

# ... but where do we run it?

Jonathon W. Ross, Geoscience Australia



# Why did we build the AGDC?

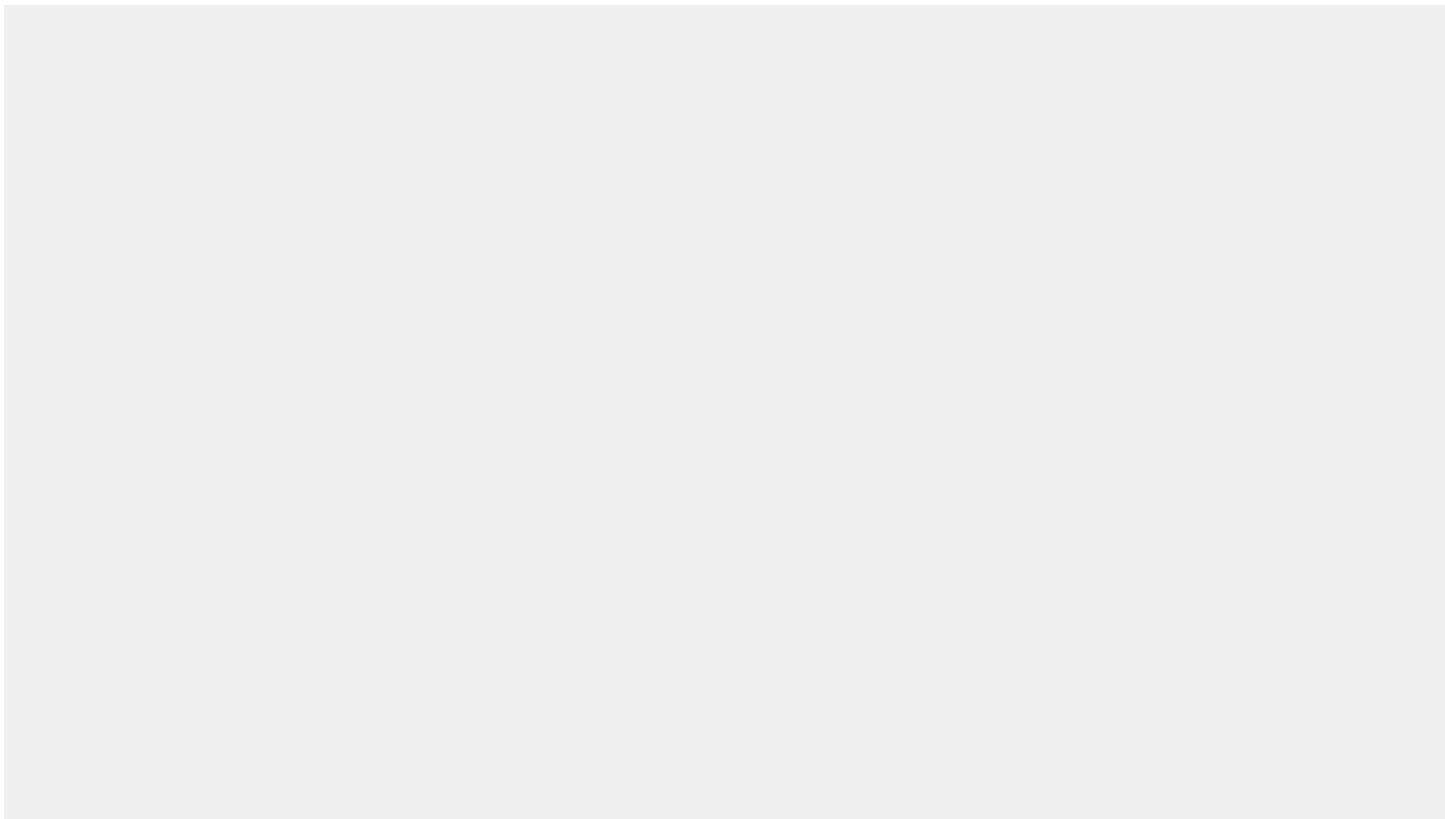
- Collecting data since 1979 - important to deliver value to Government
- Mandate to support Australian Government objectives
- Key national objectives:
  - A national record of change – as it happens
  - Sustainable and productive resources and agriculture industries
  - **Disaster risk reduction**
  - **Marine and coastal jurisdiction management**
- Support the **region and regional engagement priorities** (APEC, ASEAN)
  - **Food security and sustainable livelihoods (incl aquaculture)**
  - **Climate adaptation**
  - **Disaster resilience**
- Space policy:
  - Give back to the international community
- Exploit multi-\$100m national HPC/HPD



## The key gap

Lots of data ...  
Plenty of good idea ...  
Interesting methodologies ...  
But where to run it?  
And at scale?

# Information infrastructure for EOS



# 'Analysis Ready Data'

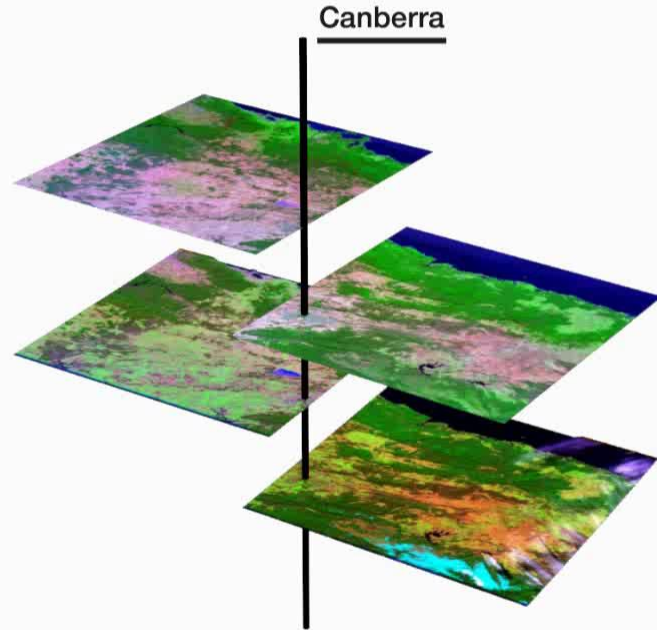
Orthorectification



Calibration

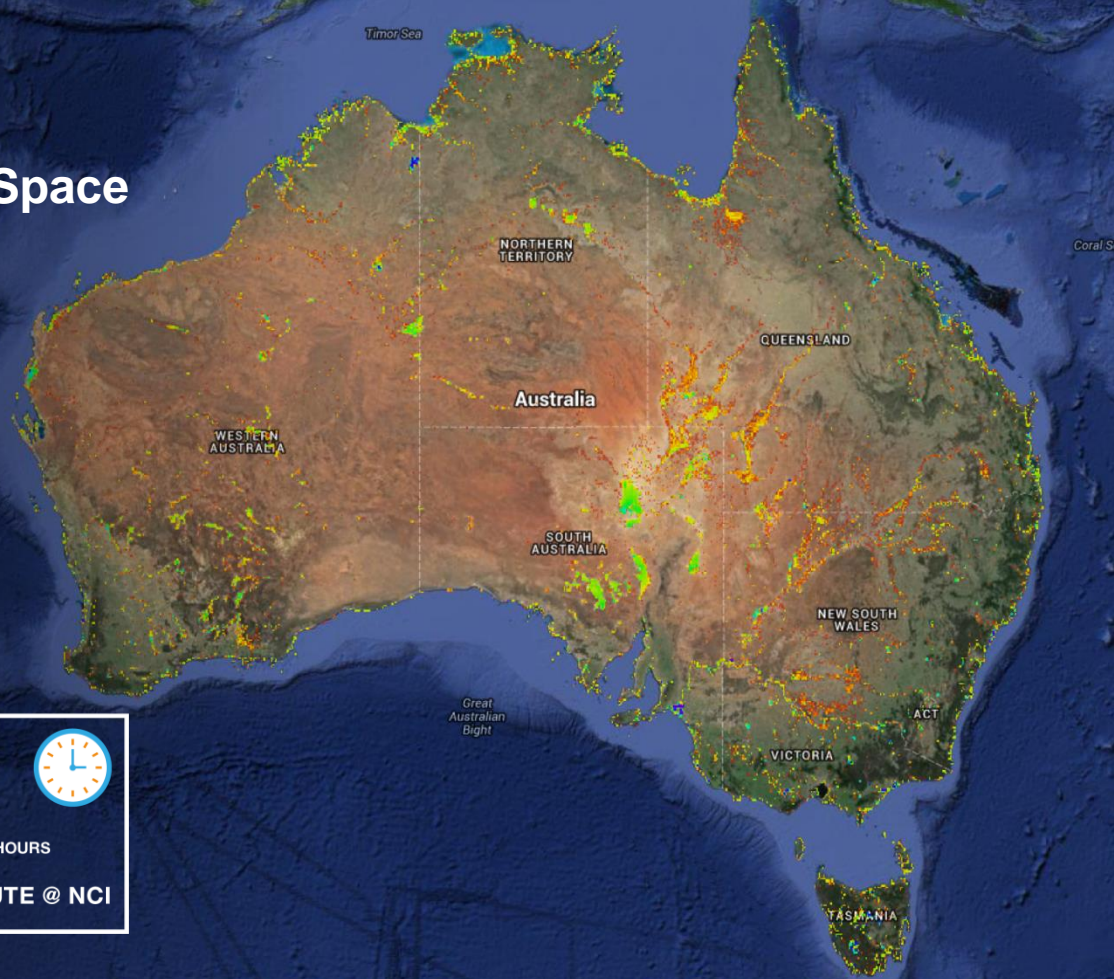
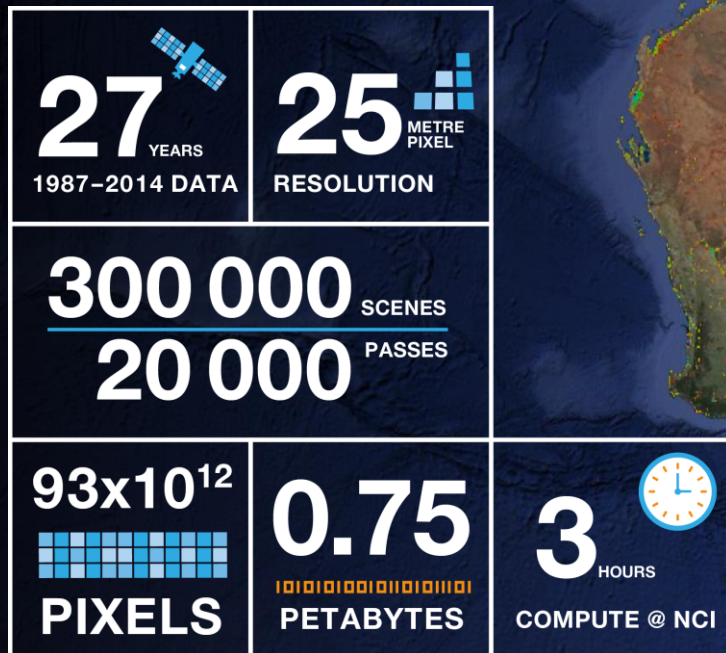


Time series





# Continental Scale Water Observations from Space



# Key lessons

- **Analysis ready data: the ‘goldilocks’ effect**
  - Exploit data density vs the “perfect scene”
- **Favour integration across sensors/data types**
  - Vs highly vertically integrated products
  - Data security and product depth
- **Engagement with end users is not negotiable**
  - Capacity dev for domain experts is key
  - Co-design good!
  - Avoid the “echo chamber” effect
  - Empower ‘users’ to work iteratively – in real time, with peers
  - Enable domain expert groups to support each other



# Key lessons

- **Must be “seen to be believed” – agile is good!**
  - Something now -> better than something later
  - A head start + ability to tailor products to local needs -> ideal
- **Open source + commercial -> optimal**
  - Sovereignty and ownership are critical issues 4 industry/business
- **Avoid technology fixation**
  - If in five years other tech works -> hooray!

# Learning from the lessons



**Digital Earth**  
AUSTRALIA

# We spend a lot of money on the environment

- In 2016/17 announced \$1.1 billion over 7 years for Australia's Landcare Program.
- We spend ~\$150 million per year on environmental water in the Murray-Darling Basin
- We have \$140 million dedicated to changing land management practices to protect the Great Barrier Reef
  
- Many of these make **almost no use** of EO Data at all
- Sometimes ... we don't really have much quantitative evidence of the impact and efficiency of these interventions

# Digital Earth Australia



- Australian Government has provided Geoscience Australia with an additional **\$15.3 million** to transform the pilot 'AGDC' into the operational **Digital Earth Australia. \$28 million over 2 years.**
- Funding will support:
  - Co-designing and developing applications with agencies
  - Embedding products into government business processes
  - Support for new data streams (data richness and security)
  - Access for industry (e.g. app developers)
  - Further engagement with statistical communities
  - **Platform for GEO outputs to run**
  - **Foster open source community**



# Lies Darn Lies And Statistics???

Probabilities vs Certainties

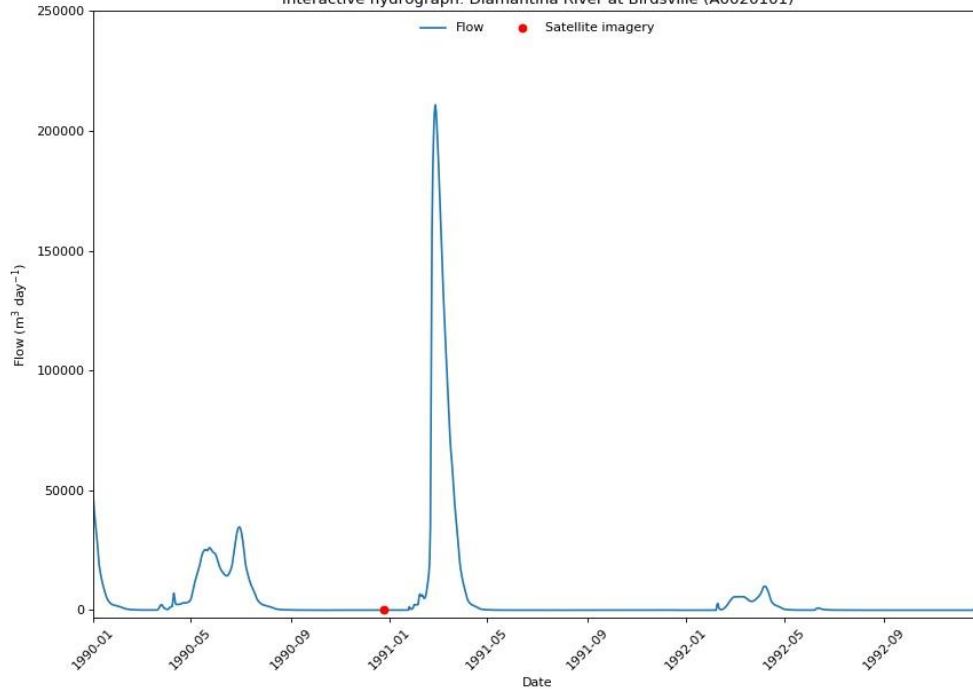
What happens when you give scientists Python Notebooks!



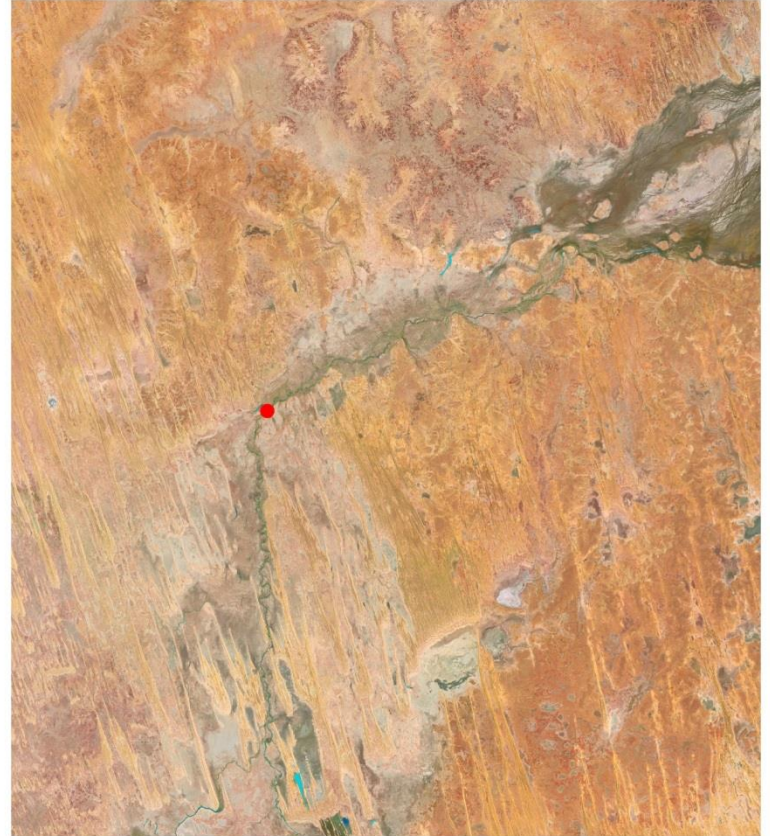
# Understanding water resources



Interactive hydrograph: Diamantina River at Birdsville (A0020101)



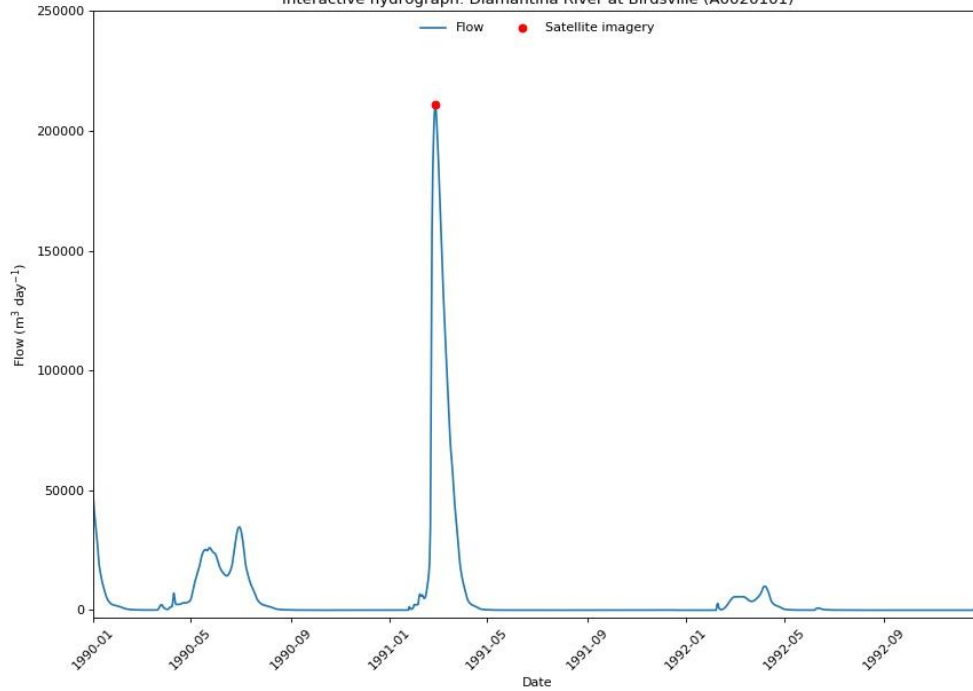
Date: 1990-12-24 Flow: 0.00 m<sup>3</sup> day<sup>-1</sup>



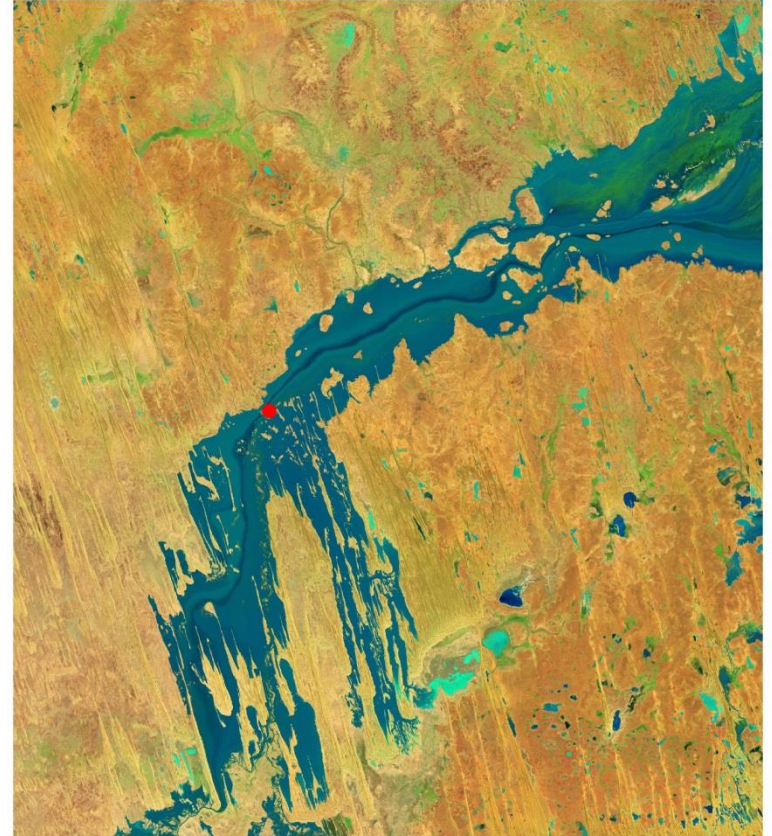
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Interactive hydrograph: Diamantina River at Birdsville (A0020101)



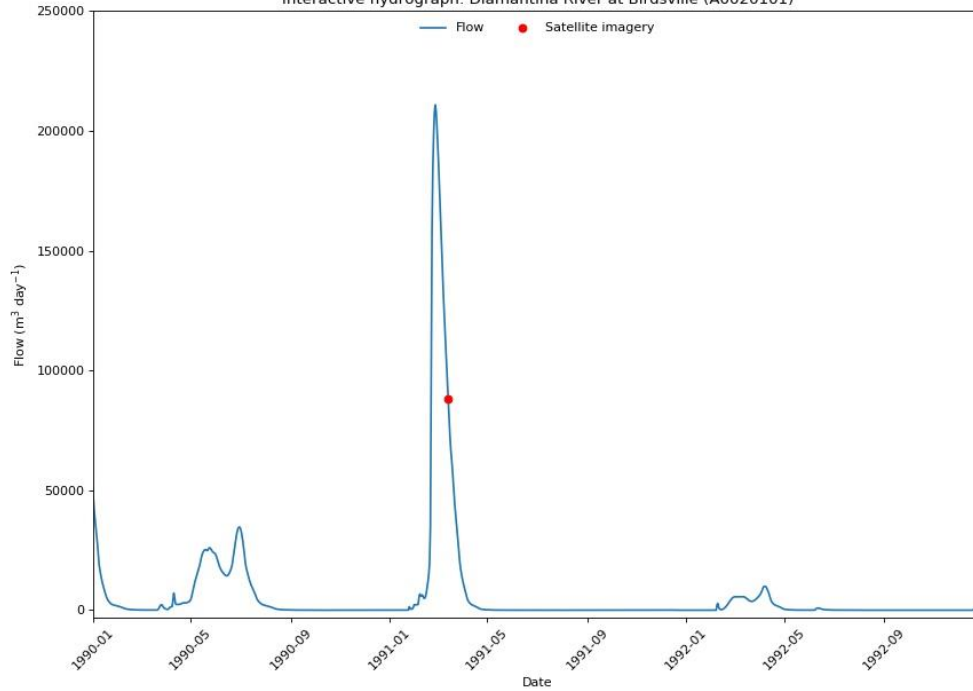
Date: 1991-02-26 Flow: 210856.12 m<sup>3</sup> day<sup>-1</sup>



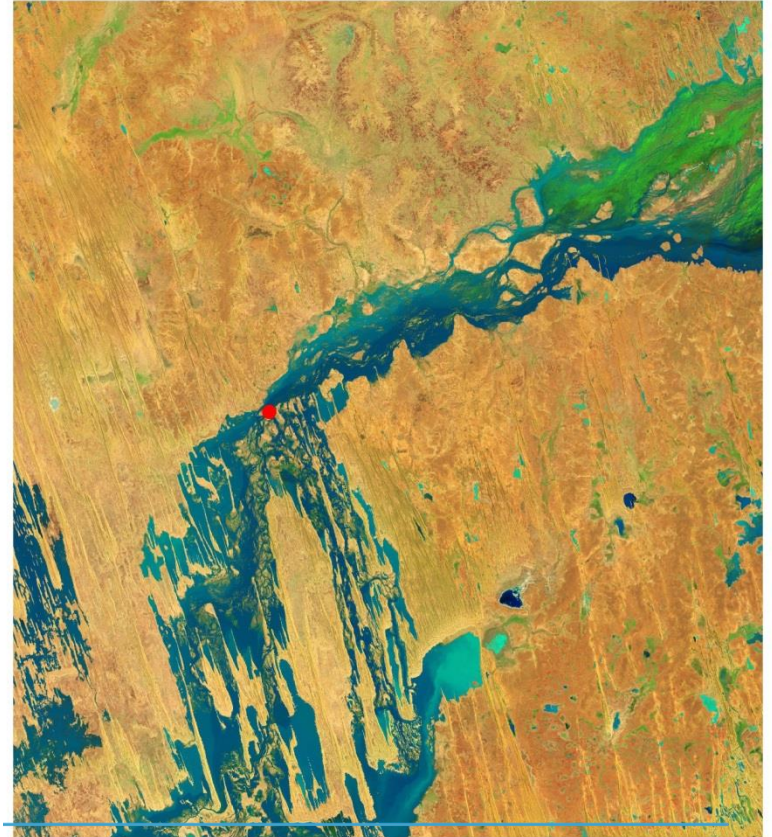
# Understanding water resources



Interactive hydrograph: Diamantina River at Birdsville (A0020101)



Date: 1991-03-14 Flow: 87971.78 m<sup>3</sup> day<sup>-1</sup>

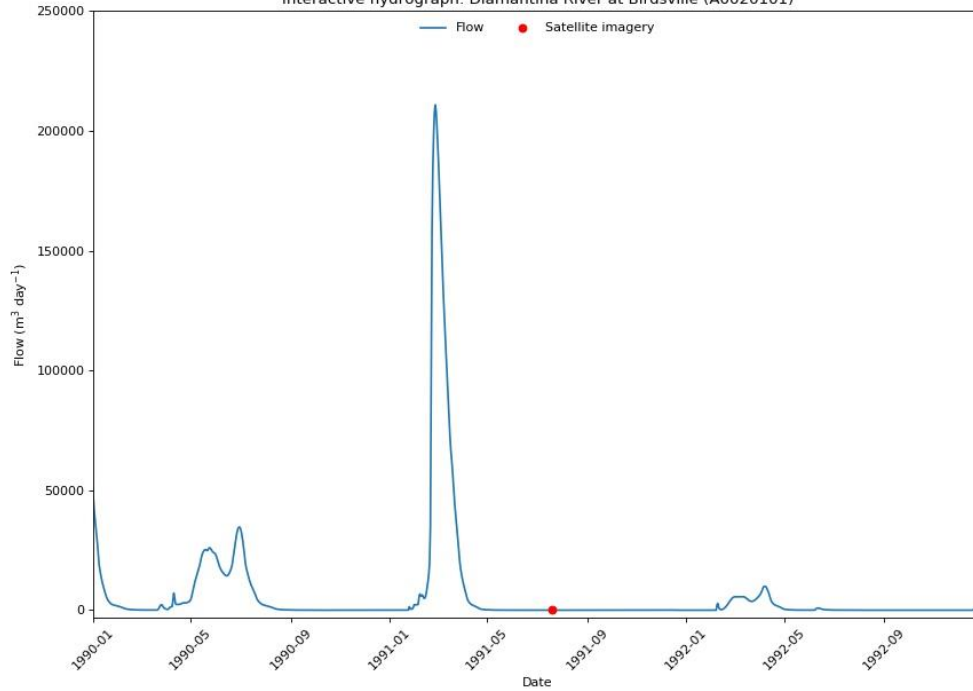




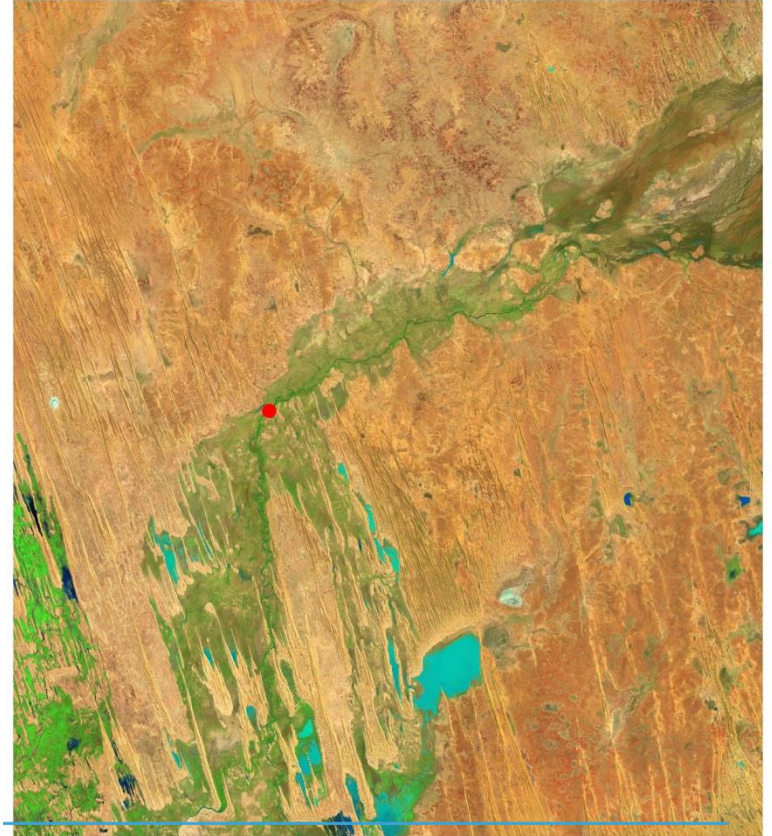
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Interactive hydrograph: Diamantina River at Birdsville (A0020101)



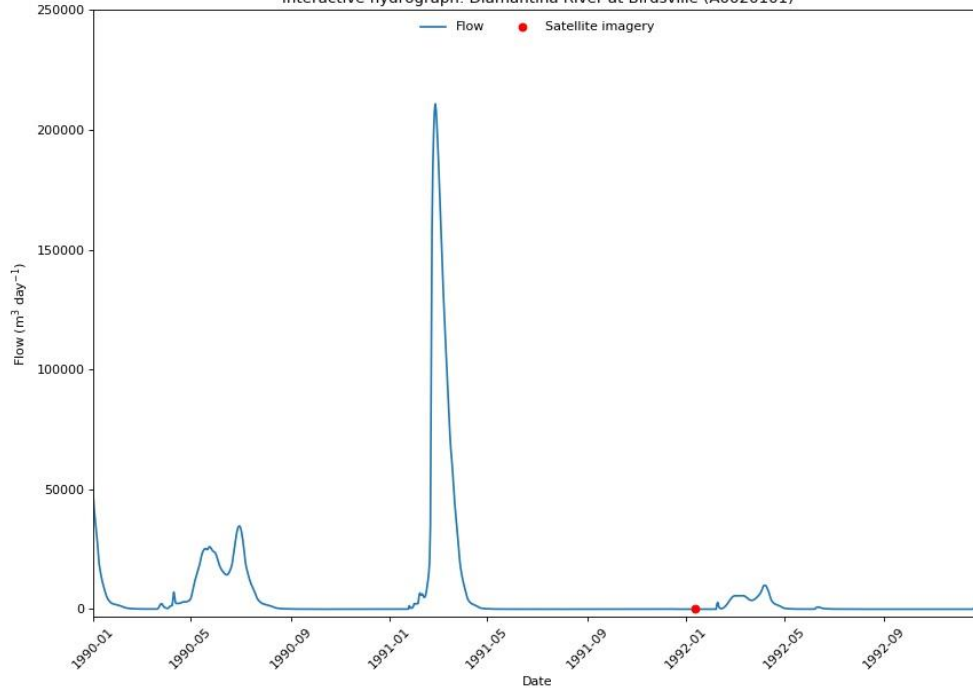
Date: 1991-07-20 Flow: 0.00 m<sup>3</sup> day<sup>-1</sup>



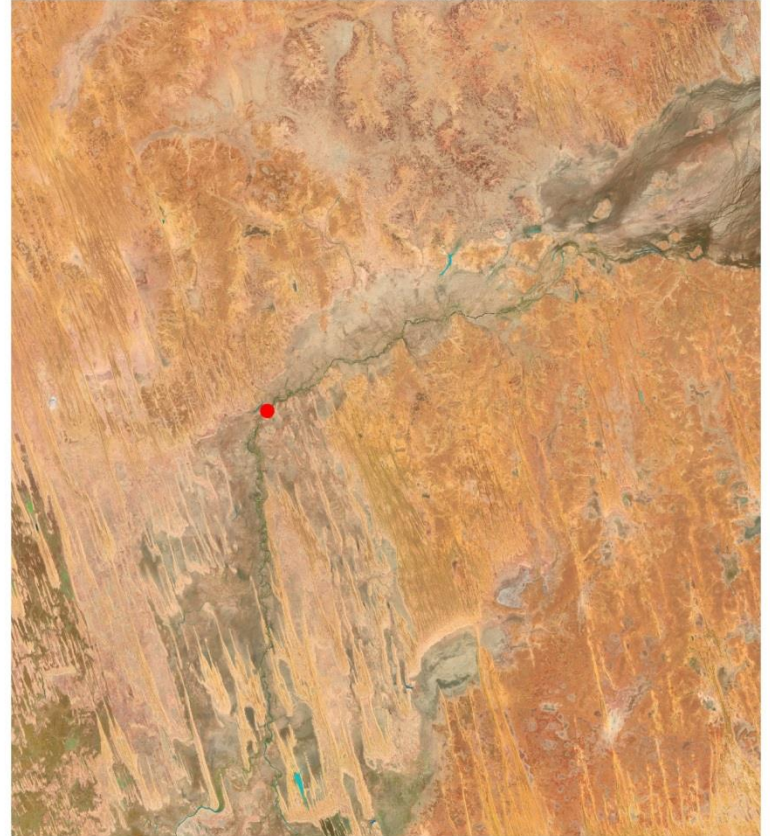
# Understanding water resources



Interactive hydrograph: Diamantina River at Birdsville (A0020101)



Date: 1992-01-12 Flow: 0.00 m<sup>3</sup> day<sup>-1</sup>

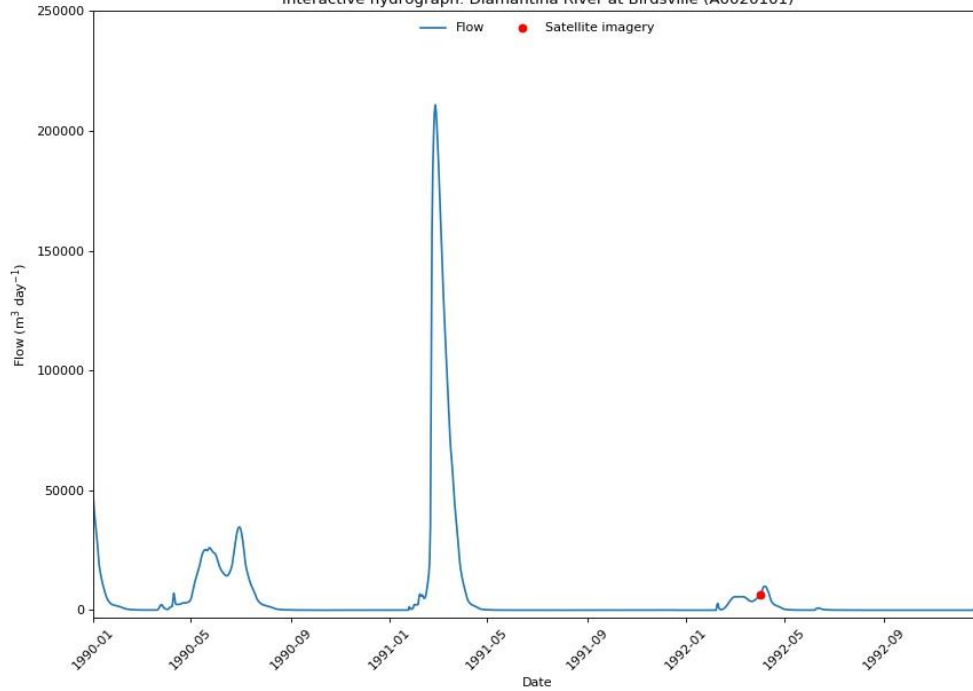




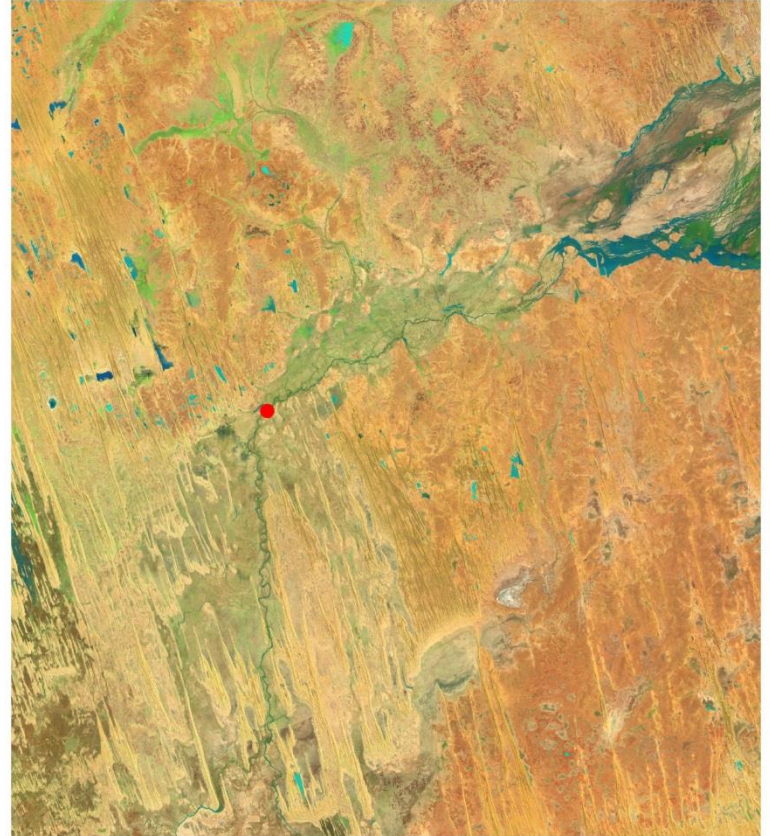
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Interactive hydrograph: Diamantina River at Birdsville (A0020101)

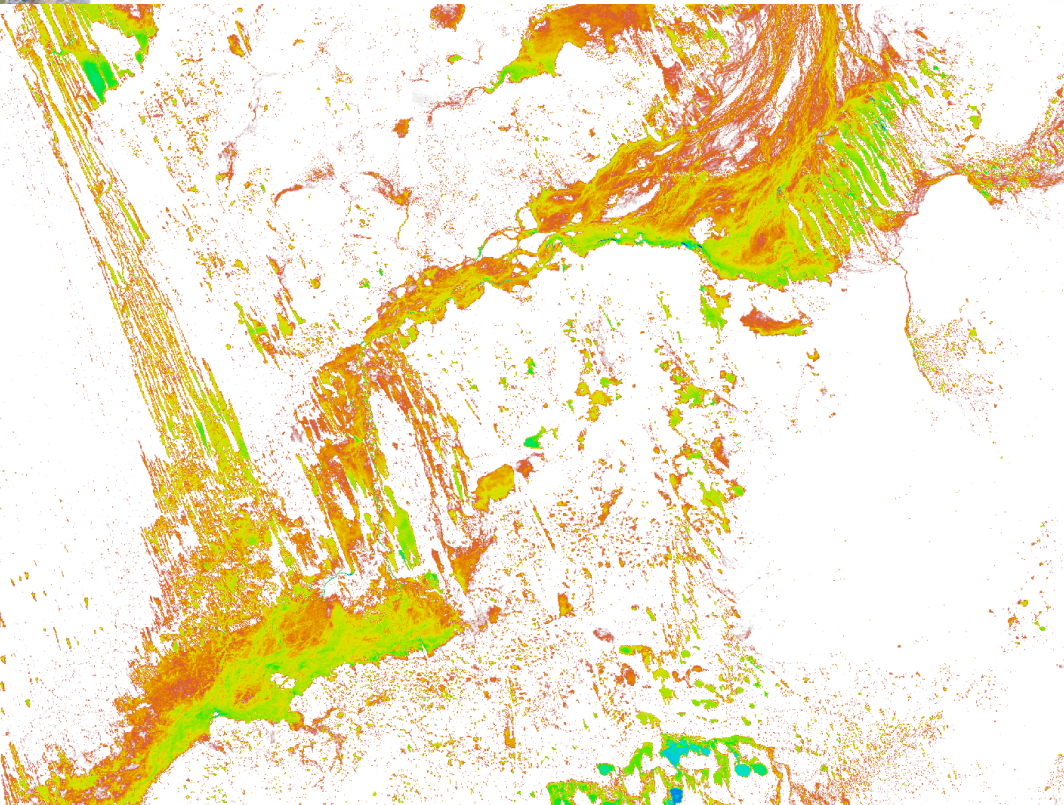


Date: 1992-04-01 Flow: 6418.89 m<sup>3</sup> day<sup>-1</sup>



# Understanding water resources

Date: 1990-12-24 Flow: 0.00 m<sup>3</sup> day<sup>-1</sup>







■ green

■ dry

■ soil

1988

2000

2006

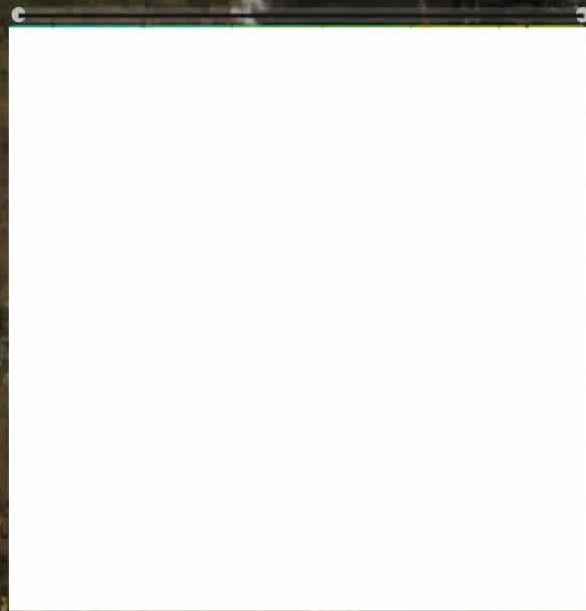
2014

# Water quality monitoring: Lake Burley Griffin

1987

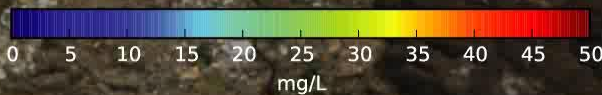
2001

2013

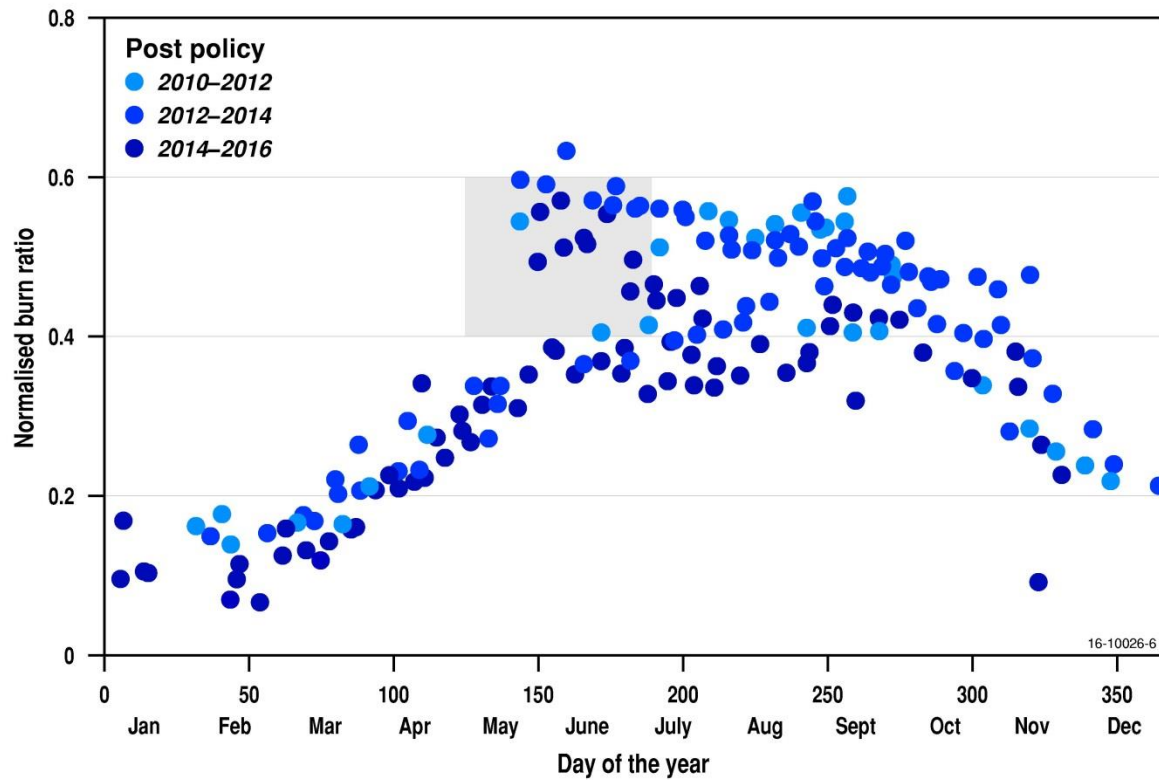


325

0

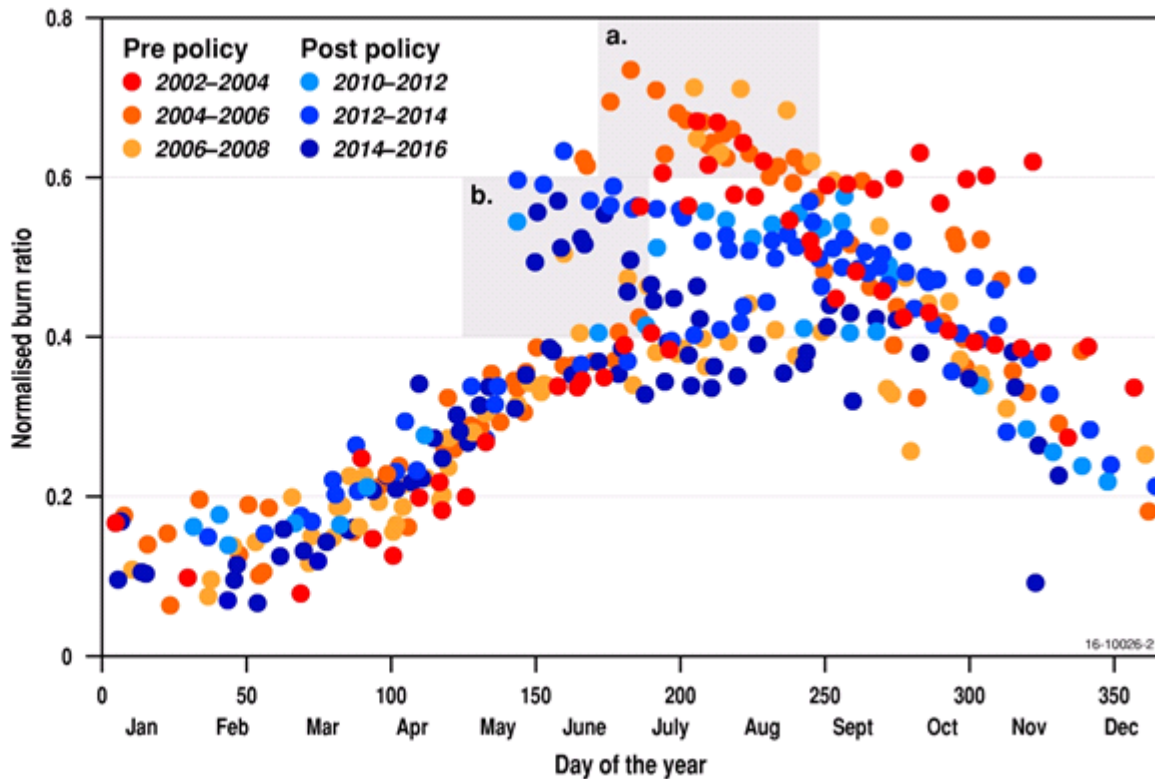
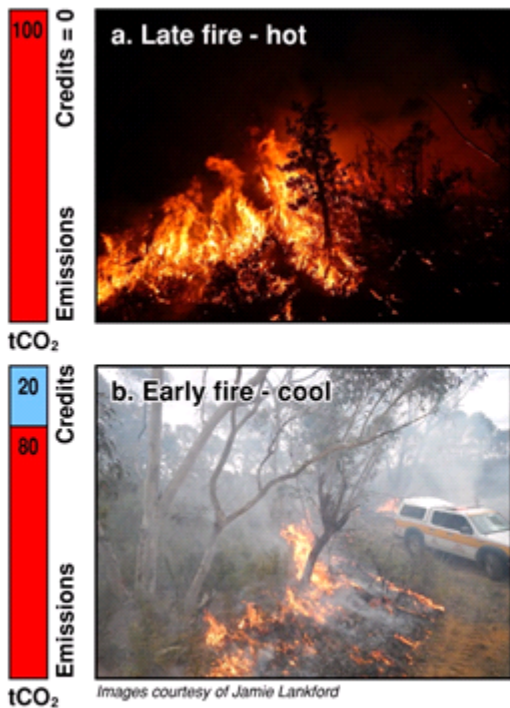


# Changes in fire management practices

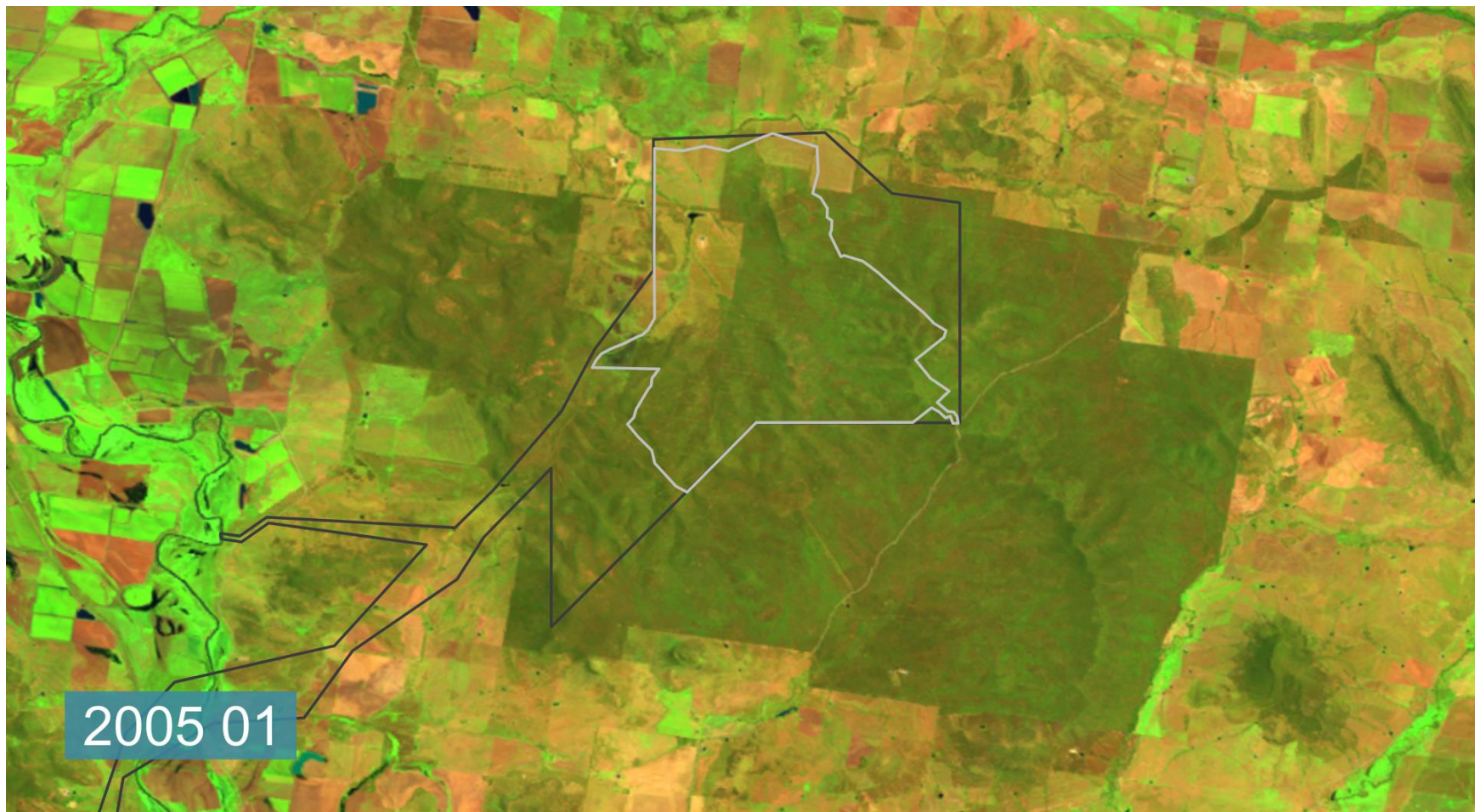




# Changes in fire management practices



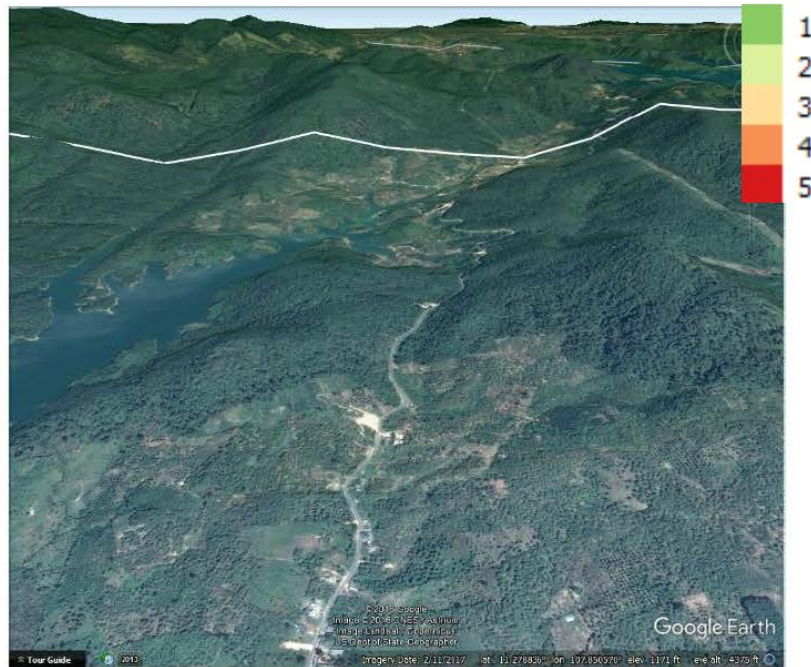
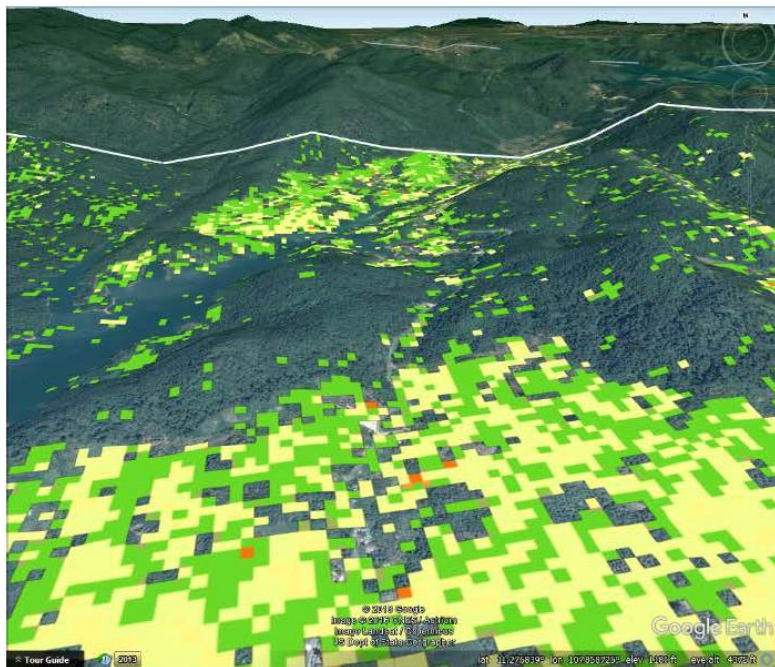
# Tracking development conditions:- clearance



2005 01



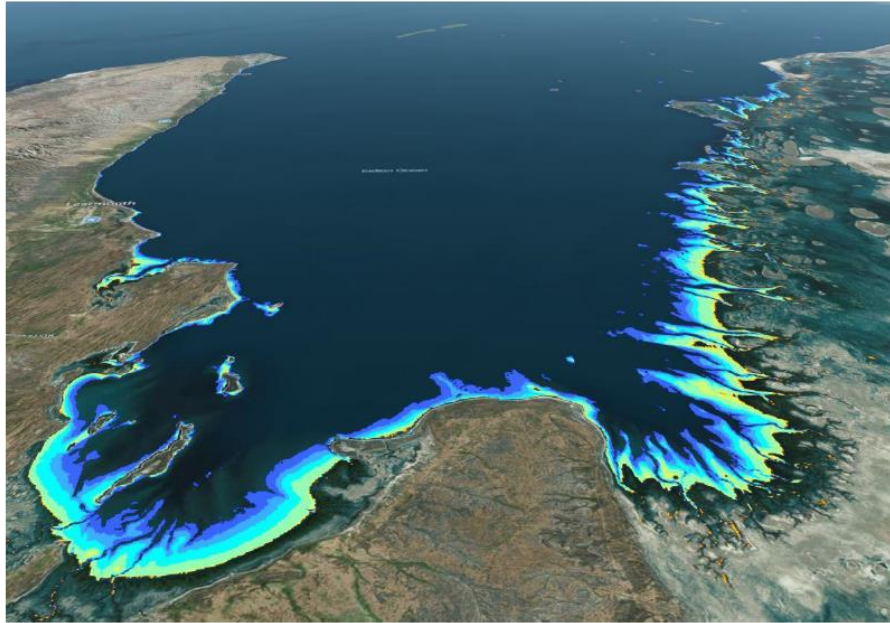
# Continuous Change Detection and Classification





**And, of course ... the coastal zone**

# The Intertidal Extent Model (ITEM) v.1



**Objective:** To model the extent and topography of the intertidal flats of Australia's coastline utilising 28 years of the Landsat archive

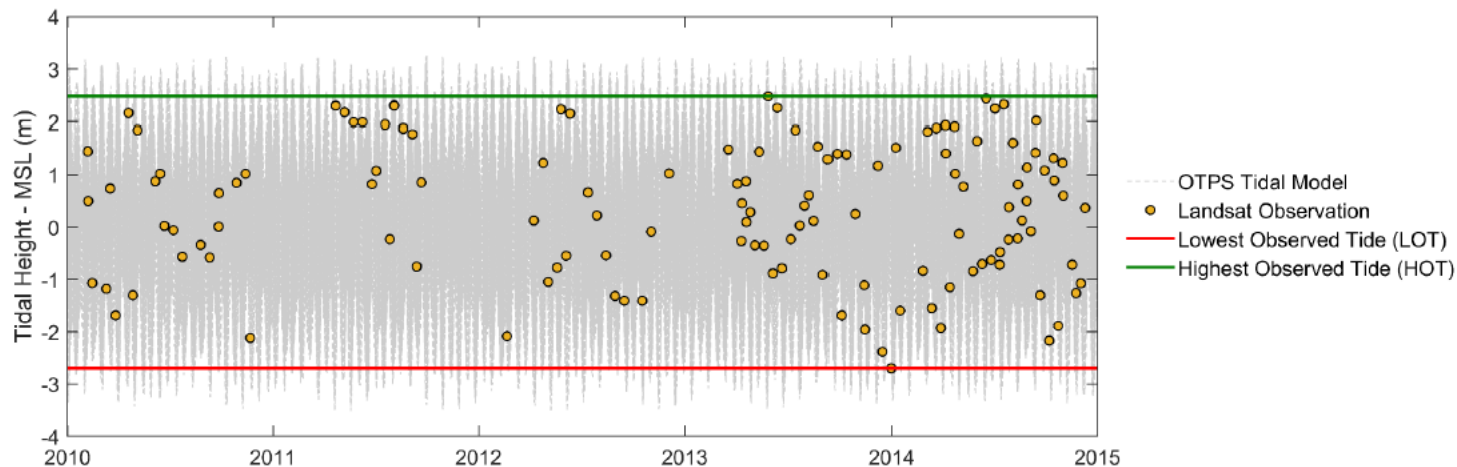
*Credit: Geoscience Australia (Sagar et al)*

# Sun-synchronous sensors and the Observed Tidal Range

A sun-synchronous sensor – observes at the around the same time of the day for each observation

This means that even with tidal variations, we most likely will only observe a portion of the full tidal range

We can characterise this as highest (HOT) and lowest (LOT) observed



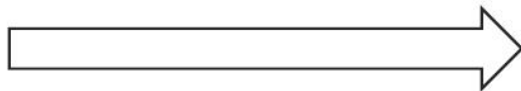


## The Intertidal Extents Model (ITEM) Process

- Each tile stack of observations is attributed with a tidal height utilising the OTPS model
- Observations are reordered based on tidal height rather than time



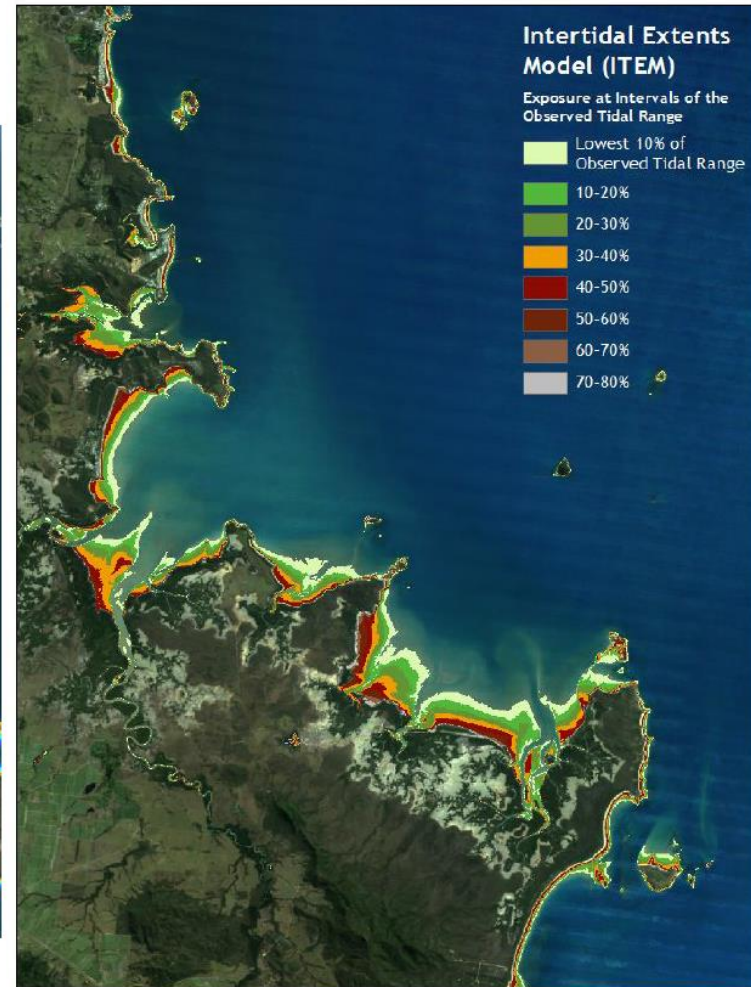
Lowest Observed Tide



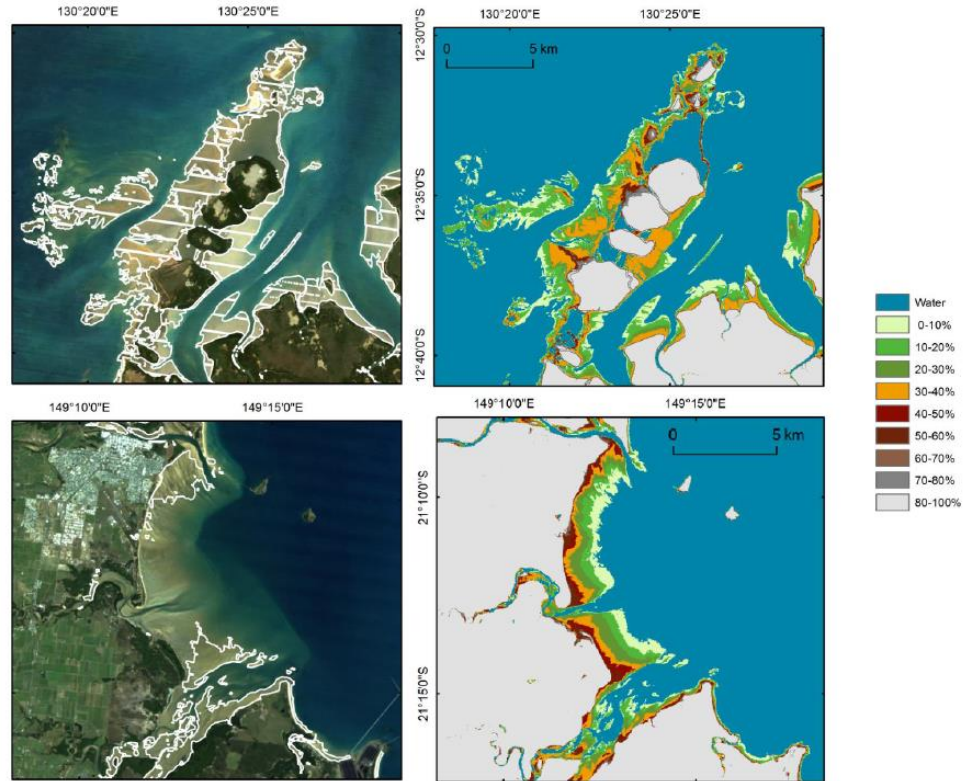
Highest Observed Tide

- The Observed Tidal Range is divided into 10 equal interval buckets to create ensemble stacks of observations for each 10% of the range

# ITEM Model Examples

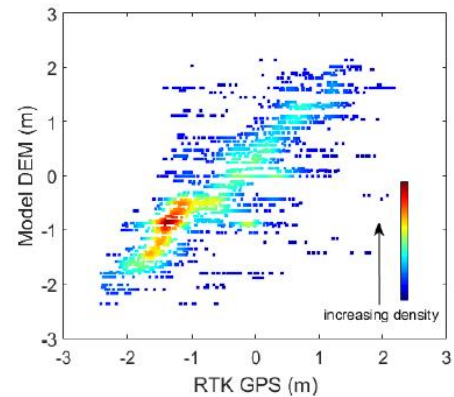
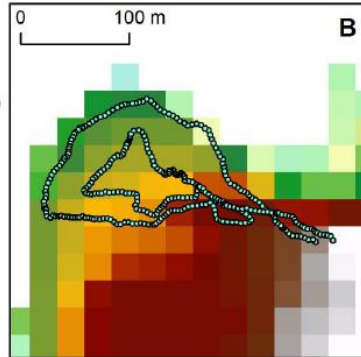
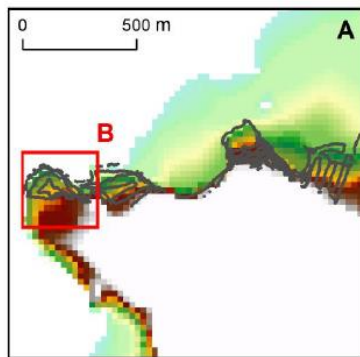


# Benefits over a paired scene approach

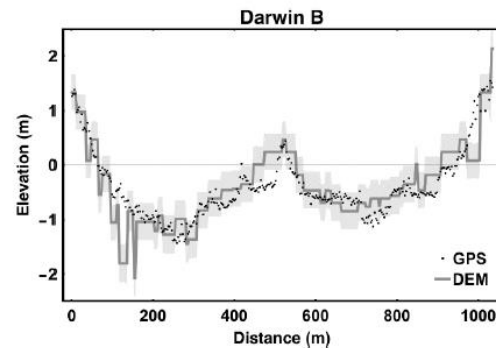




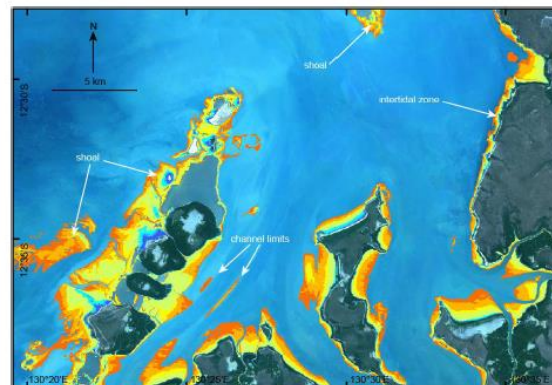
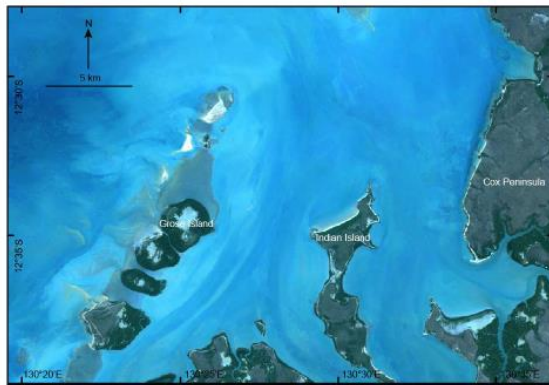
# Model Validation - Darwin Harbour, Northern Territory



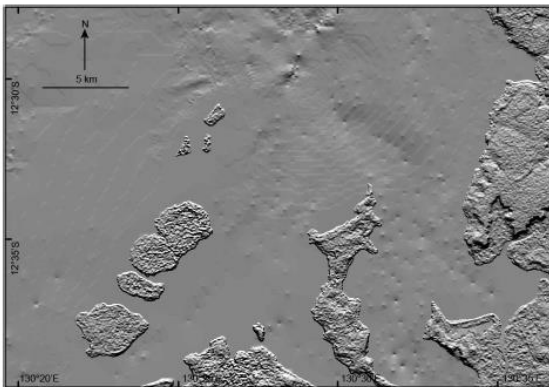
Mean Absolute Height Residual = 0.57m



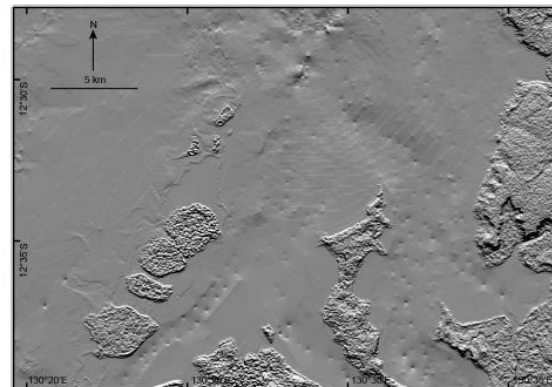
# Integrating the Intertidal DEM in the Northern Australian 100m Bathymetry Grid



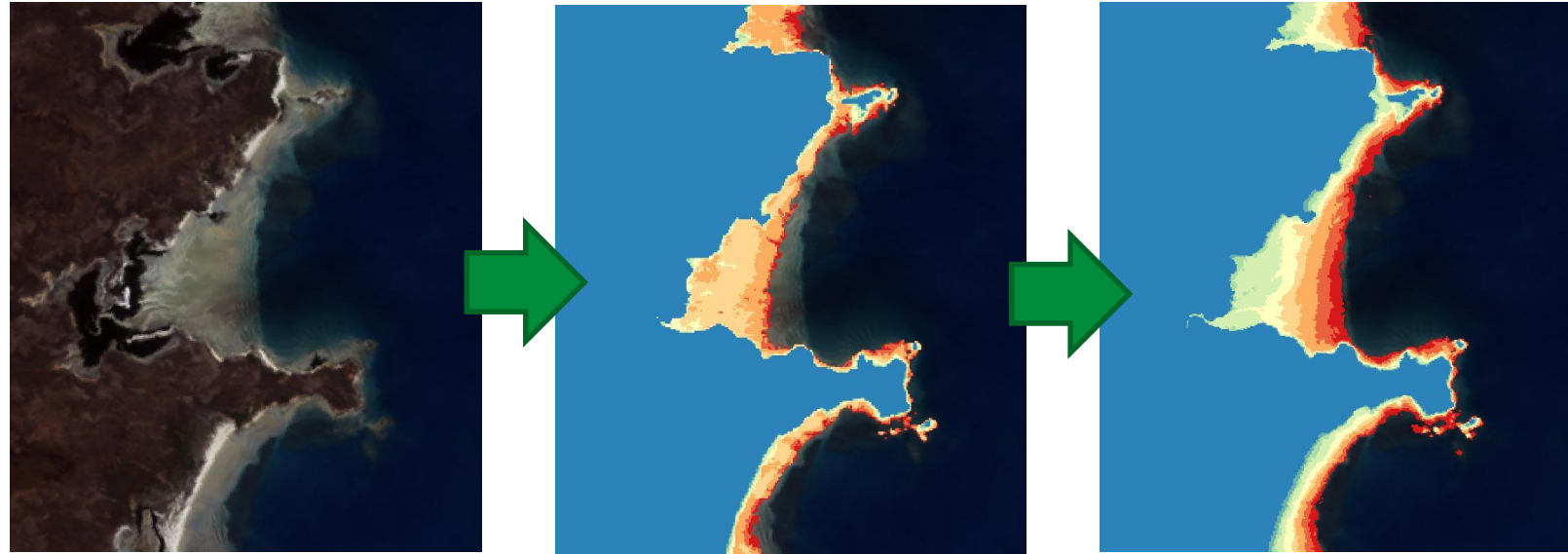
Before



After



# Agility at Work – From .1 to .1.1





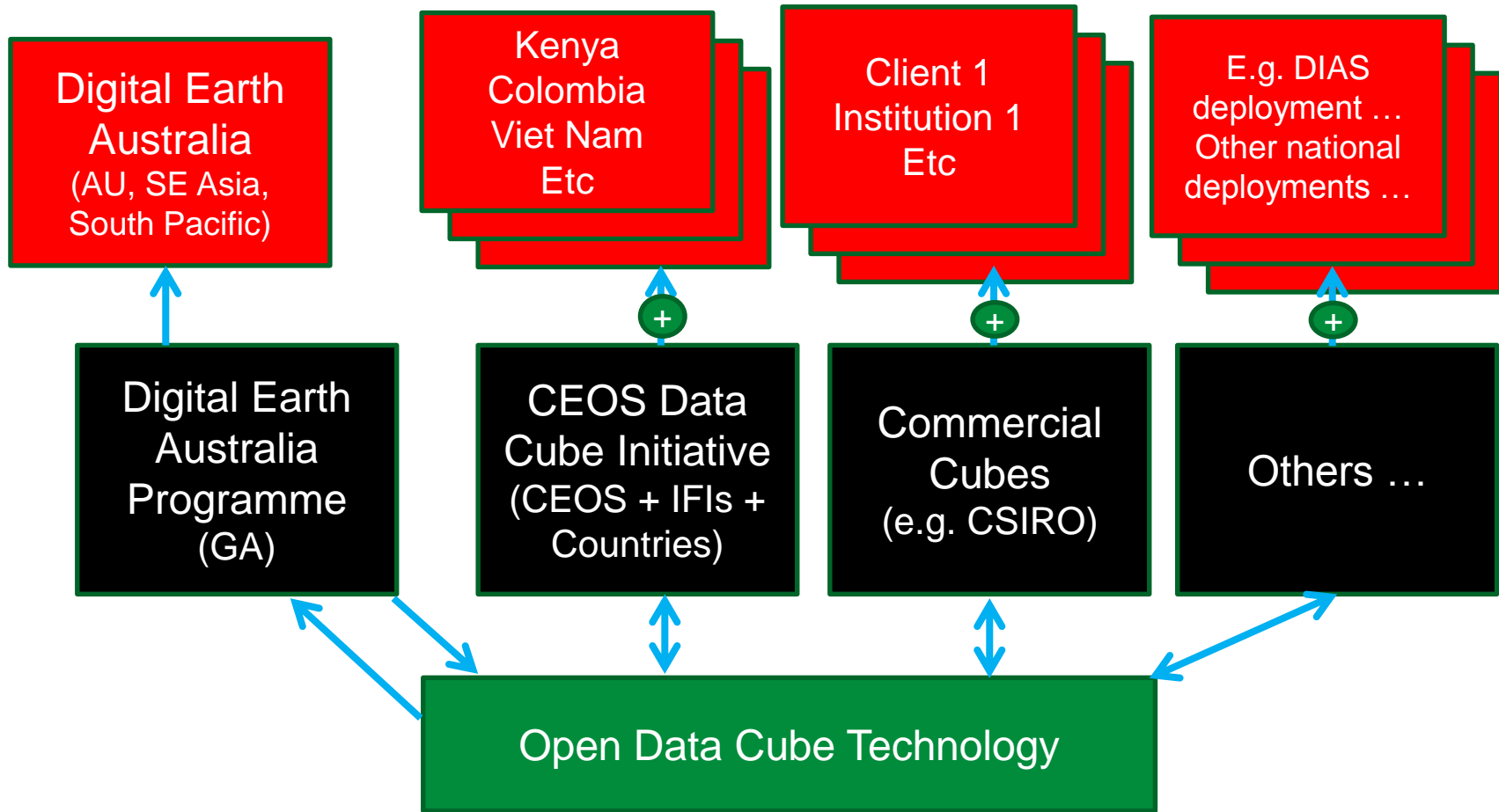


# Sharing is caring



# Open Data Cube – Global Open Source Community

- Engaging others in exploiting, and enhancing, the technology
  - build more applications (e.g. engage GEO Initiatives)
  - incorporate more satellites (e.g. engage space agencies, private sector)
  - More platforms
- Inclusive community governed democratically by the ‘contributors’
- Being clear this is not just ‘our thing’
- ‘Backbone’ community support from GA, CSIRO, USGS, NASA and CEOS





## Key directions

- More **open source** apps 😊
- **Sensor ignorance** - draw on CEOS work
  - Express requirements – let ODC map to data
  - ‘Like’ sensors (OLI/MSI) and cross-scale (OLCI/MSI)
- **Marine/shallow water atcor**
  - We think ARD will be different (water leaving radiance)
- Integrating **new satellite data**
  - Sentinel-3 data (GA partnership w/ EC/ESA/EUMETSAT)
  - Himawari-8 data (BOM partnership with JMA)





# Key directions

- **Engaging the community**
  - Guidelines to enable development of ‘cube ready’ portable algorithms, modules, science code
  - More non-space data (IMOS a very strong foundation)
- **Provide opportunities to “plug in” new missions/datasets**
  - Support CEOS Agency goals
  - Local datasets
  - ‘Exposure” for niche/commercial missions
- **Support industry**
  - Trade storage vs CPU (‘on the fly’ vs cached ARD)
  - Scalable business models



## Key directions

- **Deployability on more platforms**
  - HPC vs Commercial cloud vs local cloud vs PC
- **DGGS integration to support stats community**
- **Packaged ‘turnkey’ versions**
  - Open Source GEOSS-In-A-Box?
  - ‘Cube ready’ open source science code to give countries a head start while empowering them to adapt to local conditions
  - Guides for the community

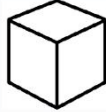
# Open Data Cube – Global Open Source Community

Open Data Cube

GitHub, Inc. [US] | https://github.com/opendatacube

Apps Google Drive Github - AGDC Rajjin ipython notebook QBT JIRA Aurion AGDC Content Manag Interactive Maps - ITE

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 **Open Data Cube**  
✉ opendatacube@googlegroups.com

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Open Data Cube core  
● Jupyter Notebook ★ 37 🍴 18 Updated 15 hours ago

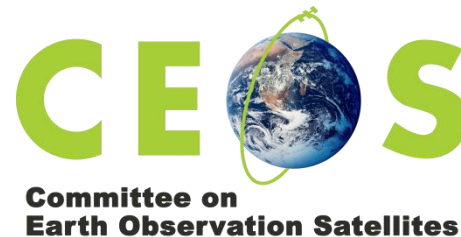
Top languages  
● Ruby ● Jupyter Notebook

People 20 >



[Invite someone](#)

# CEOS Data Cube Initiative



- Lead: NASA CEOS Systems Engineering Office
- Target of 20 countries with operational cubes
- Platform that supports deploying outcomes of GEO initiatives e.g:
  - GEOGLAM, GFOI, GEO-DARMA ...
  - BluePlanet
- More data sets available from CEOS Agencies
- Engagement **in country** (user agencies, support agencies)
- Engagement **of key investors** e.g. development banks, foundations, national aid programmes
- Helping countries to **help each other** (and advocate to each other)
- Foster development of Open Data Cube technology





# Thank You

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<http://www.ga.gov.au/about/projects/geographic/digital-earth-australia>

[www.opendatacube.org](http://www.opendatacube.org)

[www.github.com/opendatacube](http://www.github.com/opendatacube)