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RheinBlick2050

Hydrological model intercomparison, suitability and robustness studies



CHR RheinBlick2050 final colloquium, 13/14 October 2010, Bonn, Germany

Structure of the presentation



- How reliable are hydrological models for climate change (CC) impact studies?
- Objectives within RheinBlick2050
- Hydrological models and data
- Testing the reliability of hydrological models
- Testing the stationarity hypothesis
- Comparing sources of uncertainty
- HBV134 reliability on reference period
- Main conclusions

How reliable are hydrological models for CC impact studies?

- A primary goal of hydrological modelling is to **simulate the transformation of precipitations into streamflow** at the catchment scale
- There is a large number of existing hydrological models differing in:
 - structure and parameterization
 - space and time scales
 - data requirements
 - etc.
 - Hydrological models are essential tools in water related studies... but:
 - they are imperfect
 - they introduce uncertainties in results







- Model selection depends on:
 - modelling objectives
 - data availability
 - user's experience and confidence in the model
- Quantification of the confidence in a model by evaluating its ability to simulate catchment behaviour and answer modelling objectives
- Klemes (1986) proposed the "split sample test" scheme to evaluate model transposability in time



How reliable are hydrological models for CC impact studies?

- Two options in the evaluation scheme with tests under:
 - 1. stationary conditions (*split sample test*): periods with similar climatic conditions
 - 2. non stationary conditions (*differential split sample test*): periods with contrasted conditions
- Option 1 widely used in model testing, not demanding enough in the case of CC impact studies
- Necessary use of option 2: evaluation of the model's ability to adapt to unknown conditions



Calibration on wet period and validation on dry period: change towards drier conditions

Performing the differential split sample test scheme

- Generalization to get more contrasted conditions between calibration/validation by **selecting specific years**:
- 1. Choose a selection index (e.g. mean precipitation or temperature)
- 2. Identify years with low/high index values (here selection of 5-year periods)
- 3. Calibrate/validate models on selected years in contrasted conditions:
 - calib. on low and valid. on high
 - calib. on high and valid. on low
- 4. Analyze change in model performance





Objectives within RheinBlick2050?

Climatic uncertainty





Hydrological uncertainty

Hydrological models



Semi-distributed HBV134 model



• Divides the catchment into subcatchments with flow routing



- Widely used on the Rhine basin
- Major prior efforts to optimize the model on the CHR_OBS data set (no re-calibration in RB2050)
- Two model versions: BFG and DELTARES

7 lumped hydrological models

(GR4J, GR5J, HBV0, IHAC, MORD, MOHY, TOPM)



- Consider the catchment as a single unit
- Models tested in various conditions
- From 4 to 9 free parameters automatically optimized
- Use of a simple degree-day snowmelt module on top of models
- Lumped models used as *benchmarks* for ₈ the semi-distributed model

Data and criteria

- CHR_OBS data set for the 1961-1990 reference period
- 8 target stations
- Daily time series of P, Temp., PE and Q
- Two PE formulations tested (Penman-Wendling and Oudin)
- 18 climatic projections
- Model evaluation using 6 performance measures (focusing on regime curve, mean, high and low flows)
- Difficulty to compare results due to different testing schemes





Testing the reliability of hydrological models



HBV134 model

- Generally high level of performance: more than 90% of observed flow variance explained on most of the 8 target stations (calibration results)
- Limited differences between BFG and DELTARES model versions

Lumped models

- Best models obtained good to very good results on all stations
- Catchment size not a factor limiting model performance (results similar to Merz et al., 2009)
- Significant differences between the worst and best lumped models, i.e. model structure potentially brings significant uncertainty
- Not a single model better everywhere
- MORD best performing on average followed by GR4J/GR5J/MOHY (the three other models are significantly poorer)

Testing the reliability of hydrological models



HBV134 model benchmarking (comparison in calibration)

• <u>On average on the 8 target stations</u>: **HBV134 versions better than all lumped models** (reduction of MORD RMSE values ranging from 2 to 20% for HBV134 model versions)

		Regime	Low flow	High flow		
Average efficiencies (NSE) on the 8 target stations	Model	Efficiency on monthly	Efficiency on log-	Efficiency on flows		
		mean flows	transf. flows			
	HBV134_BFG_EOU	0.916	0.919	0.911		Semi-
	HBV134_BFG_EWP	0.927	0.910	0.907		distributed
	HBV134_DELTARES	0.940	0.915	0.897		
	GR4J	0.868	0.849	0.857		
	GR5J	0.869	0.845	0.862		
	HBV0	0.823	0.814	0.776		Lumped
	IHAC	0.795	0.828	0.826		
	MOHY	0.886	0.842	0.857		
	MORD	0.911	0.870	0.870		
	ТОРМ	0.820	0.841	0.815		

- <u>On each target stations</u>:
 - HBV134 outperformed lumped models in Basel, Maxau, Worms and Kaub
 - Slight advantage to HBV134 in Köln and Lobith
 - Slight advantage to lumped models at Raunheim (Main) and Trier (Moselle)



Testing the stationarity hypothesis



- Tests performed only with lumped models
- <u>Main results</u>:
 - Models **less robust** in contrasted conditions
 - models calibrated under current conditions are not optimal to simulate catchment hydrological behaviour under very different future climate conditions
 - Sensitivity of results to calibration conditions varies between models
 - poorest models in split sample testing are also the most sensitive to calibration conditions
 - Differences much larger between models with the test under contrasted conditions

Ifferential split sample test scheme more informative on models' limitations

- Relative errors increase (by about 10% on low flows, a bit less on mean and high flows)
- Level of model error found under stationary conditions most likely optimistic



Comparing sources of uncertainty in hydrological projections

• Cascading (reliable) model options



- Evaluating the bandwith associated with hydrological projections
- Four combinations investigated:
 - Combination #1: 18 clim. proj. \times 1 hydr. model \times 1 param. set
 - Combination # 2: 18 clim. proj. × 1 hydr. model × 13 param. sets
 - Combination # 3: 18 clim. proj. \times 4 hydr. models \times 1 param. set
 - Combination # 4: 18 clim. proj. × 4 hydr. models × 13 param. sets

Increase in uncertainty due to paralehetteviztation

Comparing sources of uncertainty in hydrological projections

• Example results for Lobith for mean flow deviation for the 2021-2050 and 2071-2100 periods

CHR KHR



(cp: climate projection; ms: model structure; ps: parameter set)

- Structural uncertainty larger than parameter uncertainty
- Most of the spread in the bandwidth brought by climatic inputs
- Results similar for other stations and criteria

On the 8 target stations:

Climatic uncertainty > Hydr. model structure uncertainty > Hydr. model parameter uncertainty

HBV134 reliability on reference period



- Complete model chain run with the HBV134 to reproduce flows on 1961-1990
- Good confidence on mean flows, larger uncertainties on extreme flows
- Model chain is considerably better for gauges with winter high flows (Lobith, Köln, Kaub, Raunheim and Trier) than for gauges where high flows occur mostly in summer (Basel, Maxau and Worms) (the latter not further investigated)



Main conclusions

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- To which extent can we trust hydrological models in CC impact studies?
 - This can be objectively tested (although there are limitations to the evaluation framework used here)
 - Classical split sample test insufficient to evaluate model robustness
 - New solutions should be found to cope with the problem of parameter nonstationarity (ongoing works by Chiew et al. in Australia; Merz et al. in Austria; Brigode et al., Coron et al. in France; etc.)
 - Performance in current conditions are probably over-optimistic (i.e. model potential errors in future conditions underestimated)
 - Hydrological models still to be improved!
- On the Rhine basin:
 - HBV134 model more reliable on average than the lumped "benchmark" models (*but without full testing scheme*); HBV134 selected for further investigations in RB2050
 - Differences more significant on stations strongly influenced by the Alps

Main conclusions



In terms of uncertainty:

- On our target stations, significant uncertainty brought by model structure and (to a lesser extent) model parameters
- But uncertainty associated with climate forcings is larger
- Uncertainty underestimated due to the stationarity hypothesis
- Similar results had been obtained by other authors (e.g. Wilby, 2005)
- Considerable bandwidth associated with hydrological projections
- Might be difficult to handle in decision making
- Uncertainty may be reduced if **severe enough evaluation scheme** are applied to accept/reject models of the modelling chain: need to develop appropriate "**crash tests**" (see Andréassian et al., 2009)



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