

## *Agents with Attitudes*

Kurt Konolige, SRI International

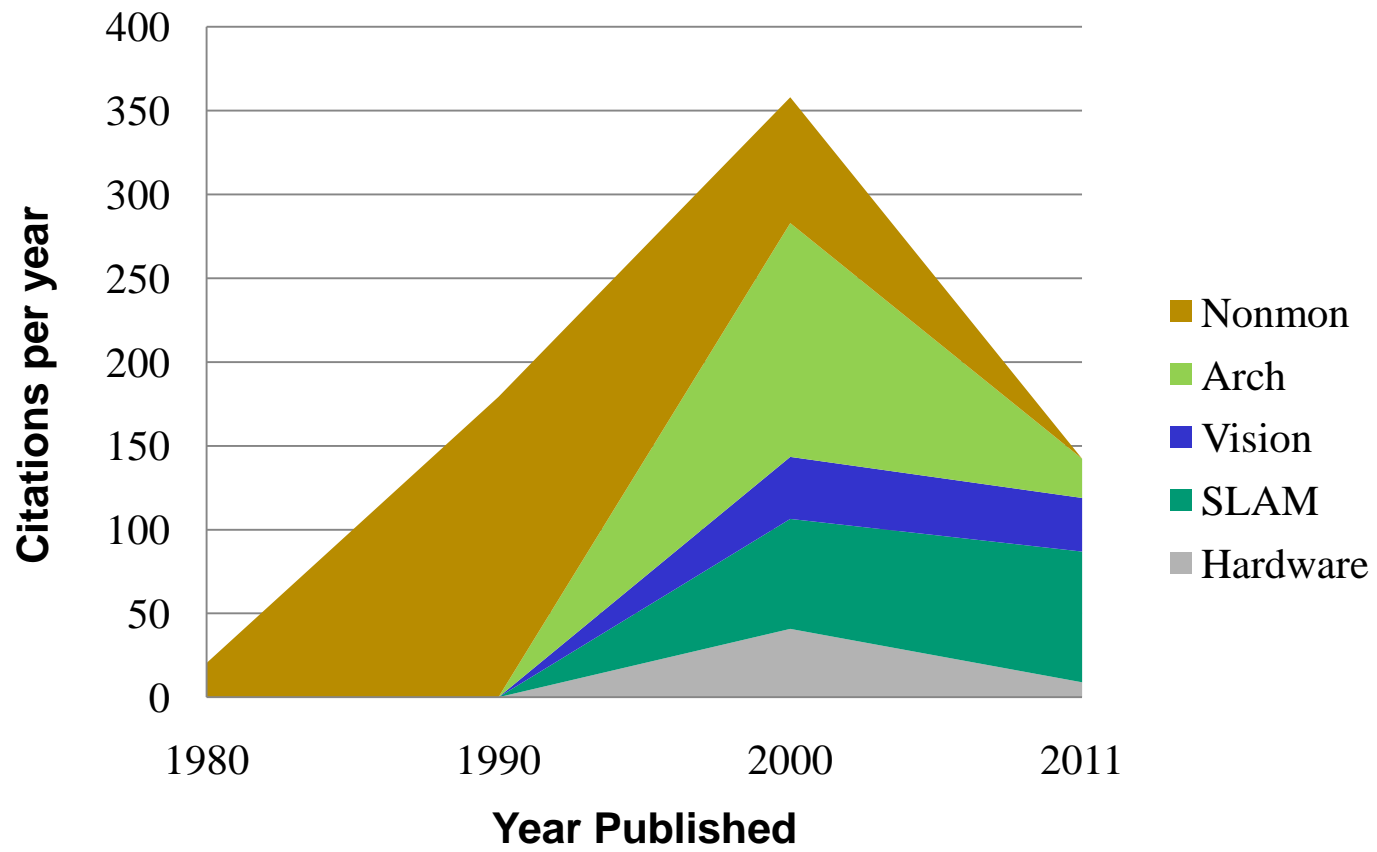
AAAI 9 (1991) Anaheim, CA

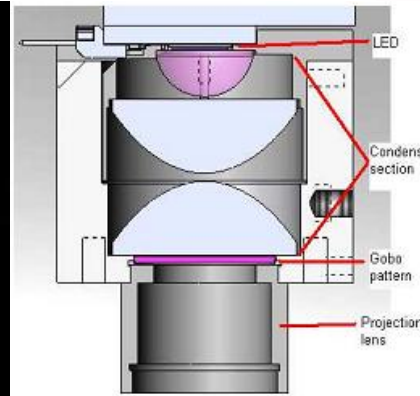
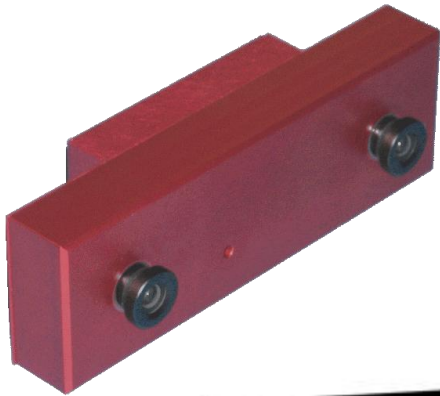
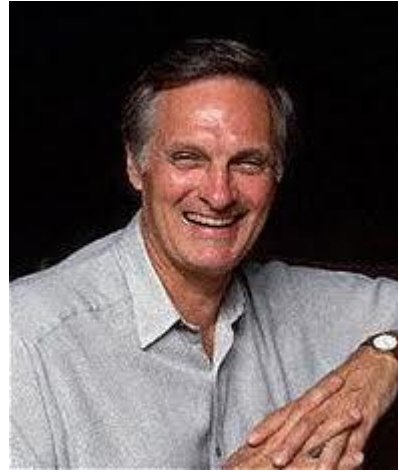
**Speaker's beliefs as a consequence of the speech act:**

$$\text{in } A_1: [u]\phi \wedge \neg L_0 \neg [s_f]\phi \supset [s_f]\phi \quad (12)$$

**Hearer's beliefs as a consequence of the speech act:**

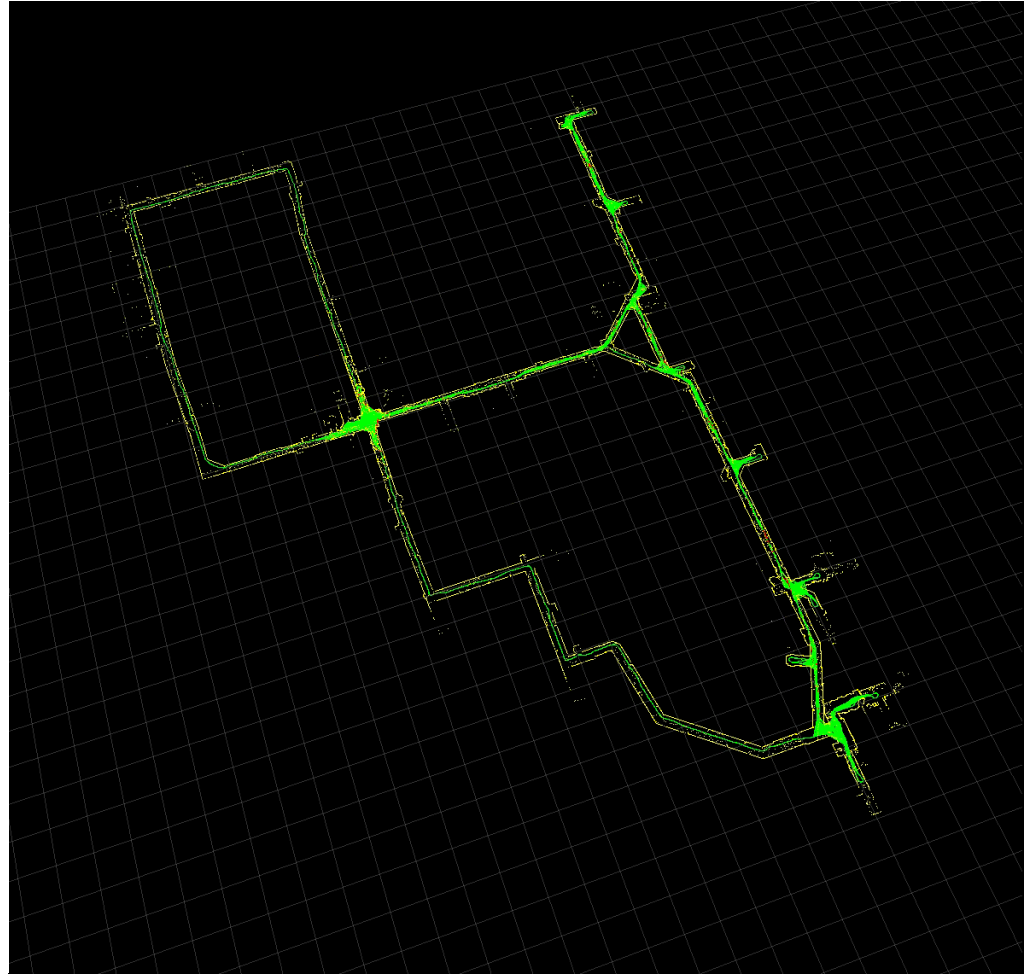
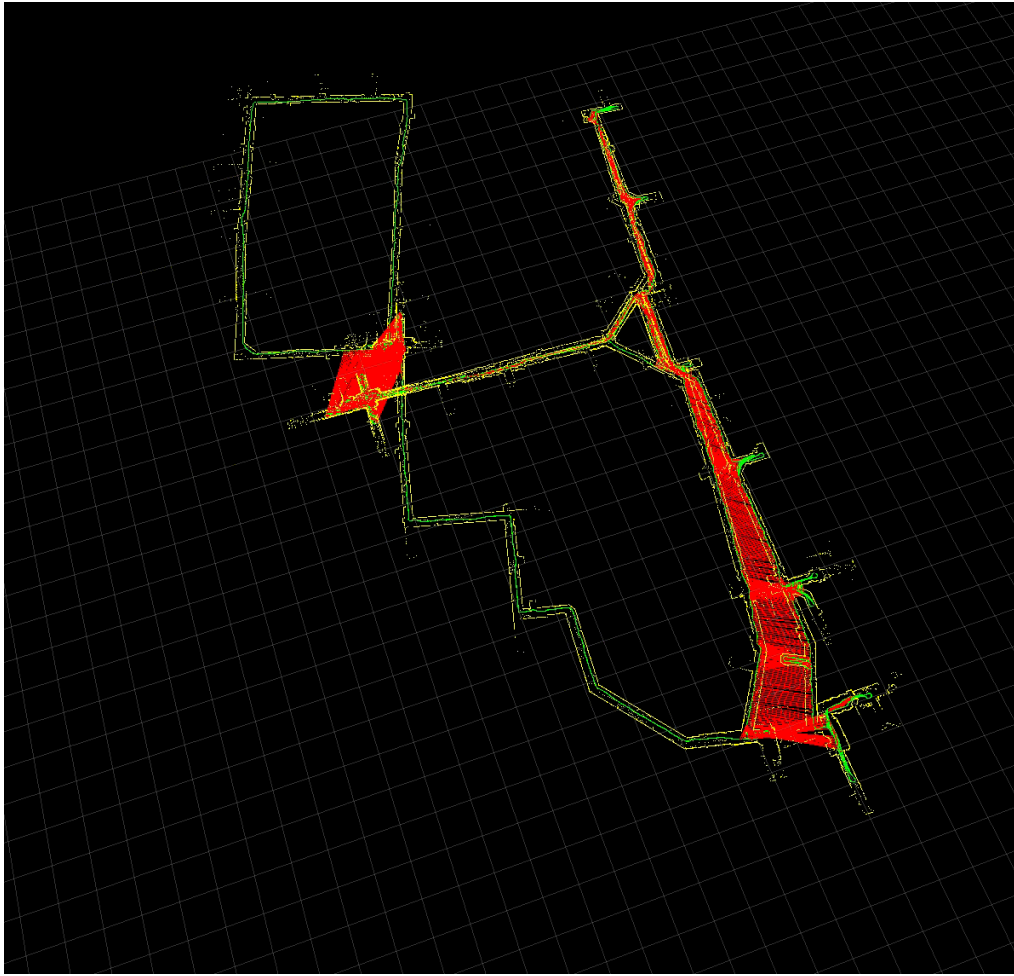
$$\begin{aligned} \text{in } A_1: & \quad - \\ & ([u]\phi \wedge \\ & \neg L_0 \neg [h_f]\phi \wedge \neg L_0 [h_f] \neg [s_f]\phi \wedge \\ & \neg L_0 [h_f] \neg [s_i][h_f]\phi) \supset [h_f]\phi \end{aligned} \quad (13)$$





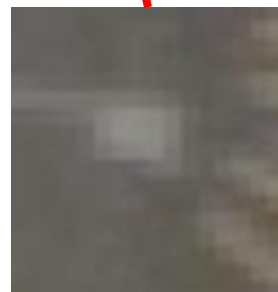
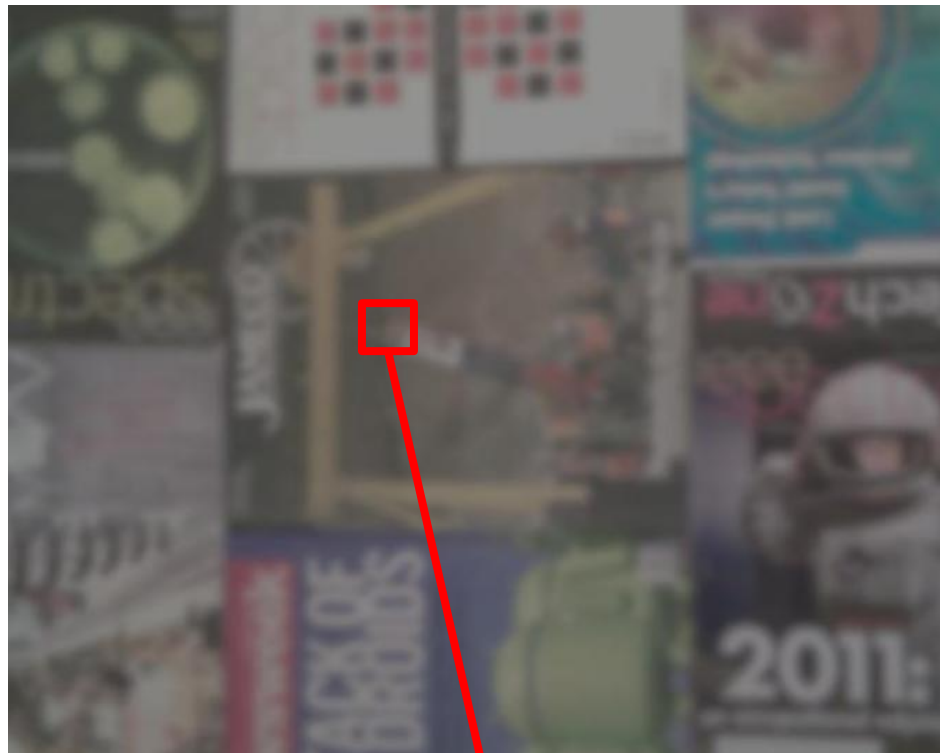
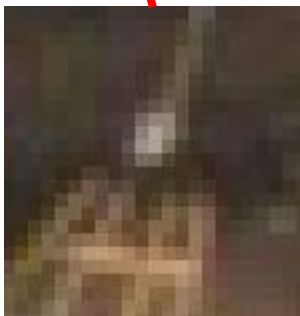
# Registration for Robotics

Kurt Konolige  
Willow Garage, Stanford CS



# *Visual Features*



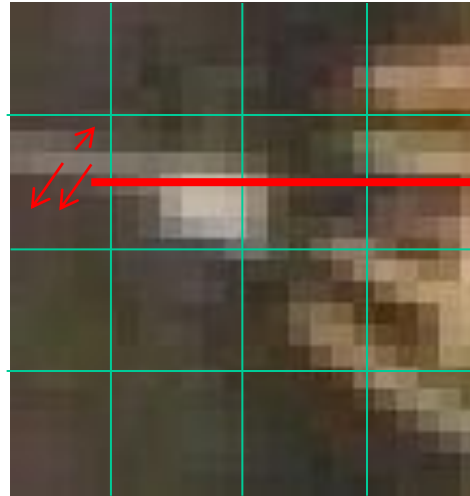


# 2D Features - Descriptors

Histogram of Gradients

SIFT [Lowe 1999]

SURF [Bay et al. 2006]



$8 \text{ bins} * 4 \text{ bytes} * 16$   
cells = 256 bytes

BRIEF Feature [Calonder et al. 2010]

ORB Feature [Rublee et al. ICCV 2011]



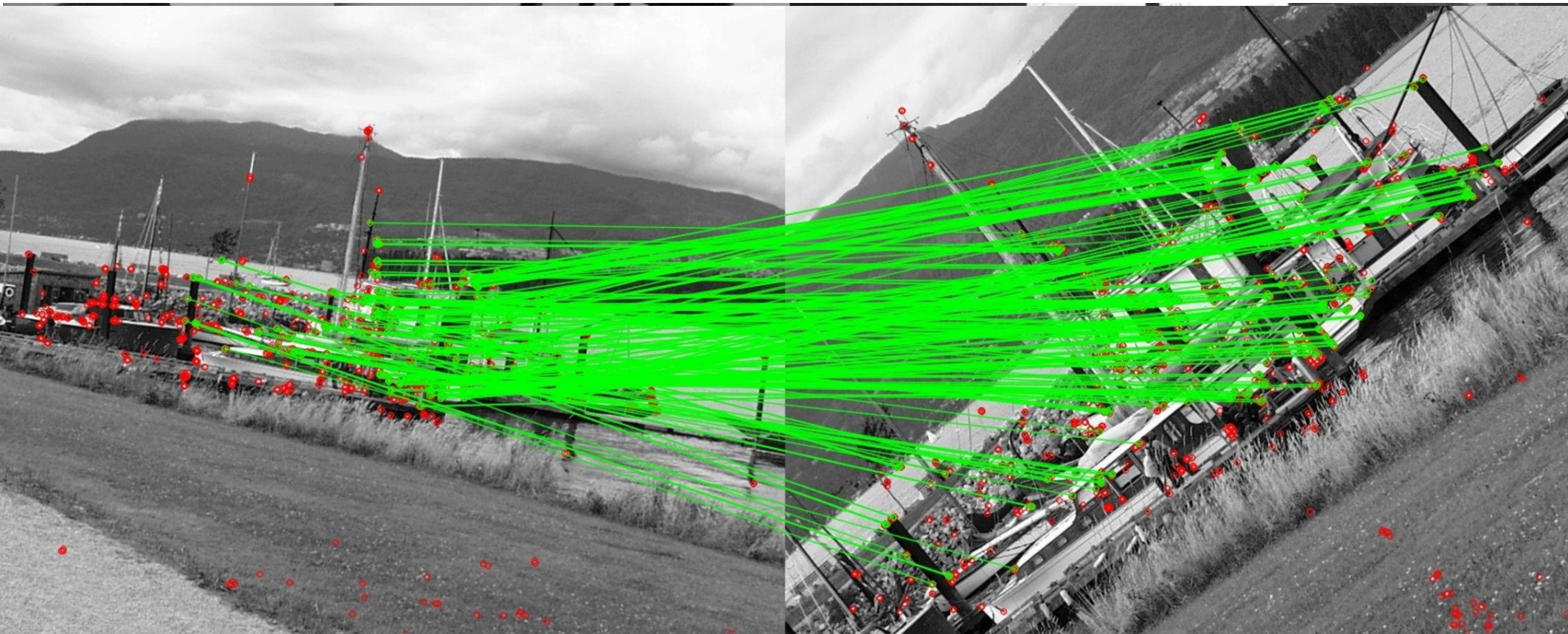
101...

256 bits = 32 bytes

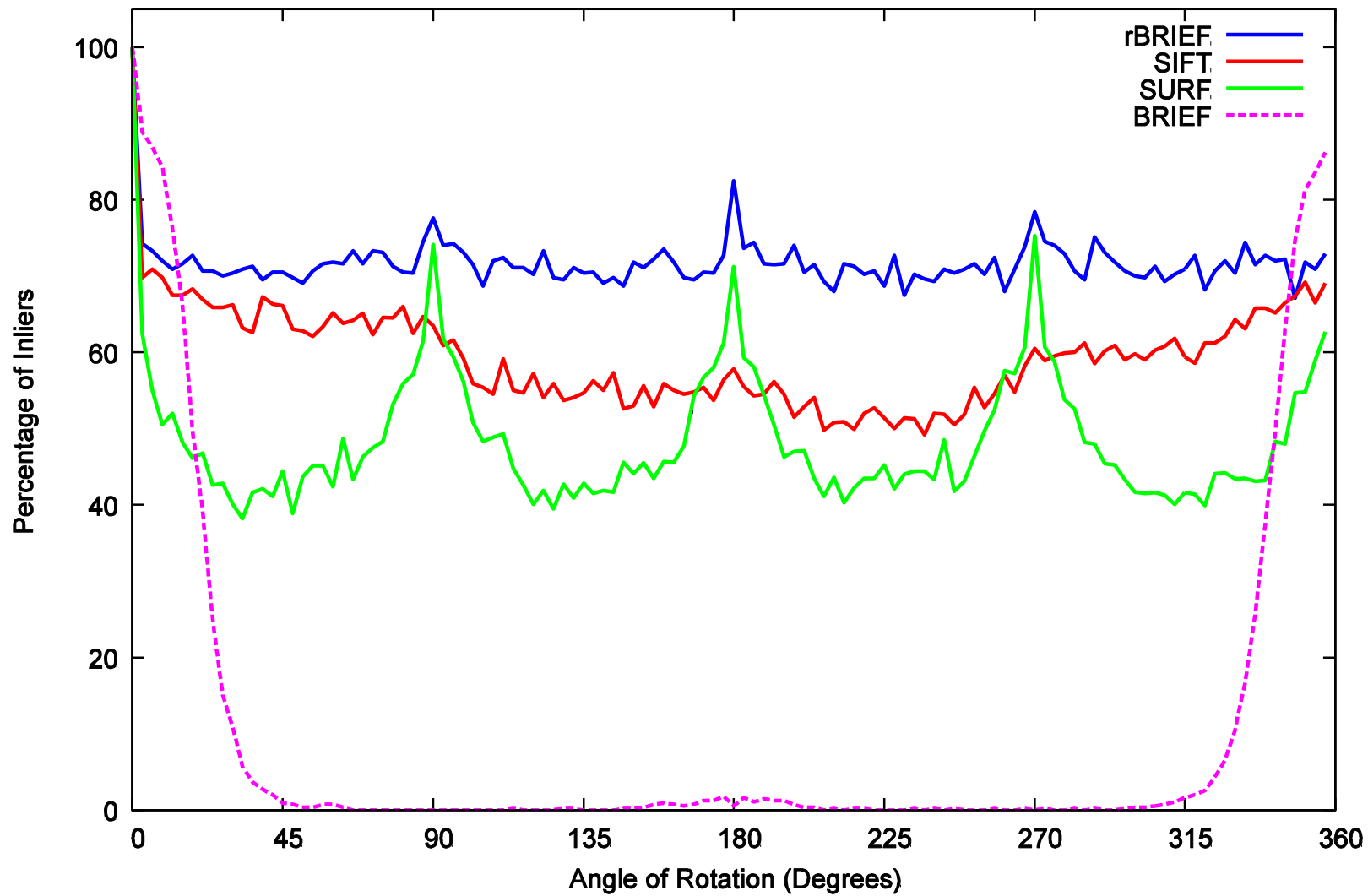
Works surprisingly well except for:

- scale
- image rotation





Percentage of Inliers considering In Plane Rotation



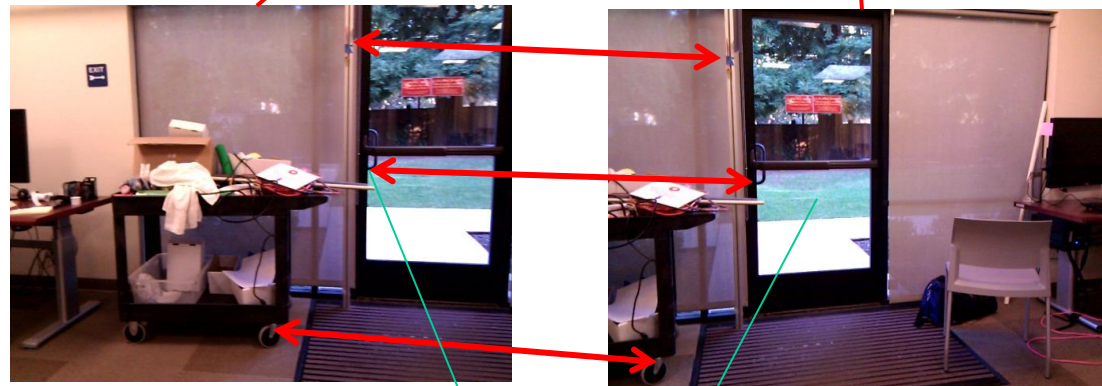
ms per frame (2000 features, 640x480):

SIFT: 5228ms [1999]

SURF: 217ms [2006]

ORB **19ms** [2011]

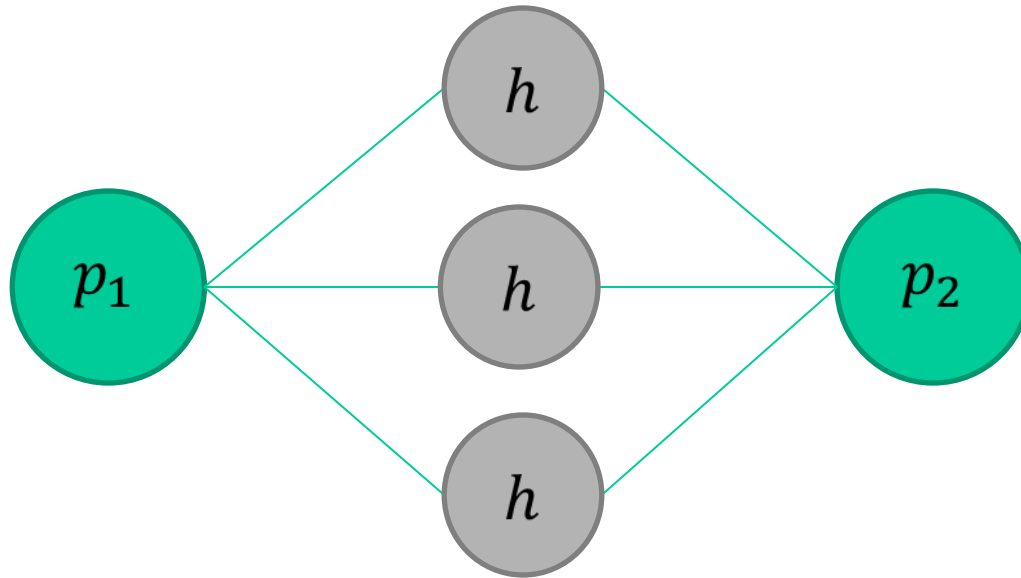




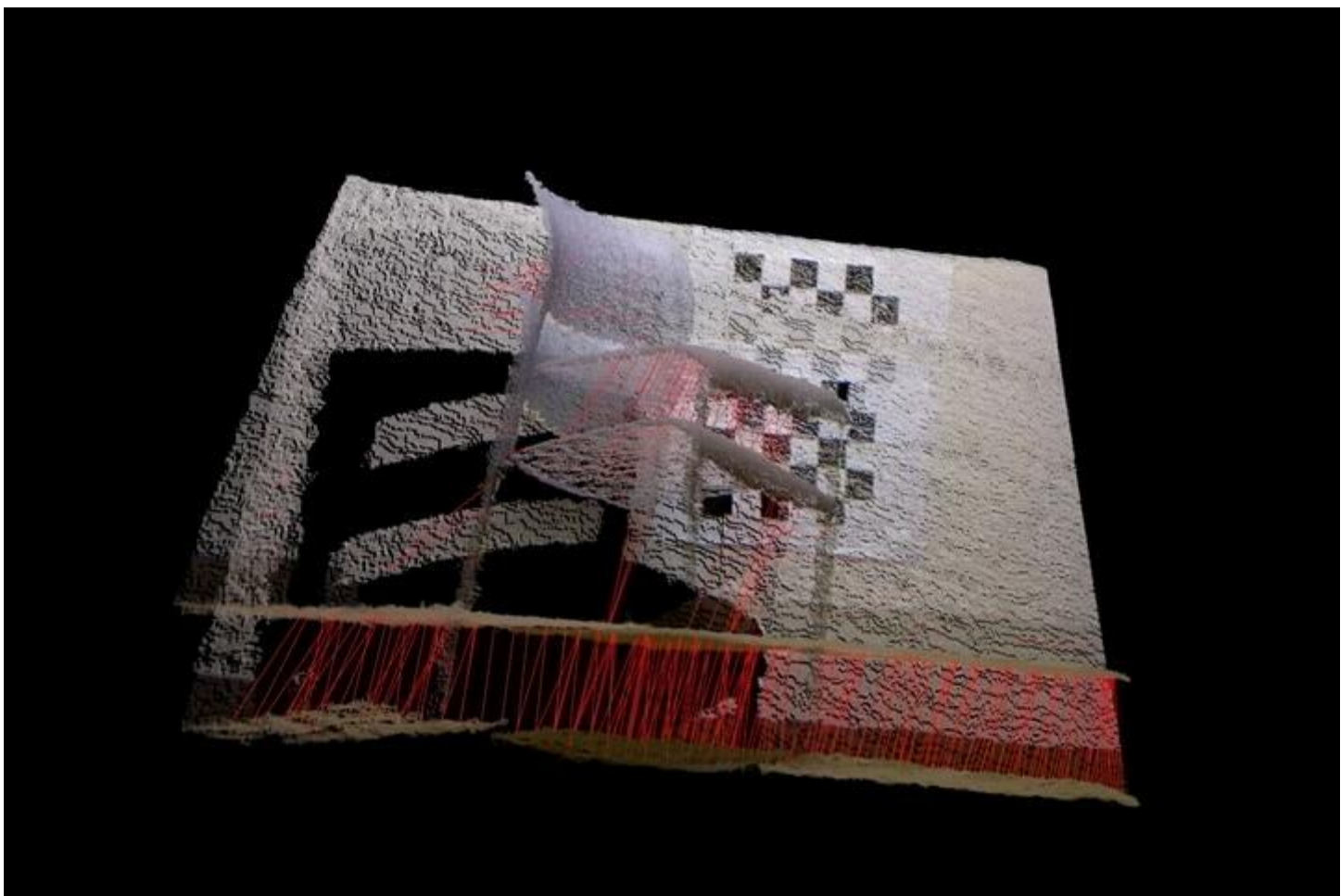
Planar Homography  
[images from Ethan Rublee]

$$f(p_1, p_2) = \prod_i h_i(p_1, p_2)$$

...

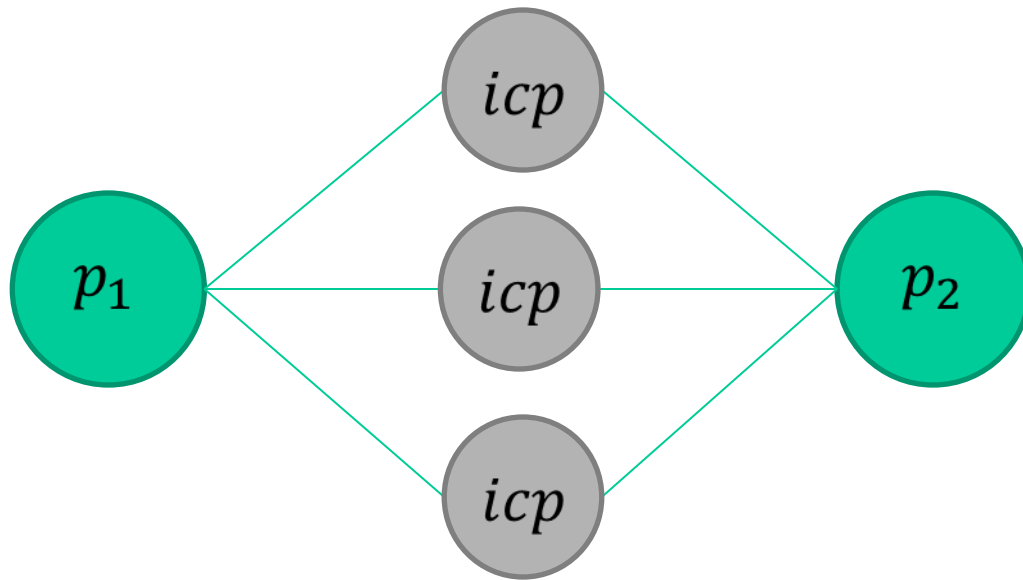


...

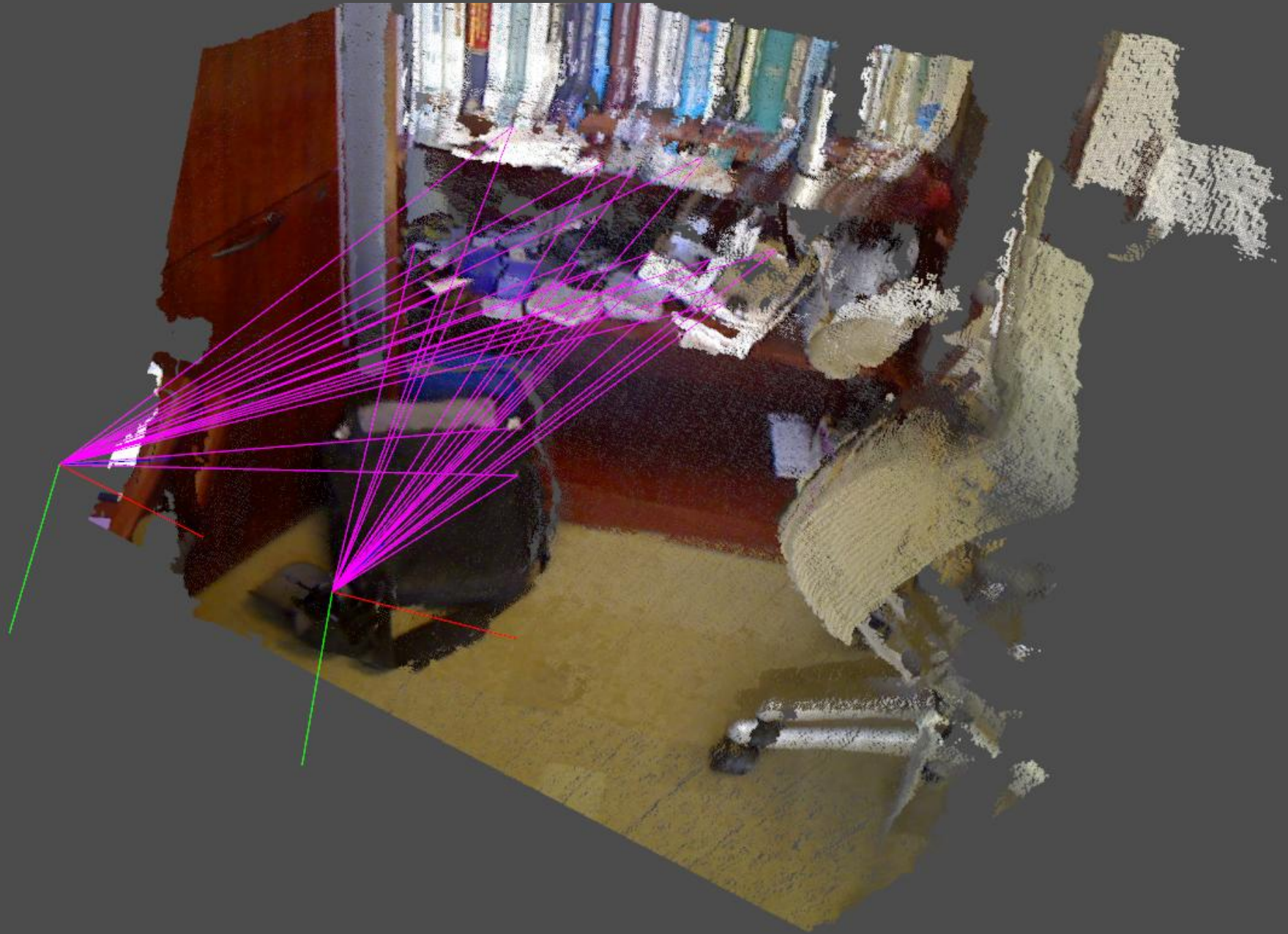


$$f(p_1, p_2) = \prod_i icp_i(p_1, p_2)$$

...



...

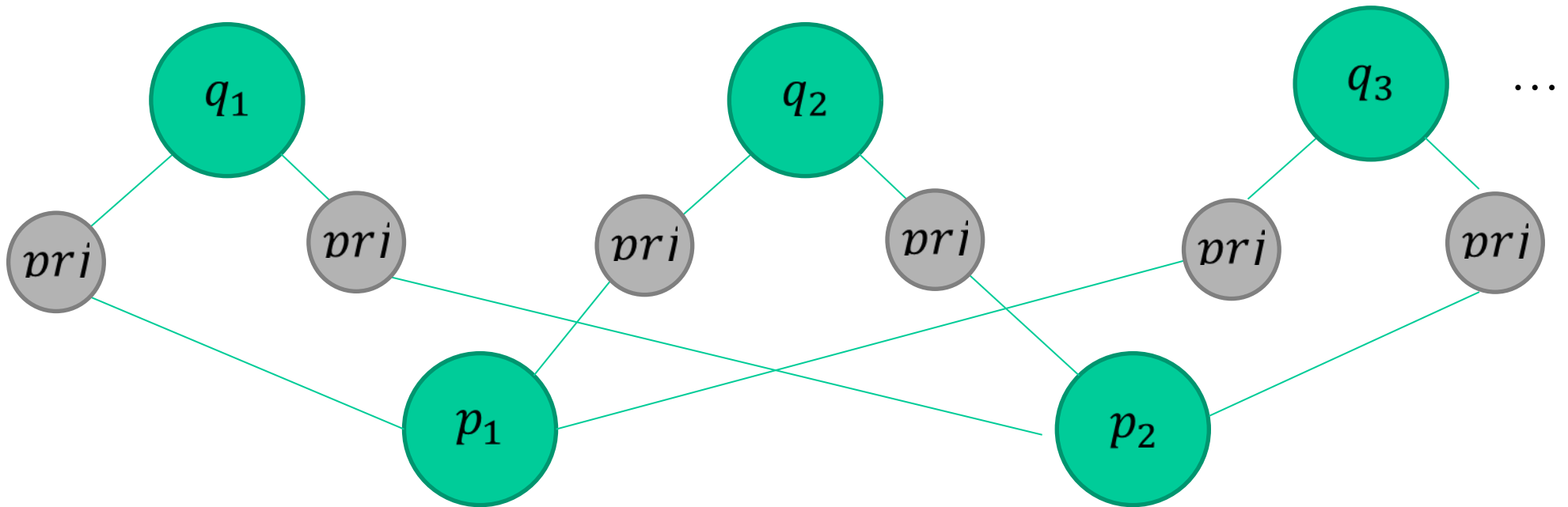


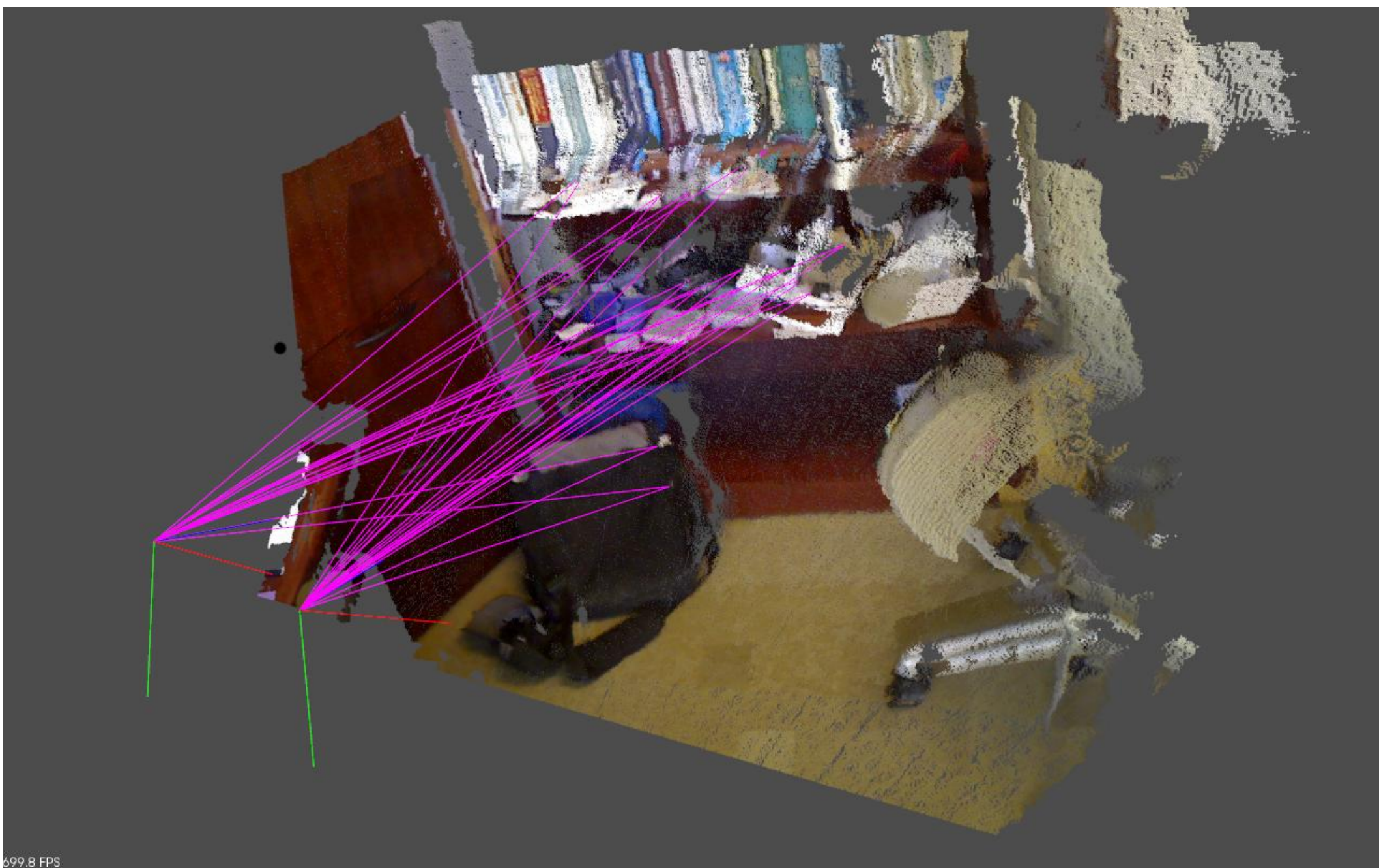
759.4 FPS

Bundle Adjustment [Nicola Fioraio, Boris Lau]



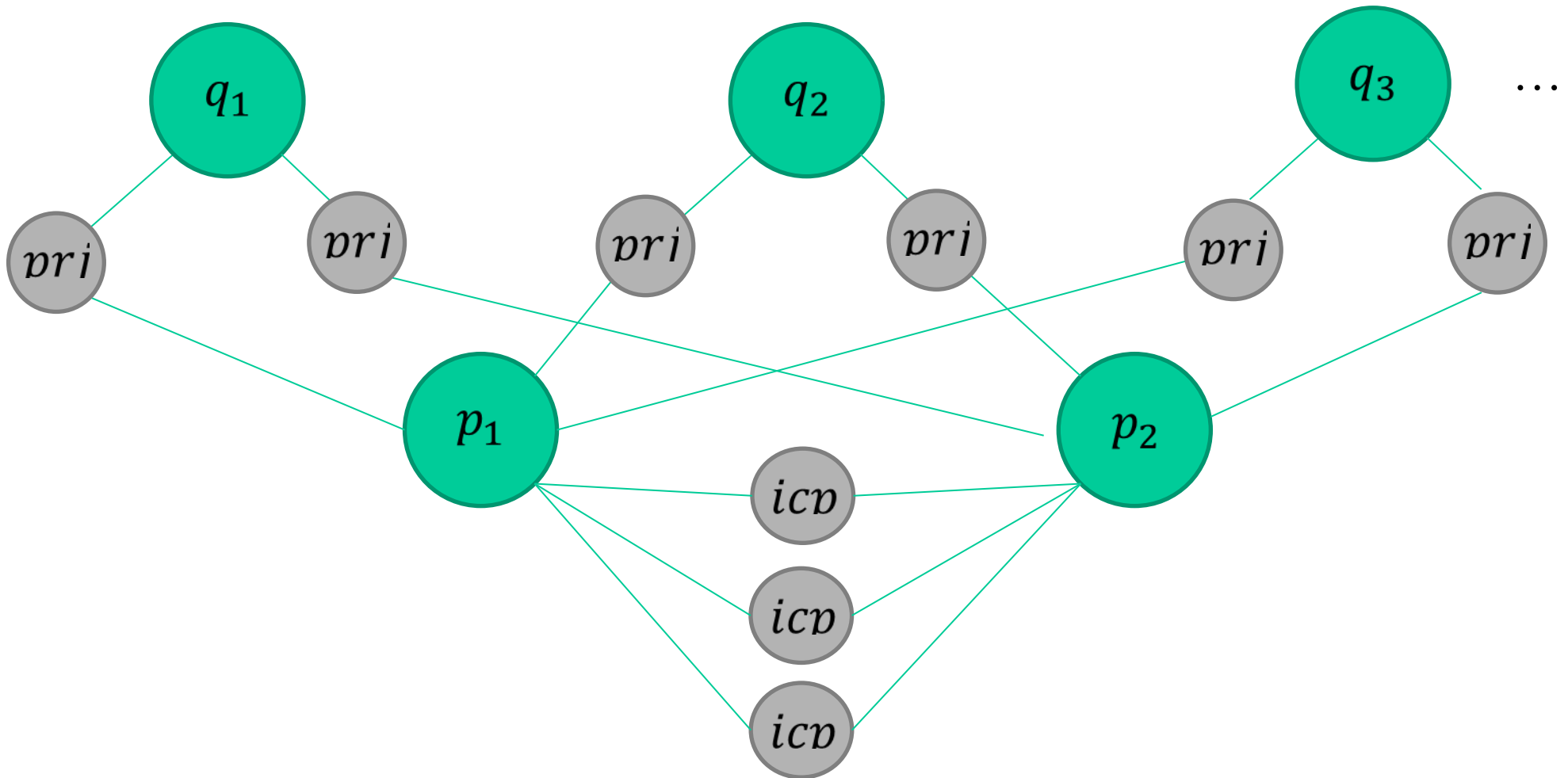
$$f(p_1, p_2, q_1, q_2, q_3, \dots) = \prod_i \text{pr}j_i(p_1, q_i) \text{pr}j_i(p_2, q_i)$$

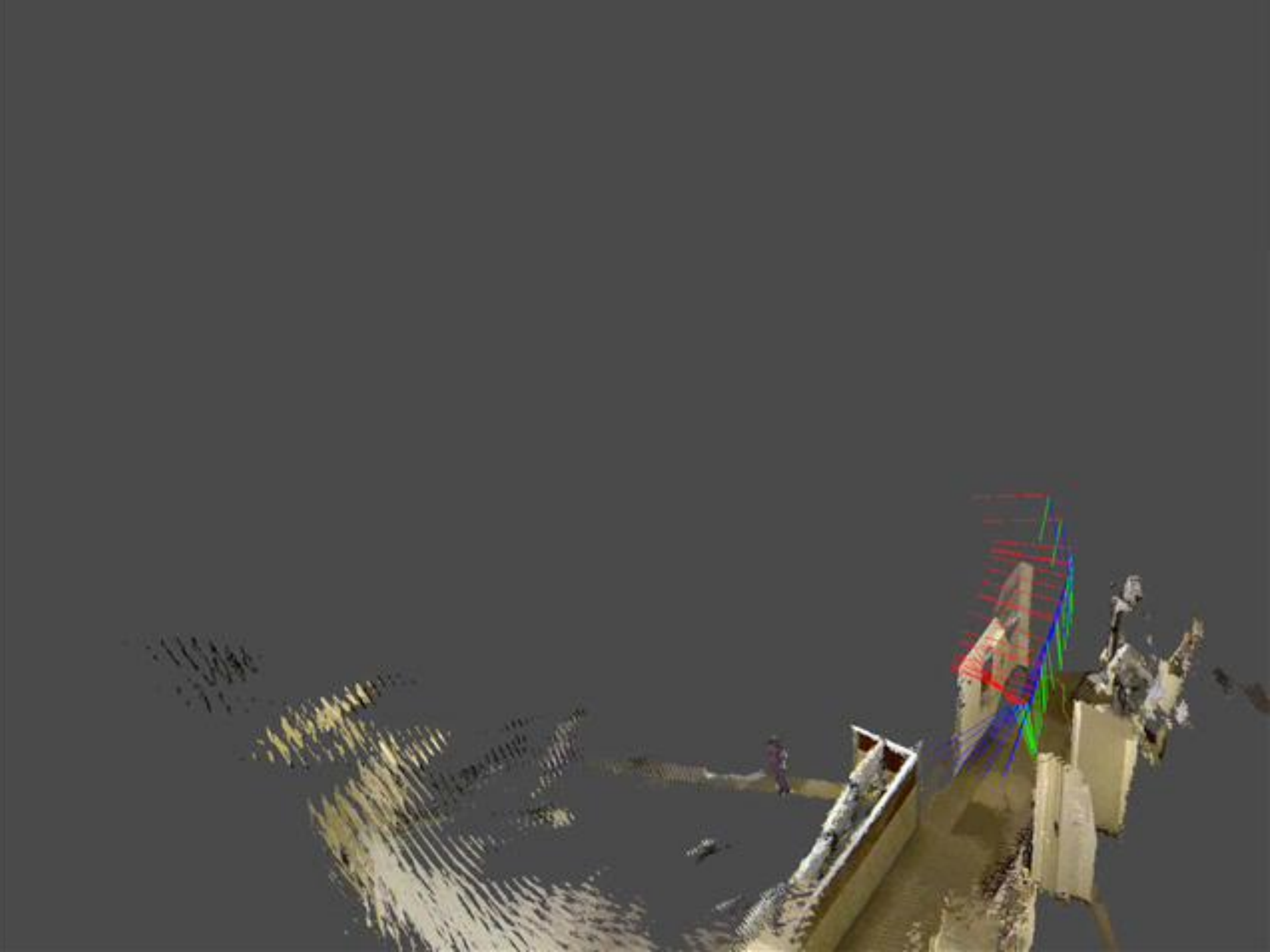




Bundle Adjustment [Nicola Fioraio, Boris Lau]

$$f(p_1, p_2, q_1, q_2, q_3, \dots) = \prod_i prj_i(p_1, q_i) prj_i(p_2, q_i) \prod_i icp_i(p_1, p_2)$$





# Photo tourism [Snavely, Seitz, Szeliski 2006]



Large nonlinear estimation problem: Bundle Adjustment  
*Thousands of camera poses, millions of points*

# Double Window Optimisation for Constant Time Visual SLAM

Hauke Strasdat et al., ICCV 2011



UNI  
FREIBURG

**AIS** Autonomous  
Intelligent  
Systems

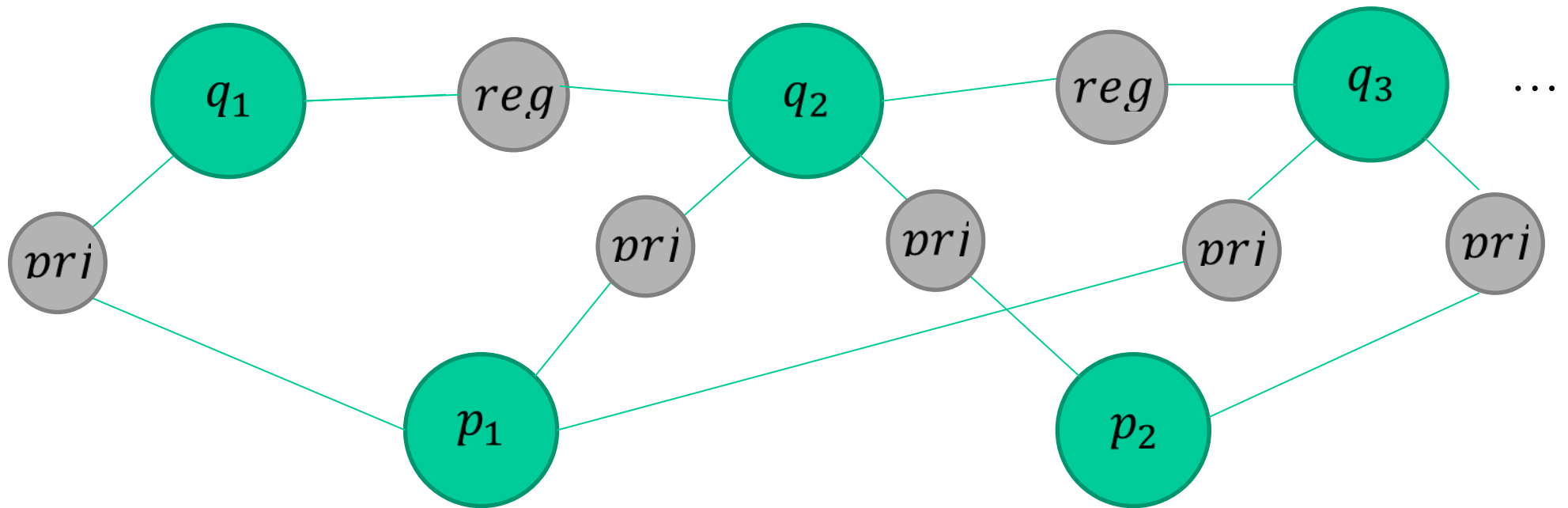
## Sparse Surface Adjustment Demonstration on Kinect Data

M. Ruhnke, R. Kümmerle, G. Grisetti, W. Burgard

University of Freiburg, Germany

<http://www.informatik.uni-freiburg.de/~ruhnke/>

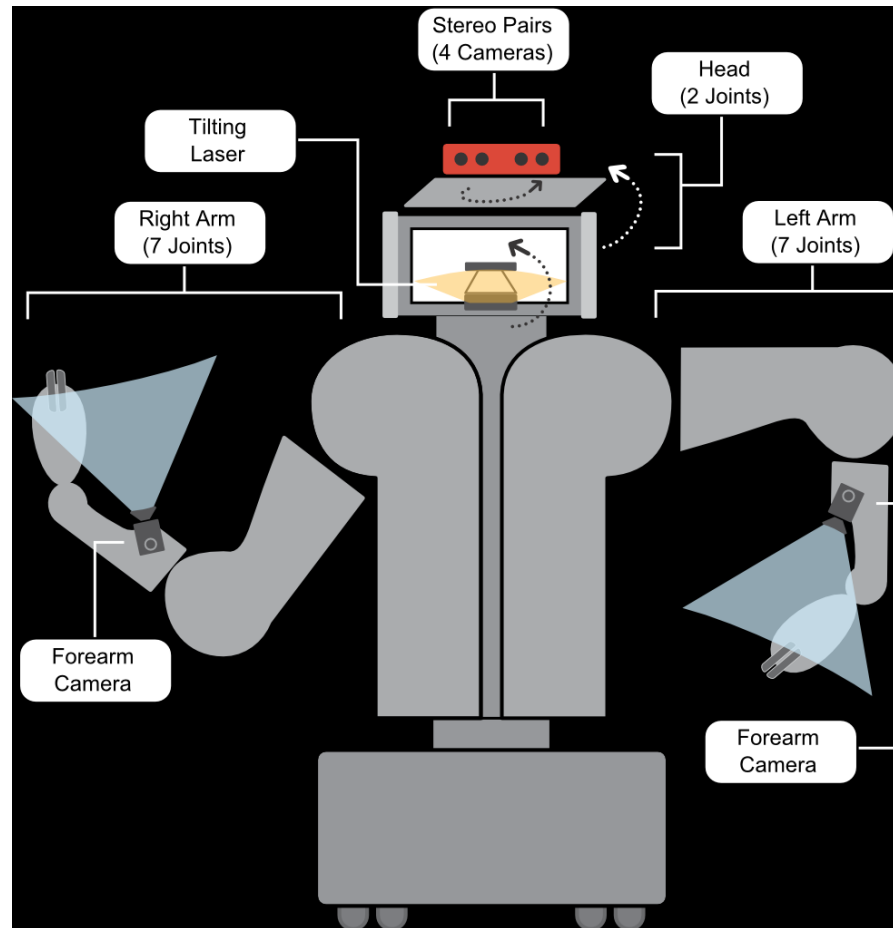
$$f(p_1, p_2, q_1, q_2, q_3, \dots) = \prod_i pr_{ji}(p_1, q_i) pr_{ji}(p_2, q_i) \prod_{jk} reg_{jk}(q_j, q_k)$$

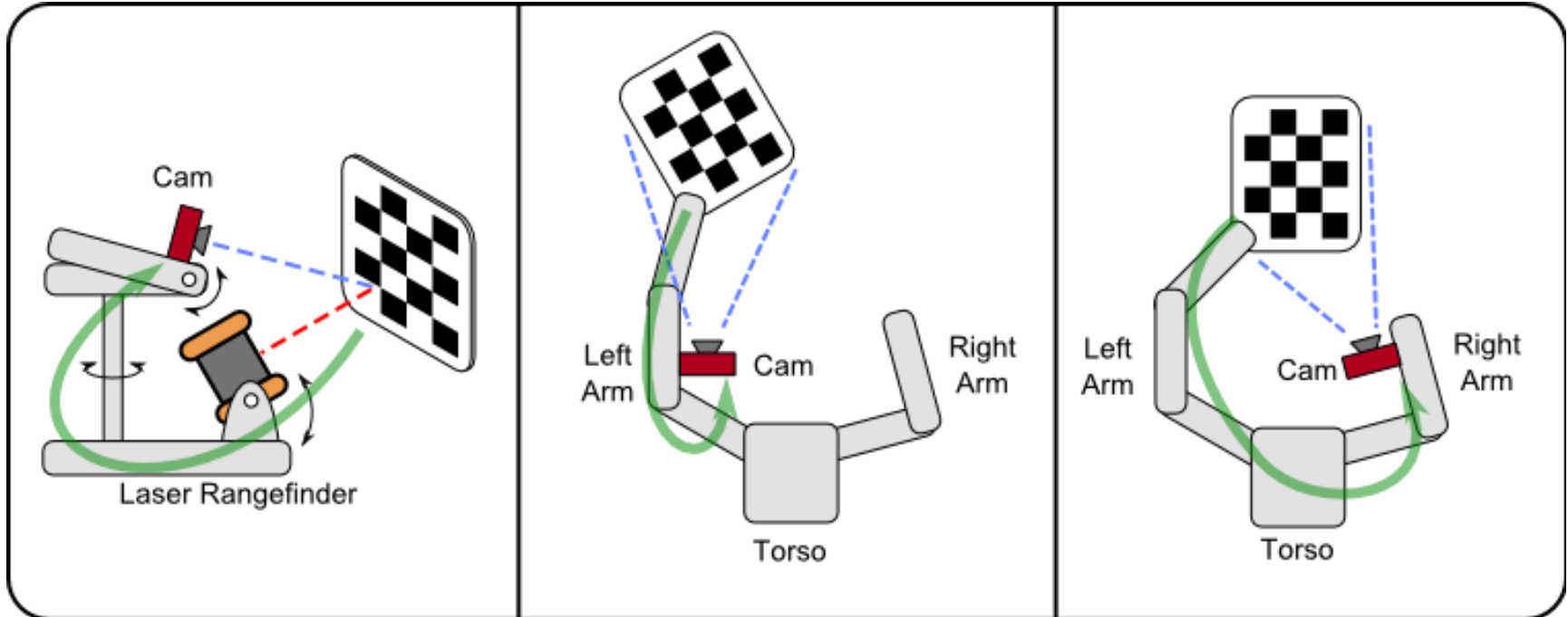




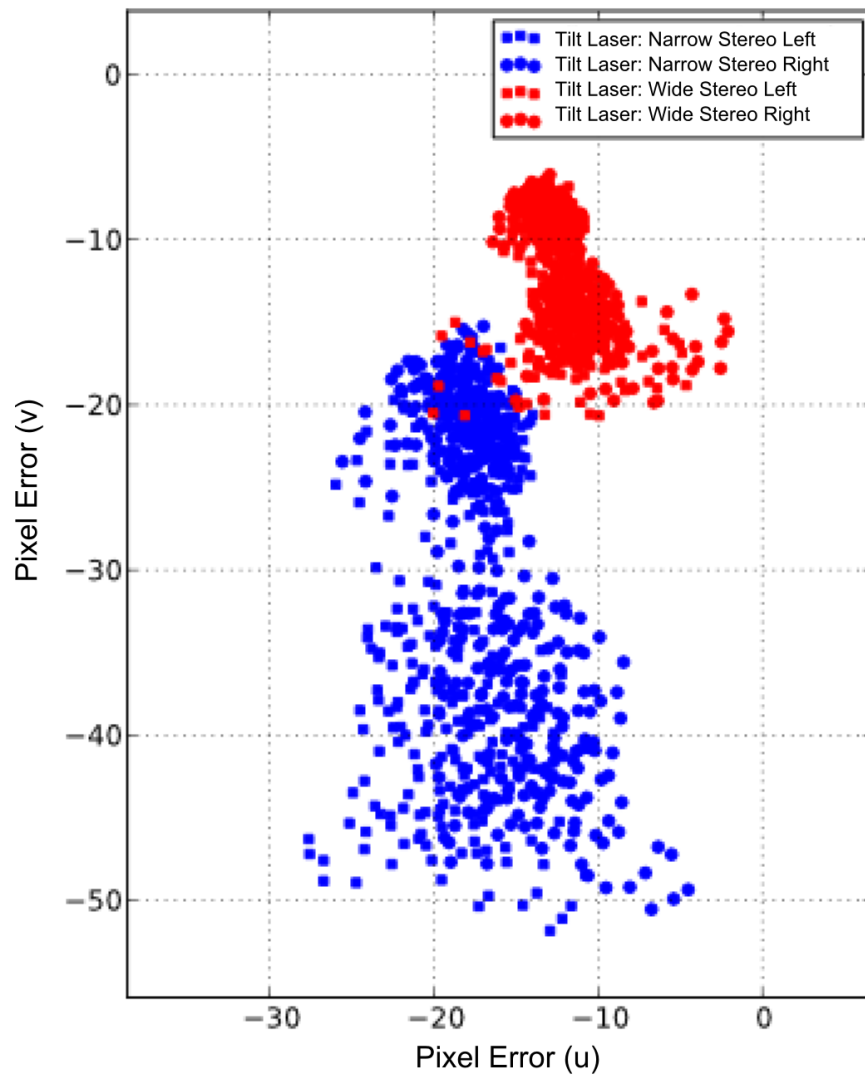


# [Pradeep et al. ISER 2010]

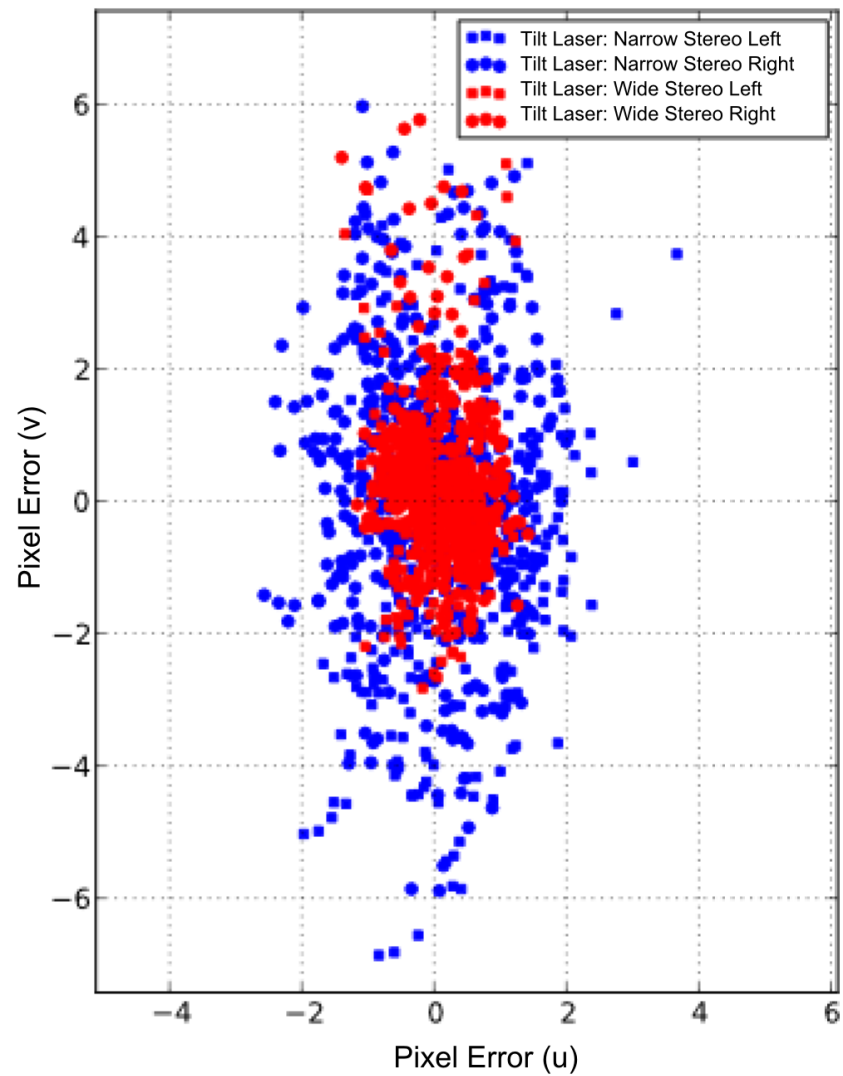




Before Calibration

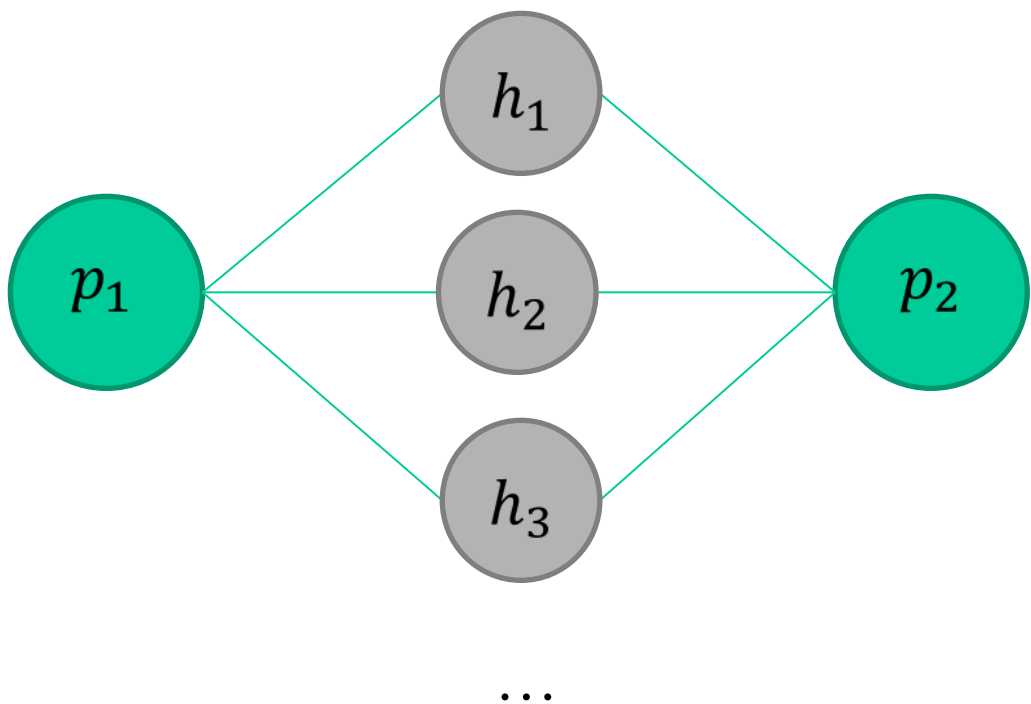


After Calibration





Javier Romero, KTH



$$P(p_1, p_2) = \prod_i h_i(p_1, p_2)$$

↓ Max Likelihood

$$\arg \min_{p_i} -\log P(p_1, p_2)$$

↓ Product to log sum

$$\arg \min_{p_i} \sum_i -\log h_i(p_1, p_2)$$

↓ Gaussian

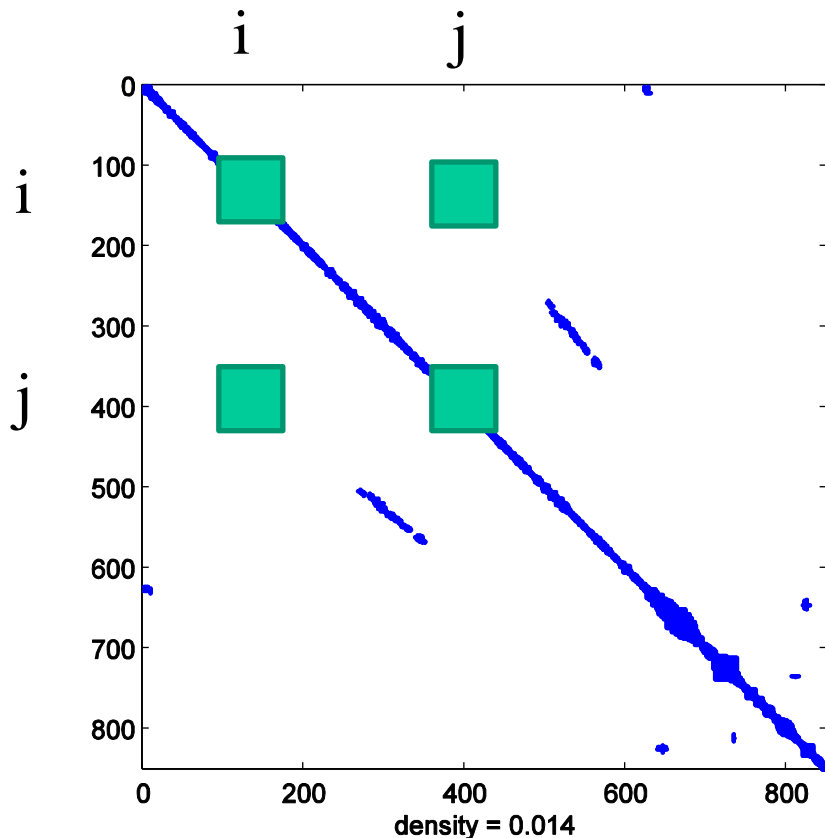
$$\arg \min_{p_i} \sum_i \|z_i(p_1, p_2) - \hat{z}_i\|^2$$

# Sparse Bundle Adjustment

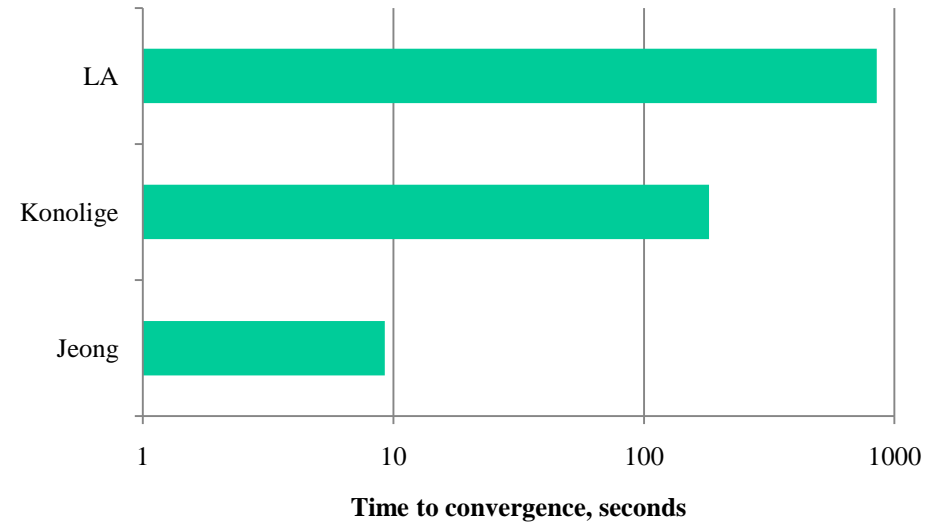
$$e_k = z_k(x_i, x_j) - \hat{z}_k \quad \text{Error Equation}$$

$$J_k = \frac{\partial e_k}{\partial x} \Big|_{\bar{x}} \quad \text{Jacobians}$$

$$J^T J x = J^T e \quad \text{Normal Equation}$$

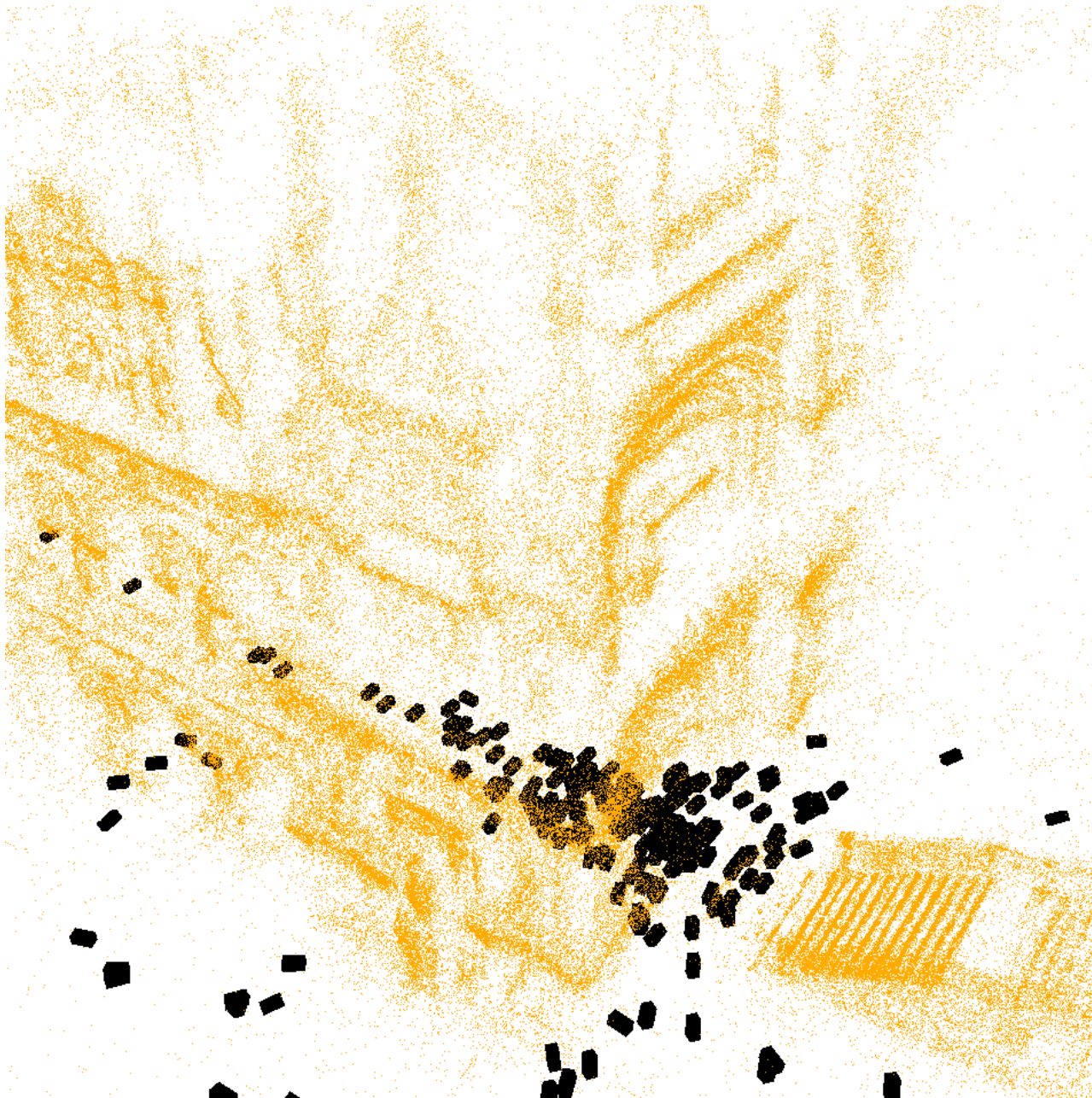


Lourakis and Argyros [TR 2004]  
Konolige [BMVC 2010]  
Jeong et al. [CVPR 2010]



2,010,363 vars, 2,857,277 constraints

849 camera poses, 668,140 points

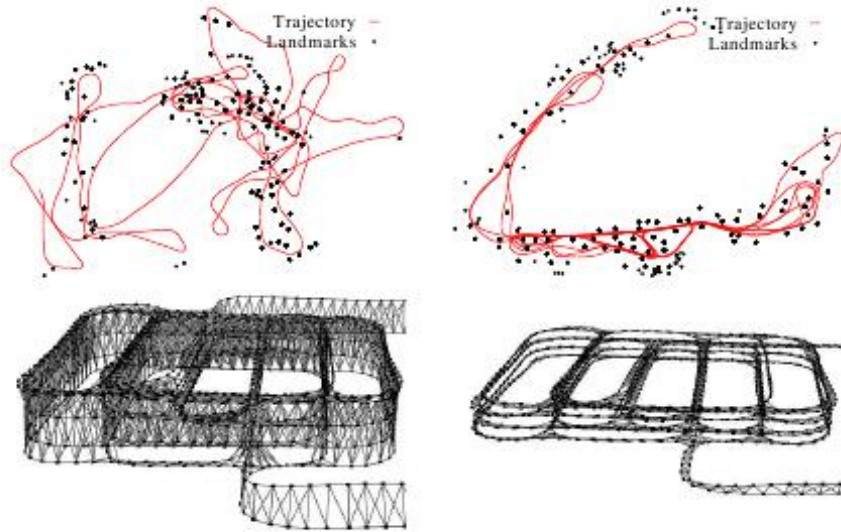




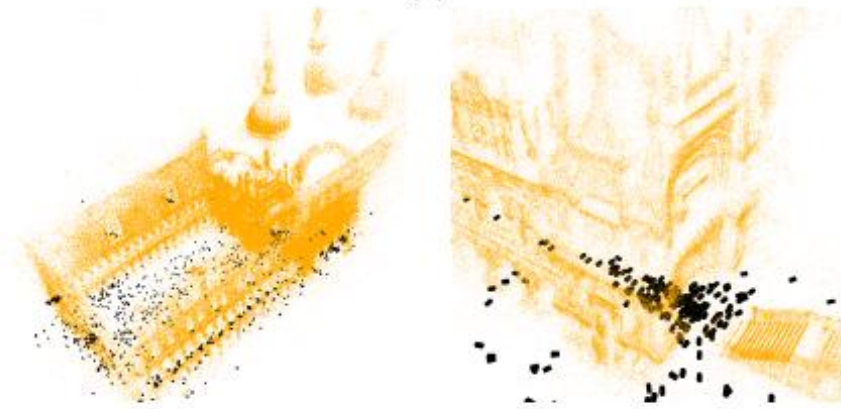


# g2o: A General Framework for Graph Optimization

Kummerle, Grisetti, Strasdat, Konolige, Burgard [ICRA 2011]  
Open Source!



(a)



(b)

