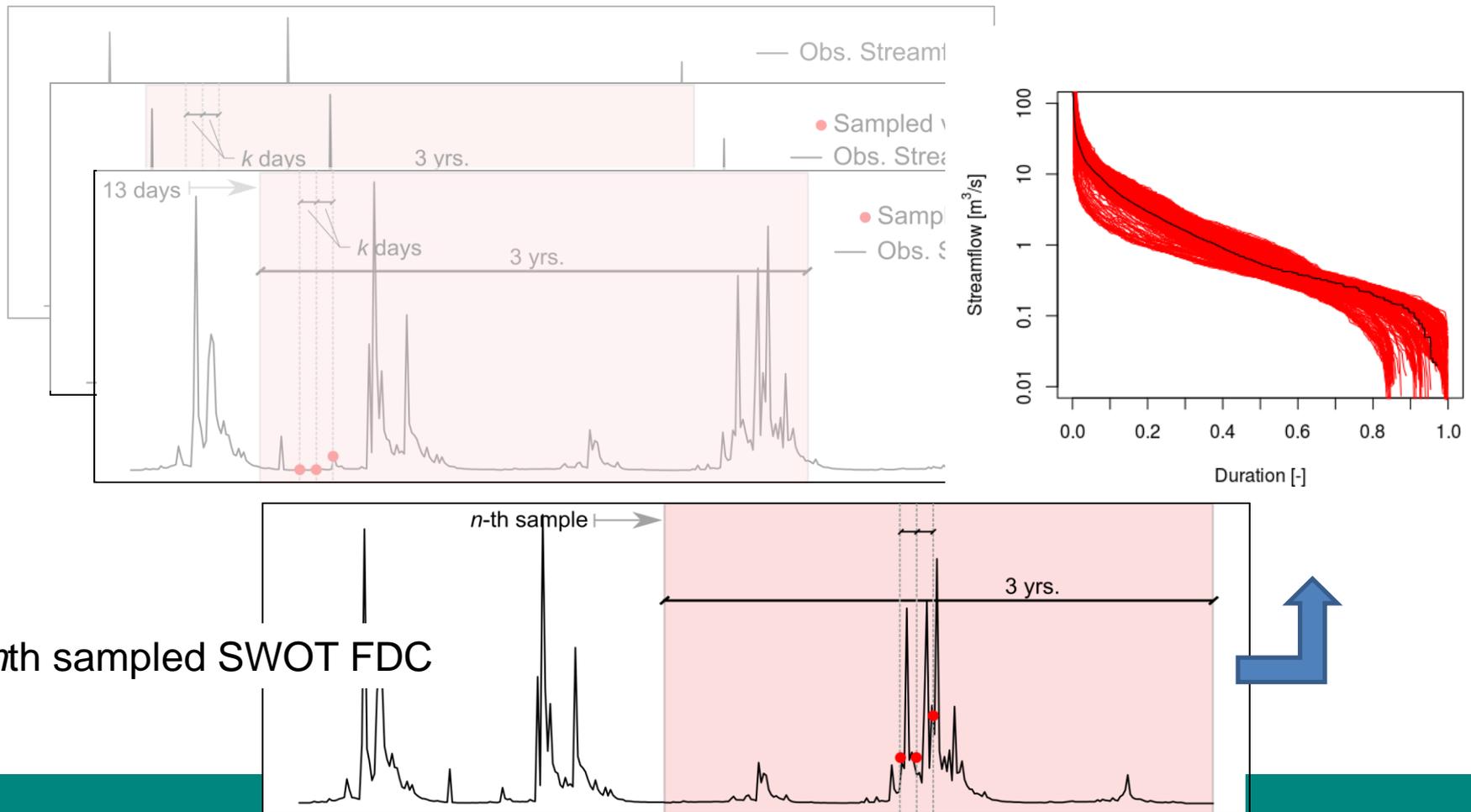
# Methodology: mimicking SWOT FDCs

## 1) Time sampling, $k$ variable sampling rate (in days)



# Methodology: mimicking SWOT FDCs

## 1) Time sampling, $k$ variable sampling rate (in days)



# Methodology: mimicking SWOT FDCs

1) Time sampling,  $k$  variable sampling rate (in days)

4 different sampling rates -> different «scenarios»

$k = 3, 5, 7, 10$  (days)

# Methodology: mimicking SWOT FDCs

## 2) SWOT measurement error

$$Q_{SWOT} = Q_{gauge} (1 + \varepsilon)$$

SWOT estimates

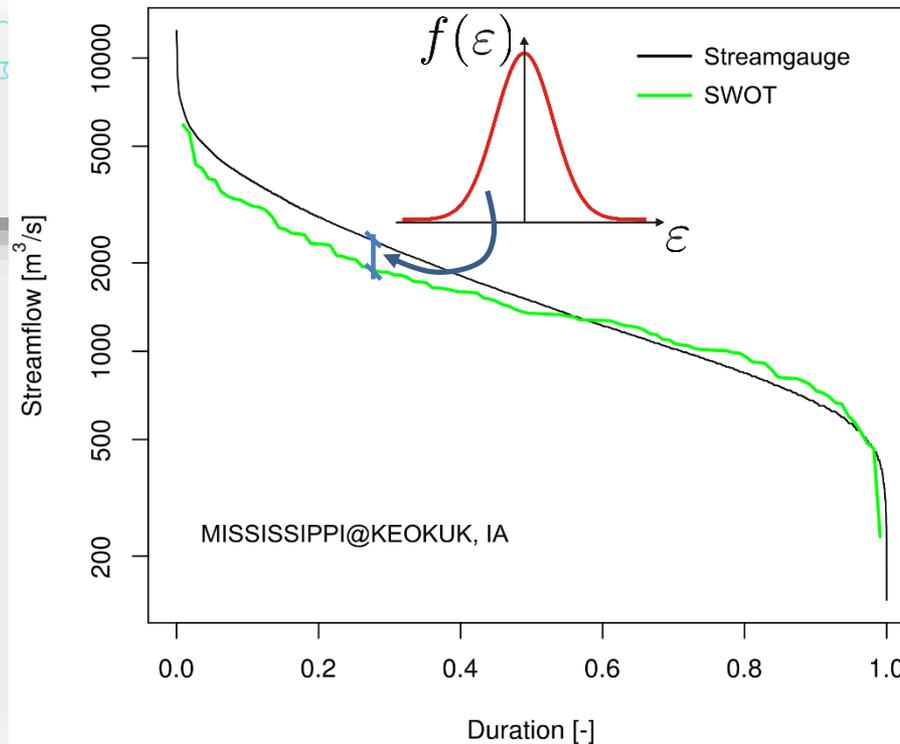
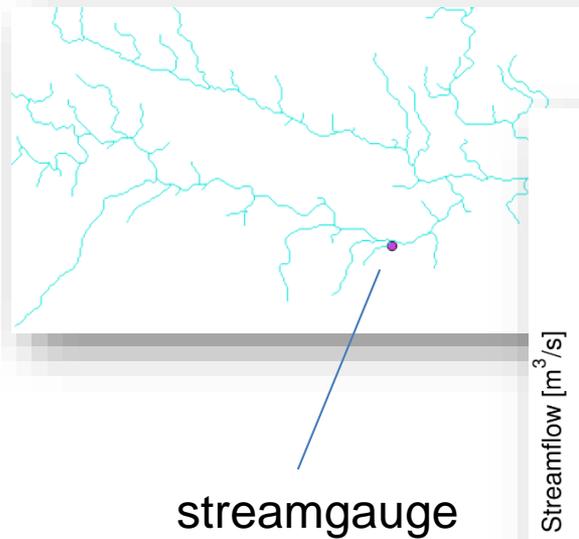
«TRUE» discharge from streamgauge

Random Error  
 $N(\mu=0, \sigma= 30\%)$

# Methodology: mimicking SWOT FDCs

## 2) SWOT measurement error

$$Q_{SWOT} = Q_{gauge} (1 + \varepsilon)$$



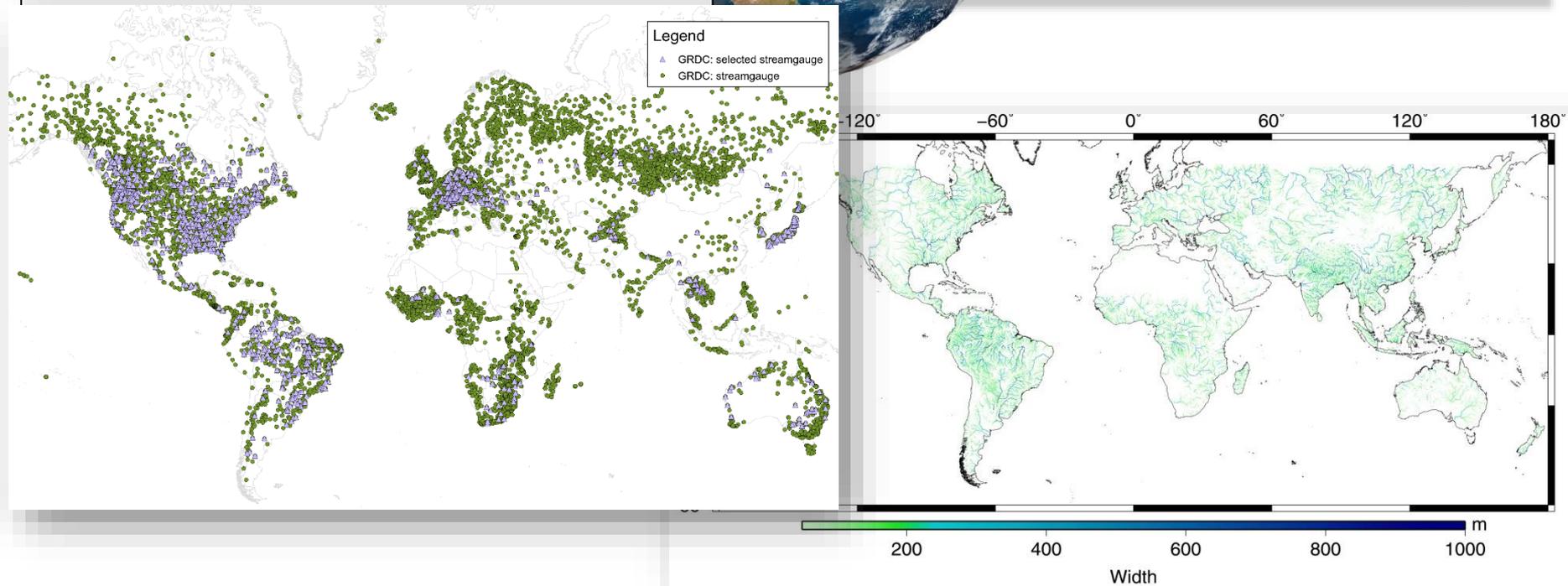
# Data

## HYDROLOGICAL DATA

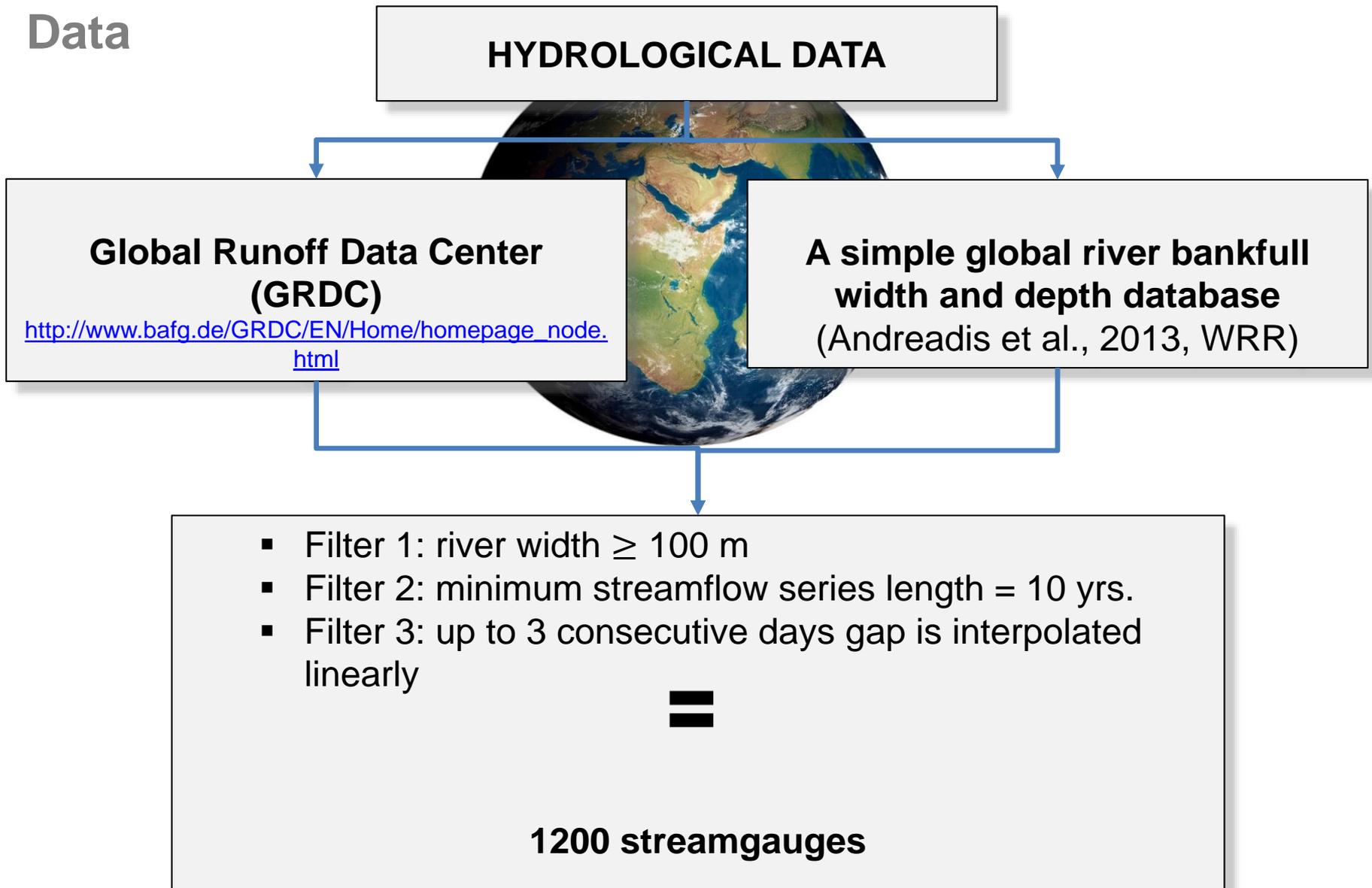
### Global Runoff Data Center (GRDC)

[http://www.bafg.de/GRDC/EN/Home/homepage\\_node.html](http://www.bafg.de/GRDC/EN/Home/homepage_node.html)

### A simple global river bankfull width and depth database (Andreadis et al., 2013, WRR)



# Data



- Filter 1: river width  $\geq 100$  m
- Filter 2: minimum streamflow series length = 10 yrs.
- Filter 3: up to 3 consecutive days gap is interpolated linearly

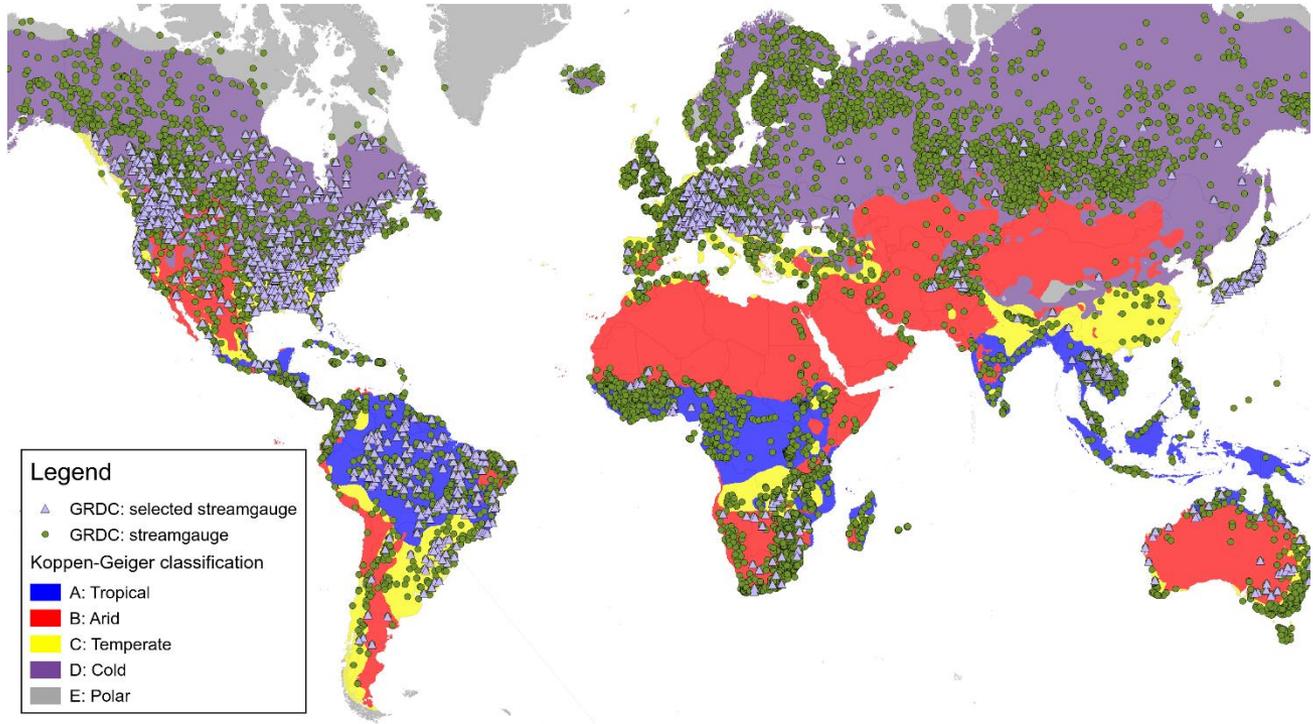
==

**1200 streamgauges**

# Data

## GLOBAL CLIMATE CLASSIFICATION

(Peel et al., 2007)



**Legend**

- ▲ GRDC: selected streamgauge
- GRDC: streamgauge

**Köppen-Geiger classification**

- A: Tropical
- B: Arid
- C: Temperate
- D: Cold
- E: Polar

No. of GRDC stations:

	A	169
Tropical		
	B	74
Arid		
	C	225
Temperate		
	D	368
Cold		
	E	7
Polar		

## Köppen-Geiger classification

# Results

For each site  $j = 1, \dots, 1200$

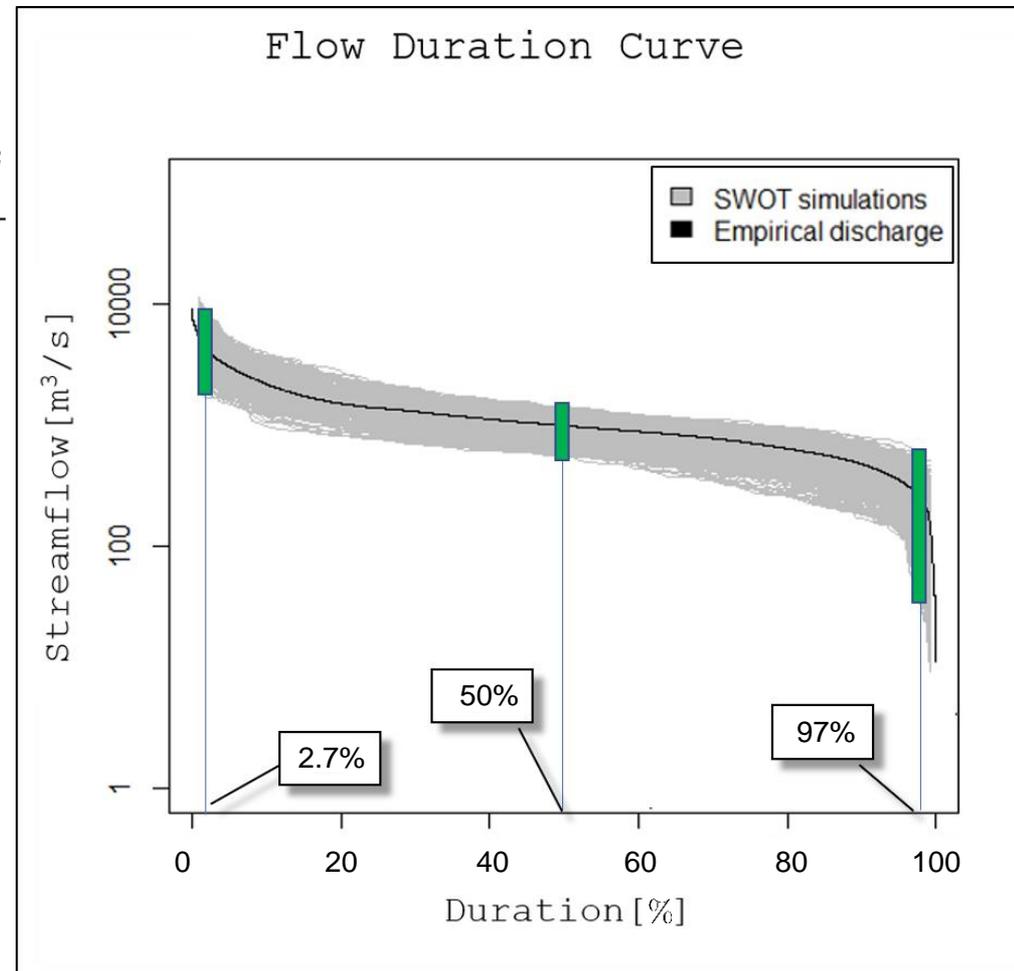
$$NSE = 1 - \frac{\sum_{i=1}^n (Q_{SWOT,i} - Q_{emp,i})^2}{\sum_{i=1}^n (Q_{emp,i} - \mu_{emp})^2}$$

$$MRE = \frac{1}{n} \sum_i \frac{Q_{SWOT,i} - Q_{emp}}{Q_{emp}}$$

$$d_{2.7\%} = Q_{10} \quad \text{High flows}$$

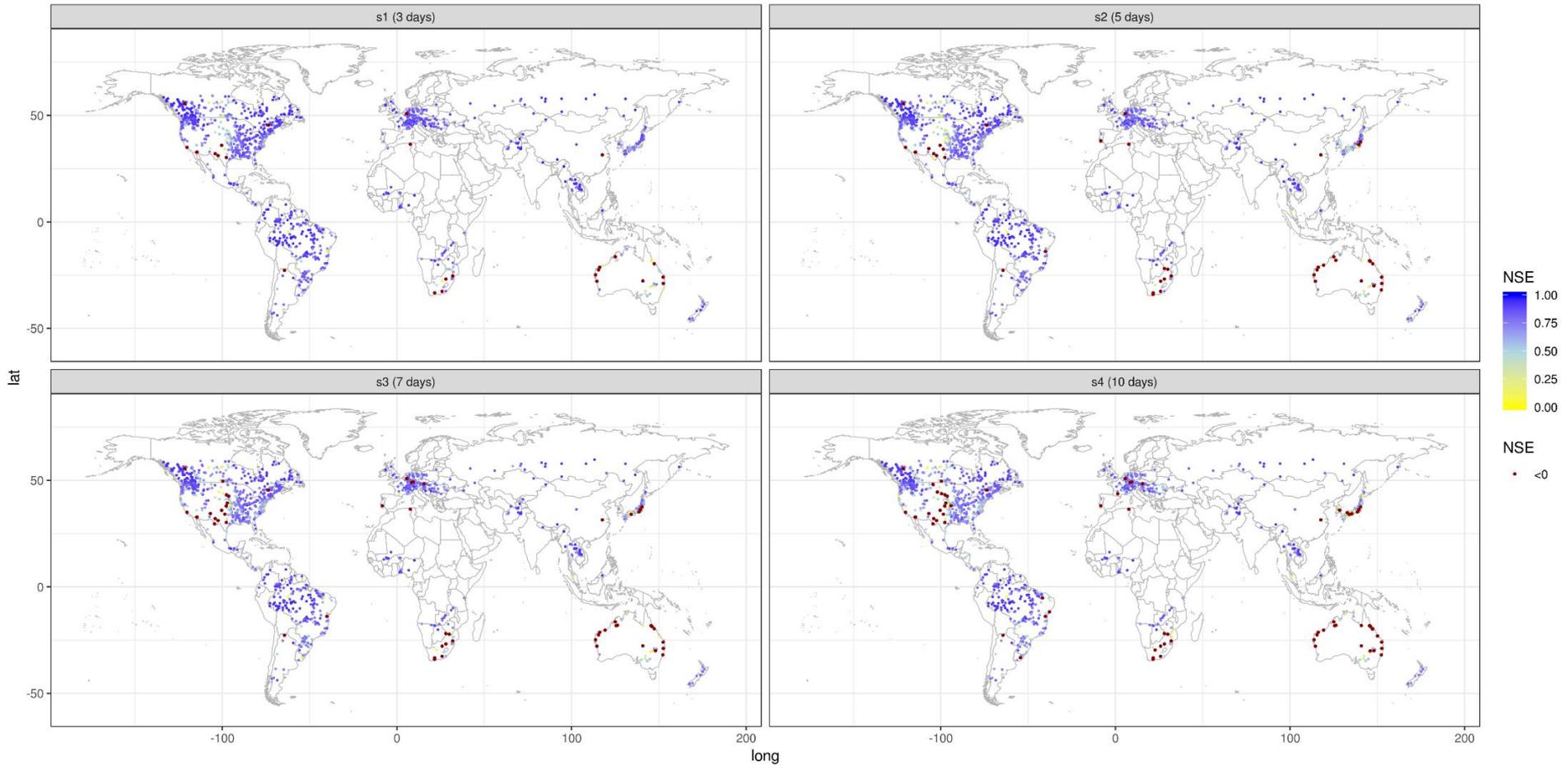
$$d_{50\%} = Q_{median} \quad \text{Median flows}$$

$$d_{97\%} = Q_{355} \quad \text{Low flows}$$

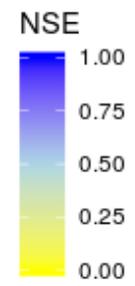
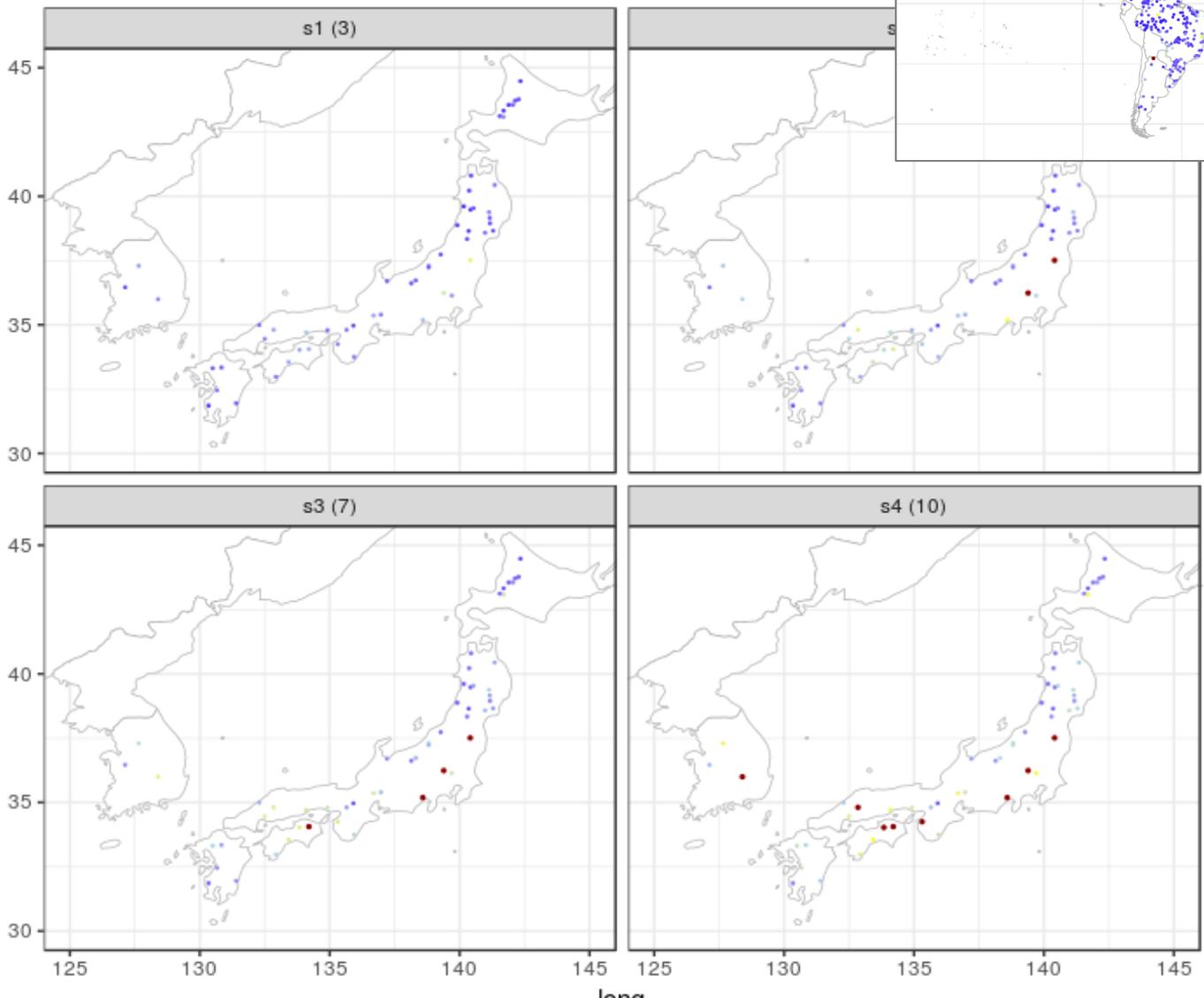
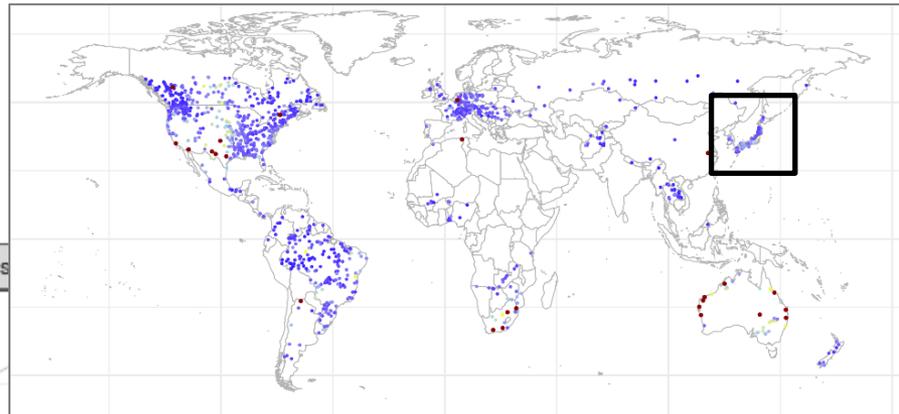


# Results

## NSE – Global overview

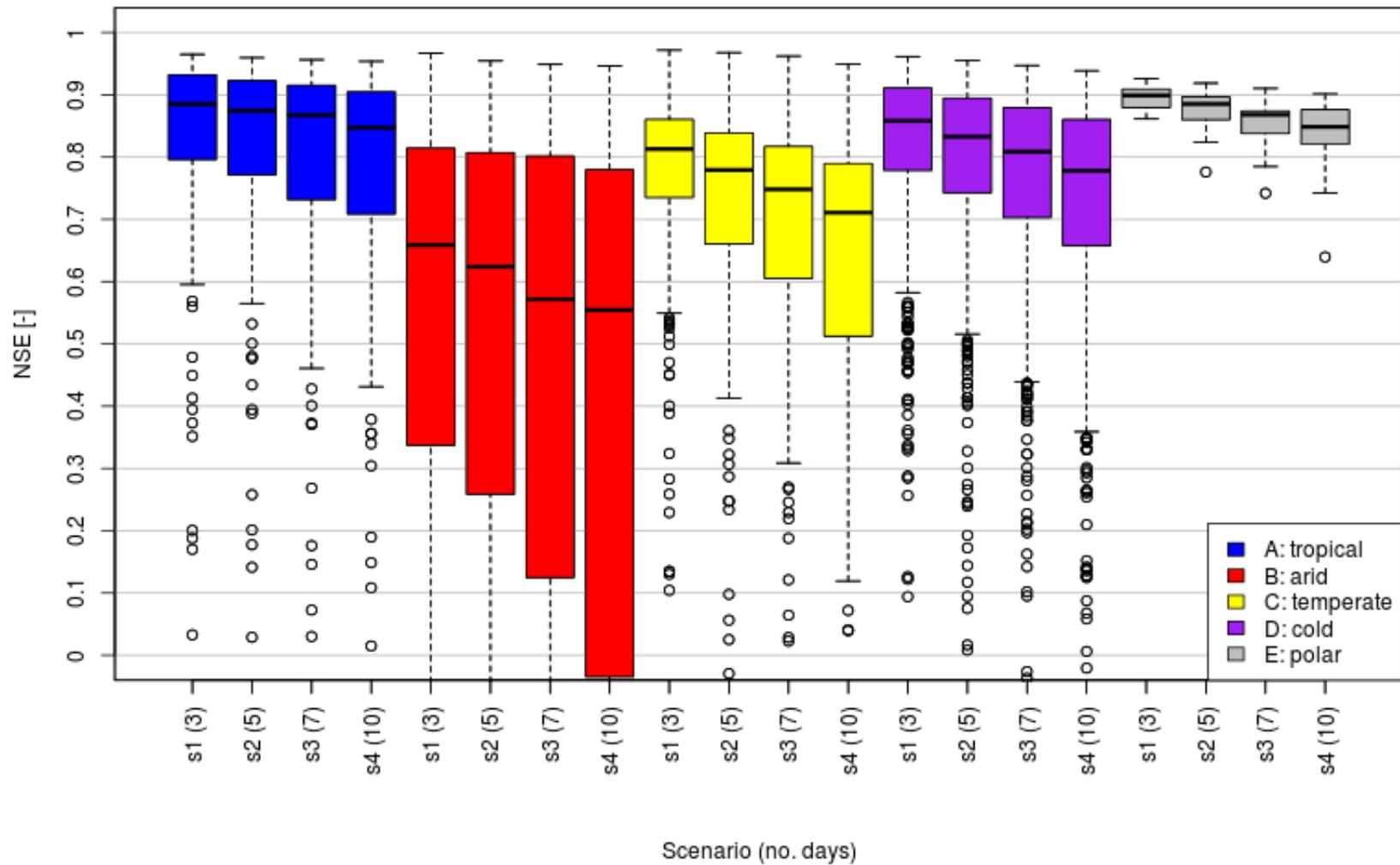


# Results



# Results

## NSE - Climate-wise



Es: s1 (3) indicates scenario 1, with one SWOT observation every 3 days within the satellite revisit period (21 days)

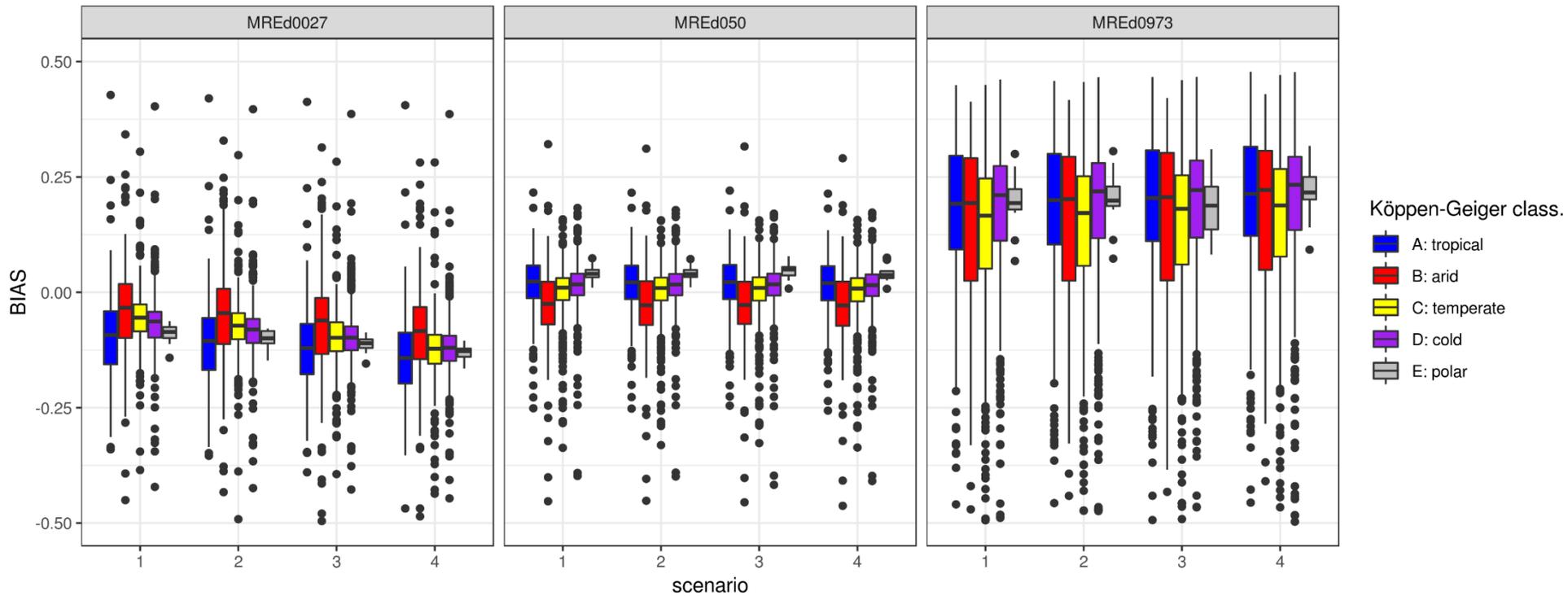
# Results

## MRE - Duration-wise

### High flows

### Median flows

### Low flows



# Results

- Progressive detriment of SWOT capabilities to produce reliable FDCs as the time interval  $k$  increases (from  $s_1$  to  $s_4$ ). Trends depend on climatic conditions.
- Arid climate presents the highest relative errors. Tropical climate present best results.
- Duration-wise, we observe a general tendency of SWOT-based FDCs to underestimate high flows and overestimate low flows, in all macro-climatic conditions and sampling rates.
- Median flows tend to be the best “observable”, regardless the climate.
- As expected, temperate and cold climates have the lowest errors for median streamflow regimes – narrower curves in the median range of durations

## Final remarks

1. SWOT-derived FDCs can be used as an alternative to gauge-derived FDCs to compensate the lack of streamflow records in ungauged basins, though different accuracy have been found in different climatic conditions;
2. Indeed, FDCs could be used “as is” in temperate and cold regions, whereas in arid and tropical areas higher uncertainty must be taken into account, especially in the low flow regimes;
3. LIMITS: this preliminary study do not include (yet) a specific random error generator for different duration ranges, but future work will.



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[\*www.dicam.unibo.it\*](http://www.dicam.unibo.it)