



Australian Government  
Geoscience Australia



Digital Earth  
AUSTRALIA



# Datacubes as a tool for Analysis Ready Data Inter-Comparison

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Observations

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## Overview

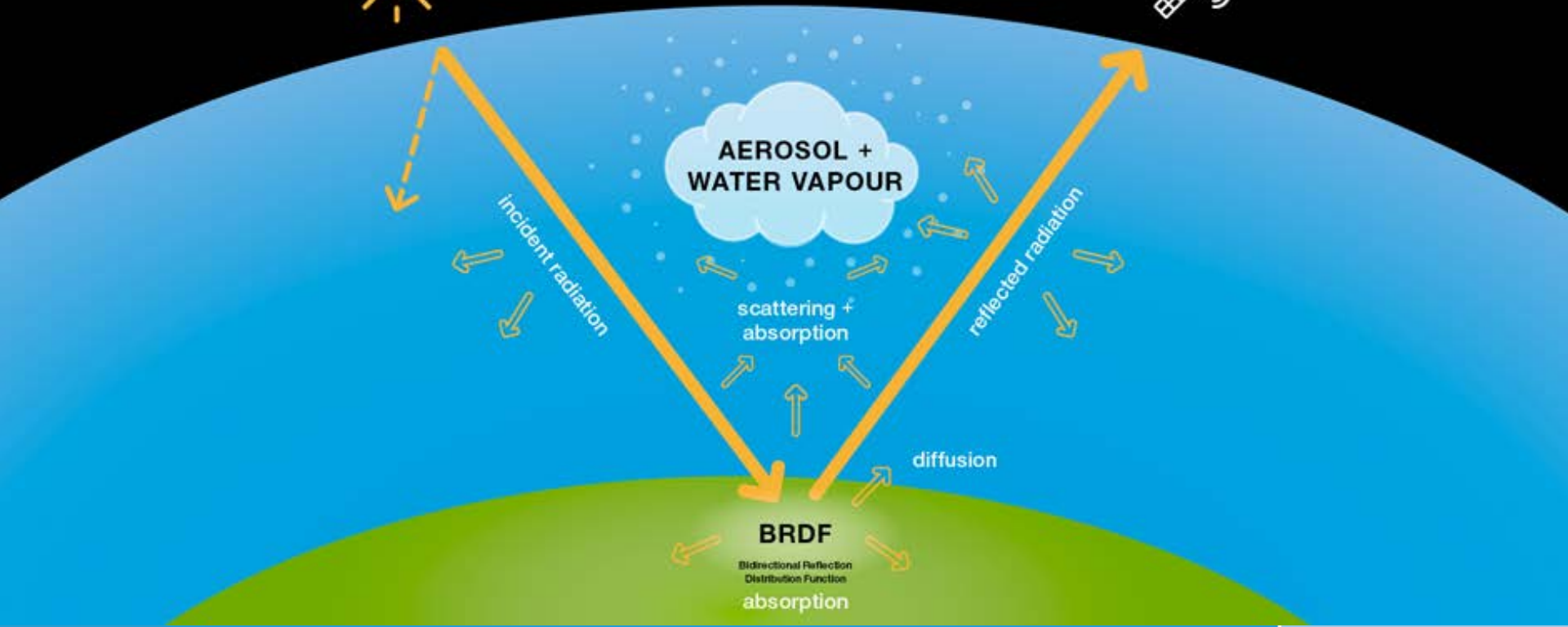
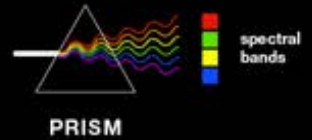
- Context
- Surface reflectance correction
- Understanding the differences
- Impacts on information products using:
  - self-normalising ratios of reflectance
  - reflectance thresholds
- Experimental design and broader objectives
- Examples using Landsat and OpenDataCube
- Future work



## Context

- Analysis Ready Data increasingly adopted
- A range of surface reflectance corrections are possible
- ARD from data providers could replace in-house capabilities
- How should agencies with in-house capability form an evidence-based decision on this?
- Datacubes have allowed users to focus on analysis without being concerned with data correction
- Datacubes can also inform users about the data they contain.

# ARD Multi-Sensor interoperability parameters

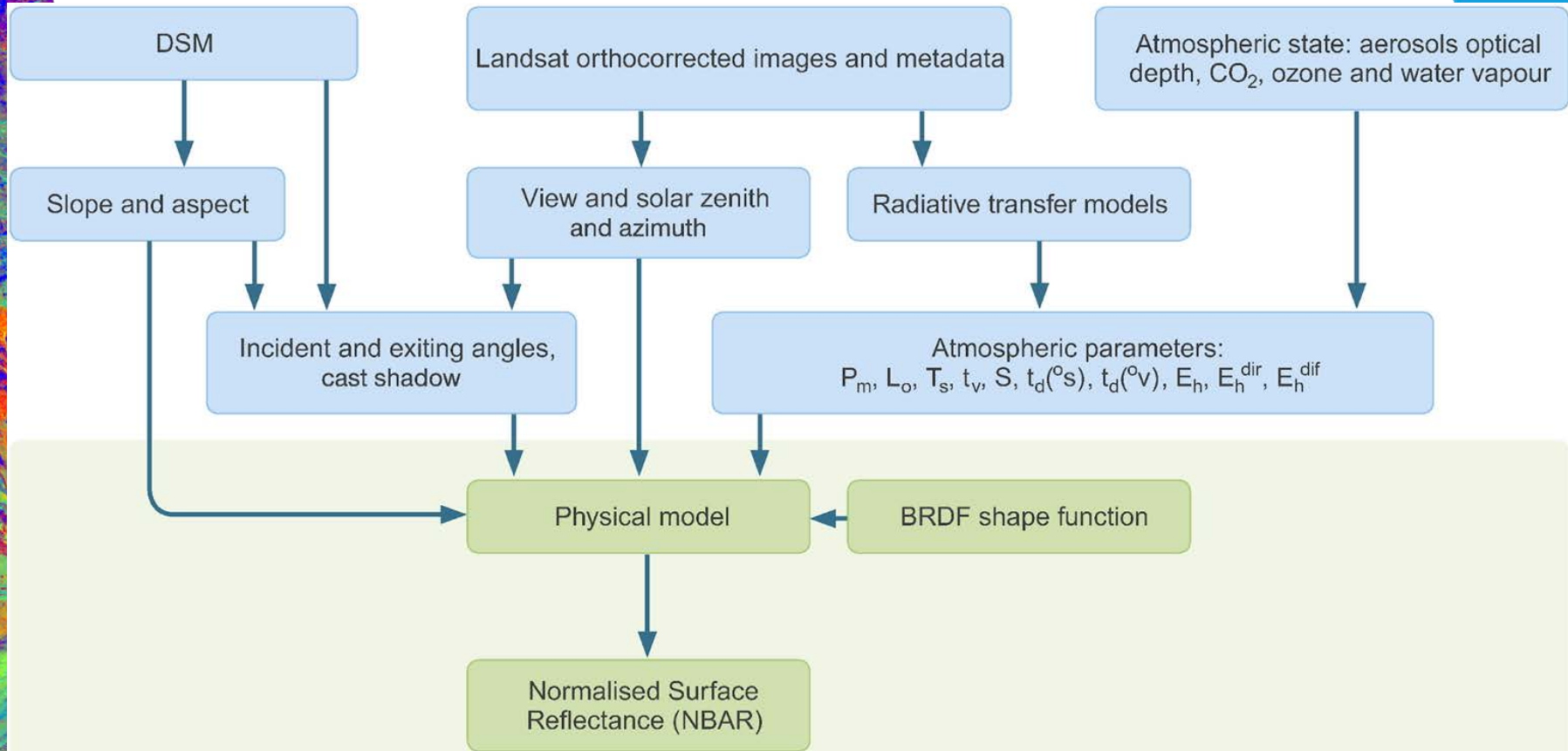




## Analysis Ready Data

The core elements in ARD preparation may include:

- Geometric correction for co-registration
- Quality masks, e.g., null data, bad data and cloud
- Atmospheric correction
- *Bidirectional Reflectance Distribution Function (BRDF) correction*
- *Terrain illumination correction in areas sensed on mountainous areas*
- *Sun and sky glint correction in areas sensed on open water surfaces*





# Surface Reflectance products for Landsat

USGS Surface Reflectance:

1. Landsat 4 to 7 - Landsat Ecosystem Disturbance Adaptive Processing System (LEDAPS)
2. Landsat 8 - Landsat Surface Reflectance Code (LaSRC)

Geoscience Australia “wagl” system Landsat 5/7/8:

1. Lambertian
2. Nadir Bidirectional Reflectance Distribution Function (BRDF) Adjusted Reflectance (NBAR)
3. Nadir BRDF Adjusted Reflectance with Terrain Illumination Correction (NBART)

# Landsat Surface Reflectance Correction

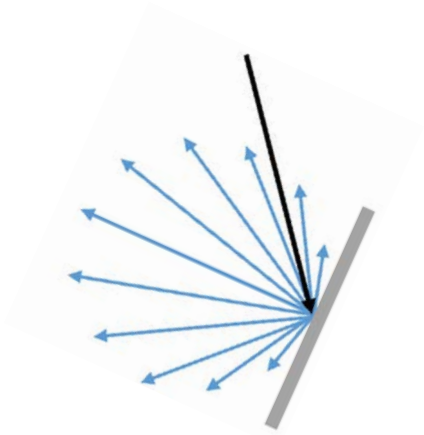
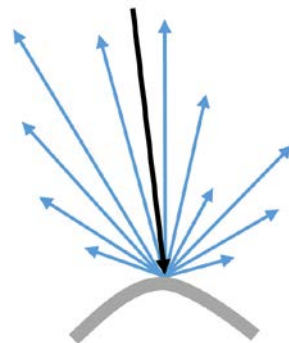
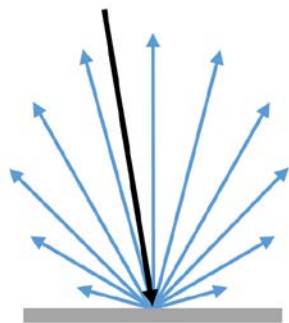
<i>Correction</i>	<b>USGS L2</b>	<b>GA Lambertian</b>	<b>GA NBAR</b>	<b>GA NBART</b>
<b>BRDF:</b> - <b>solar angle</b>	X	X	✓	✓
<b>BRDF:</b> - <b>view angle</b>	X	X	✓	✓
<b>Atmospheric:</b> - <b>solar angle</b> - <b>view angle</b>	✓ ✓	✓ ✓	✓ ✓	✓ ✓
<b>Terrain illumination</b>	X	X	X	✓
<b>Adjacency</b>	X	X	X	X



Lambertian

BRDF

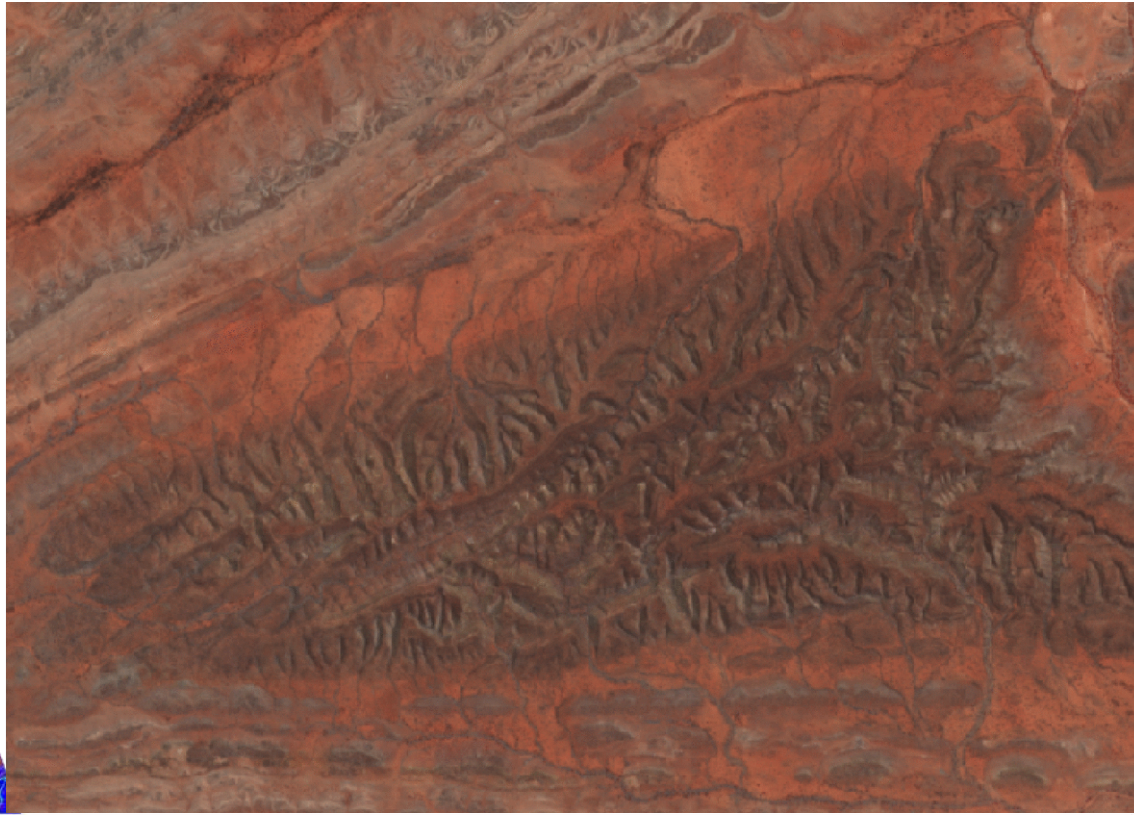
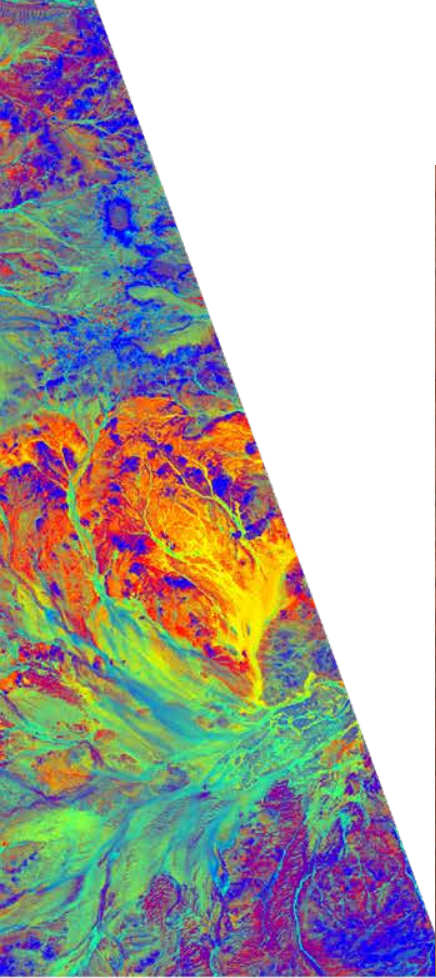
Terrain



Model complexity + compute intensity



# Terrain illumination correction



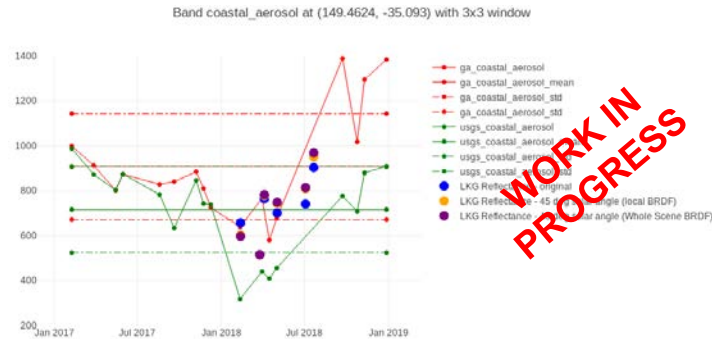
# Open Data Cube

- Underpins numerous national and continental-scale initiatives including Digital Earth Australia
- Reduces barriers to non-expert user analysis
- Provides a means for efficiently analysing time-series at scale
- Also can be used to compare collections of similar products

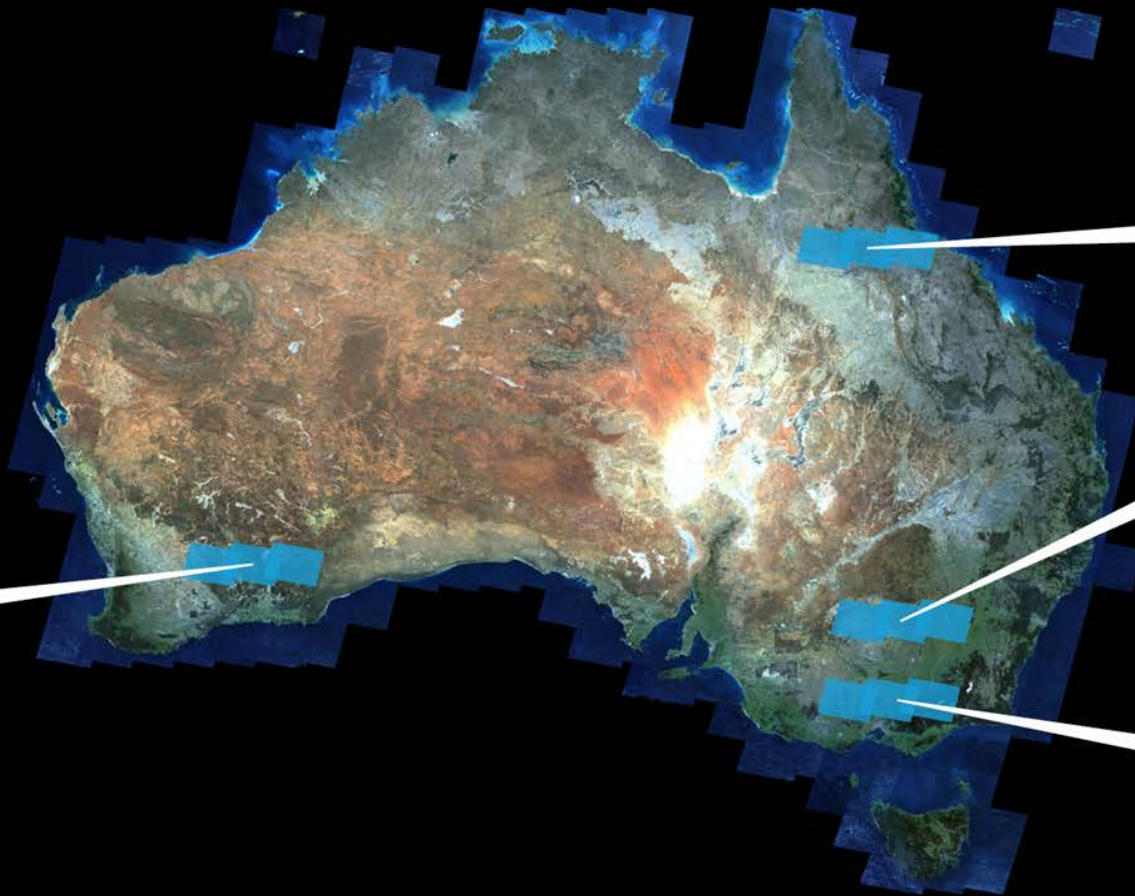


# Experimental design

1. Assess ARD correction parameter **sensitivity**
2. Assess **temporal stability** - comparison of measurements from corrections through time (GA Lambertian/NBAR/NBART vs LEDAPS/LaSRC)
3. Field **validation** - comparison with in-situ measurements (historical and current)



Landsat Path/row	Number of scenes	Sensor and acquisition date
091/084	927	Landsat 5/7/8; 1986 ~ 2017
092/084	896	
093/084	887	
091/086	879	
092/086	892	
093/086	812	
094/074	894	
095/074	897	
096/074	895	
108/082	855	
109/082	858	
110/082	857	



Supplemental Area



Medium vegetation cover



High BRDF targets



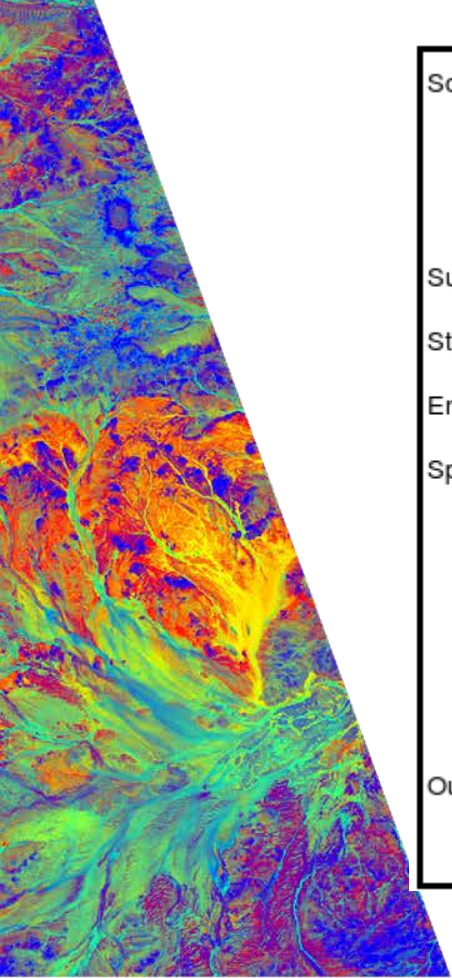
Low vegetation cover areas (low BRDF)

LAKE LEFROY

## Method

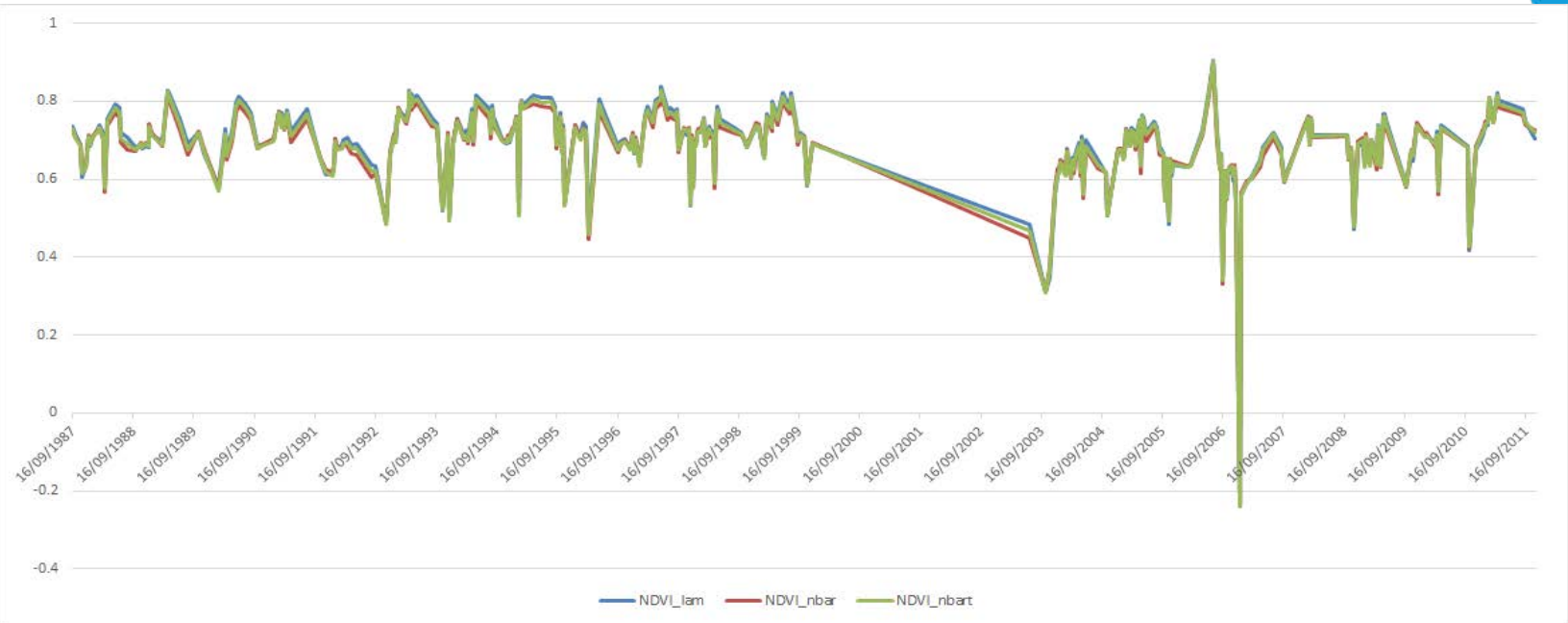
- Level 1 collection 1 data retrieved from USGS
- USGS Level 2 Surface Reflectance products acquired on-demand through ESPA
- Geoscience Australia modified production code to match the USGS Level 2 product (assumes lambertian / ideal diffuse target)
- Level 2 data indexed to ODC instance
- Python tool developed to enable 1:1 comparison
- Use inter-comparison tool to interrogate datasets





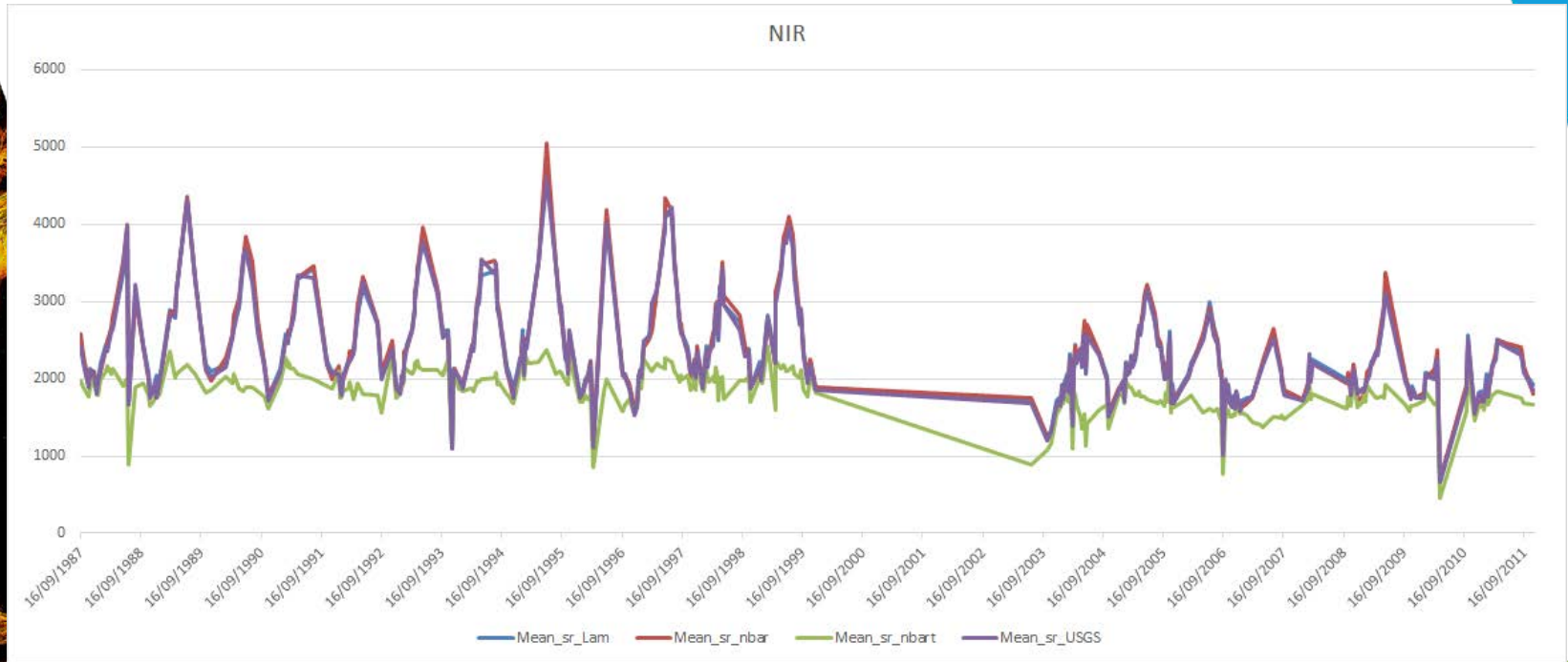
Source products	<input type="text" value="ls5_ard"/> <input type="text" value="ls7_ard"/> <input type="text" value="ls8_ard"/> <input type="text"/>
Sub product to compare	<input type="text" value="lambertian"/> ▼
Start Date	<input type="text" value="2018-04-01"/>
End Date	<input type="text" value="2018-12-31"/>
Spatial location	<input checked="" type="radio"/> Single lon/lat <input type="radio"/> Multiple lon/lat <input type="radio"/> Single polygon <input type="radio"/> Multiple polygo
	Longitude <input type="text" value="142.9384"/> ▲▼
	Latitude <input type="text" value="-22.5275"/> ▲▼
	Window Size <input type="text" value="3"/> ▼
Ouptut folder	<input type="text" value="/g/data/v10/tmp/intercomparison"/>
<input type="button" value="Extract Products"/>	

# Normalising ratios - NDVI

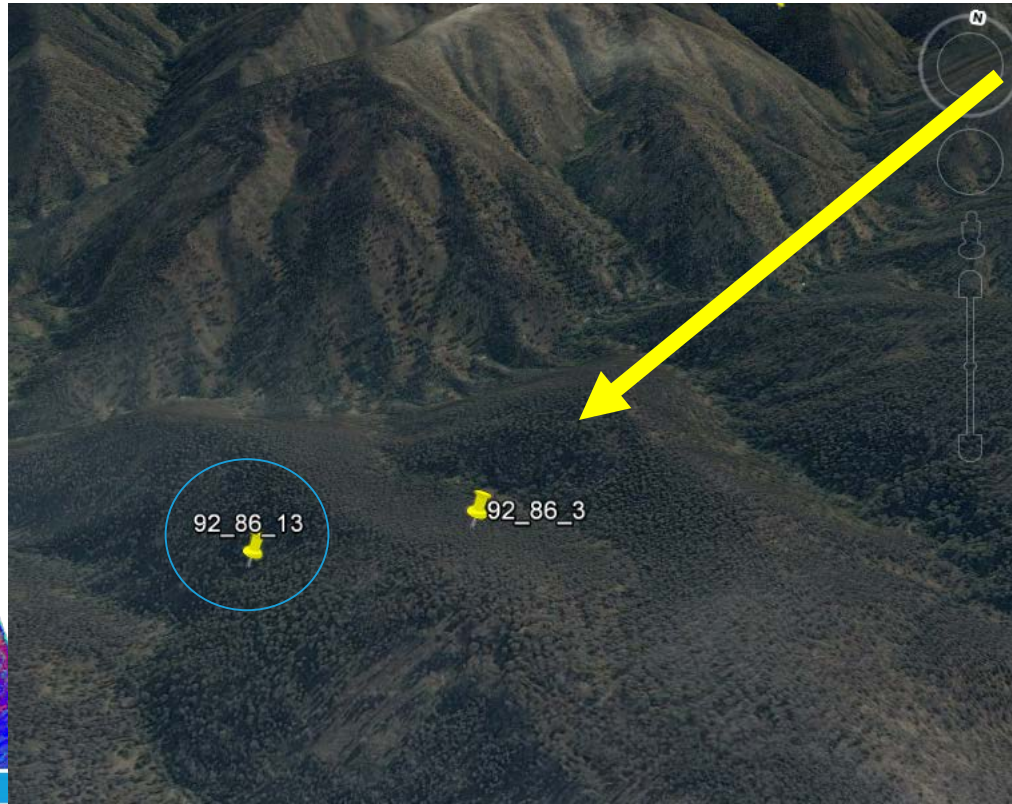
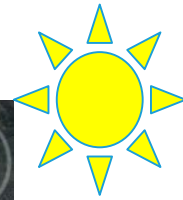




# Thresholds on spectra

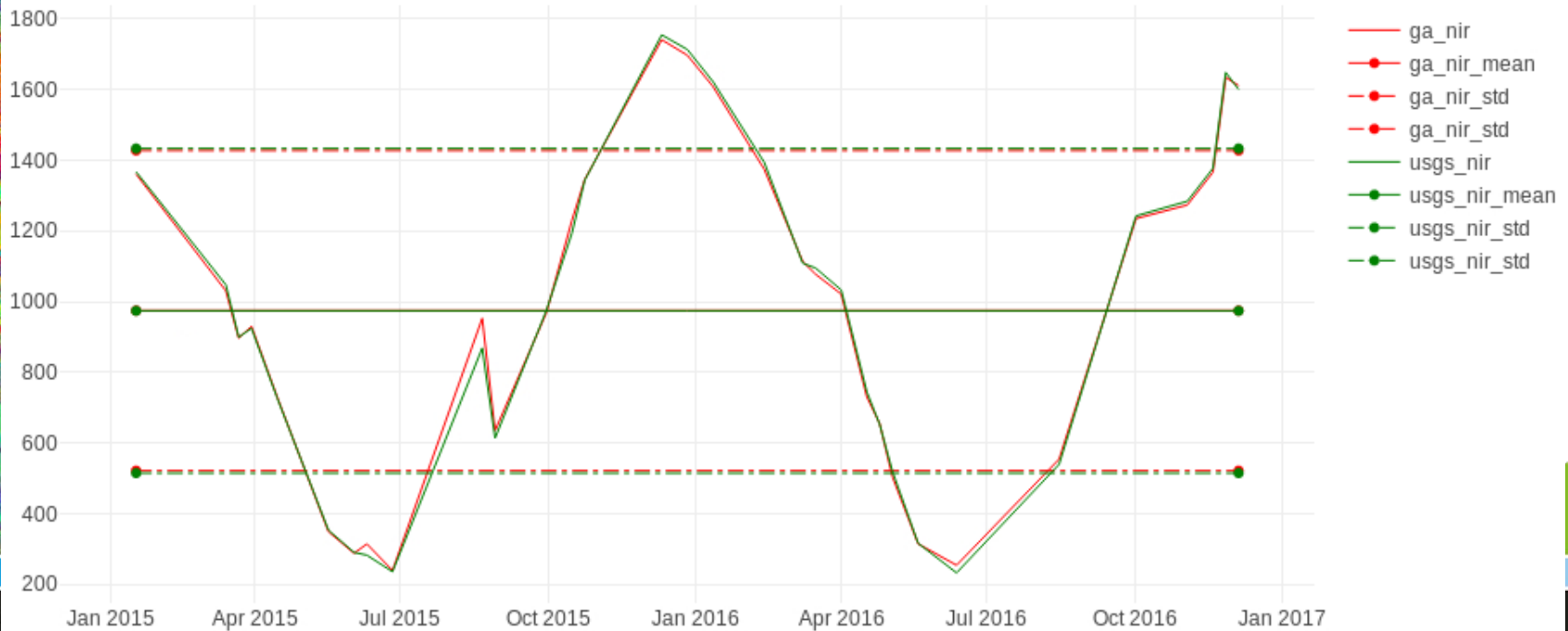


# NE and SW Facing hill slope



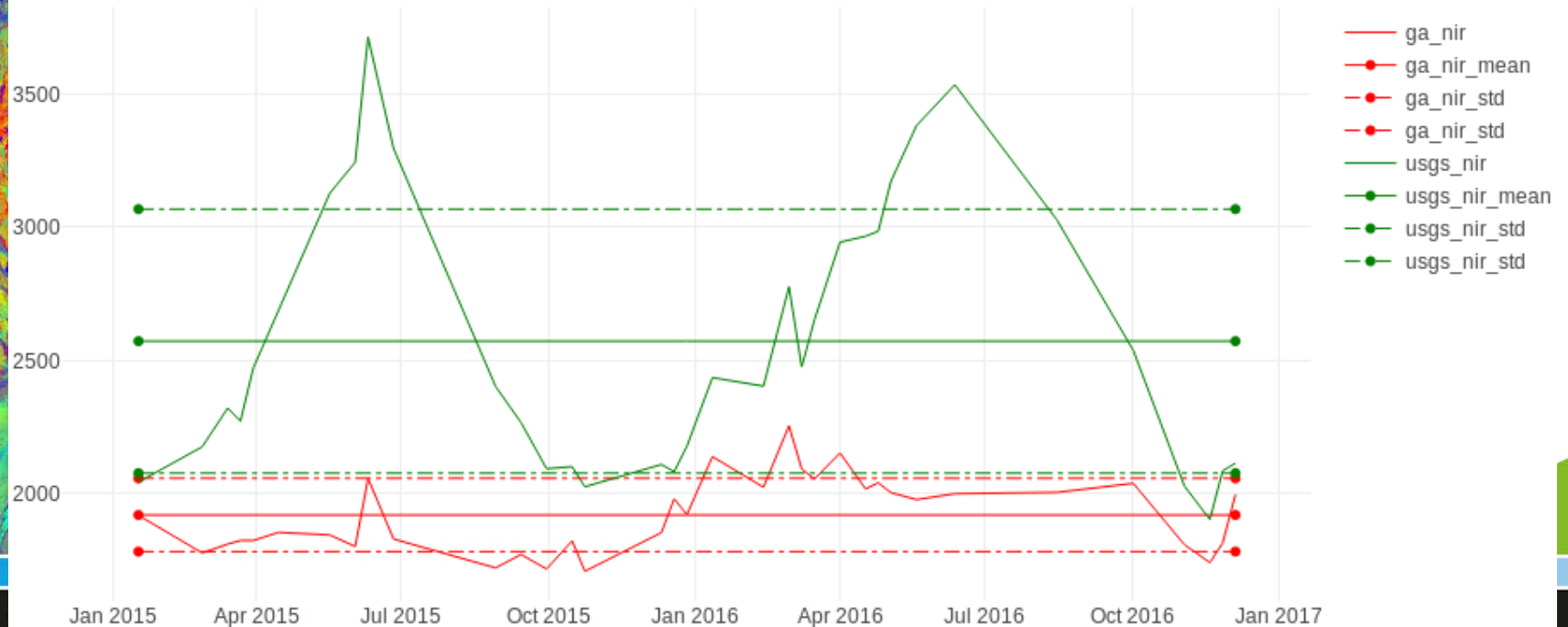
# SW Facing hill slope USGS and GA Lambertian

Band nir at (147.044075, -37.08125278) with 3x3 window



# NE Facing hill slope – NIR band USGS Lambertian - GA NBART

Band nir at (147.0484056, -37.08065556) with 3x3 window





## Upcoming features

- Generic sensor support - Landsat, Sentinel-2 or any OpenDataCube product
- Interactive map for query selection
- Optional matching of time-series pairs
- Update tool release - May 2019
- Results of sensitivity and inter-comparison study to be presented at Living Planet Symposium.



# Acknowledgements

The authors wish to acknowledge the contribution of Landsat data by USGS EROS to this study

# Thanks!

A satellite view of Earth showing Australia and the surrounding oceans. The image is a composite of satellite data, showing the continent of Australia in the center, surrounded by the Indian Ocean to the west and the Pacific Ocean to the east. The landmass is shown in shades of brown and green, while the oceans are in various shades of blue. The image is set against a black background, suggesting space. The bottom of the image features a blue and green gradient bar.

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