

# 24/7 Multi-Robot Systems operating in real world

Stefan B. Williams

- Introduction to ACFR
- Fielding Multi-Robot Systems
  - Logistics
  - Defence and Security
    - Unmanned Air Vehicles
    - Multi-vehicle Ground Vehicle Systems
  - Mining
  - Art
  - Agriculture
  - Environmental
- Conclusions
- Acknowledgements



# AUSTRALIAN CENTRE FOR FIELD ROBOTICS



THE UNIVERSITY OF  
SYDNEY



- An engineering research institute at the University of Sydney
- Research staff
  - 6 academics
  - 40 research fellows
  - 50 PhD students
  - 30 software, mech/aero, electrical/electronic staff
- One of the largest field robotics and intelligent systems group in the world
- Dedicated to the scientific advancement and industry uptake of autonomous robots and intelligent systems for outdoor operations







# Examples of Collaboration



Australian Government  
Australian Research Council



RIO  
TINTO



Australian Government  
Department of Defence  
Defence Science and  
Technology Organisation



MINISTRY OF DEFENCE

BAE SYSTEMS



국 방 과 학 연 구 소  
Agency for Defense Development



bhpbilliton

KOMATSU



Australian Government  
Land & Water Australia



Australian Government  
Department of Agriculture,  
Fisheries and Forestry



Horticulture Australia



MEAT & LIVESTOCK AUSTRALIA



THE SPIRIT OF AUSTRALIA

IMOS  
Integrated Marine  
Observing System



U.S. AIR FORCE



ST Aerospace  
A company of ST Engineering

# Research and Technology Themes

## Field Robotics and Complex Software Systems

- Novel Machines and Mechanisms for Air, Ground, Marine and Space
- Complex Software System Development
- Autonomous Information Processing

## Sensors and Machine Perception

- Laser, Radar, Vision, Thermal, Hyperspectral, Inertial, GPS.
- Rich Probabilistic Models and Representations
- Advanced algorithms for localisation and mapping

## Machine Control and Autonomous Decision Making

- Modeling complex platform motion and environment interaction
- Linear and adaptive control algorithms and implementation
- Probabilistic planning techniques

## Learning Systems and Adaptation

- Data Mining and Classification
- Machine learning for environment modelling
- Reinforcement learning for control and planning

## Systems of Intelligent Systems

- Multi-sensor and multi-platform data fusion and control
- Large scale optimisation for operation planning
- Human-machine systems and interaction

# Application Areas

Field Robotics and  
Complex Software  
Systems

Sensors and Machine  
Perception

Machine Control and  
Autonomous Decision  
Making

Learning Systems and  
Adaptation

Systems of Intelligent  
Systems

Human-  
Machine  
Interaction

Environmental  
Monitoring  
and Scientific  
Exploration

Intelligent  
Transport  
and  
Logistics

Agriculture  
and Food  
Production

Defence  
and  
Security

Mining and  
Construction

## **Robots at Work**

Enhanced Straddle Carrier

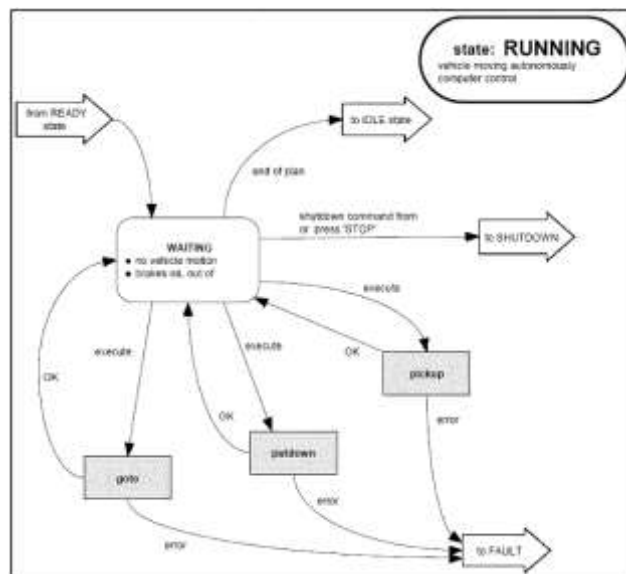
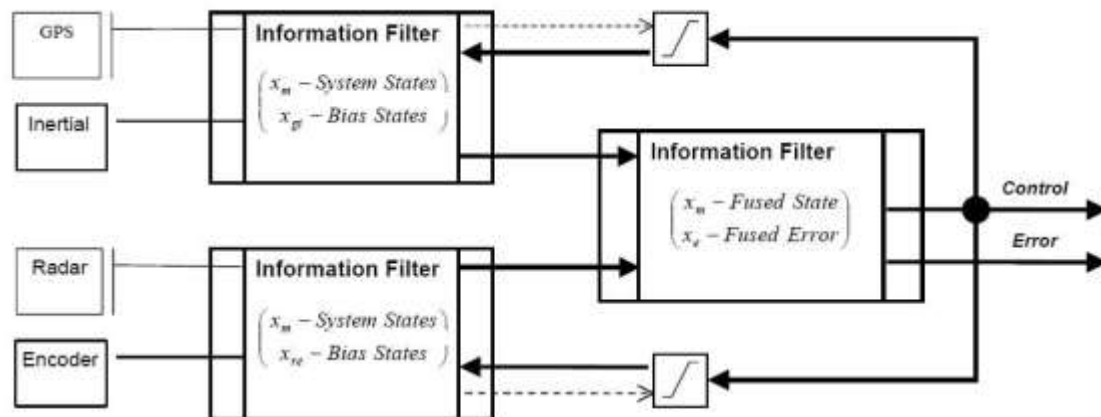


# ENHANCED STRADDLE CARRIER



Durrant-Whyte, Hugh, Daniel Pagac, Ben Rogers, Michael Stevens, and Graeme Nelmes. **"Field and service applications-an autonomous straddle carrier for movement of shipping containers-from research to operational autonomous Systems."** Robotics & Automation Magazine, IEEE 14, no. 3 (2007): 14-23.

# HIGH INTEGRITY NAVIGATION



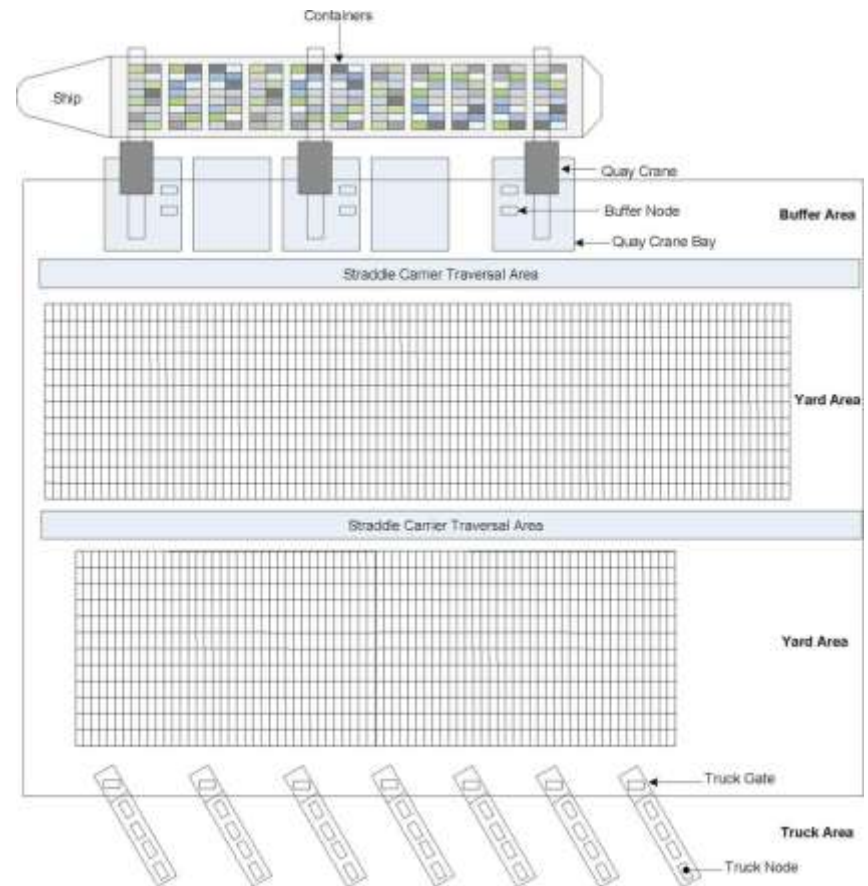
## COMPLETE AUTOMATION OF A BERTH





# PLANNING UNDER UNCERTAINTY

- More recent work from UTS has considered the case of planning under uncertainty
- Multi-objective planning under uncertainty, including
  - Travelling time
  - Waiting time
  - Finishing time for high priority jobs



Cai, B., Huang, S., Liu, D., & Dissanayake, G. (2014). **Rescheduling policies for large-scale task allocation of autonomous straddle carriers under uncertainty at automated container terminals.** *Robotics and Autonomous Systems*, 62(4), 506-514.

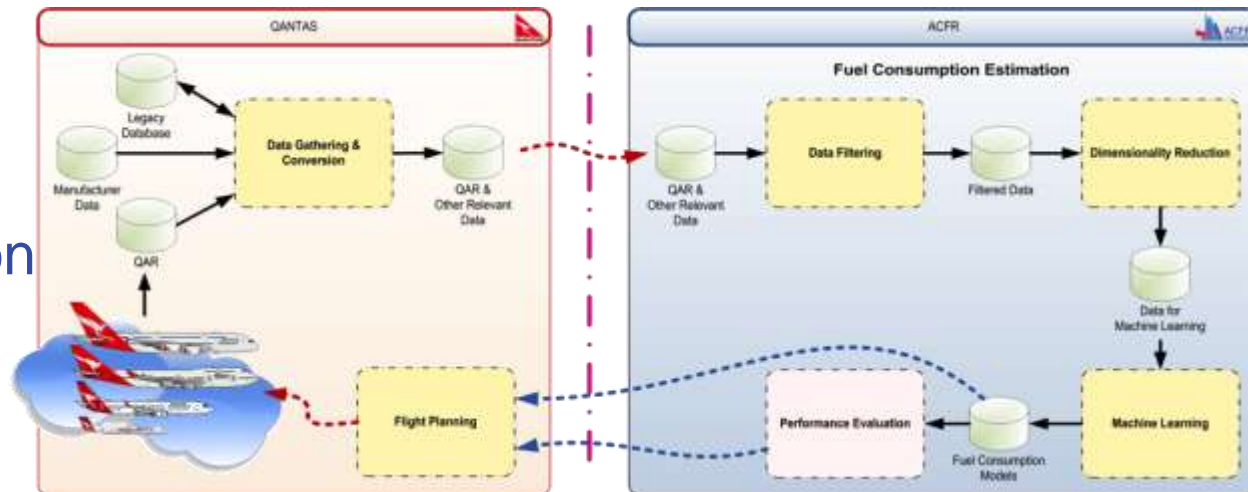
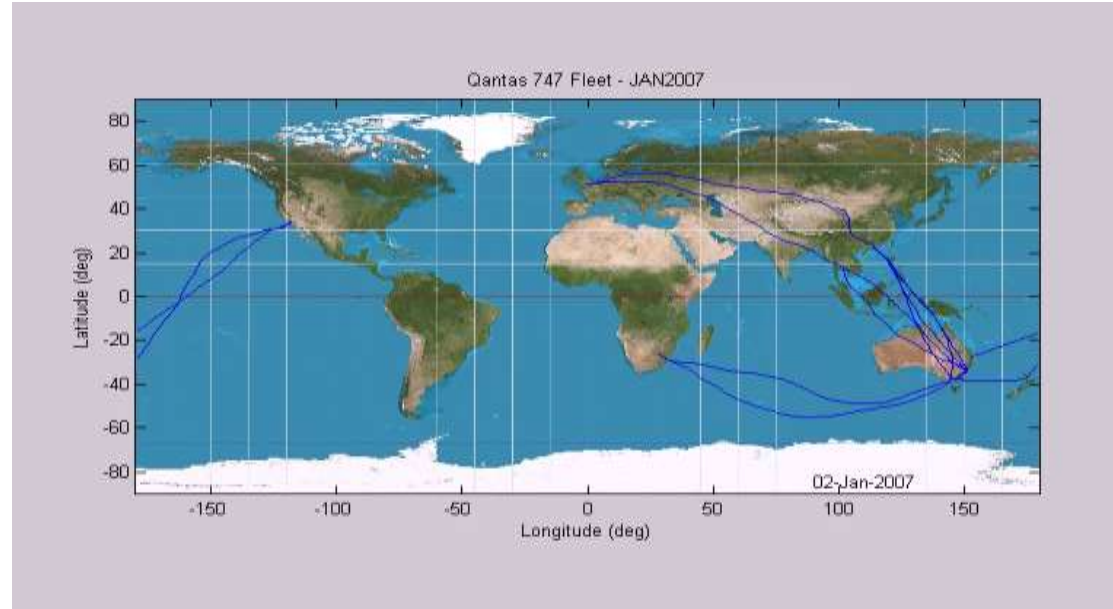
# MULTIMODAL LOGISTICS/FREIGHT/TRANSPORT





## QANTAS FLIGHT PLANNING AND FUEL OPTIMISATION

- Working closely with Qantas on the development of flight planning systems
- Small changes in weather can have a significant impact of flight times and efficiency
- Leveraging recent work in multi-objective optimisation and planning under uncertainty



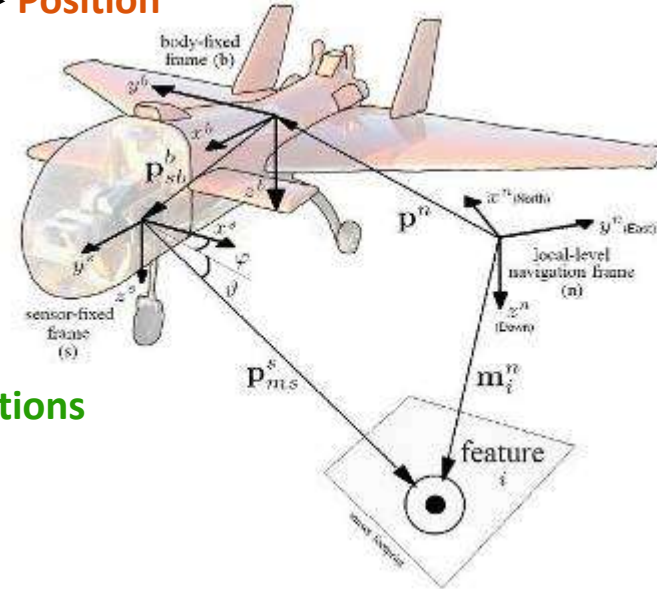
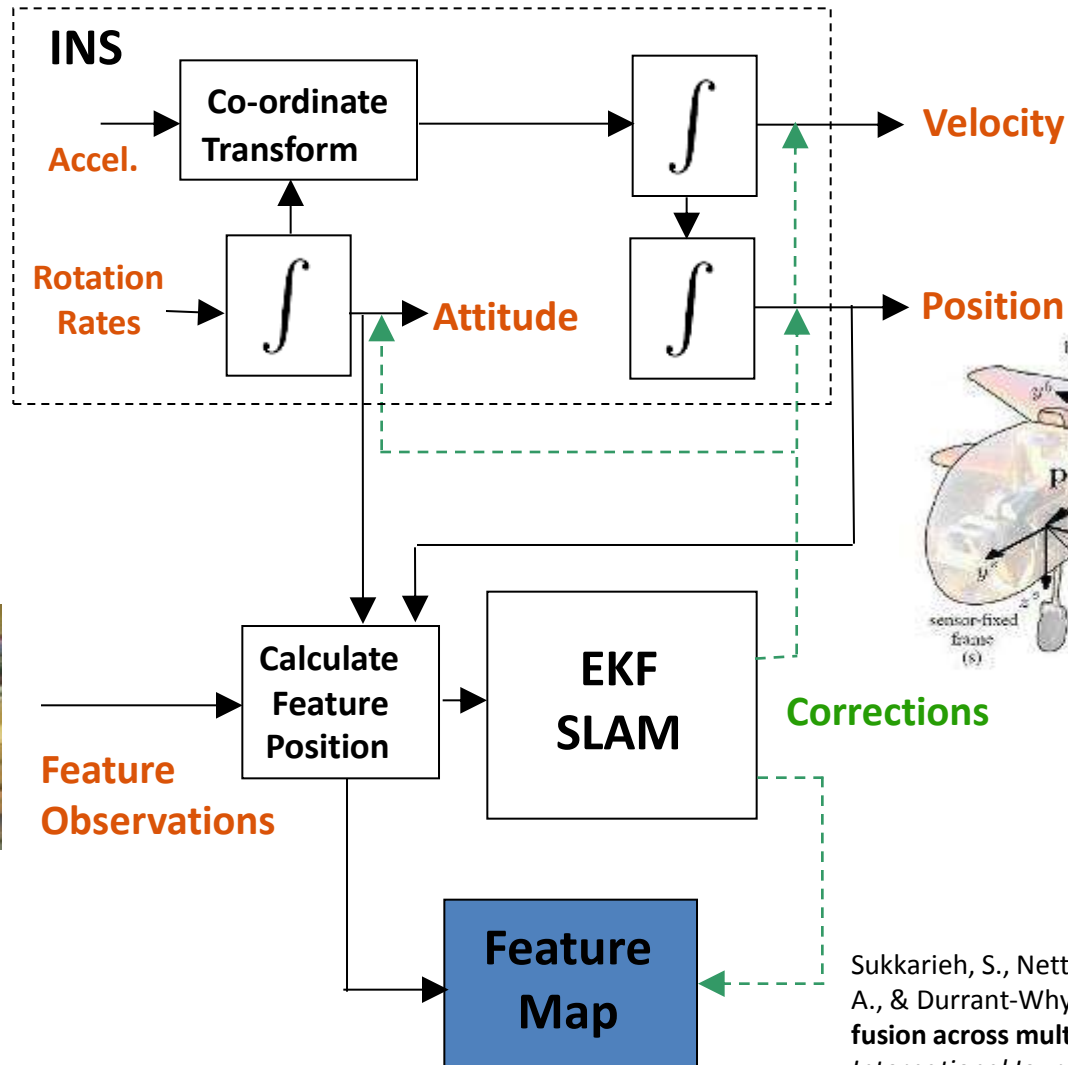
## **Robots at Work**

Defence and Security

# UNMANNED AIR VEHICLES



- DSTO
- BAE Systems
- ST Aerospace
- US Air Force
- Ministry of Defence UK
- US Office of Naval Research
- Australian Research Council
- Department of Agriculture, Fisheries, and Forestry
- Land and Water Australia
- Australian Plague Locust Commission
- Meat and Livestock Australia



Sukkarieh, S., Nettleton, E., Kim, J. H., Ridley, M., Goktogan, A., & Durrant-Whyte, H. (2003). **The ANSER project: Data fusion across multiple uninhabited air vehicles.** *The International Journal of Robotics Research*, 22(7-8), 505-539.



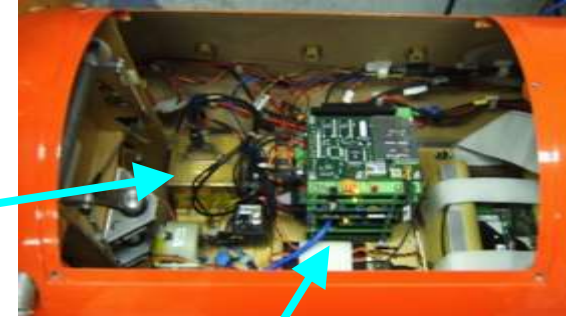
# SLAM IN ACTION – SINGLE VEHICLE



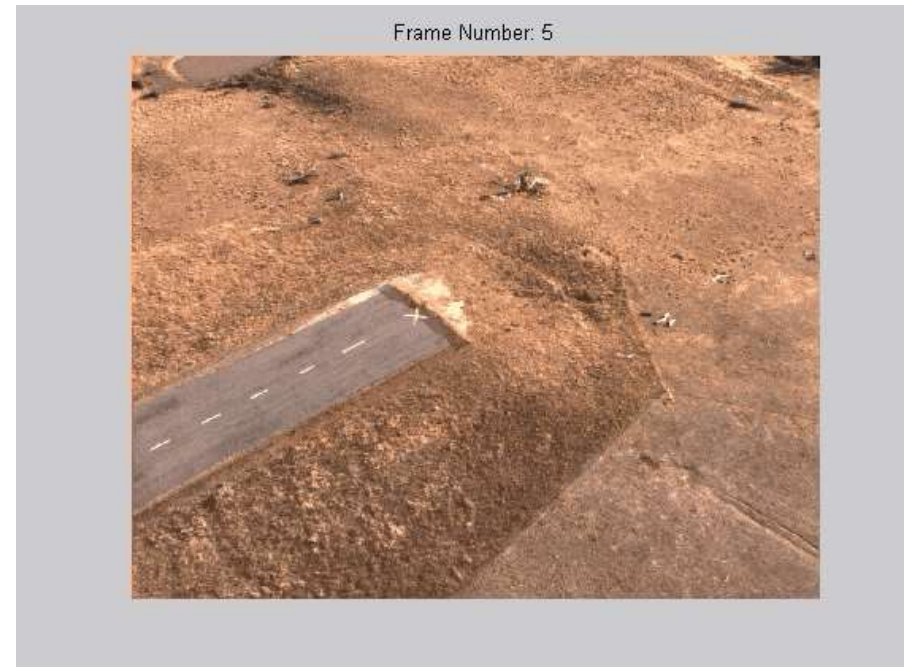
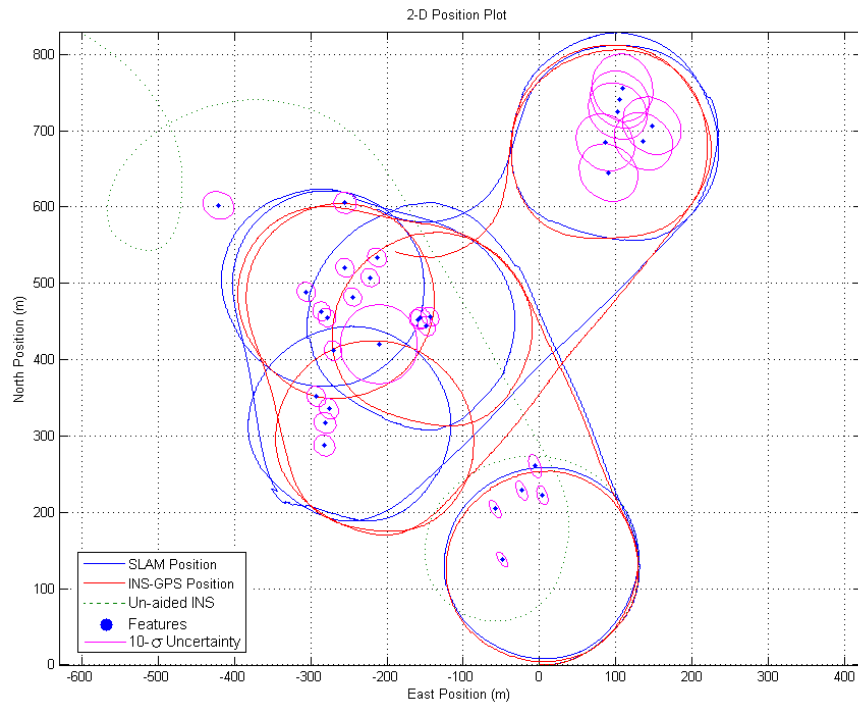
**Colour Camera**

**Vision  
CPU**

**IMU**



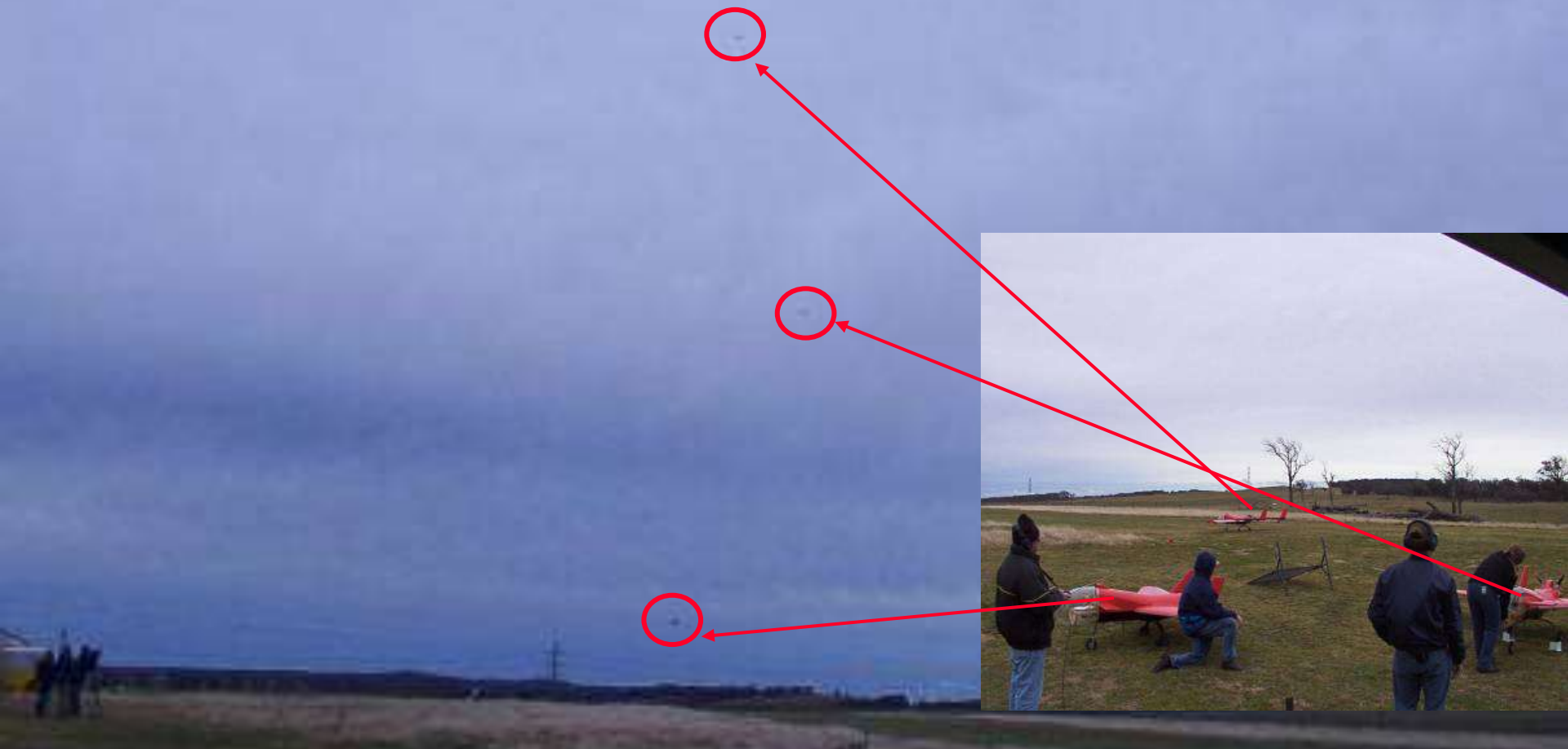
**Flight Control Computer**





2000-2004

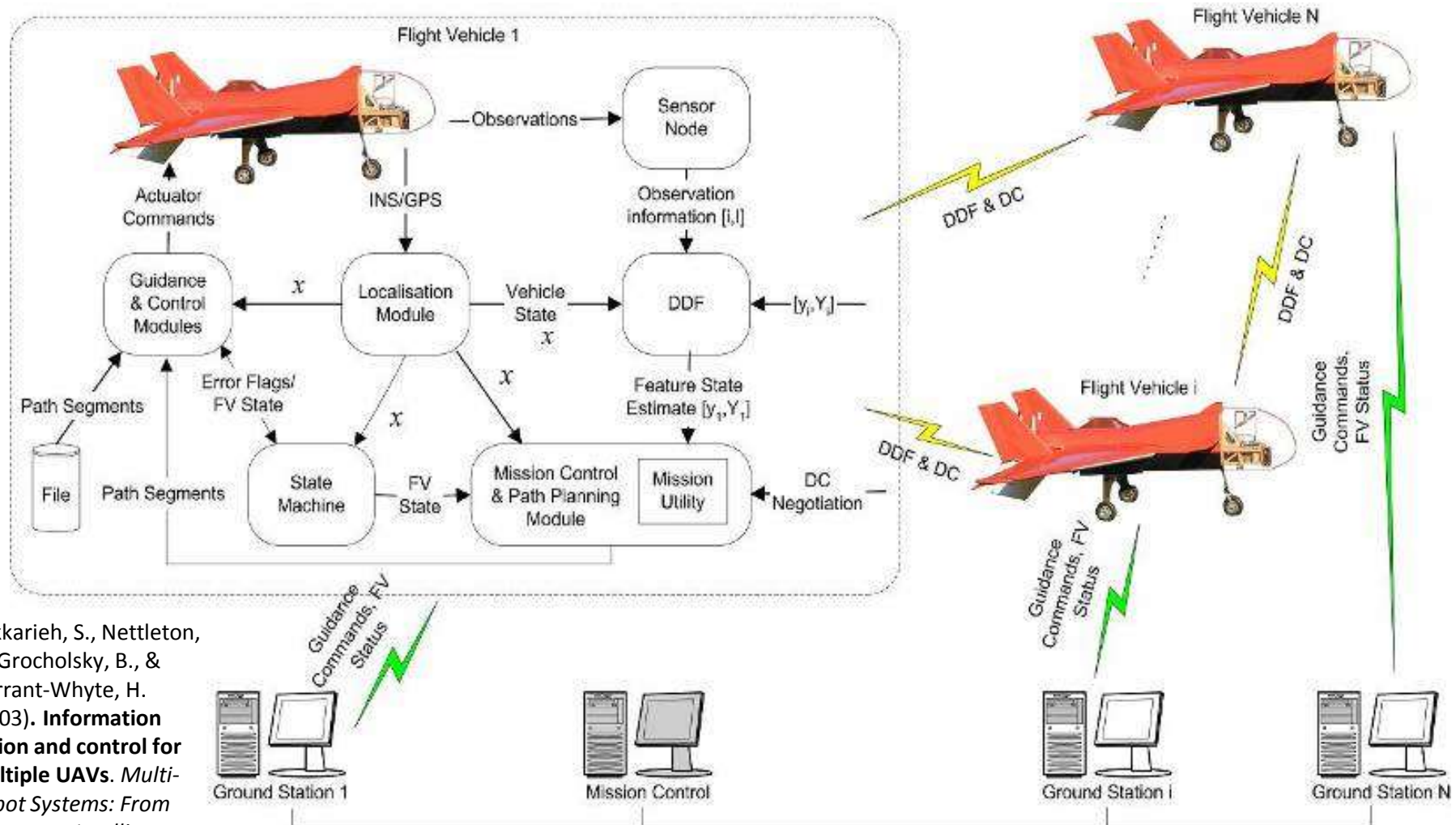
# ANSER 1 – Demonstration of a Decentralised Air Surveillance System







# SYSTEM ARCHITECTURE



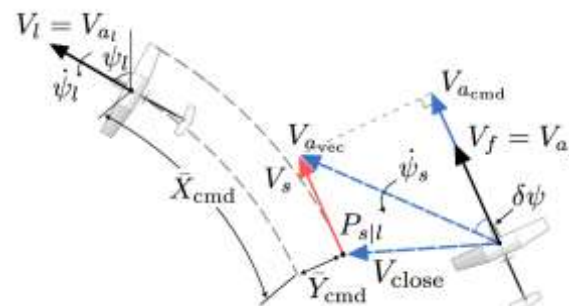
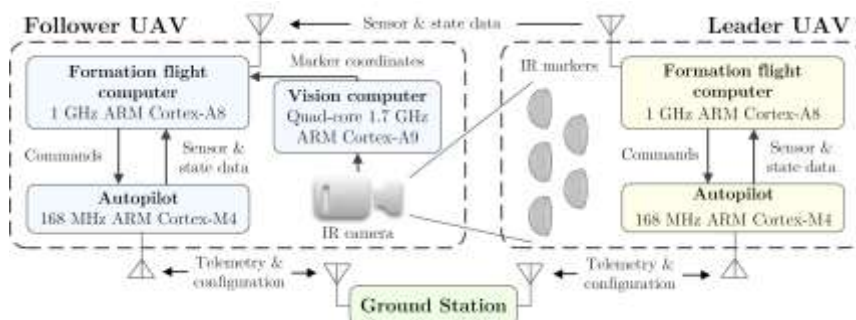
Sukkarieh, S., Nettleton, E., Grocholsky, B., & Durrant-Whyte, H. (2003). **Information fusion and control for multiple UAVs. Multi-Robot Systems: From Swarms to Intelligent Automata**, 2, 123-134.



# Autonomous UAV Docking for Aerial Refueling

Daniel B. Wilson

Dr Ali Haydar Göktoğan

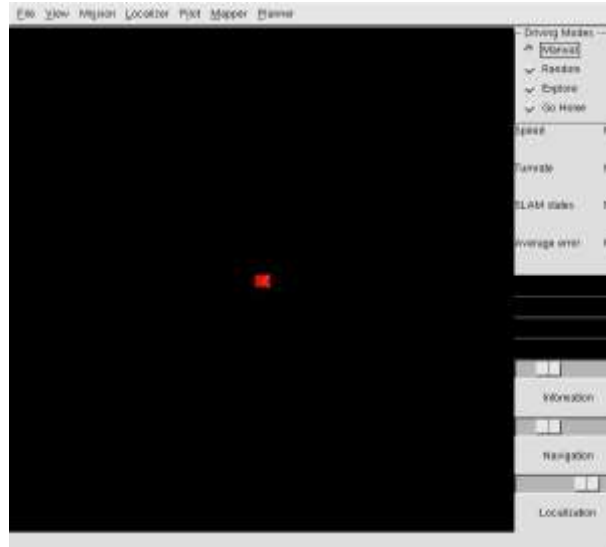


Wilson, D. B., Göktoğan, A. H., & Sukkarieh, S. **"Guidance and Navigation for UAV Airborne Docking"**, Robotics: Science and Systems, 2015 (winner Best Paper)



## SPECIAL FORCES TRAINING

- Work on indoor SLAM and exploration
- Received a request from Australian Special Forces training facility for assistance with the development of a flexible, robotic system
- An internally funded project had spent 12 years developing a prototype



# SPECIAL FORCES TRAINING





# SPECIAL FORCES TRAINING





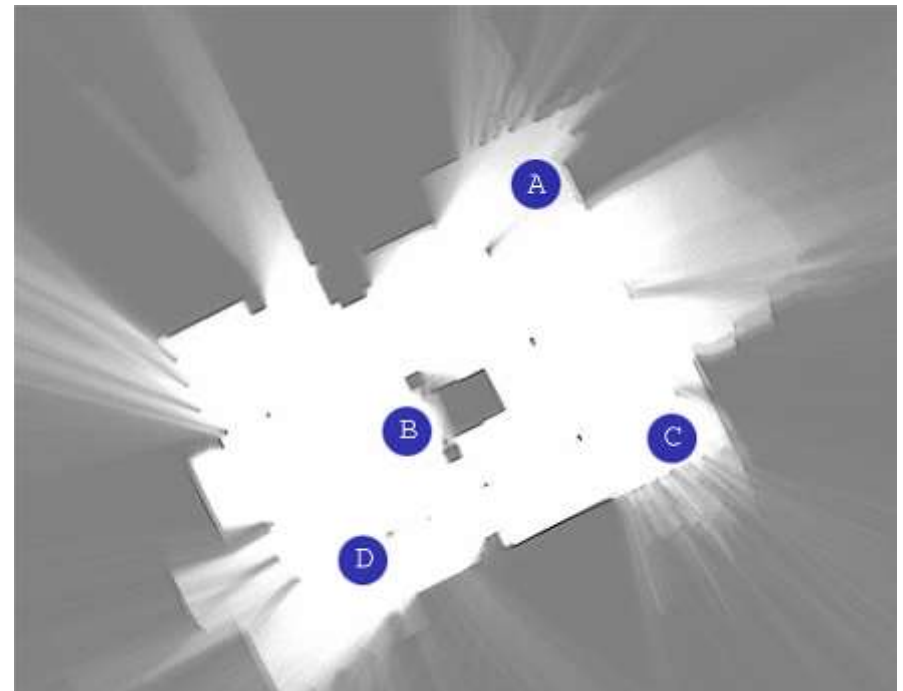
# LOCALIZATION



- Odometry
  - Wheel encoders to estimate forward speed and turn rate
- Laser features
  - Surveyed into the range
  - Easily identifiable targets
- Data Fusion
  - Fusing encoder data with the laser observations yields best estimate of vehicle pose
  - Initialisation from unknown location depends on recognizing feature arrangements
- Alternative methods
  - GPS – suitable for outdoor environments
  - Wi-Fi Strength

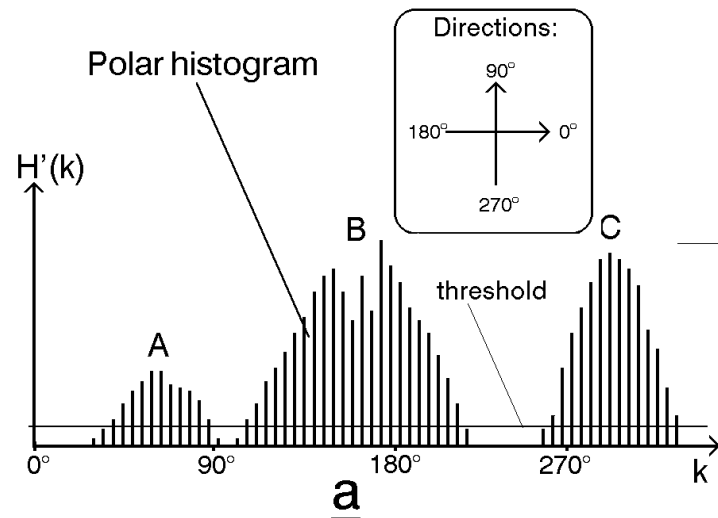
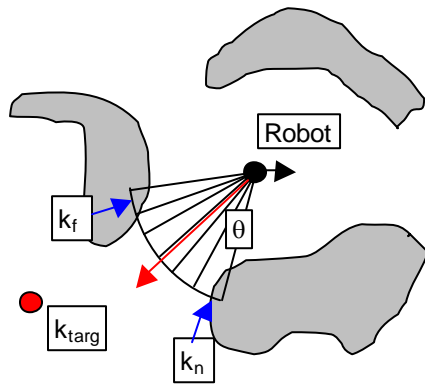
## MAPPING

- Feature based localization and AMCL require map of environment
- Deployed Simultaneous Localisation and Mapping
- Occupancy Grid Mapping algorithms
- Autonomous Mapping to create maps using the vehicle sensing capabilities





# OBSTACLE AVOIDANCE



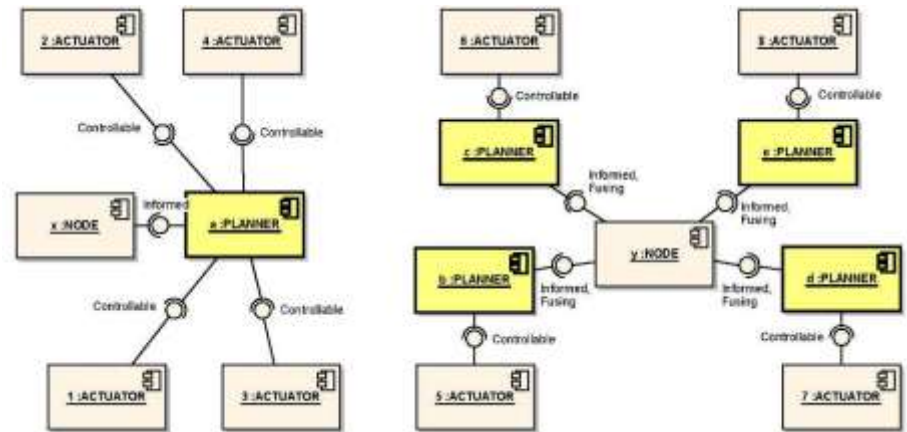
- Laser used for obstacle avoidance
  - Allows local decisions about best path to next waypoint
  - Presents flexibility in plan execution
  - Continuation of game post shot
- Vector Field Histogram
  - Fast obstacle avoidance technique
  - Discretization of area around vehicle
  - Choice of direction towards goal which minimizes chance of collision
- Significant tuning required to operate with multiple platforms in confined spaces

## **PLANNING AND CONTROL**

- Scenario planning to be overseen by an operator
- A simple waypoint based interface used to designate timed waypoints for each platform
- No explicit coordination of platforms
- Local control of each platform facilitates waypoint following and dynamic obstacle avoidance

# COMMUNICATIONS

- Development of ORCA interprocess communication framework
- Based on an existing open source project (OROCOS)
- Pre-ROS



Makarenko, A., Brooks, A., & Kaupp, T. (2006, October).

**Orca: Components for robotics.** In **International Conference on Intelligent Robots and Systems (IROS)** (pp. 163-168).

## OUT OF THE LAB

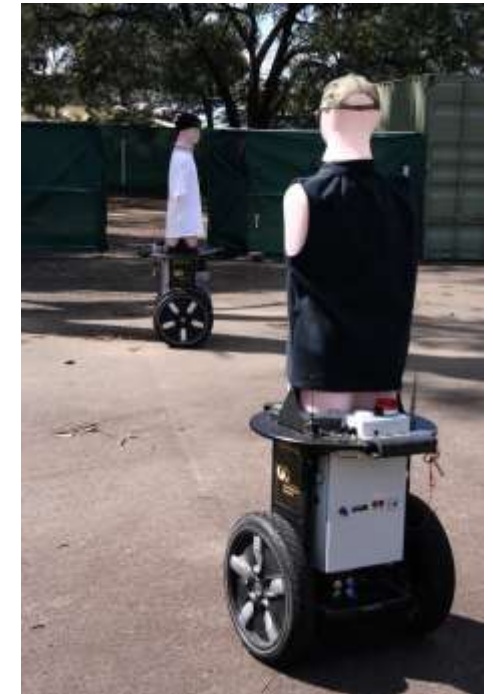




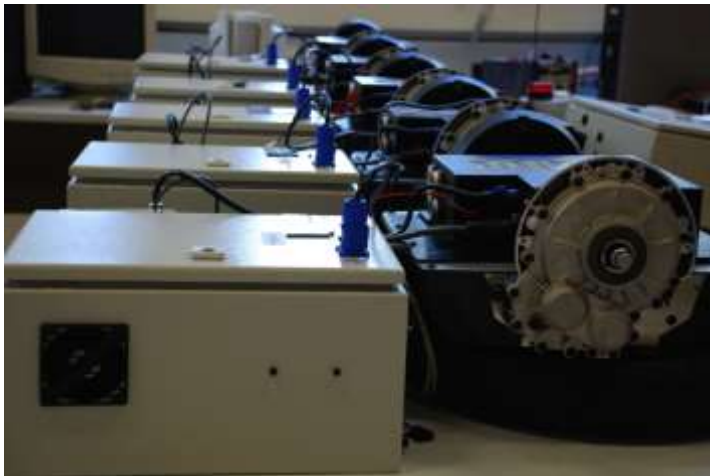
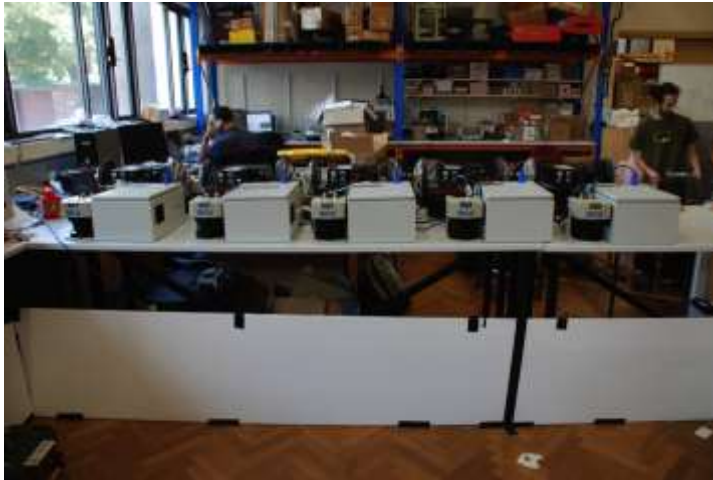
## ON SITE DEMONSTRATION



## MULTI-ROBOT SYSTEM



# MULTI-ROBOT SYSTEM





# SPECIAL FORCES TRAINING





## MARATHON TARGETS

- Marathon Targets established to exploit the technology
- Supplying flexible robotic training systems to special forces around the world
- Requirement for a multi-robot system with a SLAM based mapping system that can be run by non-specialist operators
- Significant engineering investment in reliability and robustness
- Entire system essentially redesigned from the ground up



# SEMI-URBAN OPERATIONS



# Dynamic 3D Perception

Multi Platform Active Sensor Control for  
Optimal Multi-Target Tracking

**BAE SYSTEMS**

Centre for Intelligent Mobile Systems





## **Robots at Work**

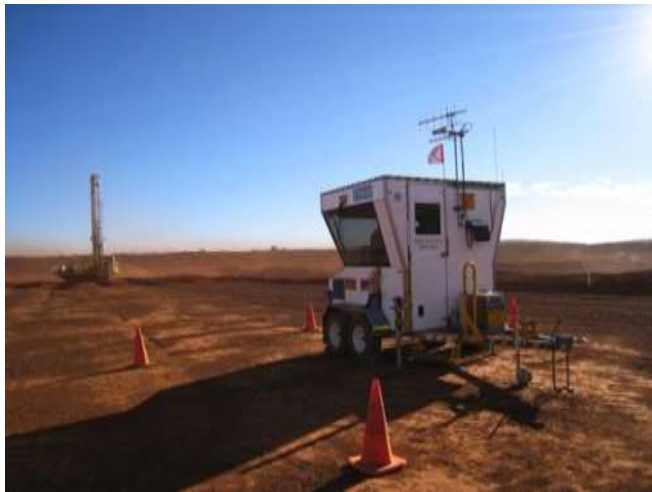
### Autonomous Mining

- The Rio Tinto Centre for Mine Automation represents one of the world's largest commercial automation projects
- Established in 2007 to exploit developments in autonomous systems for mining applications
- Automated drill rigs originally developed at the ACFR are now in continuous 24/7 operation and can be controlled from a Remote Operations Centre in Perth
- Work continues to increase safety and efficiency through the use of:
  - Novel sensing techniques
  - Machine learning
  - Data fusion
  - Systems engineering



- Complex system of systems
  - Centralised, hierarchical control
  - ‘Chain of command’
  - Bounds on responsibility
- Trusted systems
  - Different OEM implementations
  - Commanding / interfaces
  - Monitoring / safety
- Humans & autonomous systems at different levels
  - Levels of autonomy
  - Manned → Autonomous
    - Machine operators
    - Supervisors of autonomy
    - Planning (level of detail)







## **Robots at Work**

Art

## ROBOTIC ART

- Requires
  - Consideration of aesthetics
  - Focus on form rather than technology
  - Human robot interaction



## **Robots at Work**

Agriculture

## AGRICULTURE (GROUND)

- Long-term perception problems
- New sensor modalities
  - Hyper-spectral
  - Gamma log
- Mutli-robot survey
  - Air/ground collaborative mapping
  - Harvest yield estimation
- New robots
  - Ladybird
- Manipulation of the environment



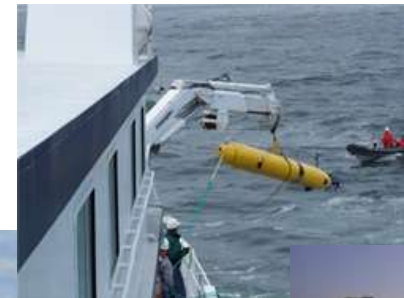


## **Robots at Work**

Environment (marine)

## FRONTIERS IN MARINE ROBOTICS

- Long history of successful adoption of robotic systems in marine sciences (oceanography, biology, geoscience, archaeology, etc.) and industrial applications (exploration, oil and gas, minerals, etc.)
- Strong 'pull' from end users – requirement for remote and robotic systems
- Support from governments around the globe

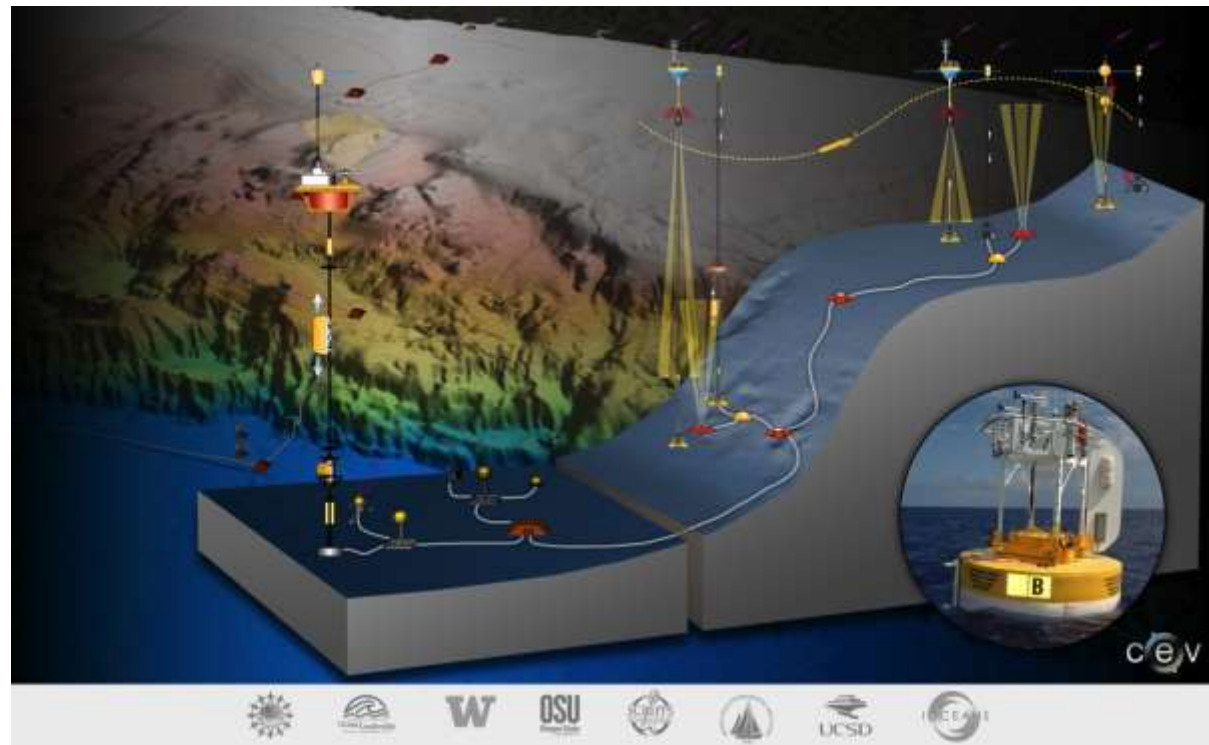


Images courtesy  
of WHOI, FAU,  
URI, iRobot,  
MBARI, Reuters



## FRONTIERS IN MARINE ROBOTICS

- Initiatives in Ocean Observation designed to understand ocean dynamics
- Integration of modeling with observations provided by satellite and in-situ systems including ship-borne sensors, moorings, gliders and AUVs
- Challenges in navigation, communication, data assimilation, coordination, planning in dynamic fields and long term deployments



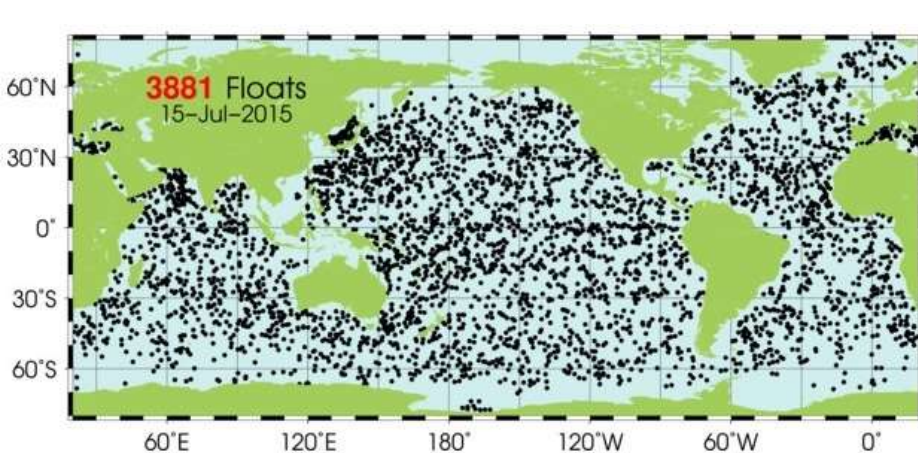
## INTEGRATED MARINE OBSERVING SYSTEM

- NCRIS is a program designed to provide infrastructure to support national research priorities
- Marine Science designated as one of 8 priority programs
- A \$150M program to provide infrastructure to support the marine sciences in Australia (2007-2016)

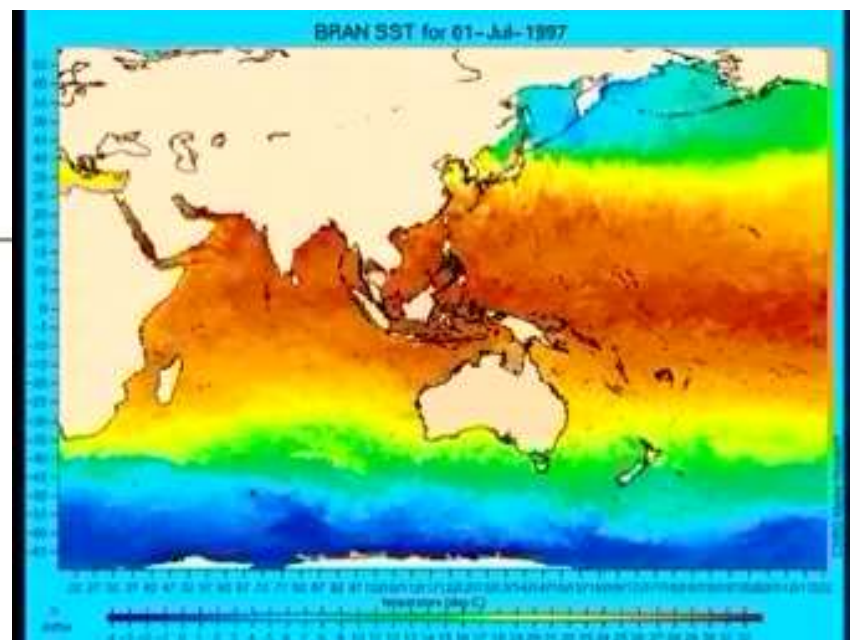
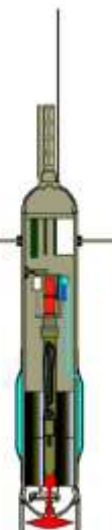




# ARGO FLOATS



Floats



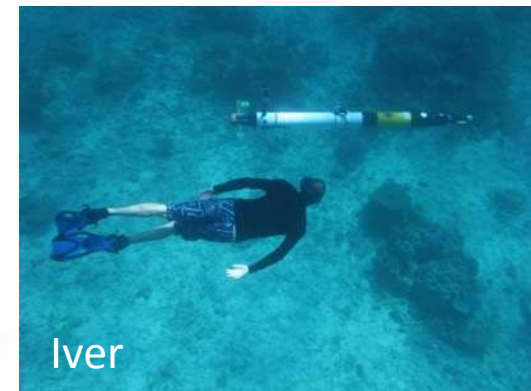
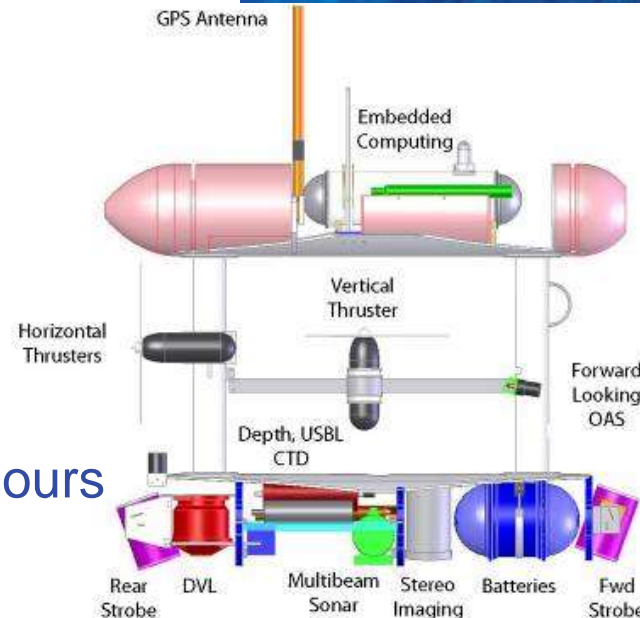
Gliders



Animal tagging  
and telemetry

## IMOS AUV FACILITY

- Flexible, mobile, high resolution data collection device
- Objective to monitor benthic processes and relate changes to oceanographic processes
- Sensors include
  - Vision (stereo)
  - Sonar (multibeam, imaging and fwd obstacle avoidance)
  - DVL
  - Compass
  - Pressure
  - Water Chemistry
  - Up/down looking hyperspectral
- Depth to 800m
- Mission Time up to 12 hours

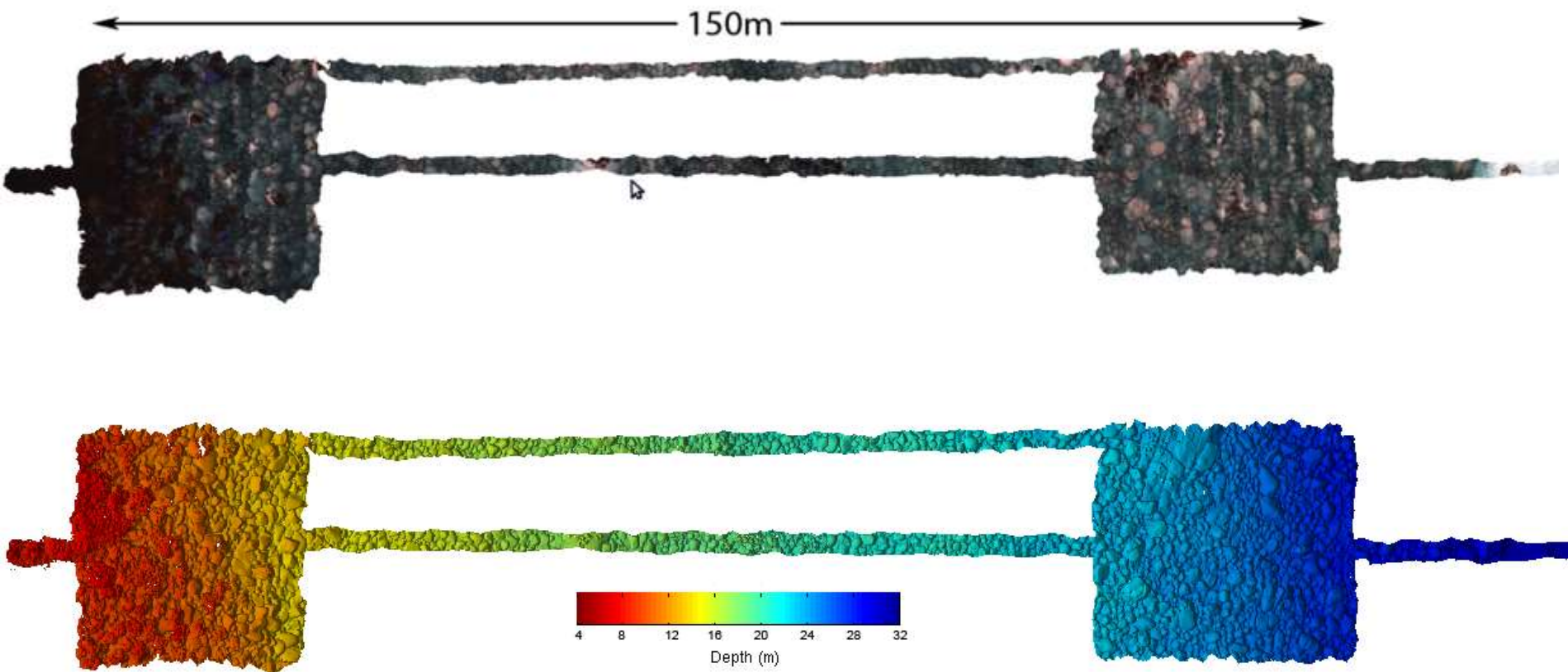




## AUV PLATFORM - IMAGING

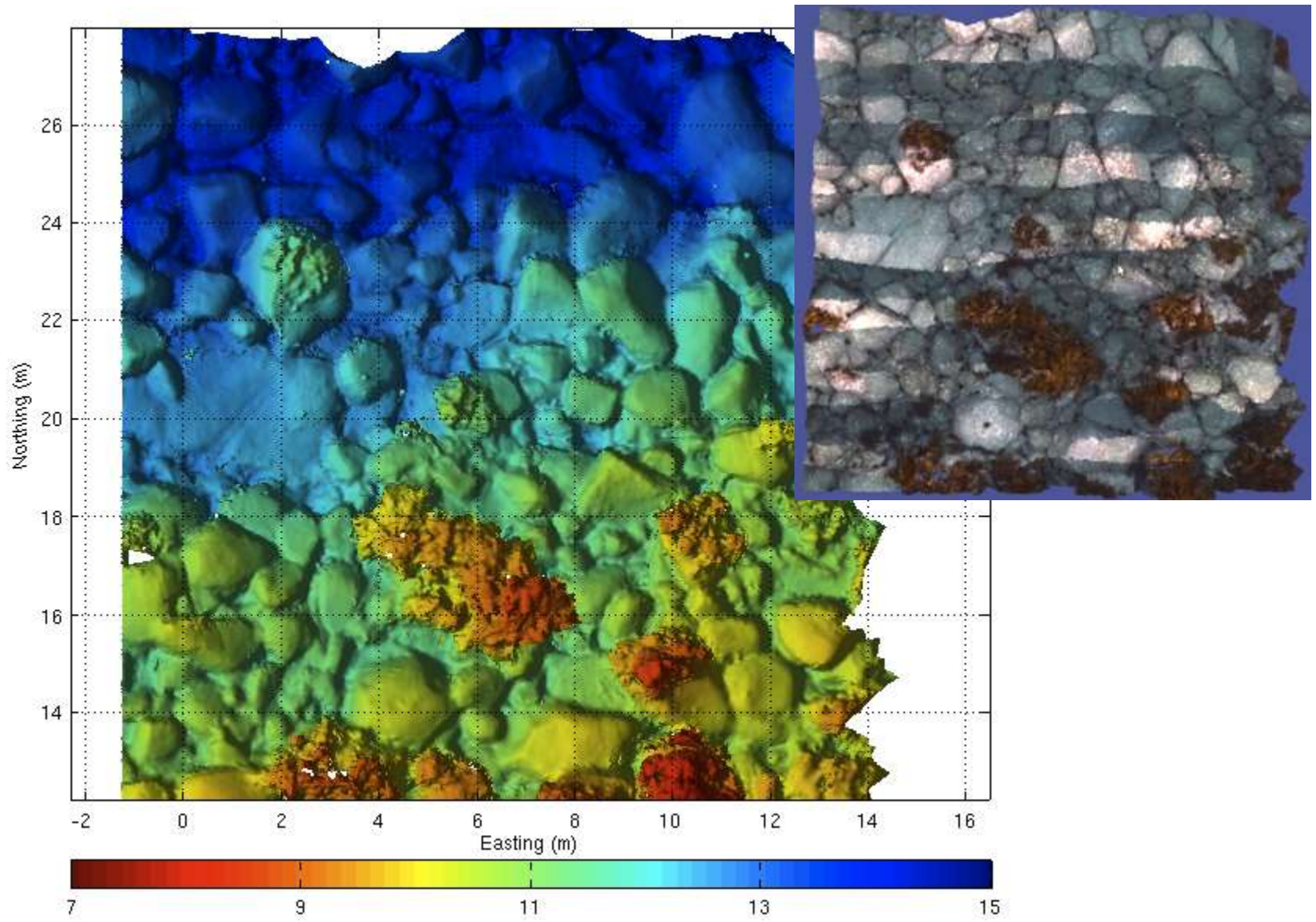


# BATHYMETRY FROM STEREO

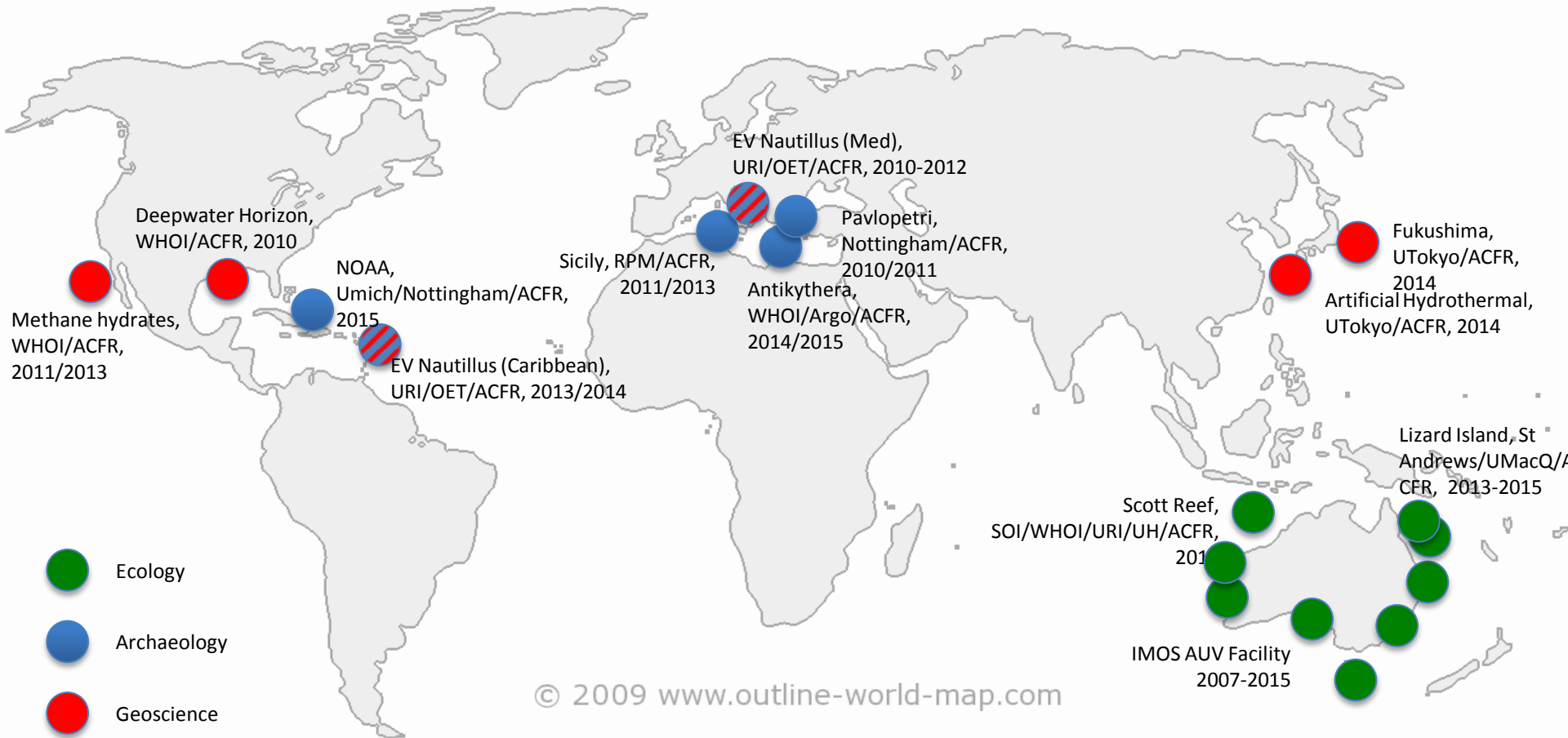




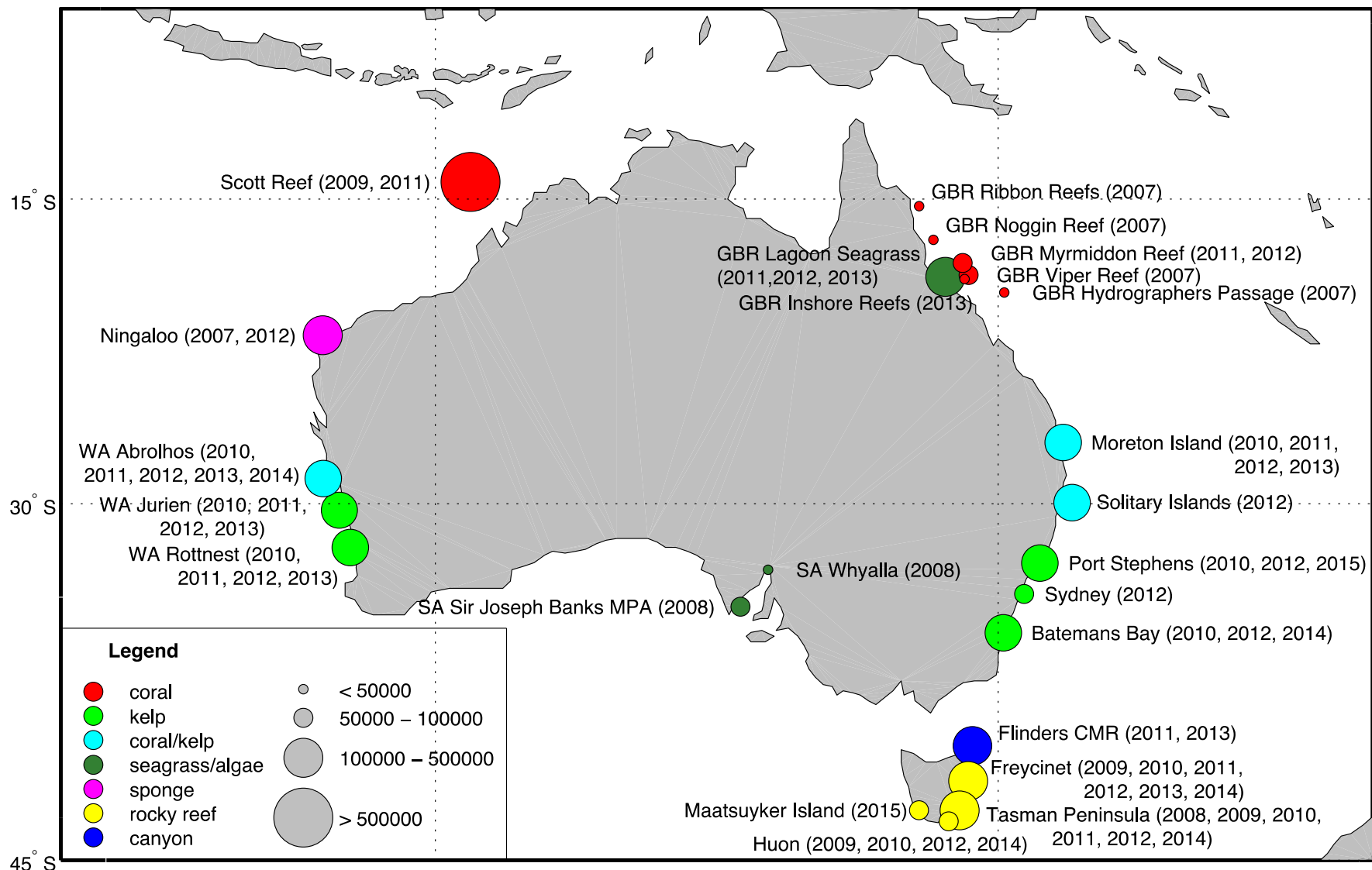
# BATHYMETRY FROM STEREO



# AUV AND ROV SEAFLOOR SURVEYS

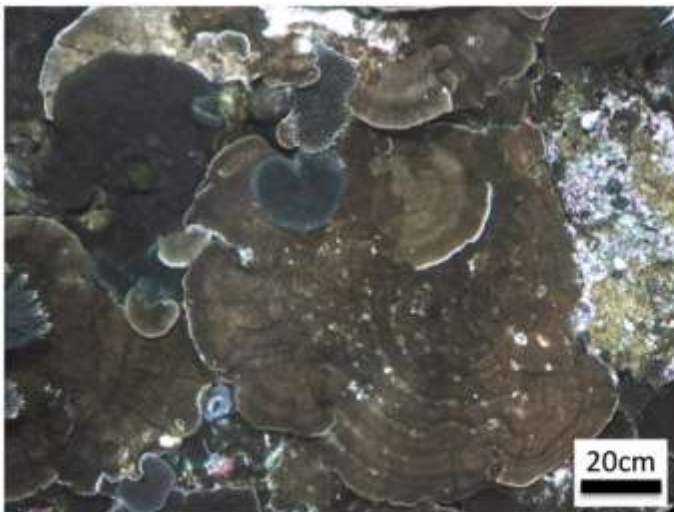


# IMOS AUV DATA ARCHIVE

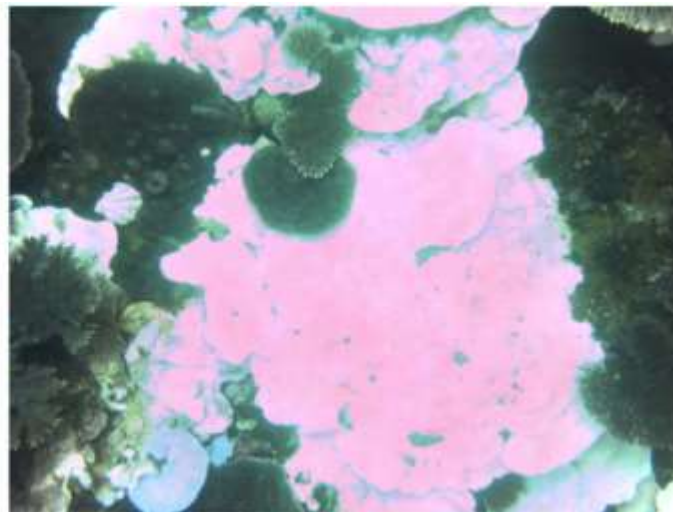




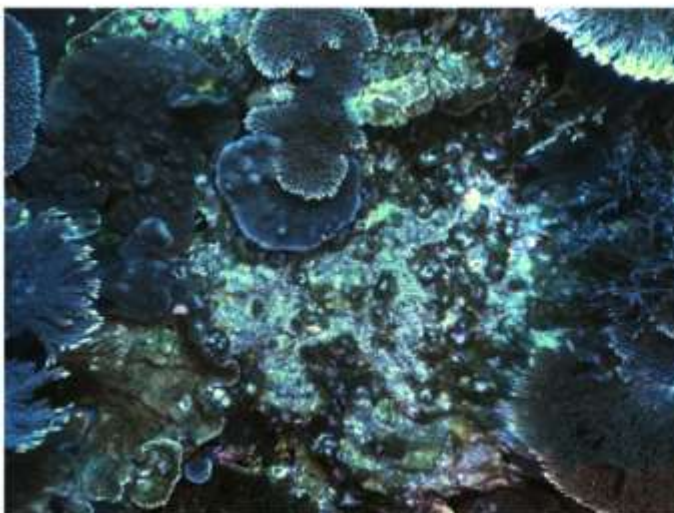
## REGISTERING MULTI-YEAR DATASETS



(a) April 2010



(b) April 2011



(c) April 2012

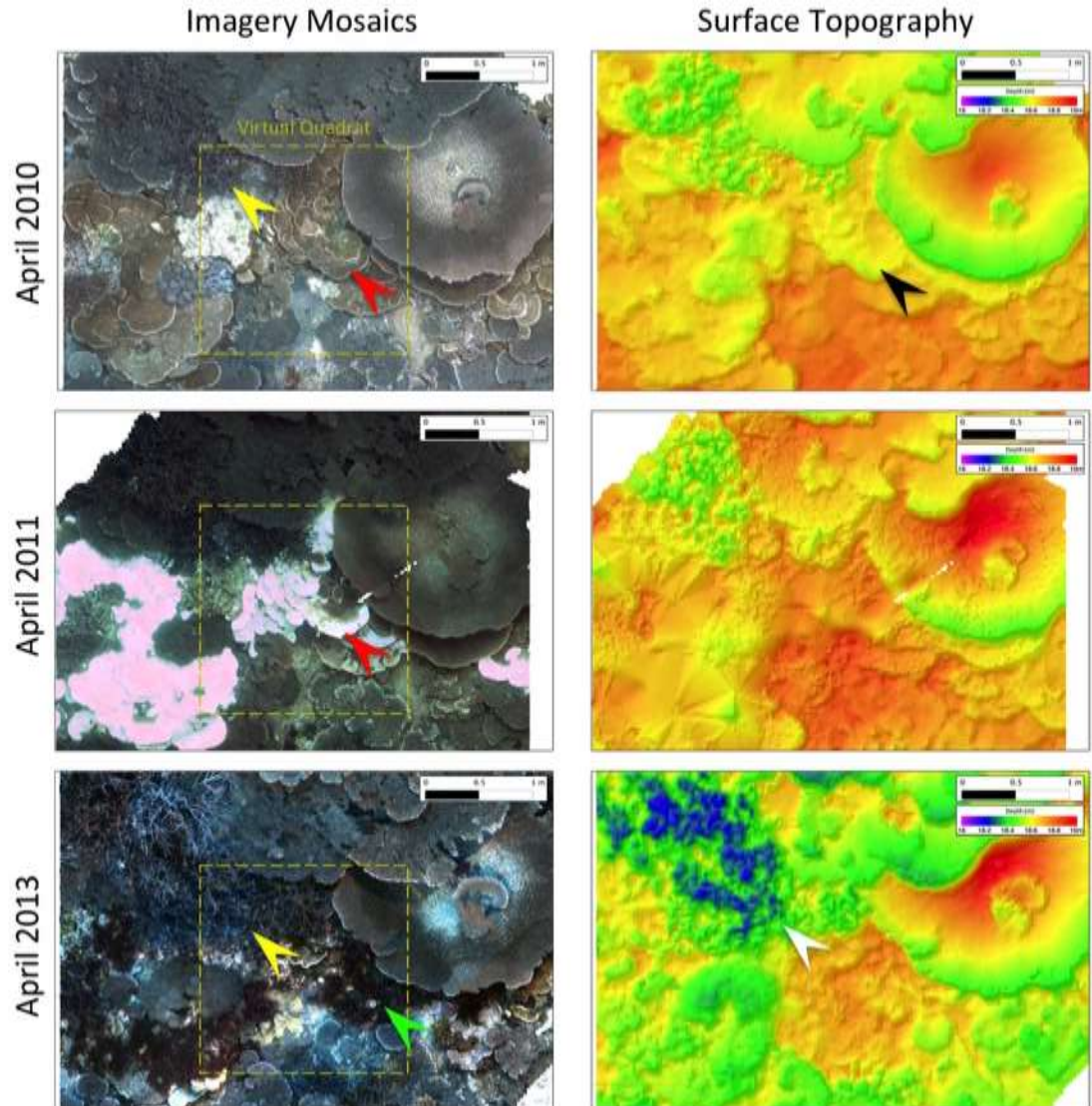


(d) April 2013



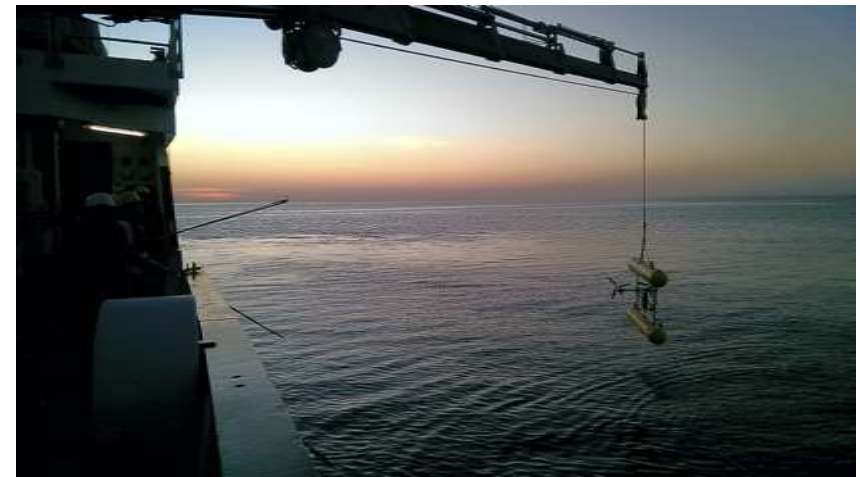
# REGISTERING MULTI-YEAR DATASETS

- Now examining detailed changes in structural complexity across plots
- Some areas show decreases in complexity due to mortality
- Others are increasing in complexity as branching corals begin to grow



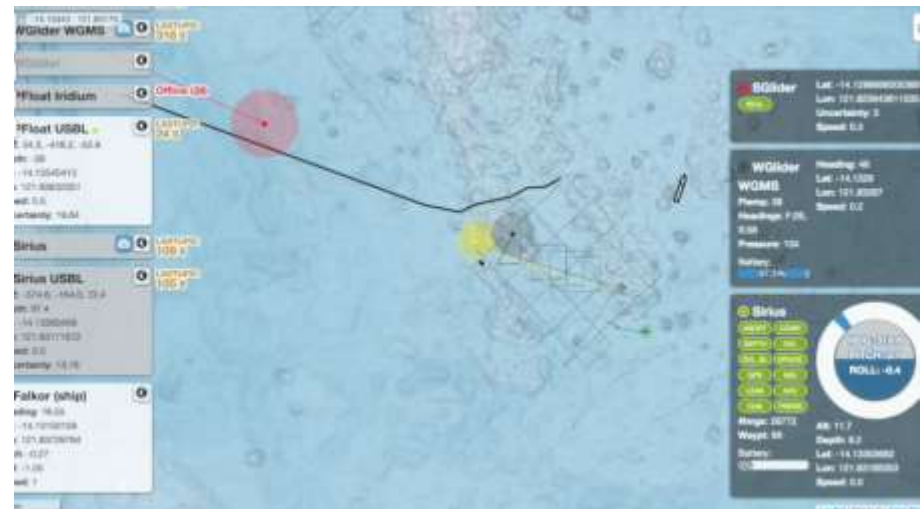
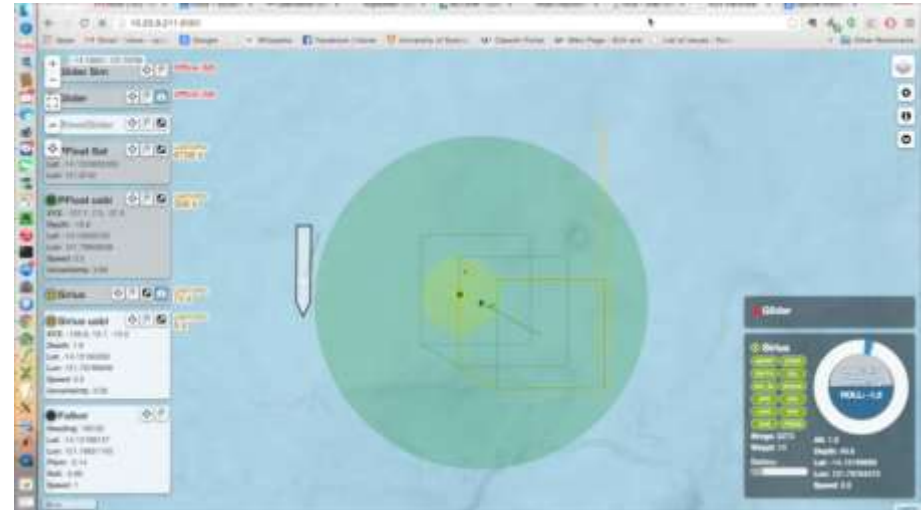
## MULTIPLE VEHICLE DEPLOYMENTS

- Latest expedition to Scott Reef in WA, supported by Schmidt Ocean Institute, aimed to demonstrate multi-vehicle, coordinated operations
  - ACFR: AUV Sirius, 2x Iver AUVs
  - URI: Imaging float
  - WHOI: Slocum glider
  - UH: Wave glider
  - EvoLogics: USBL Communications and tracking
- Surveying a 300 km<sup>2</sup> coral lagoon
- Live tracking of vehicles broadcast online
- Upload of images for online annotation and remote visit of ship to support outreach



## MULTIPLE VEHICLE DEPLOYMENTS

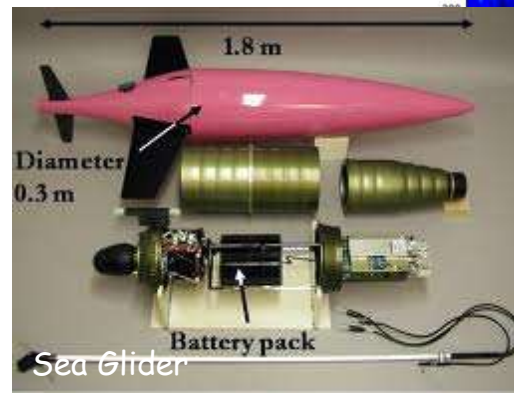
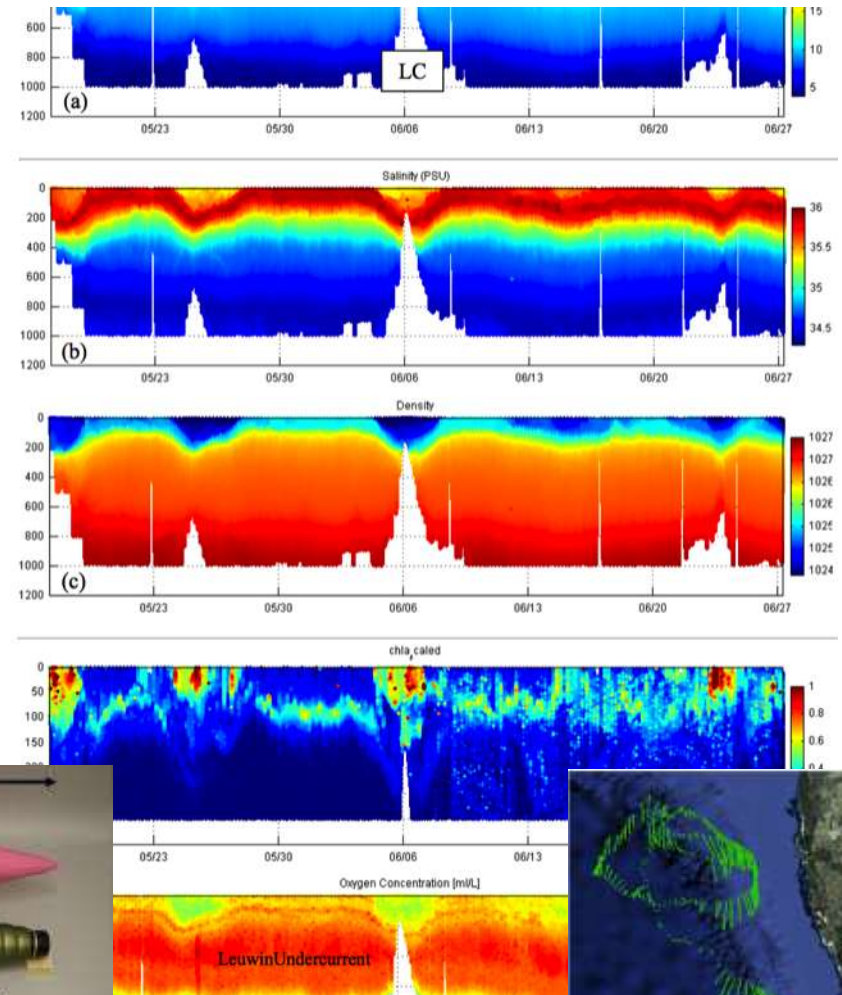
- One of the key building blocks for these multi-robot systems is the communications and visualisation infrastructure required to track multiple platforms
- Coordinated deployments of up to 4 platforms operating around ship
- Initial experiments conducted in online replanning and collaborative survey



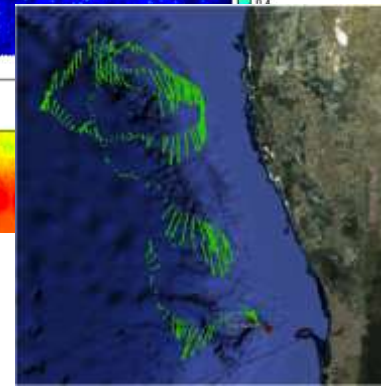


## LONG RANGE GLIDERS

- Oceanic gliders currently have endurances of several months using buoyancy engines
- New thermal propulsion mechanisms promise to extend these endurances to multi-year deployments



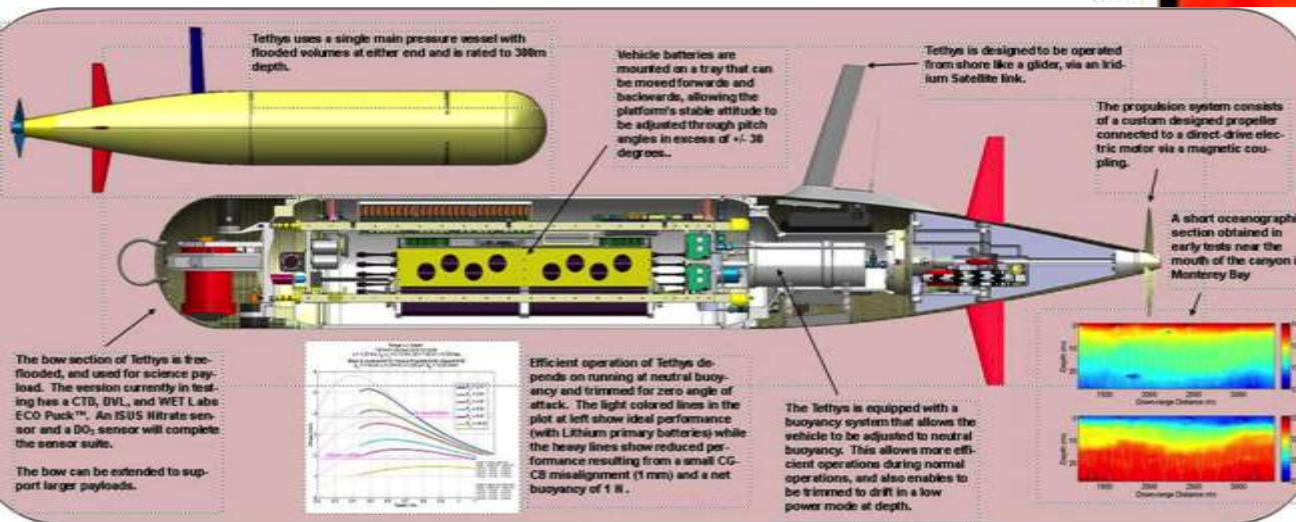
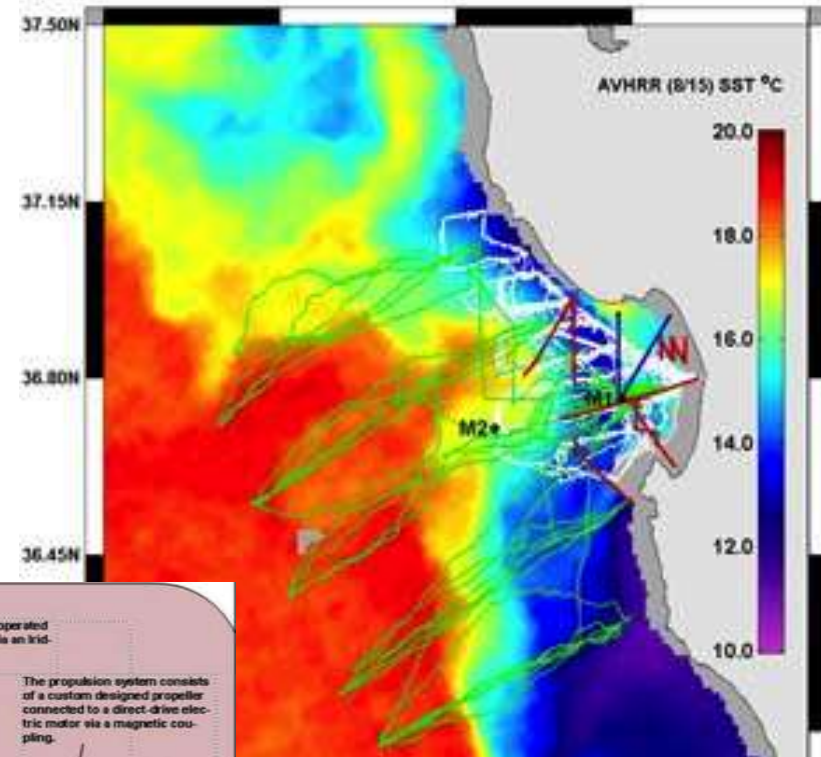
Images courtesy of Webb,  
U Washington and UWA





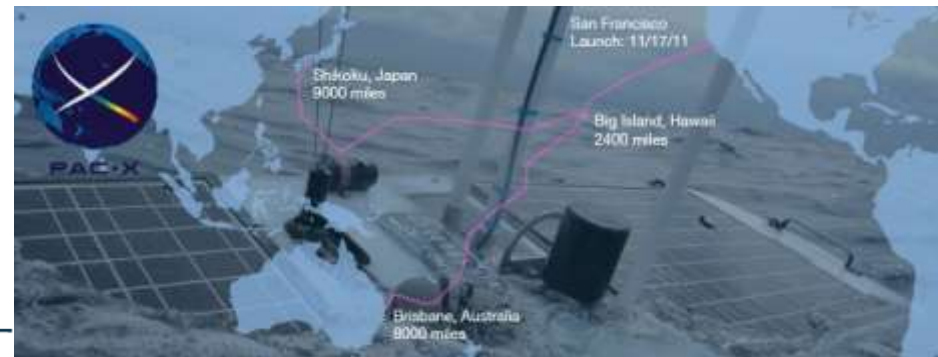
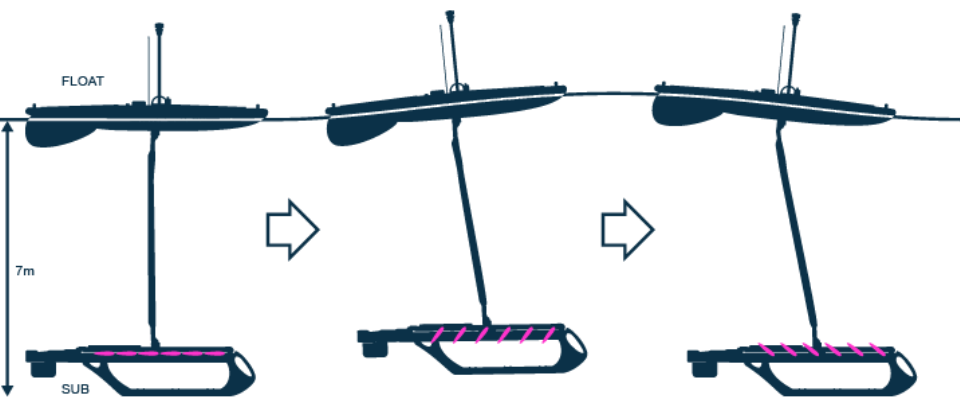
## LONG RANGE AUVS

- A number of organisations are now developing long range AUVs
  - MBARI: Tethys vehicle (range: 1000km)
  - Southampton: Autosub long range (range: 6000km)



## LONG RANGE USVS

- Wave glider uses wave energy for propulsion
- Long range/duration capability (recently completed ~17000 km crossing of Pacific)



## **FUTURE DIRECTIONS**

- Novel sensing payloads and vehicle systems
- Further improvements in navigation and planning
- Supervised autonomy under communication constraints
- Multi-vehicle, heterogeneous operations
- Adaptive mission planning
- Long term deployments
- Intervention (grasping and manipulation)

## CONCLUSIONS AND FUTURE WORK

- Fielding multi-robot systems requires considerable engineering work in addition to algorithmic development to build reliable systems
- Engaging with end user communities in exploring the application of these technologies to a variety of application domains
- Exciting challenges and novel applications likely to drive developments in these areas



## ACKNOWLEDGMENTS

- Thanks to the whole team at the ACFR who have facilitated this work and to our sponsors and partners, some of whom are listed here



Australian Government  
Australian Research Council



**RIO  
TINTO**



Australian Government  
Department of Defence  
Defence Science and  
Technology Organisation



MINISTRY OF DEFENCE



Australian Government  
Land & Water Australia



국 방 과 학 연 구 소  
Agency for Defense Development



**KOMATSU**



Australian Government  
Department of Agriculture,  
Fisheries and Forestry



Horticulture Australia



**RENAULT**



U.S. AIR FORCE

