Advancing streamflow prediction using hydrological multimodel ensemble forecasting system

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9th NOAA Ensemble Users Workshop

Three key points

- i) We demonstrate a regional hydrologic multimodel ensemble prediction system.
- ii) Multimodel ensemble forecasts have higher skill than single model forecasts.
- iii) Hydrologic model diversity enhances forecast skill more than increasing ensemble size alone.

- Many hydrological models with no clear advantage of one model over another
- Challenging to choose a single model for all flow conditions

Season quadrant

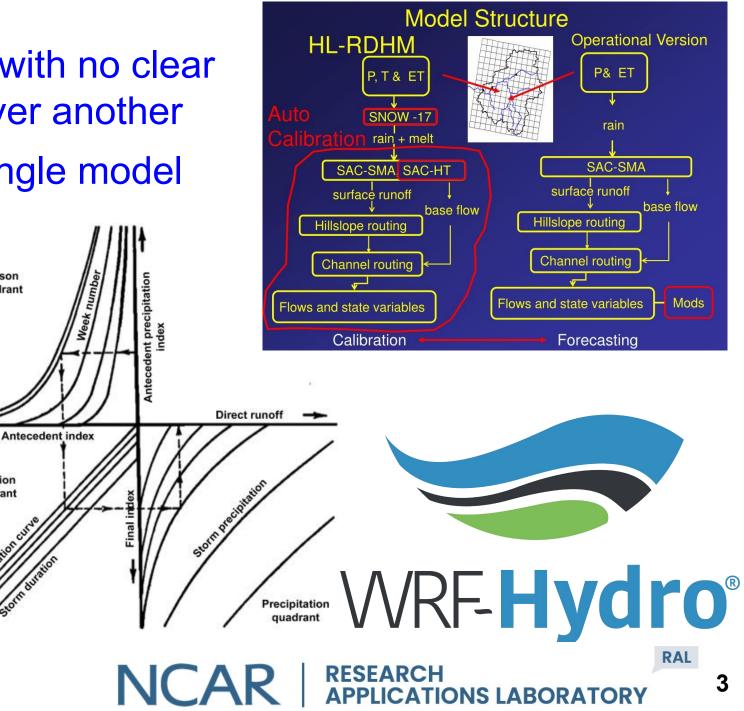
Duration quadrant

Is a hydrological multimodel system useful for improving streamflow forecasts?

HL-RDHM:https://www.slideserve.com/september-a guilar/overview-of-nws-distributed-model-hl-rdhm

API-CONT:http://www.nws.noaa.gov/oh/hrl/nwsrfs/u sers_manual/part2/_pdf/23apislc.pdf

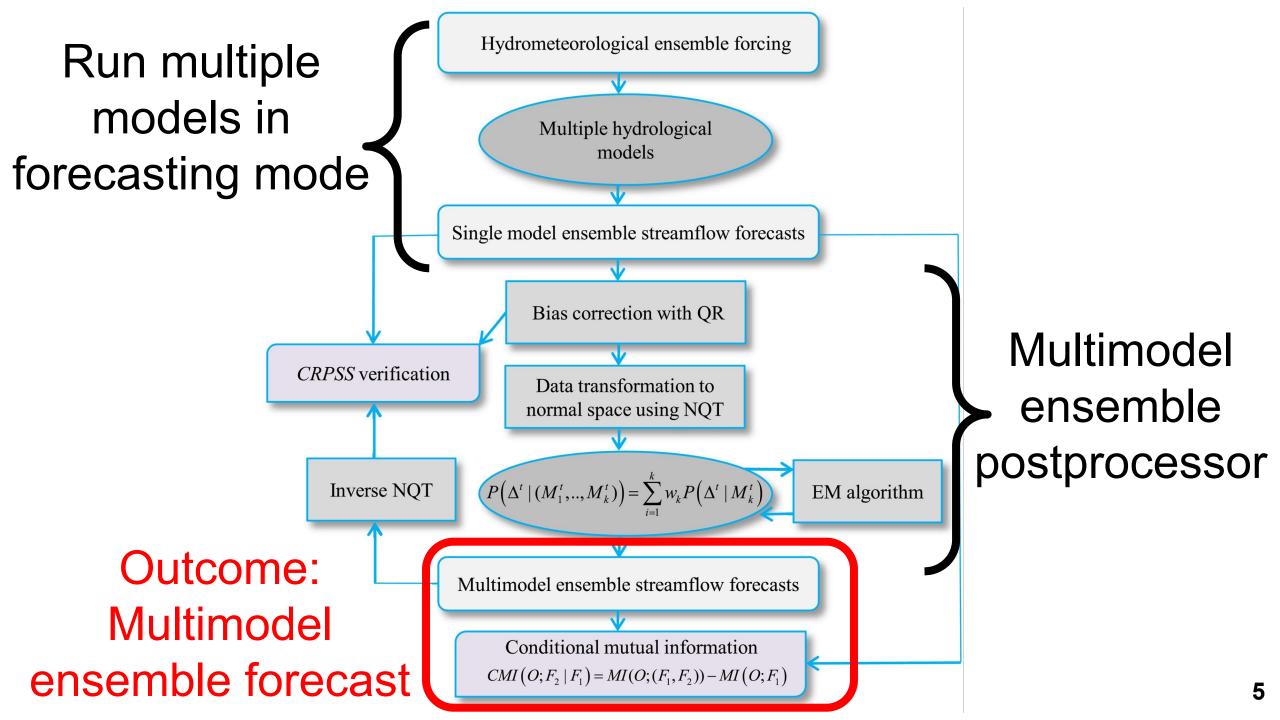
WRF-Hydro:https://ral.ucar.edu/solutions/products/w rf-hydro-modeling-system



We assemble, implement and verify a regional Hydrologic **Multimodel Ensemble Prediction** System [HMEPS]

Sharma, Sanjib, Ridwan Siddique, Seann Reed, Peter Ahnert, and Alfonso Mejia. "Hydrological model diversity enhances streamflow forecast skill at short-to medium-range timescales." *Water Resources Research* 55, no. 2 (2019): 1510-1530.

Sharma, Sanjib, Ridwan Siddique, Seann Reed, Peter Ahnert, Pablo Mendoza, and Alfonso Mejia. "Relative effects of statistical preprocessing and postprocessing on a regional hydrological ensemble prediction system." Hydrology and Earth System Sciences 22, no. 3 (2018): 1831-1849.



We consider diverse set of hydrologic models

i) HL-RDHM (distributed, conceptual) - 2 x 2 km² resolution

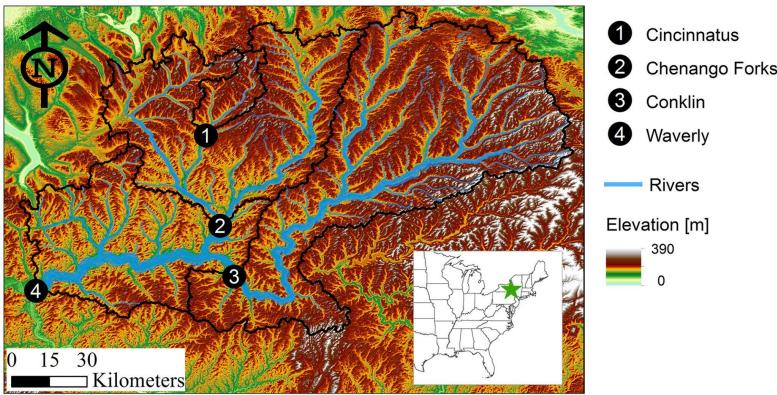
ii) Continuous API (<u>lumped, conceptual</u>)- Operational forecasts from NOAA's MARFC

iii) WRF-Hydro (distributed, land surface)

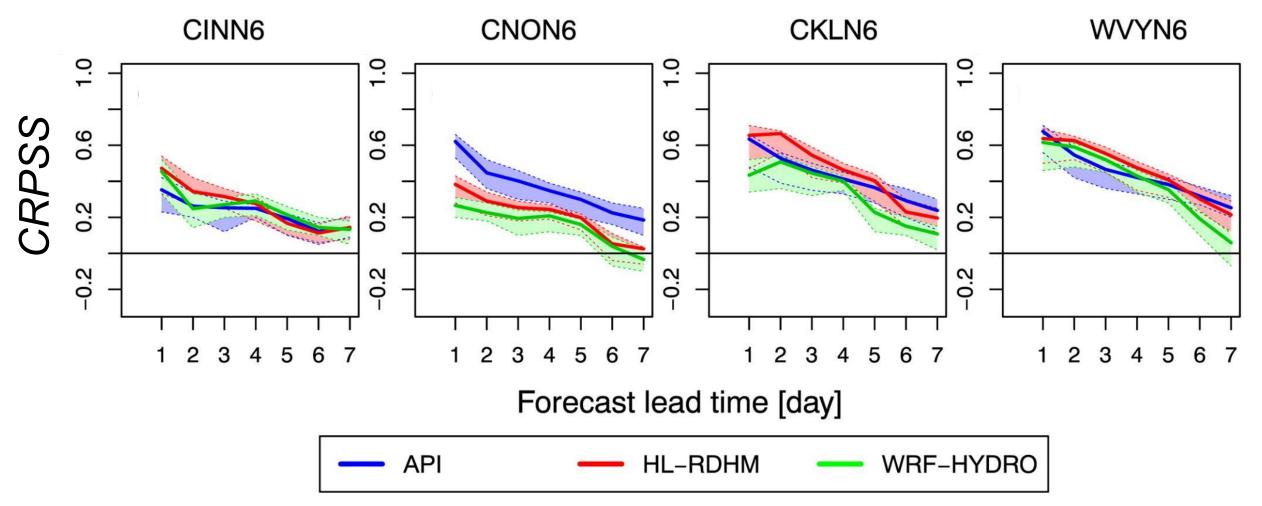
- Employs land surface model NoahMP
- Gridded wave diffusion routing
- 1 x 1 km² resolution

Forecasting experiment is conducted in four nested subbasins in the mid-Atlantic region

- GEFSRv2 (2004-2009) is used as weather forcing.
- We employ quantile regression-Bayesian model averaging (QR-BMA) as multimodel ensemble postprocessor.
- Verification is performed
 conditioned on forecast lead times (1-7 days) & basin size.

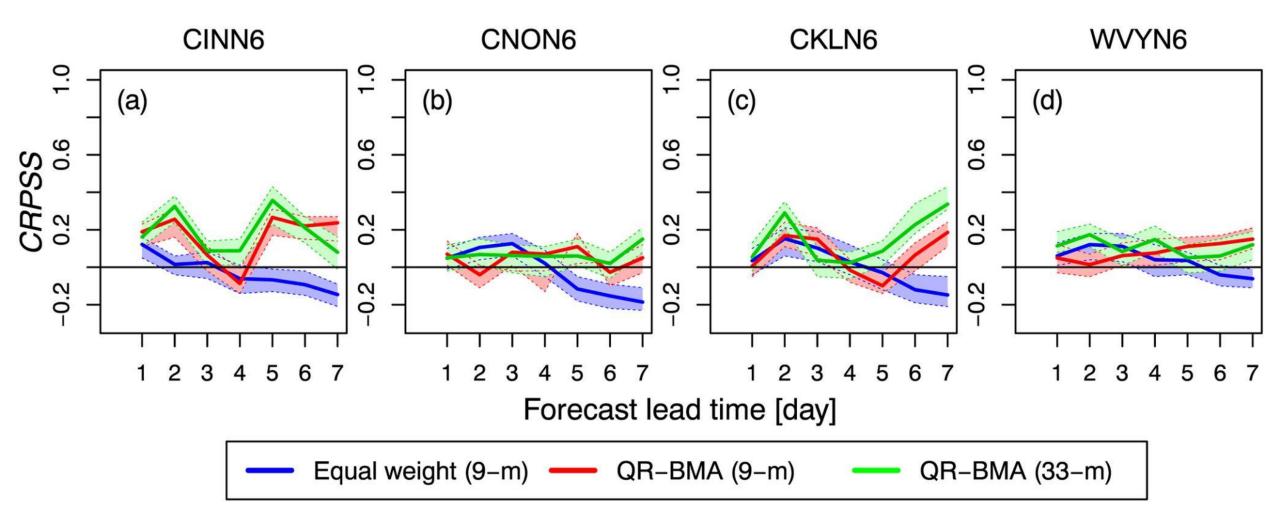


There is no single predictive system that can be considered best in all forecasting conditions



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Multimodel prediction improves forecast skill over single model



Are any skill improvements from the multimodel ensemble forecasts dominated by model diversity or the addition of new ensemble members?

Model diversity enhances forecast skill more than ensemble size alone

9-m Single model						9-m Multimodel 3 members each					33-m Multimodel 11 members each				
API															
7	0.09	0.09	0.09	0.09	7	0.54	0.45	0.52	0.51	7	0.45	0.34	0.45	0.53	
6	0.07	0.07	0.09	0.09	6	0.61	0.36	0.50	0.44	6	0.53	0.31	0.46	0.38	
5	0.03	0.05	0.09	0.07	5	0.50	0.41	0.34	0.32	5	0.42	0.35	0.37	0.32	
4	0.06	0.08	0.1	0.09	4	0.42	0.33	0.35	0.32	4	0.40	0.31	0.30	0.34	
3	0.11	0.13	0.12	0.07	3	0.39	0.27	0.26	0.24	3	0.39	0.24	0.27	0.26	
2	0.06	0.07	0.07	0.02	2	0.39	0.20	0.18	0.21	2	0.29	0.16	0.22	0.18	
1	0.01	0.01	0.02	0.01	1	0.33	0.18	0.10	0.11	1	0.28	0.19	0.10	0.10	
	CINN6	CNON6	CKLN6	WVYN6		CINN6	CNON6	CKLN6	WVYN6		CINN6	CNON6	CKLN6	WVYN6	
	Conditional mutual information [CMI]														

0.03

0.06

0.10

0.25

0.40

0.55

0.80

Ongoing works and future plans...

- i) How can we enhance the predictability of extreme events?
- ii) How can we effectively incorporate and analyze additional uncertainties, considering their potential interactions?
- iii) What insights can be gained from emerging data-model fusion strategies, such as combining AI/ML and DA?
- iv) What are the robust strategies for flood-risk management?

Thank you!

Looking forward to the discussion



Water Resources Research[•]

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