# Hydrologic process and error modelling methods for river basin scale prediction and forecasting in Australia

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LAND AND WATER www.csiro.au







# Context

## **Research focus**

- Forecasting emphasis
- Operational applications
- Basin scale
- Hours seasons
- Quantitative predictions and forecasts
- Supporting national services consistent methods across locations

## Australian hydrology

- Very high interannual variability
- Intermittent and ephemeral streams important





# What are we trying to achieve?

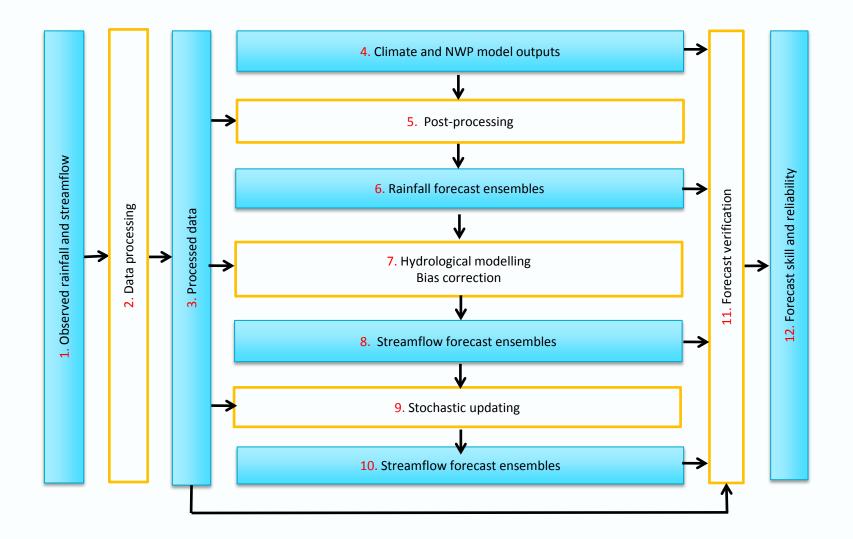
Quantitative ensemble predictions and forecasts displaying:

- Minimal bias
- Accuracy
- Coherence (errors no worse than climatology)
- Reliable uncertainty (ensemble spread consistent with forecast errors)

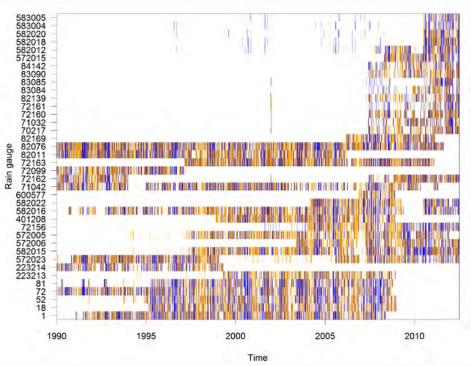
For flood and water resource management applications

- Individual locations and lead-times
- Spatial and temporal accumulations
- Realistic ensemble members usable for downstream applications

# **Ensemble forecasting framework**



# Making best use of available observations

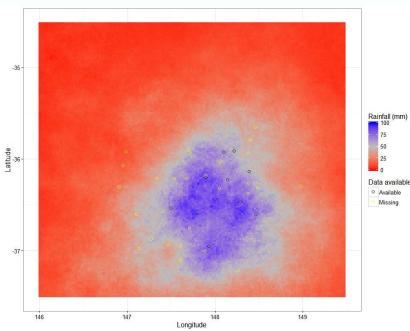


### Data infilling and interpolation

- Bayesian hierarchical model
- Explicit consideration of covariates
- Infill missing data with ensembles
- Ensemble interpolation to catchment and rainfall fields
- Locally consistent rainfall for hydrological modelling

### **Real-time hourly data**

- Missing observations
- Inconsistent observation network
- Spatial characteristics topography



## **Extracting signal from weather and climate predictions**

Raw forecast challenges:

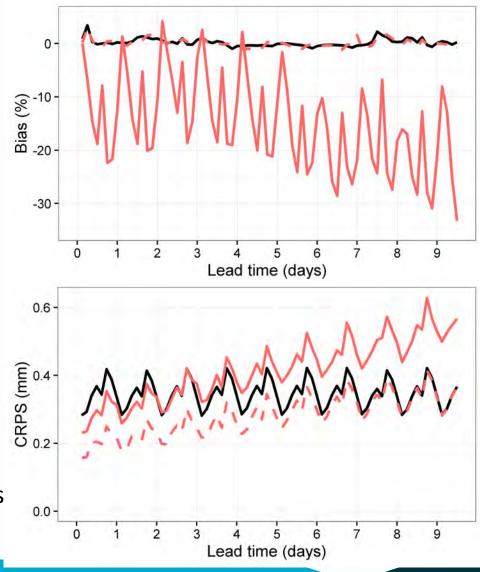
- Bias
- Coherence
- Reliability

Model output statistics style postprocessing:

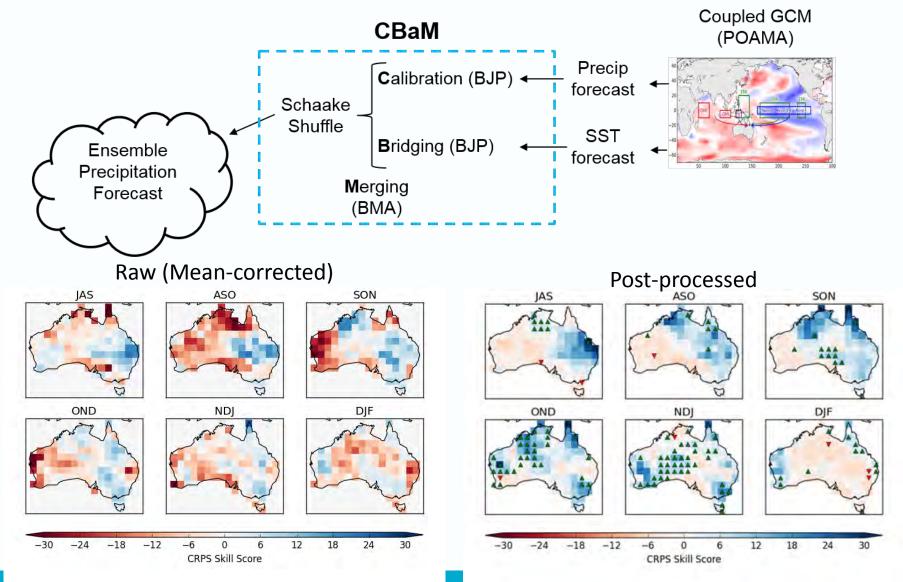
- Reduces bias
- Ensures coherence and reliability

Australian technology combines:

- BJP statistical model
- Schaake shuffle space-time correlations
- Other predictors for seasonal forecasts

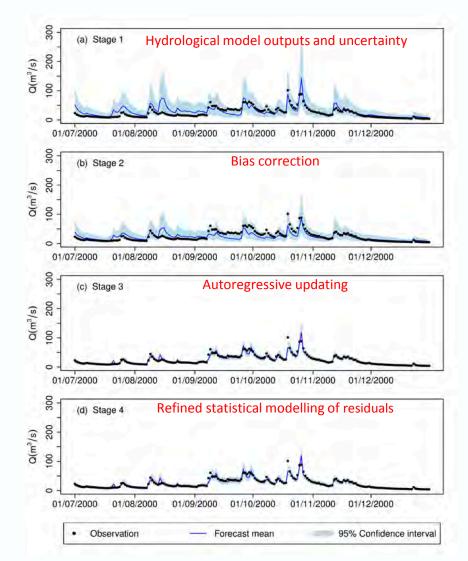


## **Getting the best seasonal precipitation forecasts**

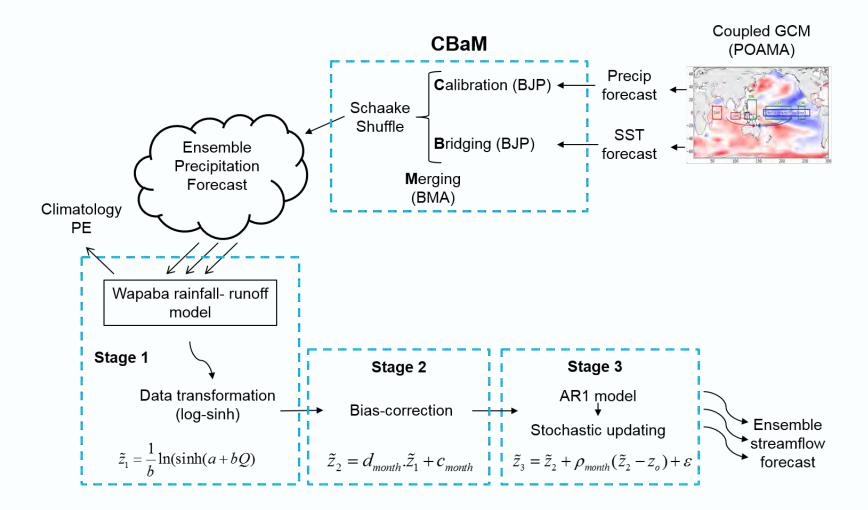


## Reducing and representing errors in hydrological models

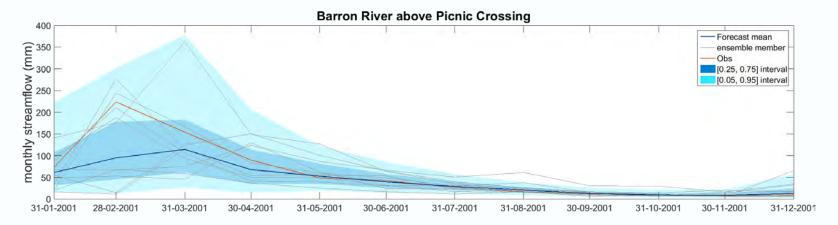
- Hydrological models not perfect
- Some hydrological model errors systematic
- Need to describe hydrological model errors for reliable forecasts
- Observations available to update predictions in real-time
- Errors not normally distributed
- Zero values complicate error distributions
- Complexity of error models need to be appropriate to application

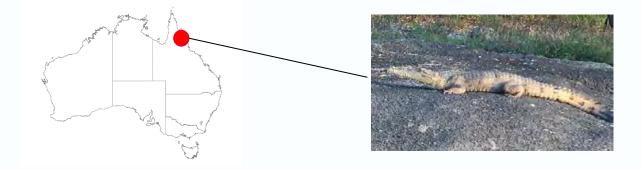


# Putting it all together – Forecast Guided Stochastic Scenarios (FoGSS)



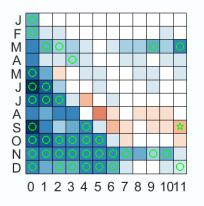
### **FoGSS example forecast**



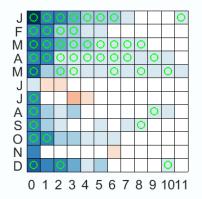


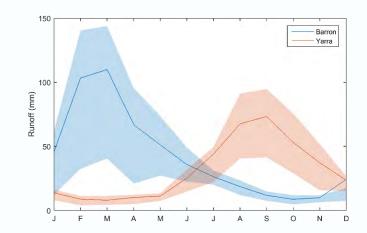
## **Streamflow forecast skill**

#### Barron River

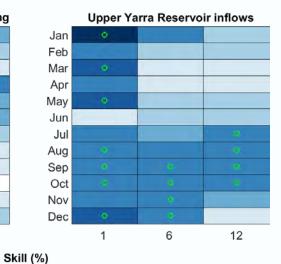


#### Upper Yarra



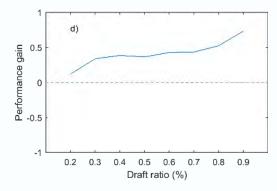


#### **Barron River above Picnic Crossing** Jan Feb Mar Apr May Jun Jul Aug Sep Oct Nov Dec 6 12 1



#### -100 -50 -35 -20 -15 -10 -5 5 10 15 20 35 50 100

#### **Upper Yarra Reservoir**



#### Turner, Bennett, Robertson, Galelli (in press) HESS

# **Summary**

- All models are wrong but some model predictions are useful
- Ensemble predictions and forecasts permit honest description of model limitations
- Combining statistical techniques with process-based models is effective in:
  - Supporting 'downstream' applications
  - Generating coherent predictions and forecasts
  - Reliably quantifying uncertainties
- We are happy to help and learn as well

# Thank you

#### CSIRO Land and Water

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