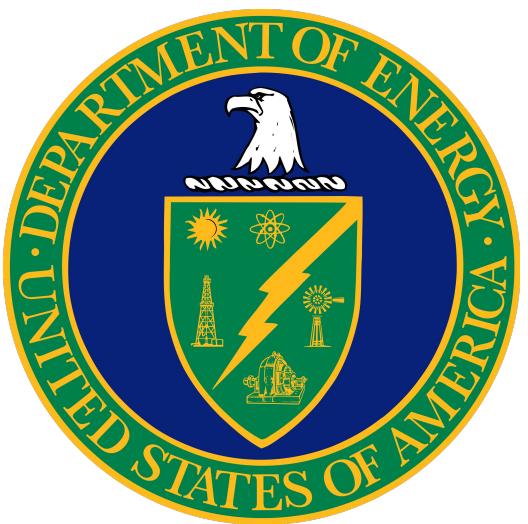
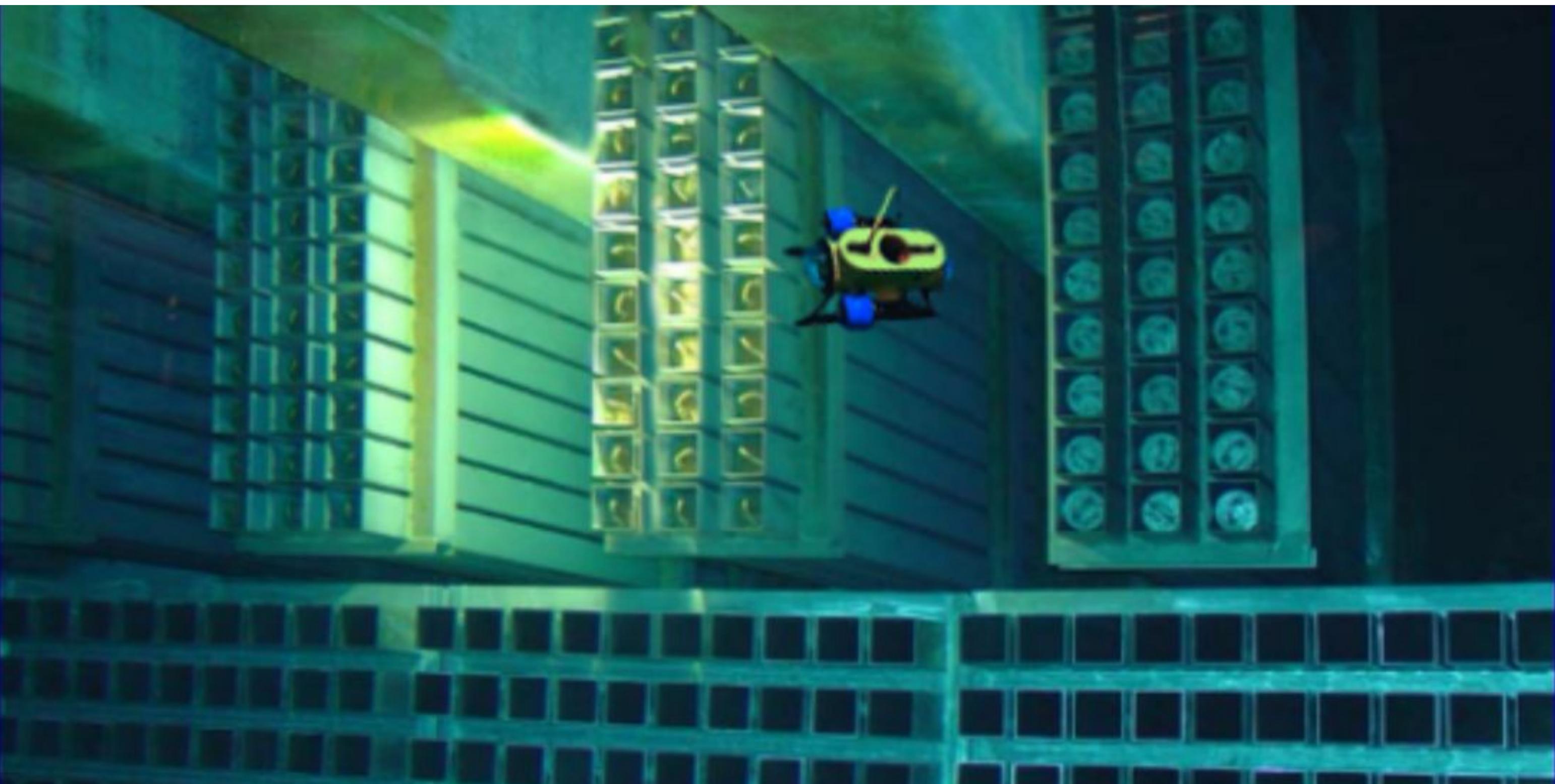
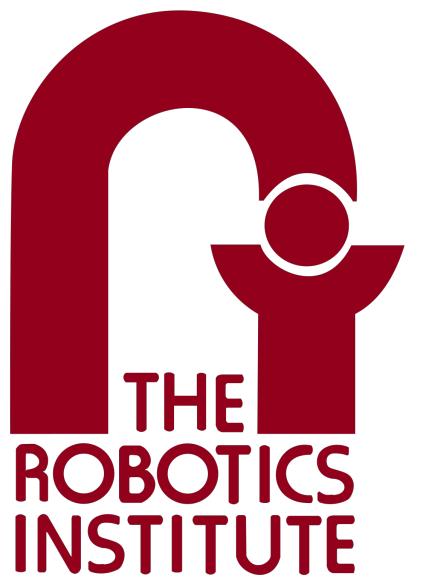


# Localized Imaging and Mapping for Underwater Fuel Storage Basins



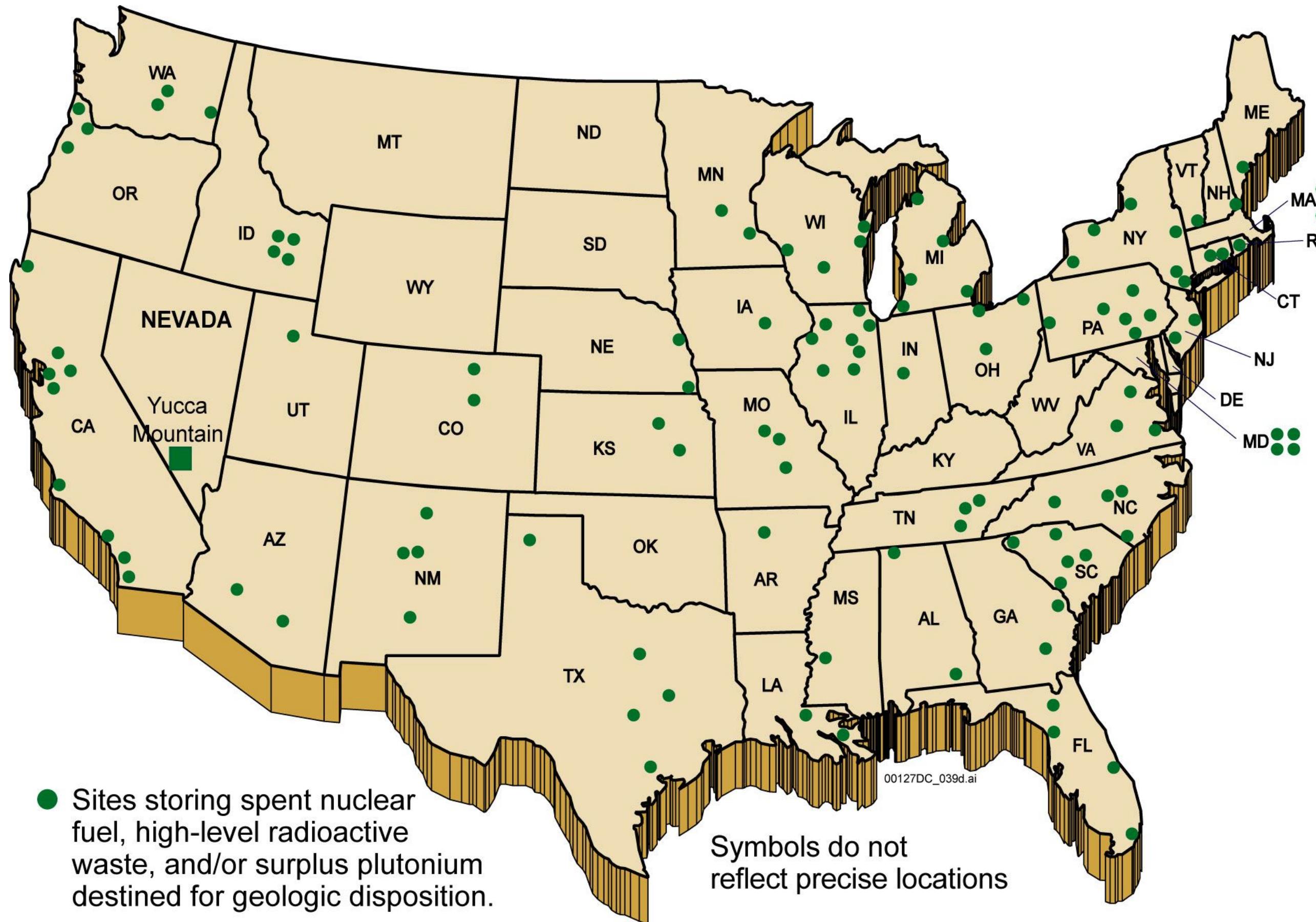
Jerry Hsiung, Andrew Tallaksen, Lawrence Papincak, Sudharshan Suresh, Heather Jones,  
William Whittaker, Michael Kaess

March 22, 2018



Carnegie  
Mellon  
University

# Spent Nuclear Fuel (SNF) Storage



Current SNF storage sites

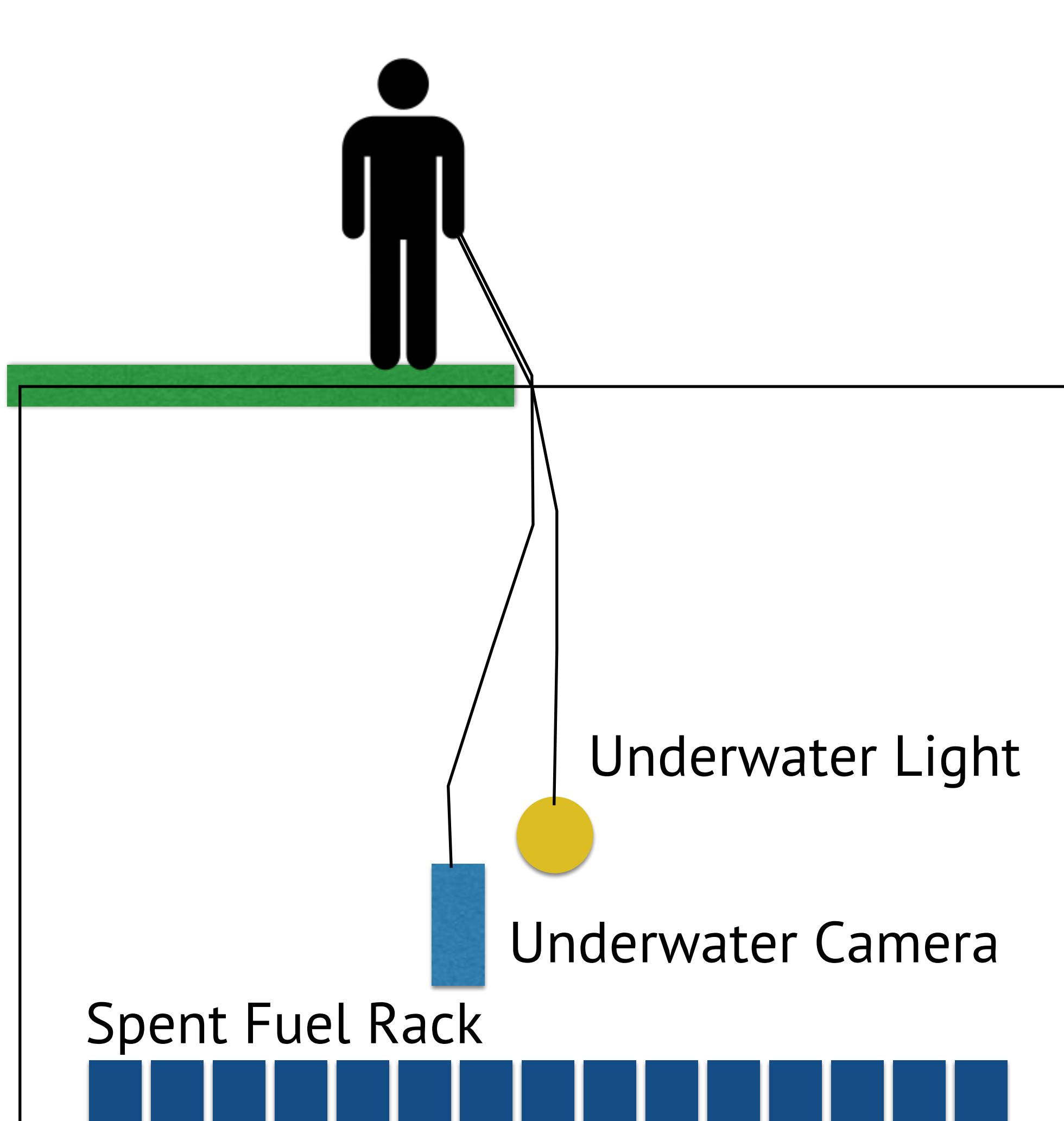


SNF is stored in water pool to shield its radioactive properties

# Human Inspection is infeasible



# Current SNF Inspection Methods



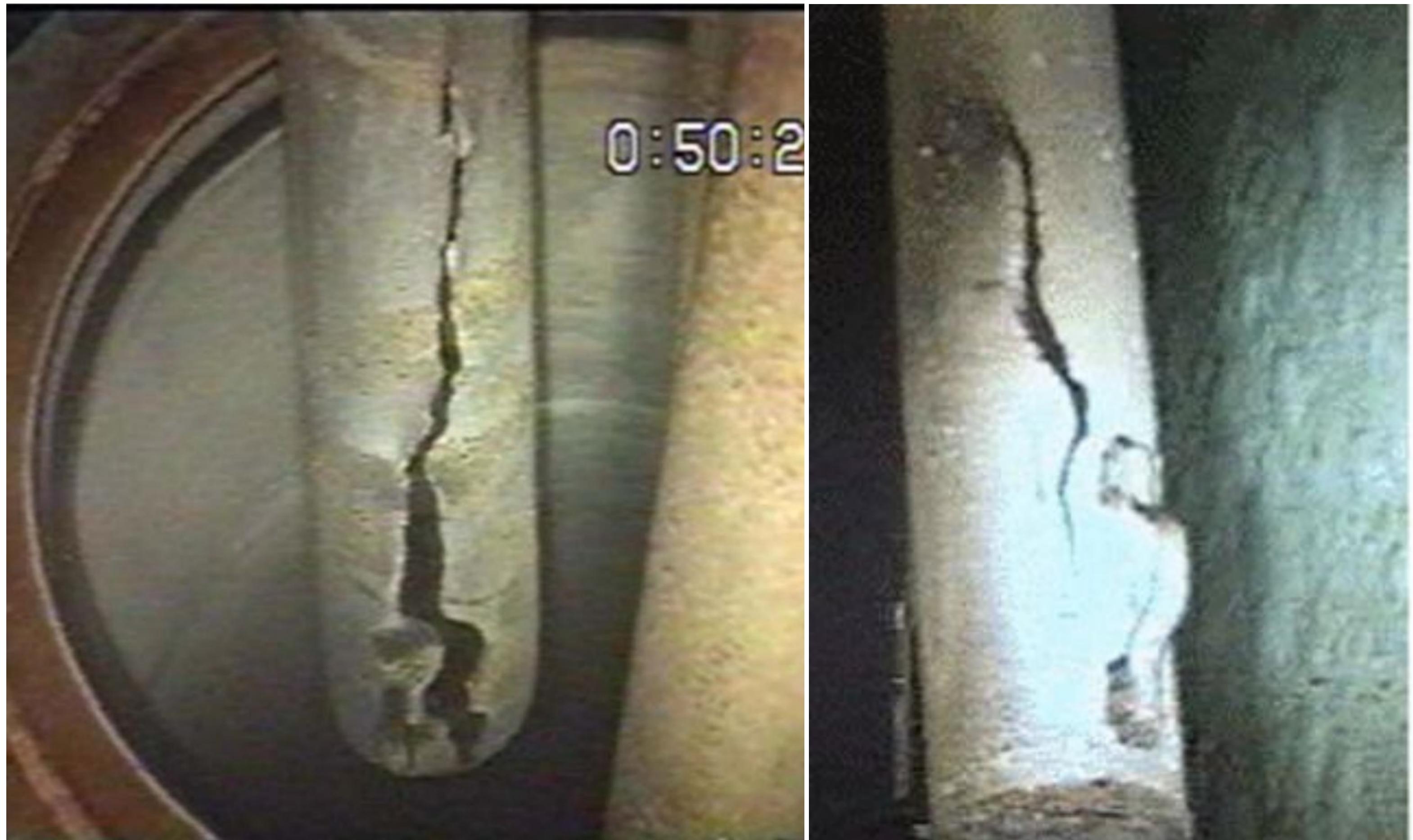
# Existing Inspection Examples

Storage Conditions of Reactive Metal Fuel in L-Basin  
at the Savannah River Site

Defense Nuclear Facilities Safety Board  
Technical Report

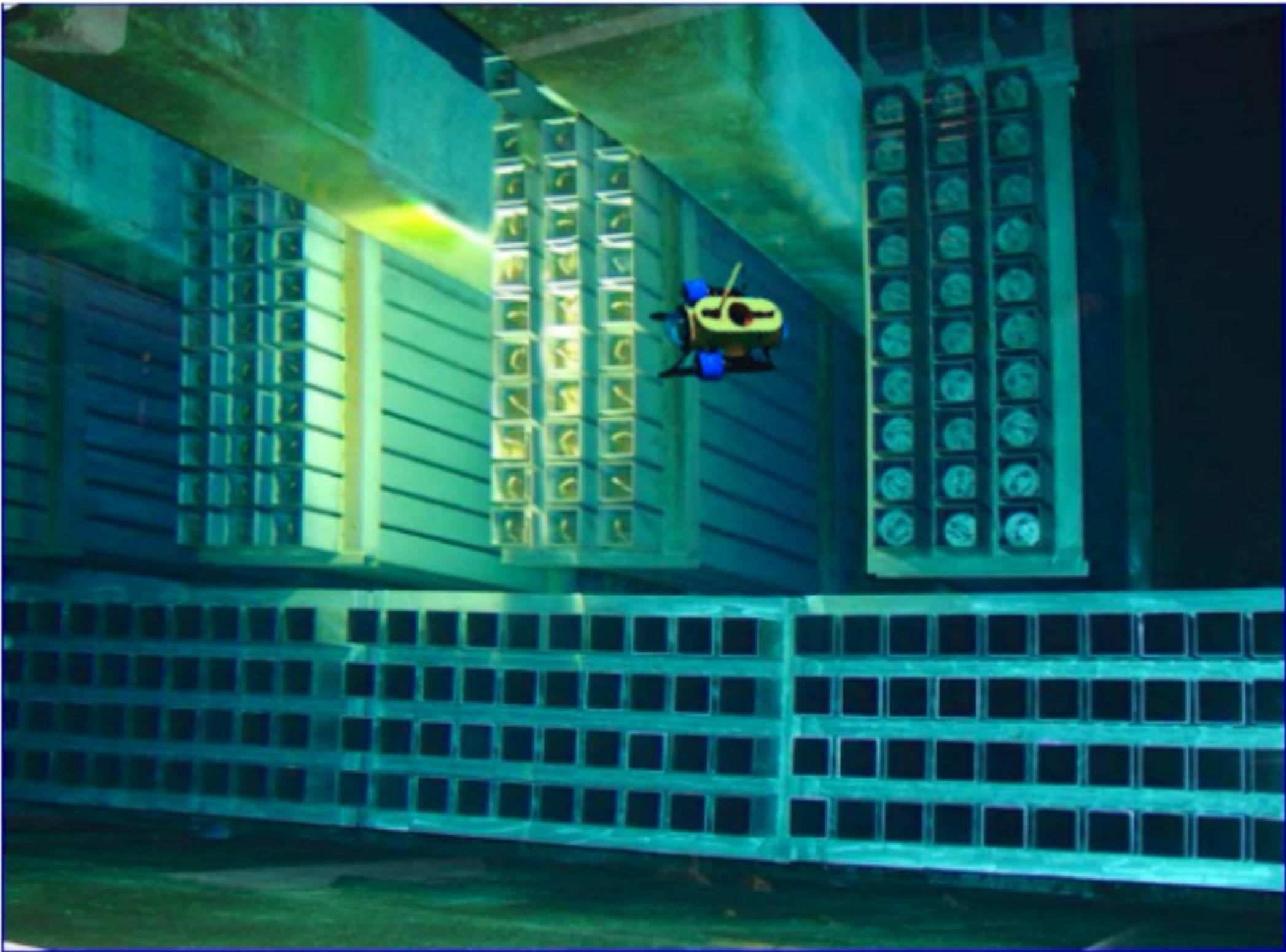


January 2013



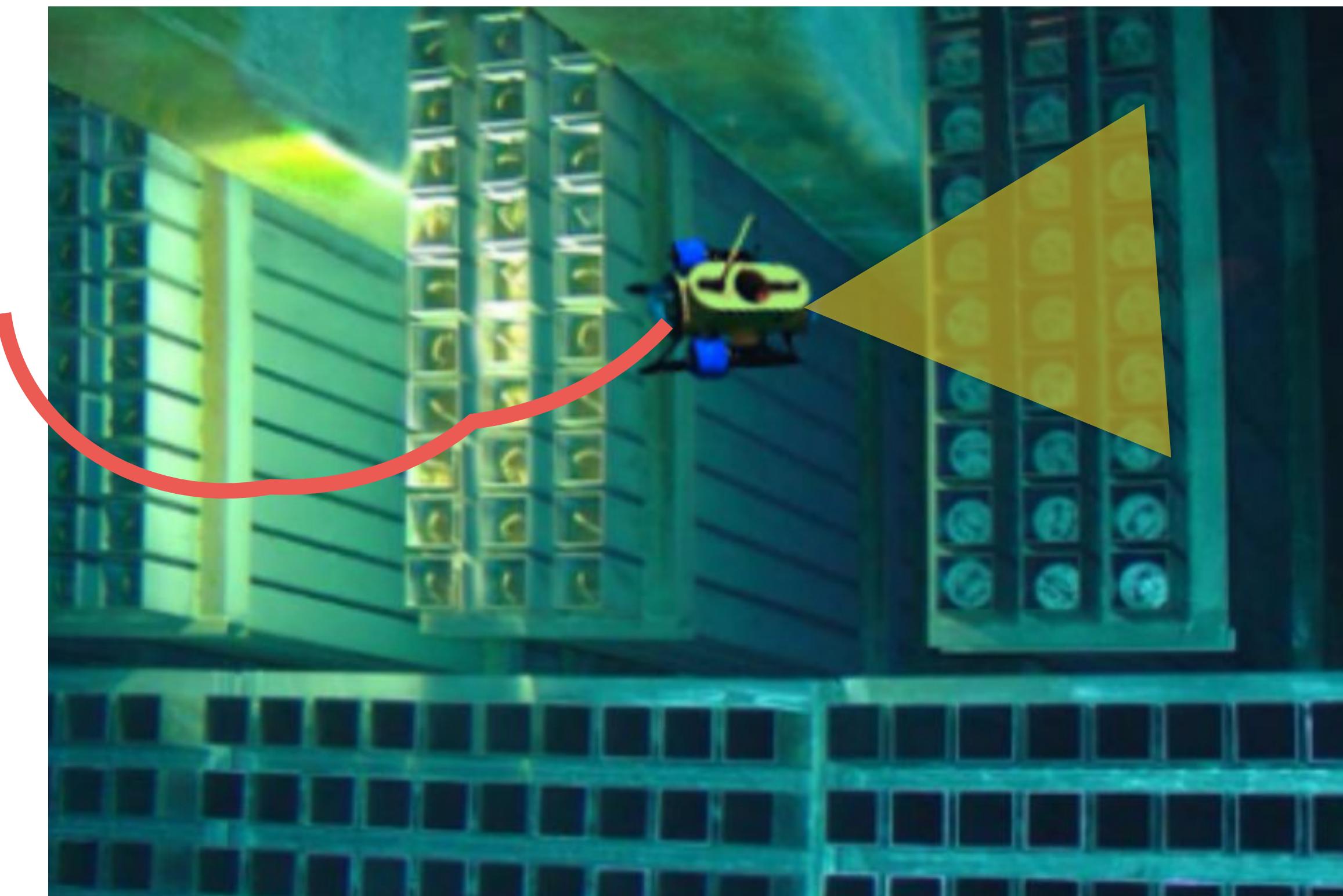
Savannah River Site's ageing cracked SNF containers

# Remotely Operated Sensor Package

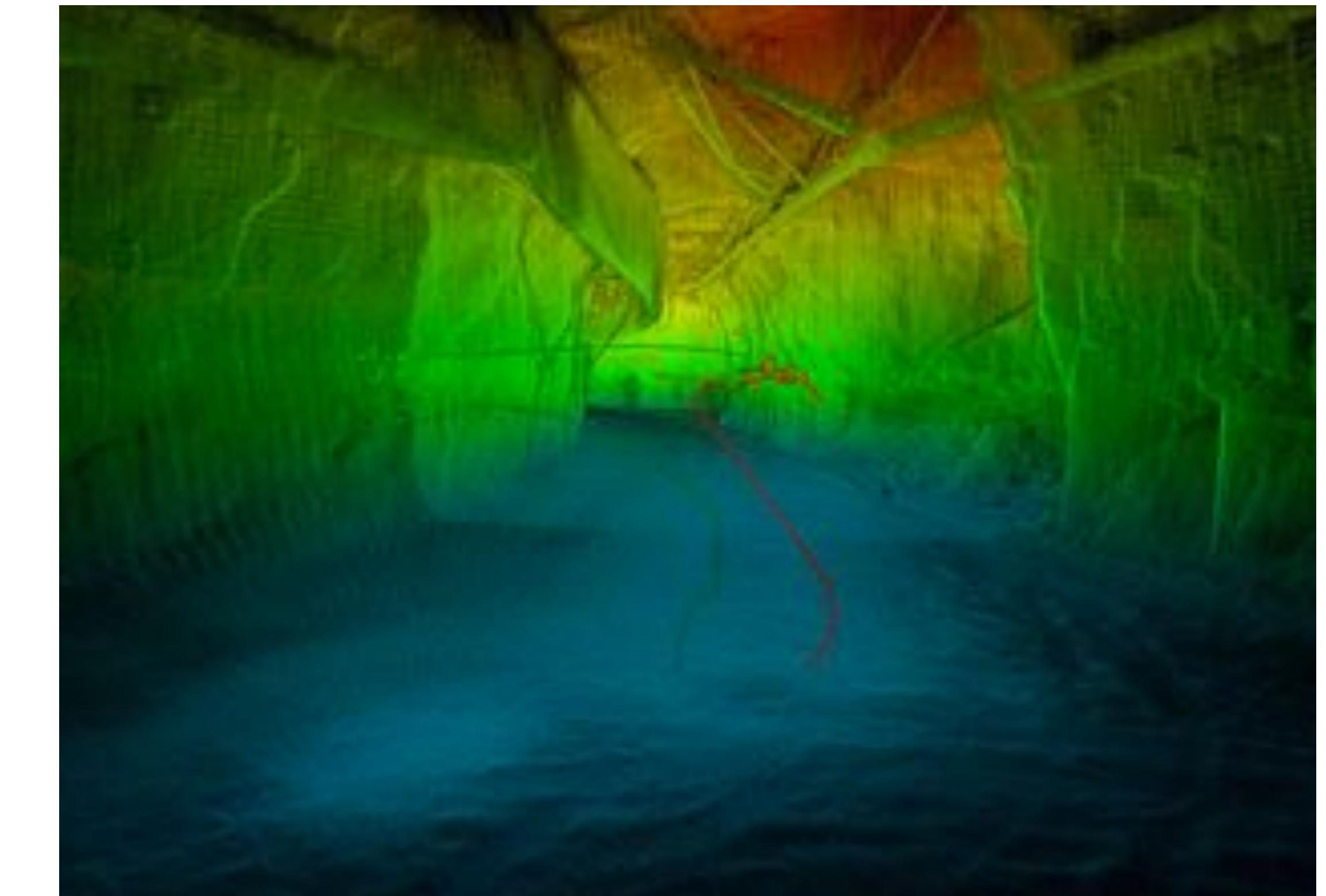


A robot-mounted sensor pod will provide localised inspection, enabling operators to pinpoint sensor reading locations relative to 3D structure.

# Remotely Operated Inspection System



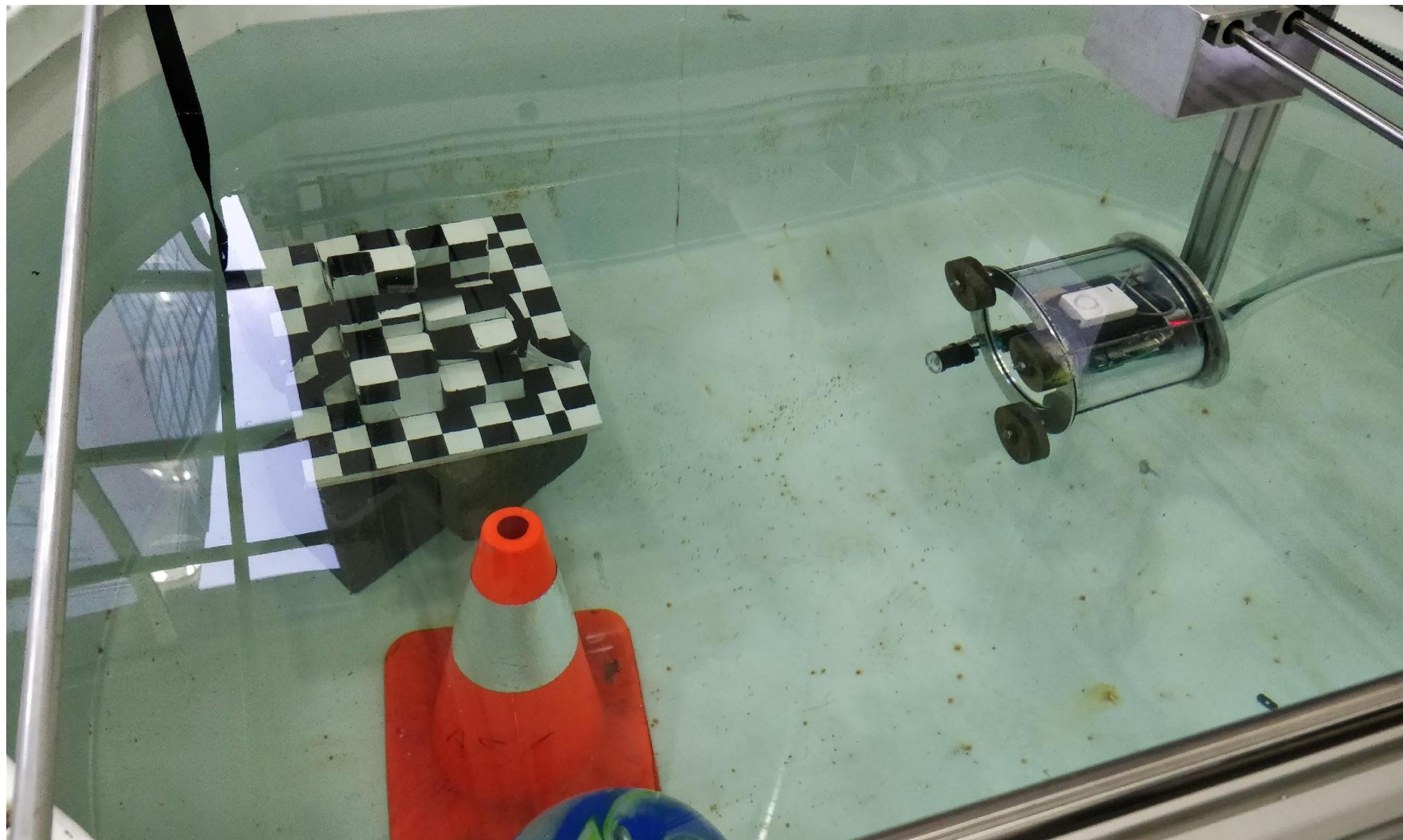
Localised Data Collection



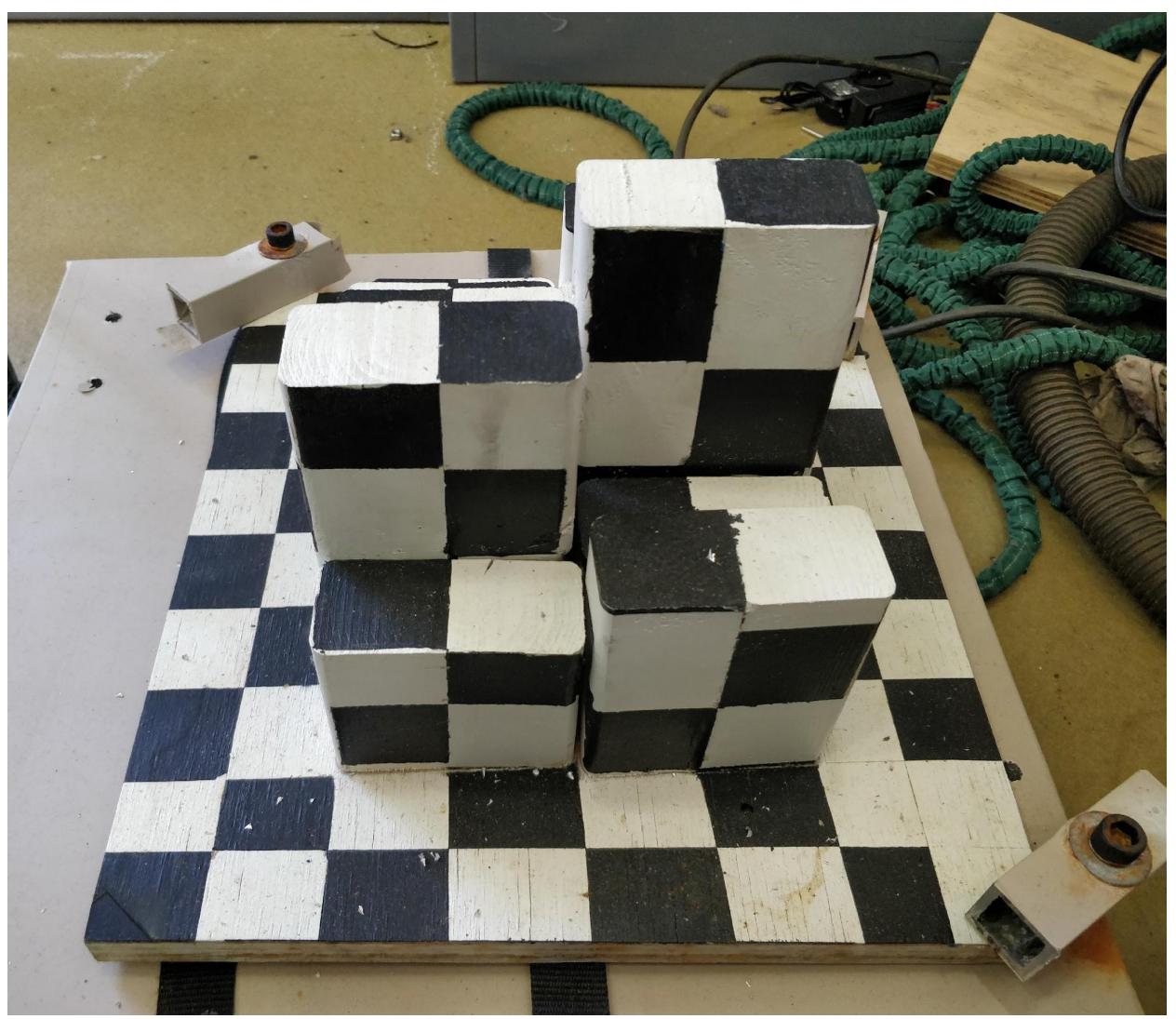
Model Reconstruction

# Underwater Mapping

- ▶ Underwater & real-time data collection
- ▶ 3D reconstruction using image sequences (Structure from Motion)



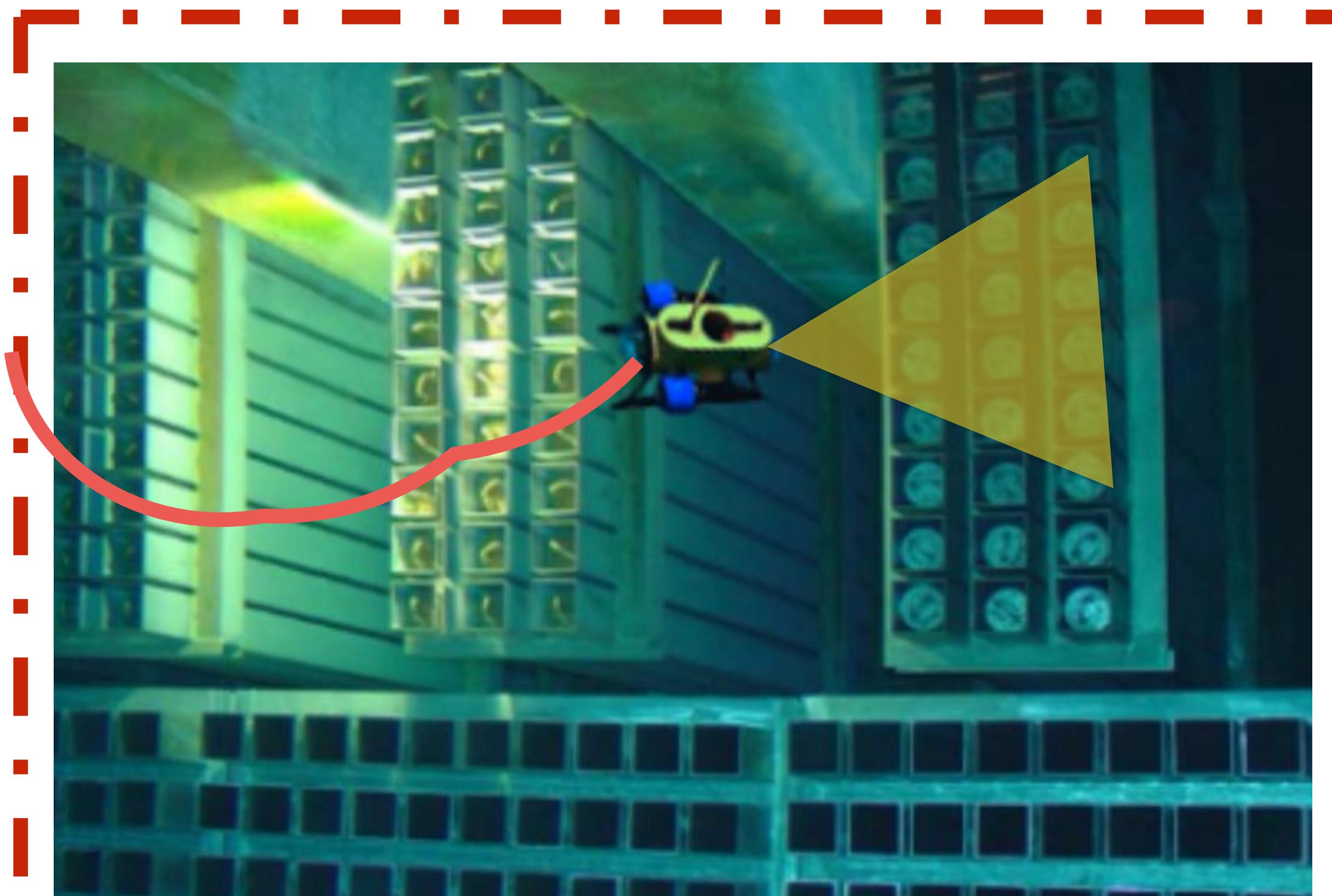
Checkered blocks



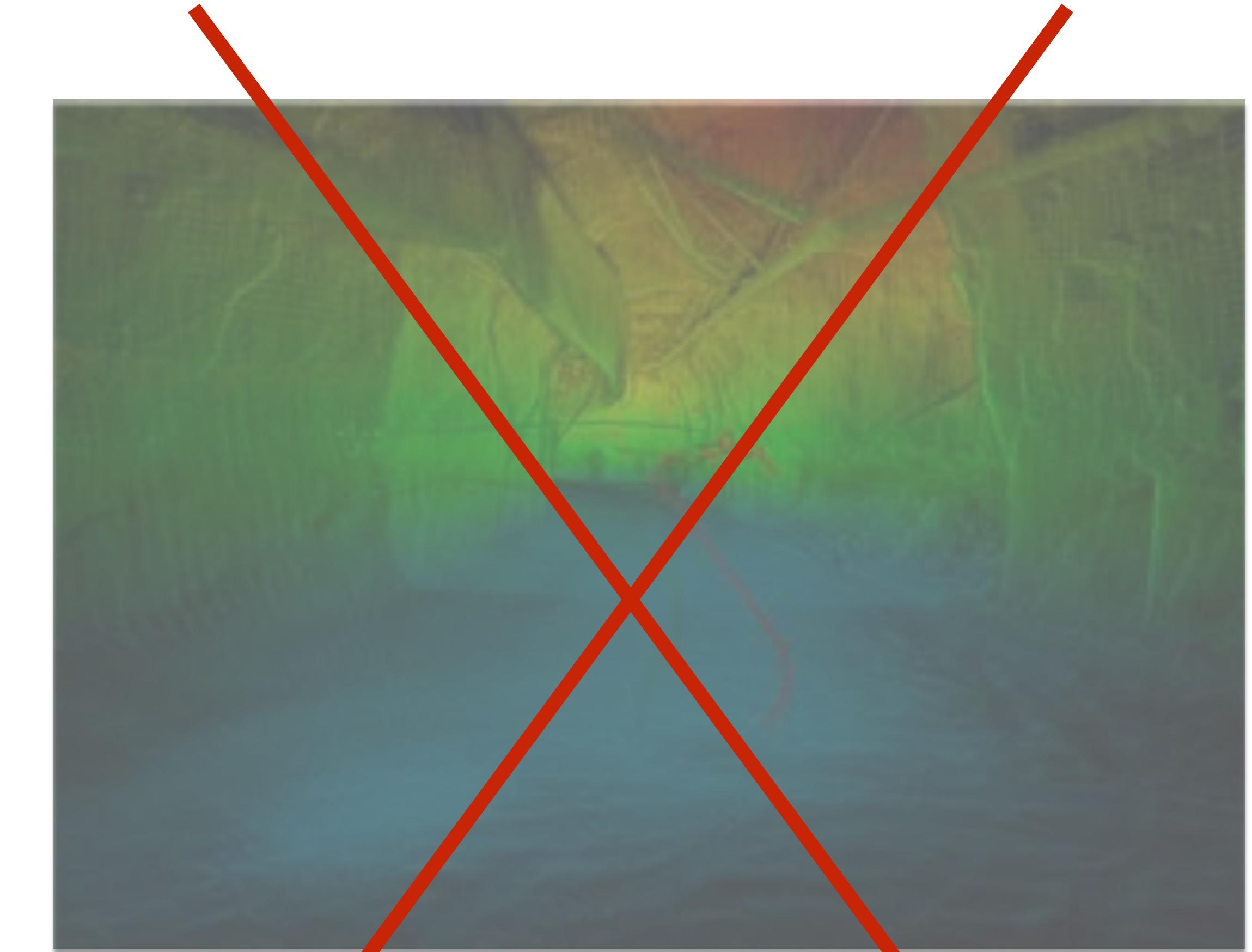
Bowling Ball



# Today's Talk...

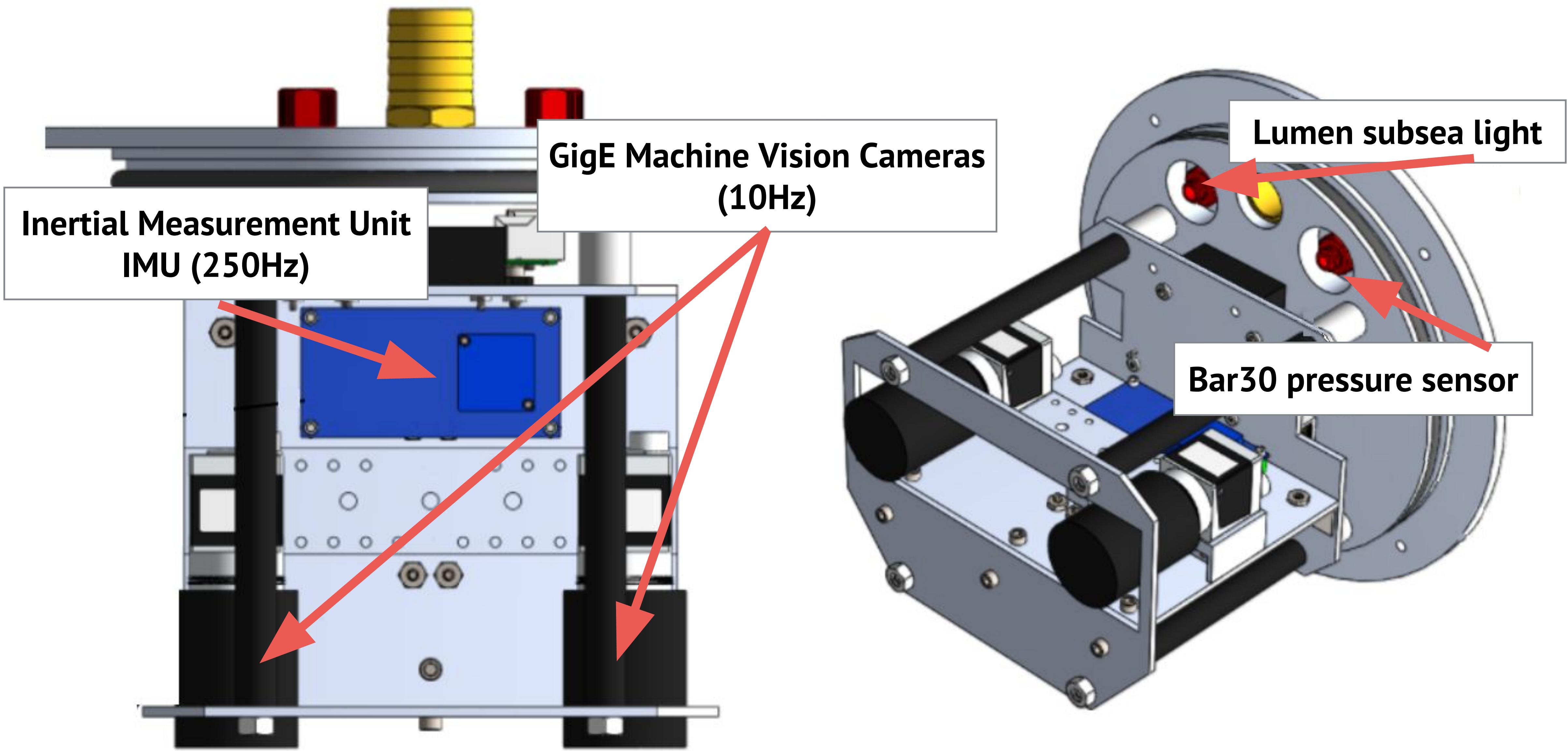


Localised Data Collection



Model Reconstruction

# Inspection Sensor Pod

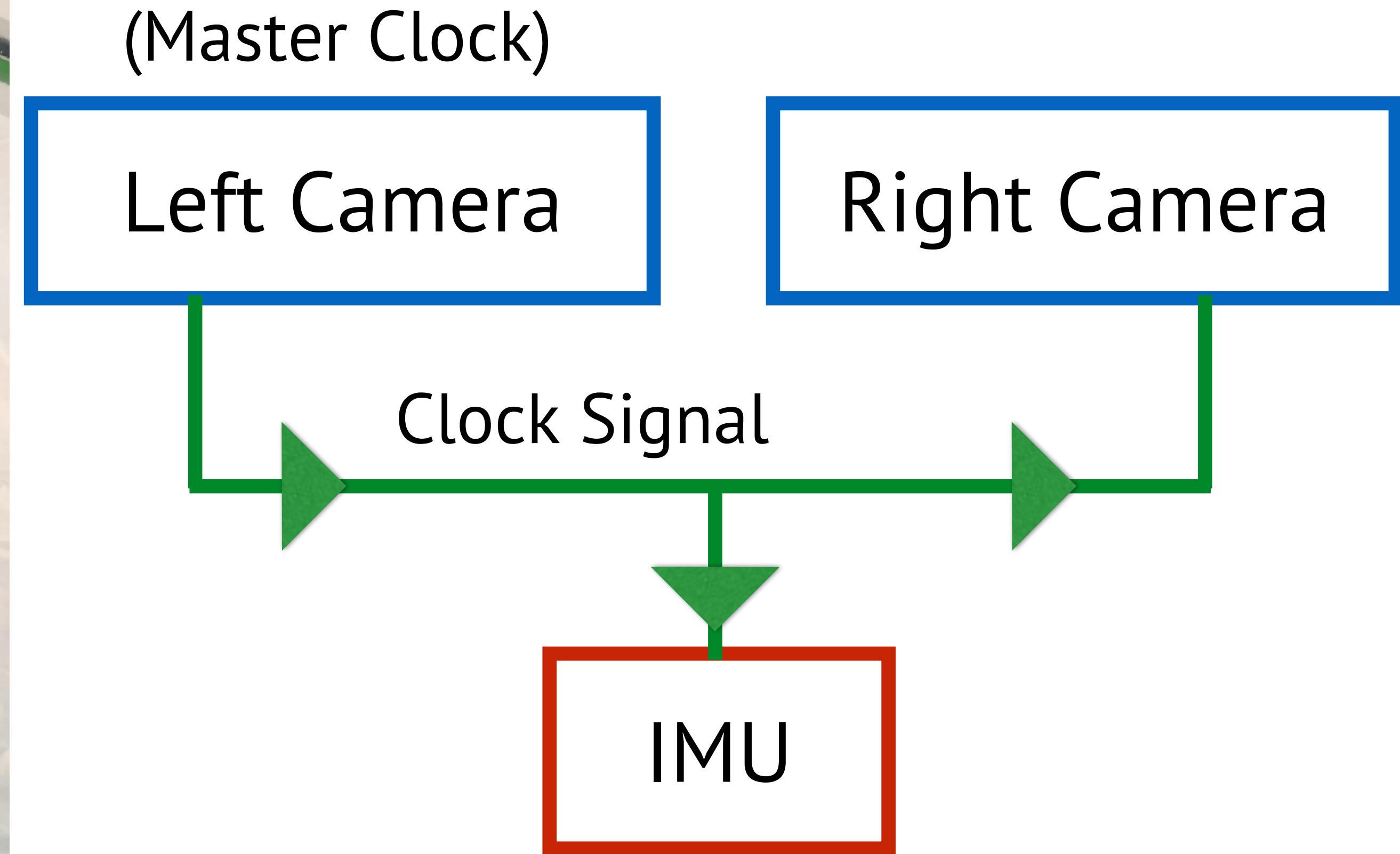
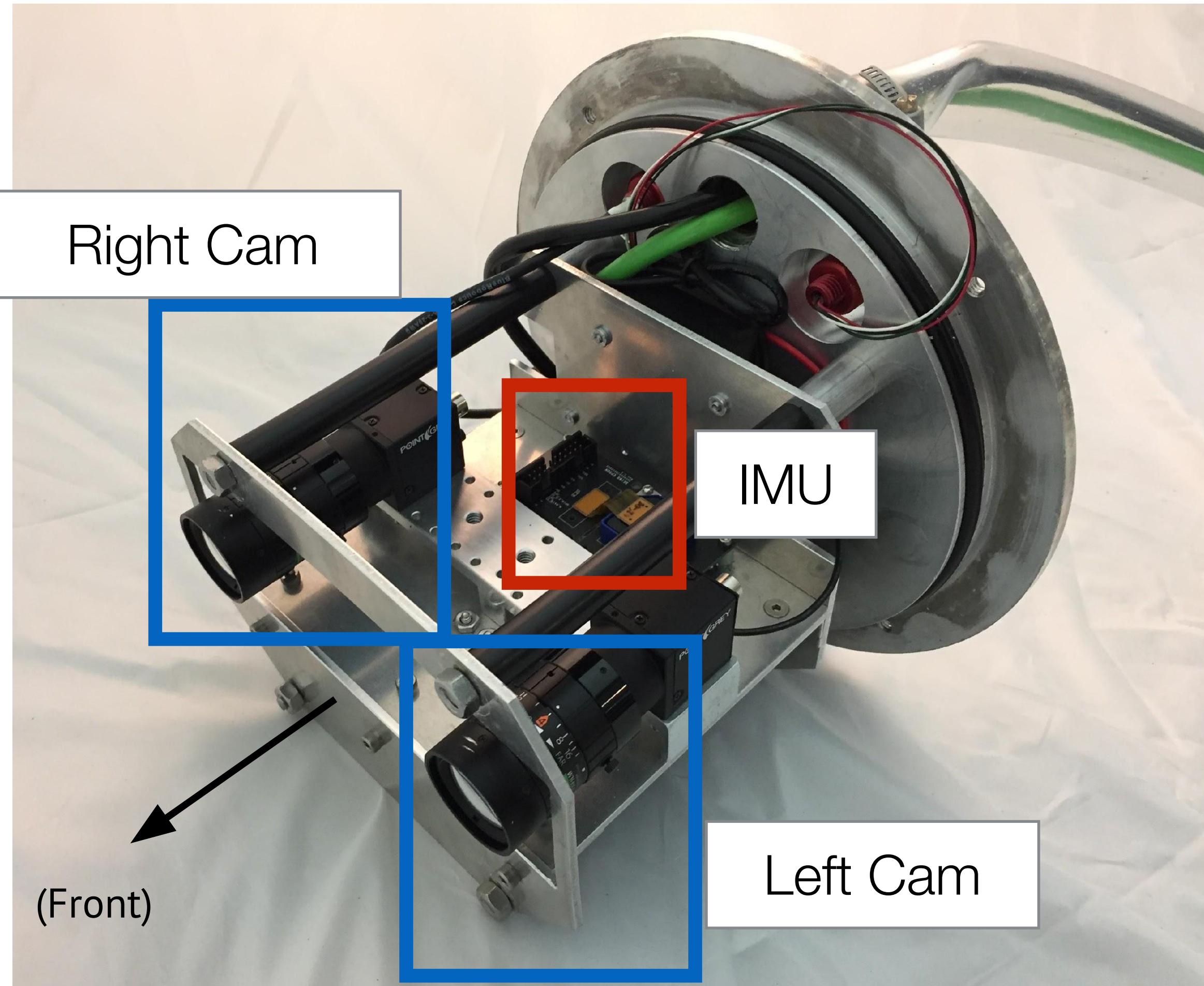


# Time-Synchronisation of Sensors

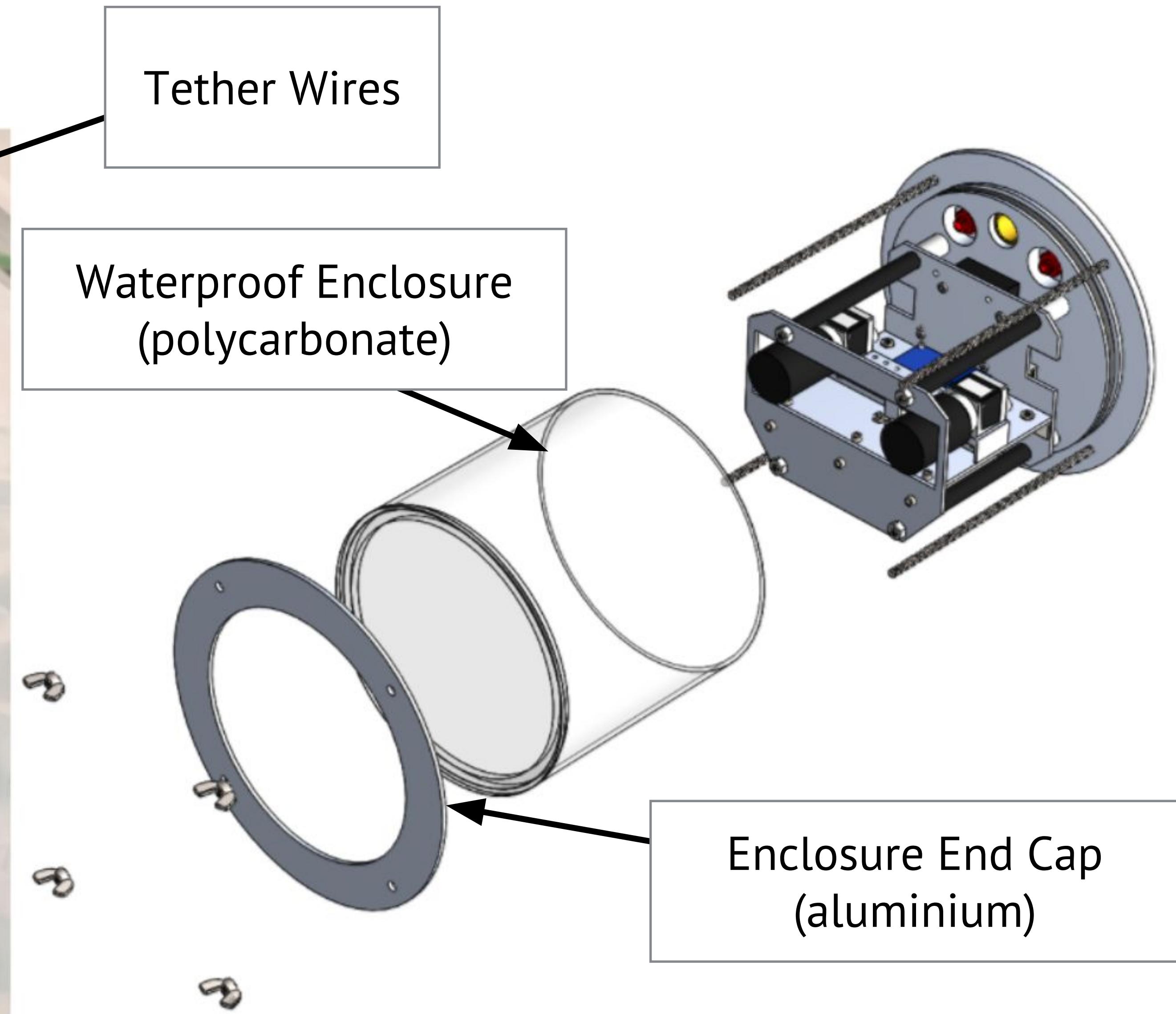
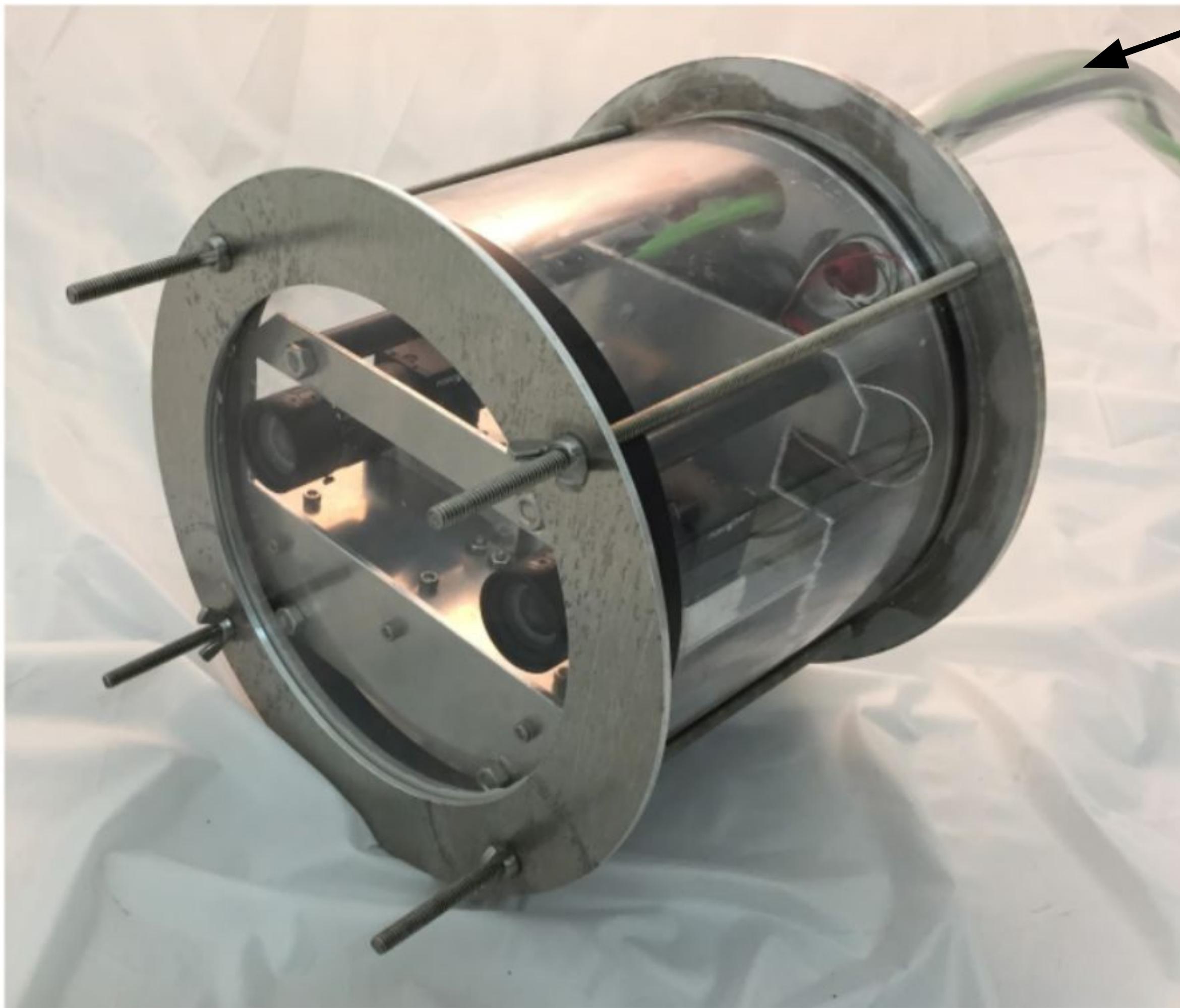
- ▶ Each sensor uses its own clock to time stamp data
- ▶ Essential to ensure accurate sensor fusion for localisation
- ▶ Sensors record at various rates
- ▶ Clock drifts!



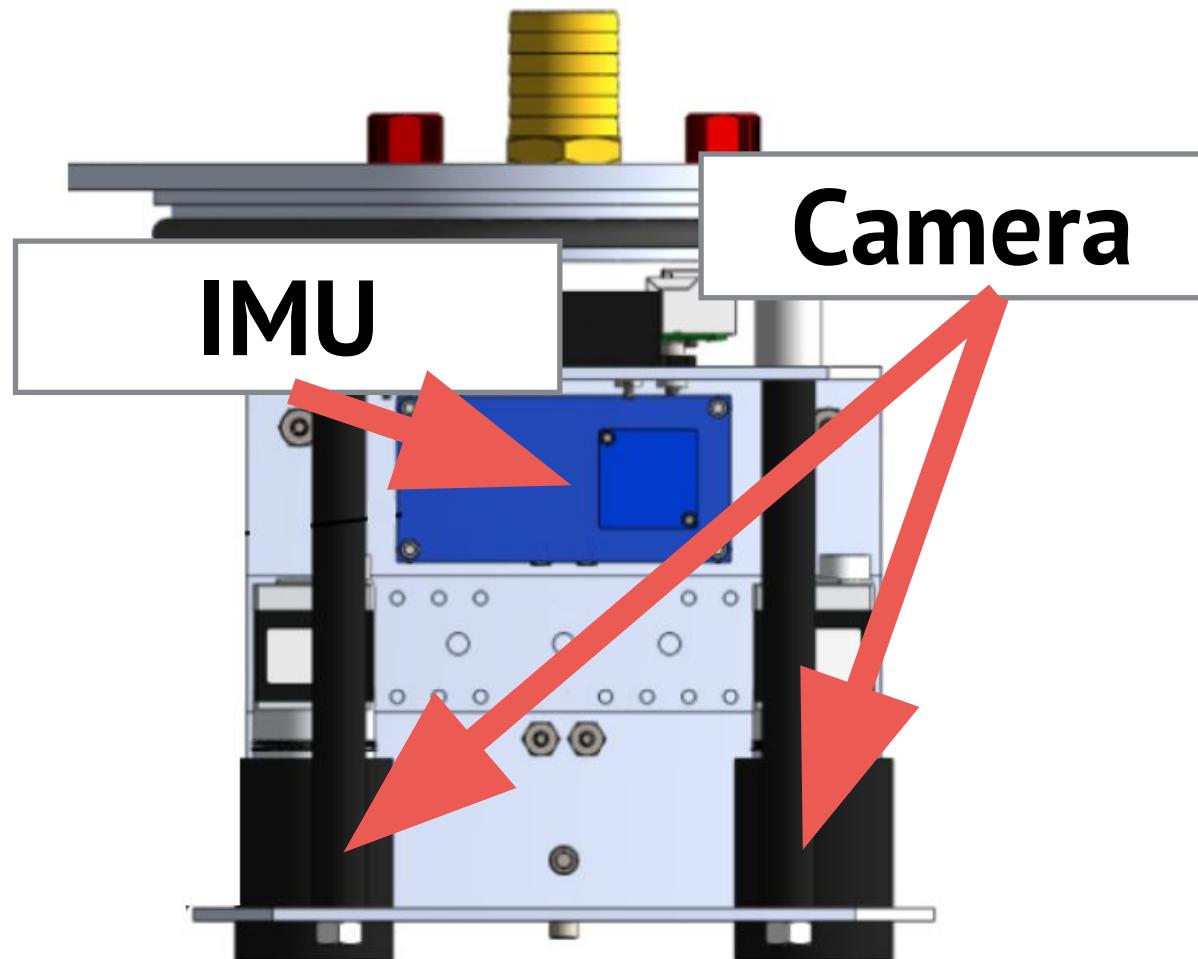
# Hardware Synchronisation



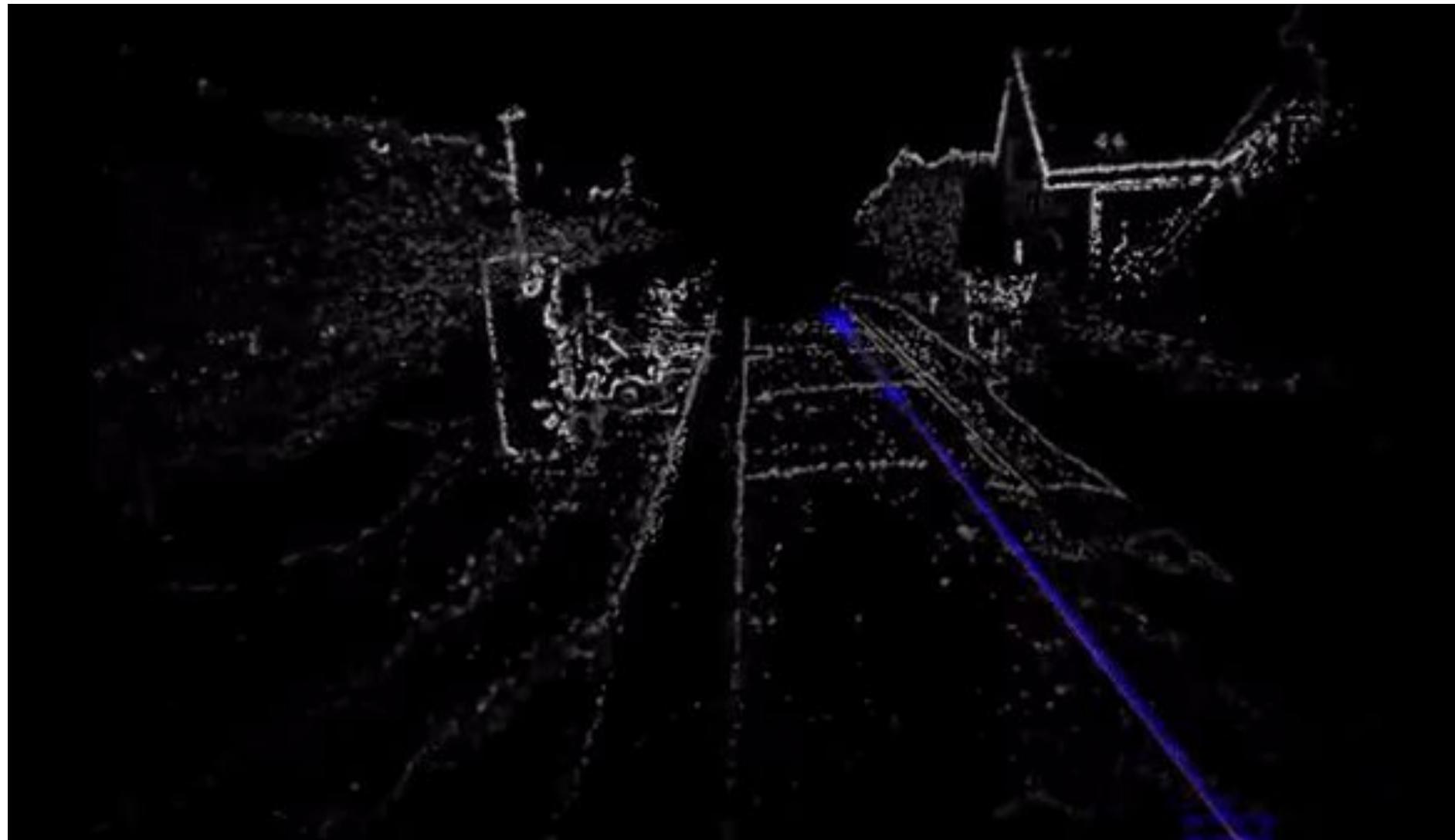
# Waterproof enclosure



# Odometry Algorithms



- Inertial Odometry is commonly used but it drifts
- Visual Odometry are effective but for small motions (DSO, ORB-SLAM)

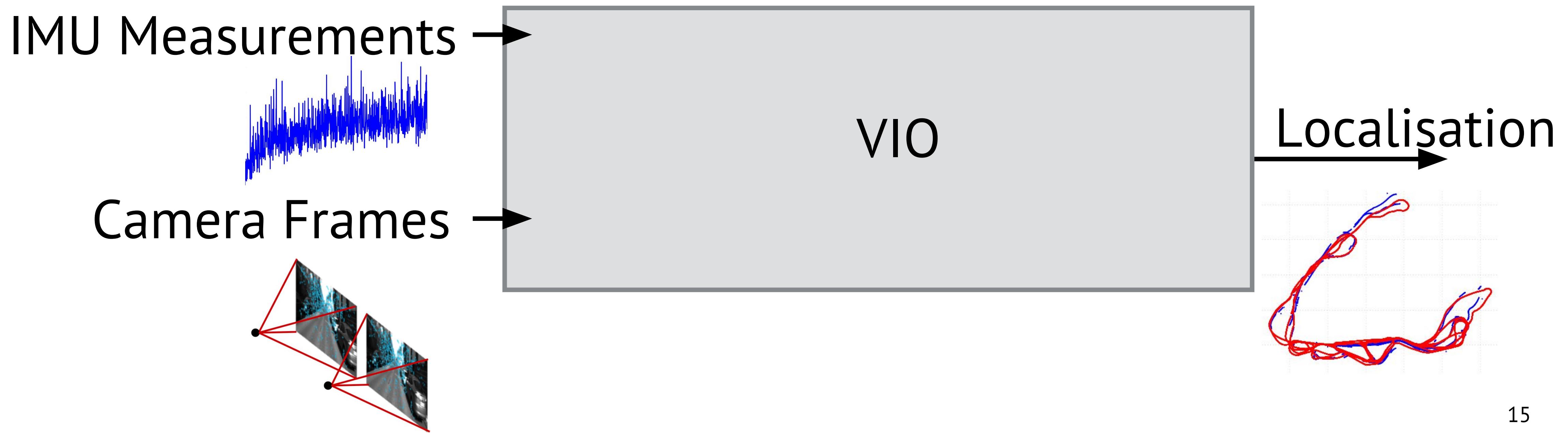


*J Engel et al.*  
“DSO”

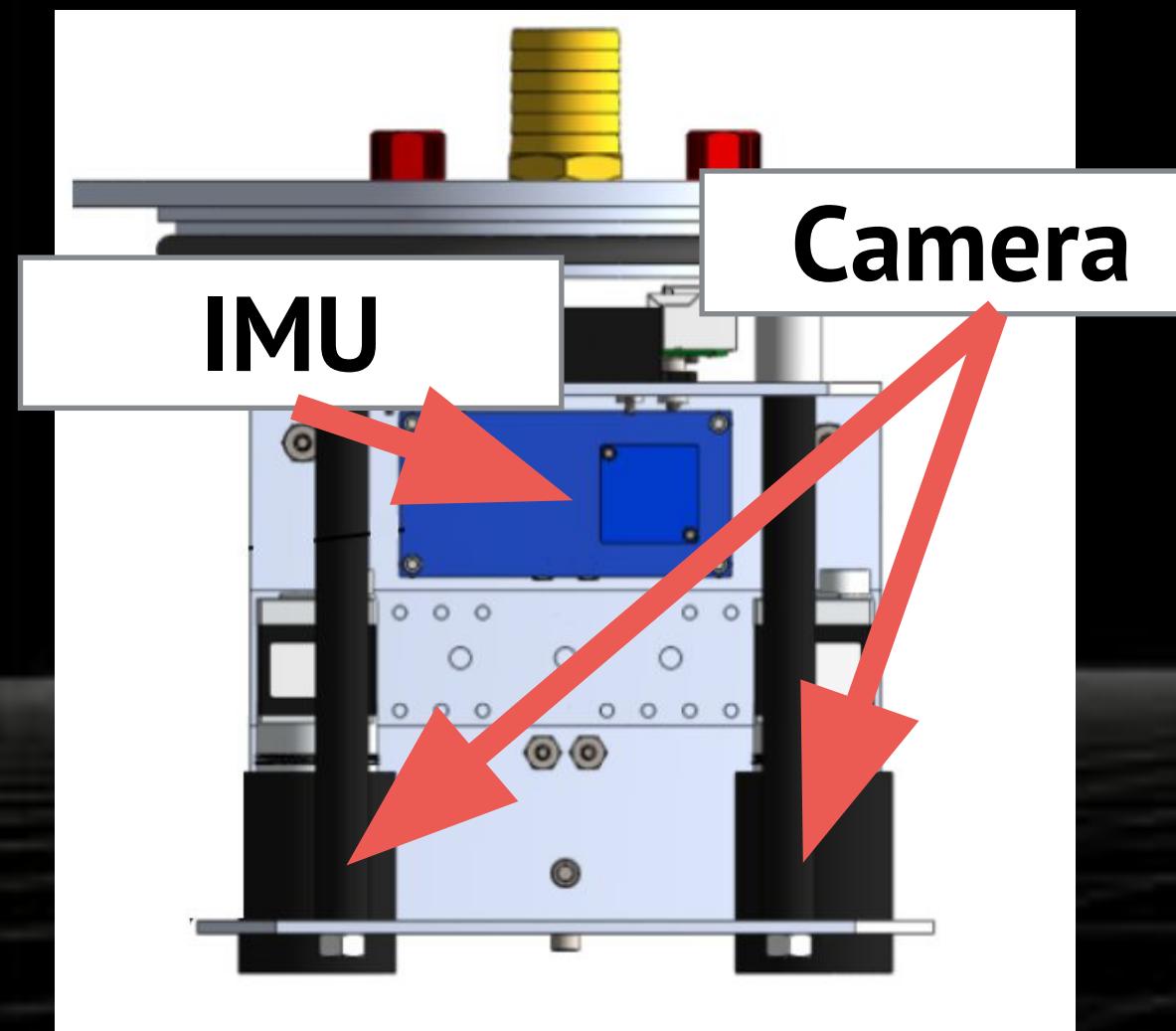
*R Mur-Artal et al.*  
“ORB-SLAM”

# Visual-Inertial Odometry (VIO) Algorithm

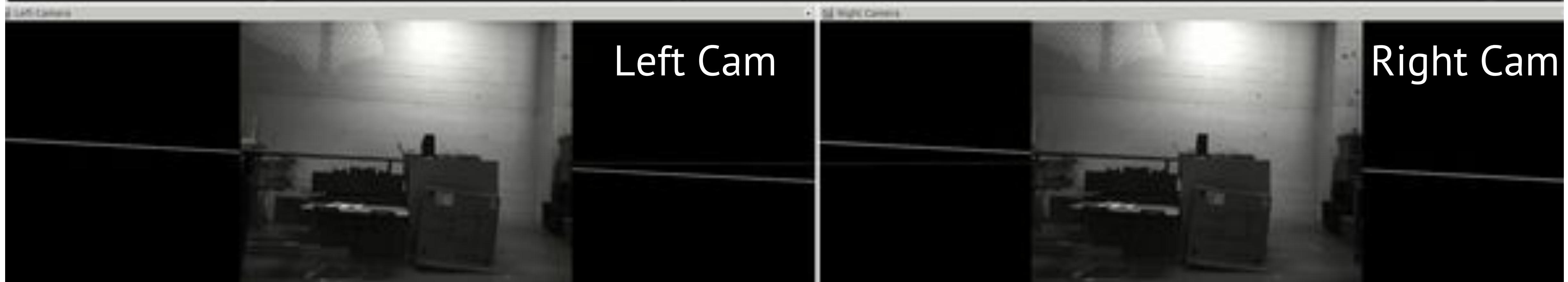
- Combines the bests from visual and inertial information
- Utilizes synchronised sensor information



# VIO for Inspection



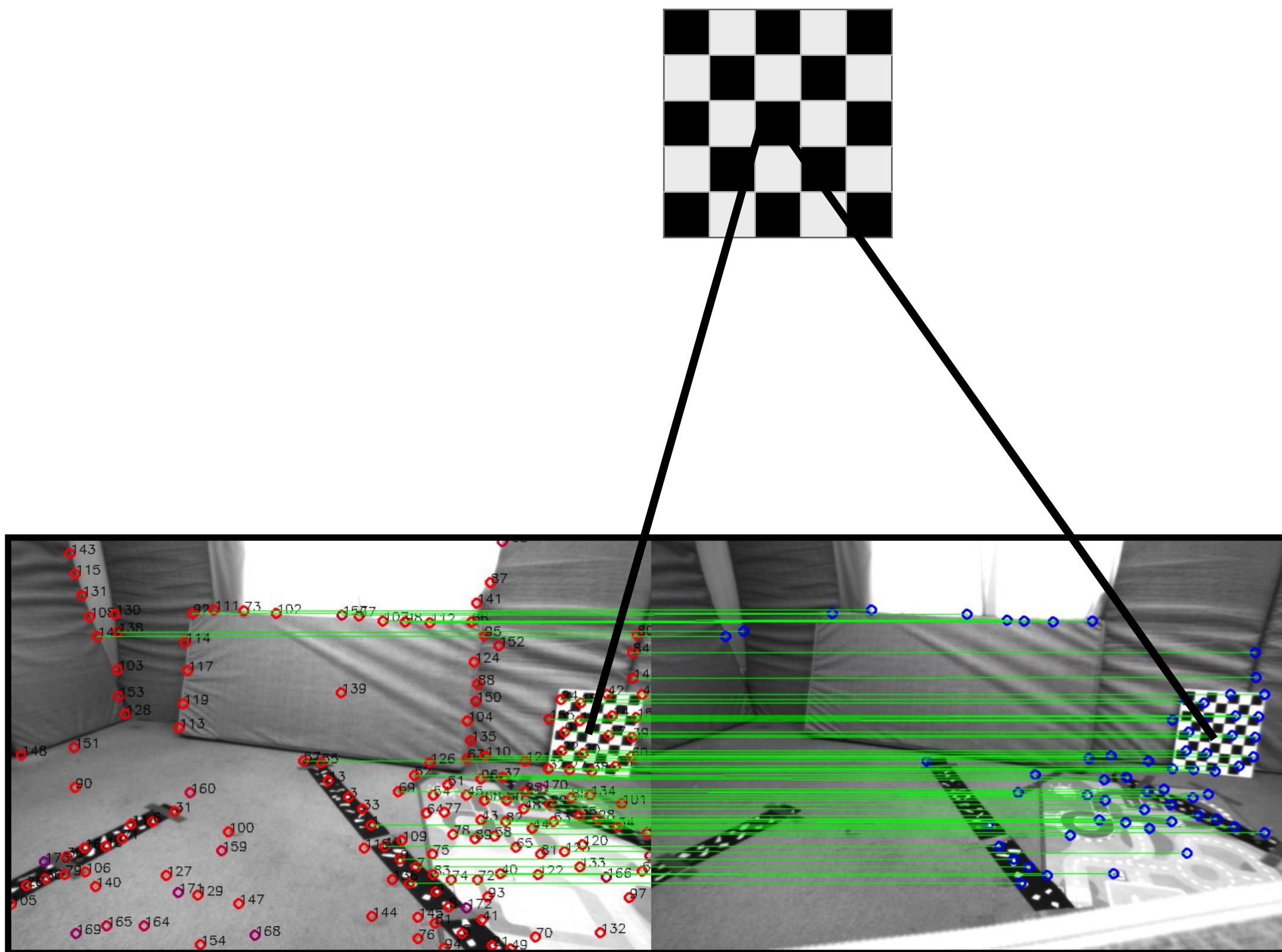
IMU



Left Cam

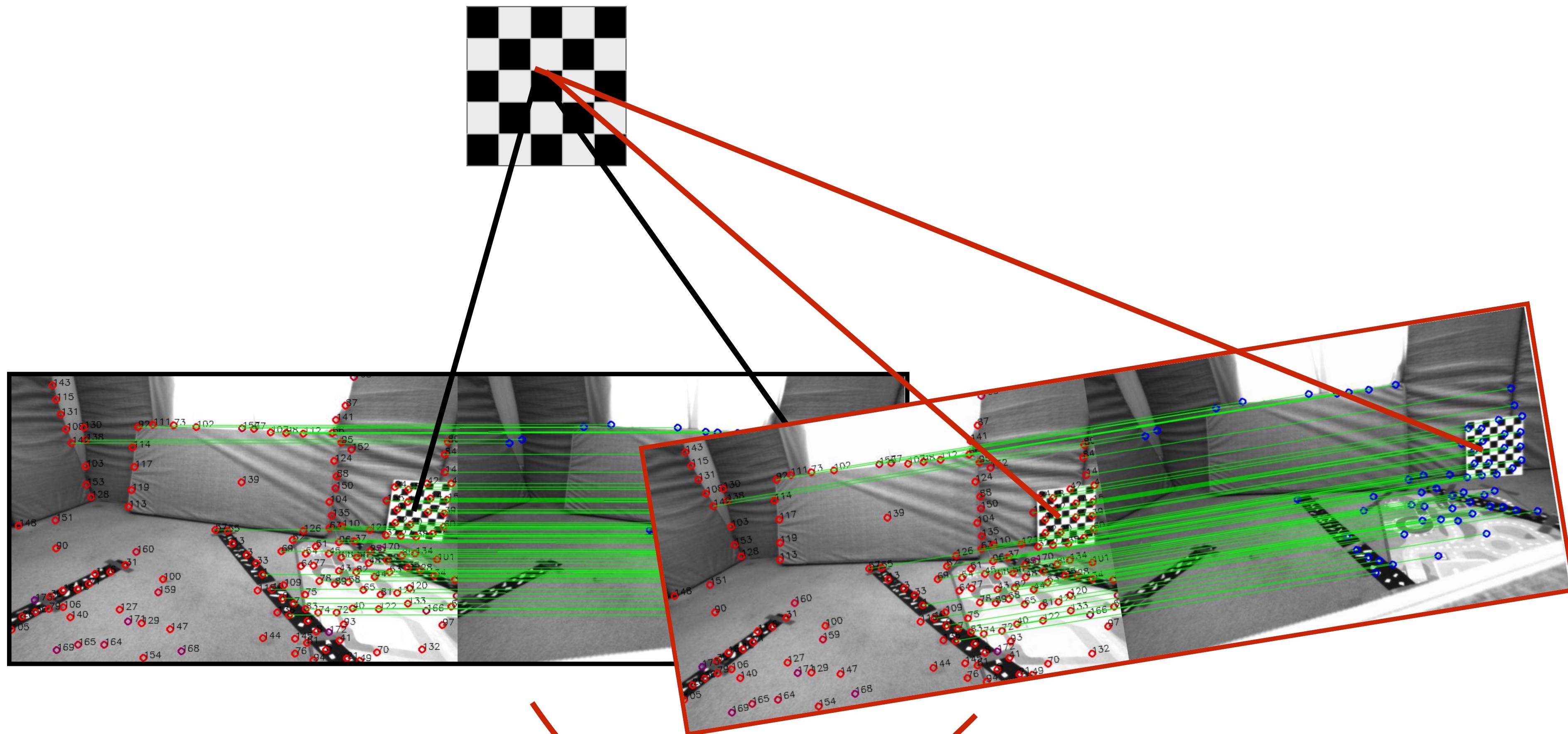
Right Cam

# Stereo Triangulation for VIO



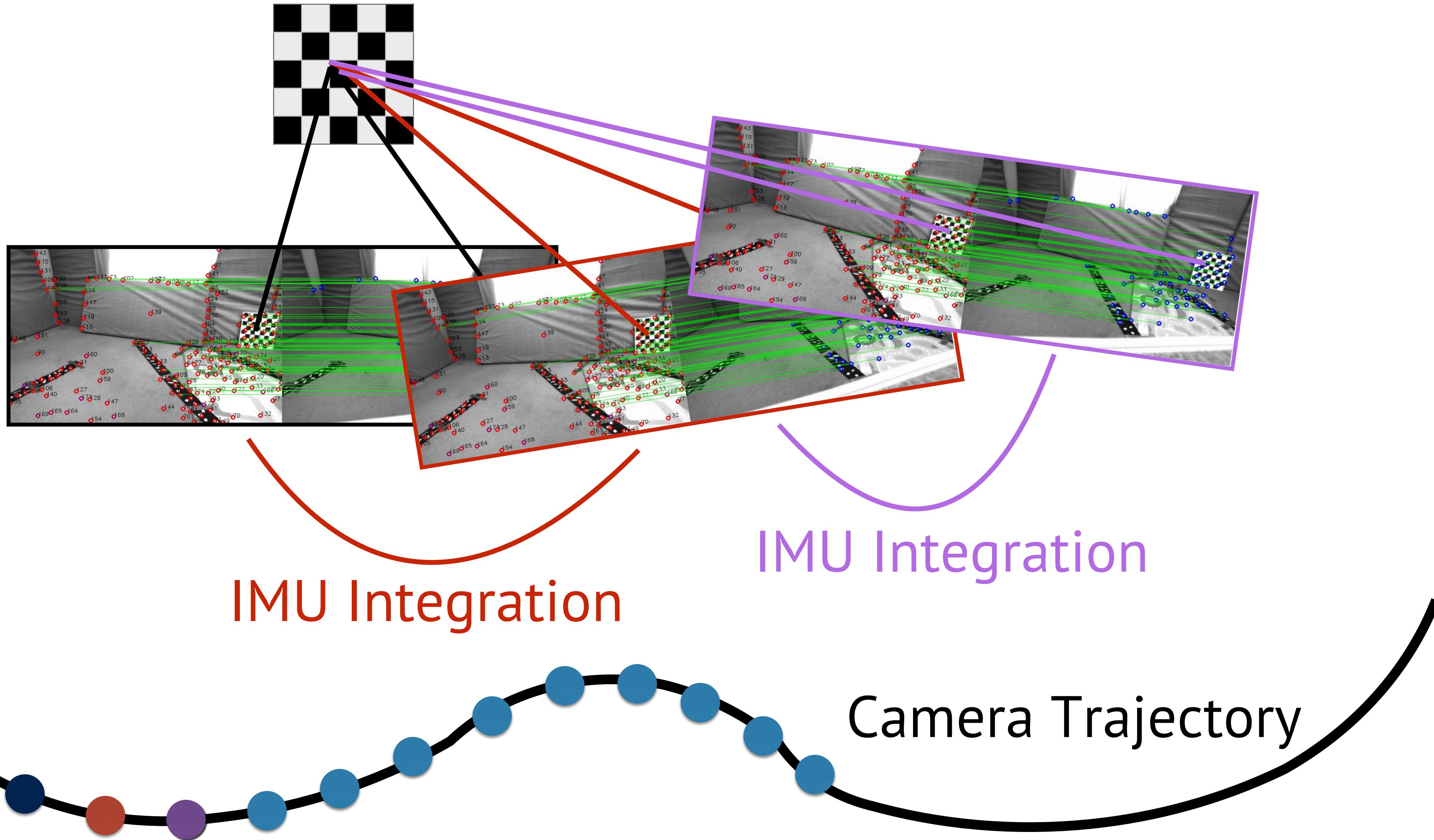
The corresponding points are triangulated into the 3D world

# Camera moves...



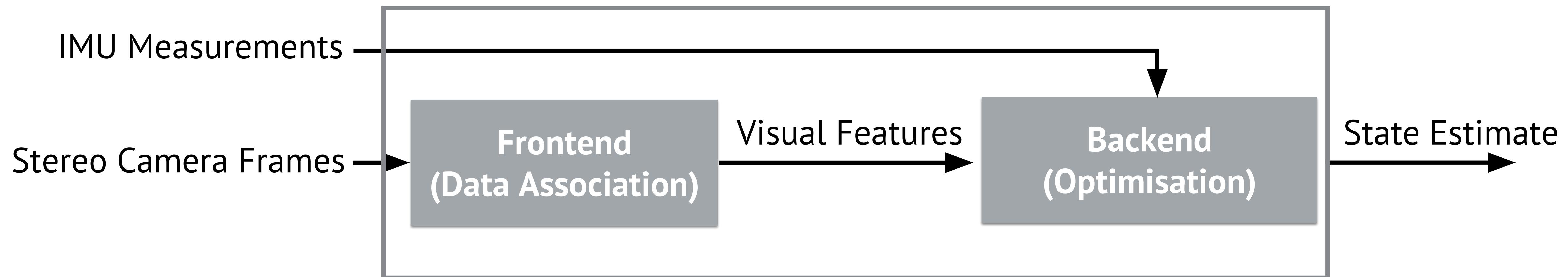
IMU Integration

# A sequence of camera movements

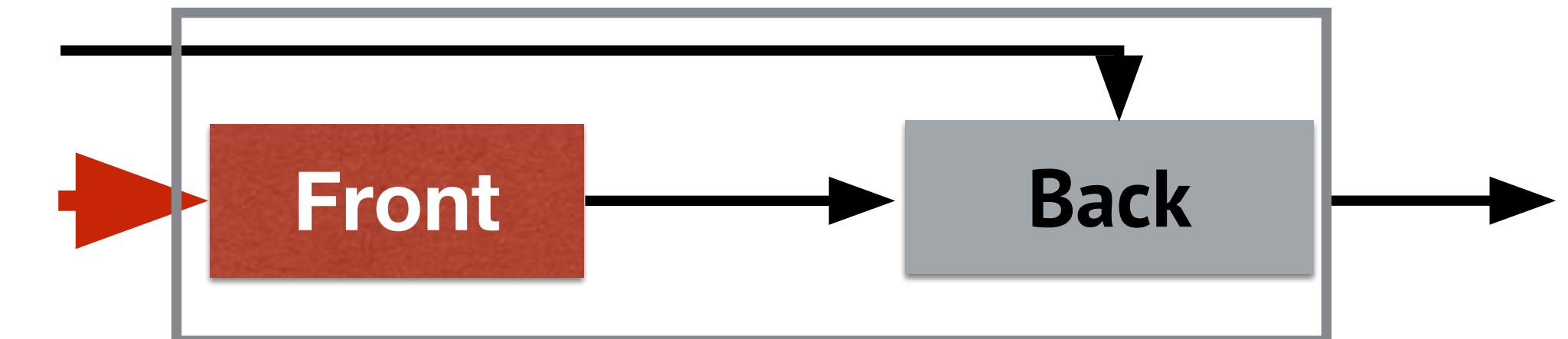


# Details of the VIO system

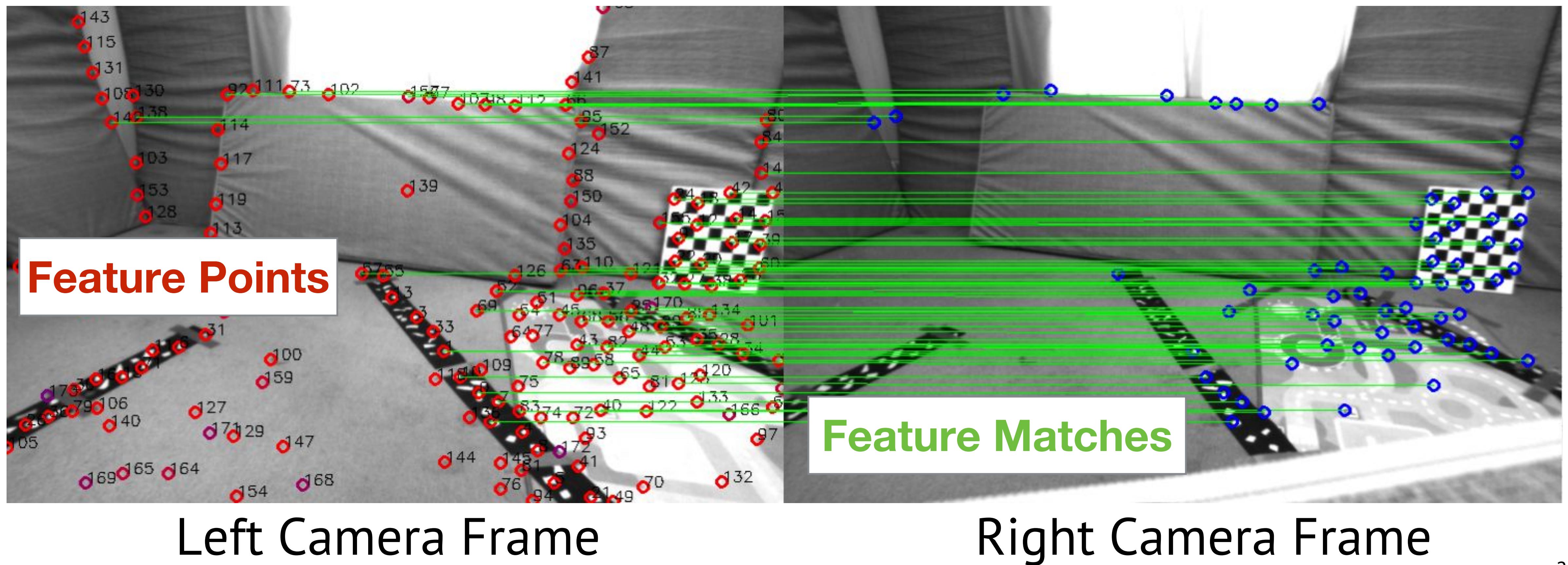
- A VIO system consists of a frontend and a backend parts
- Data association Frontend  
Optimisation Backend



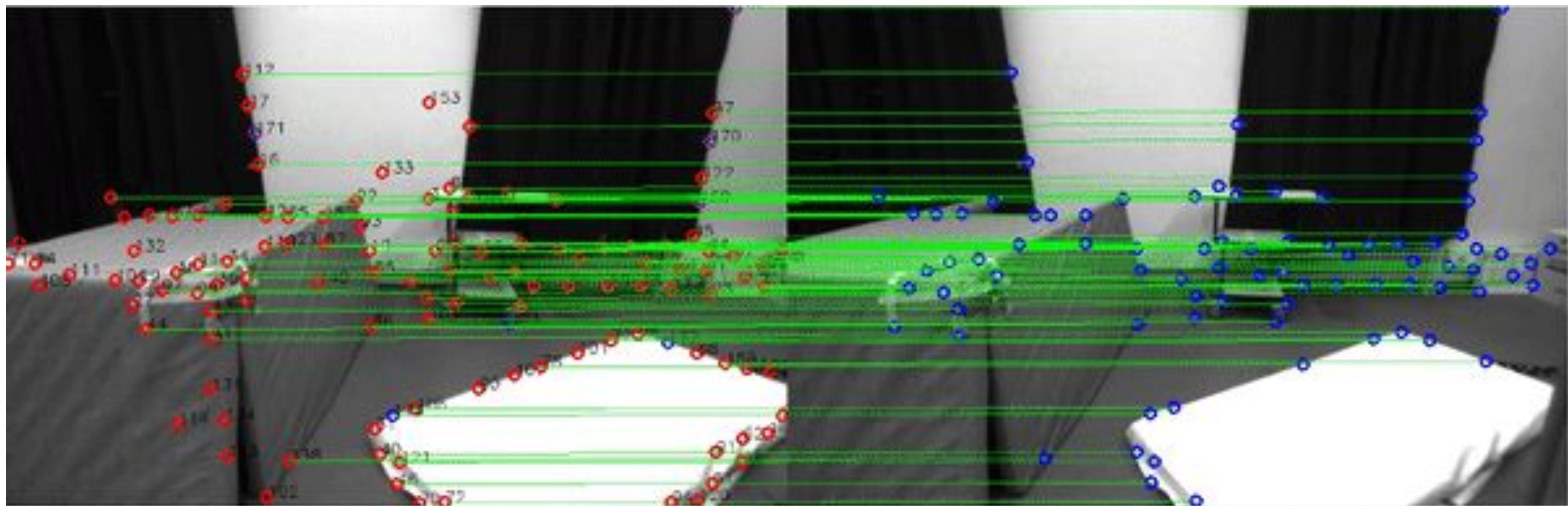
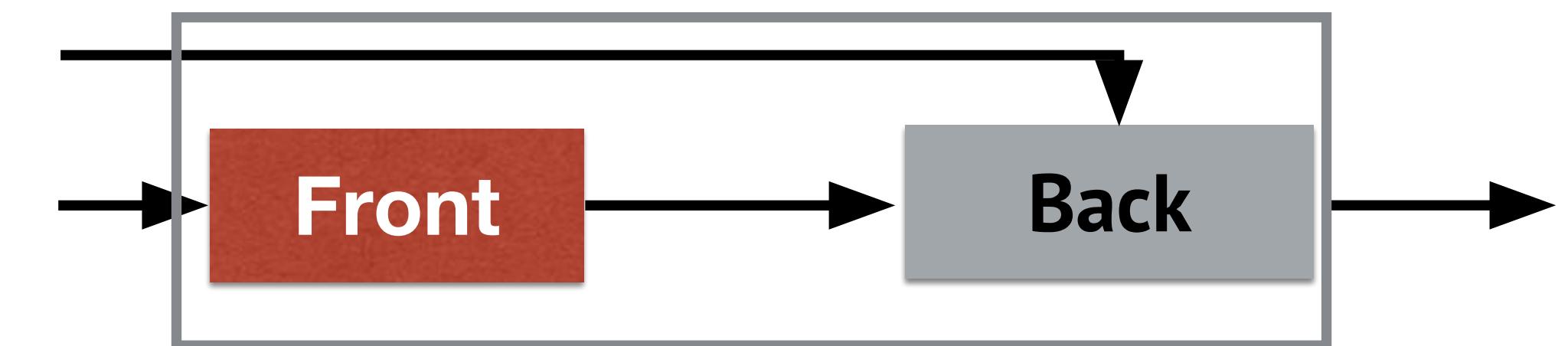
# Data Association Frontend



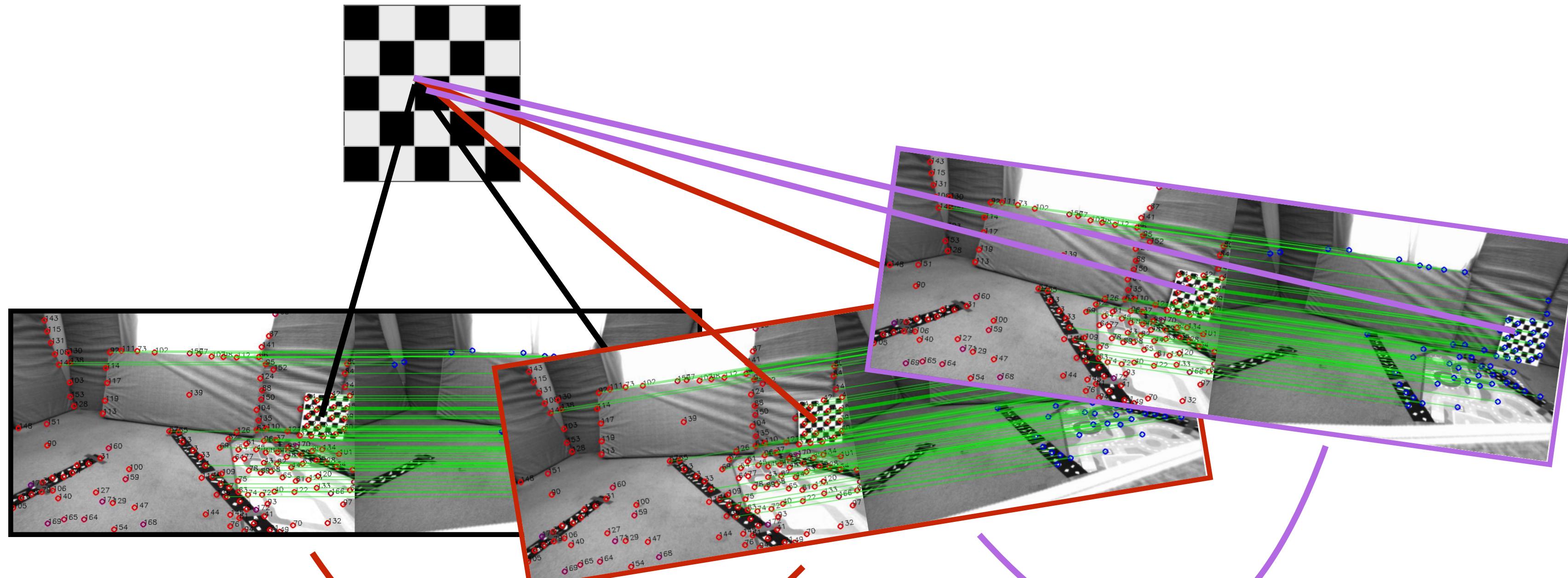
- ▶ Shi-Tomashi Corner Detector
- ▶ Lukas-Kanade Optical Flow feature tracking algorithm (up to 200Hz)



# Data Association Frontend



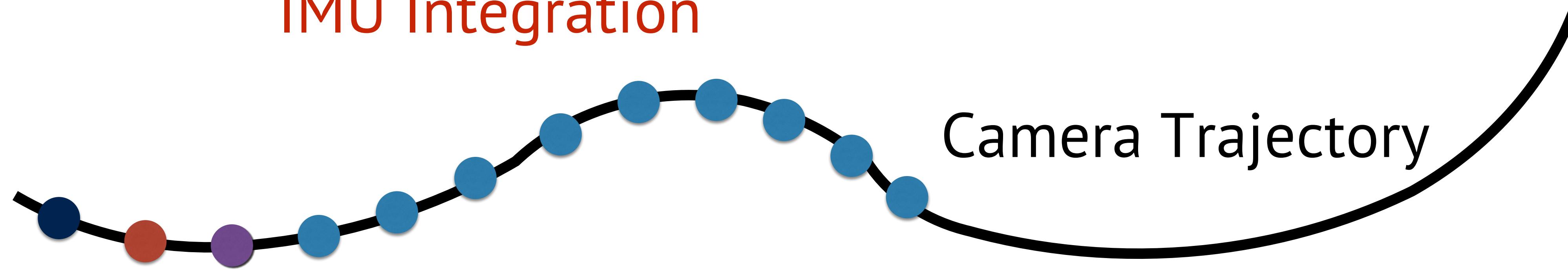
# A sequence of camera movements



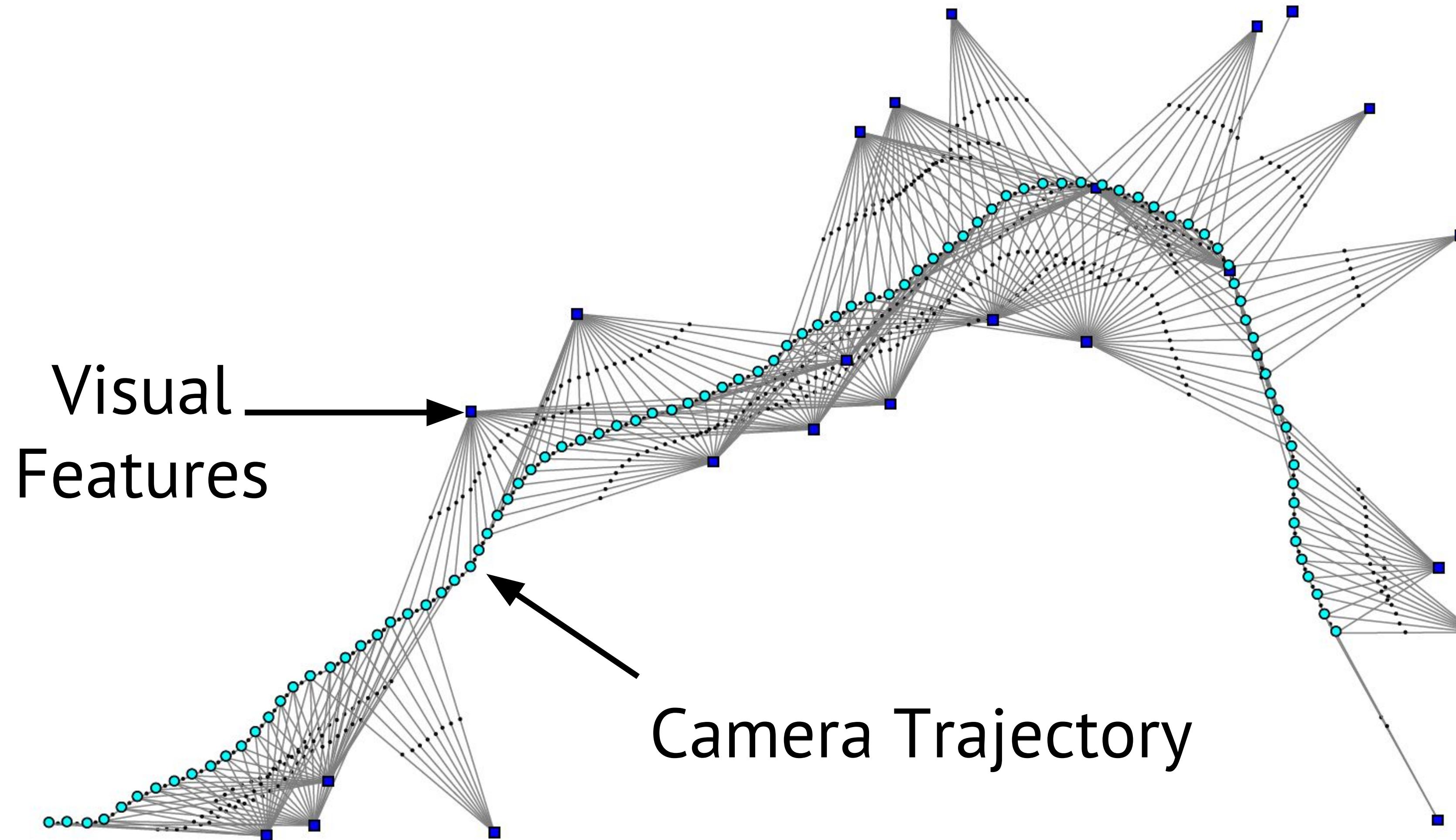
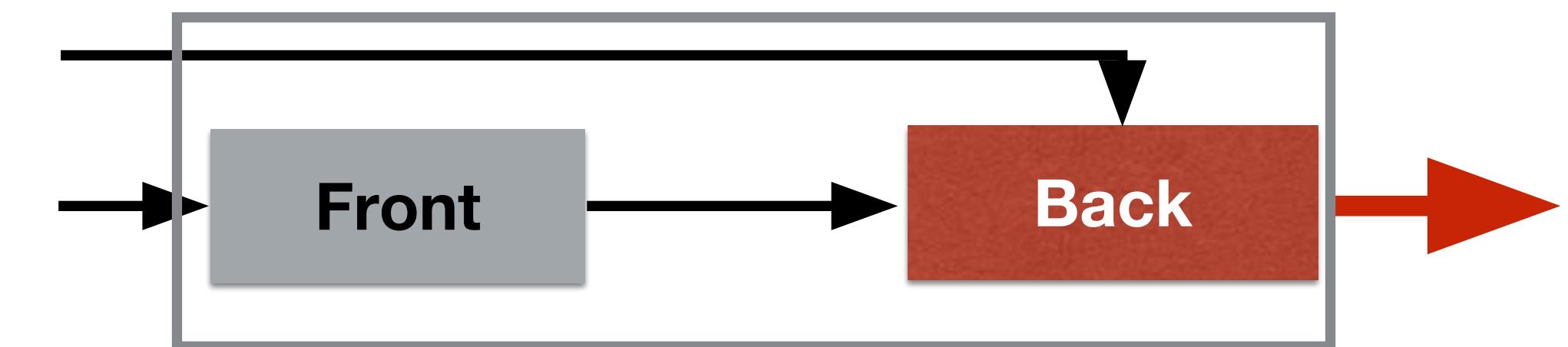
IMU Integration

IMU Integration

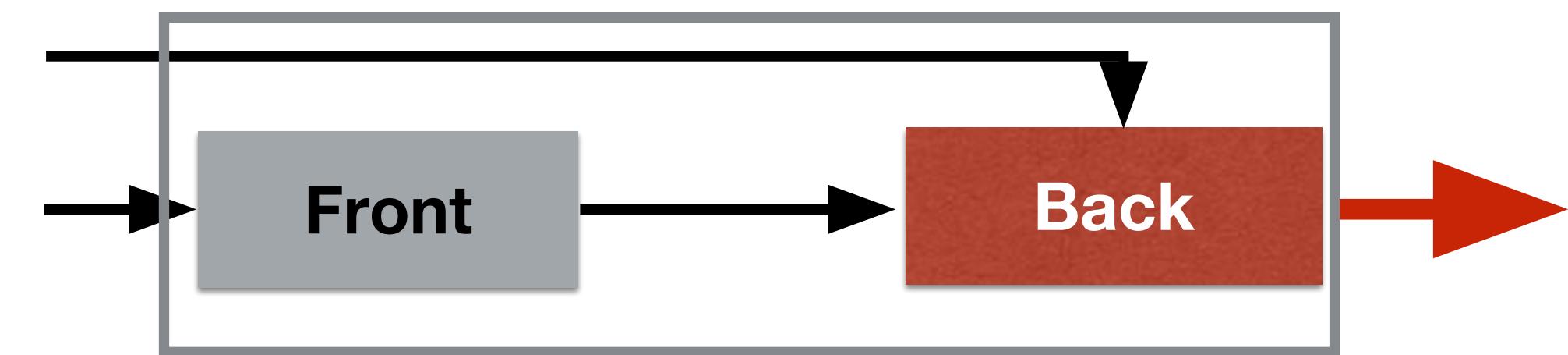
Camera Trajectory



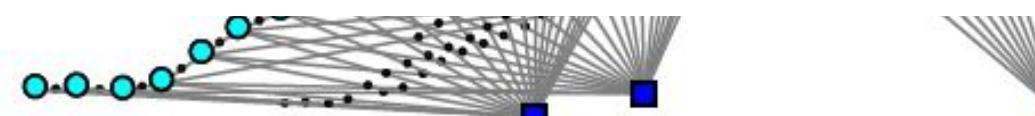
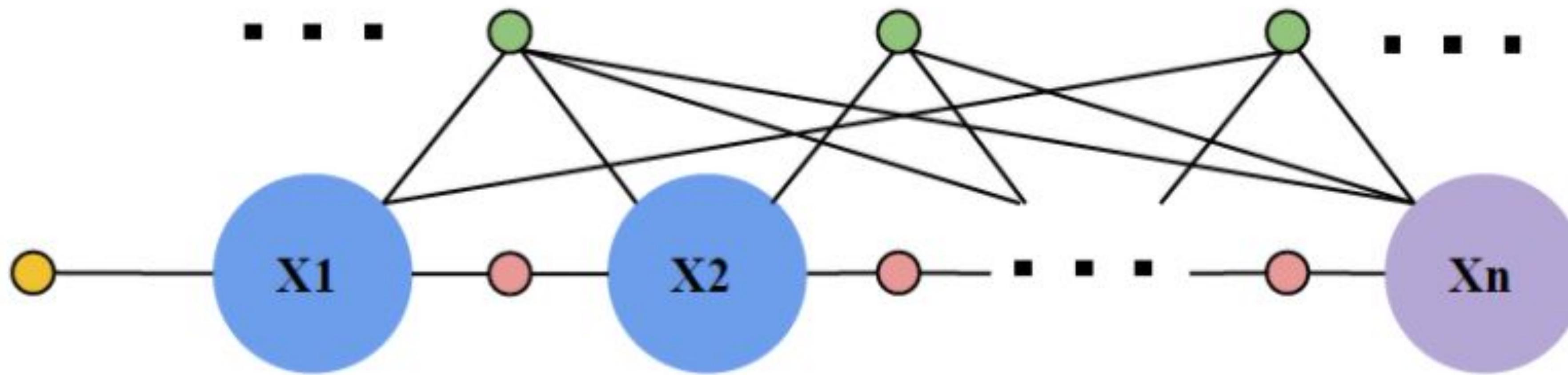
# Optimisation Backend



# Optimisation Using Graphs

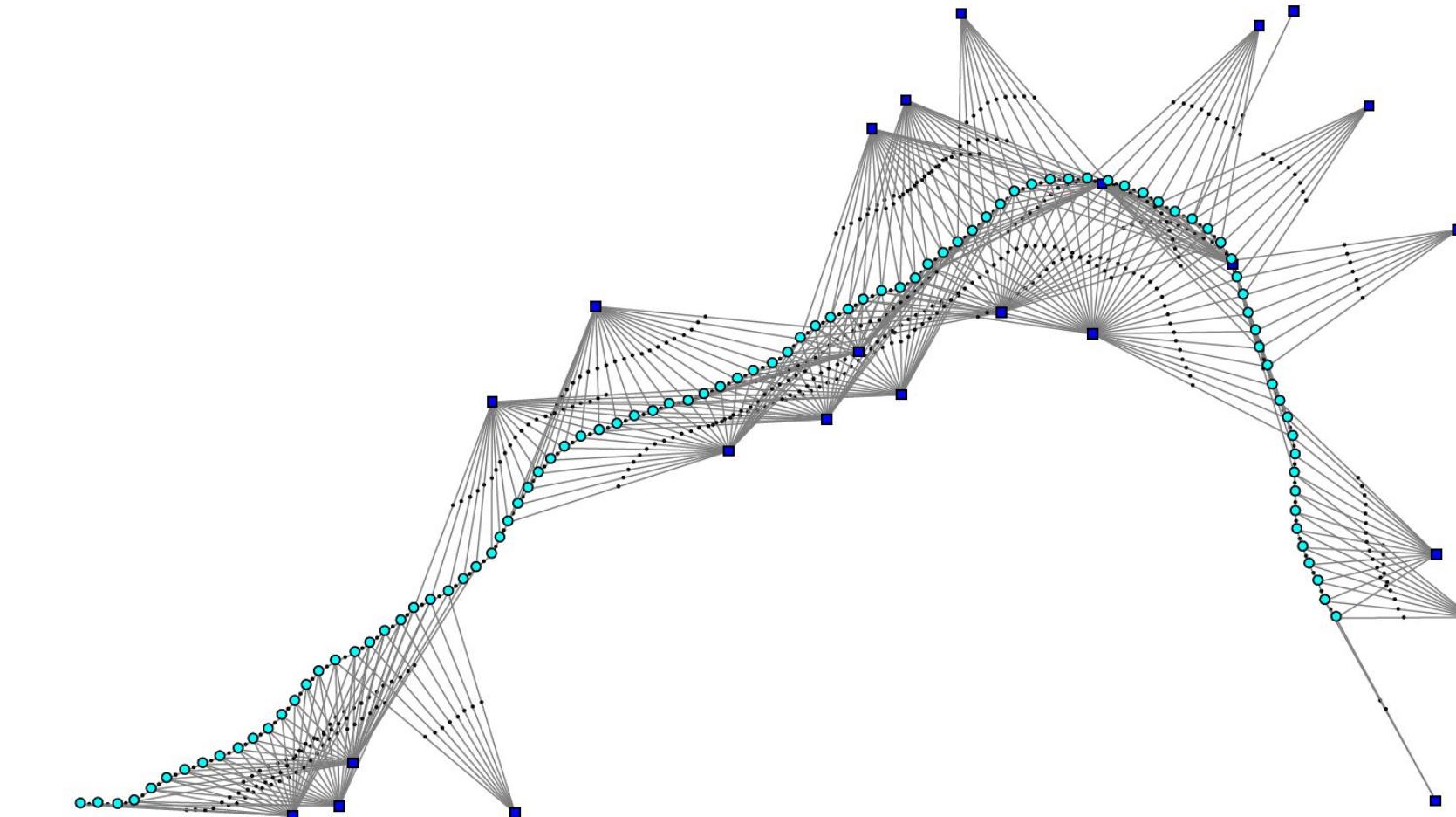


Graph

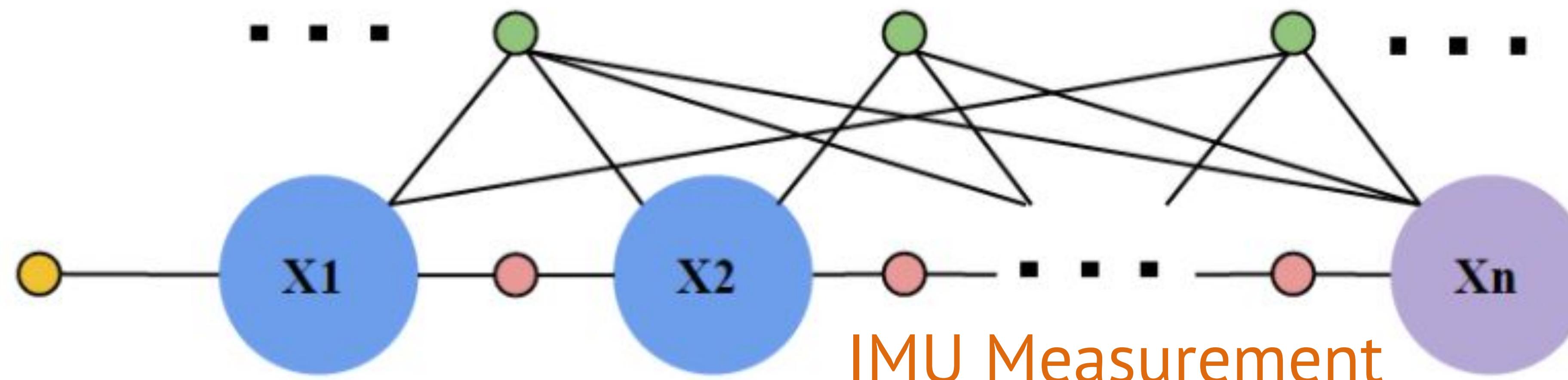


# Graph Optimisation

- ▶ Specifies the relationships between variables and measurements



Visual Measurement

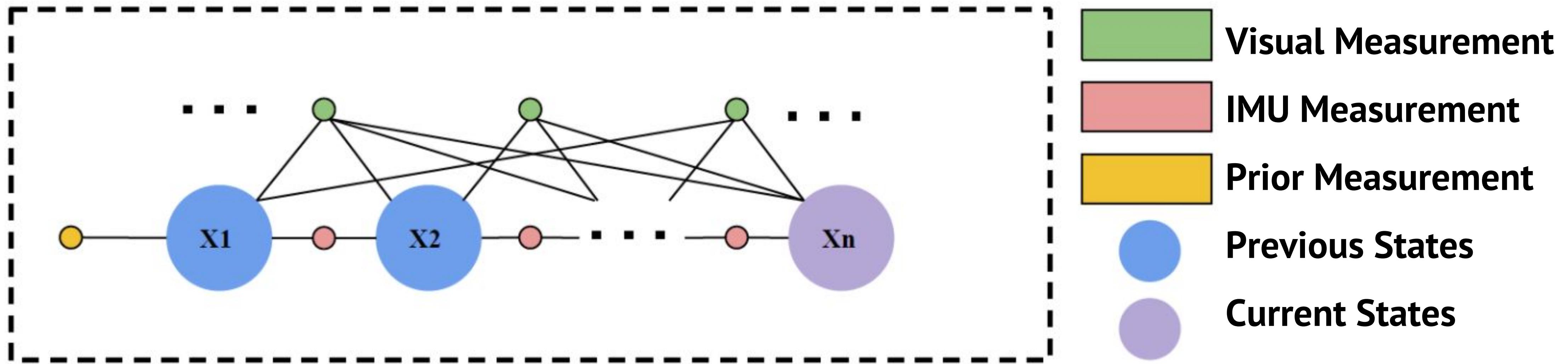


IMU Measurement

$X$  = Camera States  
(Position, Orientation, ...)

Time

# Graph Optimisation

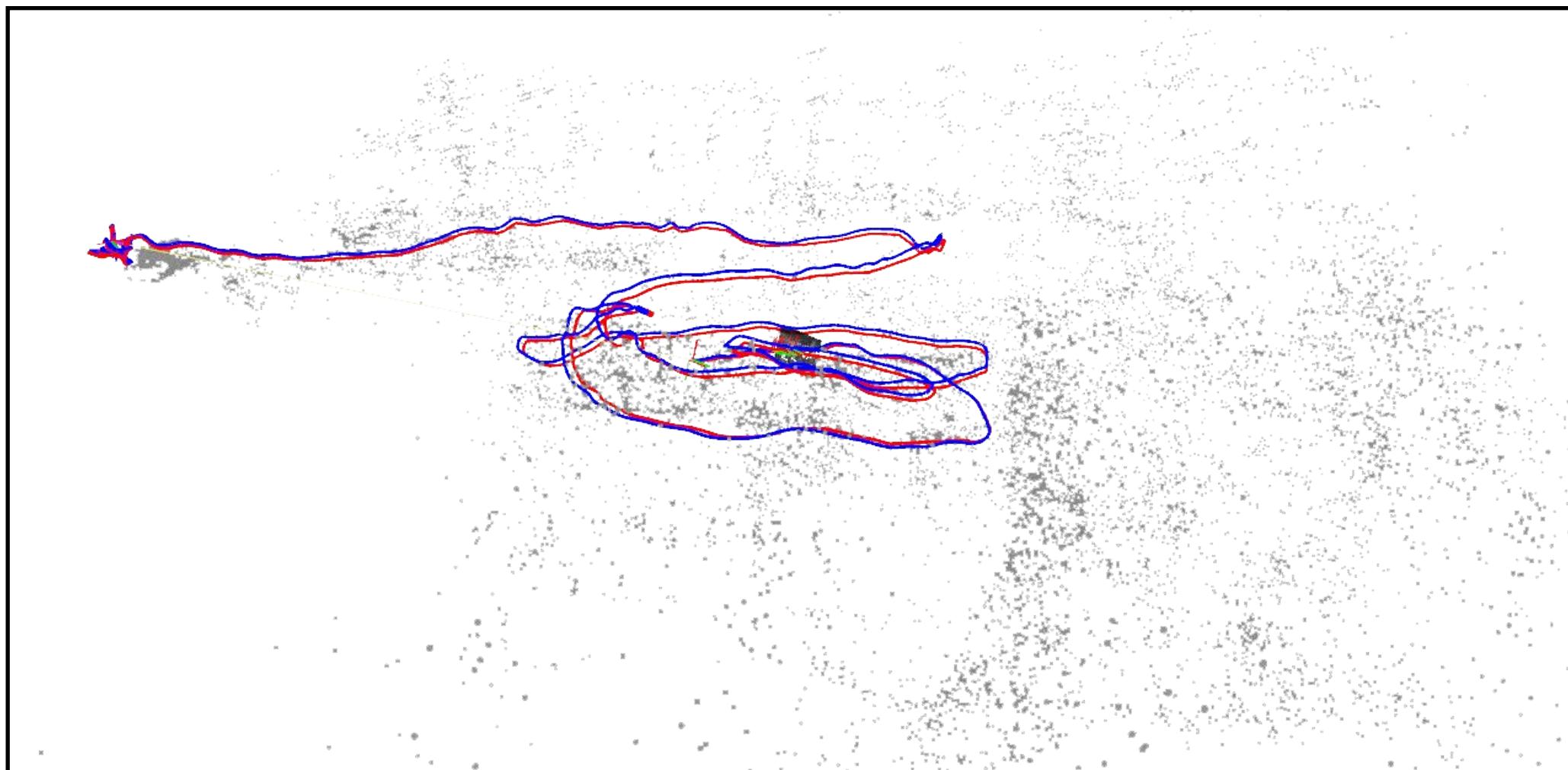


$$\chi^* = \underset{\chi_k}{\operatorname{argmin}} \left( p(\chi_0) \prod_{(i,j) \in I_k} p(z_{ij}^{imu} | x_i, x_j) \prod_{i \in I_k} \prod_{l \in C_i} p(z_{il}^{cam} | x_i) \right)$$

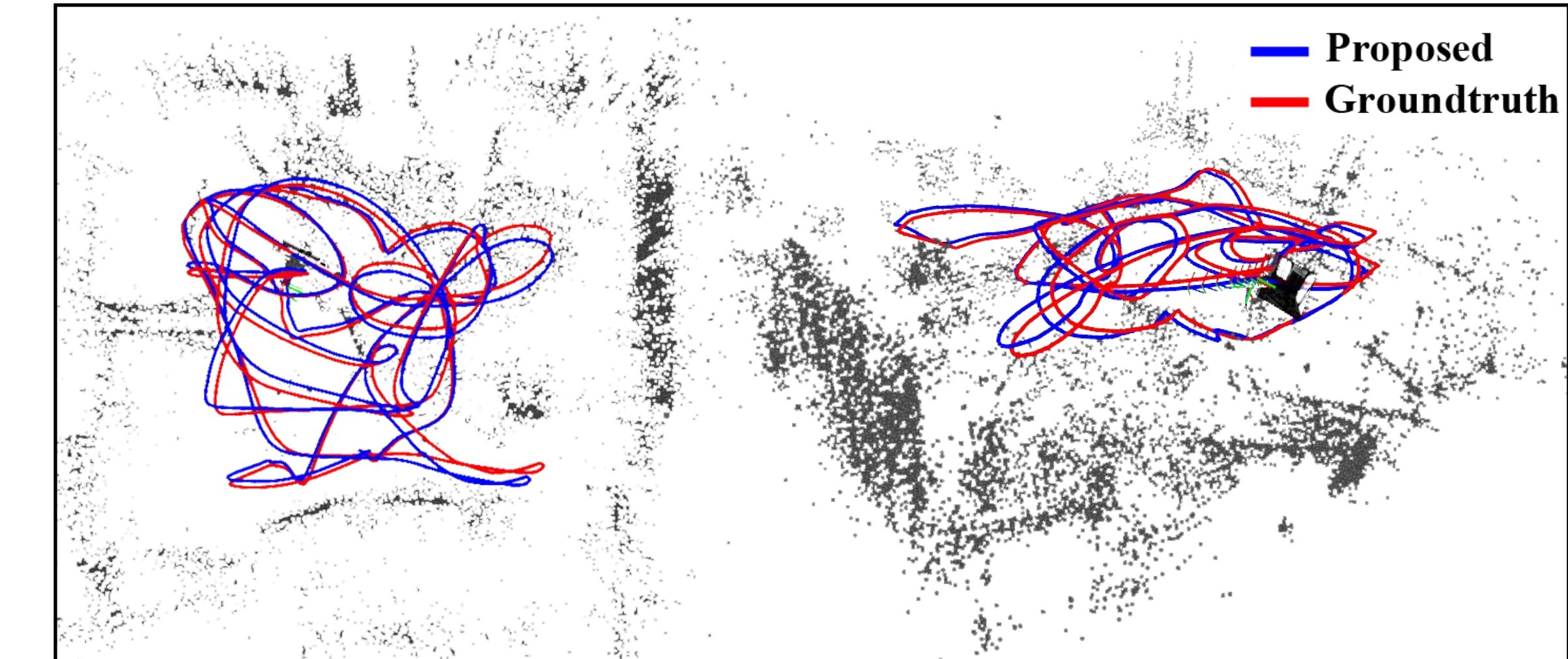
- › Solution is given by the optimal estimate that best explains all sensor measurements
- › Also known as **Maximum a Posterior Estimate (MAP)**

# VIO Datasets Trials

		RMSE	Mean	Median	Std	Min	Max
Absolute Trajectory Error (ATE)	Positional (m)	<b>0.131</b>	0.123	0.118	0.044	0.025	0.238
	Translational (m)	0.037	0.032	0.027	0.020	0.001	0.164
Relative Pose Error (RPE)	Rotational (°)	<b>0.652</b>	0.506	0.407	0.411	0.016	3.729



EuRoC VH\_01  
Dataset



EuRoC V2\_01  
Dataset

# Summary

- ▶ A localised inspection solution is essential to ensure an efficient, consistent, and accurate inspection process.
- ▶ A visual-inertial odometry algorithm is presented to allow accurate localisation in an underwater environment.
- ▶ A time-synchronised sensor pod is required for the data to be sent instantaneously and concurrently.
- ▶ With localisation information and synchronised data, 3D models can be reconstructed.

# Thank you!

- Andrew Tallaksen
- Lawrence Papincak
- Sudharshan Suresh
- Heather Jones
- William Whittaker
- Michael Kaess



rpl

Carnegie  
Mellon  
University

