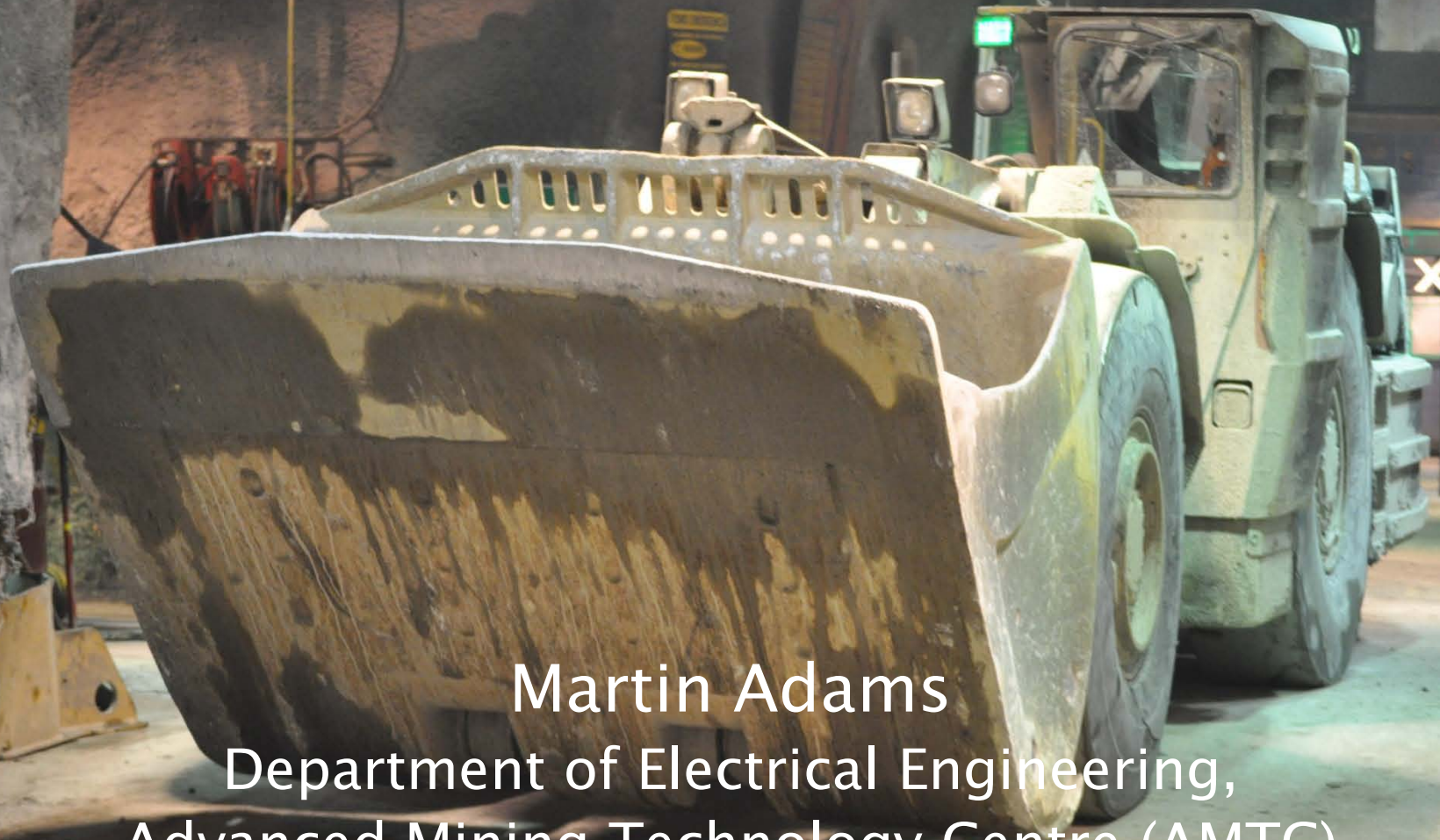


EL7031 Robotics & Autonomous Systems

Martin Adams

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Advanced Mining Technology Centre (AMTC)
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Presentation Outline

1. Autonomous Robotics in Society.
 2. Robotics Research at ARRL.
 - Radar Mapping & Traffic Monitoring.
 - Coastal and Marine Monitoring.
 - Feature Extraction with Vision/3D Laser Range Data.
 3. Simultaneous Localisation & Map Building (SLAM).
 - What is SLAM – Fundamentals?
 - Difficulties in SLAM – Data Association.
 4. Future Work in Robotics.
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Autonomy in Urban Environments



DARPA Urban Challenge.

Sensor based road lane & pedestrian detection.

Perform complex manoeuvres – merging, passing, parking, interaction with manned vehicles [Thrun 2007, Leonard 2007].



Singapore: TechX Challenge

Localisation, Path Planning, Object Recognition & Interaction [Adams 2009].

Autonomy in Mines/Rugged Terrains



Sensing Issues:
Millimetre Wave Radar in
Surface Mining
[Brooker 2006].

Rio Tinto + ACFR developing autonomous mining technologies [Durrant-Whyte 2007]

Codelco developing unmanned haulage system “FrontRunner” at Gaby copper mine, Chile [Komatsu 2007]



Intelligent Transportation Systems (ITS)



Platooning and Vehicle Following.
Optimisation and monitoring of traffic
flow needed. [Martinet et. al. 2005, Broggi 2000,
Parent 1996].

ITS Austria: Traffic
monitoring & optimisation.
[Corvette/Connect Projects].



INRIA (Schiphol/Heathrow
Airport Passenger Pick up).

Service Robotics



Autonomous straddle carriers – [ACFR](#) port automation projects in Brisbane & Singapore, [\[Durrant-Whyte 2007\]](#).

Hospital vehicles for delivery of food/laundry in Singapore [\[Swisslog\]](#).

Rehabilitation robotics [\[Tomatis – BlueBotics 2008\]](#)



Security Robotics



Surveillance and monitoring vehicles capable of indoor/outdoor motion. [\[Adams 2004\]](#).

KIRAS – Security Research [\[Austrian FFG – protection of infrastructure\]](#).

Security Robotics



Surveillance and monitoring vehicles capable of indoor/outdoor motion. [Adams 2004].

KIRAS – Security Research [Austrian FFG – protection of infrastructure].

Remaining issues:

Sensor modelling & fusion.

Robust localisation/object representation
– SLAM in complex environments.

System Flexibility: Path re-planning/unexpected situations.

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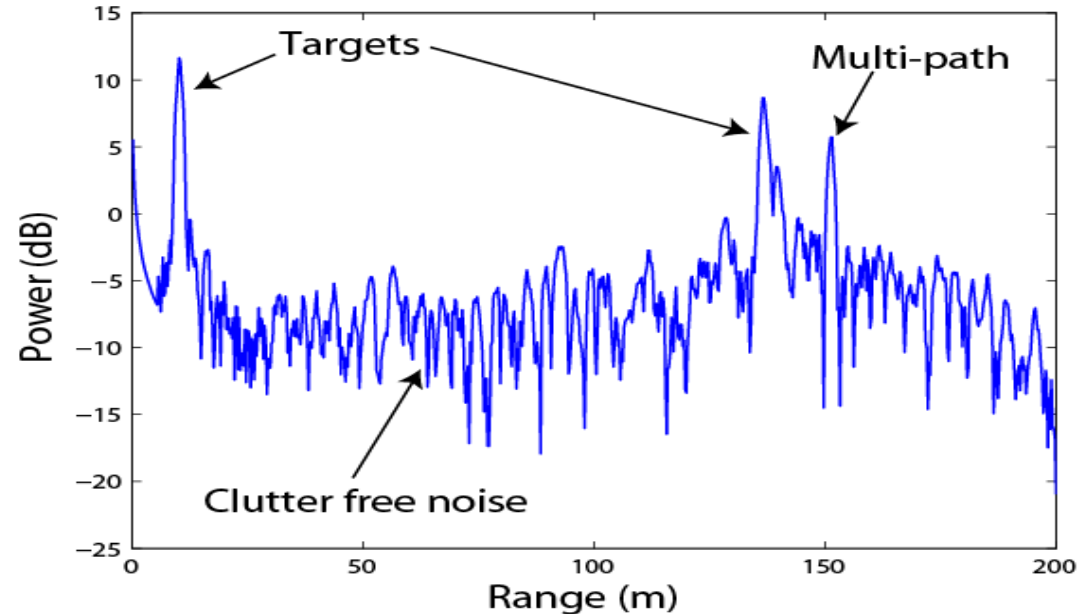
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Panasonic: People & Traffic Detection with Radar

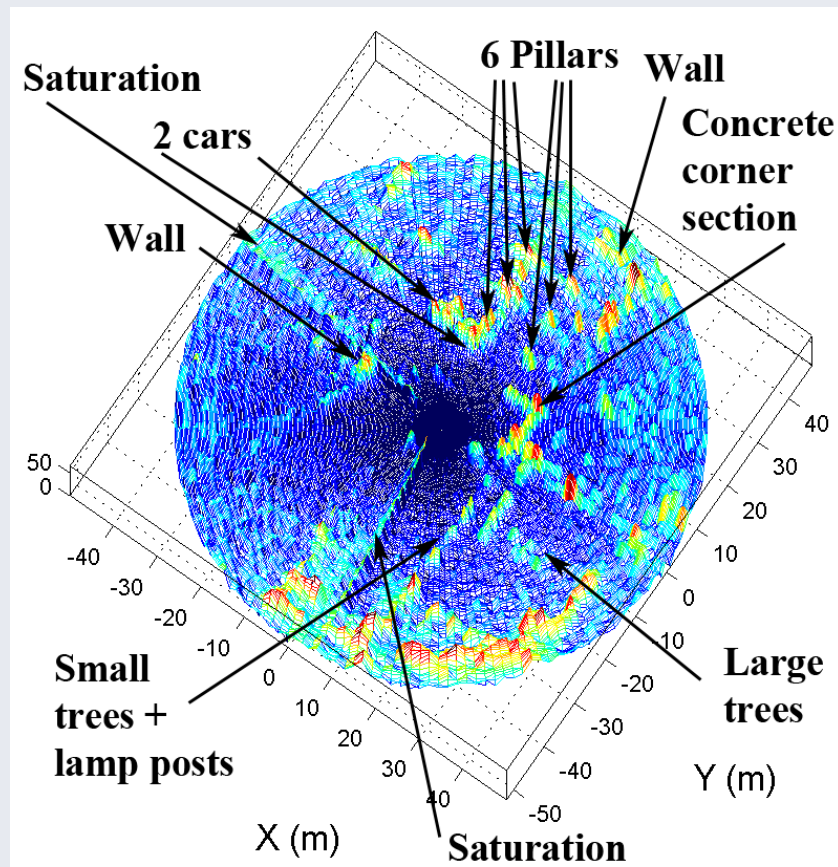
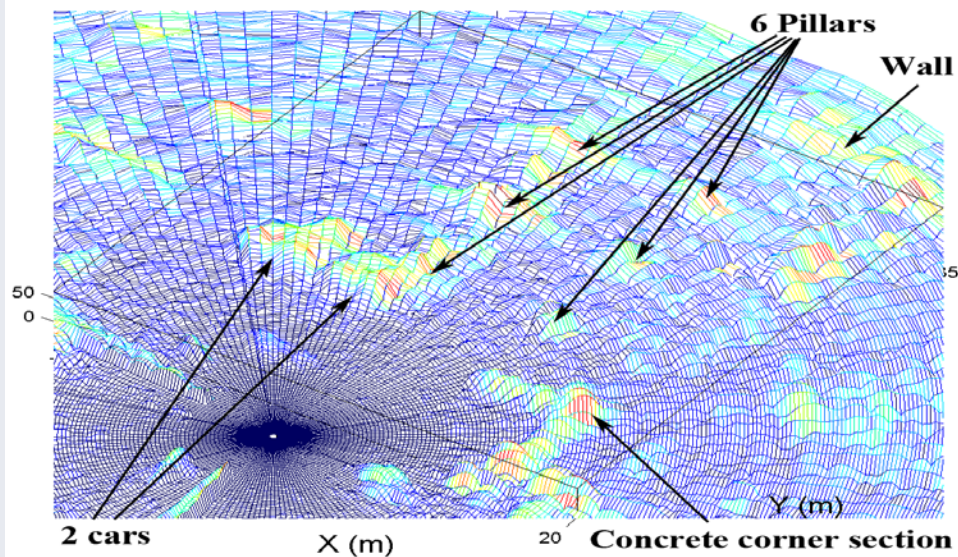
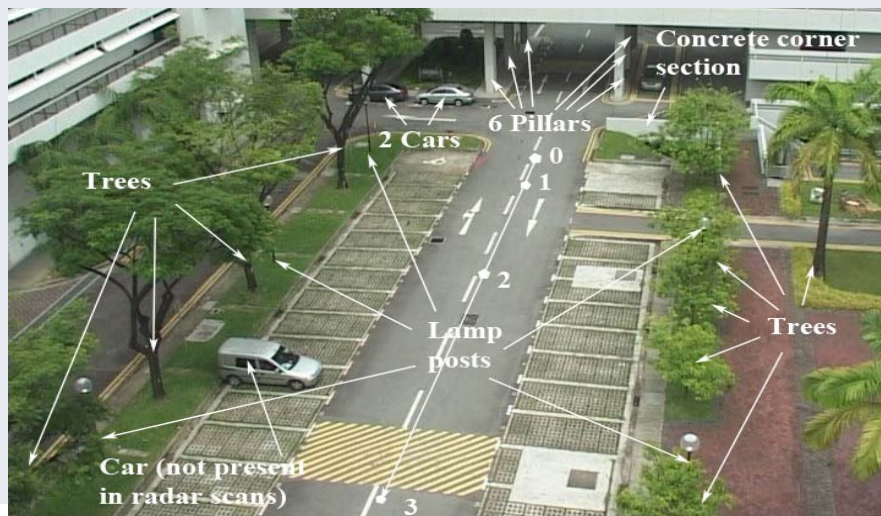
Millimetre Wave Radar



- 360 deg. scanning unit, 77GHz FMCW
- 0.25m range res., 200m max range
- Per Bearing angle -> **Multiple Targets**
- 1.8 deg. beam width

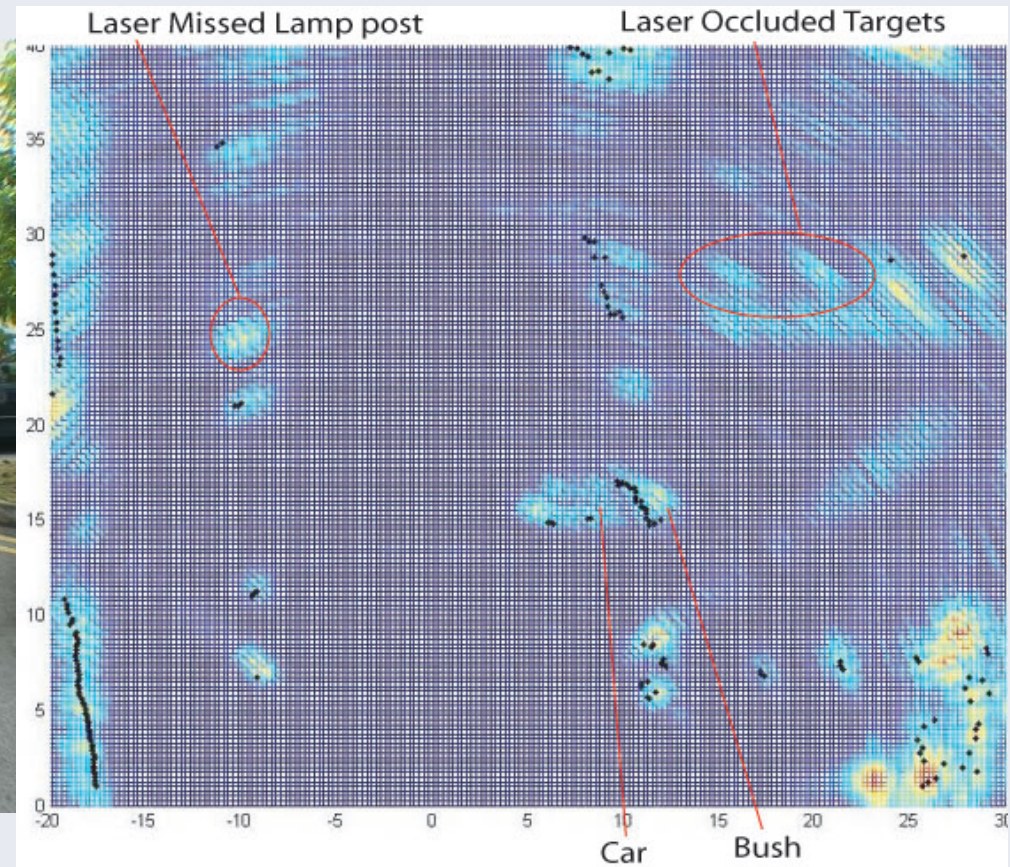


Advantages of Radar



Advantages of Radar

- ✓ **Wider beam width**
- ✓ **Foliage penetration**



Panasonic: People Tracking at Road Junctions

Transverse Length of
road crossing: 13m



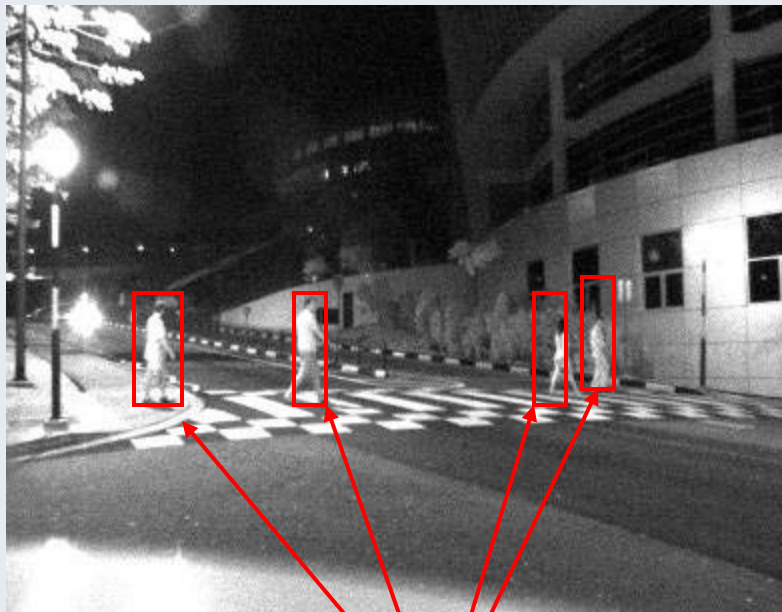
Road crossing 13m from radar
(min. detection range 5m)

- Use of Radar for adverse weather/atmospheric conditions.
- Robust detection of pedestrians and traffic [Mullane, Adams 2009]
- Purpose: To transmit traffic information to drivers for advanced warning systems.

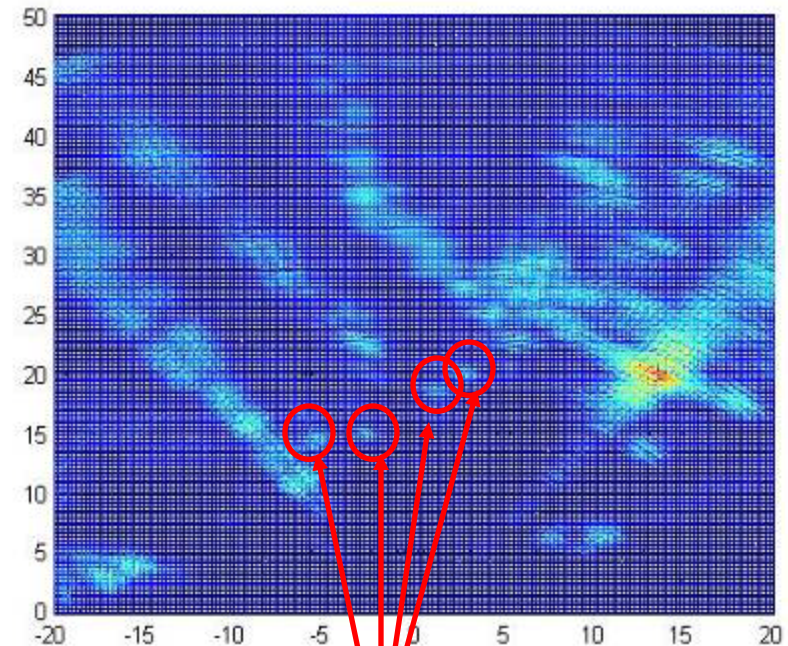
Location: A pedestrian crossing
within NTU campus

Panasonic: People Tracking at Road Junctions

Road crossing environment (Near IR image Vs. Radar image)



4 Pedestrians crossing



4 Pedestrian targets detected

At Night

Singapore – MIT Alliance: CENSAM Project

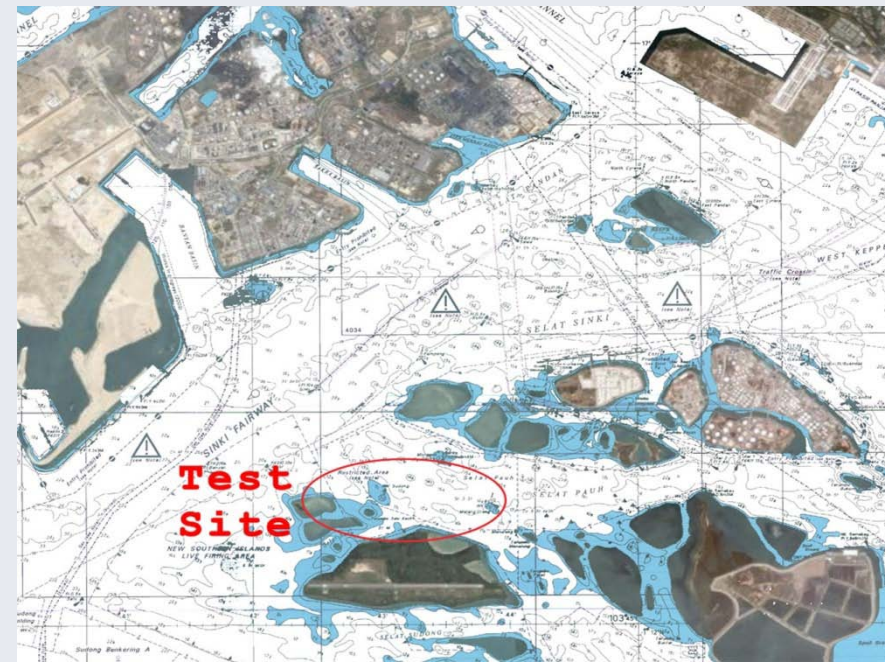
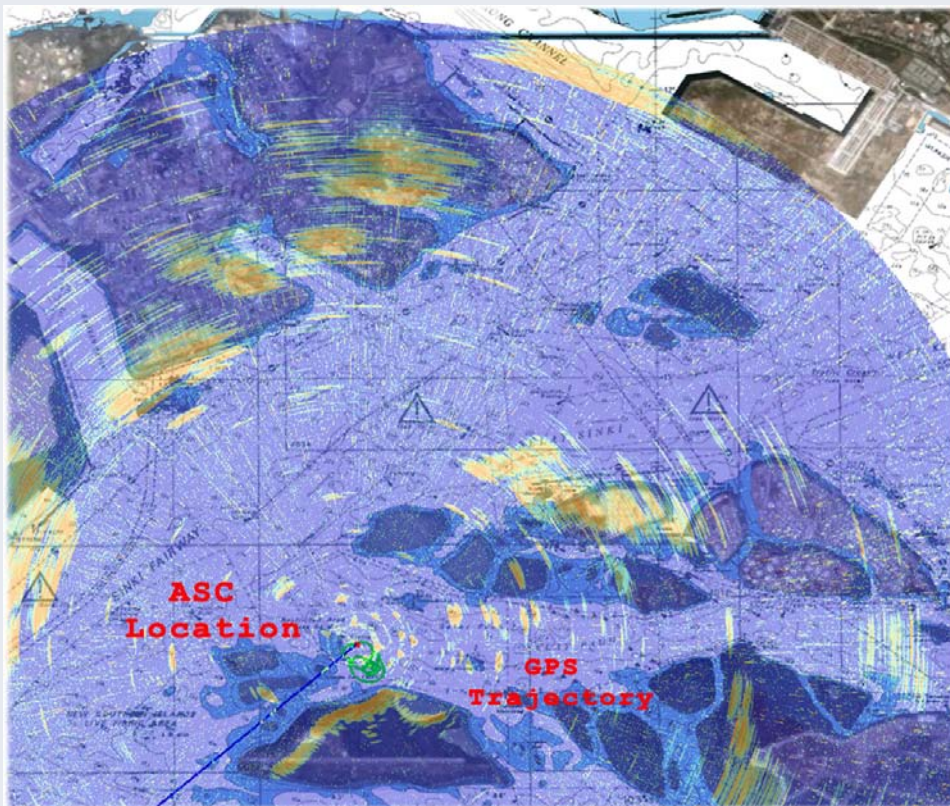
- Environmental monitoring of coastal waters.
- Navigation and map info. necessary above/below water surface.
- Fusion of sea surface radar, sub-sea sonar data for combined surface/sub-sea mapping.



Autonomous Kayak Surface Vehicle with Radar

Singapore – MIT Alliance: CENSAM Project

- Surface and sub-sea data.
- Verification of radar/sonar data with coastal satellite images.



A*Star: Fusing 3D LADAR & Vision [Sok, Adams 2009]

3D Laser Detection and Ranging

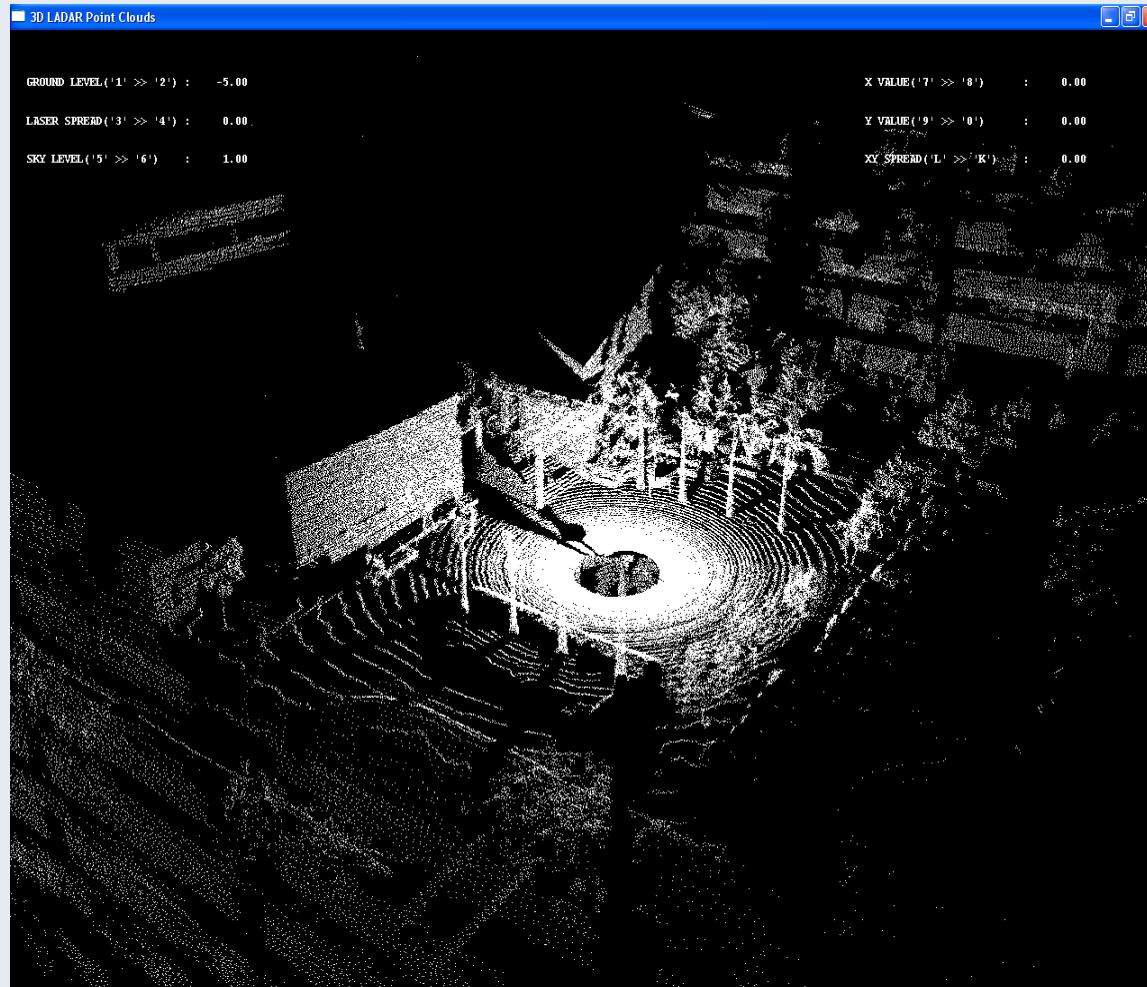


- Continuous 360° scanning unit.
- 200m max range.
- Time of Flight pulsed Riegl LADAR
- Accuracy (1 Sigma) 2cm.



A*Star: Fusing 3D LADAR & Vision [Sok, Adams 2009]

3D Laser Detection and Ranging



- 3D Point Cloud Data.
- Planar/Linear Segments visible.
- Data Compression with Principle Component Analysis (PCA).
- PCA unreliable on complete data sets.
- First Image Segmentation Necessary.

OpenGL2

A*Star: Fusing 3D LADAR & Vision [Sok, Adams 2009]

Omni-Directional Vision

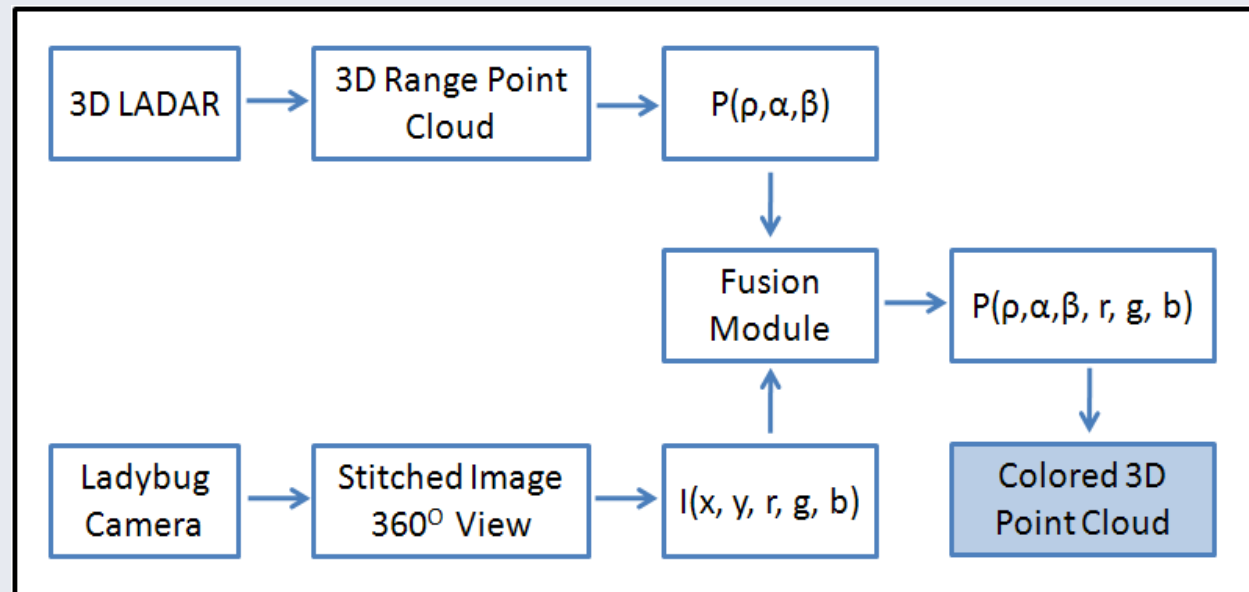


- Point Grey Lady Bug 2 – Panoramic camera.
- Approx. calibrate 3D LADAR data with image coords.
- Can be mounted coaxially with 3D LADAR.
- Stitch, Smooth and Segment Images
- Process 3D LADAR segments only.



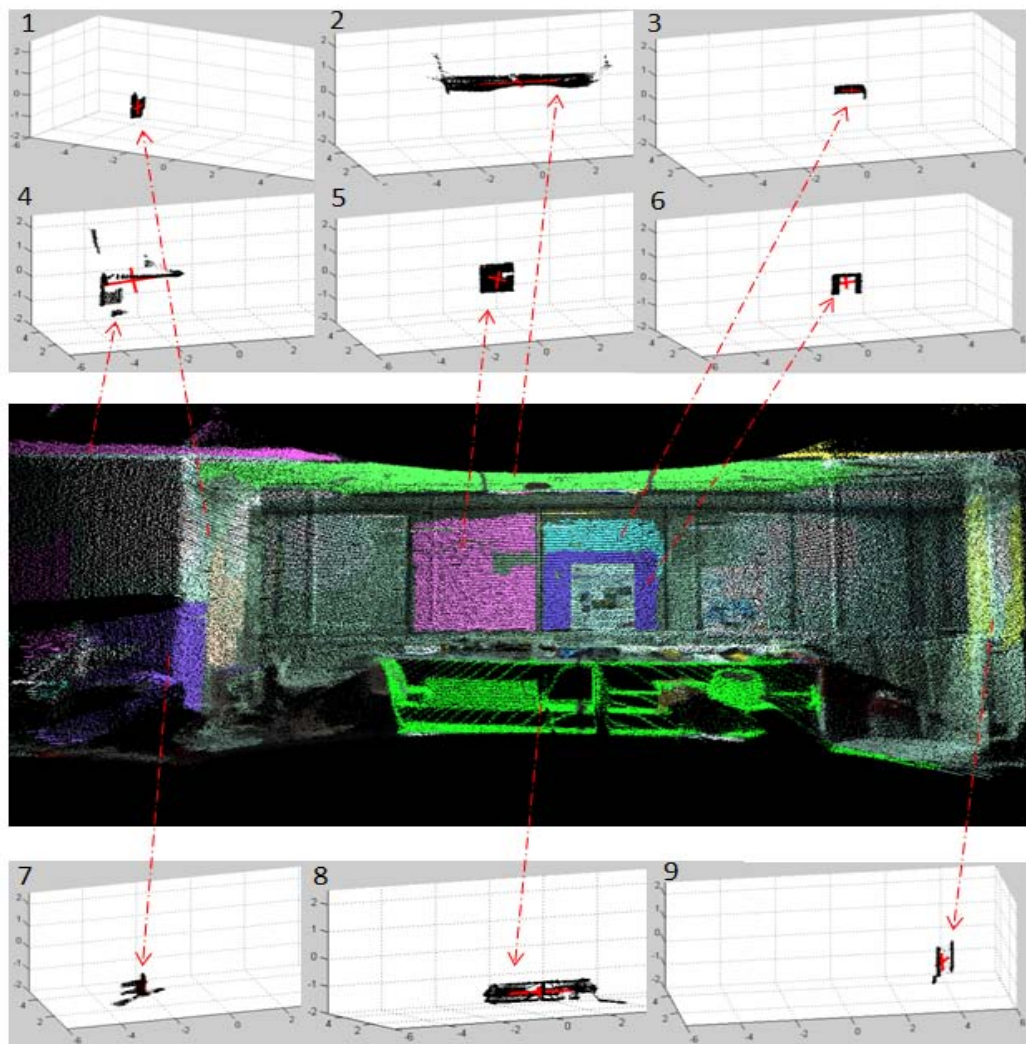
A*Star: Fusing 3D LADAR & Vision [Sok, Adams 2009]

Approx. calibrate 3D ladar + camera data $\rightarrow$ Coloured 3D point cloud.

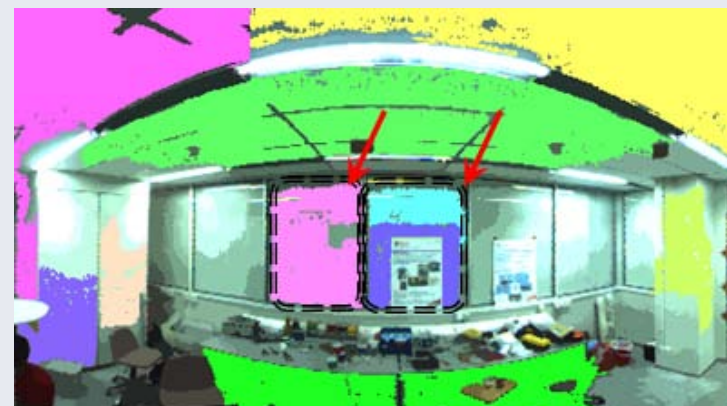


OpenGL2

PCA: Dominant Data Directions, Extracted Planes



Section of Original Image



Segmented Image

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SLAM Fundamentals

- In an unknown environment – robot & feature positions *must* be estimated simultaneously – SLAM.
- SLAM is a probabilistic algorithm

$$p(x_t, m \mid z_{1:t}, u_{1:t})$$

x_t = State of the robot at time t

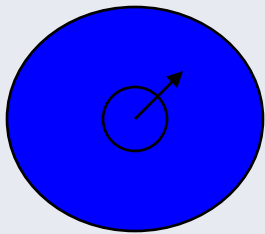
m = Map of the environment

$z_{1:t}$ = Sensor inputs from time 1 to t

$u_{1:t}$ = Control inputs from time 1 to t

- Update distribution estimate with Bayes theorem.
-

SLAM Fundamentals

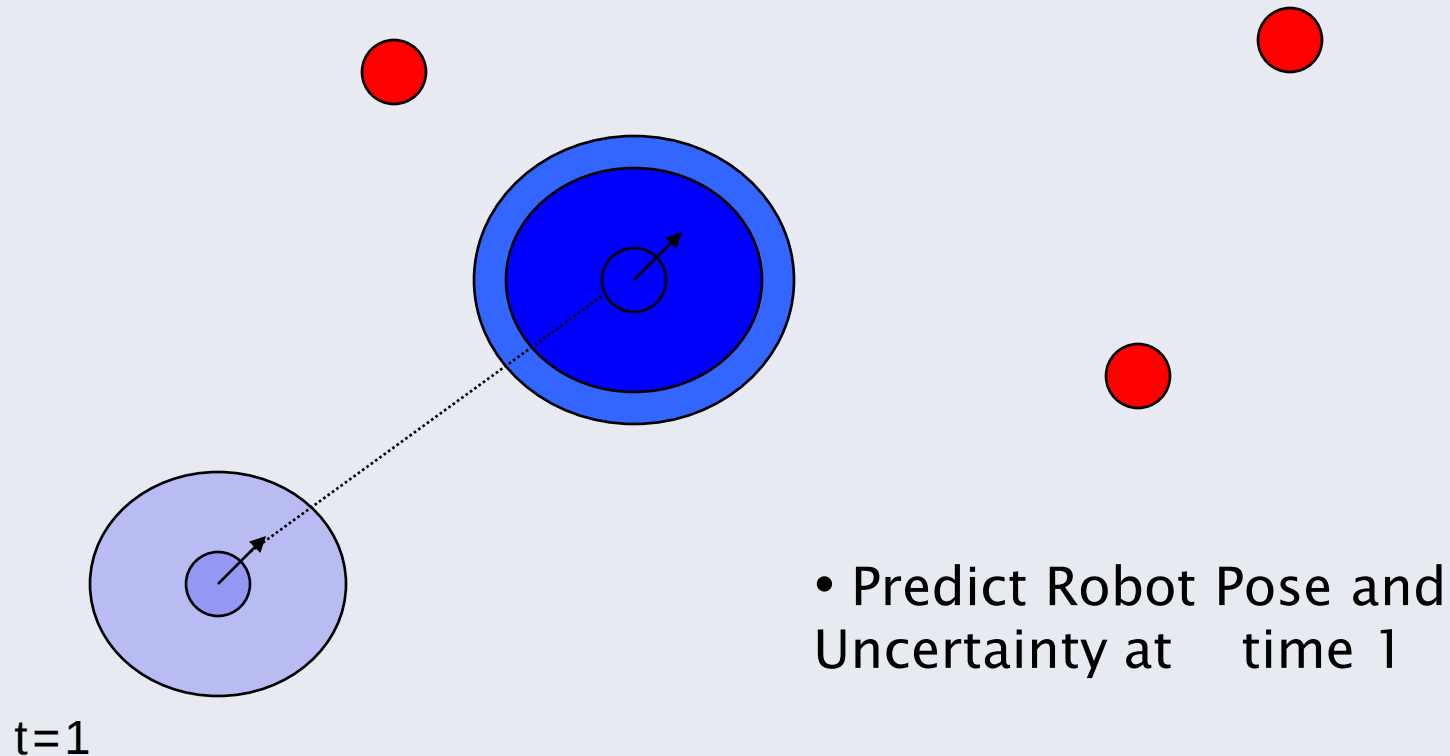


t=0

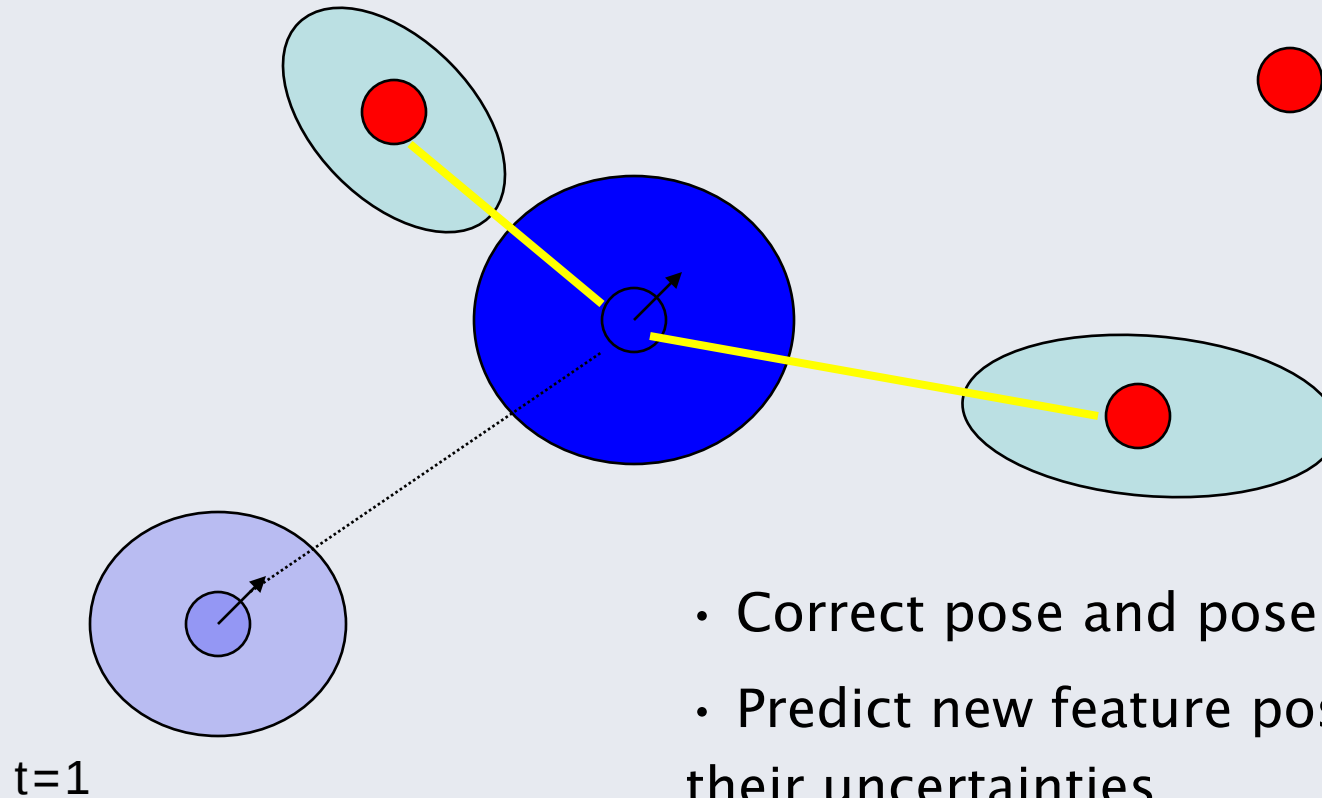


- Initial State and Uncertainty
- Using Range Measurements

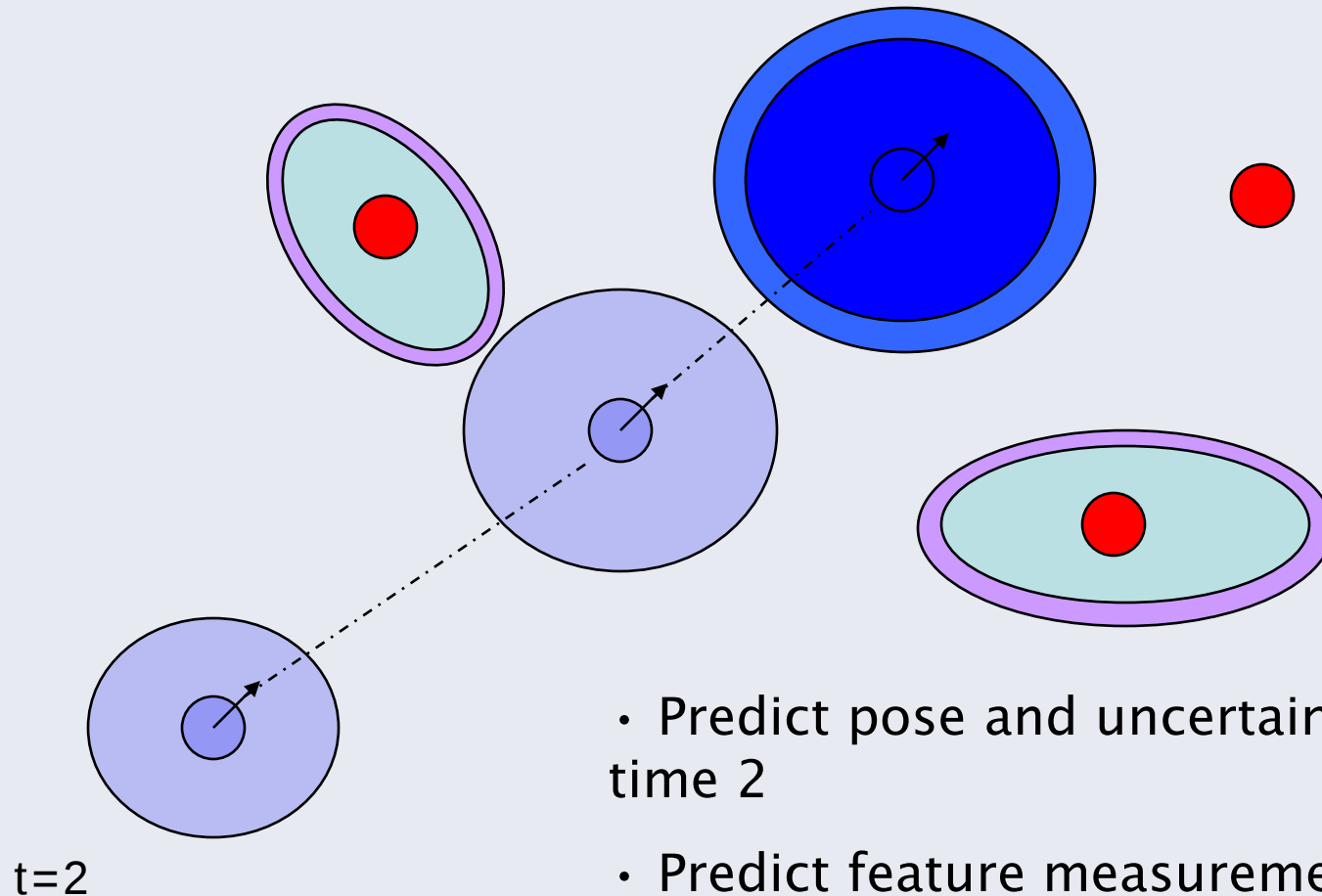
SLAM Fundamentals



SLAM Fundamentals

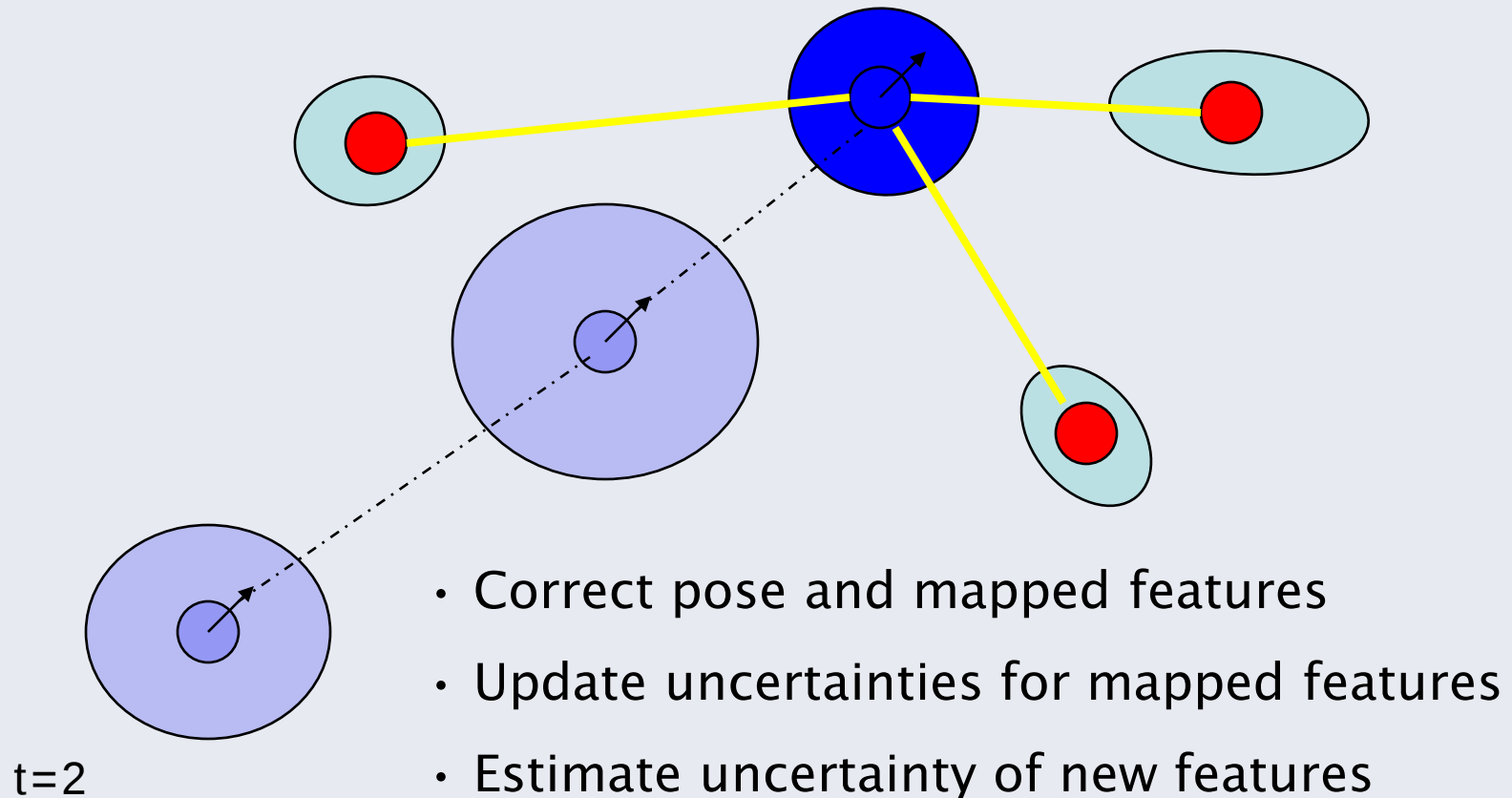


SLAM Fundamentals

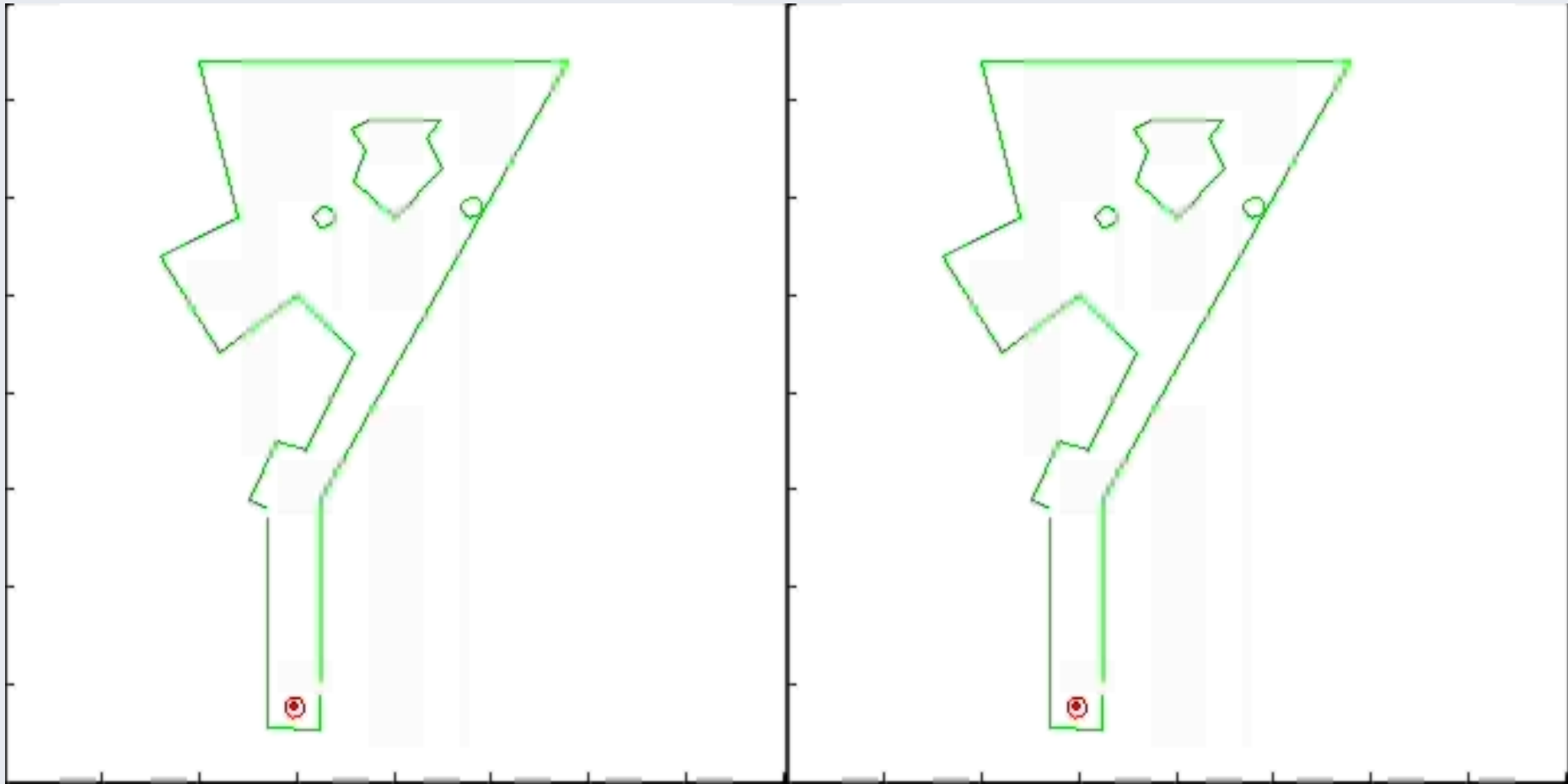


- Predict pose and uncertainty of pose at time 2
- Predict feature measurements and their uncertainties

SLAM Fundamentals



SLAM: A Real Experiment



SLAM using line intersection features in 80m by 35m office corridors.

Vid 4, Vid 5

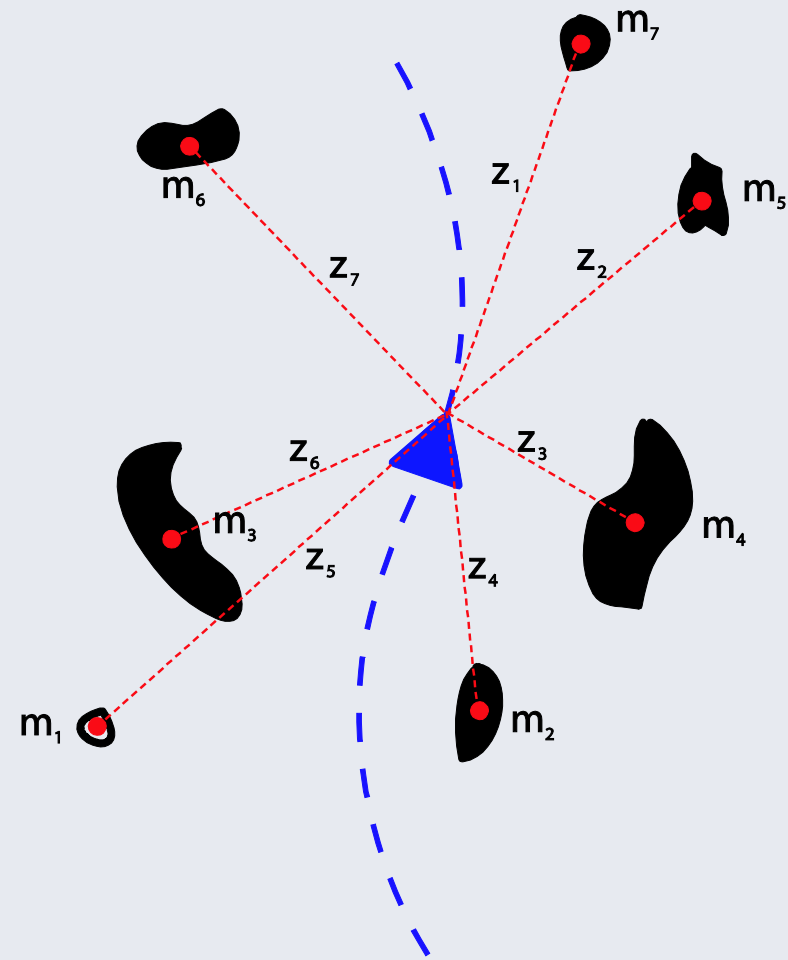
Difficulties of SLAM – Data Association

Untangle:

$$\mathbf{Z} = [\mathbf{z}_1, \mathbf{z}_2, \mathbf{z}_3, \mathbf{z}_4, \mathbf{z}_5, \mathbf{z}_6, \mathbf{z}_7]$$

?

$$\mathbf{M} = [\mathbf{m}_1, \mathbf{m}_2, \mathbf{m}_3, \mathbf{m}_4, \mathbf{m}_5, \mathbf{m}_6, \mathbf{m}_7]$$

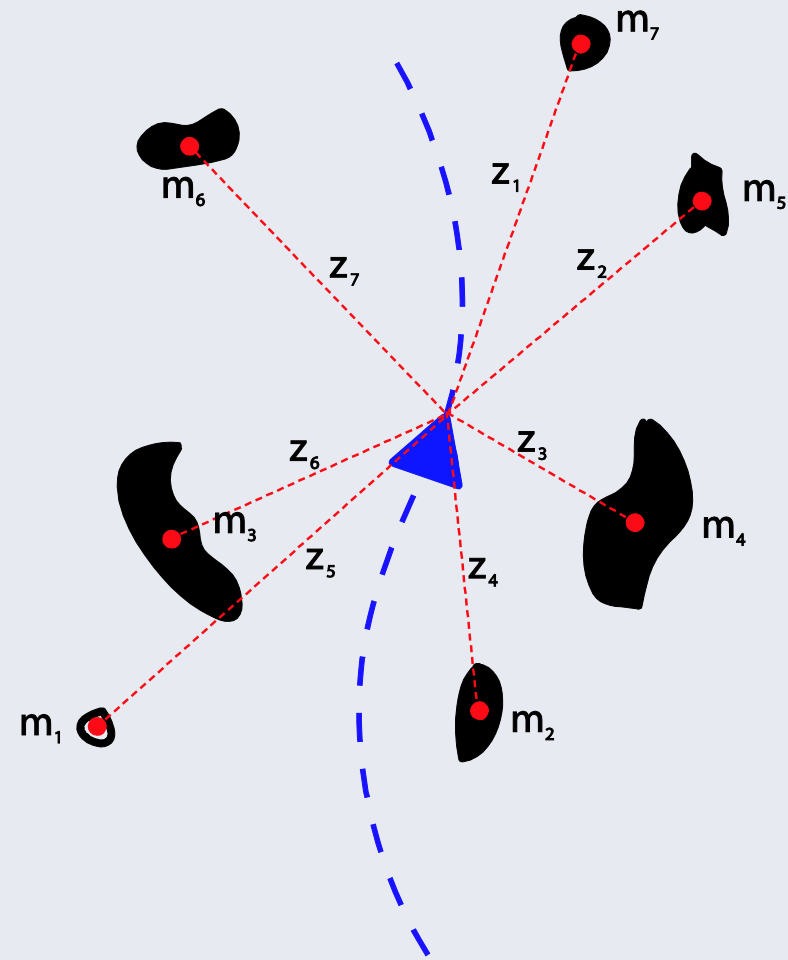


Difficulties of SLAM – Data Association

Untangle:

$$\mathbf{Z} = [z_1, z_2, z_3, z_4, z_5, z_6, z_7]$$

$$\mathbf{M} = [m_1, m_2, m_3, m_4, m_5, m_6, m_7]$$

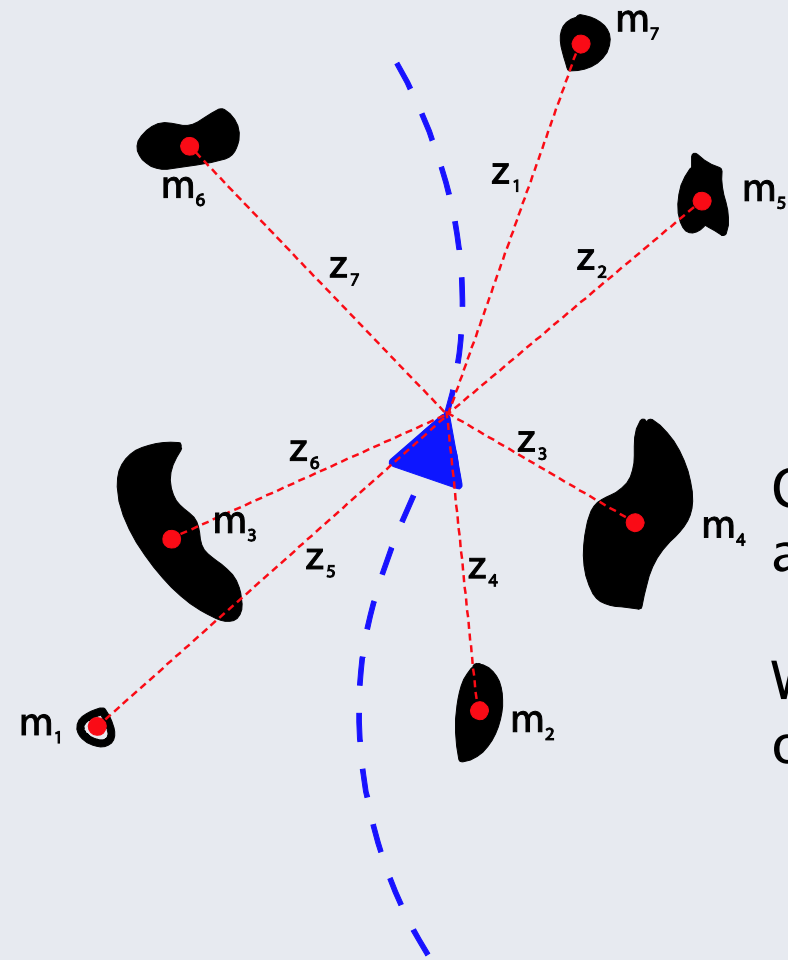


Difficulties of SLAM – Data Association

Untangle:

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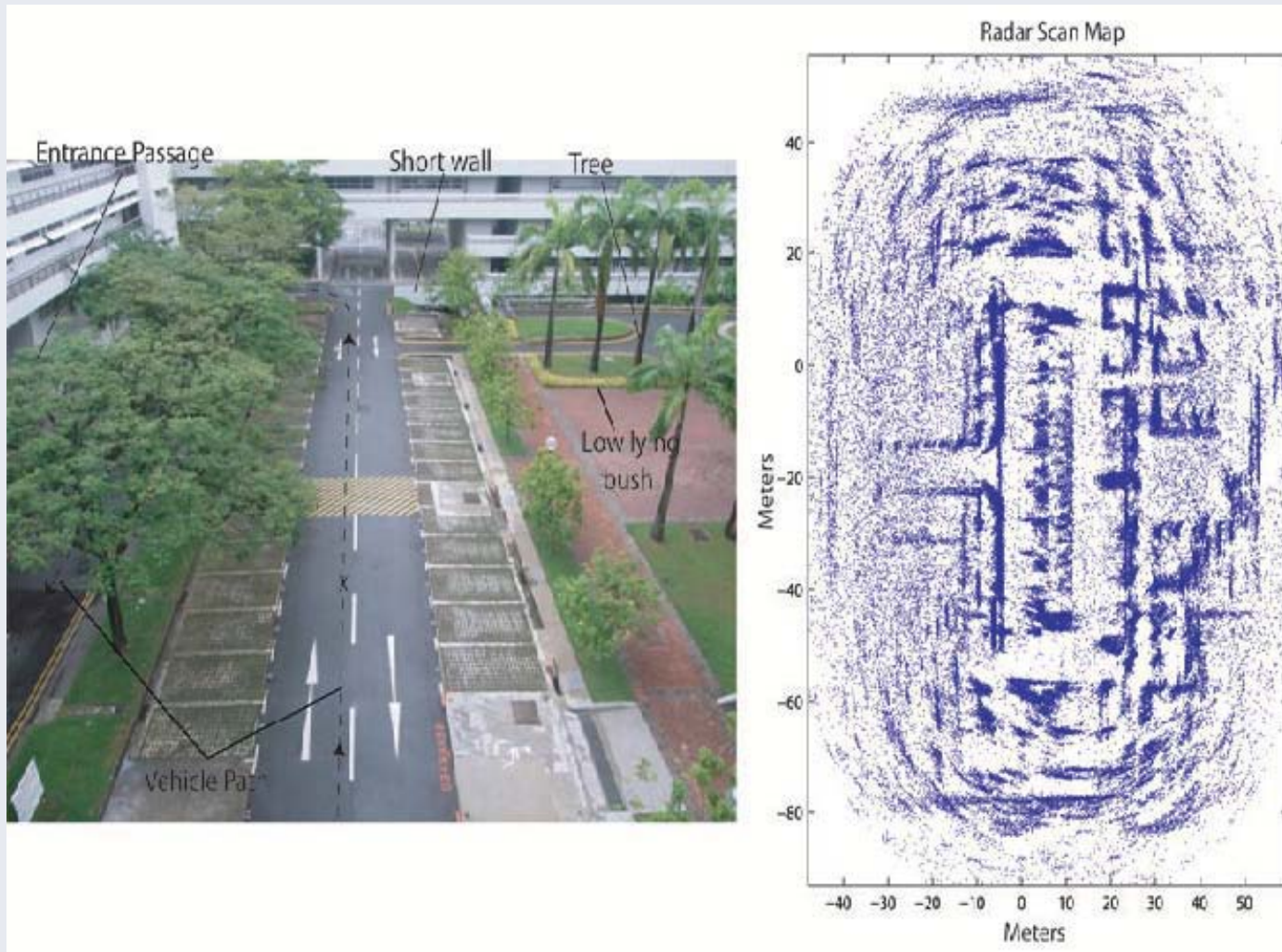
$$\mathbf{M} = [\mathbf{m}_1, \mathbf{m}_2, \mathbf{m}_3, \mathbf{m}_4, \mathbf{m}_5, \mathbf{m}_6, \mathbf{m}_7]$$



Current vector formulations *require* data association (DA) prior to Bayesian update:

Why? Features & measurements rigidly ordered in vector-valued map state.

Difficulties of SLAM – Data Association

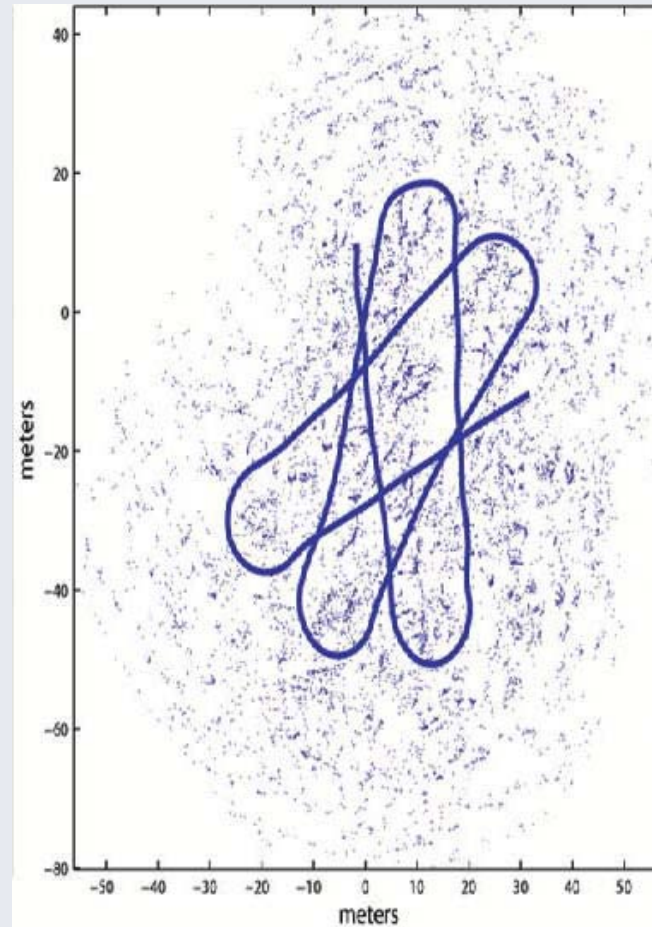


Sample data registered from radar.

Vid 1

Difficulties of SLAM – Data Association

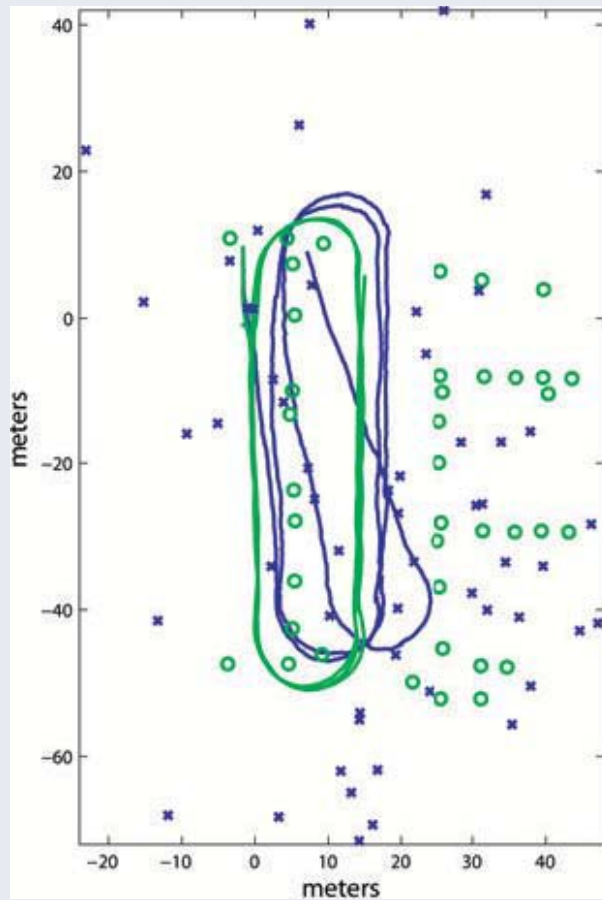
SLAM input: Odometry path + radar data



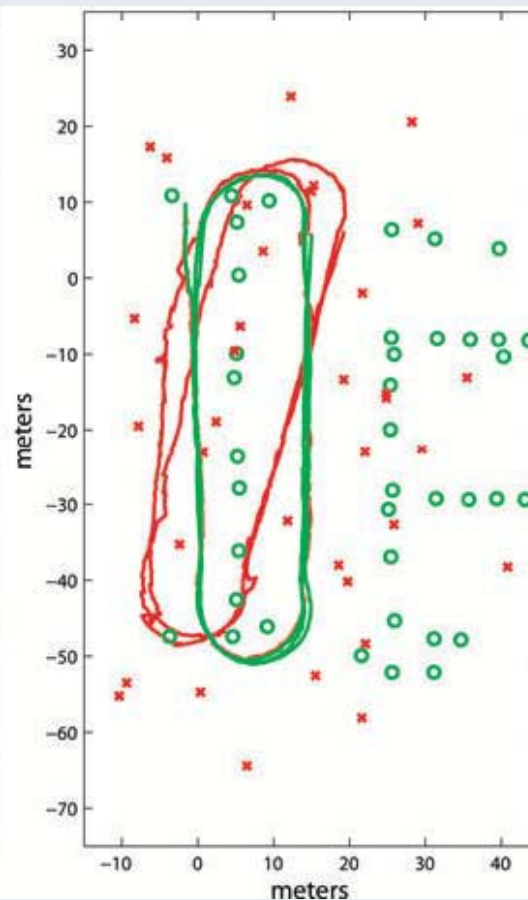
Extracted point feature measurements registered to odometry.

Difficulties of SLAM – Data Association

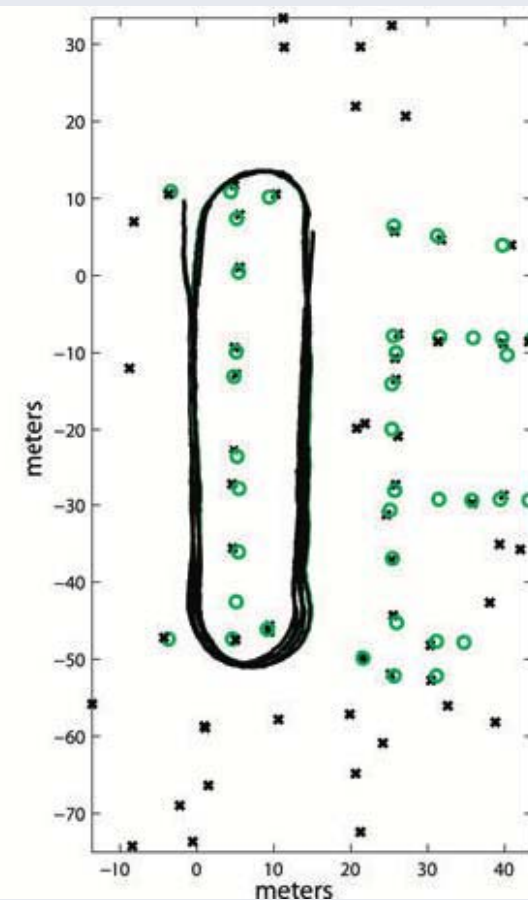
NN-EKF



FastSLAM



PHD-SLAM



EKF, FastSLAM and PHD-SLAM with Radar data.

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Mechatronic Autonomy in Mines/Rugged Terrains



- **Caterpillar**: “CAT Integrated Object Detection”
Fusion of radar/vision for object detection
[Australian Mining, 2009].
 - **Rio Tinto + ACFR** developing autonomous mining technologies [Durrant-Whyte 2007].
 - **Codelco** developing unmanned haulage system “FrontRunner” at Gaby copper mine, Chile [Komatsu 2007].

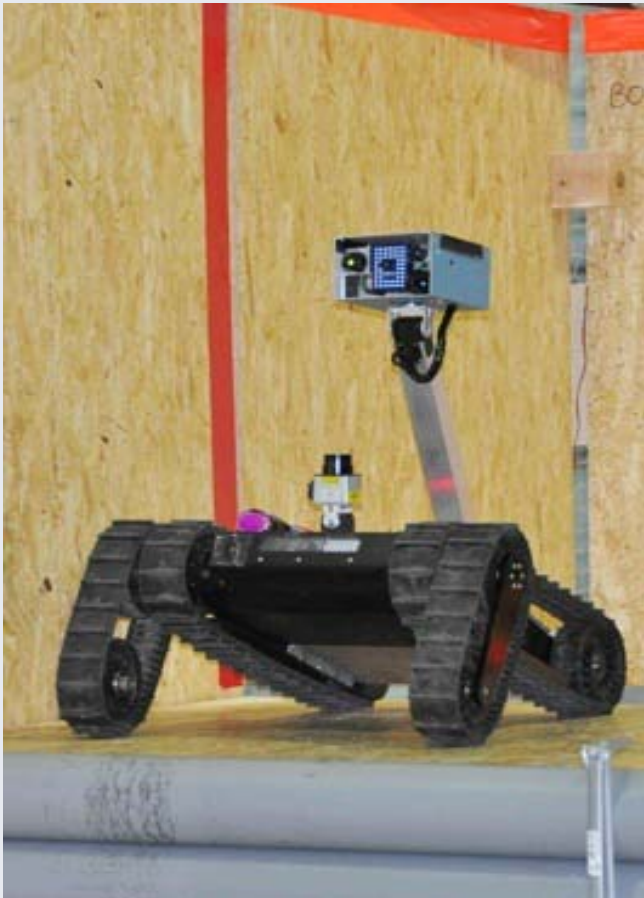


- **Acumine**:
Millimetre
Wave Radar in
Surface Mining
[Brooker 2006].



Sensing & Mechatronics for Search & Rescue

Thredbo Landslide:
Mechatronic Search & Rescue Aids
called for [\[ABC News\]](#).



Rescue Robotics – Challenges:
Mechanical Design & Traction,
Obstacle Avoidance,
Victim Detection,
Localisation & Path Planning.

(UTS USAR Vehicle [\[Valls Miro, Gamini 2009\]](#).)

Navigation in Complex Environments

Navigation in the presence
of clutter.

...on land.



Victoria Park Data Set
[ACFR, University Sydney].

Navigation in Complex Environments



Australian Institute of Marine Science & ACFR: AUV “Sirius” for underwater monitoring. [Stefan Williams 2007].

BHP Billiton: Sponsors Trials At Ningaloo Reef for testing suitability of robots for reef monitoring. [Stefan Williams 2007].



Navigation in Complex Environments



Australian Institute of Marine Science & ACFR: AUV “Sirius” for underwater monitoring. [Stefan Williams 2007].

Successful sensing & navigation required in environments with complex feature representations, disturbed by clutter.

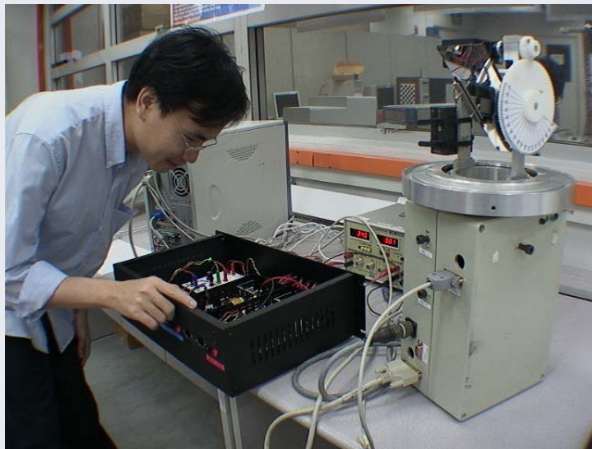
BHP Billiton: Sponsors Trials At Ningaloo Reef for testing suitability of robots for reef monitoring. [Stefan Williams 2007].



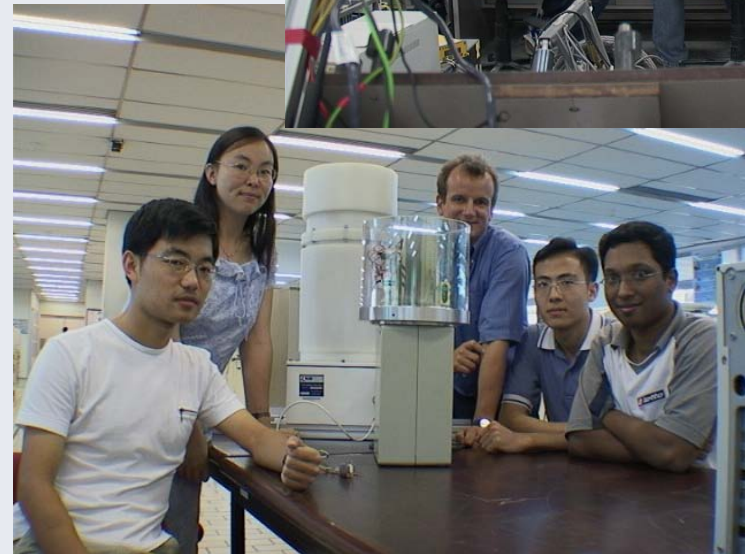
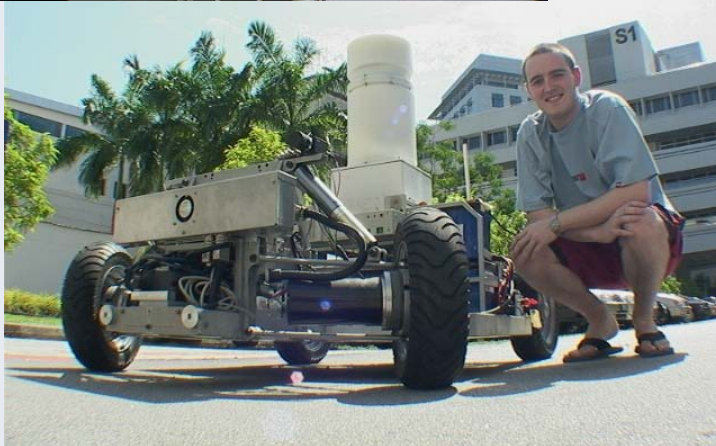
Motivation for Robotics & Autonomous Systems

1. Improve robustness of autonomous sensing systems.
 2. Radar for pedestrian/traffic monitoring in ITS.
Improve traffic safety through sensor technologies.
 3. Surface & sub-sea joint environmental/navigation estimation.
 4. Extend 3D sensor fusion technologies in scene inspection & security research – Application in mining.
 5. Probabilistic sensor modelling – improve robustness to sensor bias, random walk, clutter, false alarms and missed detections.
 6. Improve fundamental aspects of SLAM – Random Finite Set (RFS) rather than vector based map representations.
-

Thank You & Acknowledgements



The Research
Team:



John Mullane, Ba-Ngu Vo, Jonathon Chee Weng, Chhay Sok, Liu Bingbing, Ebi Jose, Tang Fan, Lochana Perera, Zhang Sen, Zen Koh, Bimas Winaju, Andy Shacklock, Akshay Rao, Tan Chai Soon!

Thank You!



Codelco, Rancagua, 30. September 2011