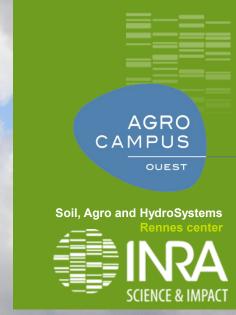
Transdisciplinarity approaches to analyzing hydrochemical time series: get a new look at data



Workshop: High resolution water quality monitoring

Session 2 : Data driven analysis

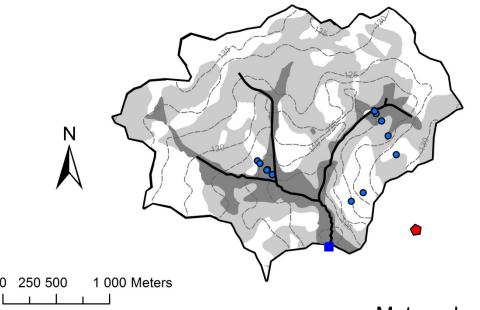
A.H. Aubert, J.W. Kirchner, R. Tavenard, O. Fovet, P. Mérot and C. Gascuel-Odoux

Magdeburg - 20-21 / VII / 2014



Kervidy-Naizin study site

Equipment and soils



- Outlet
- Well
- $-\frac{120}{}$ Isoline of elevation (meters)
- Stream
- Weather station

Soil waterlogging classes:

- Well drained
- Intermediate
- Waterlogged

Meteorology: Hourly

[solutes] / river: Various*

[major elements] / GW: /3 months

Discharge: /1 min

Water table depth: /15 min





Kervidy-Naizin study site

Various sampling rates of solutes in the river

Meteorology: Hourly

[solutes] / river: Various*

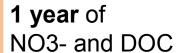
[major elements] / GW: /3 months

Discharge: /1 min

Water table depth: /15 min



UV-spectrometry probe, 20-min.



Manual sampling, Daily

3 years of about 30 elements

10 to 12 years of NO3-, DOC, Cl- and SO42-





OBJECTIVES

Many authors call for extracting as much information from the data as possible.

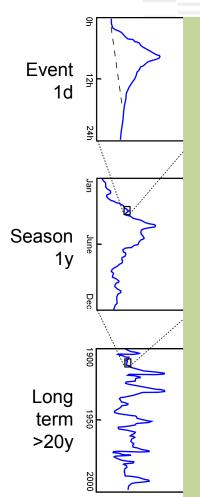
- Babovic, HP, 2005
- Soulsby et al., HP, 2008
- Hrachowitz et al, HSJ, 2013

"Reconciling environmental theory with observations [...] by defining **signatures** (dynamic, response, behaviours and patterns) [...] according to **conceptual filters**" • Gupta et al., HP, 2008

- **Defining signatures** (+ methods)
- 2. ... temporal variability
- ... hydro meteorological conditions.



QUESTIONS



Q1- What is the mean annual pattern?

Q3- Are there flood patterns?

Q2- How does
the mean
pattern change
with unusual
hydrometeorological
conditions?

Q4- What about studying signal structure to consider all time scales at once?

Bloschl et Sivapalan, HP, 1995







Flood patterns, on water chemistry

- Previous studies have observed flood patterns
 - Elements considered as tracers

- Morel et al., HP, 2009
- Use of flood descriptors, temporality loss
 Seeger et al., JoH, 2004
- We proposed to study
 - Several solutes at a time
 - On 12 yrs long records: 472 12-days periods
 - Using automated method newly applied in hydrology
 - Using a clustering method, as often used in quantitative hydrology





Defining a method to observe flood patterns

Latent Dirichlet Allocation

Blei et al., JoML, 2003

Fixed parameters

LDA generative model

Generated observation Flood N+1 Flood N Flood 1

Low Med. High Low Med. High

Time (1 column = 1 day)

Or how "grey" or probable is a word?

Var. 1 Words
distribution in
patterns

Var. 2

Or how many patterns explain a document? In which proportion?

Patterns distribution in documents

Finding θ parameters

LDA generative model

Each observation is transformed into a "hydrological word", composed of :

1- the measured variable
2- the time of measure
relative to the start of the flood
3- the magnitude of the measure
(either low or medium or high)

Document 472

Document N+1

S Document N

Document 2

Document 2

Document 1

S N h S

N h S

N h Set of

hydrological

words

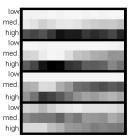


k

Asking for 4 patterns

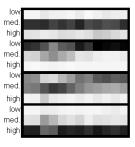
Pattern 0 (a)

Data-driven analyses oooo



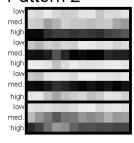
Chloride concentration Sulfate concentration DOC concentration Nitrate concentration

Pattern 1



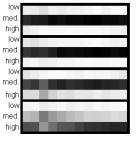
Chloride concentration Sulfate concentration DOC concentration Nitrate concentration

Pattern 2

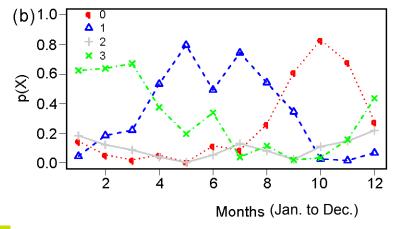


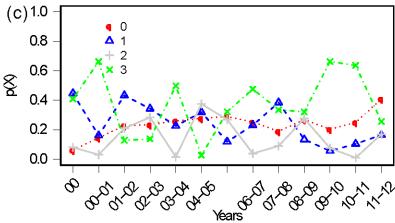
Chloride concentration Sulfate concentration DOC concentration Nitrate concentration

Pattern 3



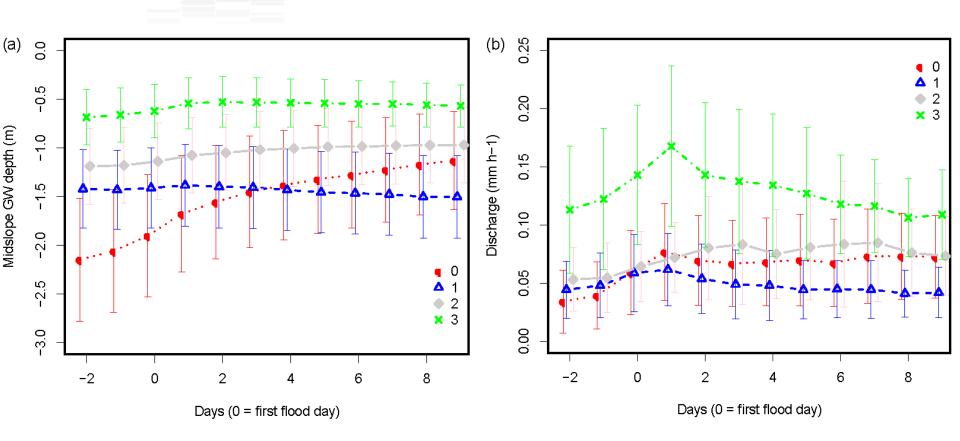
Chloride concentration Sulfate concentration DOC concentration Nitrate concentration





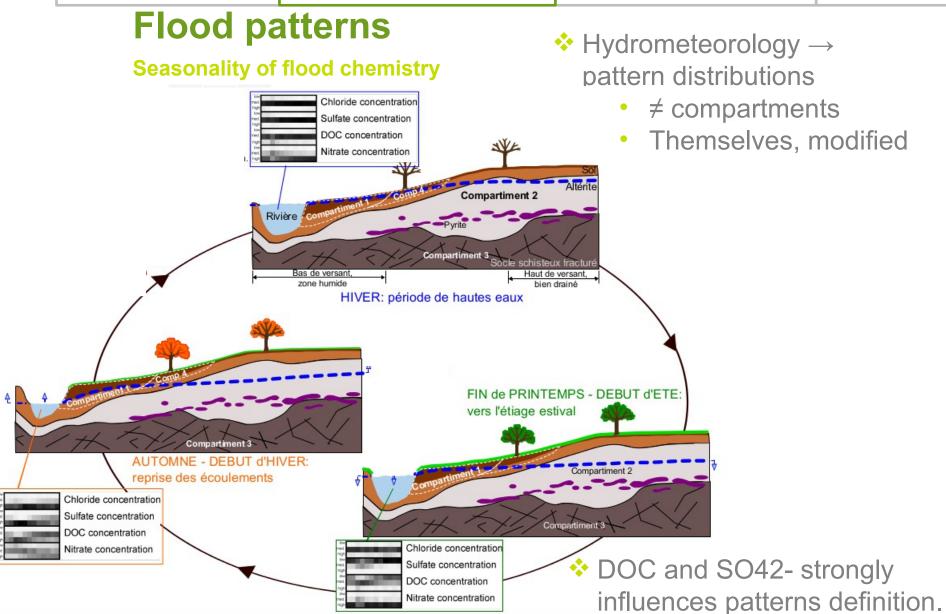


Hydrological insight



❖ A set of hydrological conditions corresponds to each pattern: an hydrologic season corresponds to an hydro-chemistry flood signature.





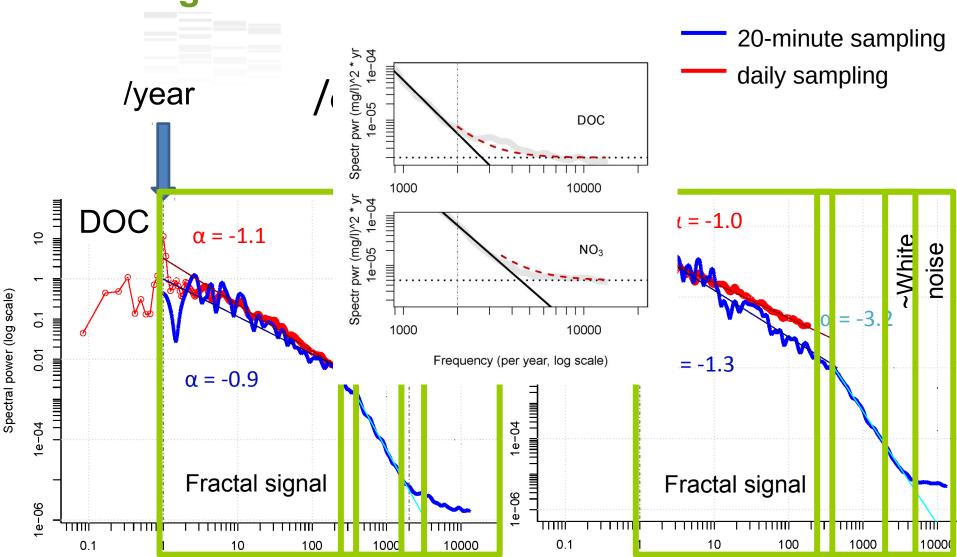


Studying signal structure

- Sampling frequency is a key issue in the design of operation of water quality observatories
 - Temporal filter
 - Emerging technologies monitor water quality almost continuously
 - Kirchner et al., HP, 2004
 - Halliday et al., Stoten, 2012
- → Assessing the value of quasi-continuous monitoring data for spectral analyses of water quality
- ❖ 1/f scaling was recently found all across the periodic table
 - On plynlimon observatory, which is rather pristine
 - Both for low- and high- frequencies
 Kirchner & Neal, PNAS, 2013
- → Testing the universality of 1/f scaling on an intensively farmed catchment & many elements





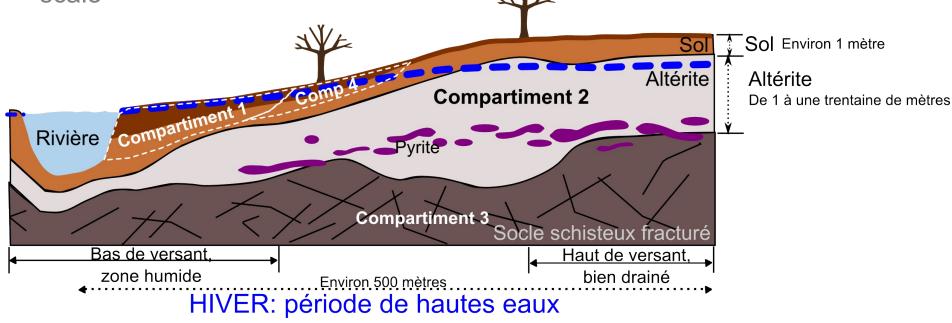




" Damping " processes

- Downslope advection and dispersion acting across a range of transport length scale
- Retention, production or mixing in the riparian zone or in-stream OR
- ❖ Fluctuation of discharge itself

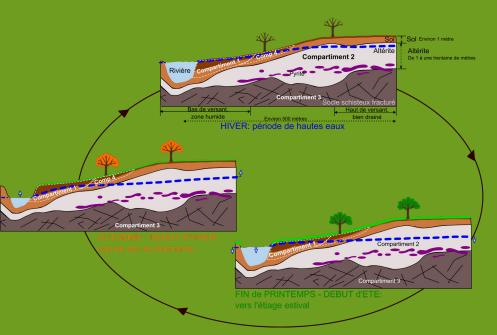
 ¬√√∠
- Measurement noise aggregate to the real world signal





CONCLUSIONS





- Those methods borrowed to other disciplines brought new informations on the time structure of water quality signal
 - A step in comparative hydrology
 - Use of higher sampling frequency would allowed to get into more detailled processus



