

# BUREAU OF METEOROLOGY

Water availability forecasts for operational planning and management – business drivers, progress-to-date and key challenges

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Manager Extended Hydrological Prediction  
29 October 2014



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Bureau of Meteorology

# Built on extensive research partnerships

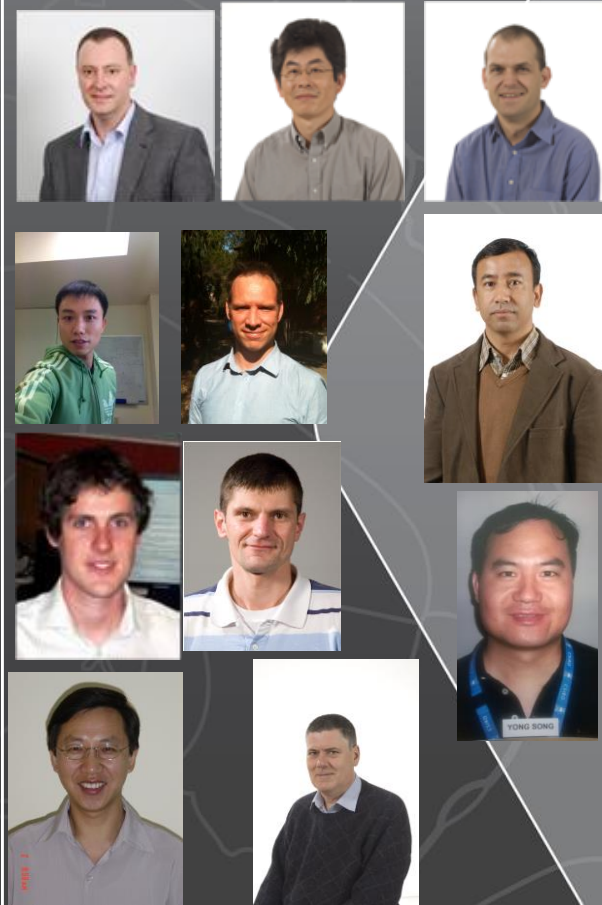
- Bureau of Meteorology
  - Water Information Program
  - Centre for Australian Weather and Climate Research (CAWCR)
- CSIRO
  - Water Information Research and Development Alliance (WIRADA)
- University sector in Australia
- eWater
- International: WMO, US-NWS, UK-CEH, US-UNC



# Bureau of Meteorology



# CSIRO



# Outline

- Business drivers for water availability forecasts
- Extended Hydrological Prediction Services: progress-to-date and next steps
  - Long Term Water Availability
  - **Seasonal Streamflow Forecasts**
  - Short Term Forecasts
- Concluding remarks and key challenges



***Water Managers in Australia have a lot to plan for!***

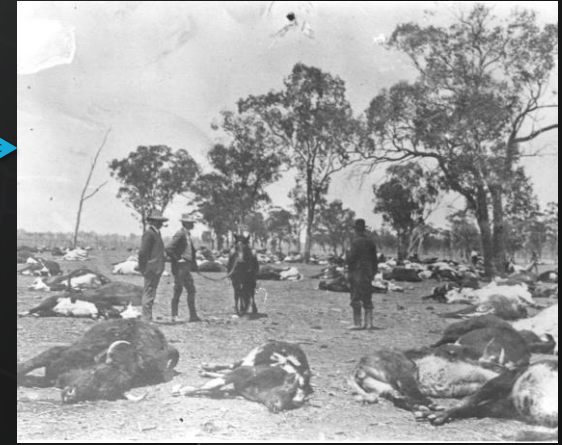


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# Australia has a variable climate

Year	Major drought conditions
1895-1903	Federation drought
1914-15	Widespread drought; Australian wheat crop failed
1918-20	Severe drought across all states
1939-45	WWII drought affects SE & SW
1965-68	Most of Australia affected
1982-83	A short severe drought
1997-2009	Millennium drought
2013-present	Parts of NSW and Queensland

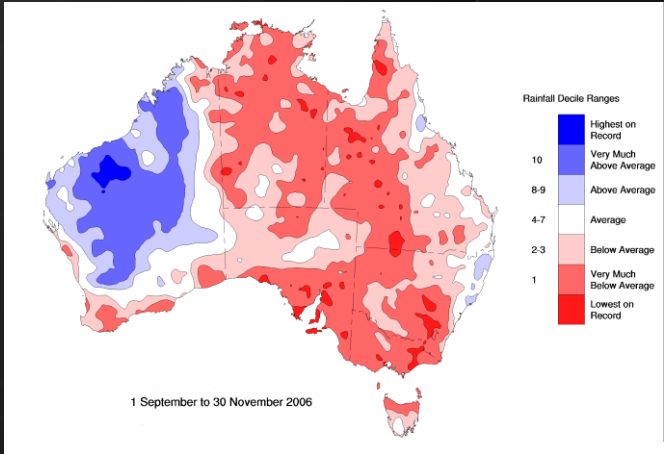
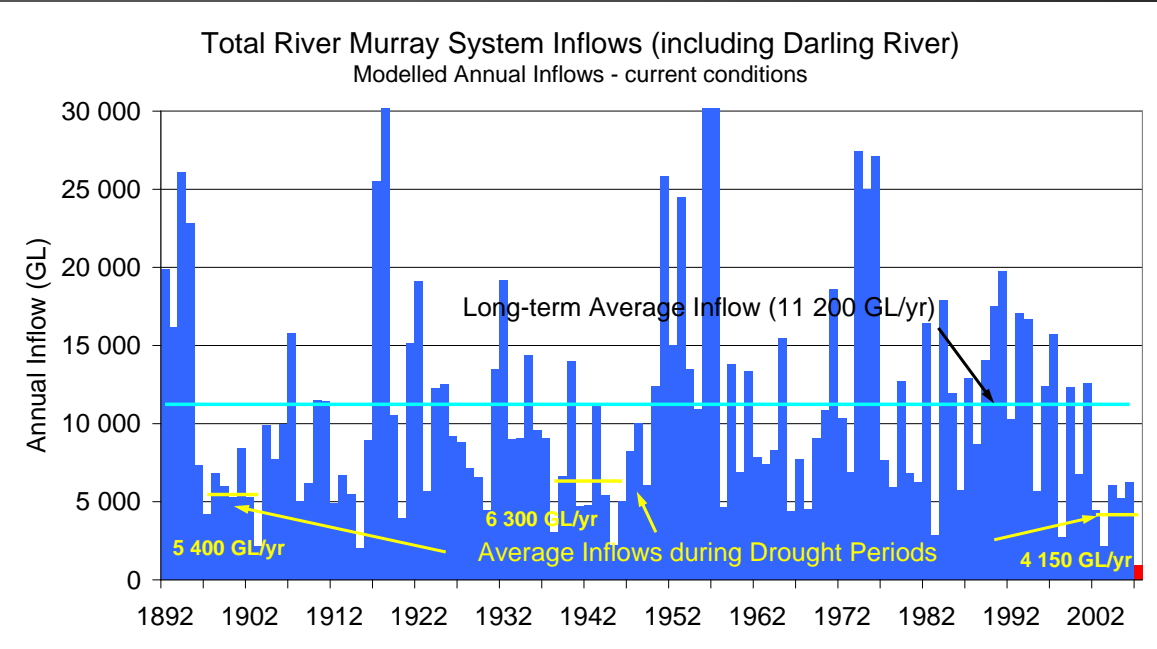


EIGHT DROUGHT EVENTS OF SHORT AND EXTREME TO PROLONGED CONDITIONS DURING THE LAST 120 YEARS



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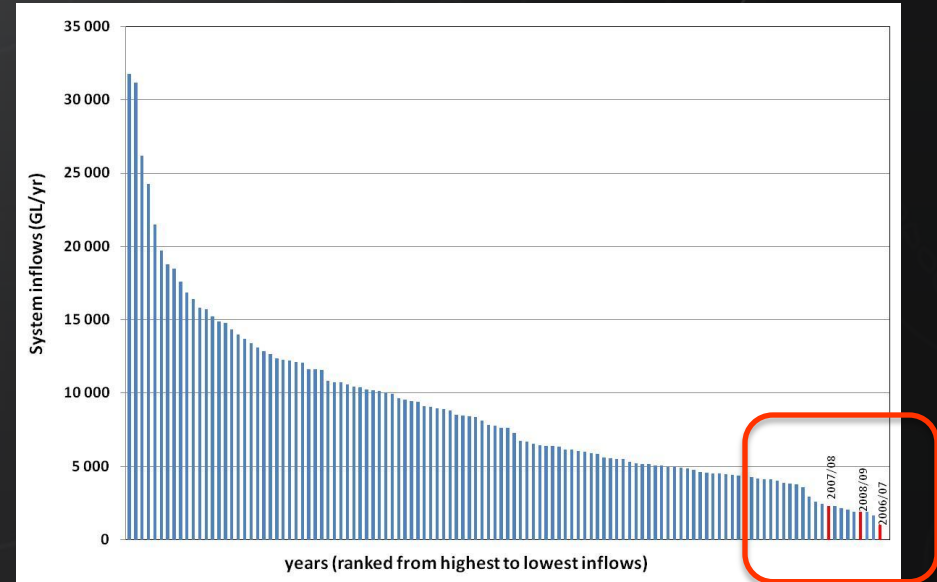
# The millennium drought impacts (1997 – 2009)



Water availability in the Murray-Darling Basin  
Source of data: MDBA

# Water outlook in spring 2006 for the River Murray System

- Lowest on record rainfall for six months Feb to Oct 2006 across most of high yielding alpine catchments
- Record low system inflows
- Less water for whole year than had been allowed for planning purposes
- Prospect of record low water availability in 2007-08 with another dry year
- Prospect of urban water supply difficulties if 2007-08 was as dry as 2006-07





# *Long-term trends in streamflow across Australia*



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# Long term trends in water availability

## Hydrologic Reference Stations



[Introduction](#) [Feature Stations](#) [Selection Guidelines](#) [FAQs](#) [Glossary](#) [Methods](#) [Stakeholder](#) [References and Papers](#) [Feedback](#) [Copyright](#)

### Station Selector

Region

Australian Capital Territory

Basin

Murrumbidgee River

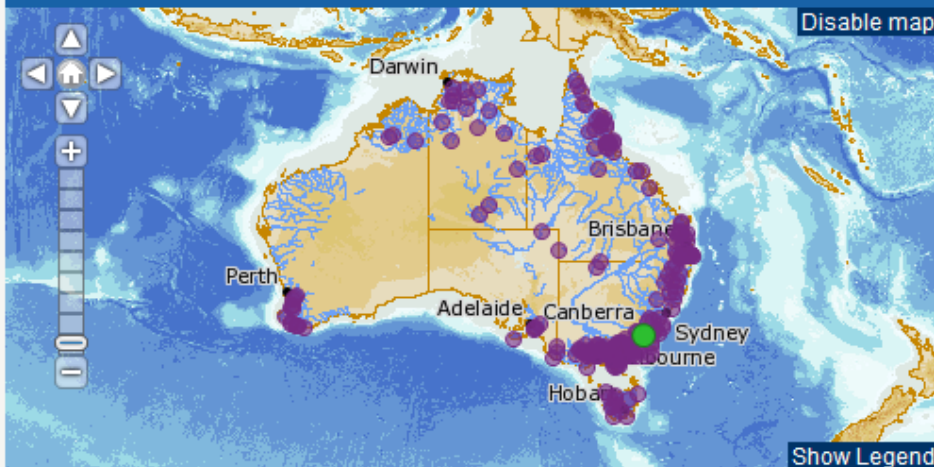
Station

Cotter River at Gingera (410730)

### Nearby stations

- Gudgenby River at Tennent (410731)
- Murrumbidgee River at Lobb Holes (410761)
- Queanbeyan River at Tinderry (410734)

### Cotter River at Gingera (410730)



### Quick Facts

#### Catchment

Area 130 km<sup>2</sup>  
Stream Length 98 km

#### Time series

Start Date 05-07-1963  
End Date 31-12-2011  
Gap-filled 0.39 %  
Daily Max 4507 ML  
Daily Min 1 ML  
Daily Average 117 ML  
Annual Average 43 GL  
Water Year Mar to Feb

[www.bom.gov.au/water/hrs](http://www.bom.gov.au/water/hrs)

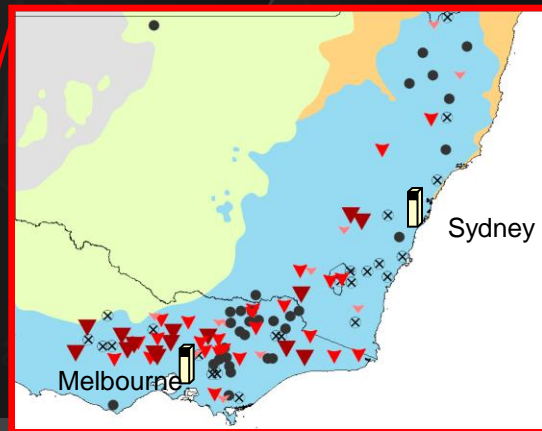
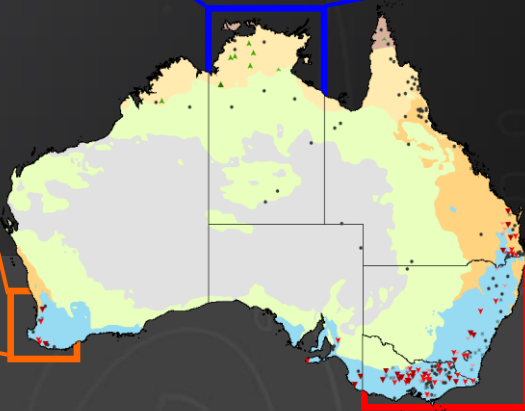
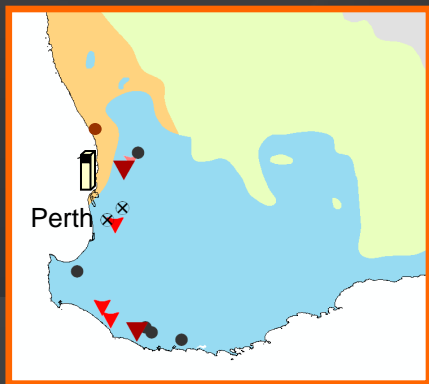
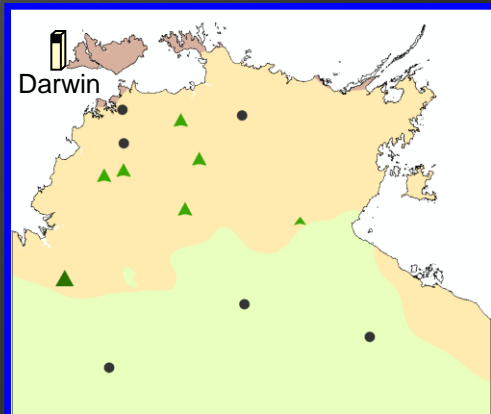


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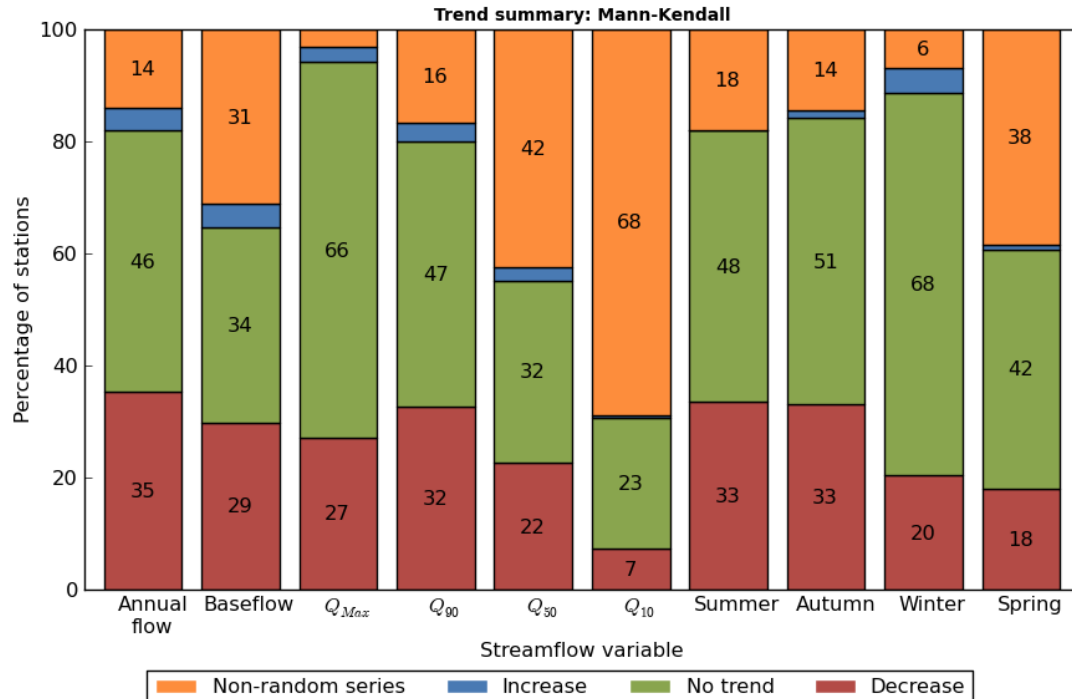
# Trends at 221 Hydrologic Reference Stations

Trends in annual streamflow:

- 35% of stations showing decreasing trend
- 4% of stations showing increasing trend



# Trends in streamflow across Australia



Generated: 12:22 02/10/2013

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- Wide range of streamflow variables
- Most of significant trends are decreasing
- These stations have:
  - Long observation records
  - Negligible land use change
  - Negligible diversions



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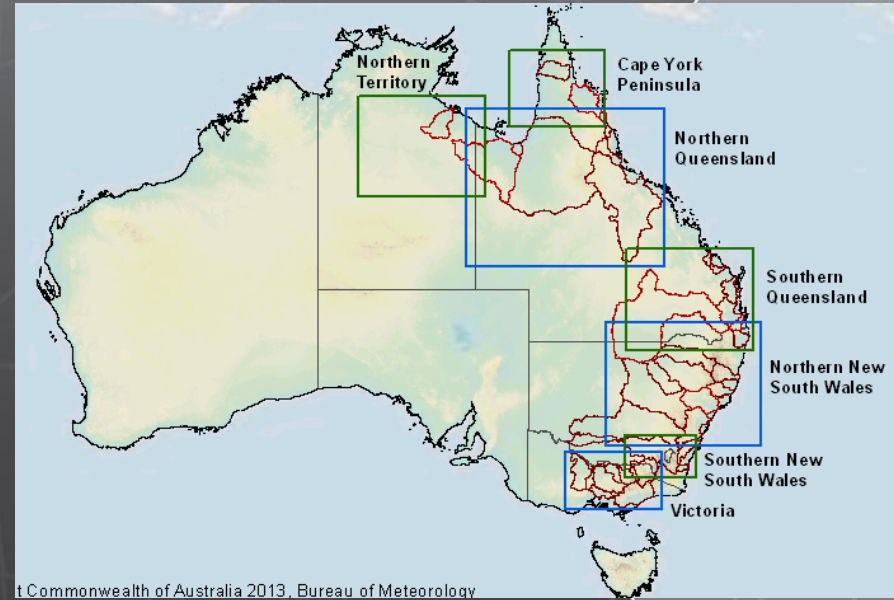
# Key drivers for water forecasting

- Large areas of the river basins
  - e.g. Murray Darling Basin: 1 million km<sup>2</sup>
- Travel times 1 to 3 months
- Most storages in headwaters
- Discharge capacity constraints
- Ratio of wettest and driest year > 50
- Legislated water sharing plans up to 10 years
- Water resource planning is done within a risk assessment framework



# Seasonal streamflow forecasting service

- Forecasts of streamflow volumes at a site or total inflows to a water storage
- 3-months ahead, updated every month, since 2010
- 86 locations and increasing coverage.....
- Statistical approach using Bayesian Joint Probability model (5000 ensembles)
- Publicly available at [www.bom.gov.au/water/ssf](http://www.bom.gov.au/water/ssf)



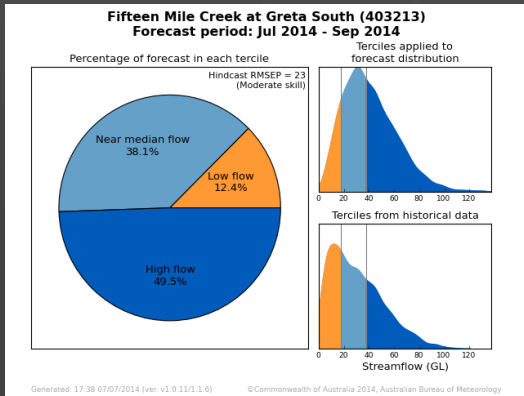


# A range of data and forecast products

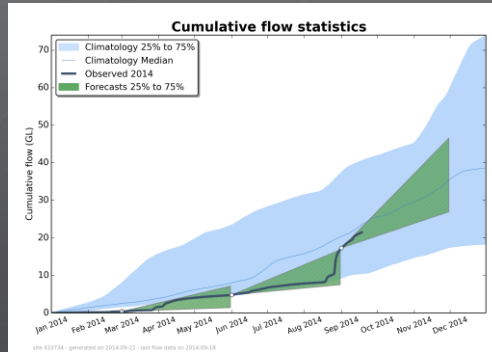
## Tercile maps



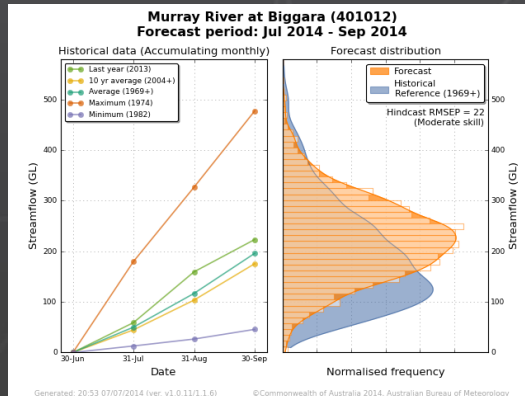
## Tercile forecasts



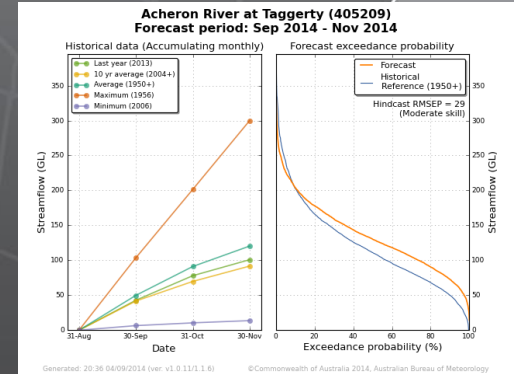
## Water year in perspective



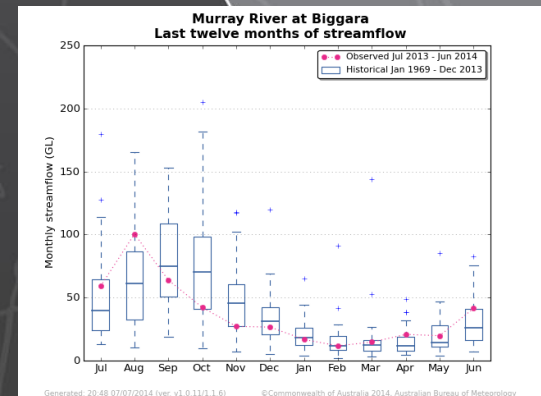
## Probability distributions



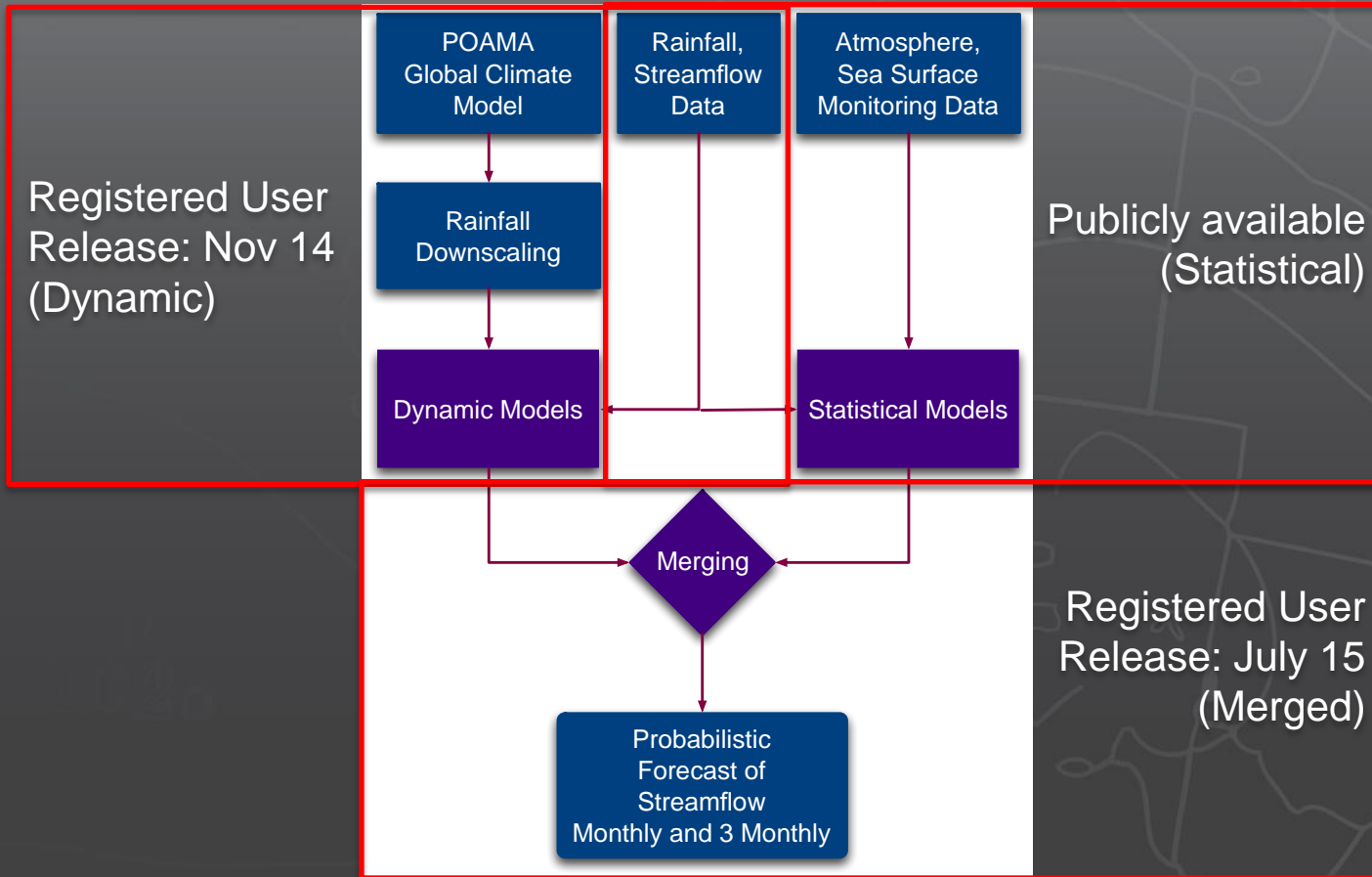
## Exceedance probabilities



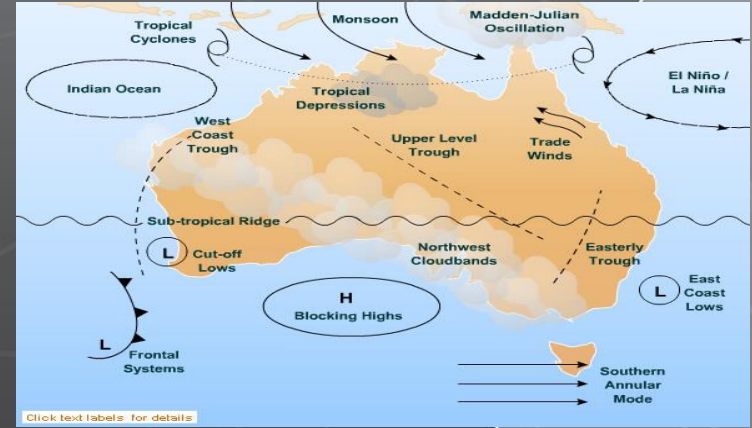
## Box plots



# Seasonal Streamflow Forecasting Approach



# The Bayesian joint probability (BJP) model



Wang, Robertson and Chiew (2009) **Water Resources Research**

Wang and Robertson (2011) **Water Resources Research**

Robertson and Wang (2012) **Journal of Hydrometeorology**

Robertson, Pokhrel and Wang (2013) **Hydrology and Earth System Sciences**

Robertson and Wang (2013) **Water Resources Management**

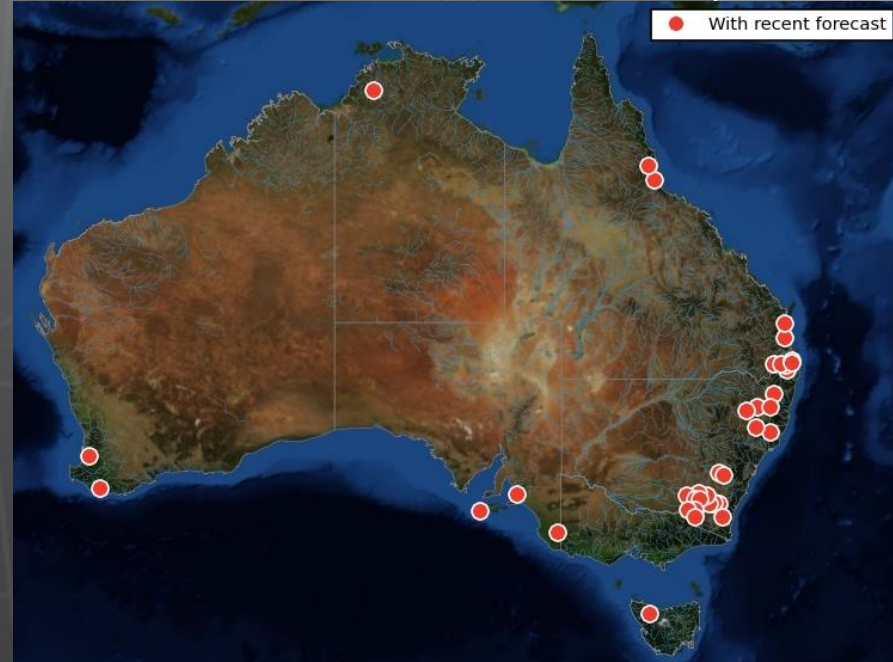
Pokhrel, Wang and Robertson (2013) **Water Resources research**

Bennett, Wang, Pokhrel and Robertson (2014) **Natural Hazards and Earth System Sciences**

# New Forecast Product Registered User Release

Scheduled for November 2014

- Rainfall-runoff modelling driven by downscaled rainfall forecasts from POAMA
- One month and three month streamflow forecasts
- Scheduled to release 38 sites across Australia to key stakeholders

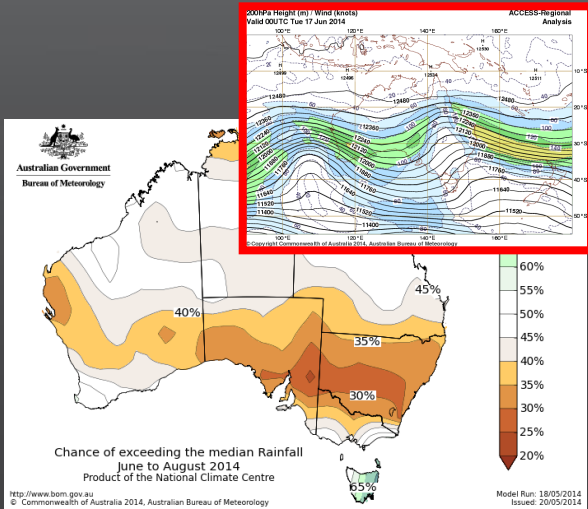


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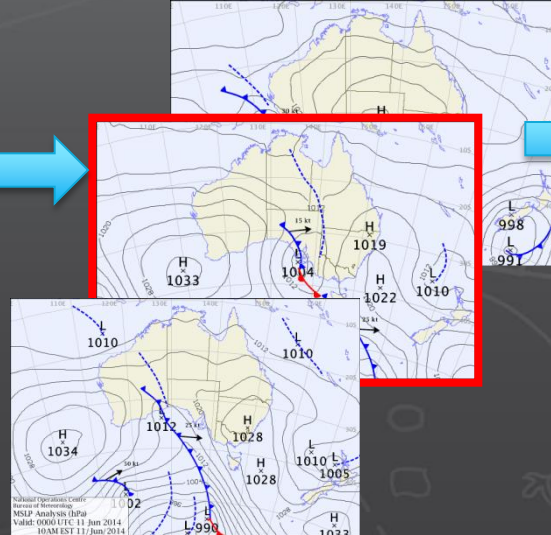


# Dynamic Approach: Rainfall Downscaling

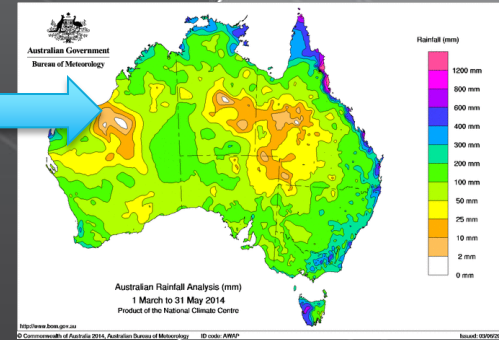
POAMA forecast of climate indices (~270km)



Analogue downscaling  
(5 replicates of 31 ensembles)



Downscaled rainfall  
(5km; 155 ensembles)



Timbal, B., Li, Z., & Fernandez, E. (2008). The Bureau of meteorology statistical downscaling model graphical user interface: user manual and software documentation.

Shao, Q., & Li, M. (2013). An improved statistical analogue downscaling procedure for seasonal precipitation forecast. Stochastic Environmental Research and Risk

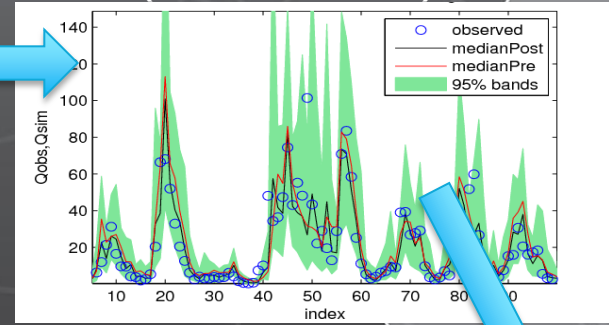
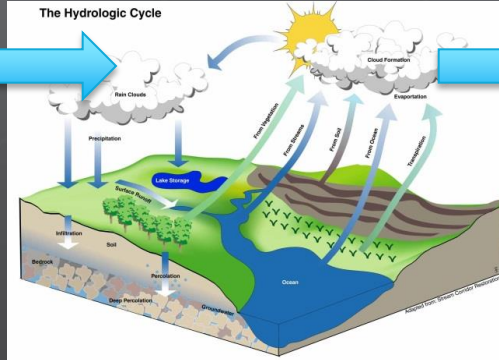
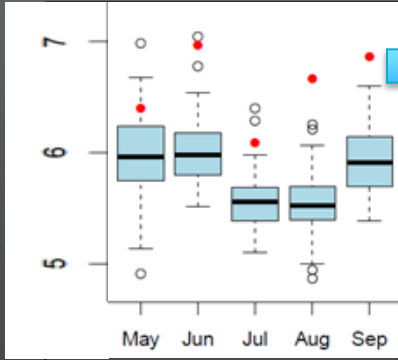
# Dynamic Approach: hydrologic modelling

Post-processed catchment rainfall forecasts

Hydrologic uncertainty (BATEA)  
(40 replicates of GR4J model)

Post-processed streamflow  
(6200 ensembles)

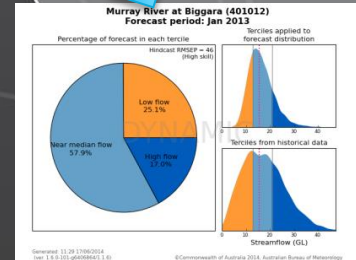
Mean wet day rainfall



AWRIS/WISKI web service  
(Streamflow)



1 month & 3 month forecasts

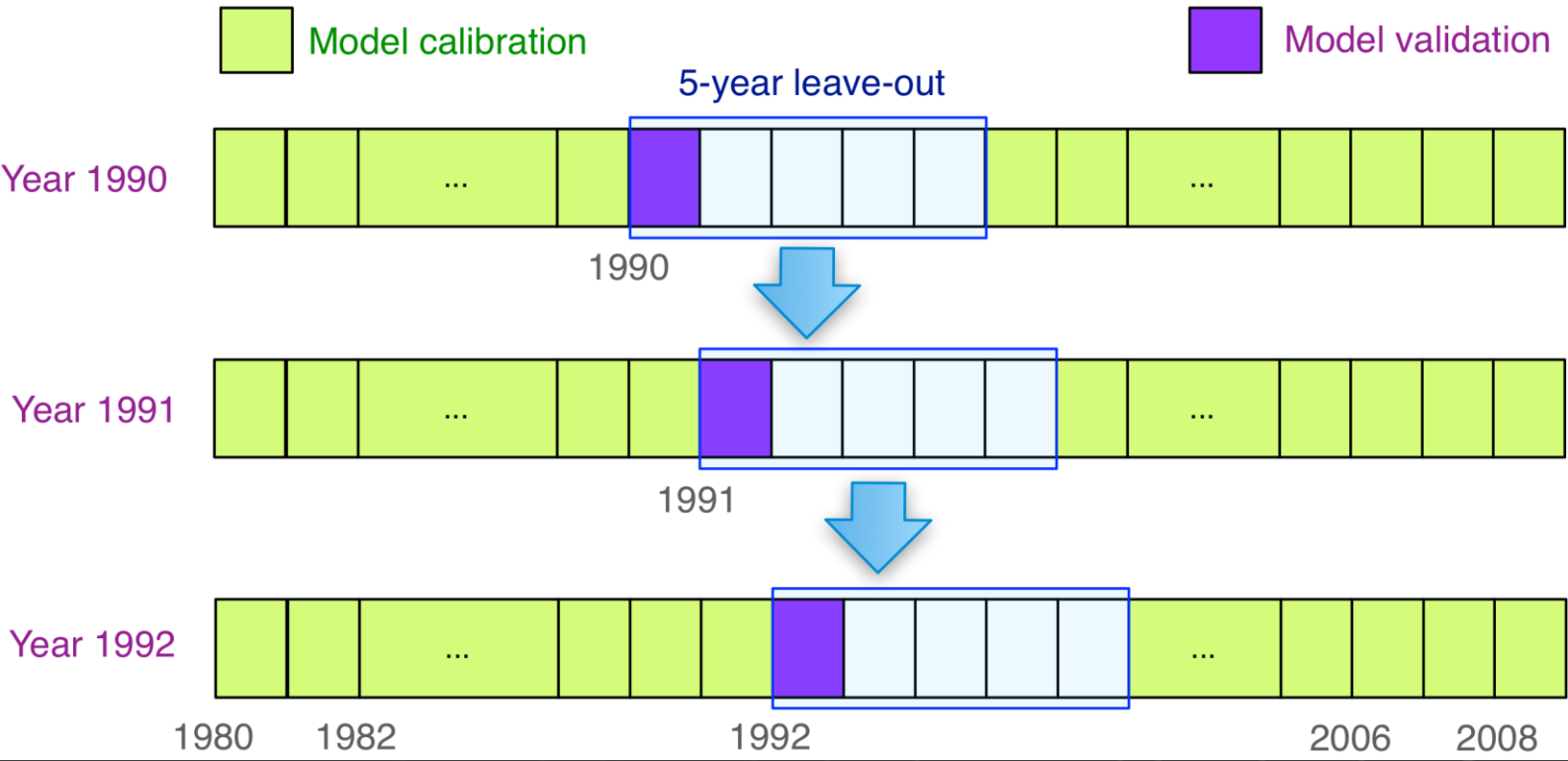


Timbal, B., Li, Z., & Fernandez, E. (2008). The Bureau of meteorology statistical downscaling model graphical user interface: user manual and software documentation.

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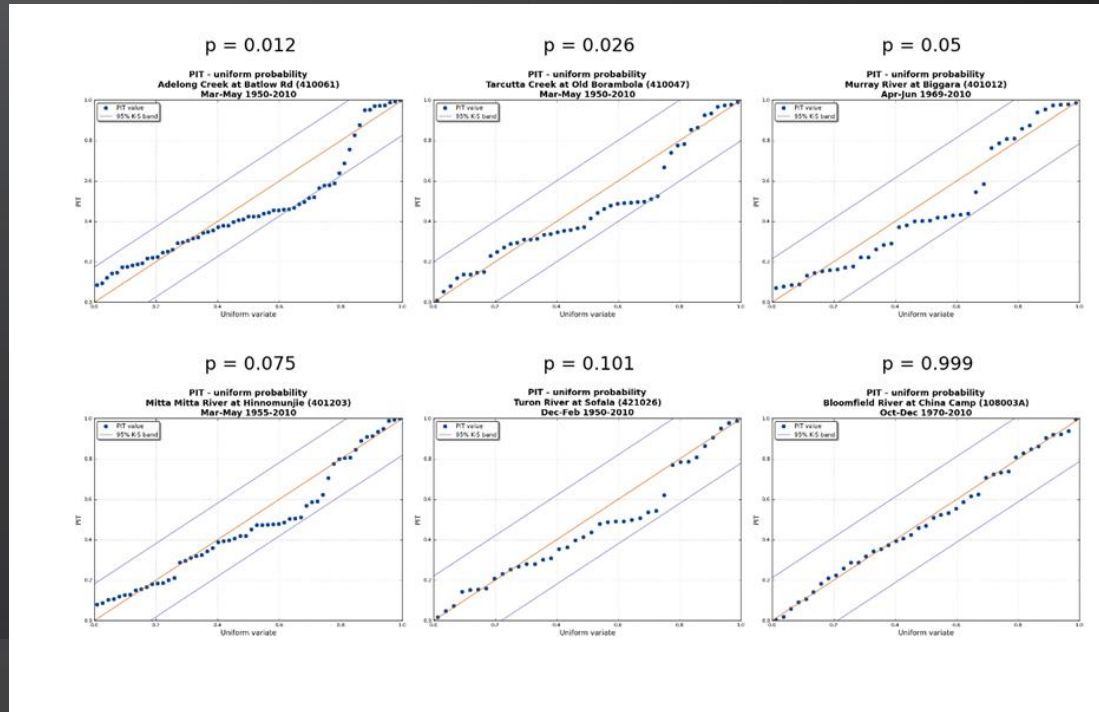


# Rigorous cross-validation scheme



# Forecast reliability

- Probability Integral Transform (PIT) Plots



FORECAST RELIABILITY IS IMPORTANT FOR END USER CONFIDENCE

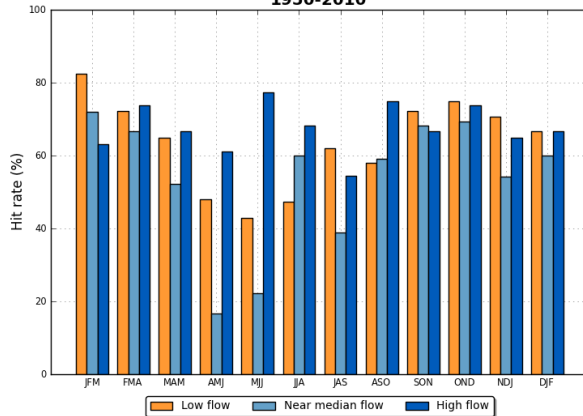


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# Forecast accuracy

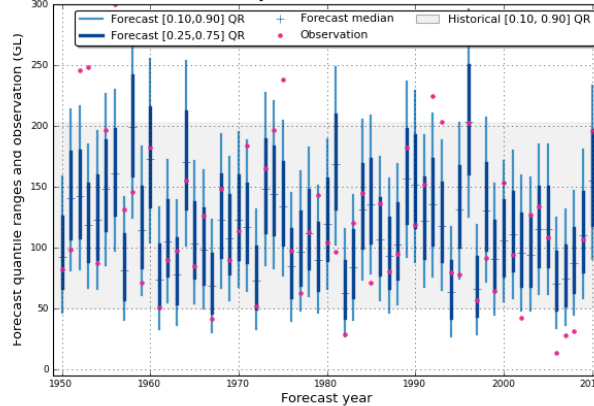
- Skill score: CRPS, RMSE & RMSEP
- Hit rate: Tercile hit rate for low & high flows
- Precision: Inter quantile range (10%,90%)

**Tercile hit rate  
Acheron River at Taggerty (405209)  
1950-2010**



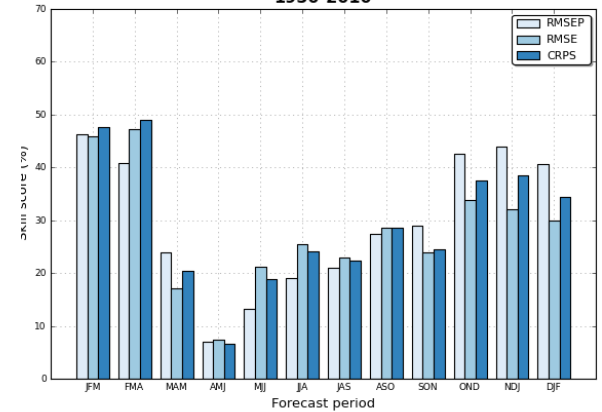
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**Forecast quantiles and observations versus year  
Acheron River at Taggerty (405209)  
Sep-Nov 1950-2010**



Generated: 20-36 04/09/2014 (ver. v1.0.11/1.1.6) ©Commonwealth of Australia 2014, Australian Bureau of Meteorology

**Skill scores  
Acheron River at Taggerty (405209)  
1950-2010**



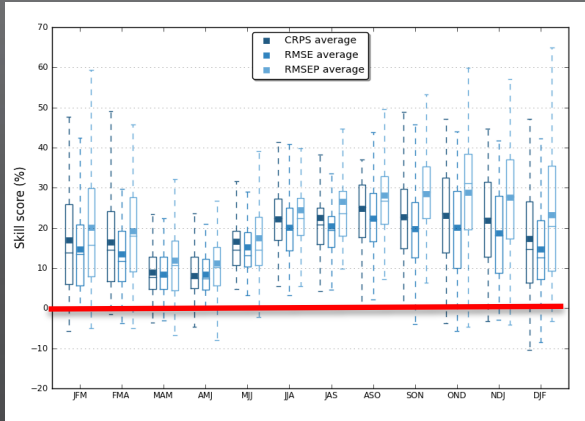
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FORECAST RELIABILITY IS IMPORTANT FOR END USER CONFIDENCE

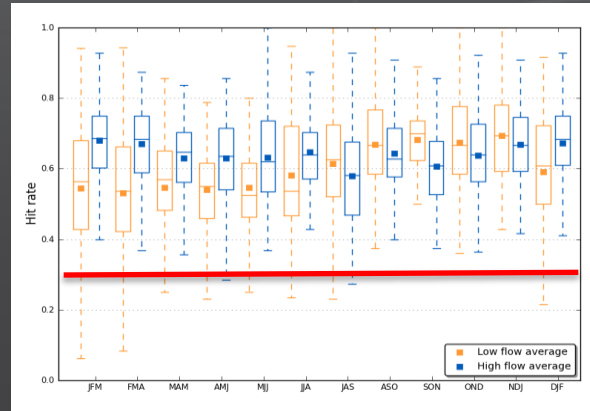


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# Forecast performance summary across all sites & seasons

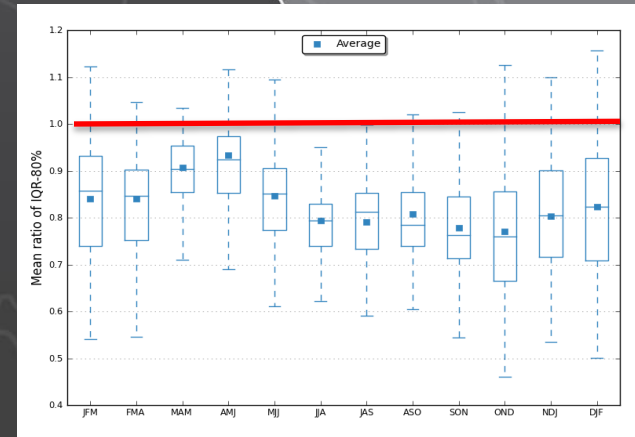


Skill scores



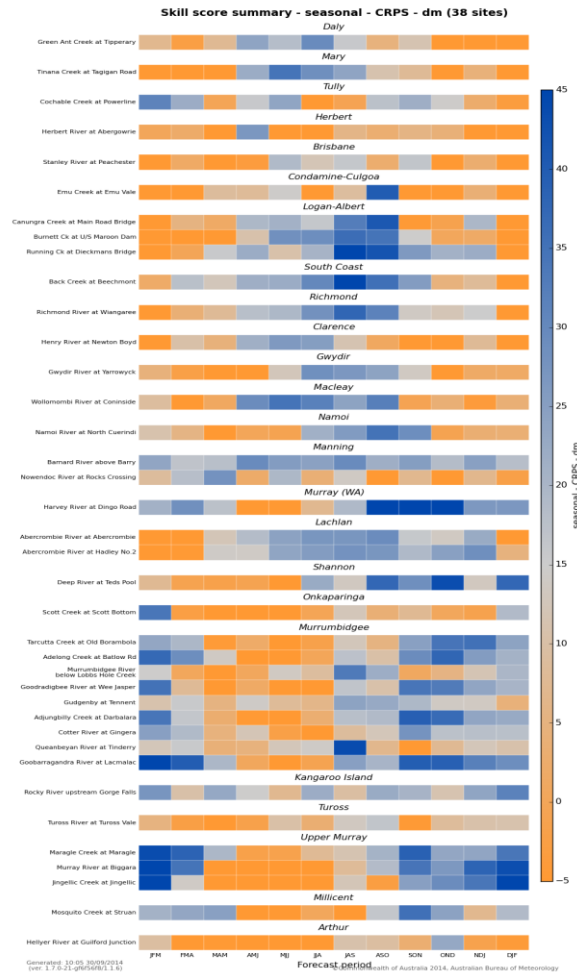
Tercile hit rates

Inter quantile range (10%,90%)



# Comparison of 1 month & 3 month forecasts

- CRPS - Continuous Rank Probability Score
- Forecast locations grouped by basins
- Better skills of 1 month forecasts compared to 3 month forecasts

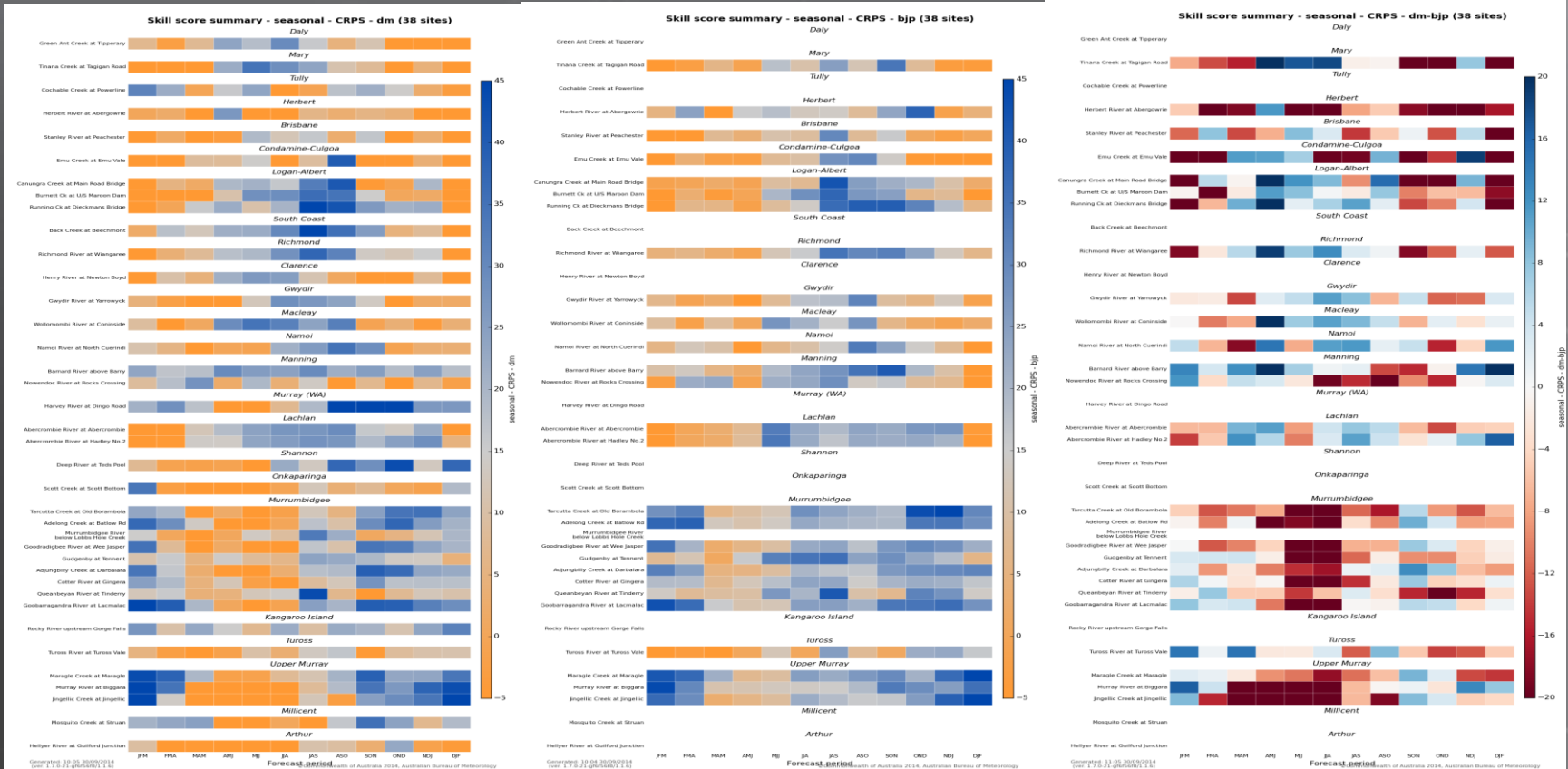


# Dynamic and statistical methods are complementary

CRPS(DM)

CRPS(BJP)

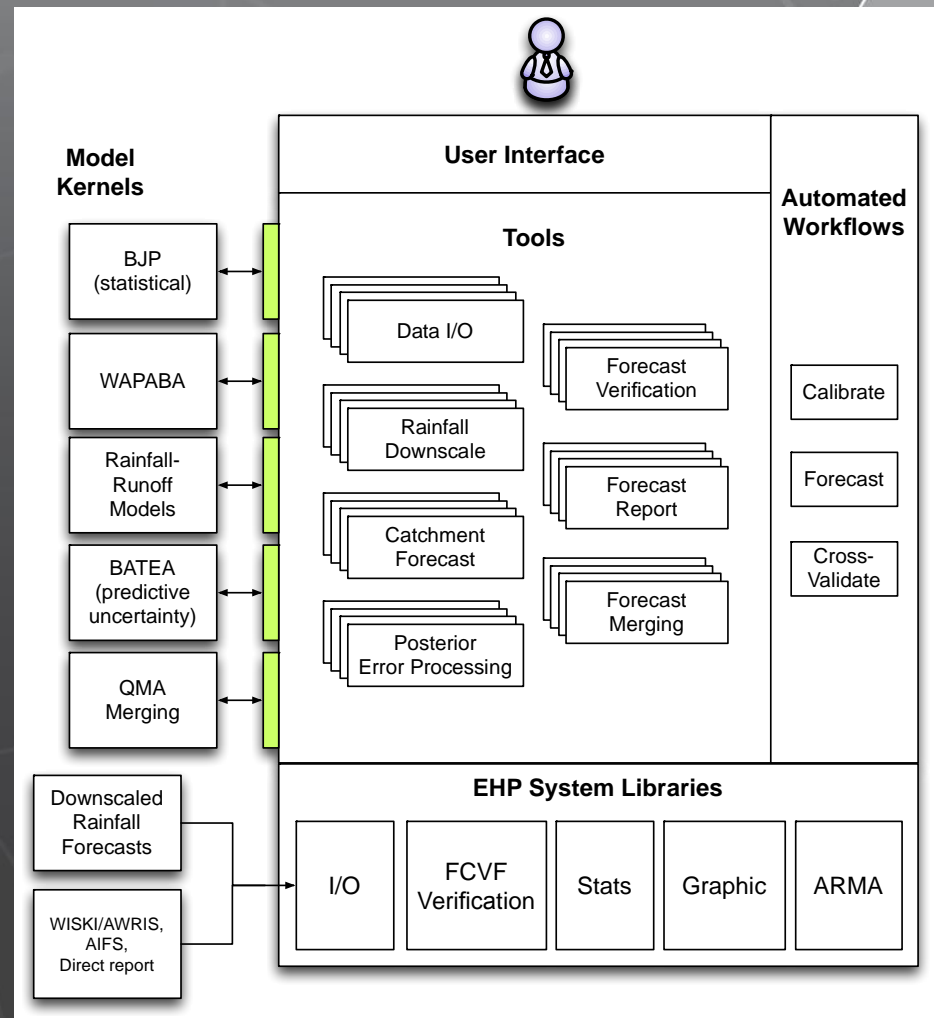
CRPS(DM - BJP)





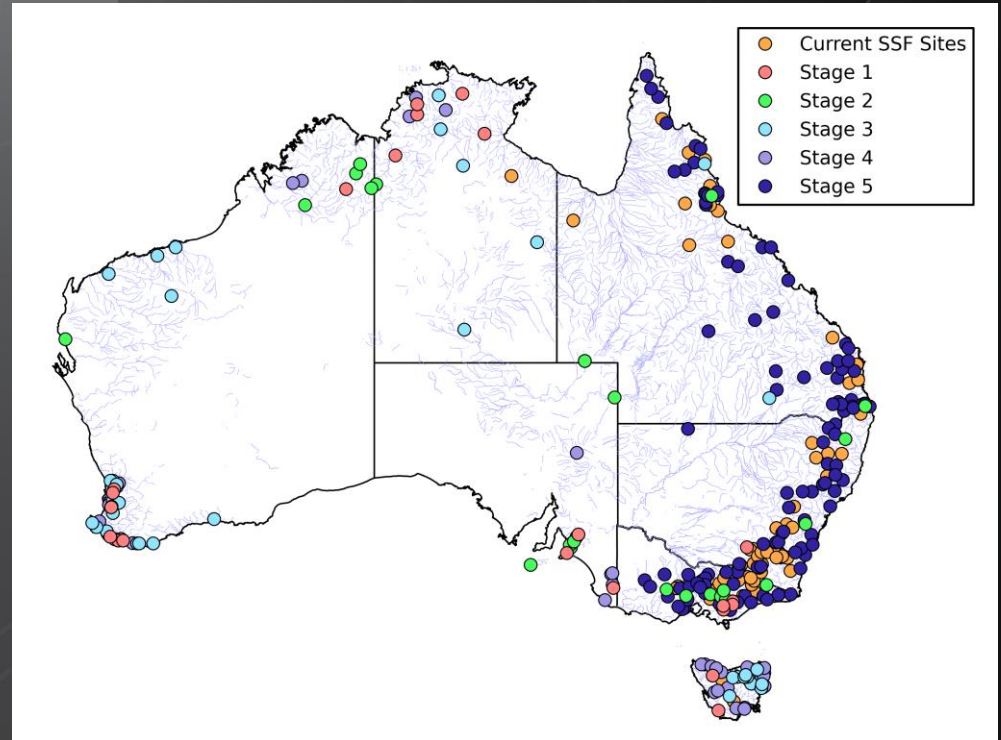
# Modelling system (WAFARi)

- Statistical, dynamic, and merging in a modelling system
- Modular structure
- Interactive simulation
- Powerful scripting capability
- Self-descriptive file formats
- Tailored graphic tools
- Parallel computing for cross-validation



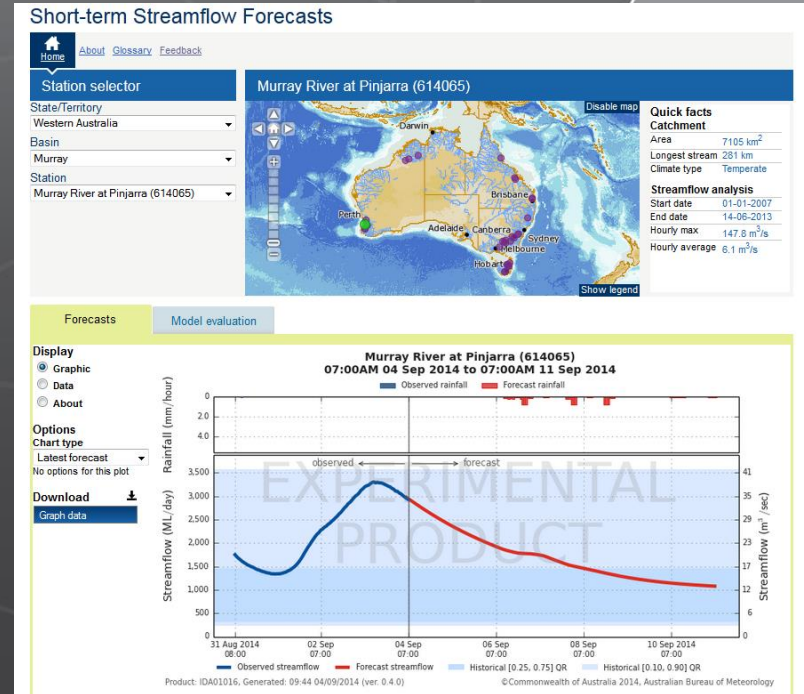
# Selection of seasonal forecast locations

- In consultation with key stakeholders across all jurisdictions
- Focus on WA, Tas, NT and SA



# Short-term streamflow forecasting service

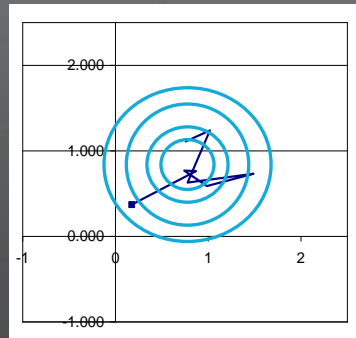
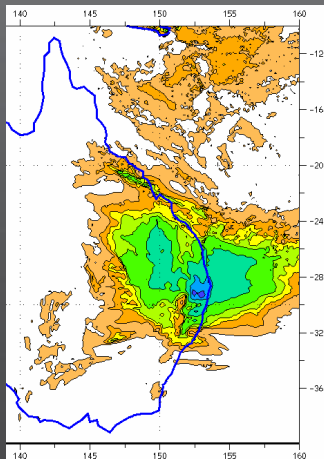
- 7-days ahead, updated every day, since 2013
- 31 locations in 20 catchments
- Deterministic approach gradually moving to ensemble mode during 2015-16
- Available to registered users
- Targeted at river and storage operation and environmental flow management
- May be used for flood guidance



# New short term ensemble forecasting system

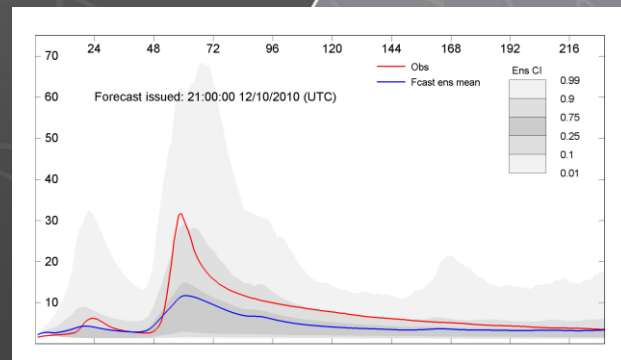
ACCESS NWP  
rainfall forecasts

(ACCESS  
ensembles in  
future)



Rainfall post processing  
(STEPS/BJP/Schaake shuffle)

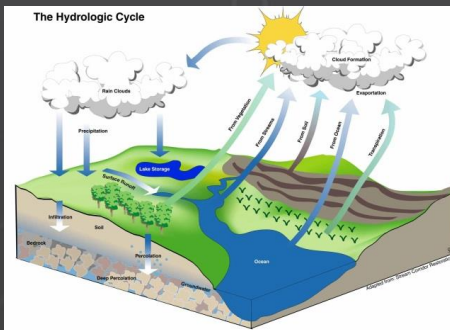
Streamflow ensembles



Real-time flows

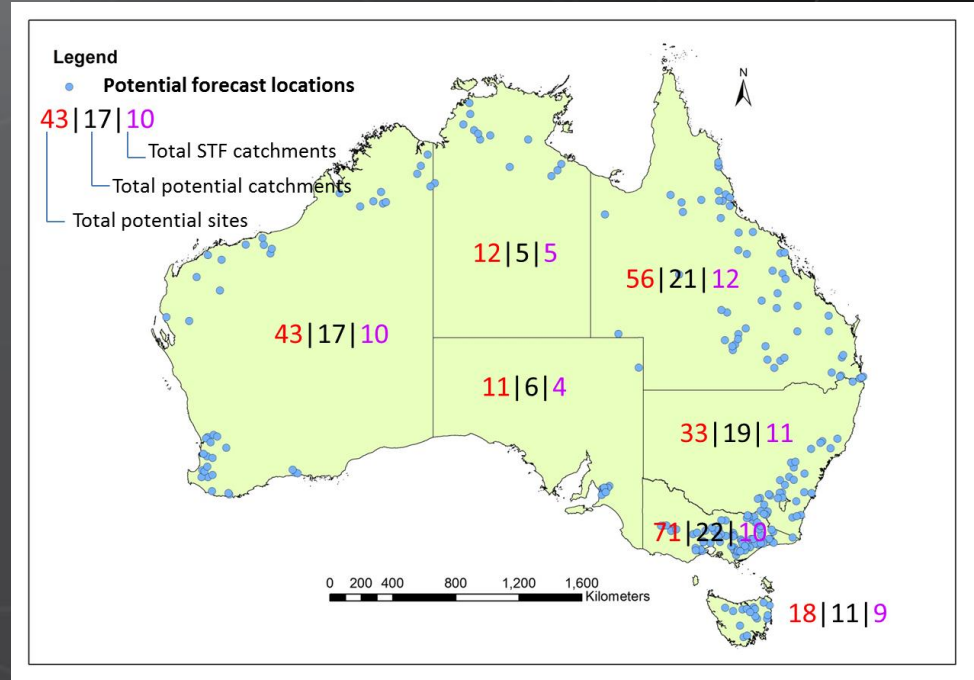


Hydrologic model  
(GR4H)



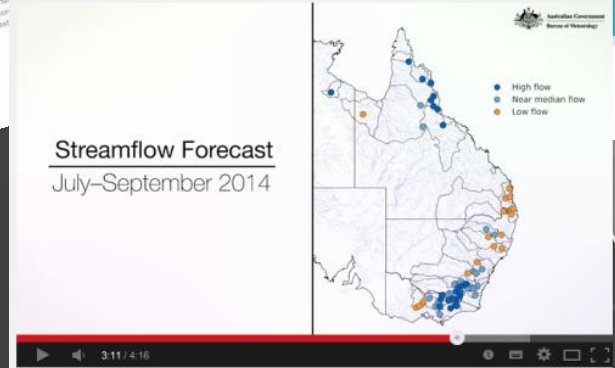
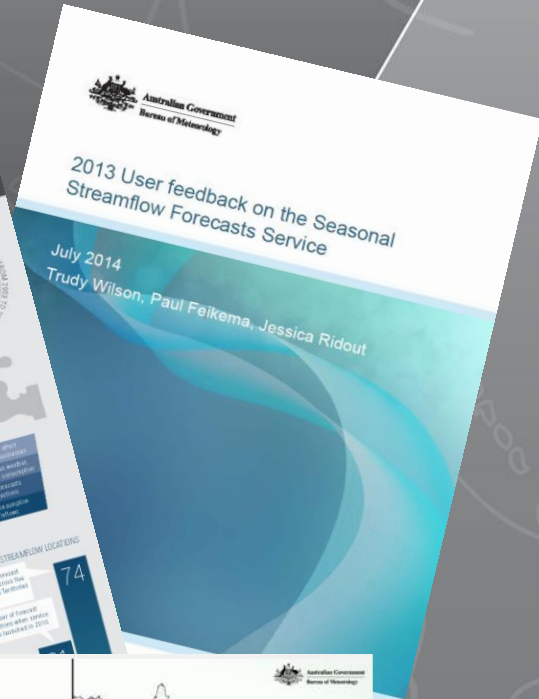
# Selection of short term forecast locations

- In consultation with key stakeholders across all jurisdictions
- Currently flow forecasts for 20 catchments are available to registered users
- 40 additional catchments to be added by January 2015



# Communication

- Over 1800 subscribers
- Online survey conducted in Nov 2013
- 88% of the key stakeholders expressed satisfaction with the SSF service
- Development of case studies with water managers
- Monthly National Climate and Water Briefings
- Forecasts included in monthly outlook video





# Concluding remarks and key challenges

- The need for water availability forecasts at a range of time scales was established through the *Water Act (2007)* and an extensive user needs analysis
- Adoption of streamflow forecasts by end users and the role of case studies
- Influencing decision making by water resource managers requires ongoing engagement throughout all stages – planning, development and delivery
- Establishing effective R&D alliances and transitioning research to operations is not trivial
- Making the right technology choices is critical for development and delivery of the operational forecasting services
- QA/QC tasks are very demanding (~40-50% of the total effort)



# Concluding remarks and key challenges (contd.)

- The impact of budget cuts on high quality streamflow monitoring stations
- Climate hydrology interface – opportunities and challenges!
- The need for high resolution NWP models to be valid at the hydrologic scale
- Forecast time scales of up to 1 year for water allocation outlooks and environmental flow planning
- Decadal forecasting – is it possible? Up to 2 to 3 years?
- Whole of river basin forecasting and estimation of inflow forecasts from ungauged areas
- Communication of forecast uncertainty and performance is indeed difficult



# Thank you

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Prediction

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[www.bom.gov.au/water/ssf](http://www.bom.gov.au/water/ssf)



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