



# European Geosciences Union General Assembly 2016

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## *Automatic calibration of a parsimonious ecohydrological model in a sparse basin using the spatio-temporal variation of the NDVI*

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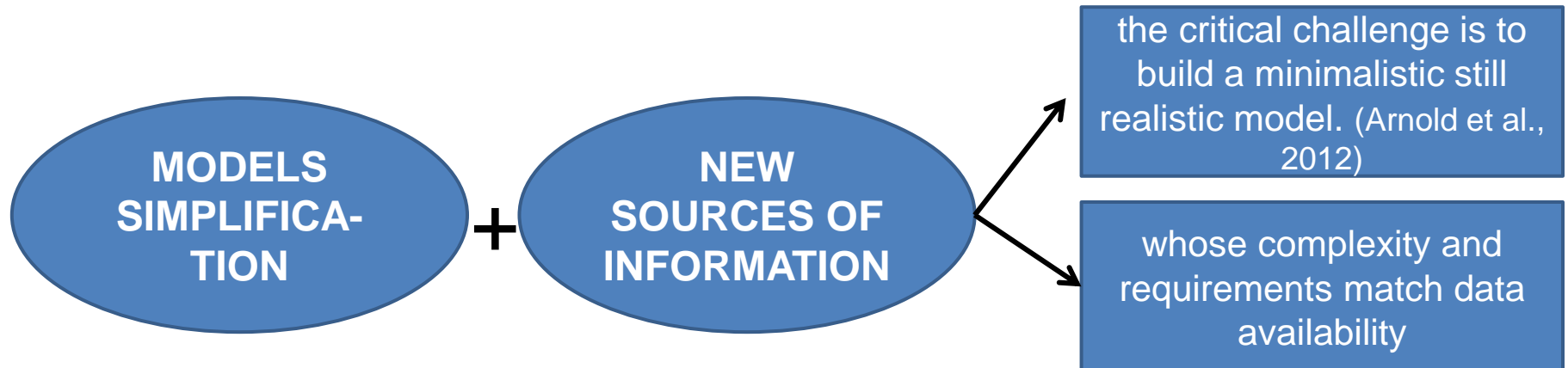
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- The vegetation plays a key role in a catchment's water balance particularly in semi-arid areas (Laio et al., 2001)

The ET > 90% of the precipitation (Andersen, 2008)

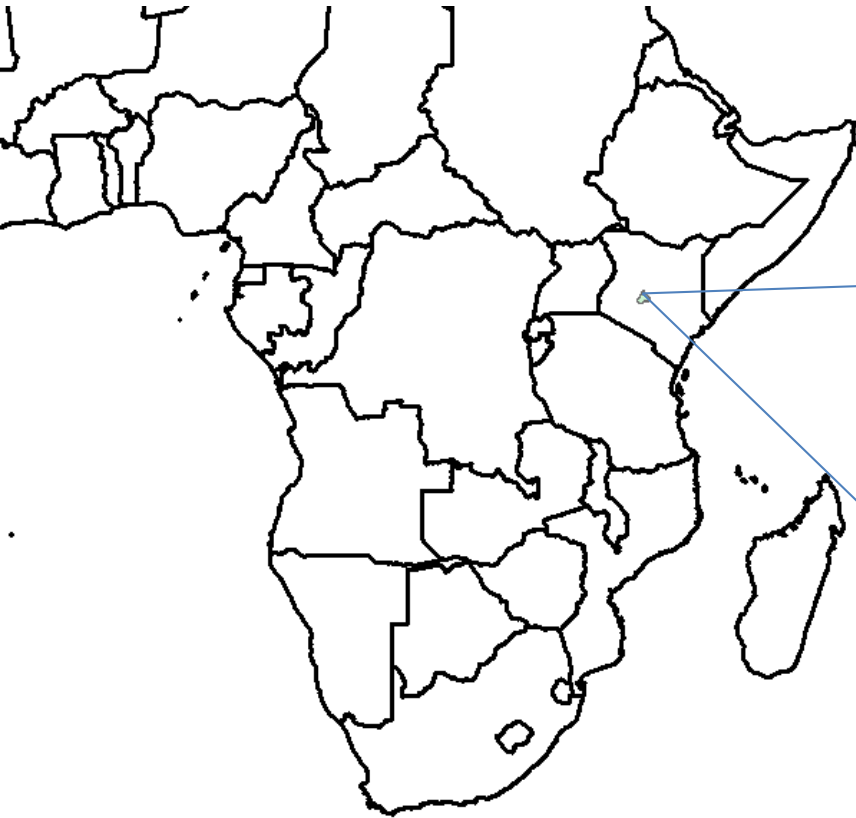
- The number of hydrological models taking into account the vegetation development has increased substantially

High parametrical requirement – Data scarcity

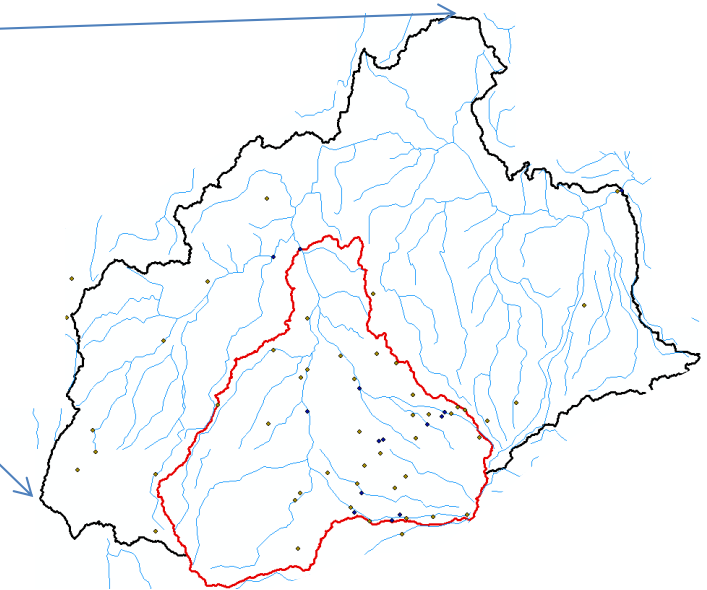


- ❑ Applicability of remote sensing data
  - Models forced by remote sensing data
  - Proxy of some parameters
  - Calibration and validation → challenging task
- ❑ Bibliographic survey of the Web of Knowledge:
  - Satellite Calibration Implementation Modelling Ecohydrology
  - Lumped or semi-distributed models: 76.5%
  - Distributed models: 23.5% → multi-objective approach (1 exception)

**SPATIO-TEMPORAL DATA**

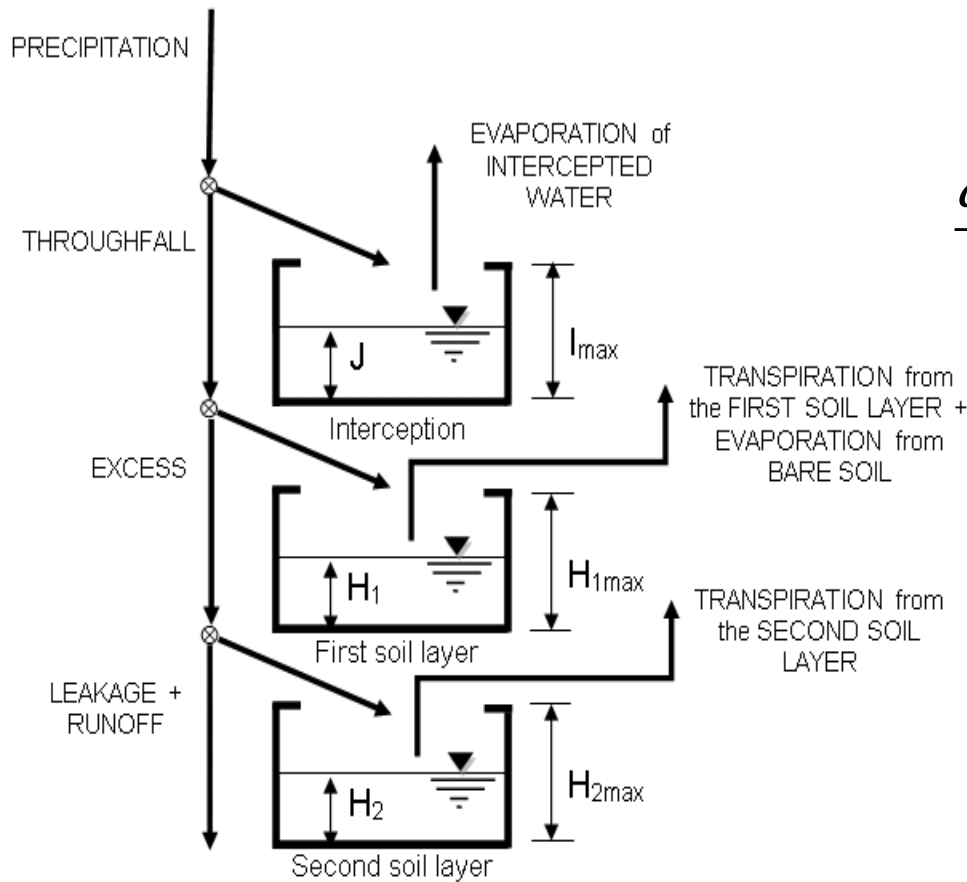


Area: 4605 km<sup>2</sup>  
Mostly water-controlled  
Sensitive to global change



Rainfall: 1950-2003  
Temperatures: 1950-Nowadays  
Observed discharge: 1980-2002  
NDVI: 2000-Nowadays (MODIS products)





$$T_1 = ET_o \cdot f_t \cdot \min(LAI, 1) \cdot \beta_t(H_1) \cdot r_1$$

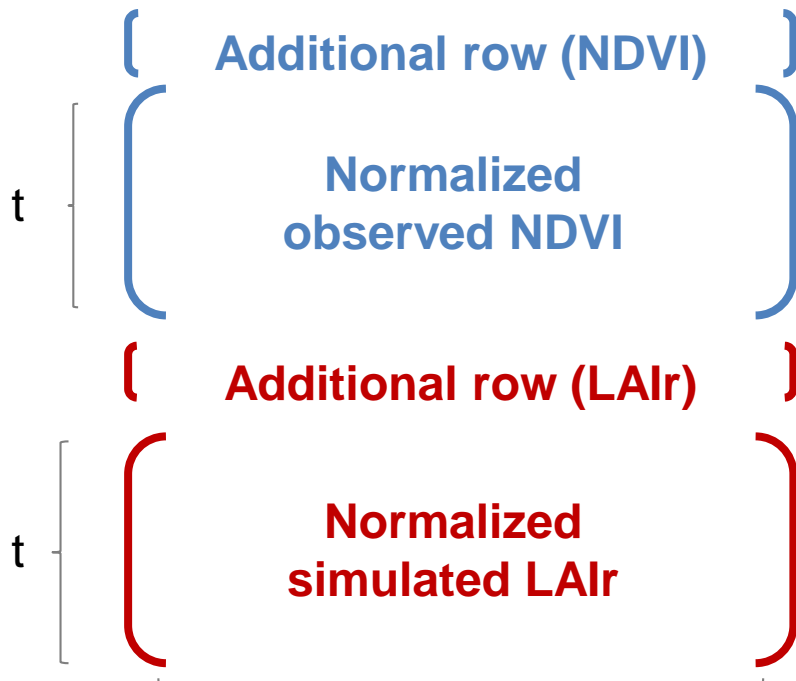
$$\frac{dB_l}{dt} = (LUE \cdot \varepsilon \cdot APAR - Re) \cdot \varphi_l - \kappa_l \cdot B_l$$

$$LAI = B \cdot SLA \cdot f_t$$

$\varepsilon$  depends on:

- Water Stress => connection with hydrological model
- Temperature

- ❑ Automatic calibration using EOF analysis
- ❑ Minimize the difference between the loadings
- ❑ Always according to the explained variance



STEP 1: Concatenate observed and simulated matrices

Addition of a row which takes into account the spatial gradient

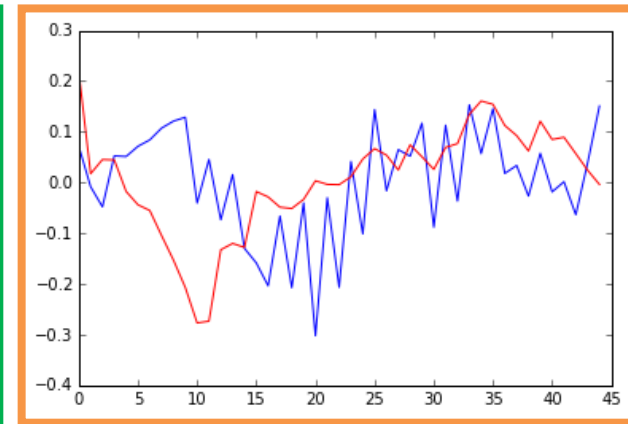
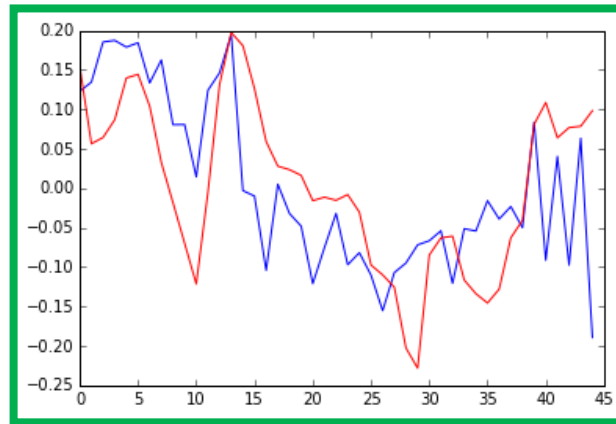
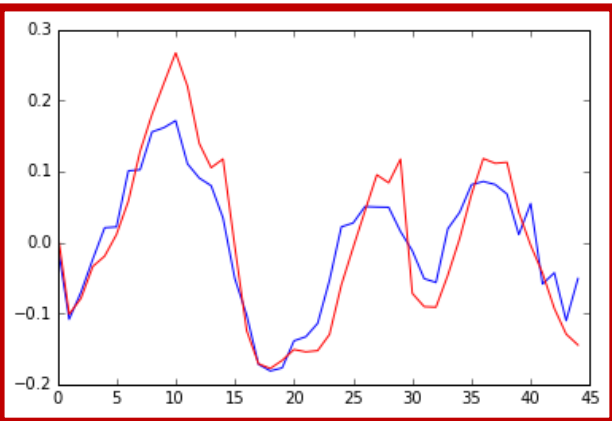
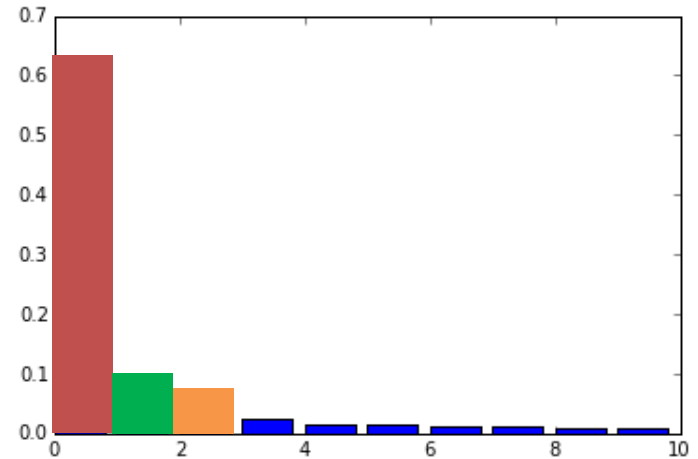
STEP 2: Minimizing loadings differences according to the explained variance

□ Calibration process:

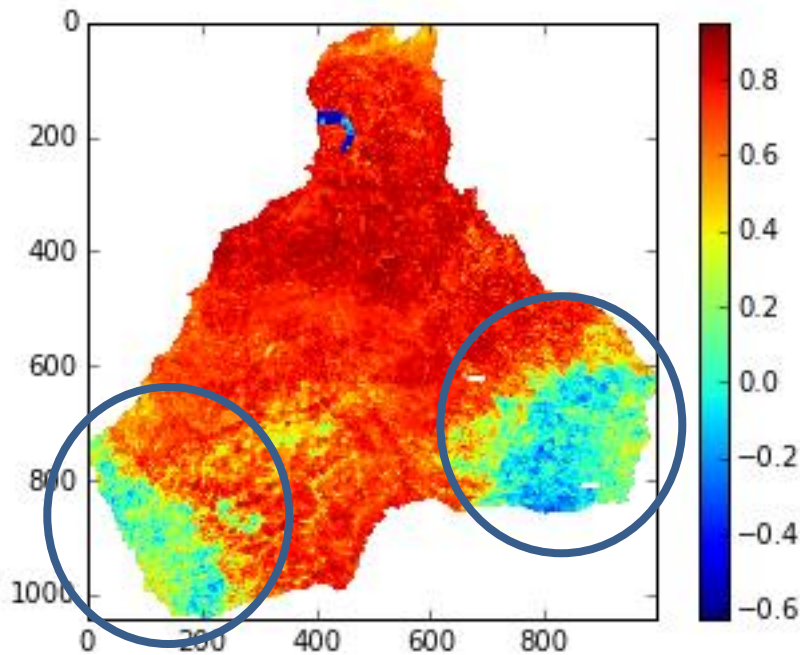
➤ Python package

➤ Objective function:

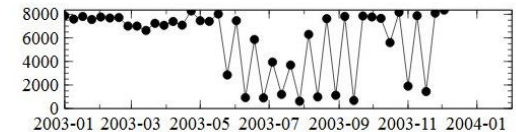
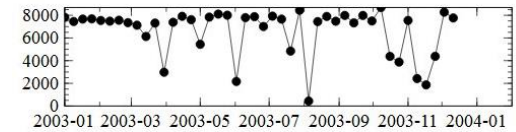
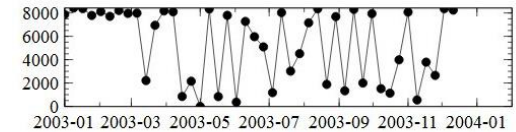
$$Error = \sum_{i=1}^n |w_i * (load_i^{SIM} - load_i^{OBS})|$$



- Results → Temporal correlation in each pixel

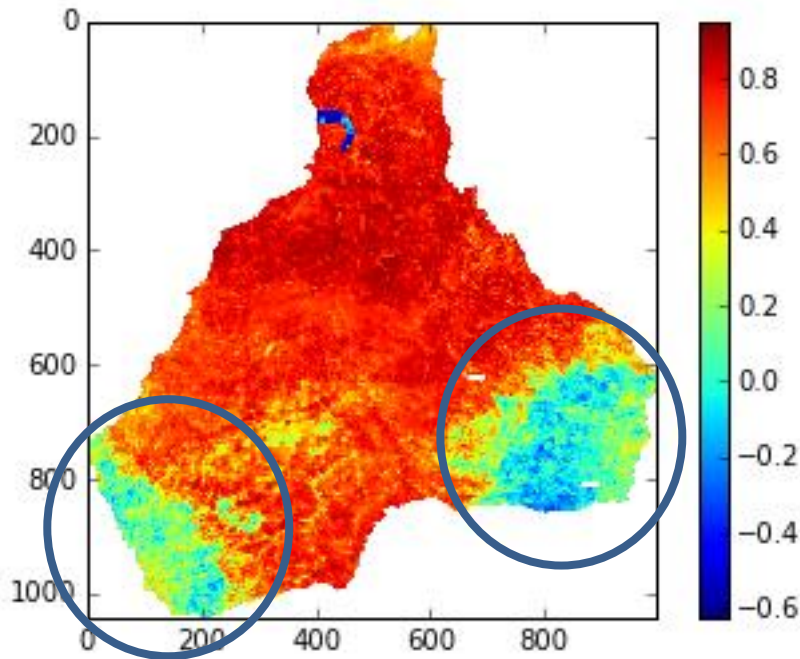


Realistic  
observed NDVI?  
Oscillations  
between 0.8 to  
0.2 (even 0.0) just  
in a week

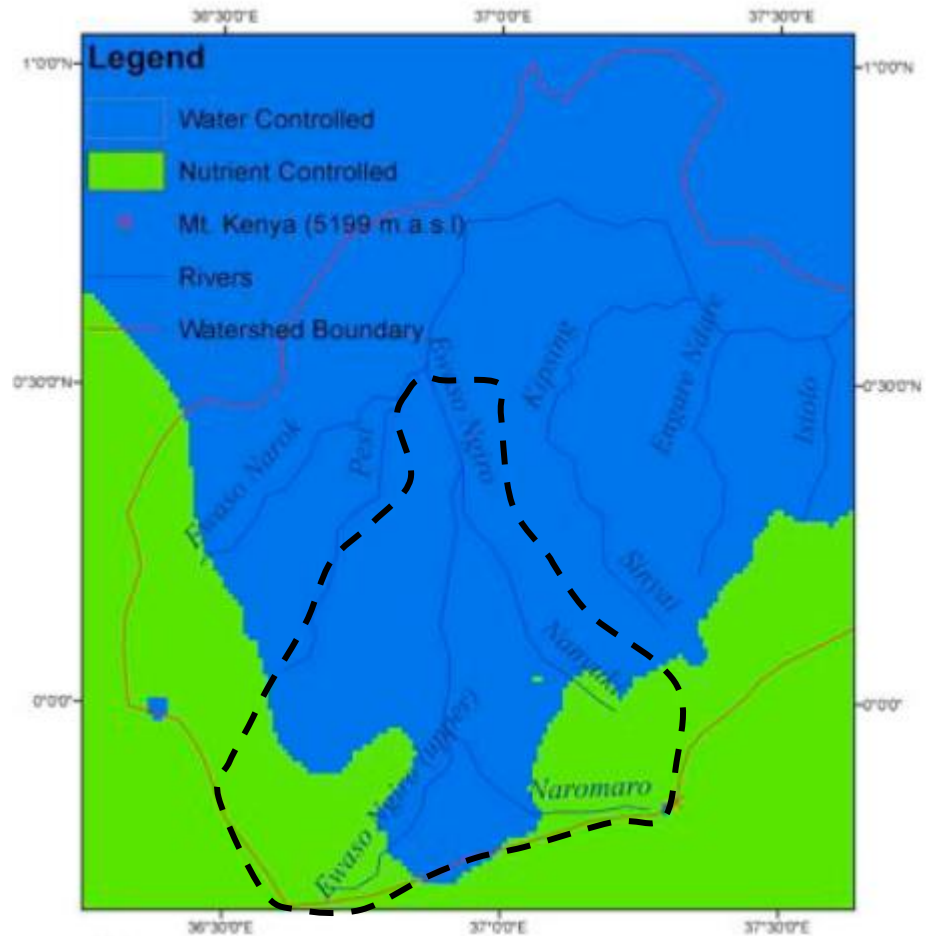




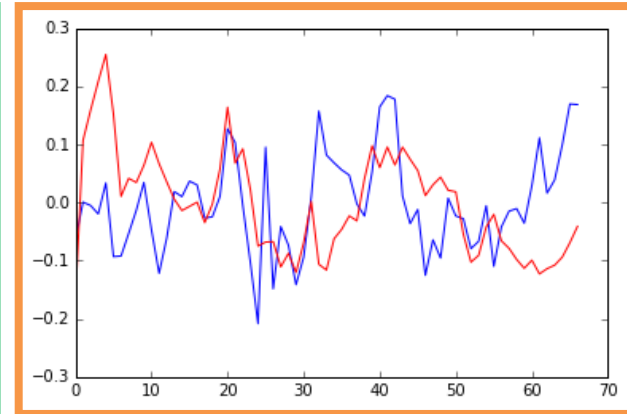
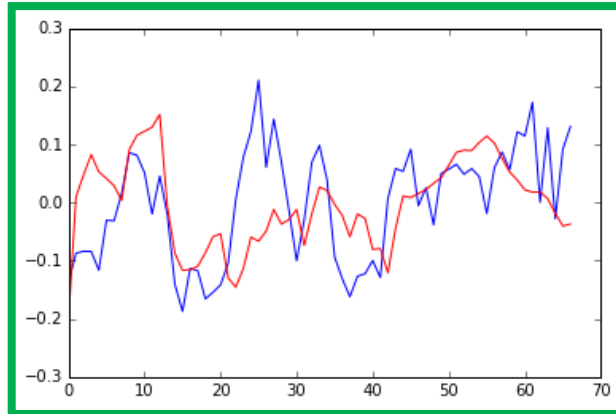
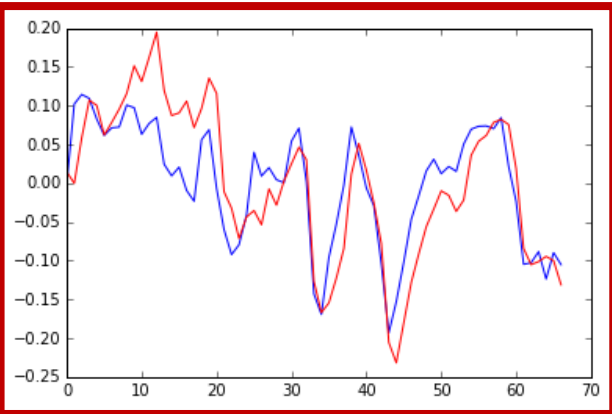
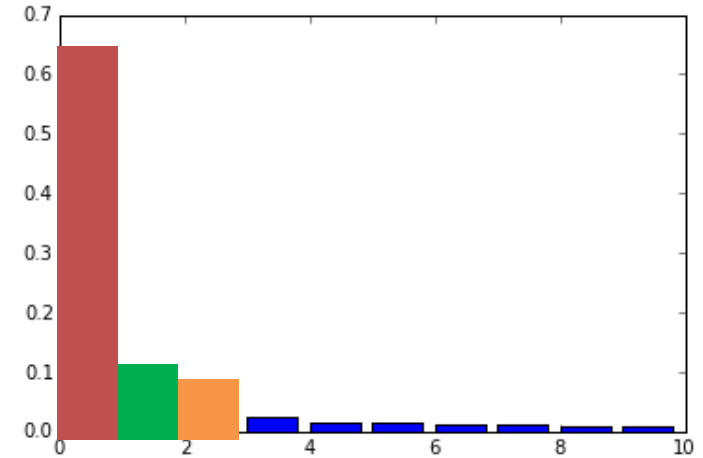
## □ Why?



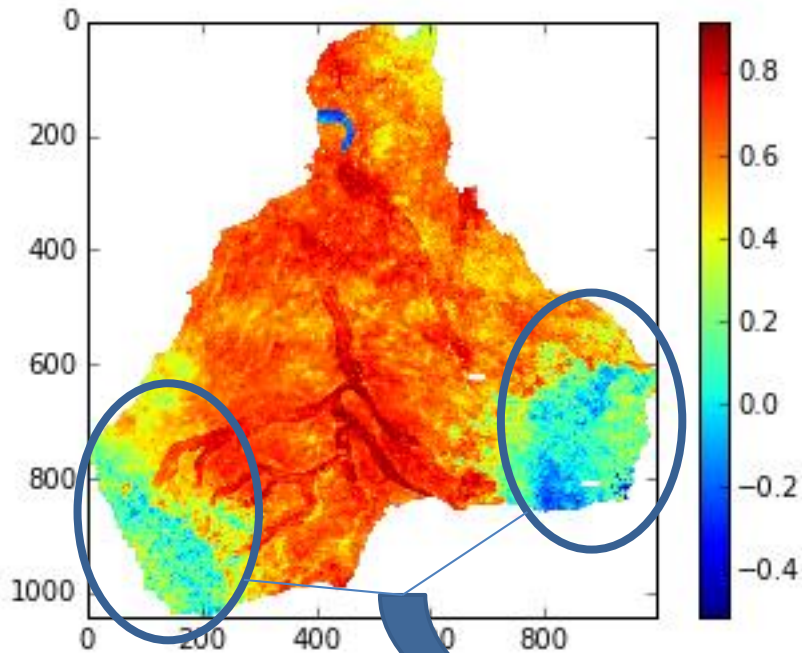
According to a previous work → No water-controlled areas



- Years 2000, 2001 and 2002
  - Vegetation
    - Loadings comparison
    - Temporal Pearson correlation maps in each year

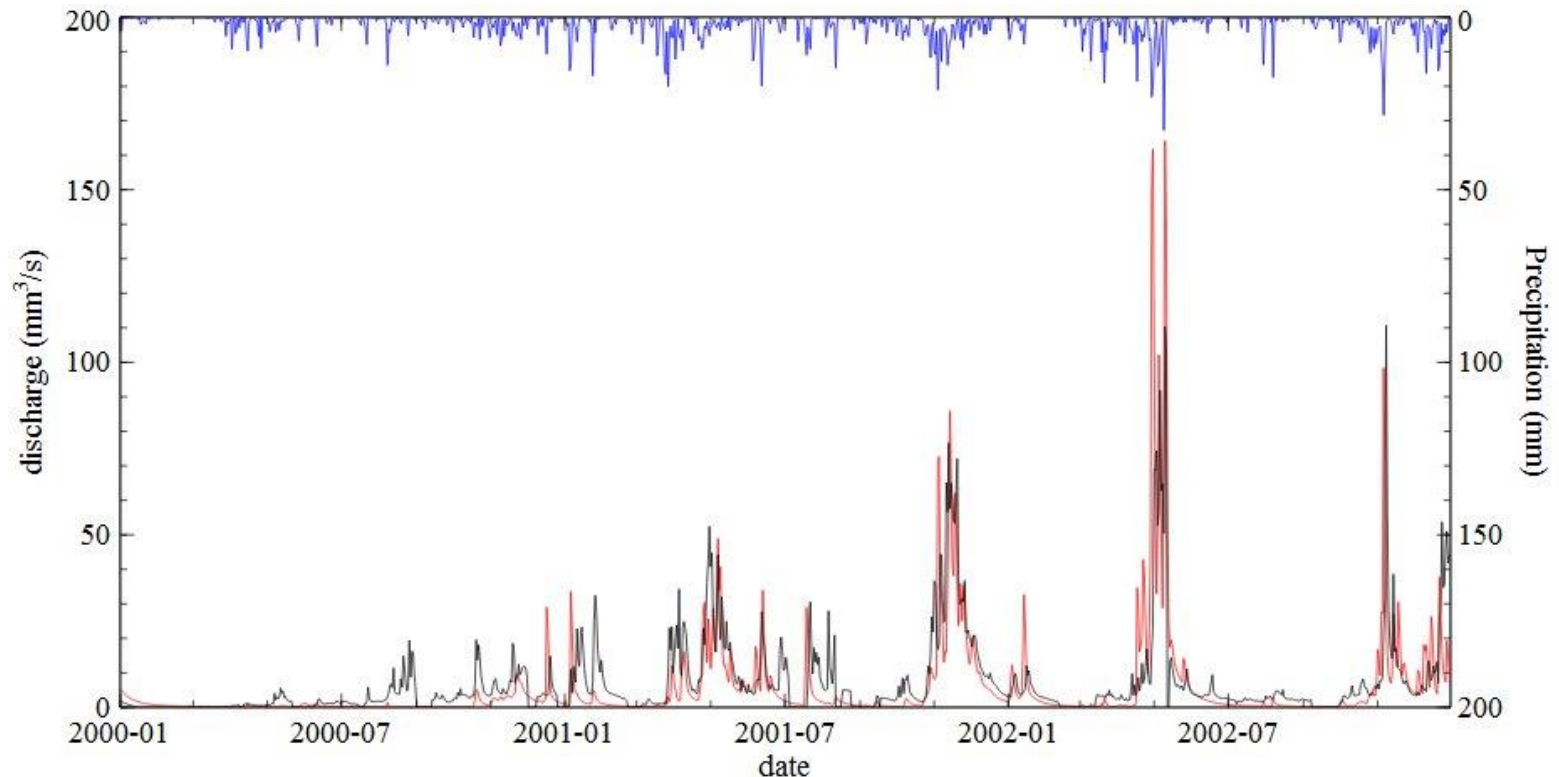


- Years 2000, 2001 and 2002
  - Vegetation
    - Loadings comparison
    - Temporal Pearson correlation maps



Expected bad results (even worse)

- Years 2000, 2001 and 2002
  - Water
    - Comparison between observed and simulated discharge



- ❑ Simple models together to remote sensing data could be a potential alternative in un-gauging basins
- ❑ Some limitations:
  - Related to the model (nutrient-limited areas)
  - Related to the satellite data (clouds and others)
- ❑ The proposed methodology is an innovative option in order to include spatio-temporal data
- ❑ More statistics and methodologies must be proposed and analyzed if we want to use spatio-temporal data



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# Thanks for your attention

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