session HS2.2.1 Models and Data: Understanding and representing spatiotemporal dynamics of hydrological processes 04/05/2020



# Diagnostic of a regional distributed hydrological model through hydrological signatures

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# Context: distributed hydrological modelling at regional scale



Structure & parameters of the J2000 model (Horner, 2020)

Distributed models are useful for process-based assessment of water resources under global change

#### But...

Complex models with a high number of parameters

Large catchments (~ 100 000 km<sup>2</sup> and more) with high spatial

heretogeneity : climate, topography, geology, land use...

Model setup and parameterization is a complex task

### Our case study : J2000-Rhône



Distributed model of the Rhône catchment in France and Switzerland (100 000 km<sup>2</sup>)

- Based on the J2000 distributed model
- Takes into account dam management, irrigation and drinking water
- Parameterization strategy :
  - In situ measurements / previous studies
  - 234 control stations for Qobs / Qsim comparison
  - Manual parameter tuning on a few elementary subcatchments
  - Manual regionalization based on geology / land use / climate

Branger et al., 2018 ; Krause et al., 2006

### Model performance evaluation



- Simulations
  - Natural hydrology
  - SAFRAN meteorological forcing (Vidal et al., 2010)

- Period 1981-2010
- Still a lot of stations with unacceptable NSE values
- Manual parameterisation strategy has limitations

### The right answers for the right reasons ?

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Good agreement Qsim/ Qobs can also hide misunderstanding of

**5 hydrological processes** 

### **Comparison of groundwater recharge** estimates

1184 - 1605

50

100 km



Caballero et al. (2016)



- Comparison with J2000 RG1 : strong underestimation over the whole catchment
- There might be a problem with the representation of groundwater processes in the model !

### Our diagnostic approach methodology

 Need to improve the performance of the model for the good reasons = better understanding and reproduction of hydrological processes, even at large scale

- Development of a diagnostic approach through hydrological signatures (Gupta et al., 2008)
  - Gives direction for model improvement
- Set of 11 hydrological signatures based on rainfall / runoff data (Horner, 2020 ; Horner et al., in prep)

Type of analysis	Signatures
Runoff coefficient	RC = Q/P
Flow duration curve (FDC)	Mid-segment slope, quantiles Q0.1, Q0.9
Baseflow analysis	BFI, baseflow magnitude
Seasonal P-Q threshold	Breakpoint, P-Q slopes in dry / wet periods
Streamflow recessions	Early / late recession characteristic times tau1, tau2

### Hydrological signatures



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# Application to J2000-Rhône

- Selection of 45 stations
  - Reference stations for low flow measurement
  - 34 7290 km2
  - Contrasted climate, altitude and geologies
- Performance
  - NSE -1.79 0.84
  - KGE -0.46 0.87
  - Bias -58 % +128 %
- Calculation of 11 signatures
  groundwater recharge



### Hydrological signatures vs performance

#### 11 signatures



Quantification of signature difference Sim –Obs sig Obs

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No correlation between

bias

kge

nse

nselog

- performance and signature deltas
- **Except Bias vs Runoff** coefficient (expected), Q0.1 and pq.slpdry

### Hydrological signatures vs performance



	nse	nselog	kge	bias
Mean mountain	0,44	0,30	0,37	-0,35
Mean plain	0,52	0,55	0,58	0,11

- Mountain catchment present overall lower performance than plain catchments (systematic underestimation bias)
  - Better reproduction of many signatures (bfi, bfmag, pq.bp, pq.slopes, Q0.9, tau1)...
  - There is a know precipitation underestimation bias in the mountains with SAFRAN...

### Focus on groundwater processes

Selection of 5 groundwater-oriented signatures (Horner et al., in prep) + groundwater recharge



- Analysis of observed signature values
- Confirms significant differences between karstic / non karstic sedimentary geologies
- Also clear differences between mountain / plain catchments
  - High variability of sedimentary geologies → should probably be split further
- Sedimentary and basement rock mountain catchments have similar signature values → topography wins over geology

Observed signature values according to dominant geology in the catchment

### Sim / obs signatures



Large boxplots = large variability => geology classes are too heterogeneous in the model

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Value close to  $0 \Rightarrow$  more appropriate parameter values

- Confirms that classification and parameterisation are more appropriate for mountain catchments
- Classifications should be • reworked for plain catchments

Obs / Sim signature differences according to dominant geology in the catchment

karst

socle

sédimentaire

plissé (karst)

plissé (sédim.)

plissé (socle)

### Sim /obs differences interpretation



Obs / Sim signature differences according to •

Too much or not enough baseflow? bfi and recharge : contradictory indicators?

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- Underestimated bfmag, fdcslope, and overestimated Q0.9 : too high flow during low flow periods = too high groundwater contribution but maybe not only
- Overestimated tau2 (karst, basement rock) : groundwater contribution too steady

sédimentaire Interpretation in terms of model socle parameters : 2 possible factors

- K<sub>RG</sub> recession time too long
- Size RG<sub>max</sub> too small → RG component always saturated : steady baseflow and no storage effect



### Sim /obs interpretation : examples

U1224010 : Tille à Arceau [karst]



Simulated flow components : RD1 = surface runoff ; RD2 = interflow ; RG1 = groundwater

- Low  $RG_{max}$  : saturated reservoir  $\rightarrow$  main contribution of RD2 without storage effect
- High  $K_{RG}$  : « flat » RG1 component

RD1 — RD2 — RG1

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 $RG_{max} = 10 mm$ ;  $K_{RG} = 100 days$ 

# Conclusions

- Hydrological signatures = interesting insights into model behaviour that as a complement to performance metrics
- Mountain catchments:
  - Low performance / high bias
  - Otherwise good signature values
  - Confirms known bias on SAFRAN forcings
  - Raises the issue of potential compensation of forcings bias during calibration process
- Diagnostic on J2000-Rhône model groundwater component: identification of geology classification + parameter value issues

# Conclusions

- Building of a signature set : need to be careful about the information content and redundancy of signatures
  - Correlation Runoff Coefficient
    / Bias
  - Contradictory BFI / recharge indicators
  - BFI is much larger than actual groundwater contribution
  - It is not representative of groundwater processes only



# Perspectives

- Ongoing work :
  - Formalize the links between signature values and parameters (Horner et al., in prep)
  - See if the recommendations for geology classification / parameter improvement actually work !
- Perspectives :
  - Include additional signatures : snow (Horner et al., 2020) and soil moisture (Branger & McMillan, 2020)
  - Extend the diagnostic to the other components of the model (soil, vegetation)
  - Generalize to all control stations of the catchment

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