

# Online large-scale SLAM with stereo visual-inertial sensors

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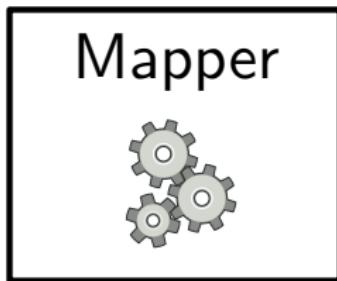


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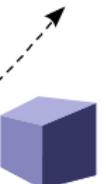
# Aim of this project

Map the world using a stereo camera and an IMU:

Stereo image input

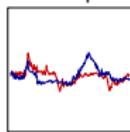


3D map



robot trajectory

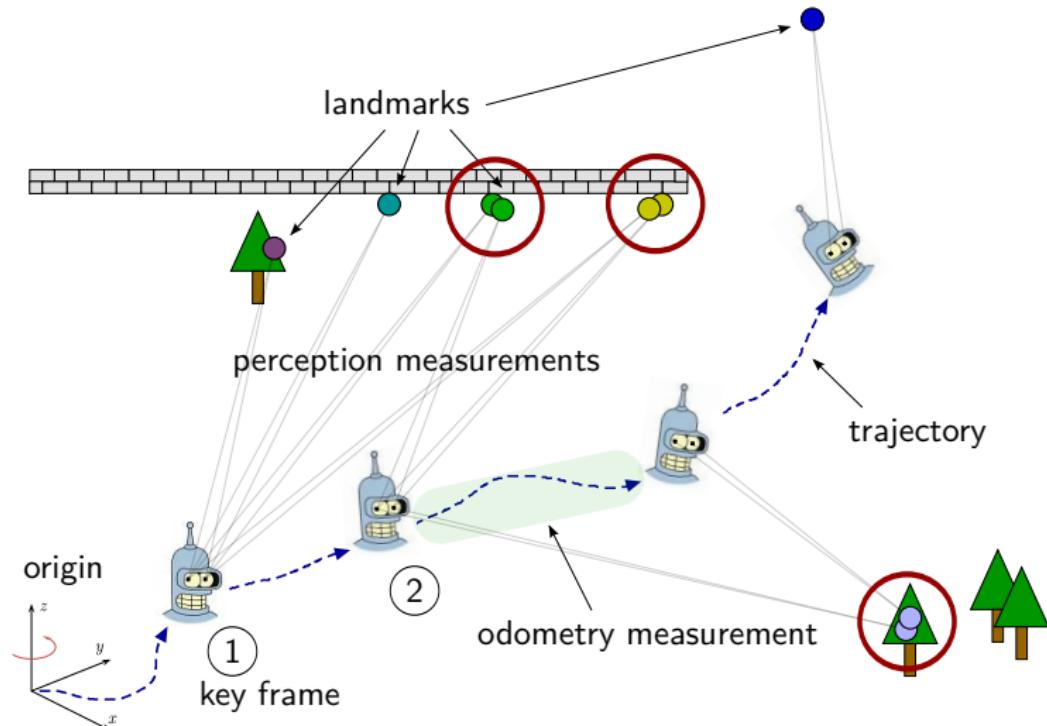
IMU input



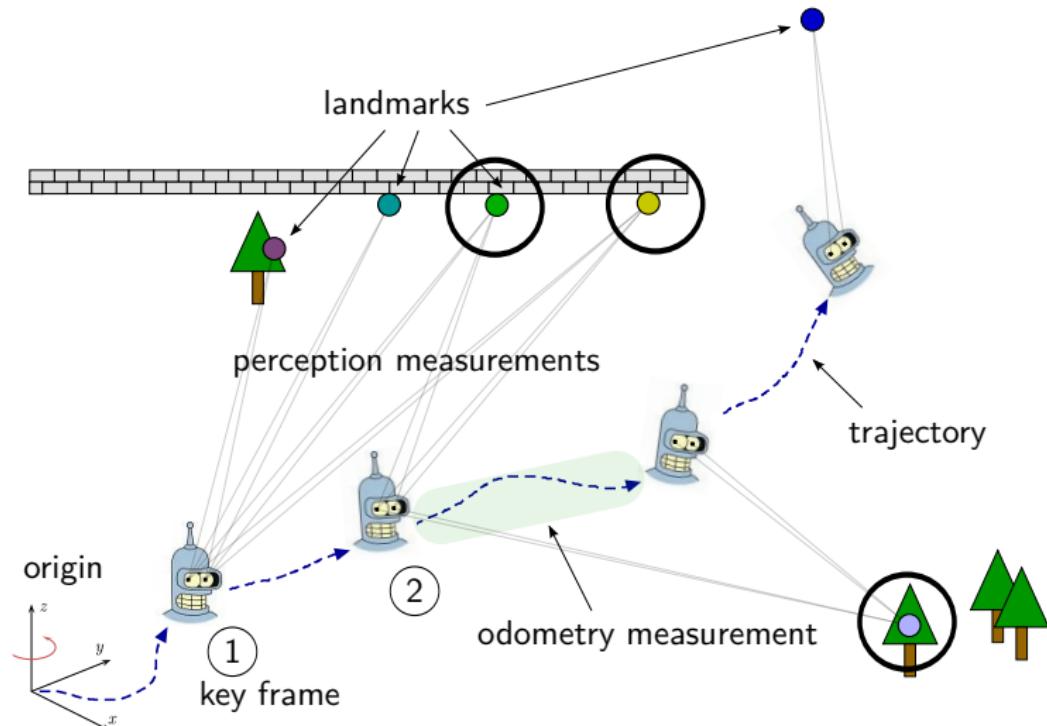
Required capabilities:

- ▶ Tracking (Localization)
- ▶ Mapping (Solving SLAM problem)

# Graph-based SLAM: The problem



# Graph-based SLAM: The solution with g2o<sup>1</sup>



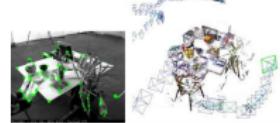
<sup>1</sup>Kuemmerle, R., Grisetti, G., Strasdat, H., Konolige, K., Burgard, W.: g2o: A general framework for graph optimization (ICRA 2011).

# State of the art

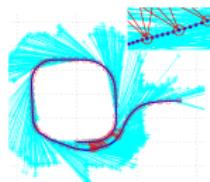
## Google (street) mapping



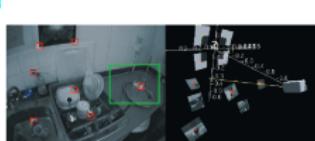
ORB-SLAM



FrameSLAM



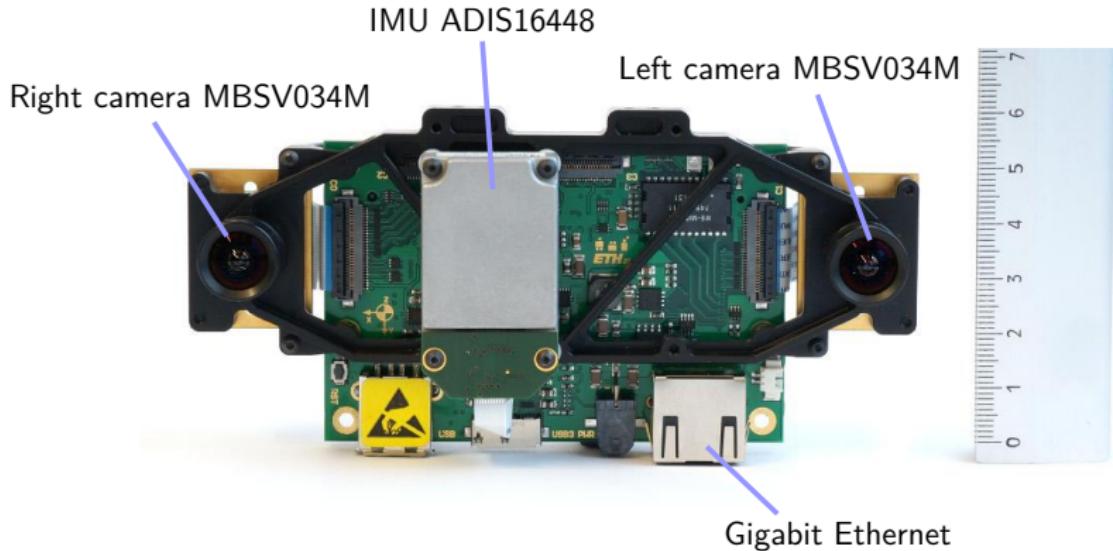
MonoSLAM



SVO

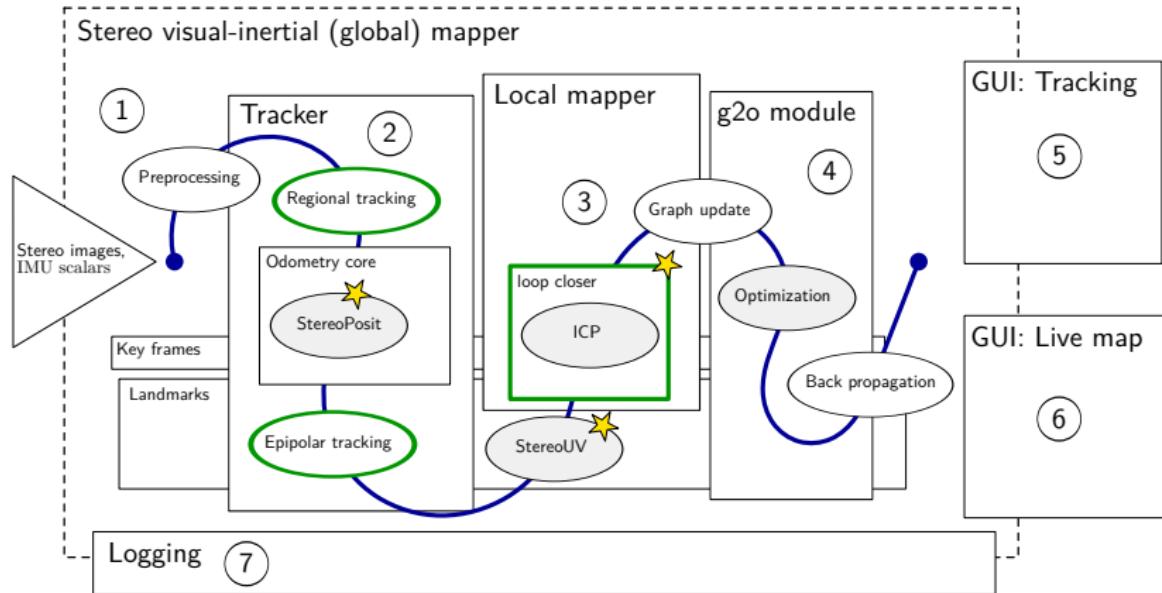


# Sensor setup: the VI-Sensor<sup>2</sup>



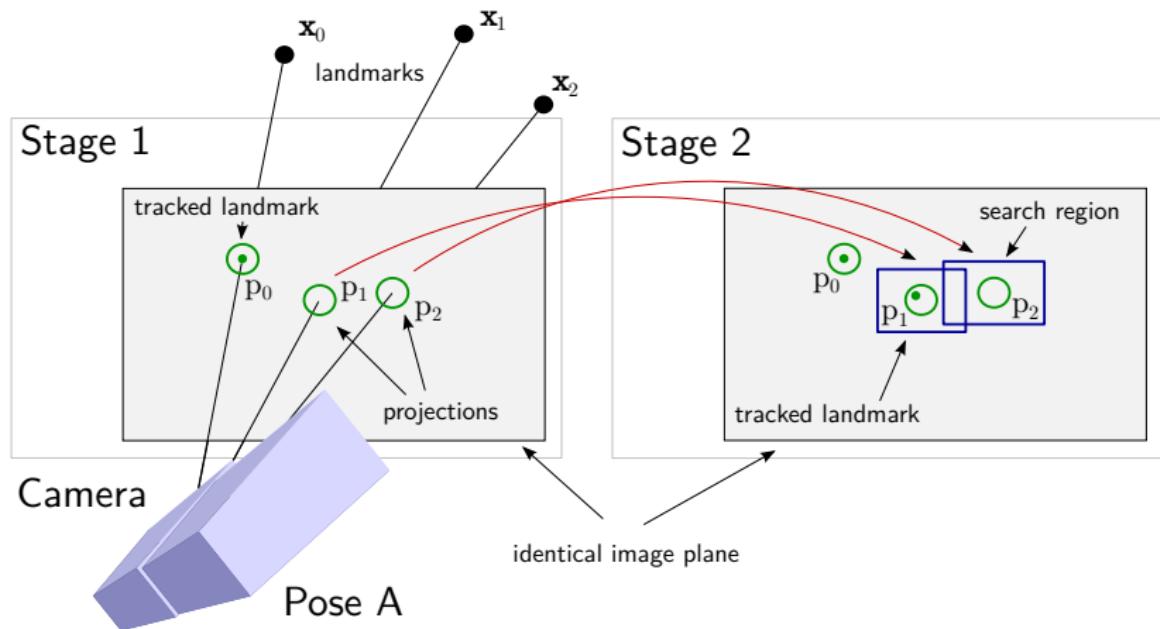
<sup>2</sup>Nikolic, J., Rehder, J., Burri, M., Gohl, P., Leutenegger, S., Furgale, P.T., Siegwart,  
R.: A synchronized visual-inertial sensor system with FPGA pre-processing for accurate real-time SLAM (ICRA 2014).

# Our system



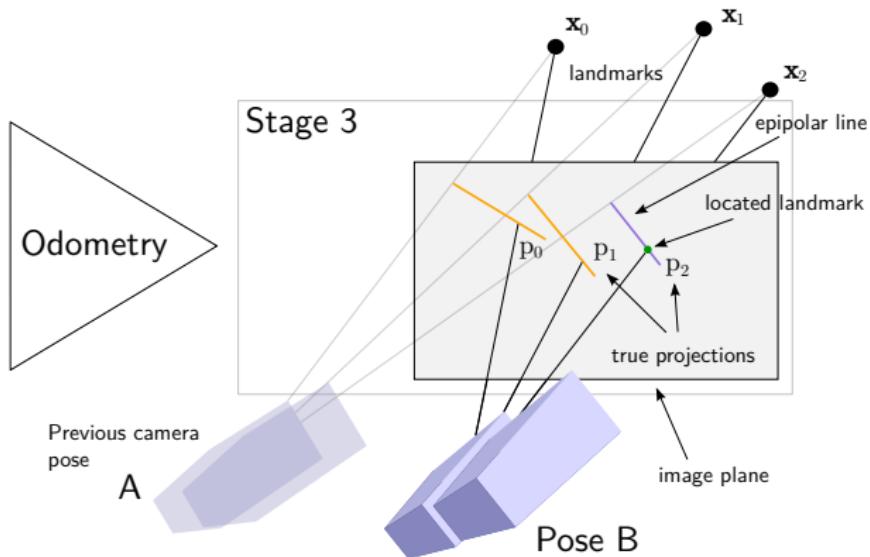
Contributions: StereoPosit, StereoUV, Loop closure detection

# Tracking: Regional tracking<sup>3</sup>



<sup>3</sup>Calonder, M., Lepetit, V., Strecha, C., Fua,  
P.: Brief: Binary robust independent elementary features. Computer Vision-ECCV 2010.

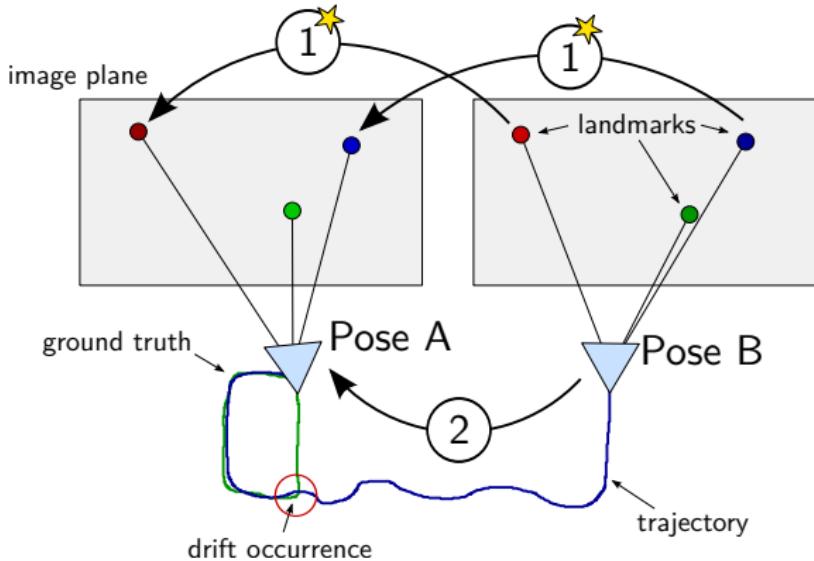
# Tracking: Epipolar tracking<sup>4</sup>



In action: [Aula Magna](#)

<sup>4</sup>Richard, Hartley; Andrew,  
Z.: *Multiple View Geometry in Computer Vision*. Cambridge University Press (March 2004).

# Loop closing: Our approach



- ▶ Step 1: Find matching landmarks (Contribution)
- ▶ Step 2: Compute spatial relation: ICP<sup>5</sup> Aula Magna

<sup>5</sup> Besl, P.J., McKay, N.D.: Method for registration of 3-D shapes. Proc. SPIE 1611 (1992).

# Data acquisition<sup>6</sup>

Hand-held



Bike



KITTI Annieway



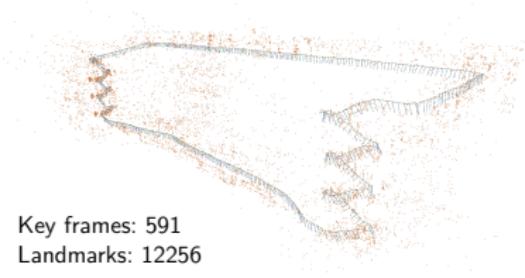
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<sup>6</sup>Geiger, A., Lenz, P., Urtasun,

R.: Are we ready for autonomous driving? the KITTI vision benchmark suite (CVPR 2012).

# Results: Hand-held

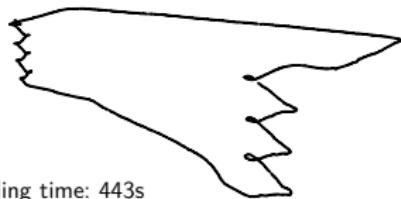
Stairs DIAG



Key frames: 591  
Landmarks: 12256

Full graph

Trajectory



Recording time: 443s  
Trajectory length: 394m

Aula Magna



Key frames: 213  
Landmarks: 4049

Full graph

Trajectory



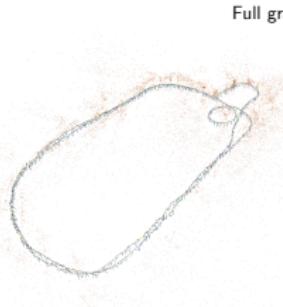
Recording time: 192s  
Trajectory length: 126m

# Results: Bike

Parco San Lorenzo

Key frames: 657  
Landmarks: 17126

Recording time: 497s  
Trajectory length: 381m



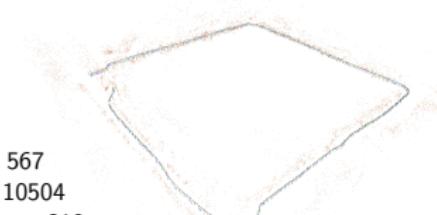
Full graph

Trajectory (Google maps overlay)



Block San Lorenzo

Key frames: 567  
Landmarks: 10504  
Recording time: 310s  
Trajectory length: 354m



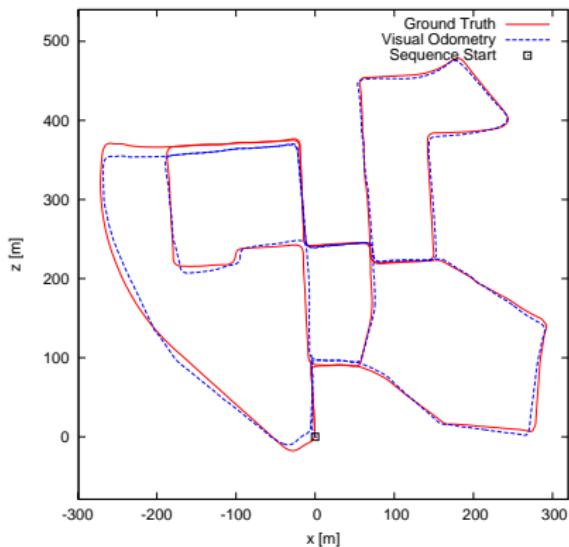
Full graph

Trajectory (Google maps overlay)

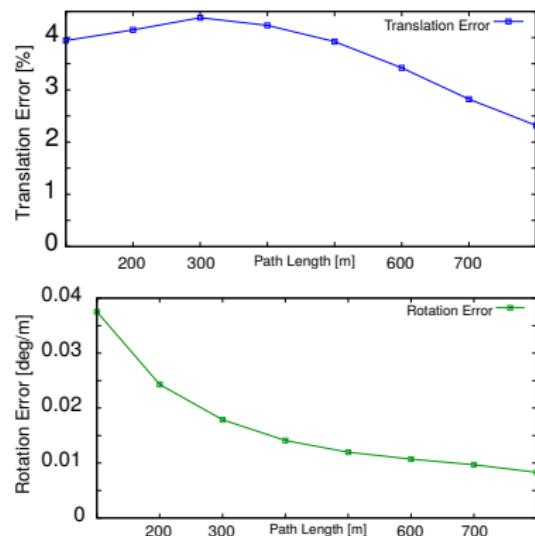


# Results: KITTI odometry benchmark (without IMU)

Trajectory overlay:



Errors (KITTI standard):



Total trajectory length: 3722m

# Conclusions and remarks

Final system:

- ▶ Outstanding robustness
- ▶ High accuracy (Map overlays, 1-5% KITTI error)
- ▶ Strong, independent odometry (KITTI)
- ▶ Modularity (Multithreading)

Future work:

- ▶ Filter integration<sup>7</sup> (IMU)
- ▶ Improved feature handling<sup>8</sup>
- ▶ Improved graph optimization<sup>9</sup>

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<sup>7</sup>Forster, C., Carlone, L., Dellaert, F., Scaramuzza,  
D.: IMU Preintegration on Manifold for Efficient Visual-Inertial Maximum-a-Posteriori Estimation. (RSS 2015).

<sup>8</sup>Rublee, E., Rabaud, V., Konolige, K., Bradski,  
G.: ORB: an efficient alternative to SIFT or SURF. (ICCV 2011).

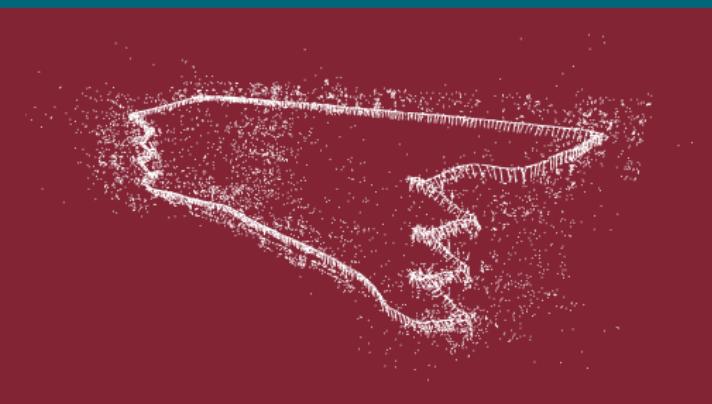
<sup>9</sup>Grisetti, Giorgio, Rainer Kuemmerle,  
and Kai Ni. Robust optimization of factor graphs by using condensed measurements. (IROS 2012).

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