



Progress toward ensemble 7-day streamflow forecast for Australia

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Australian Government
Bureau of Meteorology

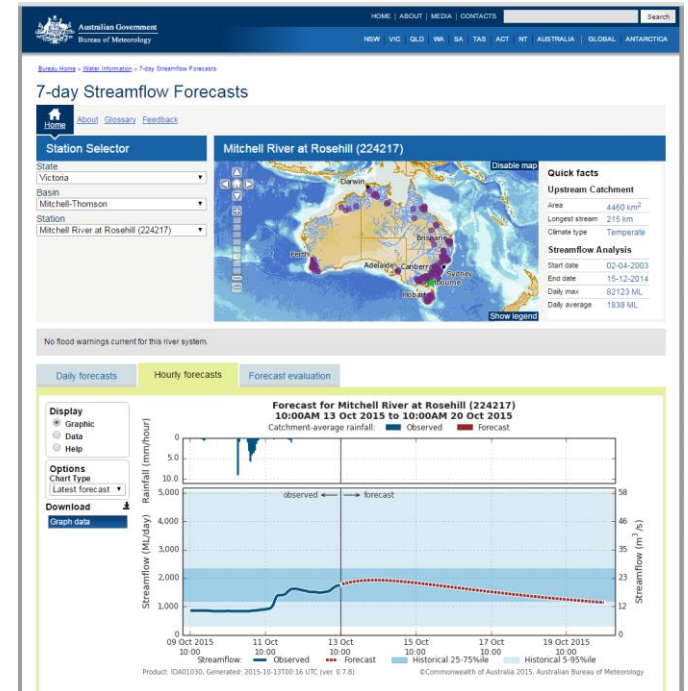
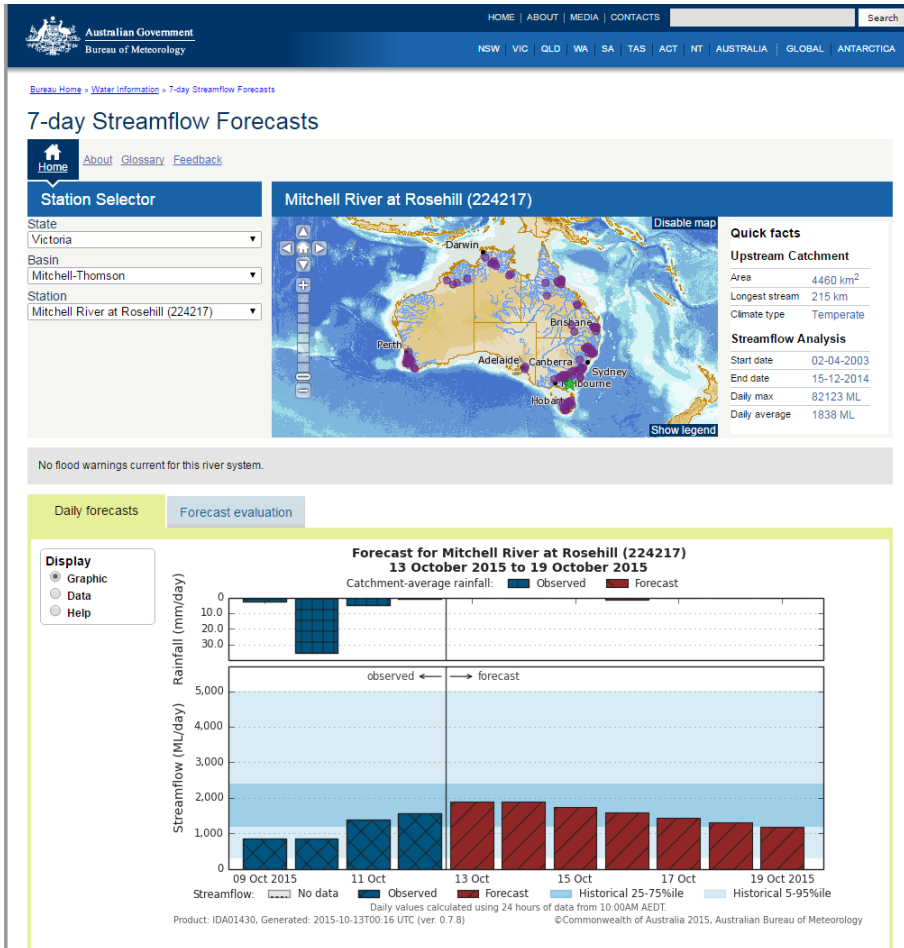


Water Information
DATA > INFORMATION > INSIGHT



Deterministic 7-day streamflow forecasts

(www.bom.gov.au/water/7daystreamflow)



An end-user's case for ensemble forecasts

(Environmental flow manager)

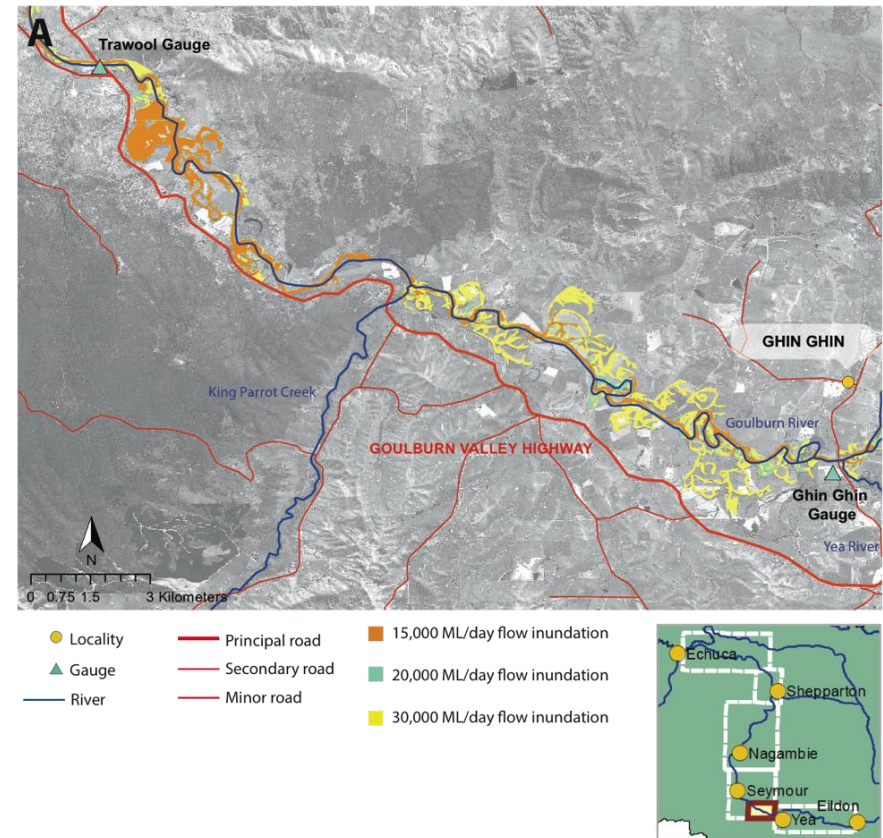
7-day forecasts will allow:

- “understand *risk* of catchment runoff at time of release”
- “manage flooding *risk*”

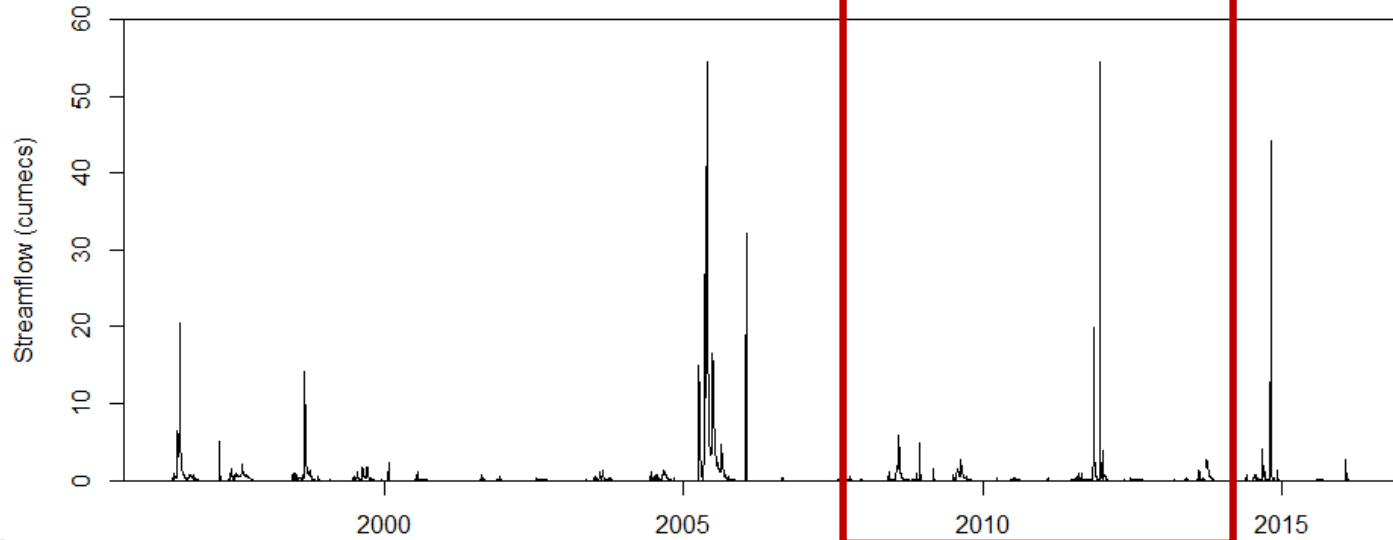
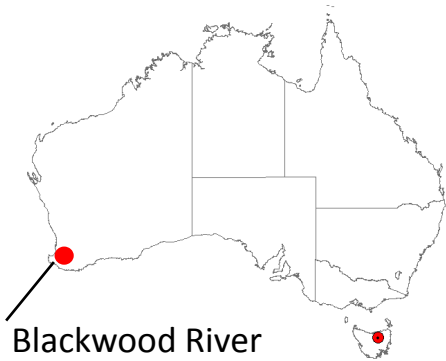
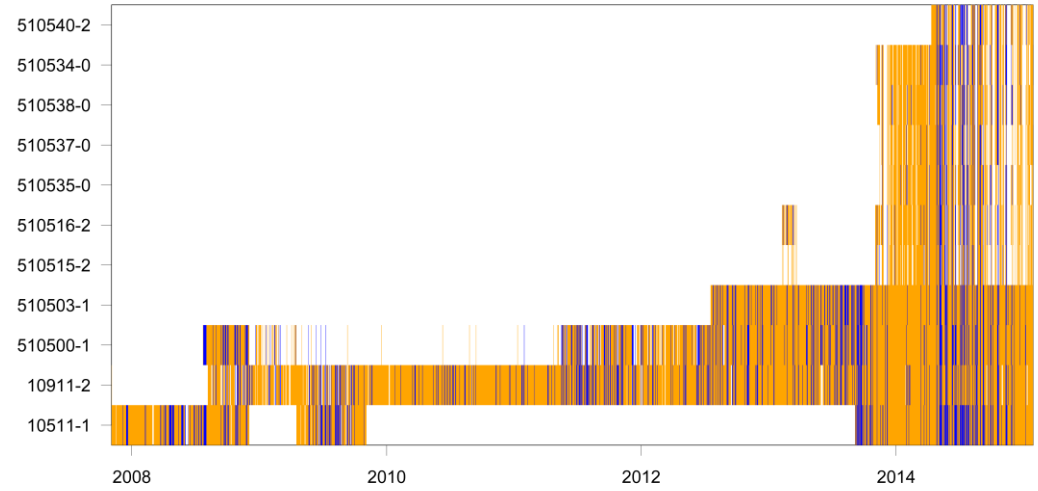
Risk = likelihood × consequence

“Good handle on consequences”

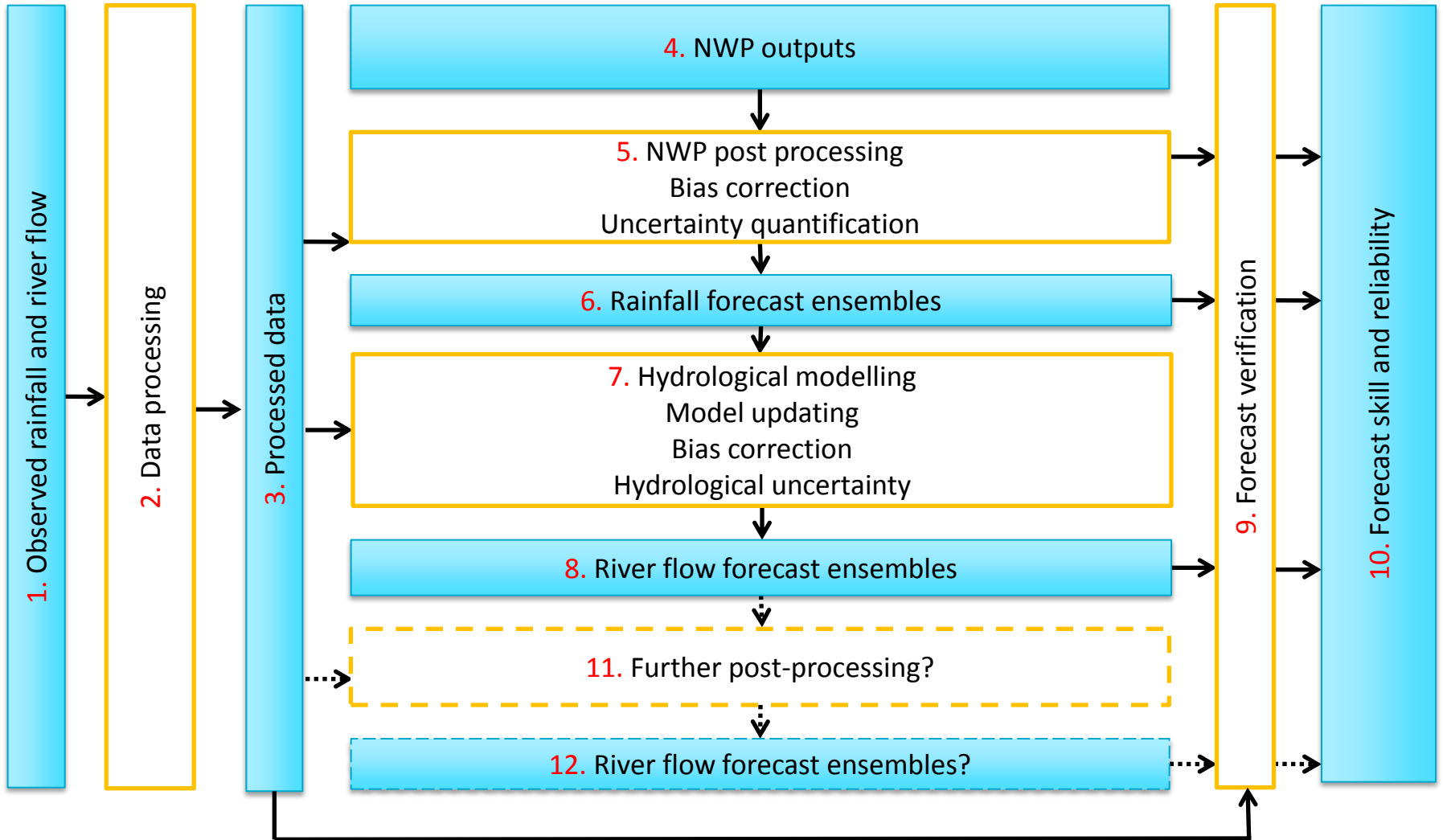
A deterministic service only gives an expected flow scenario and not likelihood of different scenarios



Forecasting challenges



Ensemble forecasting framework



Ensemble forecast system components

- Observed data

Adapted from existing flood forecasting service

- Rainfall forecasts

RPP (Bayesian rainfall forecast post-processor)

- Runoff and routing models

Semi-distributed; GR4H, Muskingum ...

- Hydrological error

Dual pass error correction (Pagano, Wang, Hapuarachchi, Robertson, 2011, JoH)

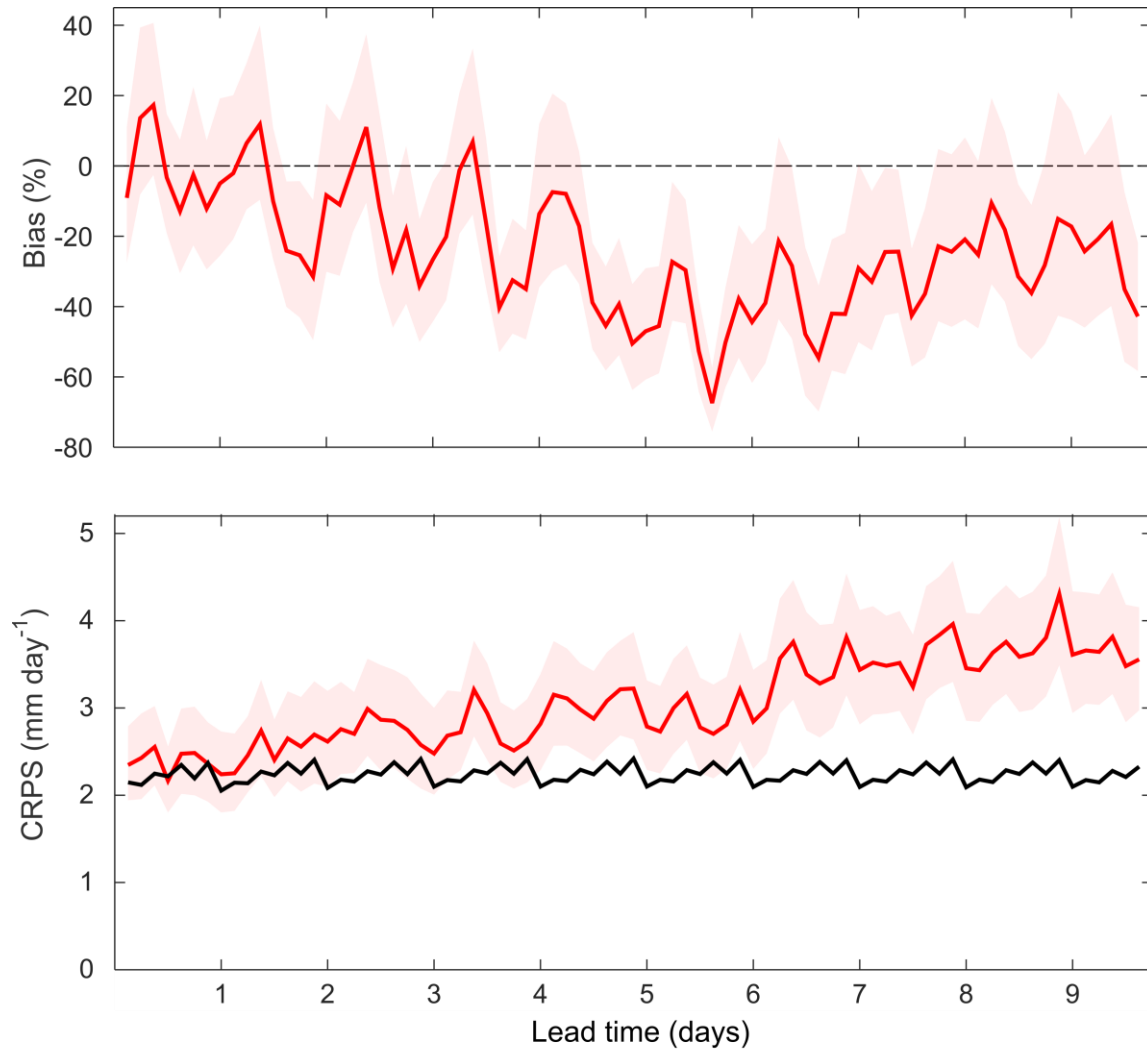
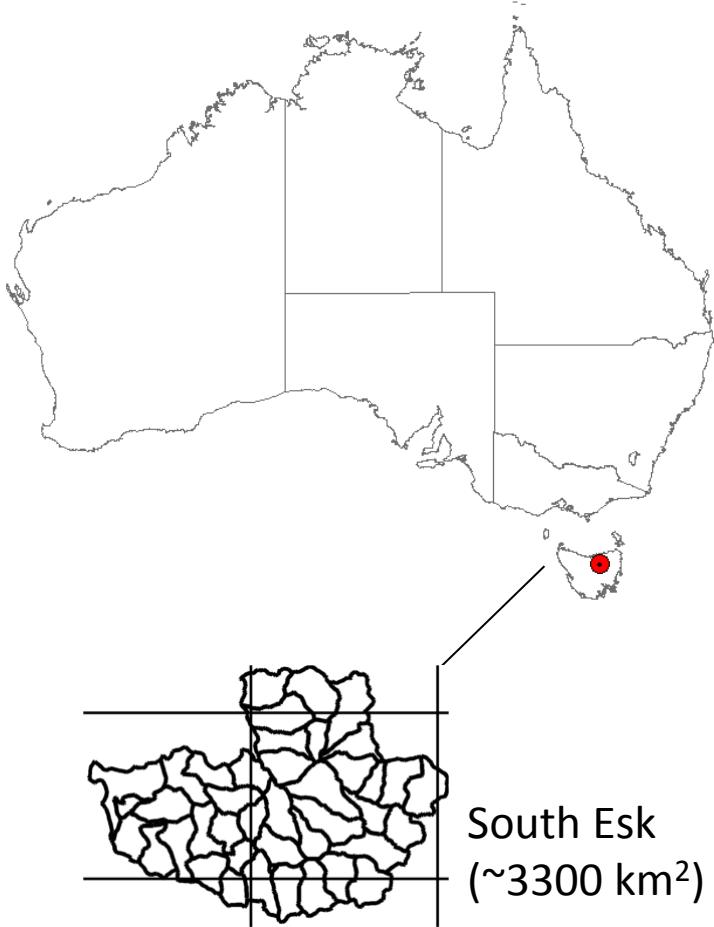
- Verification

Cross validation scheme

Ensemble forecast system components

- **Observed data**
Adapted from existing flood forecasting service
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RPP (Bayesian rainfall post-processor)
- **Runoff and routing models**
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Cross validation scheme

Rainfall forecasts



Shrestha, Robertson, Bennett, Wang (2015) MWR

— Raw ACCESS-G

— Climatology

Rainfall forecast post-processing

(Robertson, Shrestha, Wang, 2013, HESS)

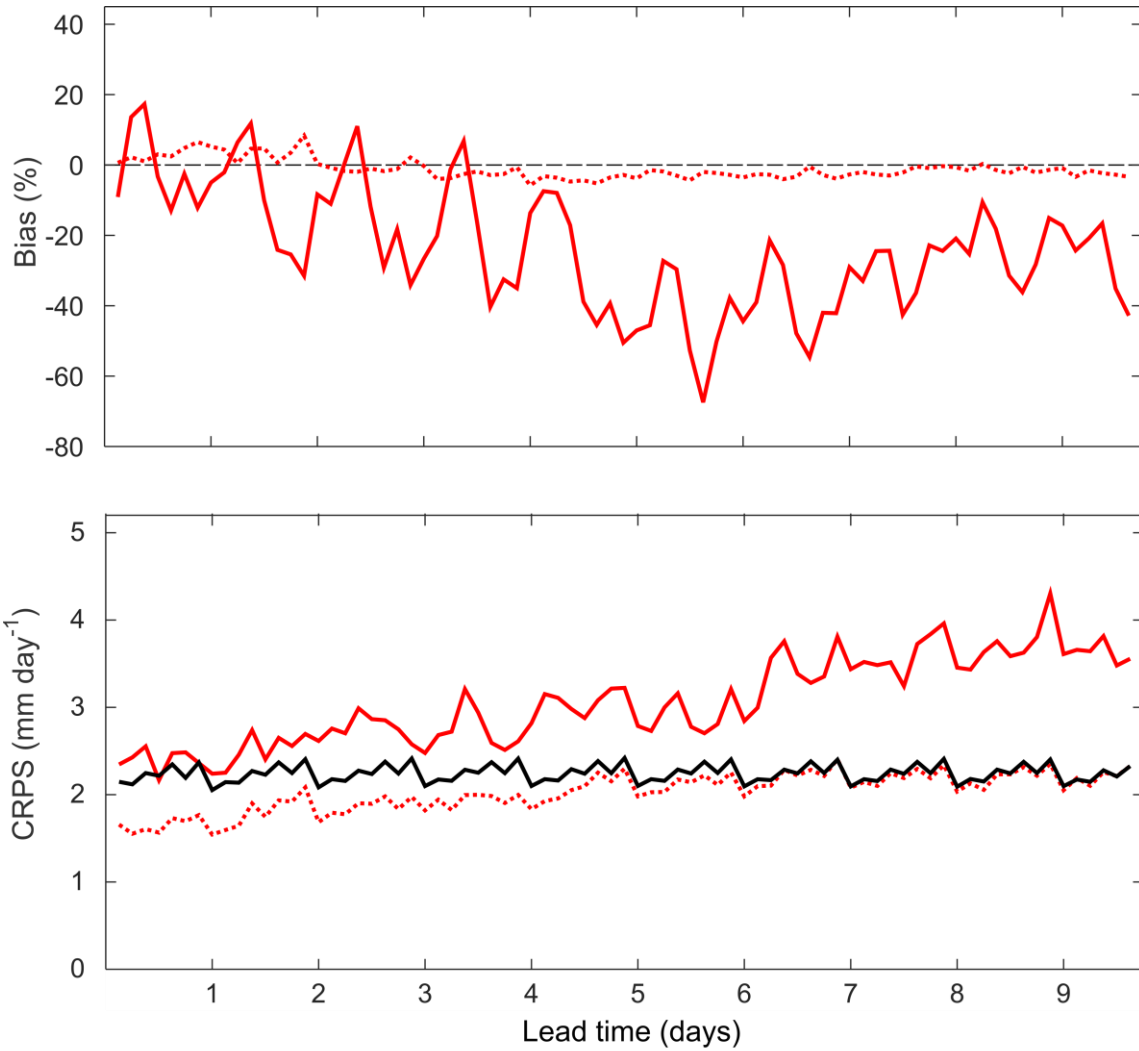
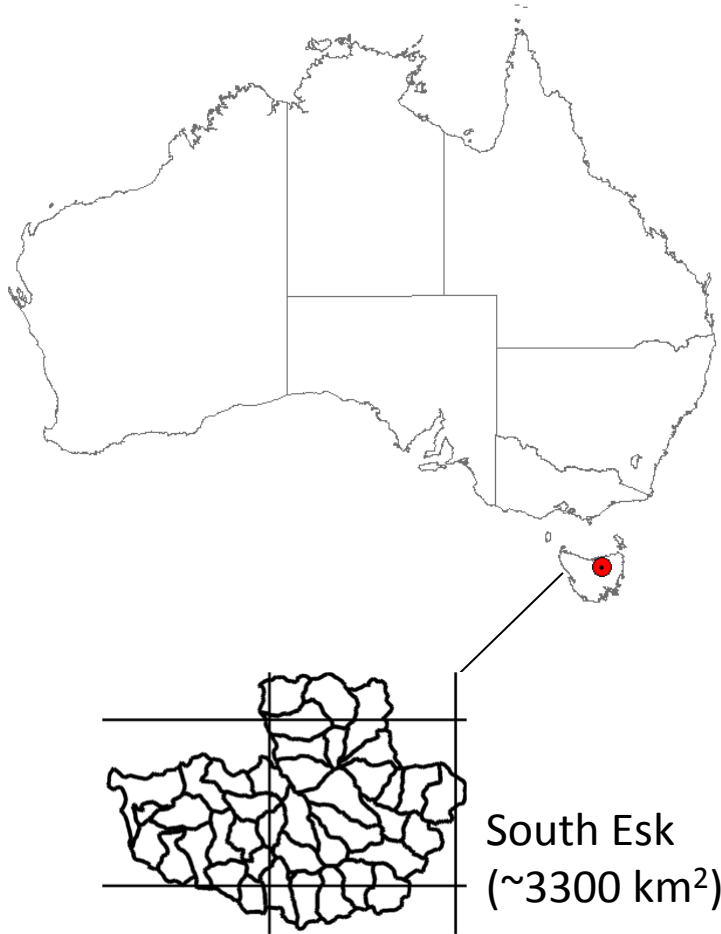
Step 1: Correct biases and quantify uncertainty

- Modified Bayesian joint probability (BJP) model
 - Log-sinh transformation (Wang, Shrestha, Robertson, Pokhrel, 2012, WRR)
 - Treatment of zero data
 - Continuous bivariate normal distribution

Step 2: Instill temporal and spatial patterns

- Schaake Shuffle (Clark, Gangopadhyay, Hay, Rajagopalan, Wilby, 2004, JHM)

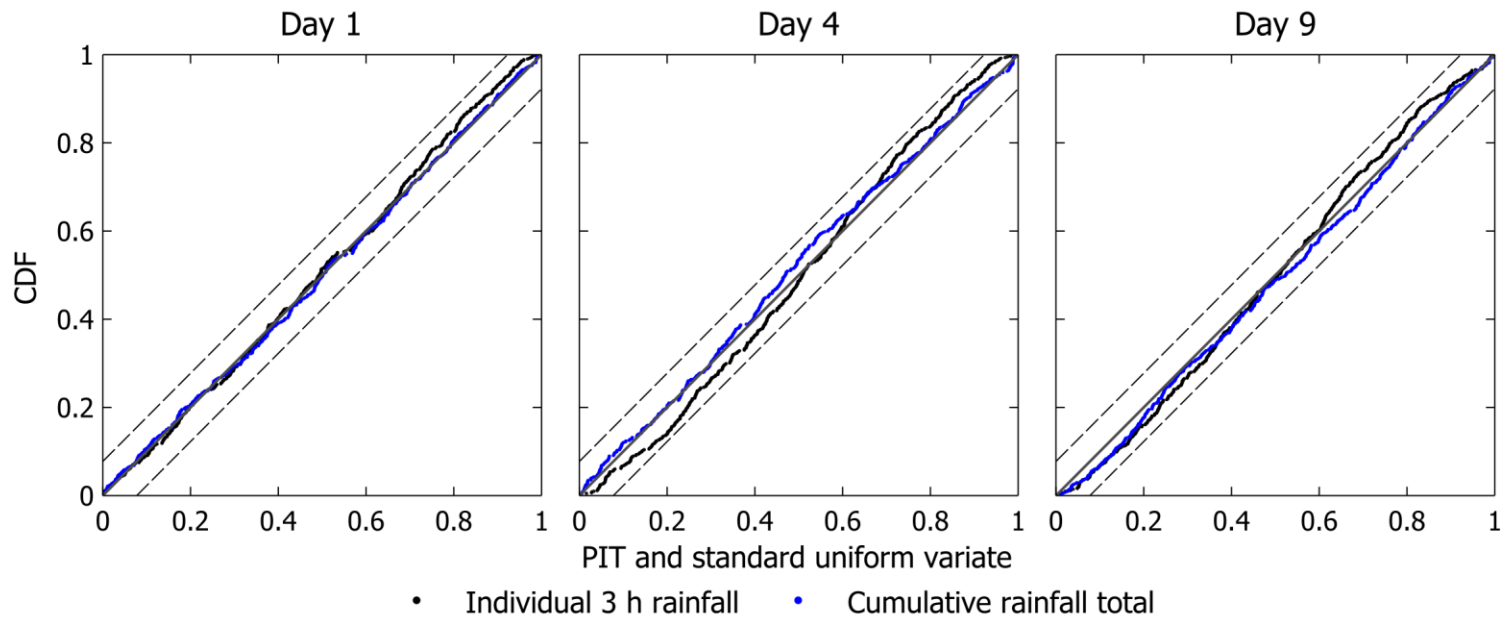
Rainfall forecast post-processing



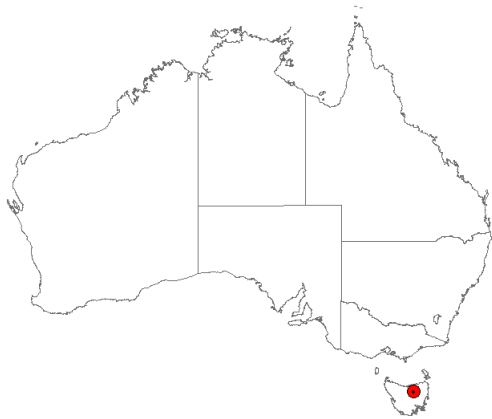
Shrestha, Robertson, Bennett, Wang (2015) MWR

— Raw ACCESS-G Post-processed ACCESS-G — Climatology

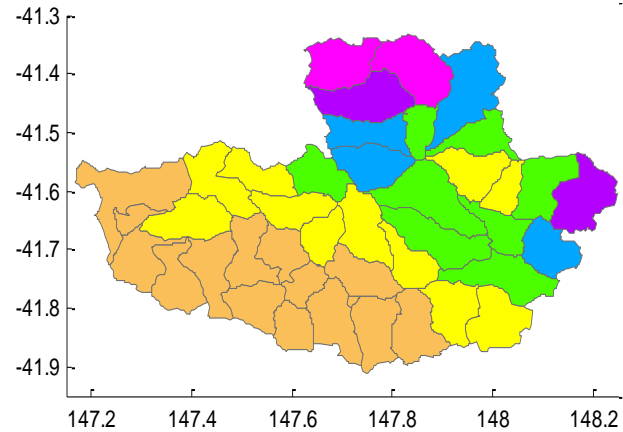
Rainfall forecast reliability



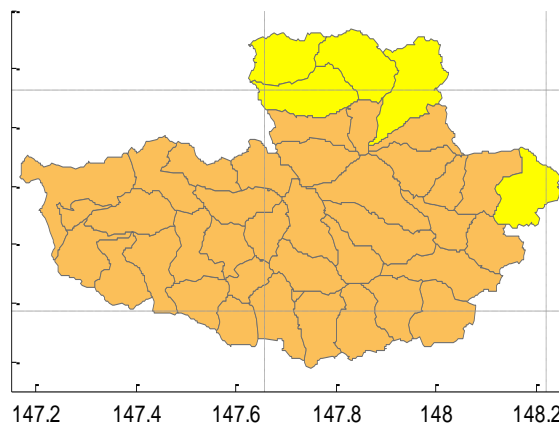
Rainfall forecast post-processing – spatial effects



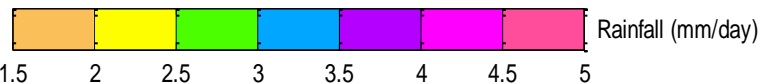
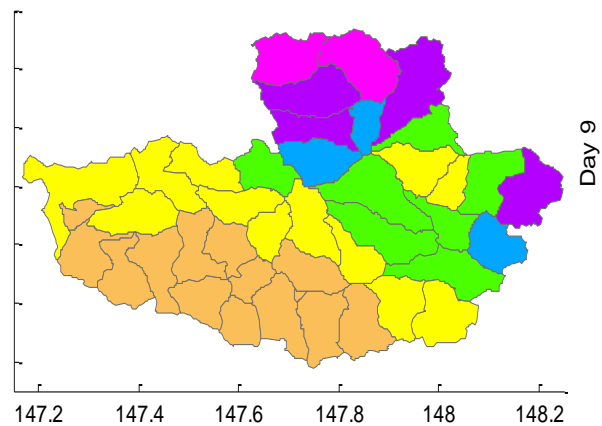
Observations



Raw ACCESS-G

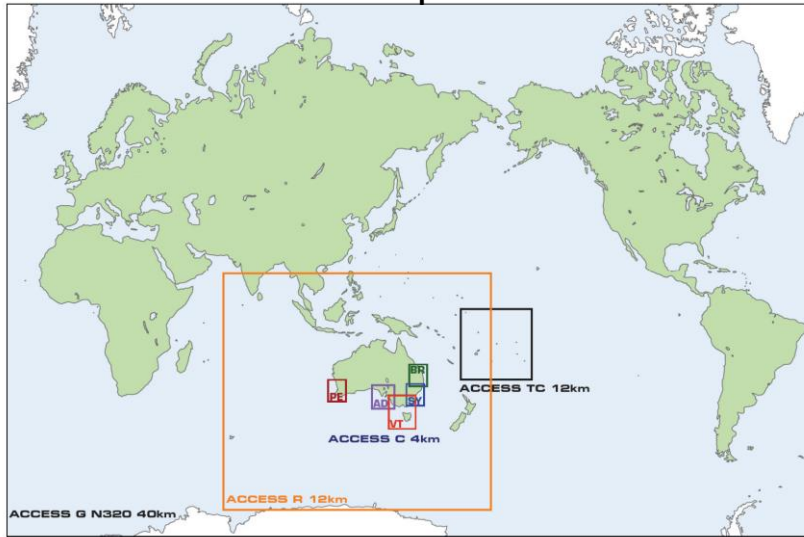


Post-processed ACCESS-G

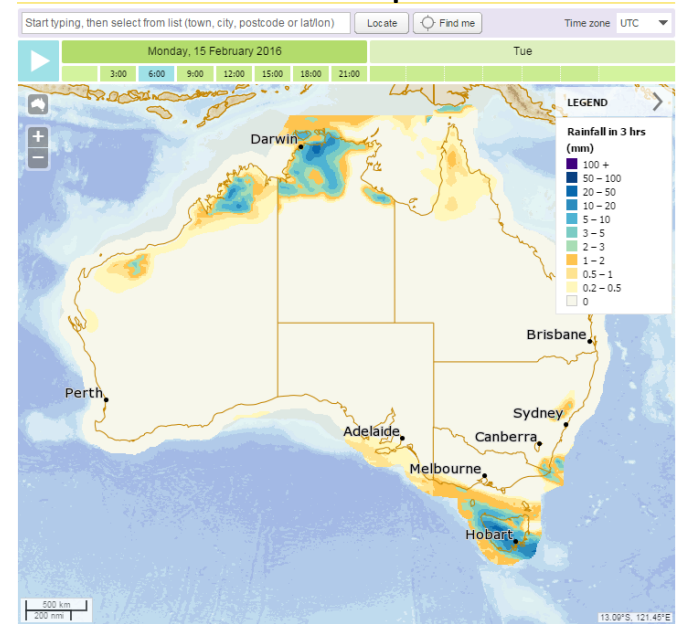


What rainfall forecast product?

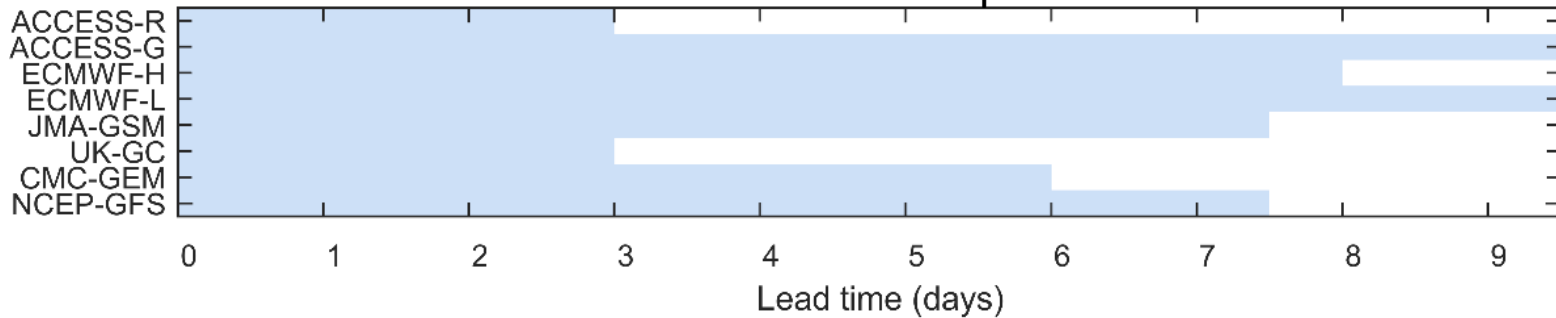
NWP output



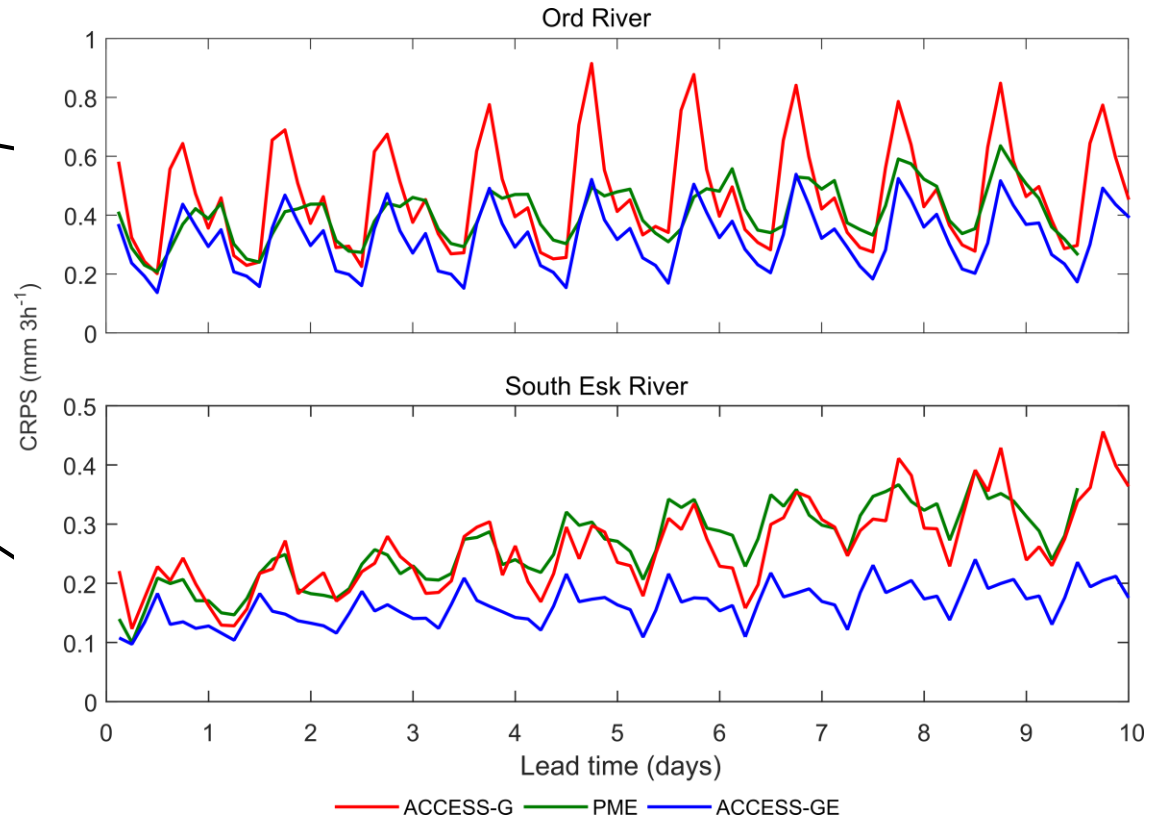
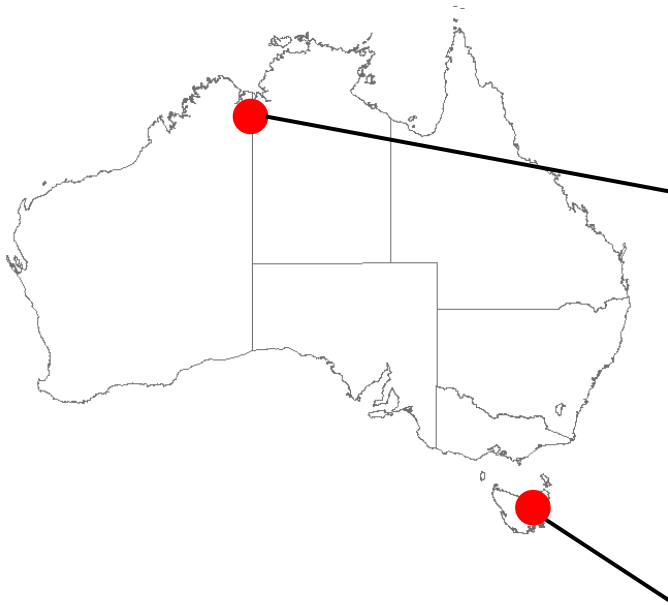
Forecaster updated



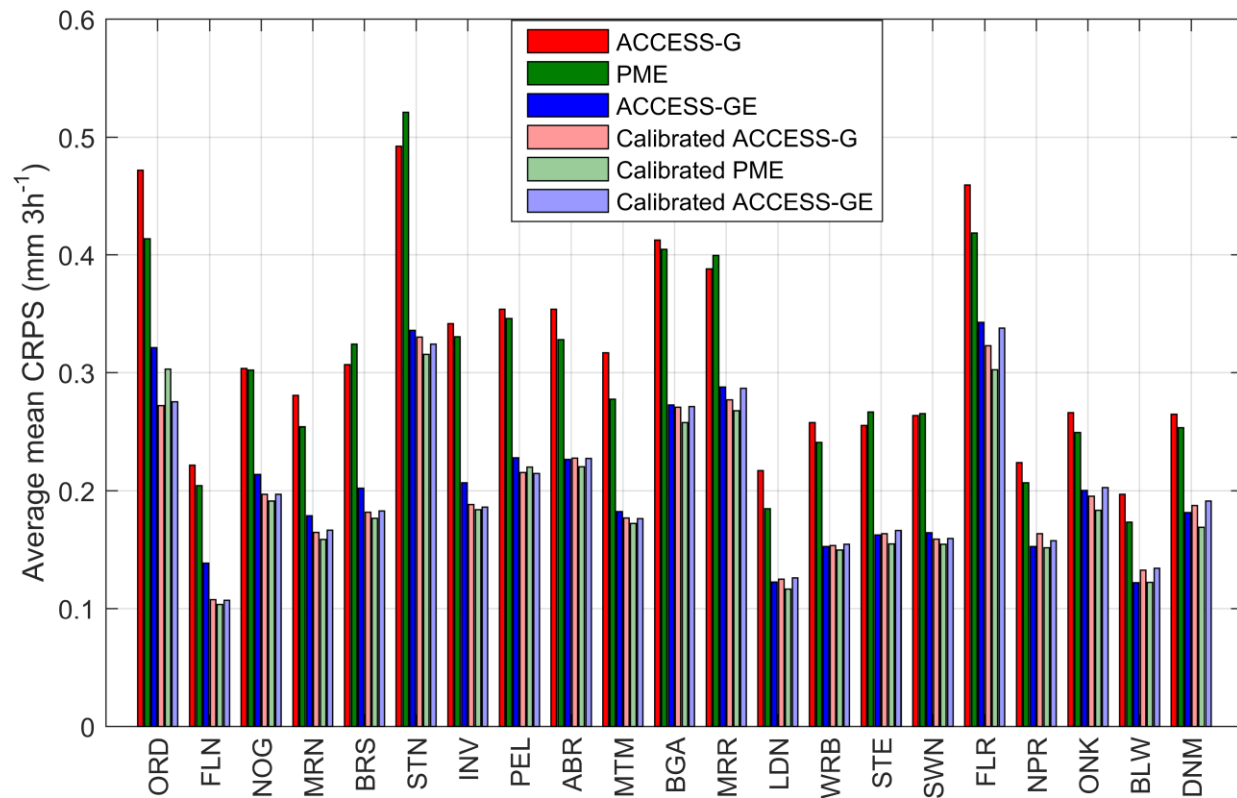
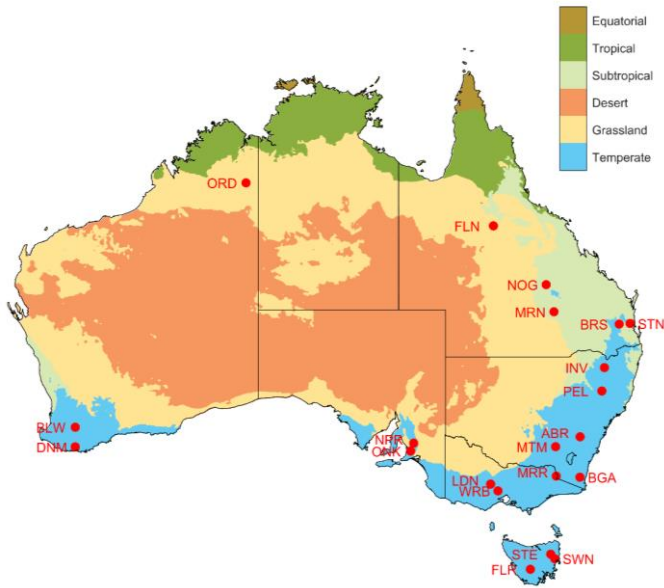
Combined NWP output



What forecast product?



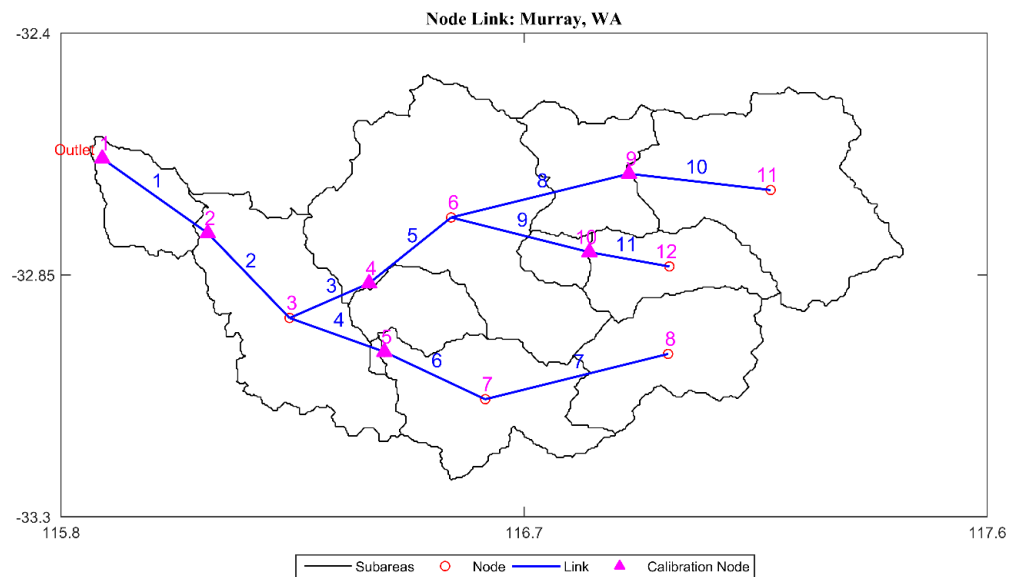
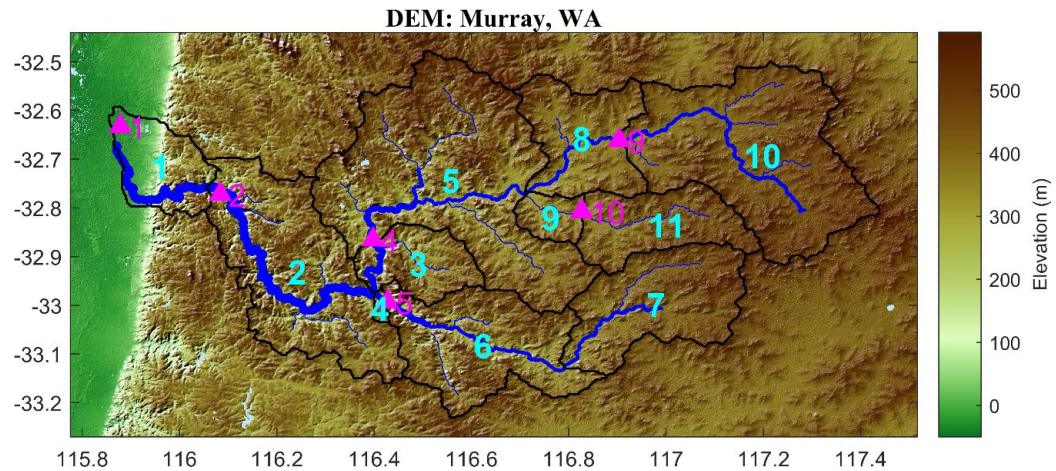
What forecast product?



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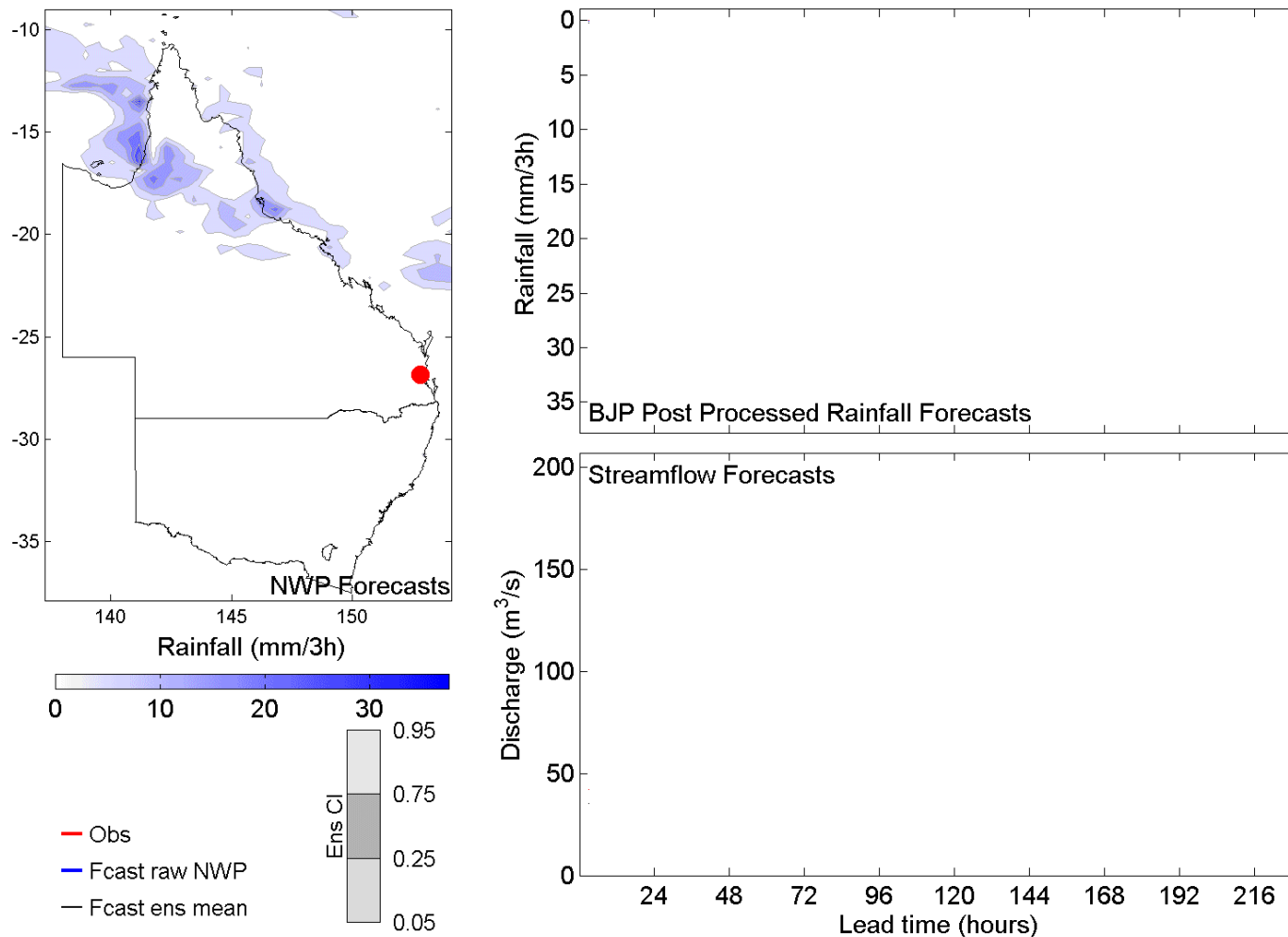
Hydrological modelling



Bennett, Robertson, Shrestha, Wang, Enever, Hapuarachchi, Tuteja (2014) JoH

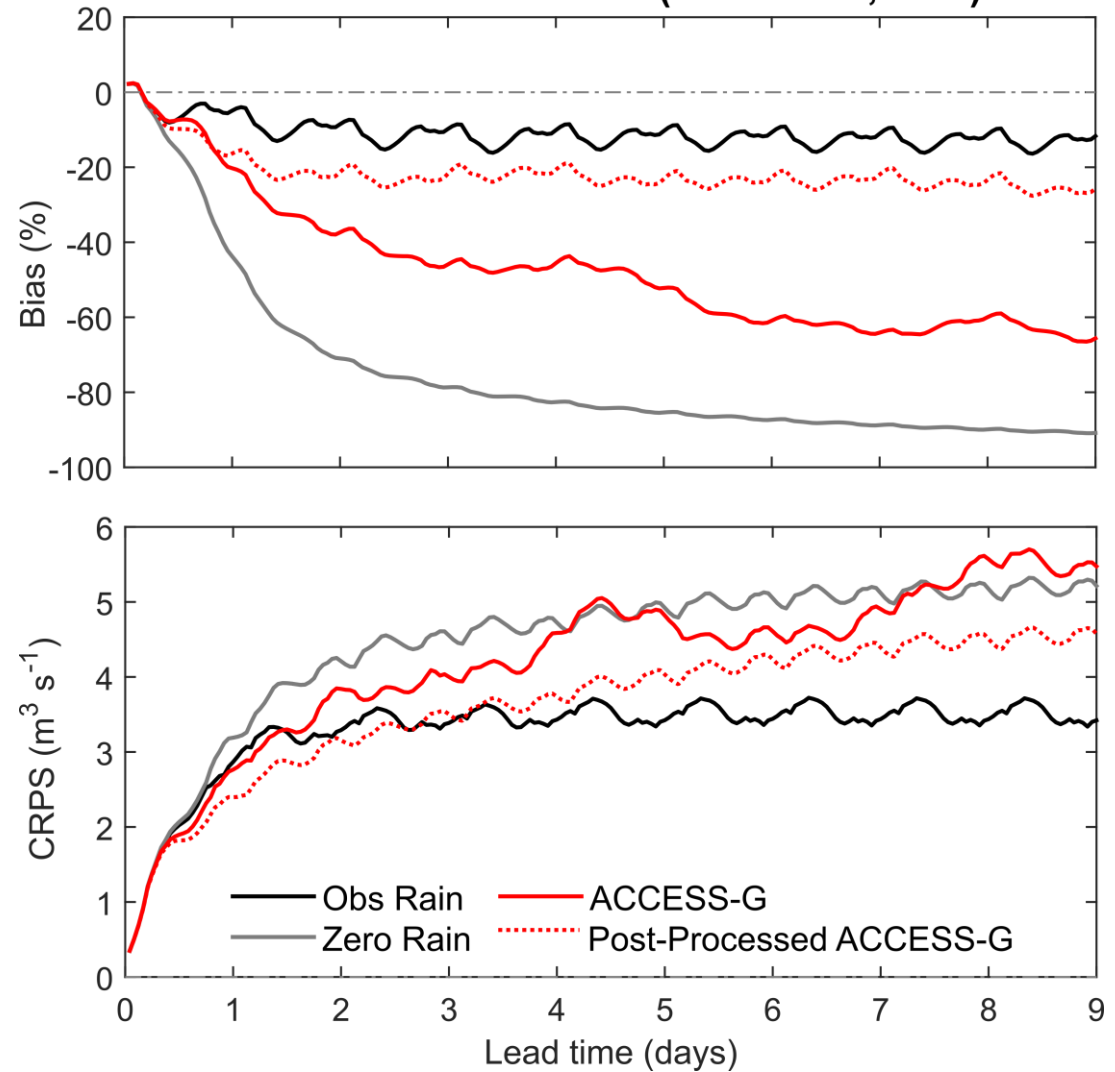
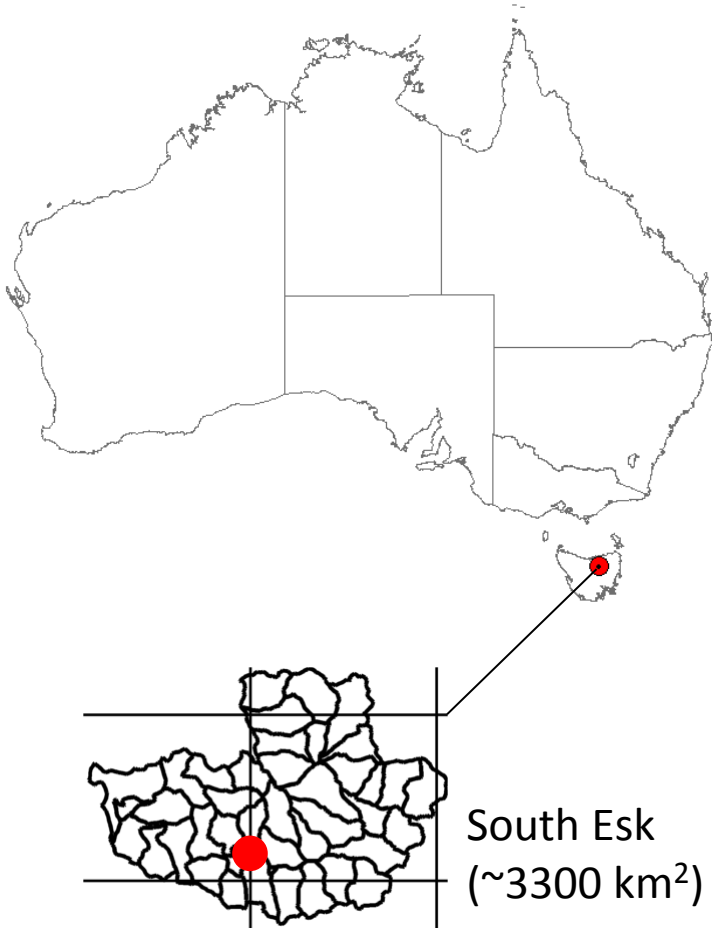
Streamflow forecasts - putting it all together

Forecasts issued on 18-Mar-2012 21:00 for 19-Mar-2012 00:00 (UTC)

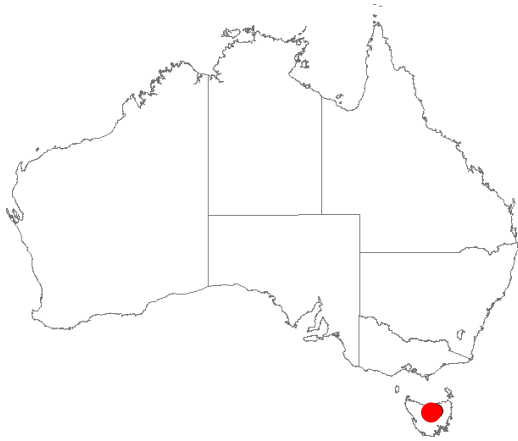


Performance of streamflow forecasts

St. Pauls R a/b Avoca (South Esk, TAS)

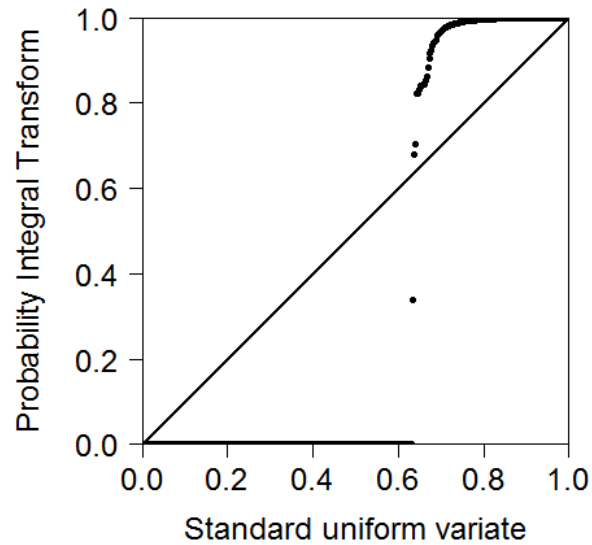


Streamflow forecast reliability

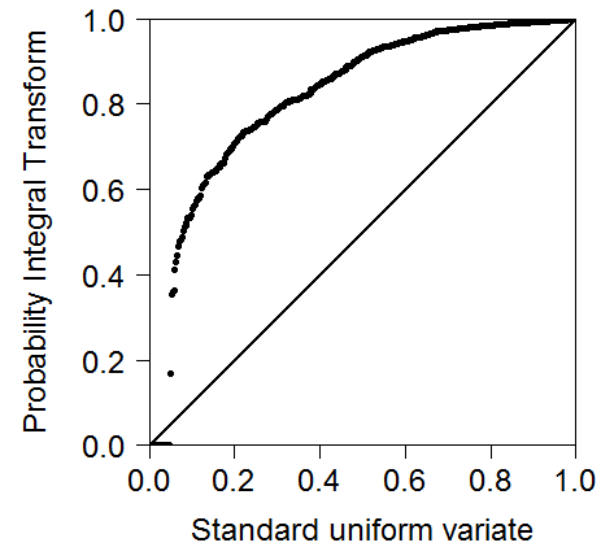


Florentine River (169 km²)

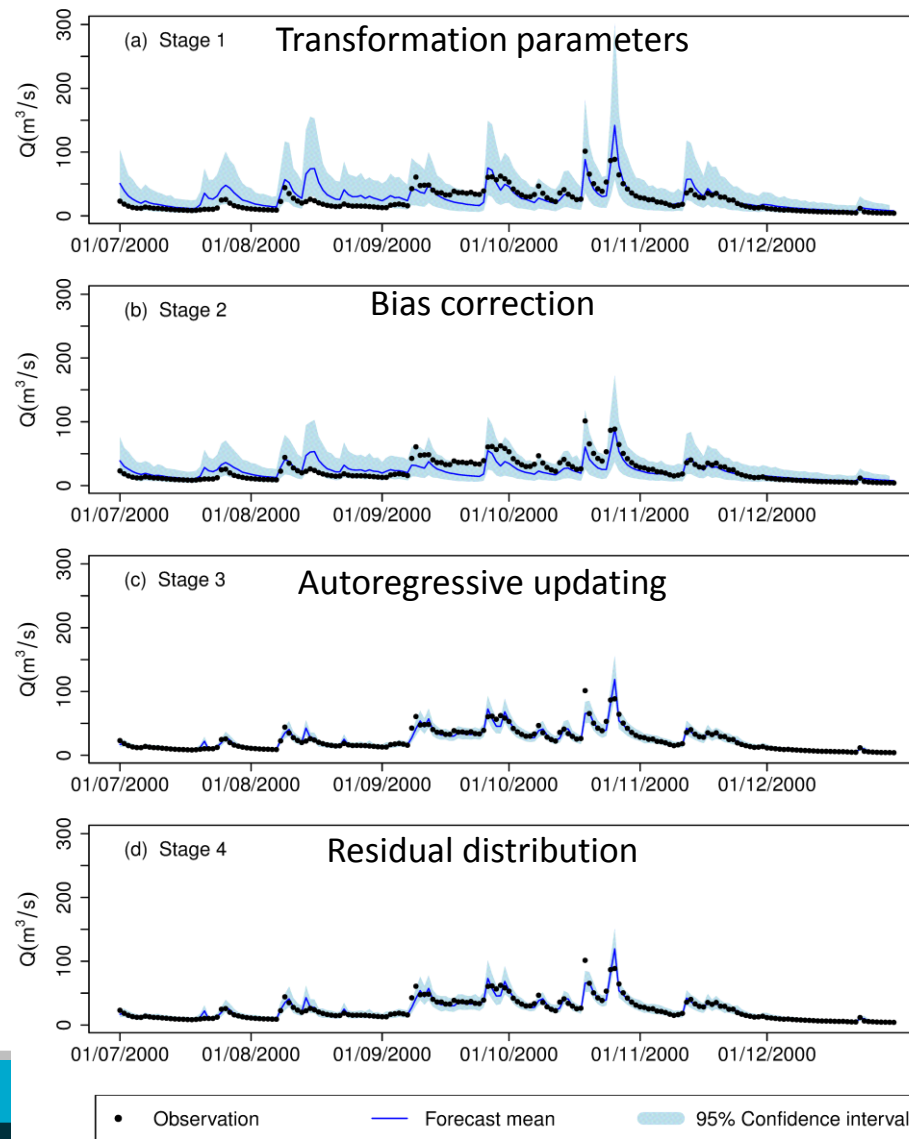
1 hour lead



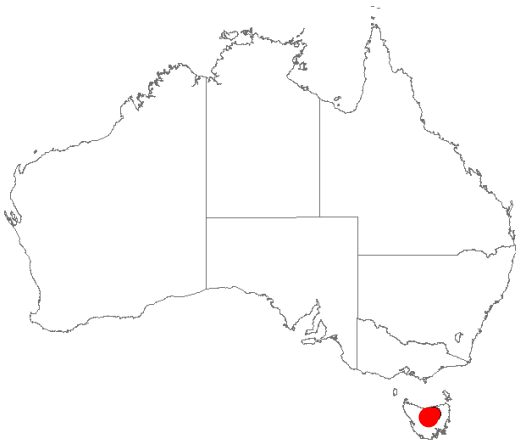
60 hour lead



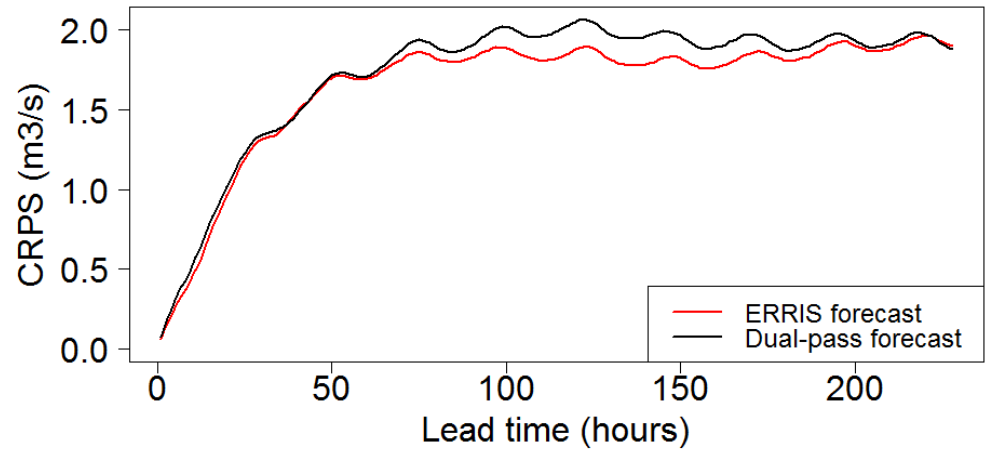
Error Reduction and Representation in Stages (ERRIS)



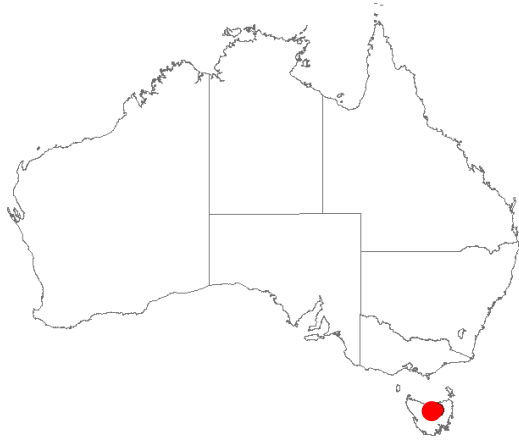
Performance of streamflow forecasts



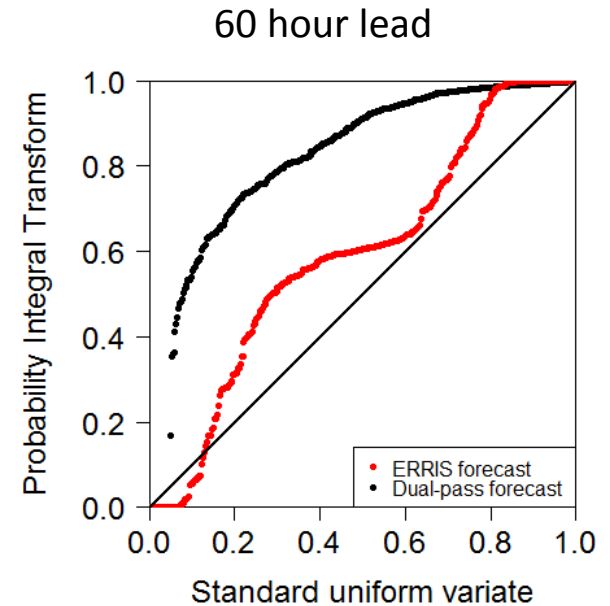
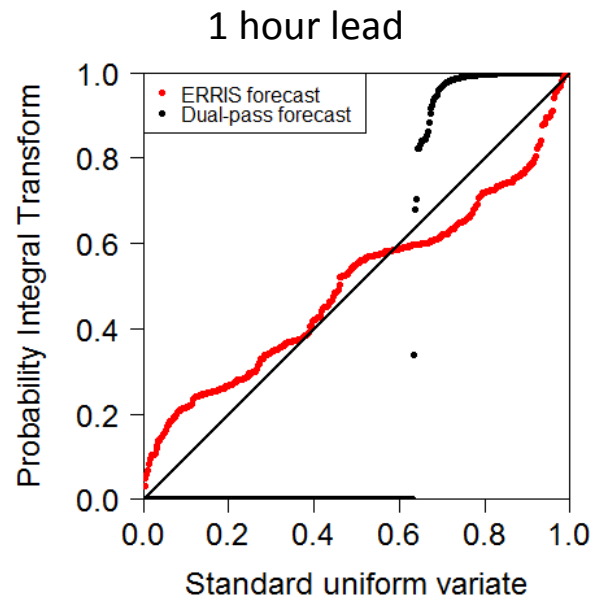
Florentine River (169 km²)



Streamflow forecast reliability

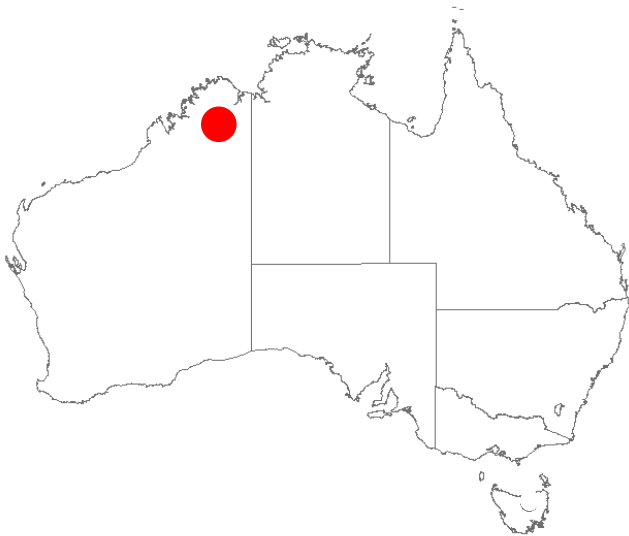


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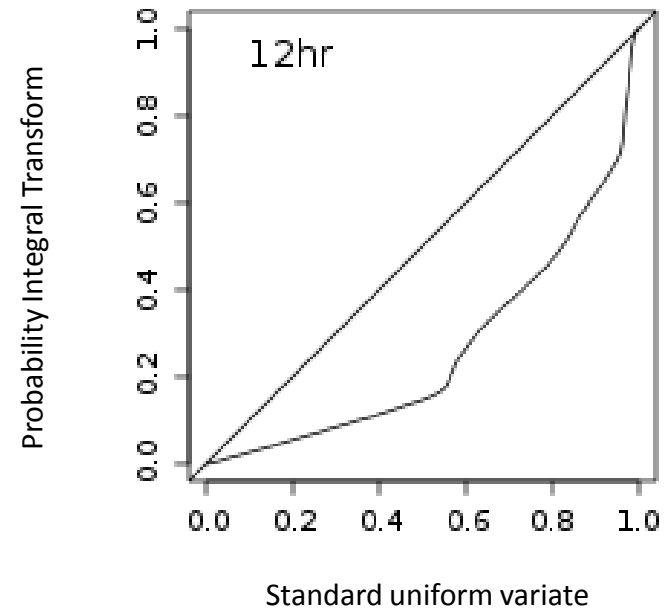


Forecast reliability in ephemeral catchments

Ord River



ERRIS @ 12 hour lead



Summary

Users are demanding reliable ensemble forecasts for lead-times to 7 days

Post-processing catchment precipitation forecasts

- Necessary for forecasts to 'beat' climatology
- More important that the source of forecast precipitation

Generating accurate and reliable ensemble streamflow forecasts requires

- Reliable ensemble rainfall at the catchment scale with minimal bias
- Correction and quantification of errors in hydrological modelling

Ongoing research directions

- Producing reliable uncertainty in ephemeral catchments
- Dealing with streamflow forecast bias
- Better (ensemble) estimates of catchment rainfall

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