

Murray River in flood, March 2012



# A System for Hydrological Ensemble Forecasting (SCHEF) for Australia

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HEPEX 10<sup>th</sup> Anniversary Workshop  
24 June 2014

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**Australian Government**  
**Bureau of Meteorology**

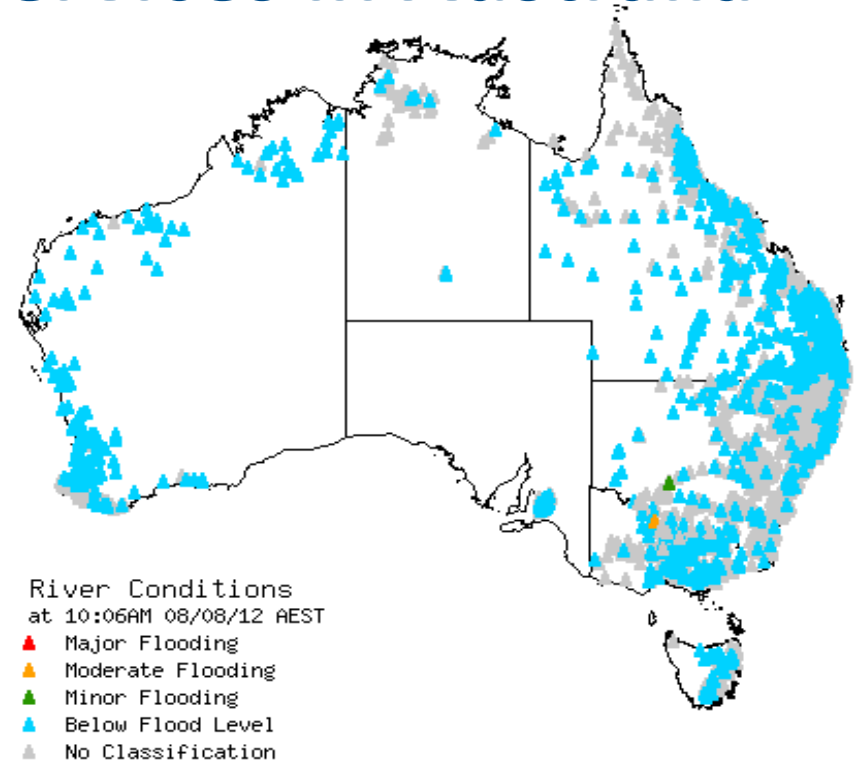


**Water Information**  
DATA > INFORMATION > INSIGHT



# Short-term forecasting services in Australia

- Existing forecasting services
  - Forecast flood events
  - Event models
  - Limited use of Numerical Weather Predictions (NWP)
  - Labour intensive
- Desired forecasting services
  - Forecast out to 7-10 days
  - Continuous hydrological modelling
  - Routine use of Australian NWP model output
  - Quantify forecast uncertainty



Australian Government  
Bureau of Meteorology

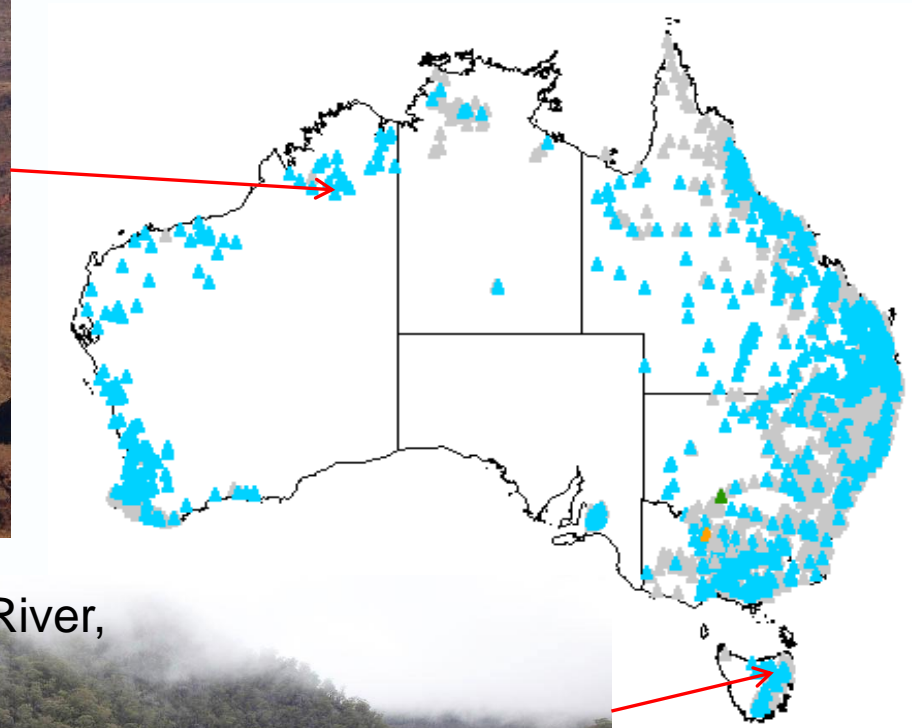


Water Information  
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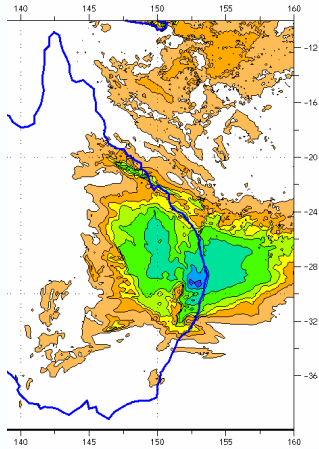
Ord River,  
Western Australia



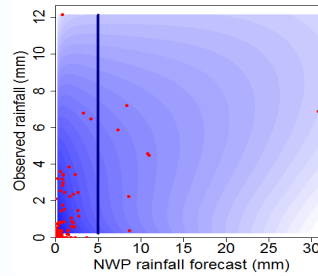
upper South Esk River,  
Tasmania



## ACCESS-G NWP rainfall forecast



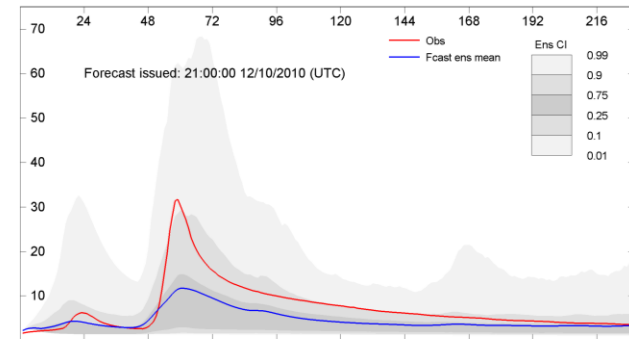
## Rainfall forecast post-processing



## Hydrological model



## 9-day ensemble flow forecast

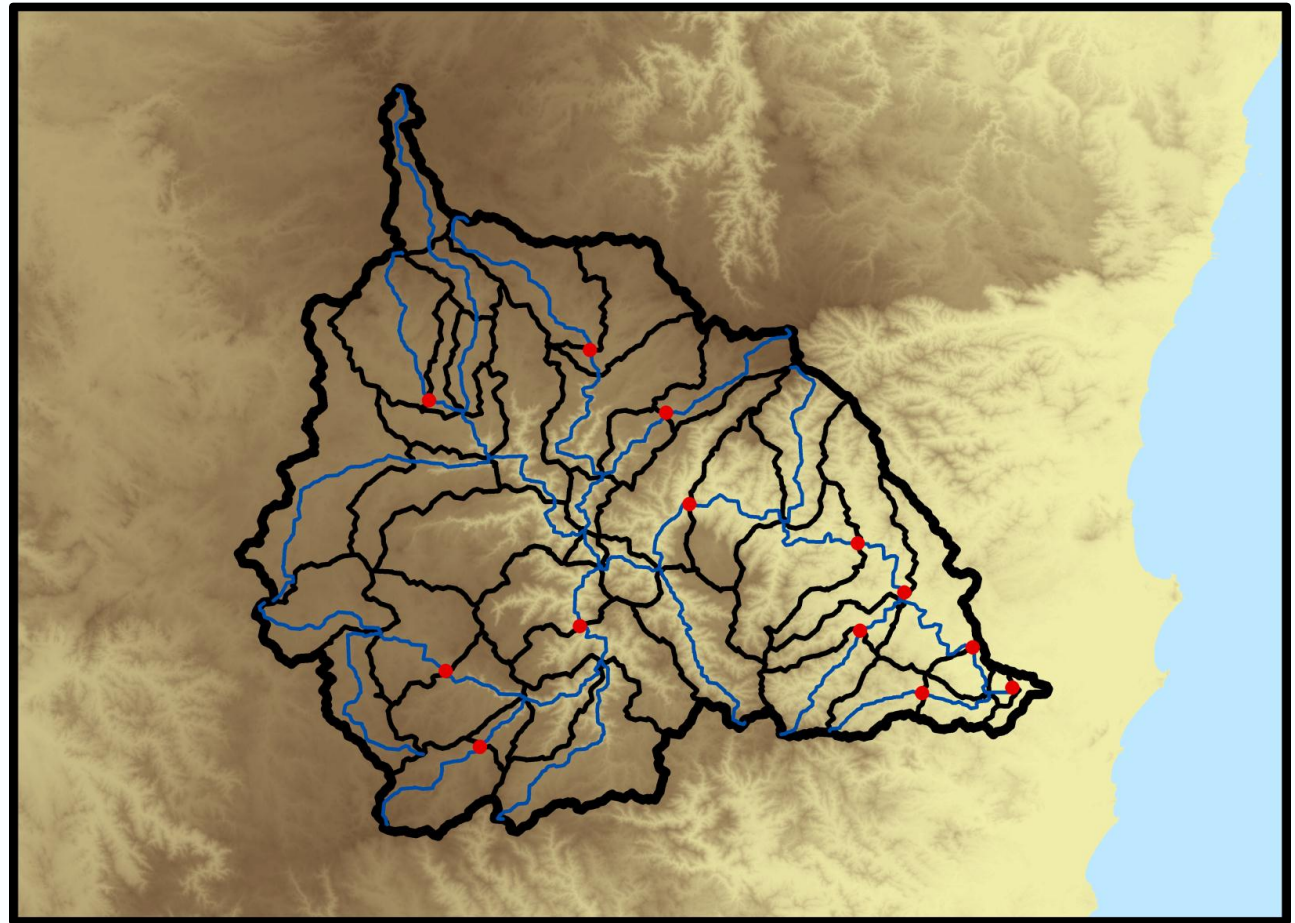


## Real-time flows



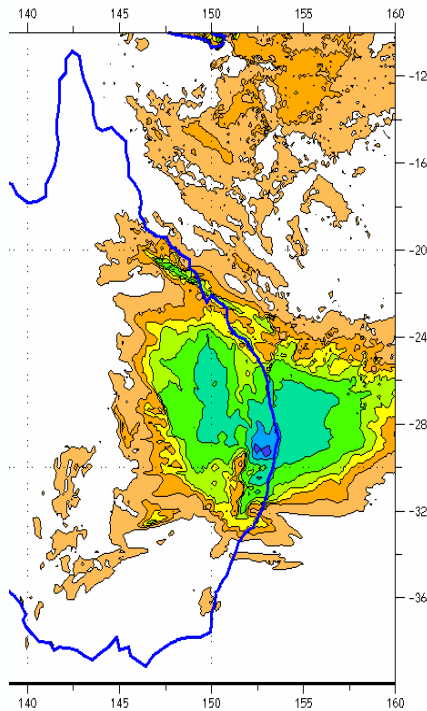
# Hydrological modelling

- Semi-distributed
- GR4H & Muskingum routing
- Error model updates forecast

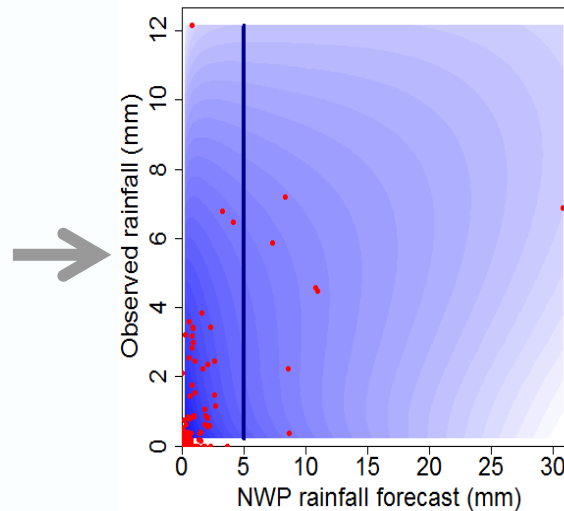


# Post-processing NWP rainfall

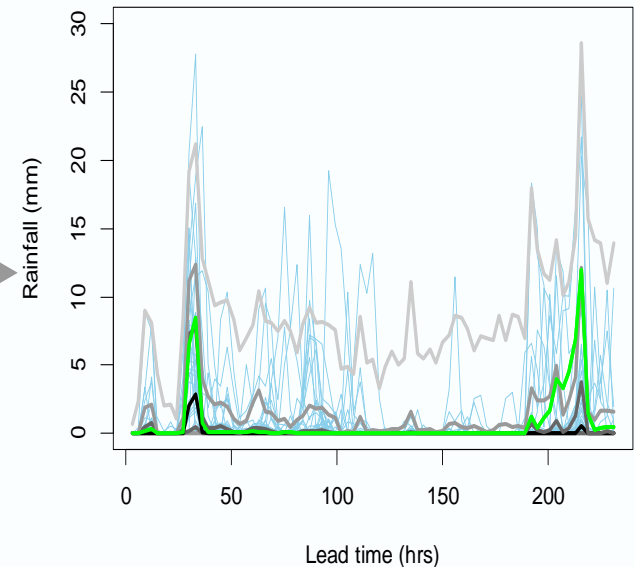
Deterministic ACCESS-G  
rainfall forecast



Rainfall bias-correction and  
ensemble generation



Ensemble rainfall forecast



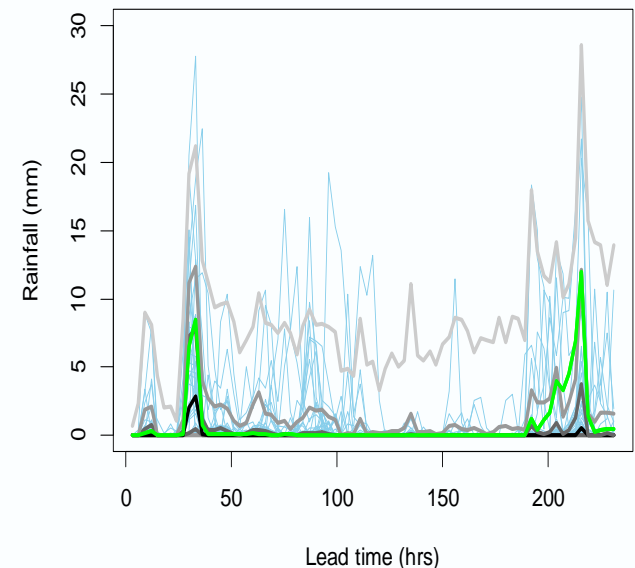
Rainfall post-processing - Robertson et al. (2013) *HESS*  
Data transformation - Wang et al. (2012) *WRR*

Handling Zero values – Wang & Robertson (2011) *WRR*  
BJP – Wang et al. (2009) *WRR*  
Schaafe shuffle – Clarke et al. (2004) *J. Hydrometeorol.*

# Post-processing NWP rainfall

- Forecasts are unbiased at all lead times and locations
- Non-linear conditional bias is corrected
- Zero rainfall days
- Uncertainty reliably quantified

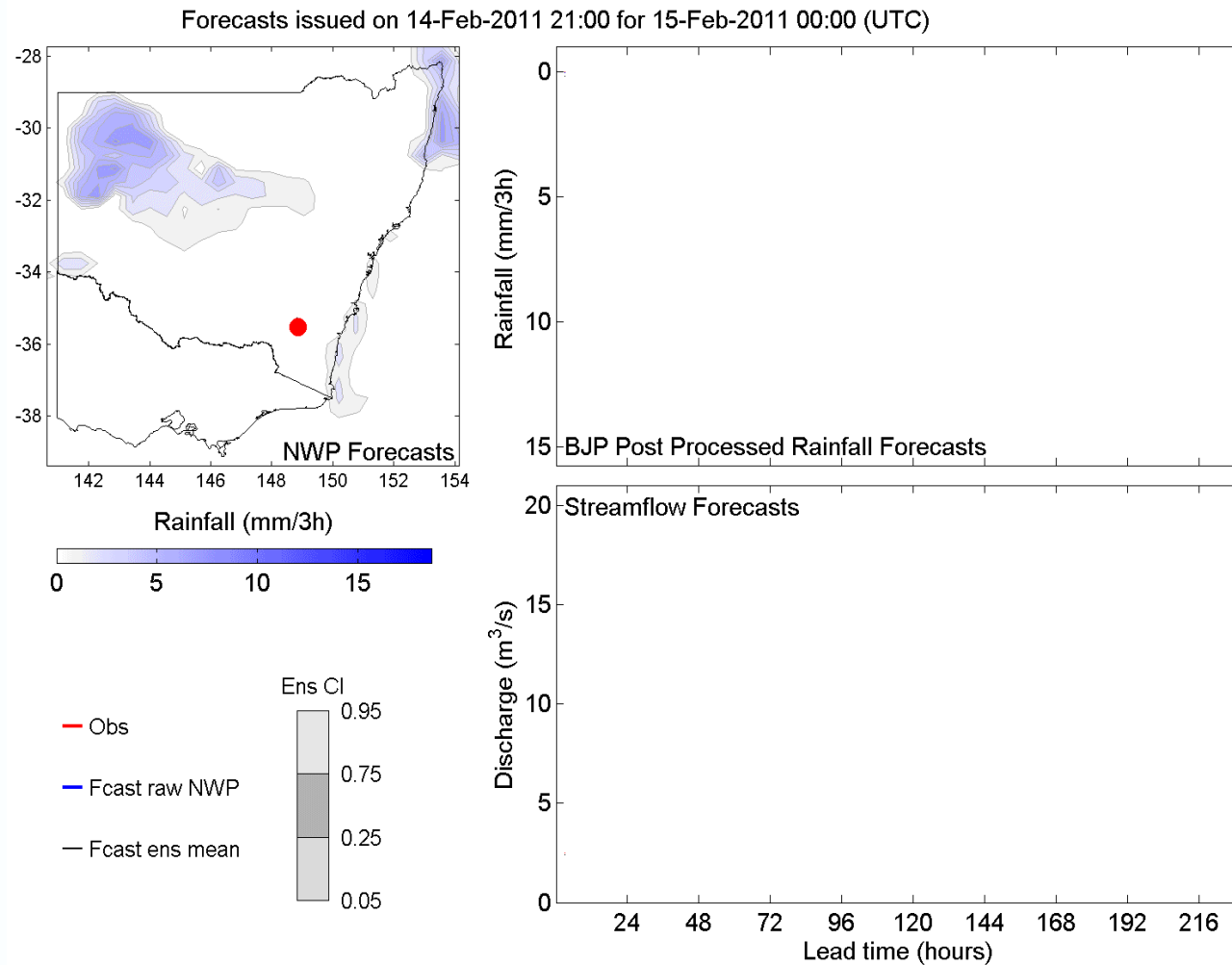
Ensemble rainfall forecast



Rainfall post-processing - Robertson et al. (2013) *HESS*  
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Handling Zero values – Wang & Robertson (2011) *WRR*  
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# Putting the system together





# Forecast Evaluation

## Forecast Performance

- Skill
- Reliability

**System evaluated at time steps of 1, 3, 6 and 24 hours**

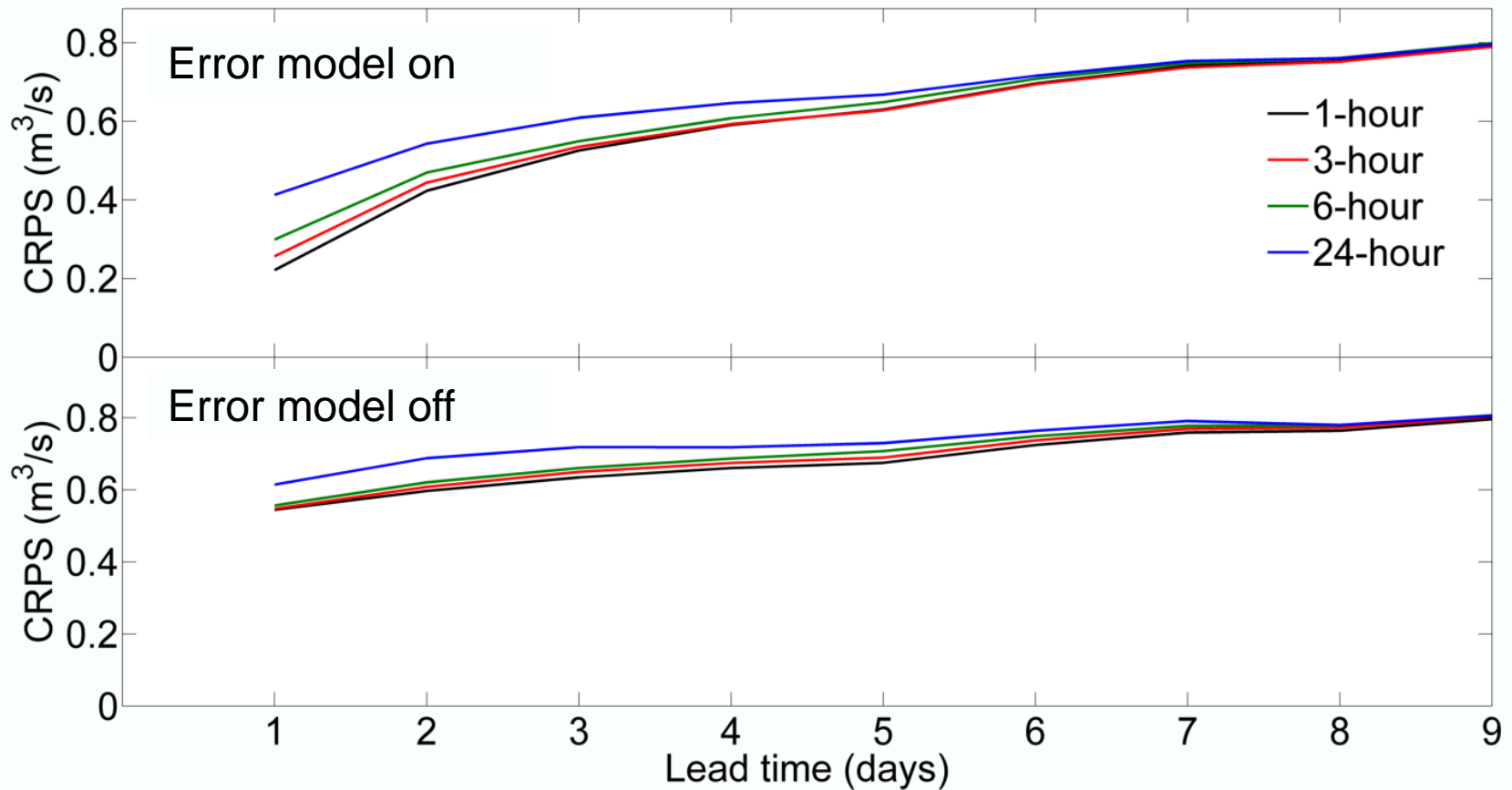
- Comparisons of 24 hr average flow

**9 catchments over the period of Aug 2010 – Apr 2012**

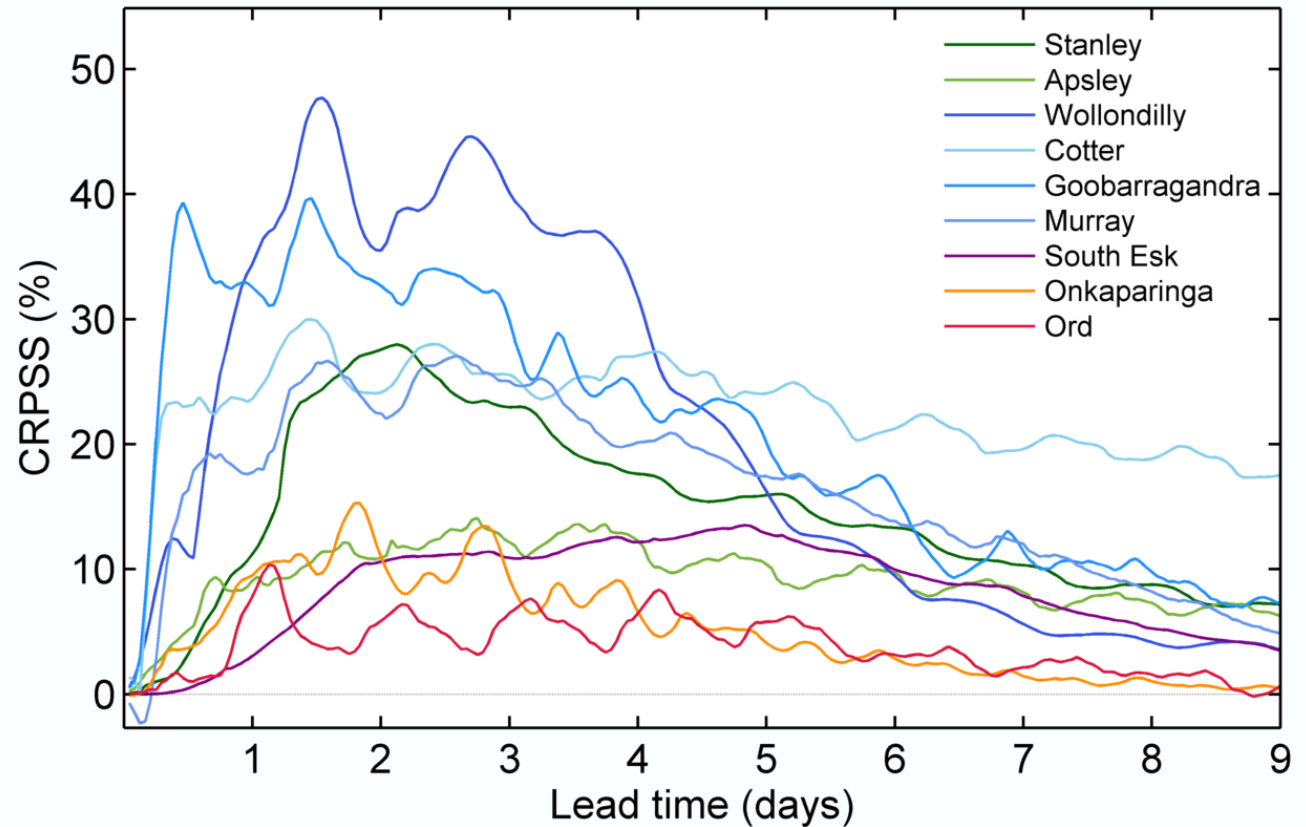
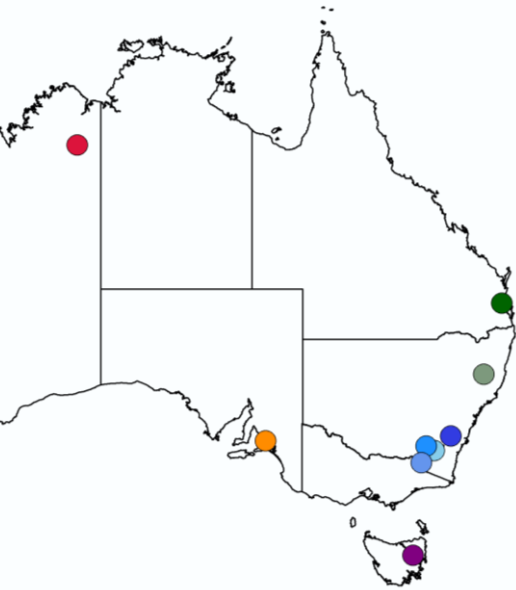
- Hydrological model calibrated to data prior to 2010
- Rainfall post-processing leave-one-month-out cross validation



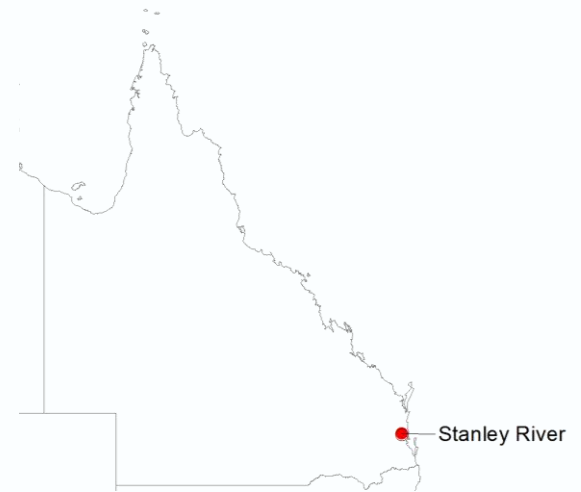
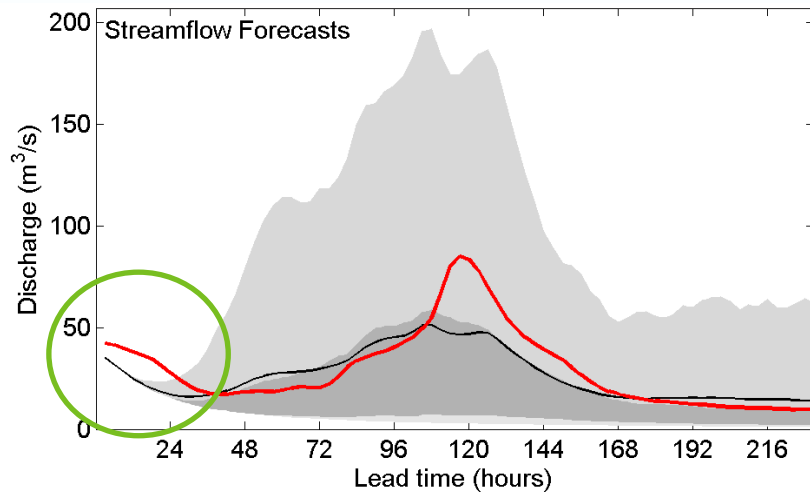
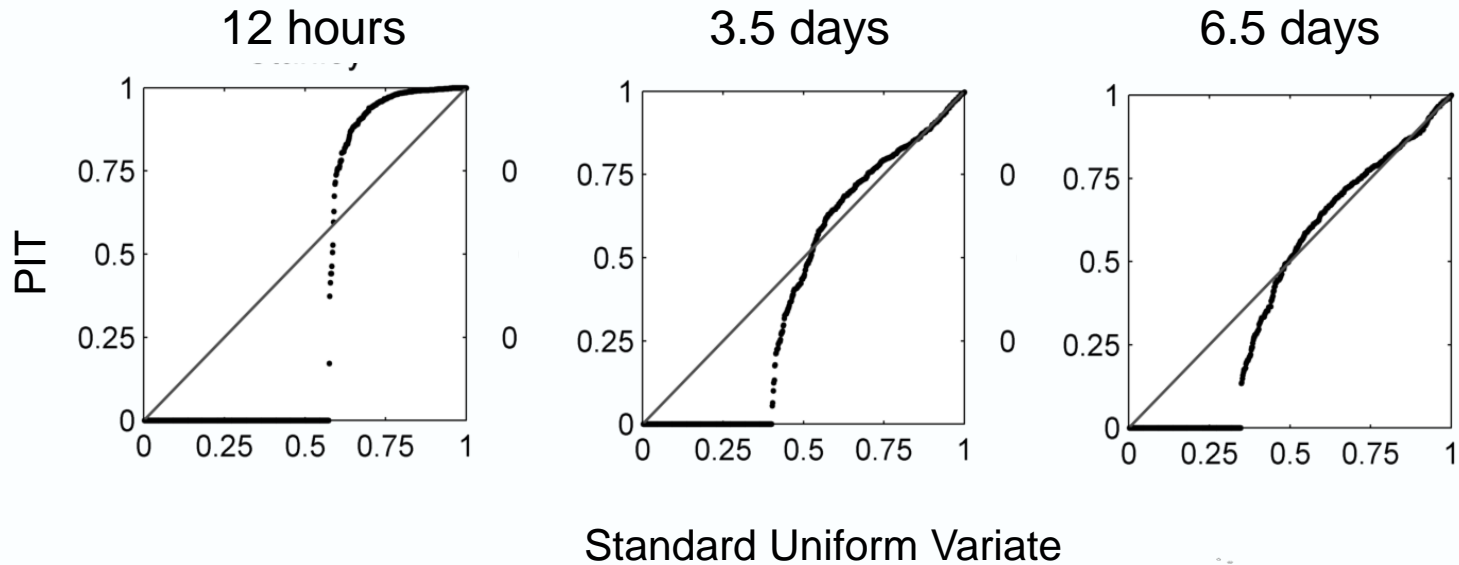
# Impact of modelling time step – Cotter River



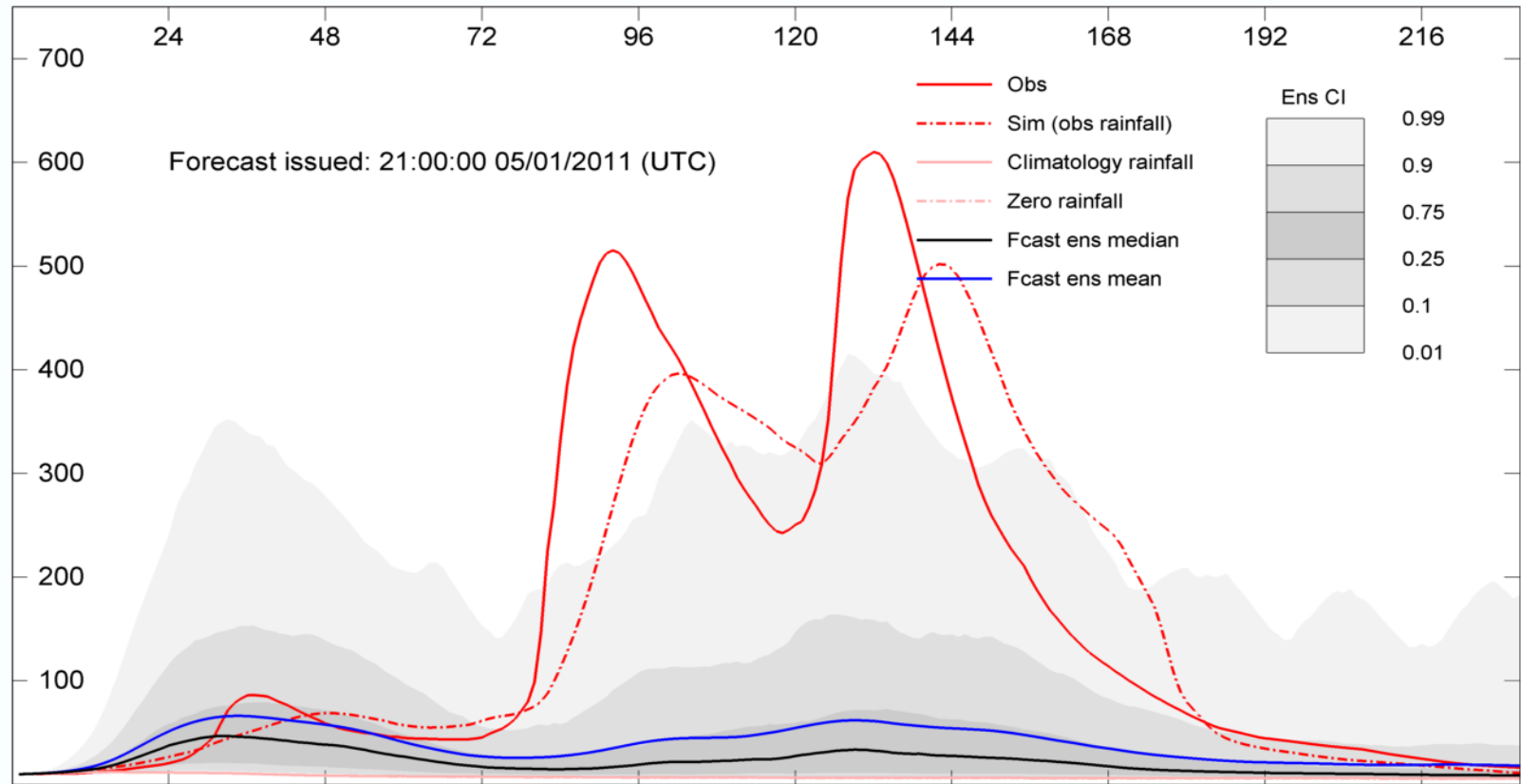
# Model skill – Continuous Ranked Probability Skill Score



# Ensemble reliability – Stanley River



# Room for improvement – rainfall forecasts



# Summary and future directions

- Ensemble forecasting is now possible, but not yet operational
- Need to account for hydrological uncertainty for better reliability
- Including more rainfall forecasts will improve skill
  
- Deterministic continuous hydrological forecast service for 11 catchments now a pilot service
- Ensemble streamflow forecast service to be implemented in the near future

# Thank you

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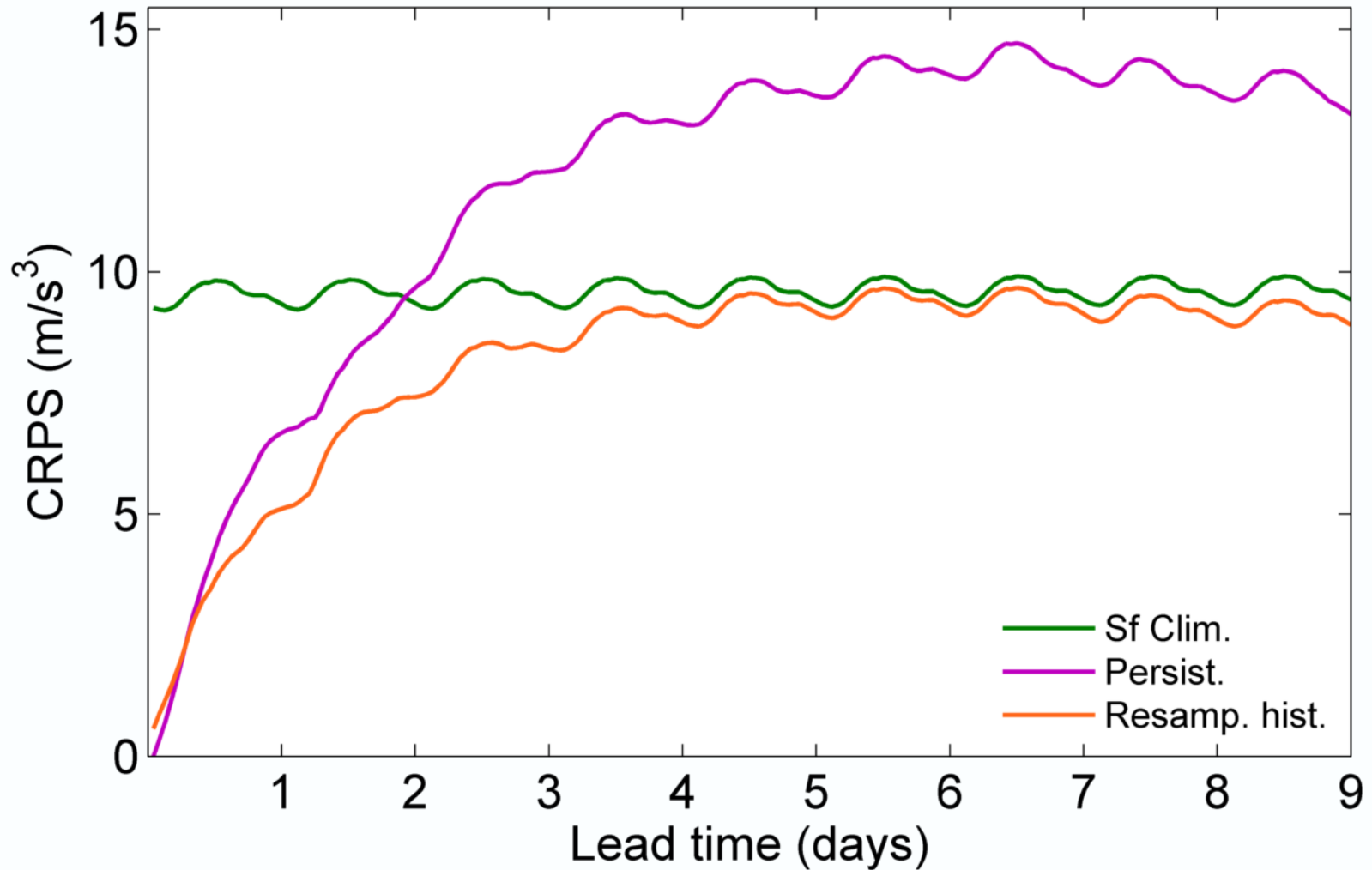


Abercrombie River

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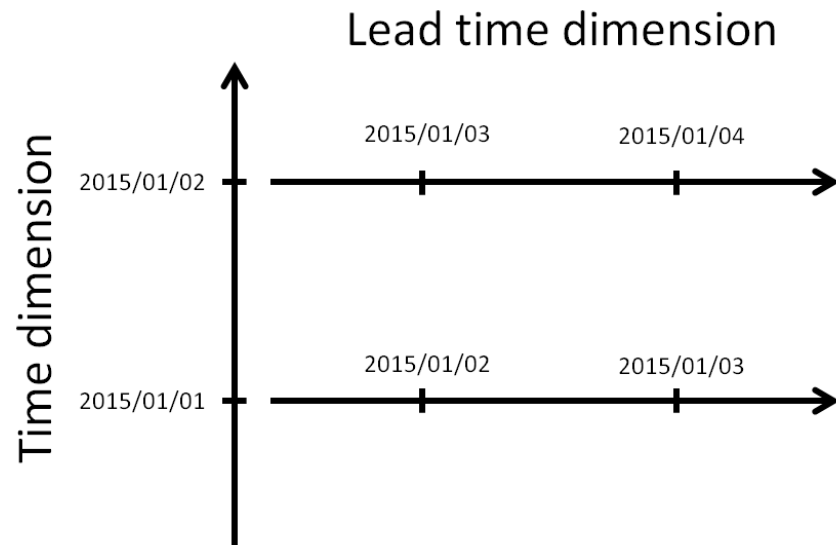
# Choosing a reference forecast



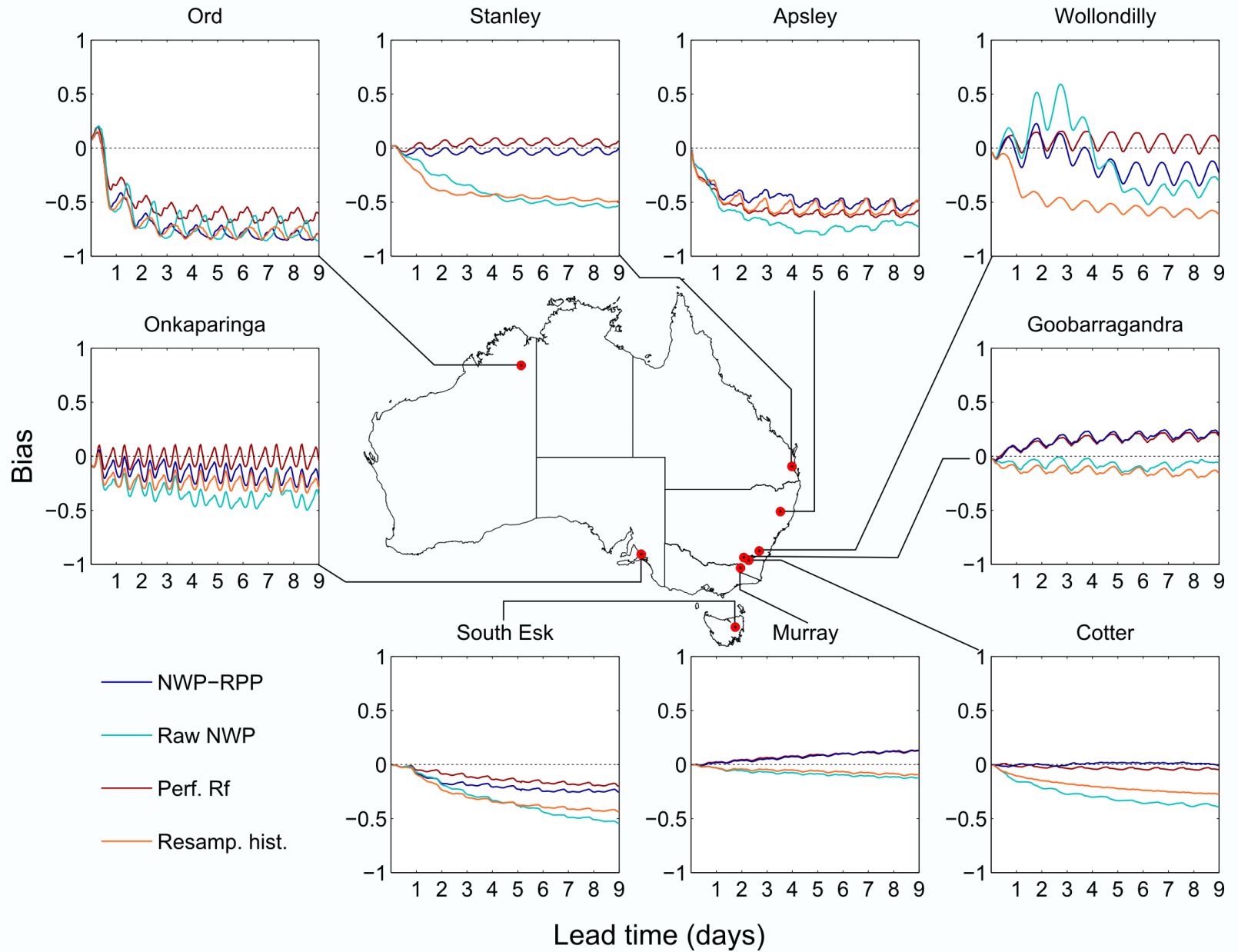


# Software and Data formats

- Modules of SCHEF developed in Fortran
- For operational forecasts, modules called by Delft-FEWS
- Data is all stored in netCDF files including dimensions:
  - Time
  - Ensemble member
  - Lead Time



# Bias



# Ensemble reliability – Stanley River

