

### **Pollutant Load Estimation for GBR Catchments:**

Accounting for uncertainty in monitoring and modelled data using data assimilation techniques

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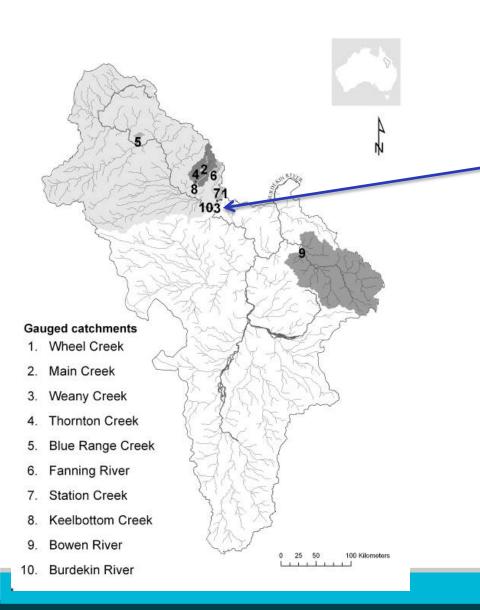
### **Relevance of Work**

- In the context of Loads for the GBR:
  - How do we prioritise areas within a catchment to obtain improvements in loads?
  - What are the sources of loads?
  - Where is information lacking (i.e. sources of uncertainty are high) and where do we need to invest more effort?
- In complex systems science we have
  - Models of the world
  - Measurements of the world
- How do we blend these sources of information to provide improved levels of confidence for decision making?

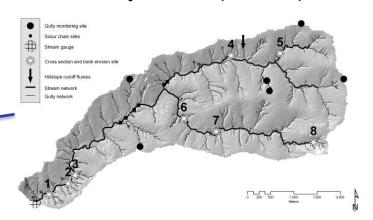




### **Case Studies**

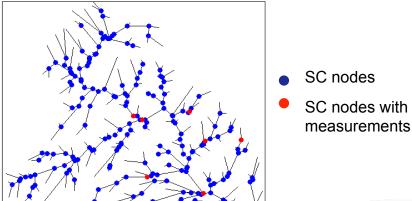


#### Single Site: Weany Creek (11 km<sup>2</sup>)



#### Multi-Site: Upper Burdekin (~40,000 km<sup>2</sup>)

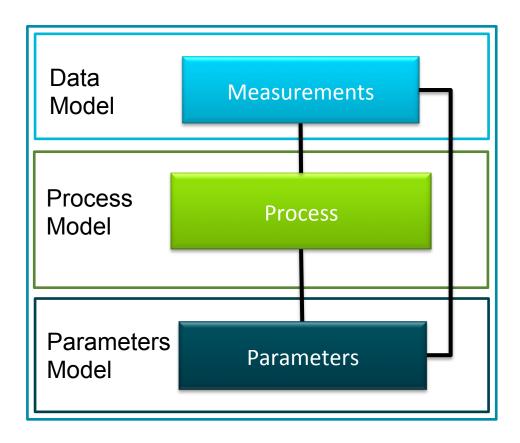
Upper Burdekin





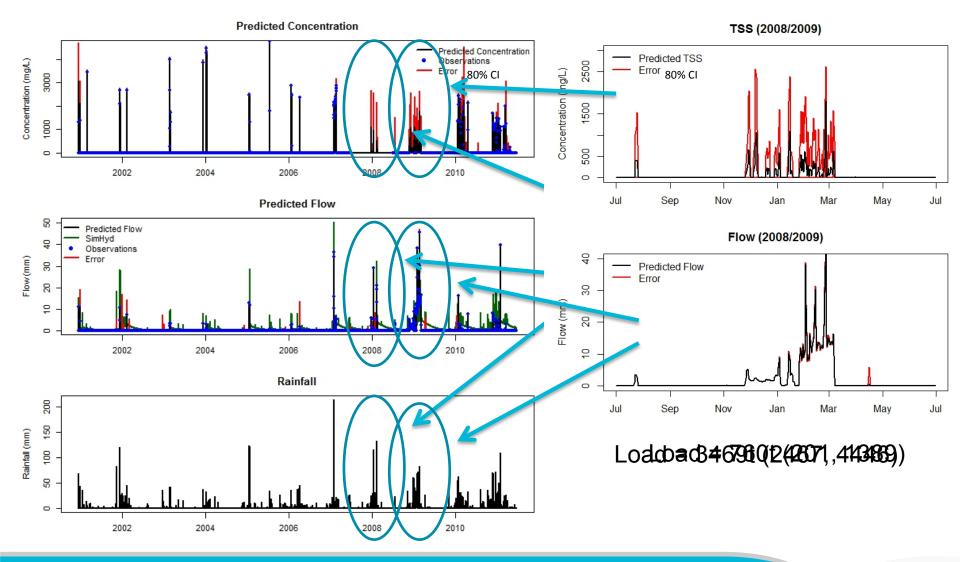
# **Bayesian Hierarchical Modelling Framework**

State of the art technology – Our International collaborators are developing with NOAA and NASA (jet propulsion labs)





## **Results I: Weany Creek**

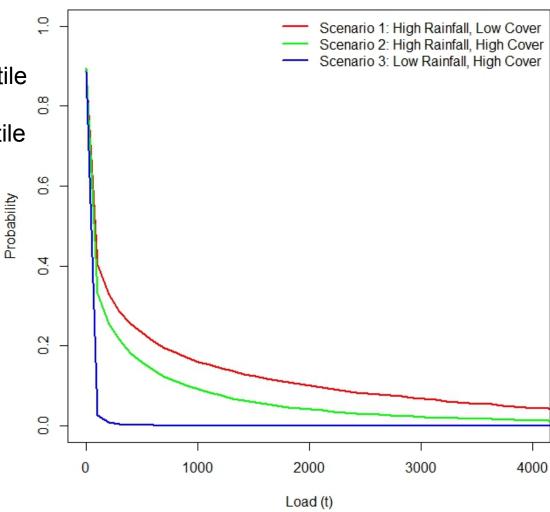




## **Results I: Weany Creek Exceedances**

#### **Exceedence probabilities for Weany Creek**

Low cover = 20th percentile of cover High cover = 80<sup>th</sup> percentile of cover



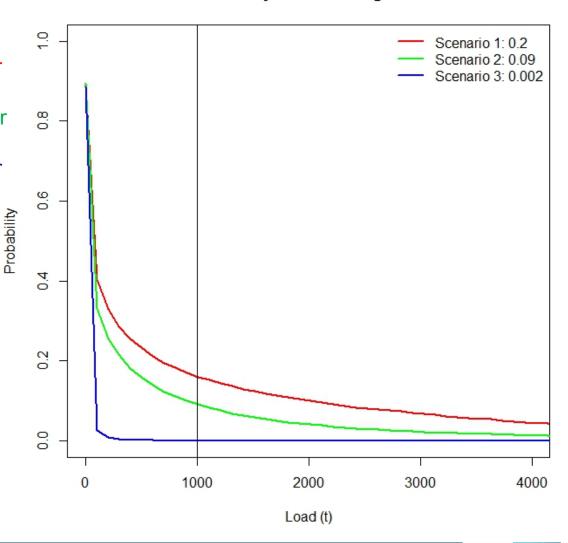
## **Results I: Weany Creek Exceedances**

#### Probability of Exceeding 1000t

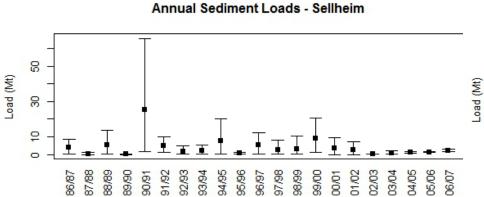
Scenario 1: High Rainfall, Low Cover

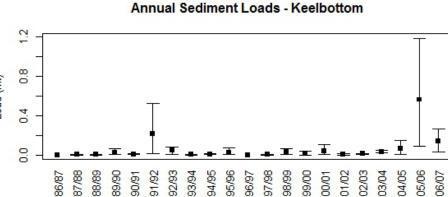
Scenario 2: High Rainfall, High Cover

Scenario 3: Low Rainfall, High Cover

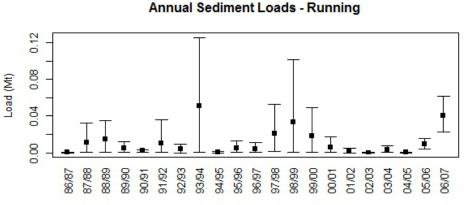


## Results II: Upper Burdekin





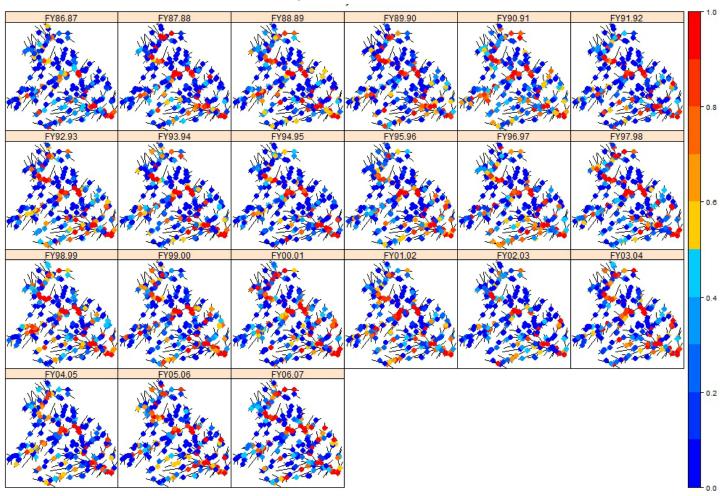
Annual Sediment Loads - Star ব Load (Mt) 2 91/92 92/93 93/94 94/95 96/96 26/96 97/98 66/86 99/00 00/01 01/02 02/03 04/05





### **Exceedence Probabilities - Load**

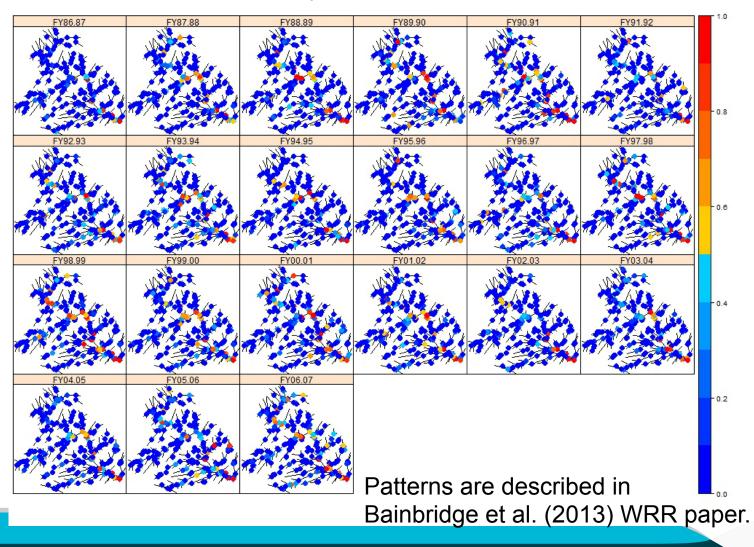
Probability Load > 5,000 t





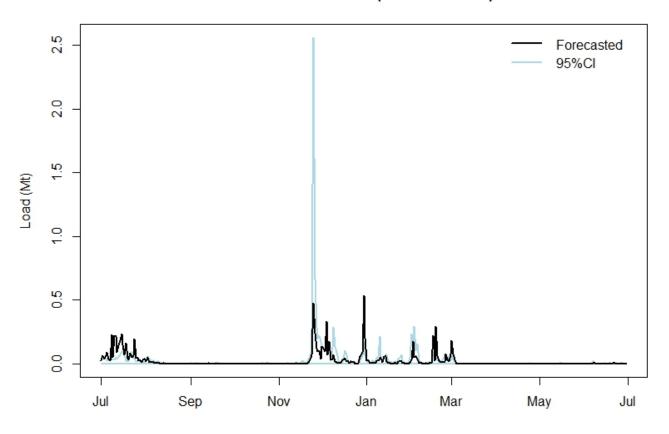
### Results II: Exceedence Probabilities - Load

Probability Load > 100,000 t



# Forecasting – Sellheim Site

#### Sellheim Forecast (FY=2007/2008)

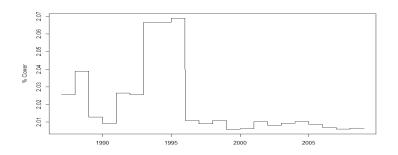


Total Load: 8.66 Mt [0,87.48]



# **Key Findings & Implications for MW-WQIP**

• Cover is significant: Increase in ground cover indicates a significant decrease in TSS concentration across the catchment.



% Cover fit as a predictor in the model

- Exceedence probabilities offer a new way to interpret uncertainties from the model. They can highlight problem areas or sources of erosion.
- Forecasting ability is quite powerful.
  - Forecast concentration, flows and loads a year out with uncertainty.
  - Investigate forecast in response to changing ground cover or climate scenarios.
- Providing a level of confidence about modelled output for reporting.



#### **Future Work**

- Extensive validation and testing of the models is still required.
  Other monitoring sites in the Upper Burdekin can help inform the model further. Initial results are promising.
- CSIRO is investing heavily into this methodology:
  - Methods are very computational as this is a complex model. CSIRO funded project to speed up the code using CSIRO software (LibBi software) developed for these types of problems.
  - Investigating ways to link catchment modelling outputs with marine biogeochemical models.
  - Trials of methodology in another catchment e.g. Fitzroy.



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