

# NORTH WEST SHOALS TO SHORE RESEARCH PROGRAM

Coral reef communities at the Rowley  
Shoals: enhanced and scalable monitoring



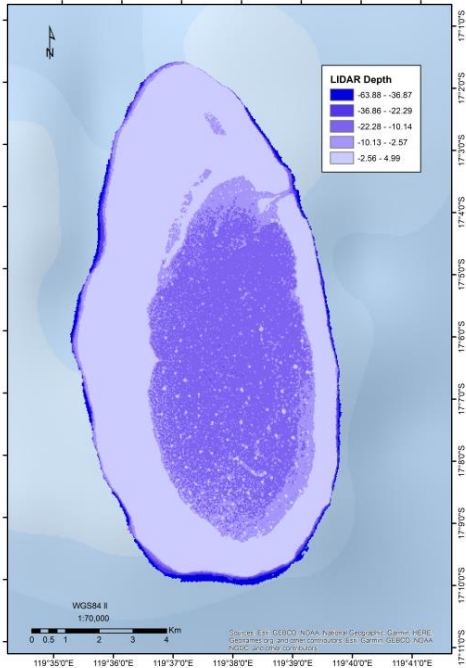
Ben Radford, James Gilmour,  
Sharyn Hickey, Matt Wyatt,

## Motivations

- Understanding condition of reef systems is key to effective management
- Vast marine and coastal areas with many remote reefs to map and monitor and assess for impacts.
- With a few exceptions many reef areas are not regularly monitored and their condition and response to impacts is unknown.
- Capitalize and look for applications for new remote cheaper sensing data, cheaper data, analysis methods that scale and online process capacity
- Look for ecological robust, scalable applications that increase our knowledge of changing



With reefs systems a number of habitats we don't monitor (deep, shallow, exposed)



Clerk



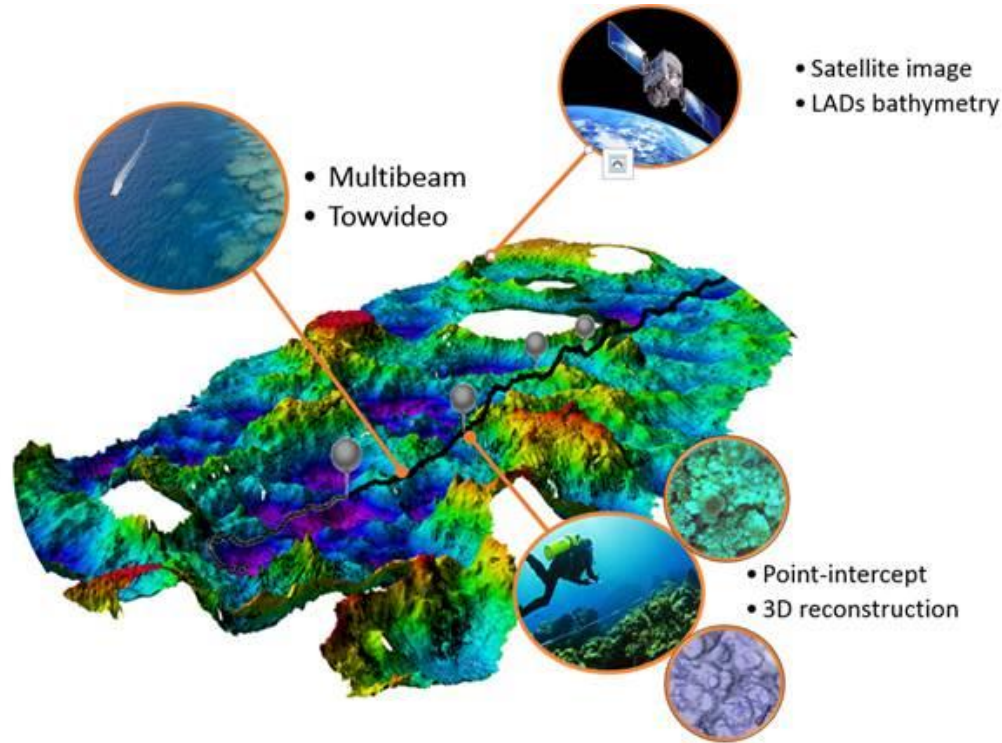


# Does the scale of monitoring fit with ecological patterns and impacts?

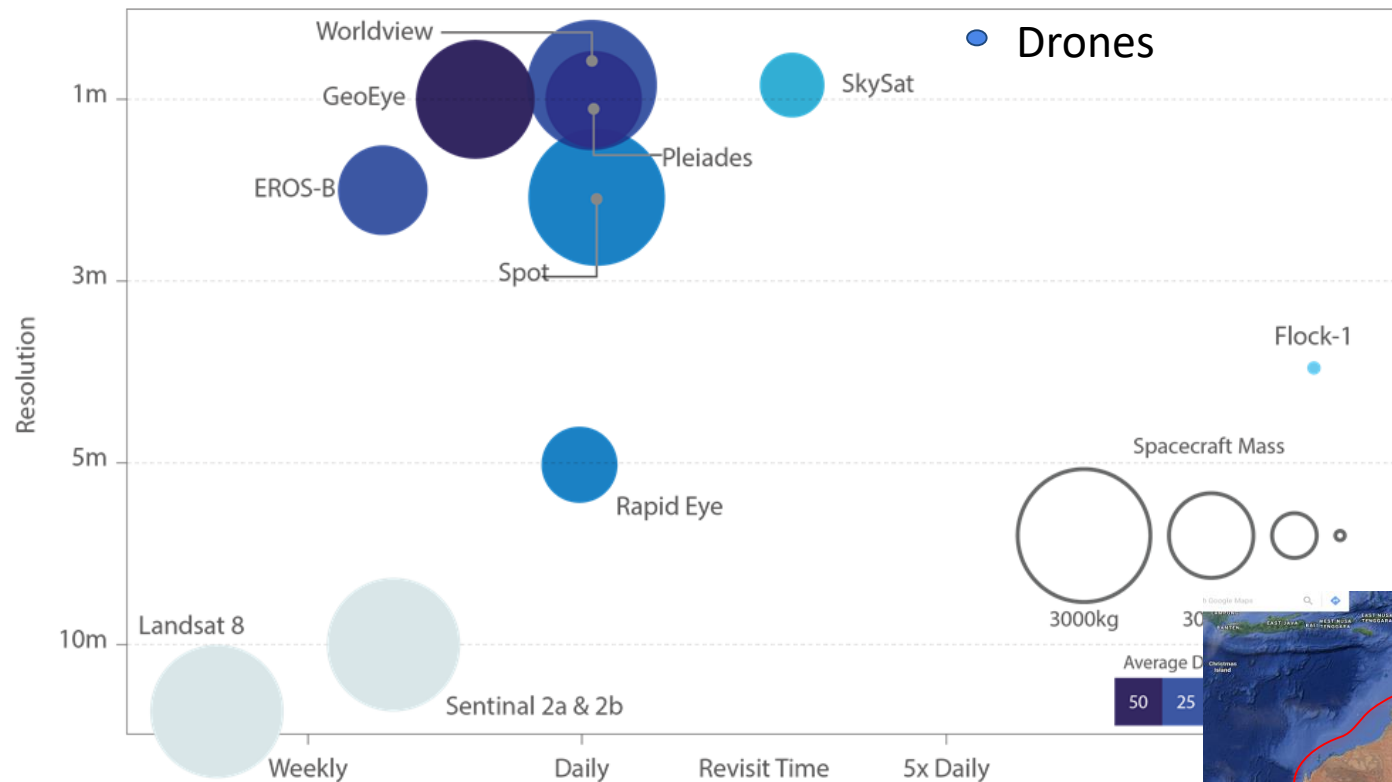


# Capitalize on new remote sensing data and methods

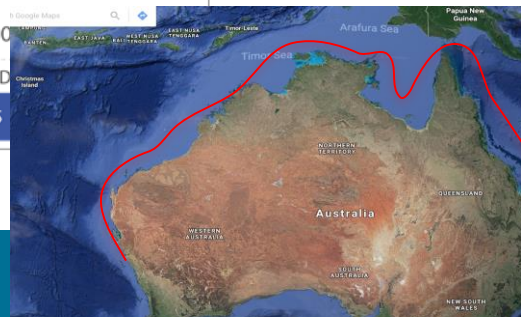
- cheaper data , analysis methods that's scale and online process capacity



# Capitalise on new data



<https://business.esa.int/newcomers-earth-observation-guide>  
AIMS: Australia's tropical marine research agency.



# Cloud processing



## Google Earth Engine Cloud Computing

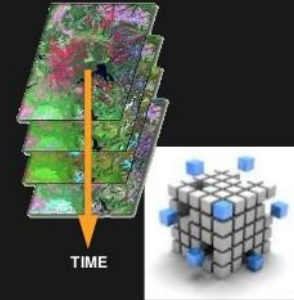
- Google has the entire archive of Landsat and MODIS imagery and CFSR, NLDAS, and downscaled NLDAS gridded weather data available for massive parallel processing in the cloud
- This technology has changed the paradigm of how we process and analyze satellite imagery and gridded weather data
- [https://earthengine.google.org/#timelapse/v=40.86687,-117.50682,8.988,lat\\_lng&t=2.85](https://earthengine.google.org/#timelapse/v=40.86687,-117.50682,8.988,lat_lng&t=2.85)



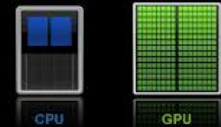
## What are (EO) Data Cubes?

- Data Cube** = Spatially aligned pixels ready for analysis
- Proven concept** by Geoscience Australia (GA), the Australian Science Agency (CSIRO) and a super-computer facility (NCI)
- Shift in Paradigm** ... Pixels vs Files
- Analysis Ready Data (ARD)** ... Reduce processing burden on users
- Supports **integration** of multiple datasets.
- Multi-platform** ... PC, HPC, Cloud

Open Source Software  
<https://github.com/opendatacube>



The Difference between a CPU and GPU





# Objectives

- Map habitats identify where we do and don't monitor
- Develop methods to monitor gaps.
- Building on LTM by incorporating new multiscale and saleable remote sensing data and methods
- Calibrate methods against natural turnover and disturbances
- Work towards adaptive monitoring and disturbances triggering monitoring ondemand

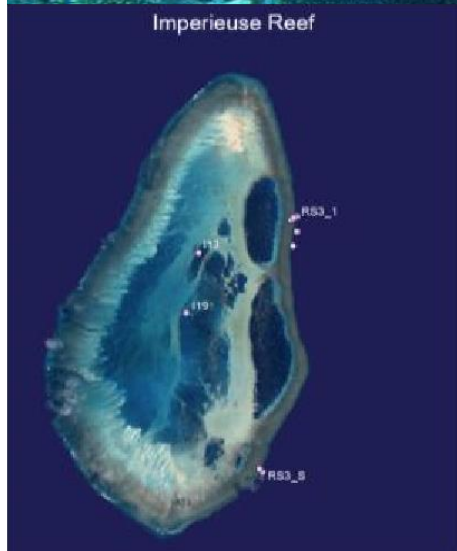


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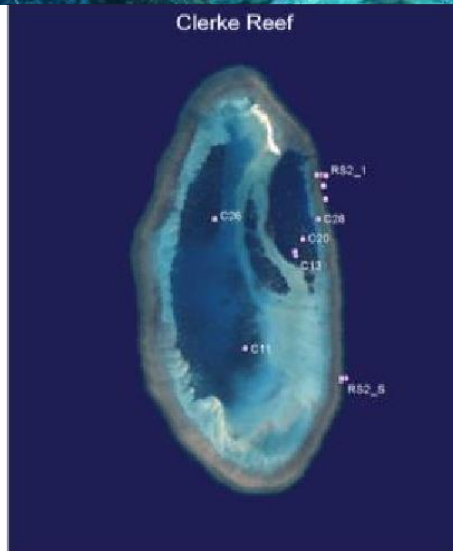
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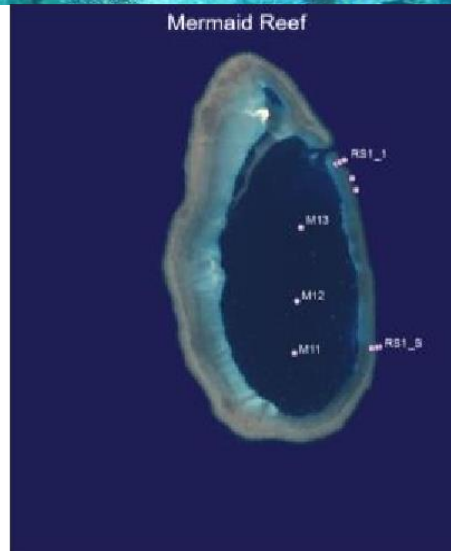
Imperieuse Reef



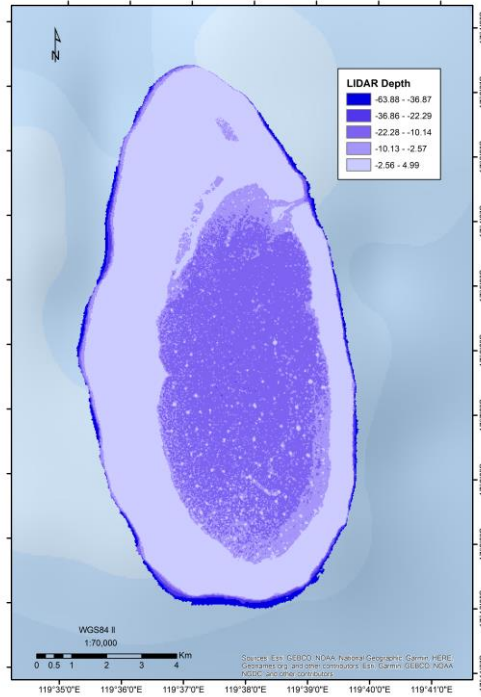
Clerke Reef



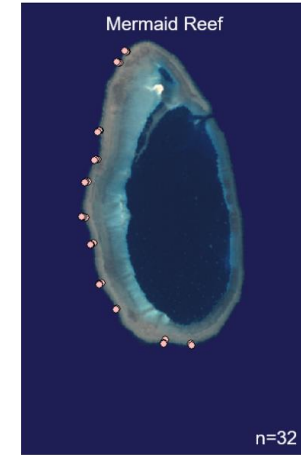
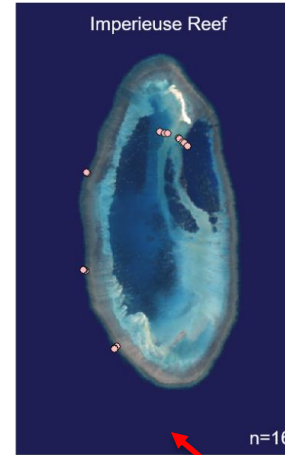
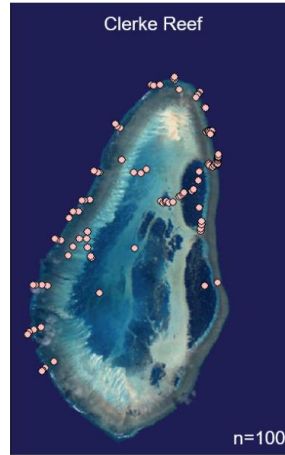
Mermaid Reef



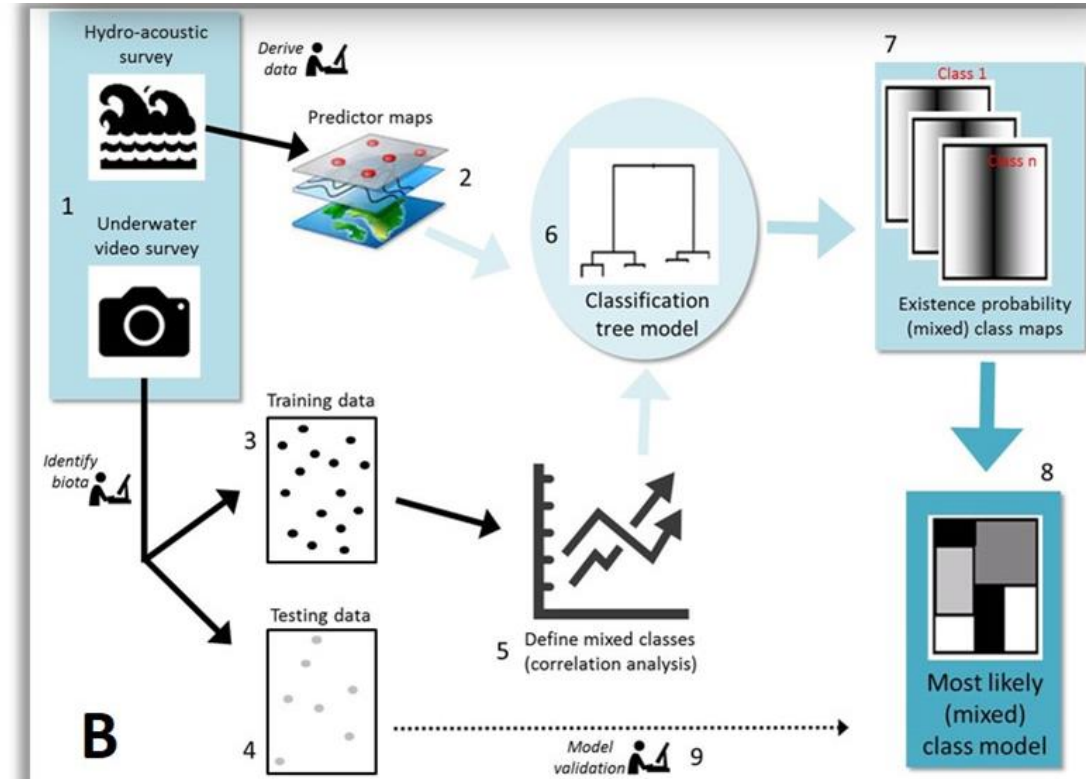
# Lidar



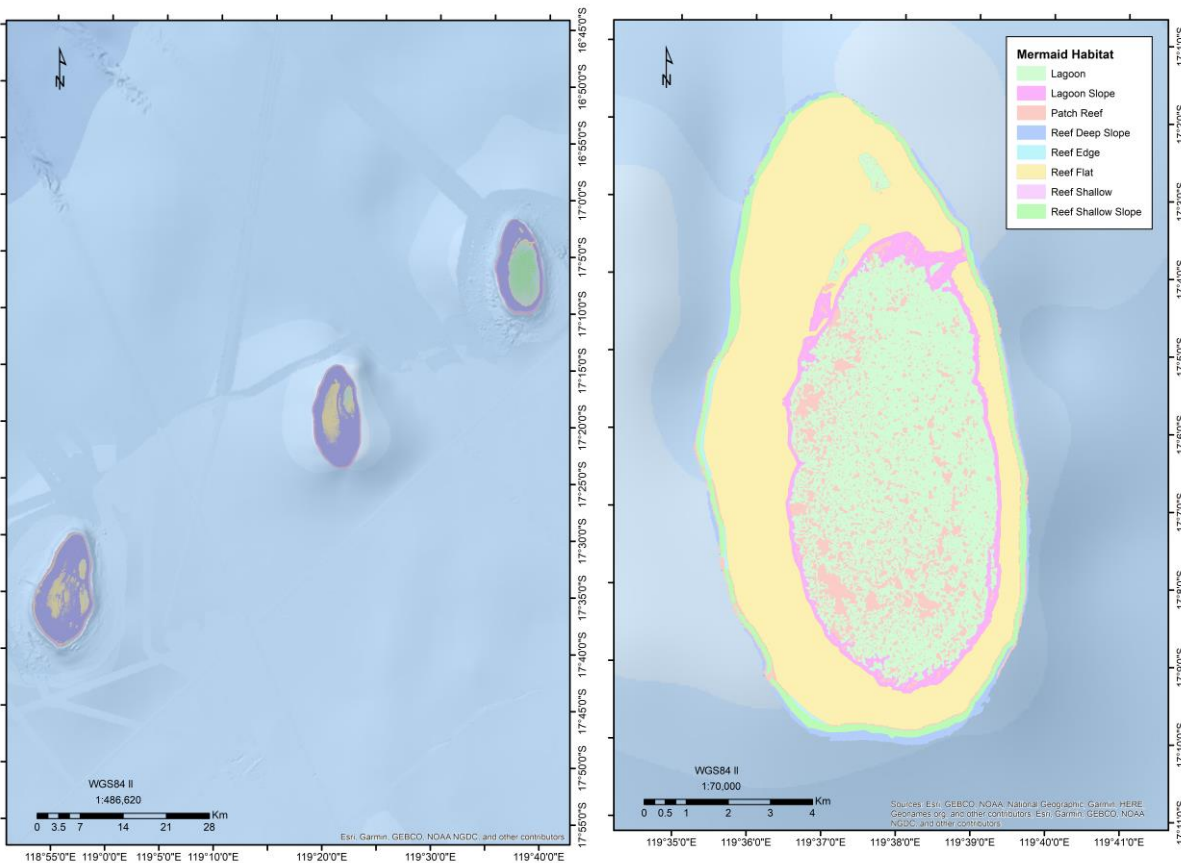
## Trip 6854 March 2018 Rowley Shoals Habitat Assessment Points



# Methods







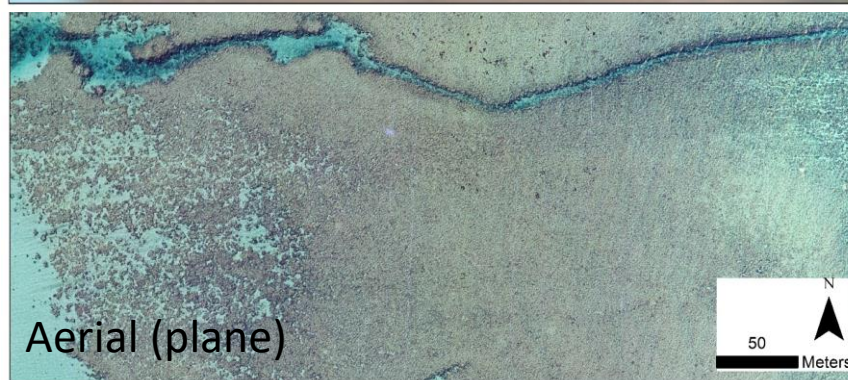
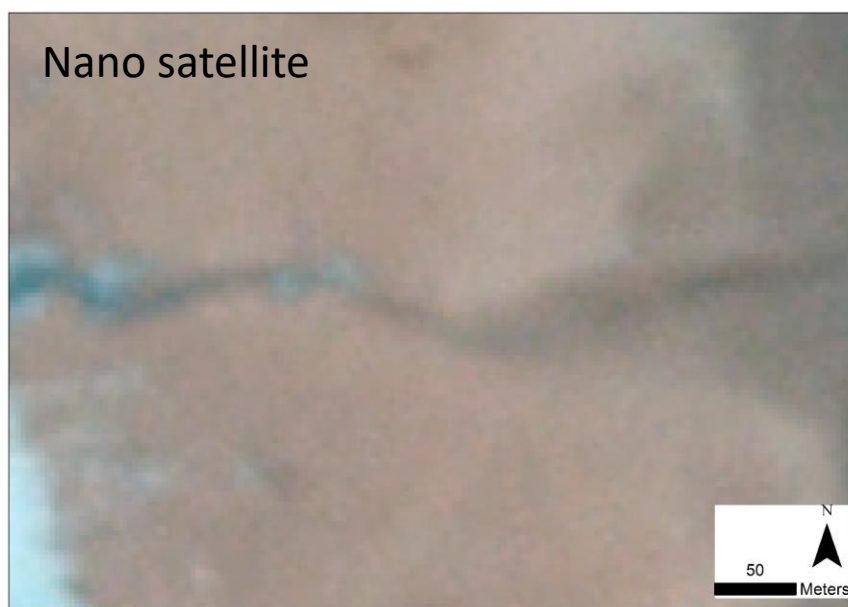
## Outcomes

- Of 8 habitats mapped were only monitoring in 3
- Largest area is reef flat with no monitoring
- Potentially important habitat (diverse, temperature resistant) but difficult to access
- Assess new remote sensing data, cheaper data, analysis methods to solve this problem

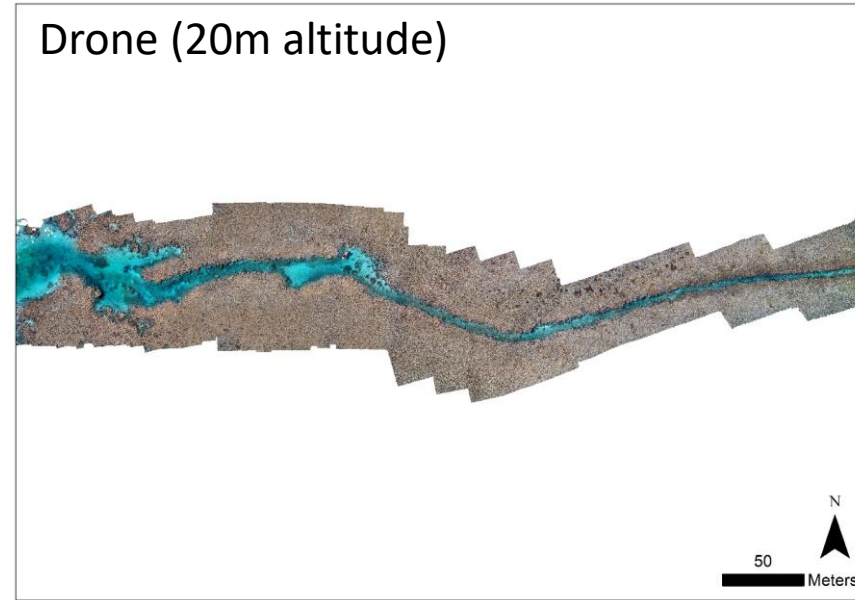
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Nano satellite

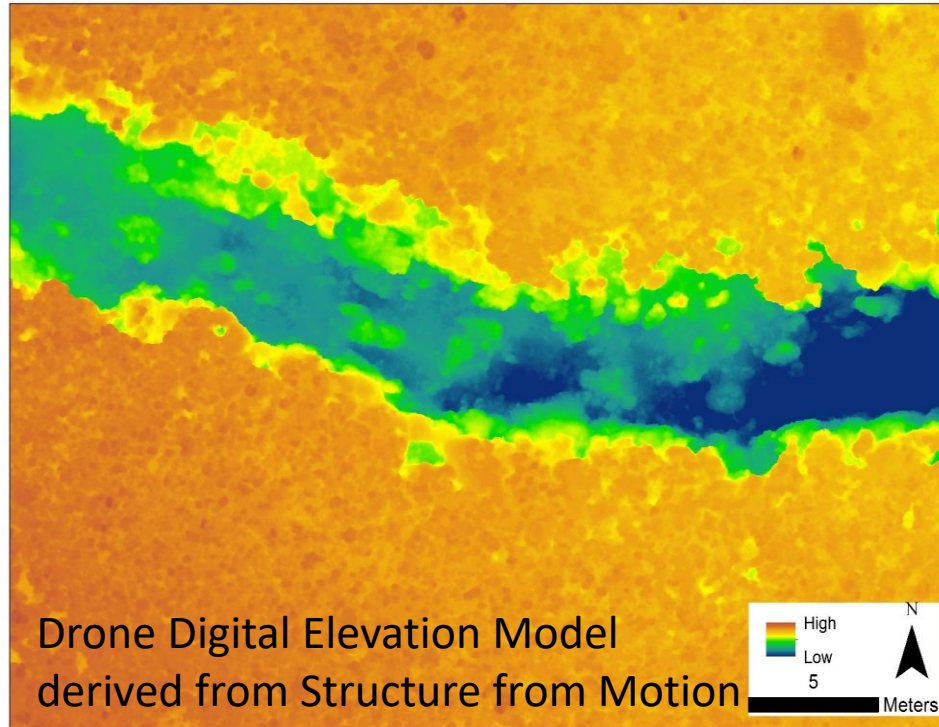
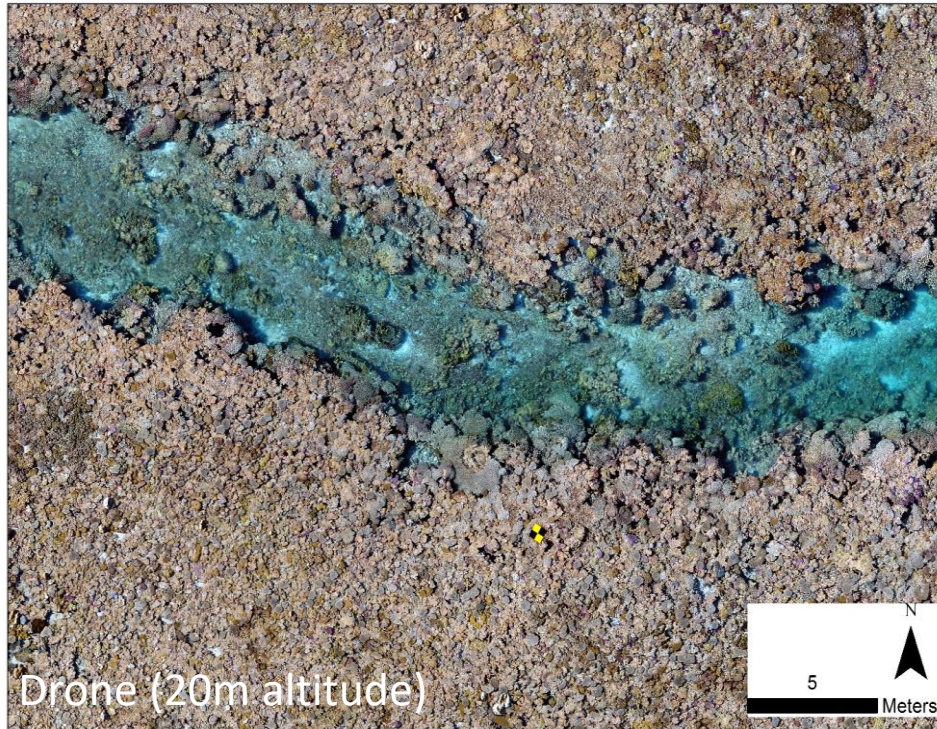


Drone (20m altitude)



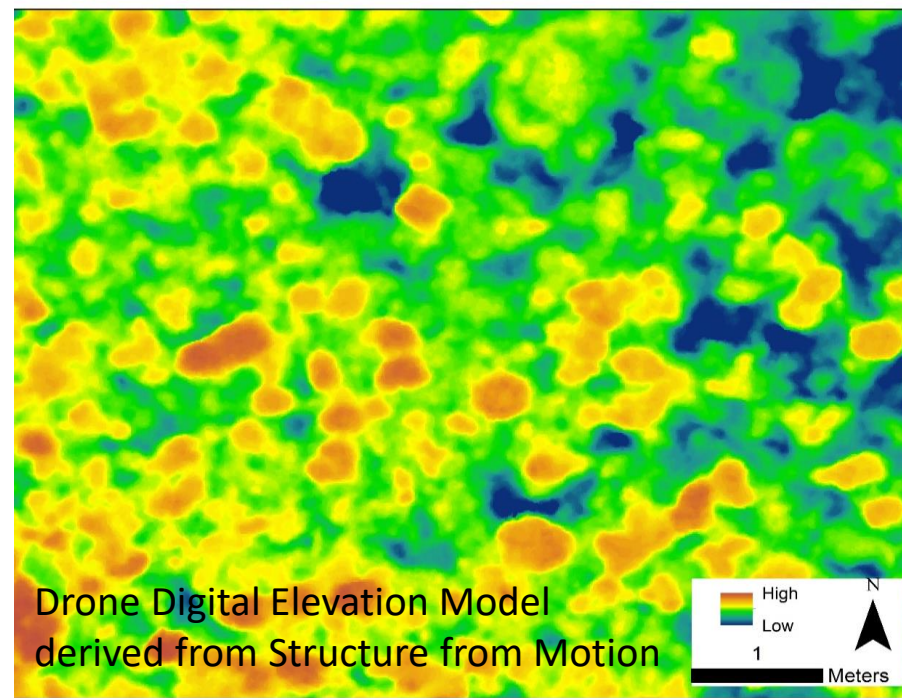
Drones can increase resolution across  
small – to – medium areas





- Structure of reef flat can be determined from when imagery clear
- i.e., water level and movement low





- Structure of reef flat can be determined from the imagery

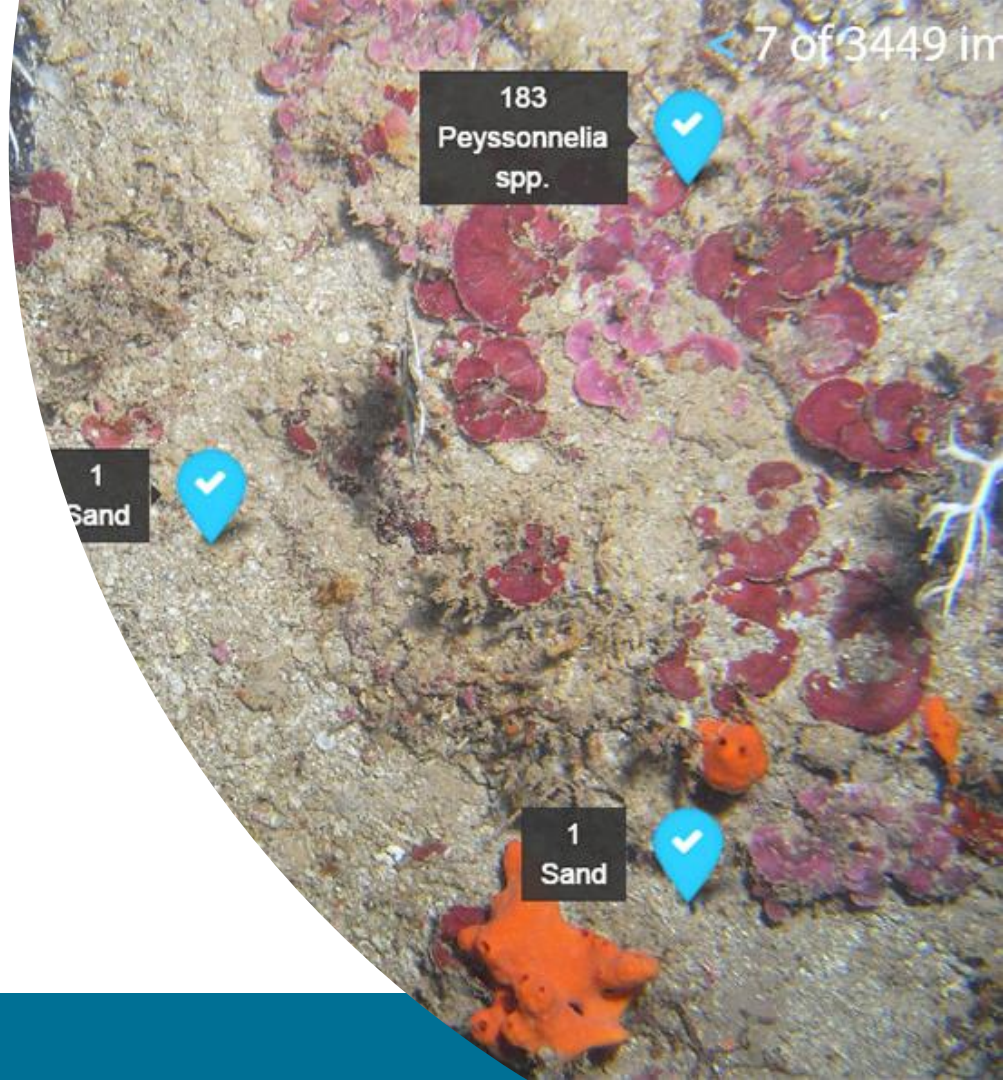
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## Building on LTM by incorporating new multiscale and saleable remote sensing data and methods; benthic image example

- As an institution collect ~100,000 still images a year as well as benthic video, and BRUVS fish videos.
- Historically analysed manually- very resource intensive, a bottle neck to rapid monitoring & reporting.
- At capacity and not scalable, laborious work prone to human error.



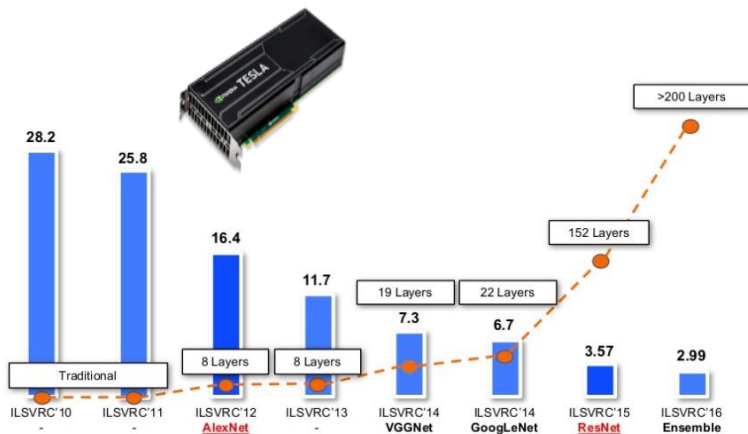
## 'AI IS THE NEW ELECTRICITY'



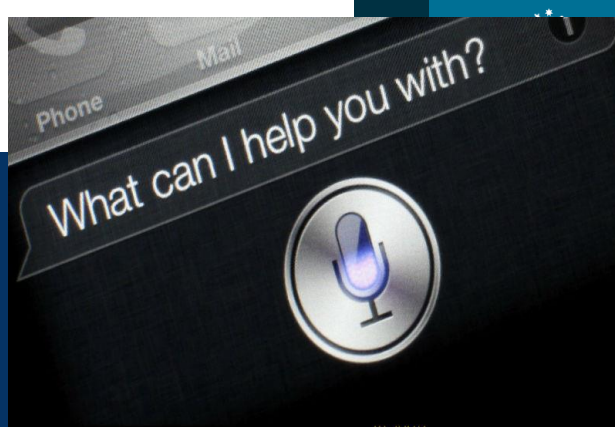
"Just as electricity transformed almost everything 100 years ago, today I actually have a hard time thinking of an industry that I don't think AI will transform in the next several years."

**Andrew Ng**

Former chief scientist at Baidu, Co-founder at Coursera



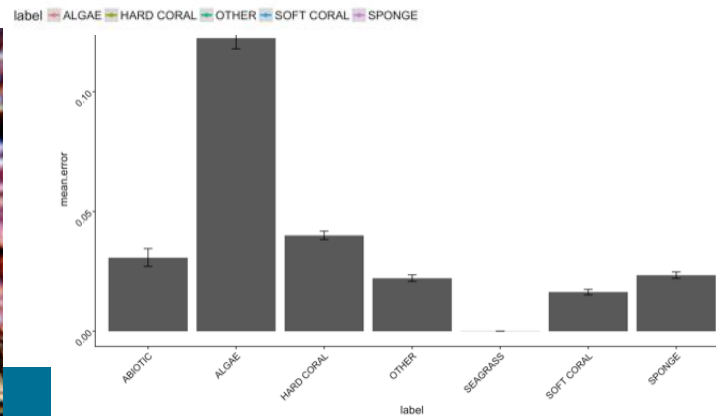
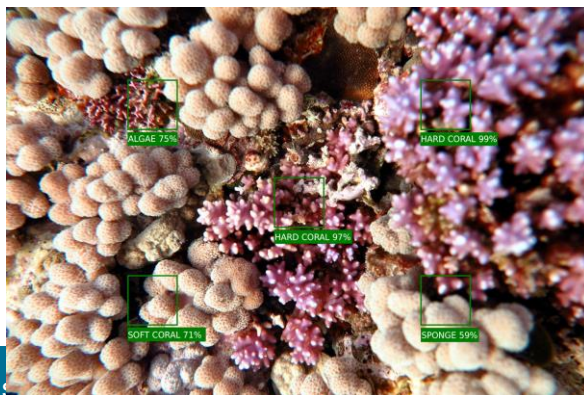
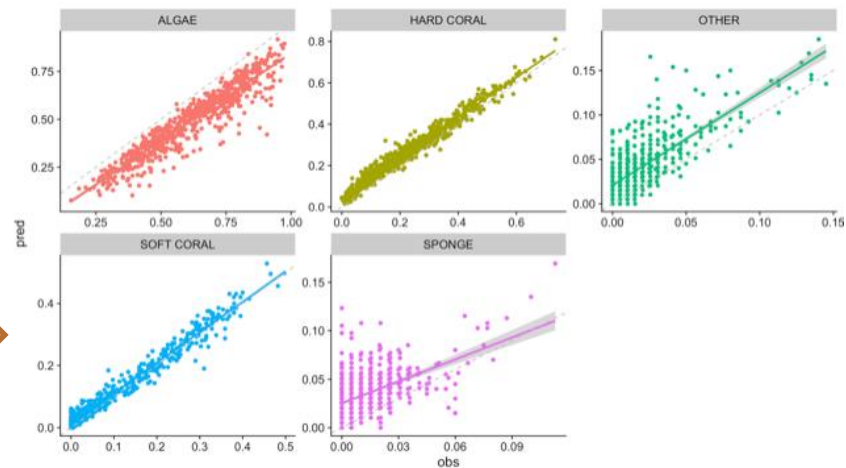
IMAGENET Image Classification Top-5 Error(%)



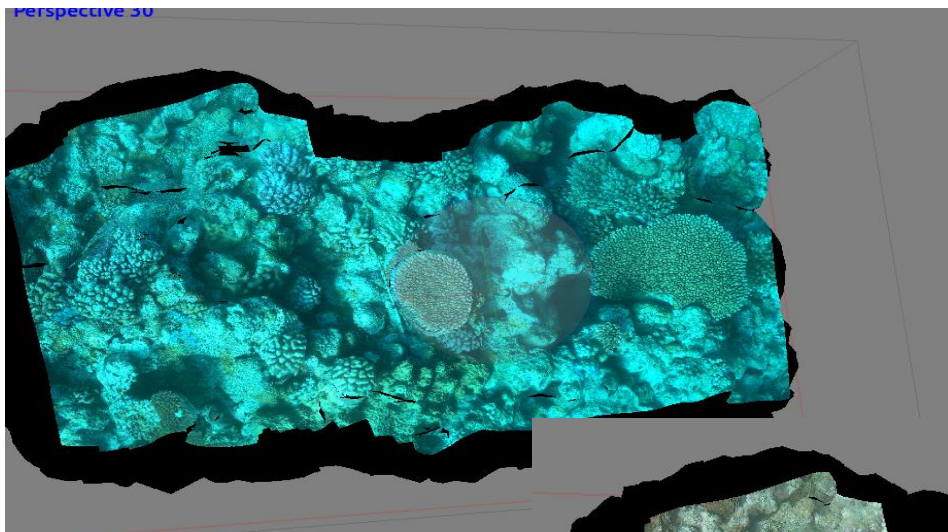


Three years of training  
data: 2008, 2010, 2012

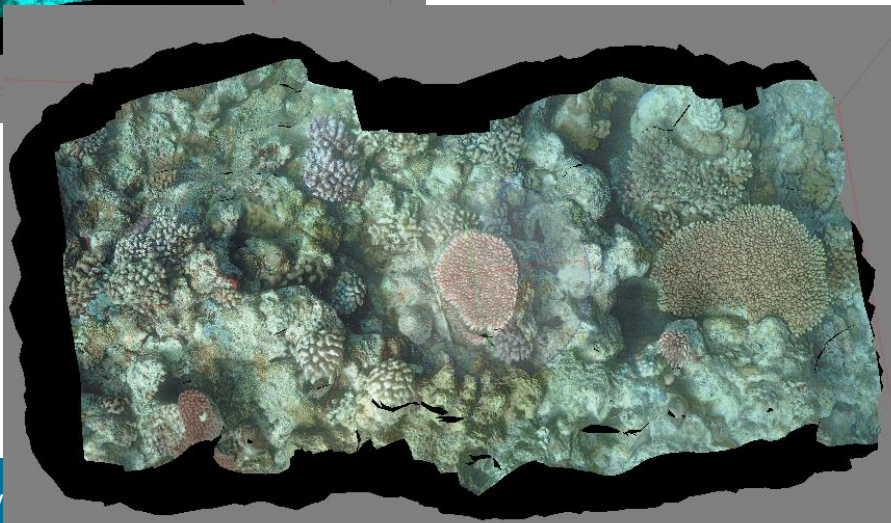
5 point validation on  
2014 50,000 images  
~1 hour per 50k images



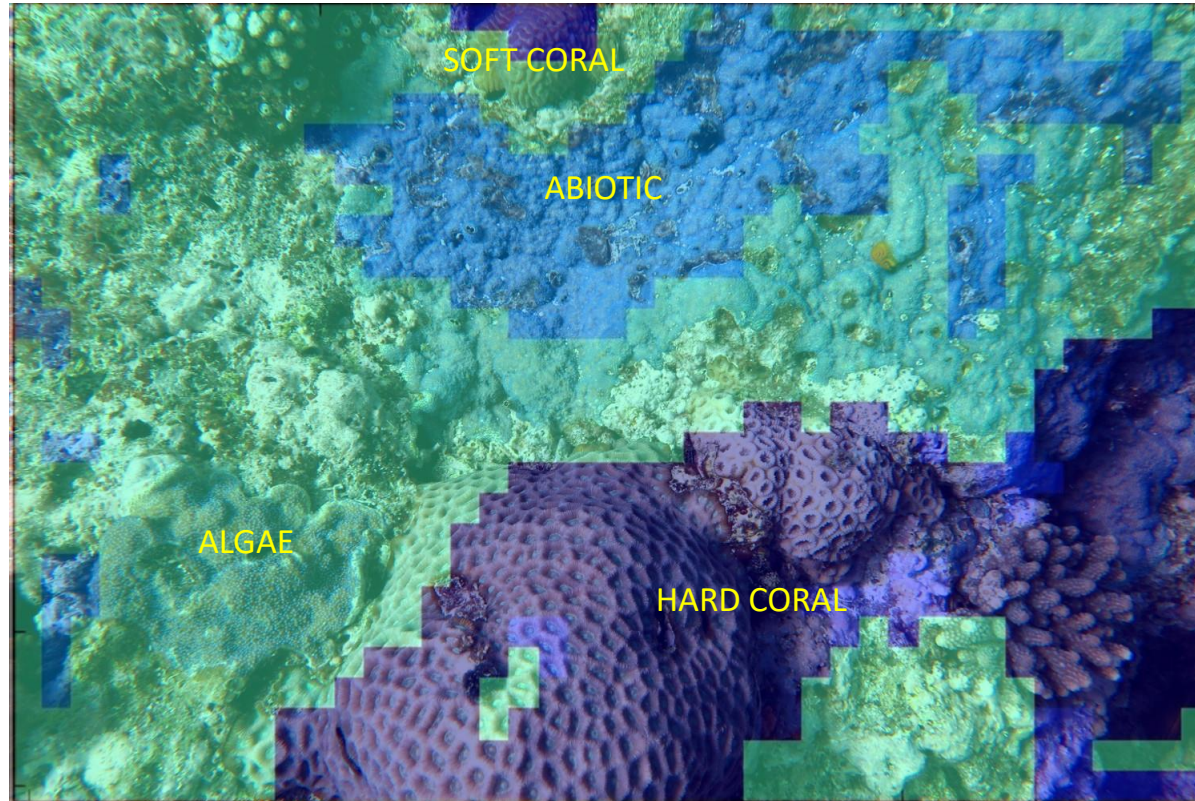
# Going beyond image points to image moacis



GAN “Generative Adversarial  
Networks”  
For image correction



# Deep nets scalability, autoscoring point, to patch to reef scale



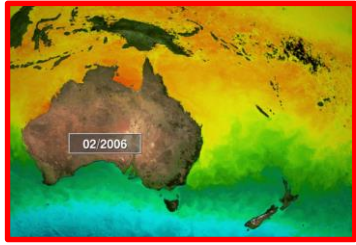
14 May 2018



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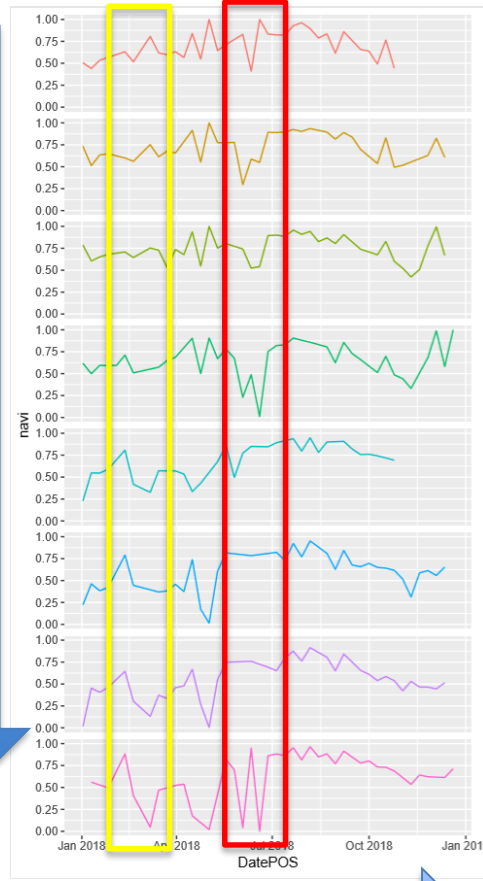
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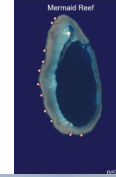


# habitat cover index

SCALE



TIME



\$

\$\$

\$\$\$

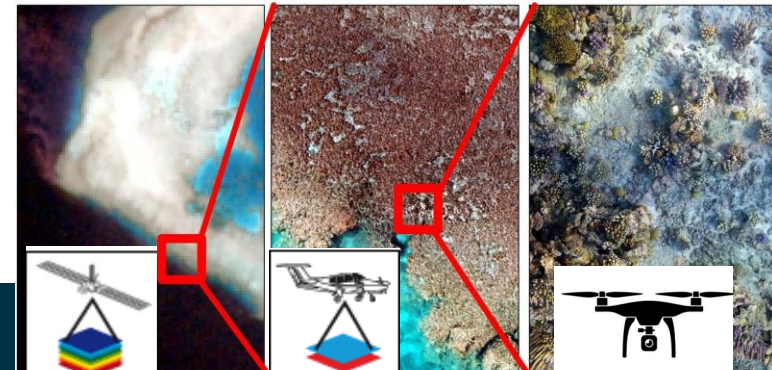
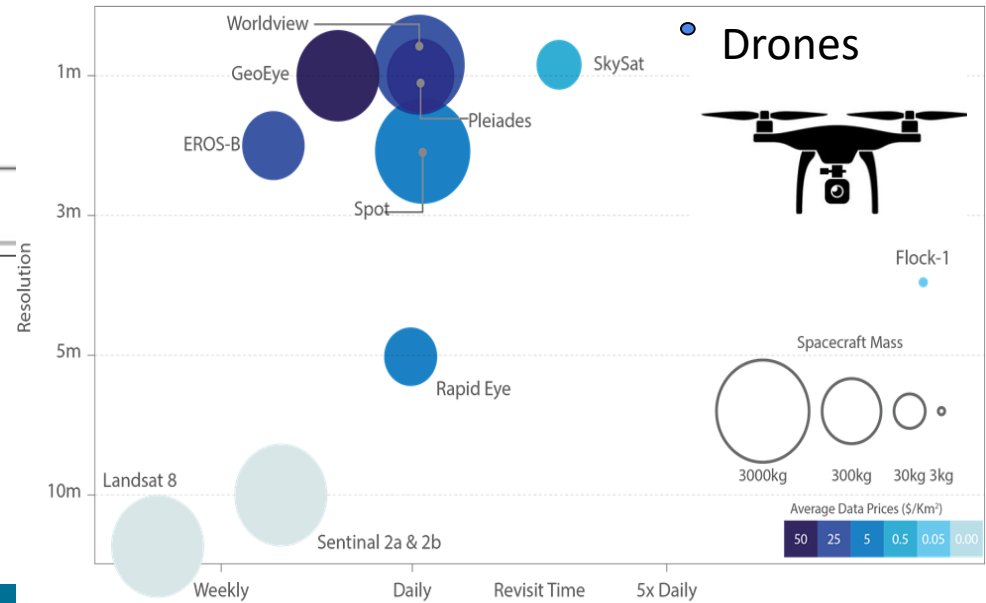
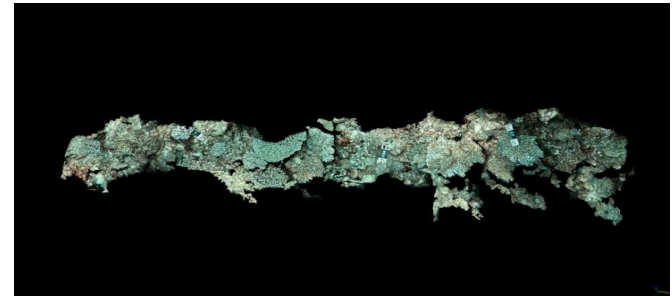
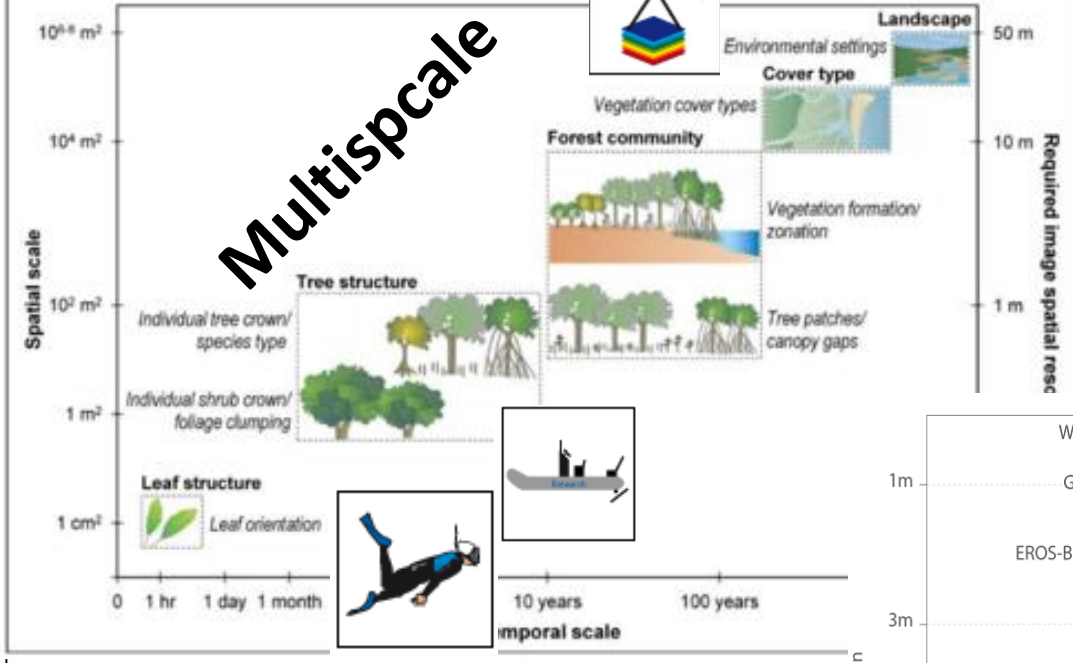
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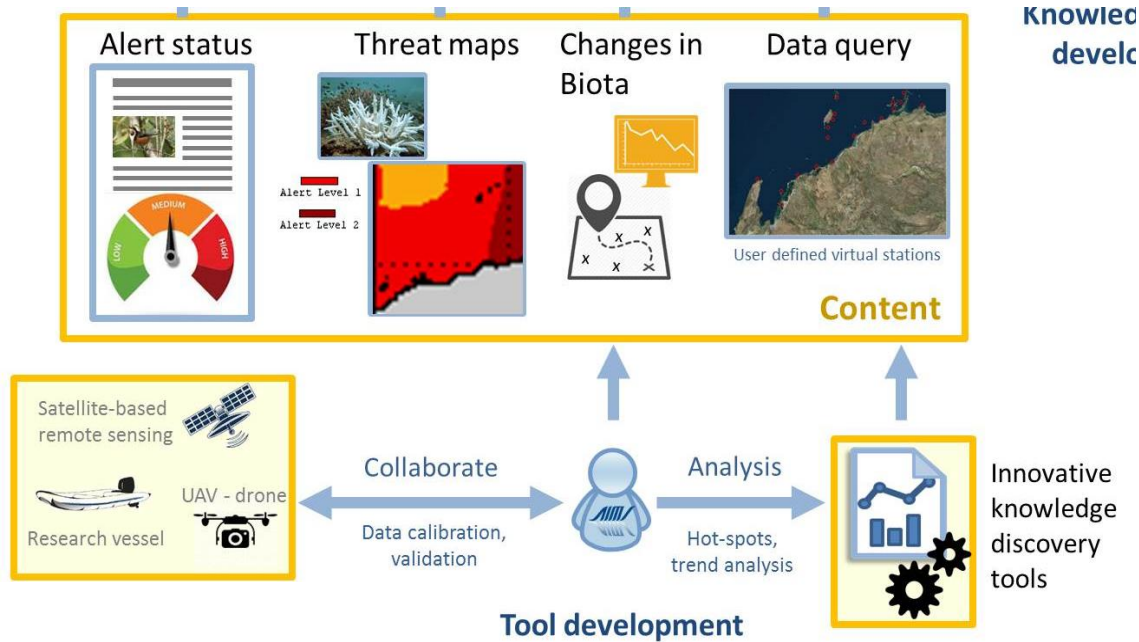
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# Multiscale





# Work towards adaptive monitoring and disturbances triggering monitoring on demand



Data.aims.gov.au  
Bleaching risk models

