



# EMBEDDED PHOTOMETRIC VISUAL ODOMETRY

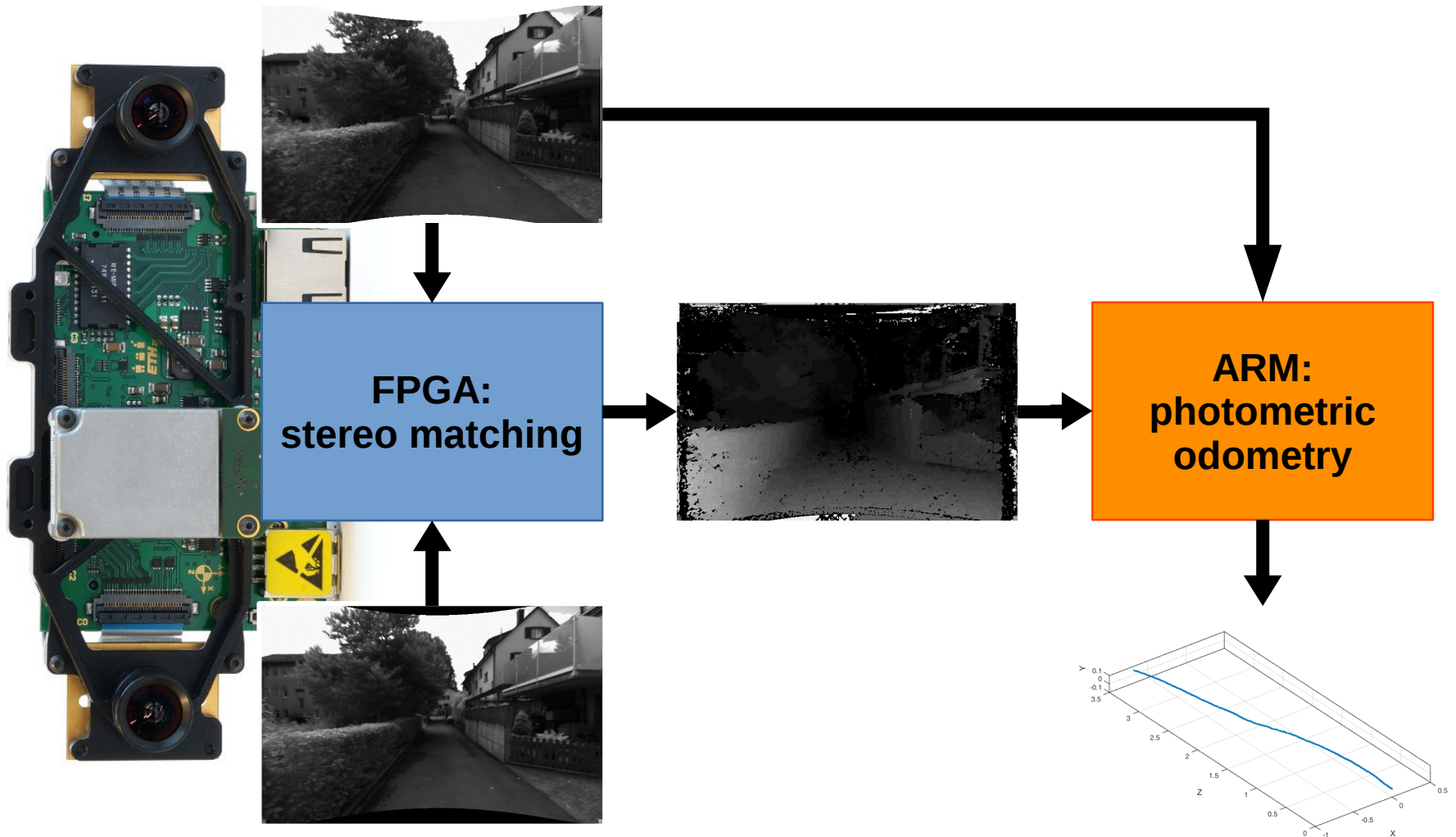
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Bachelor Thesis

Supervised by Jörn Rehder and Pascal Gohl.

## MOTIVATION

- demonstrating novel integration of FPGA and ARM through photometric odometry
- NOT the most efficient approach to embedded visual odometry
  - M. Dymczyk, „*visual-inertial motion estimation on computationally constrained platforms*“, technical report, 2014



D. Honegger, H. Oleynikova, M. Pollefeys, „Real-Time and Low Latency Embedded Computer Vision Hardware Based on a Combination of FPGA and Mobile CPU“, IROS 2014 (IEEE/RSJ International Conference on Intelligent Robots and Systems).

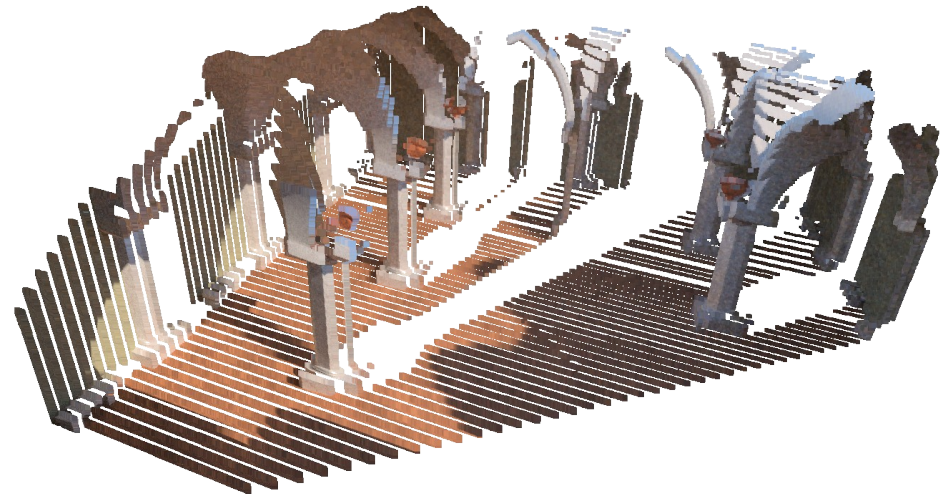
# METHOD: project into space



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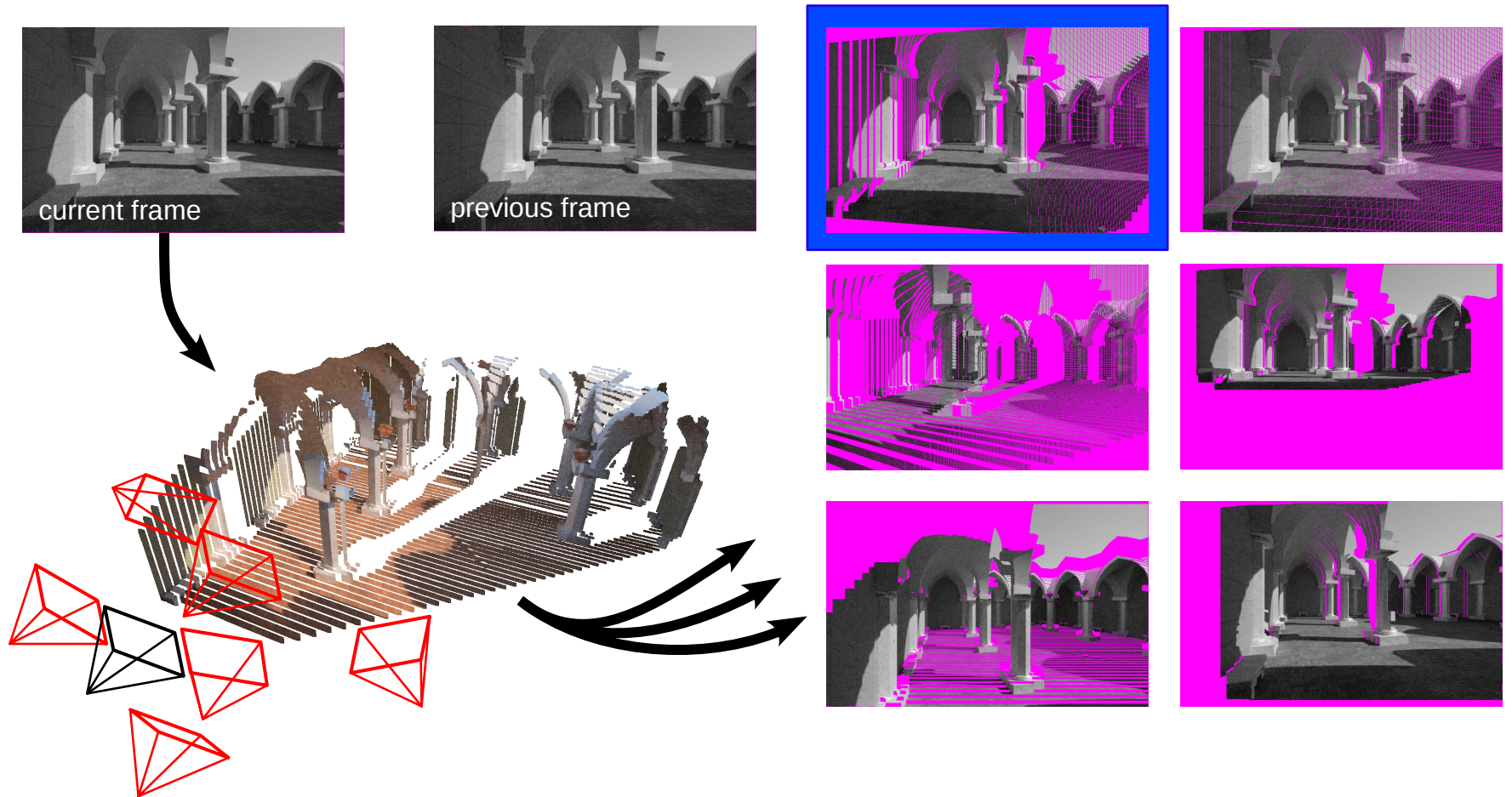


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# METHOD: render from new viewpoints



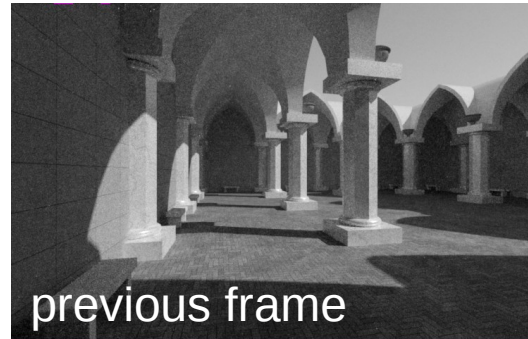
# METHOD: measure photometric error



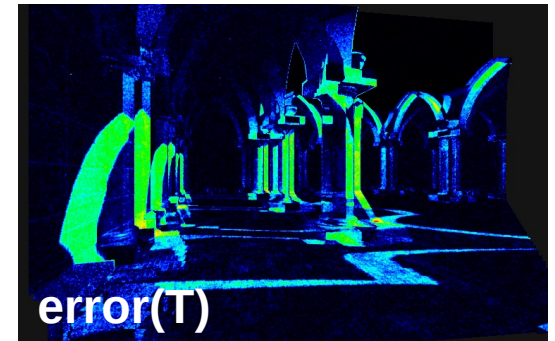
transformation  $T$



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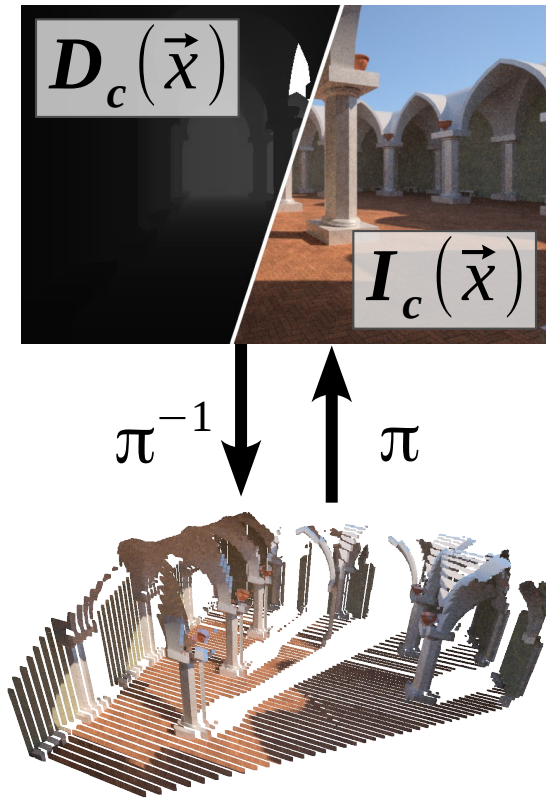


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*just minimize that!*

# METHOD: formularizing the problem



point in image:  $\vec{x} := (u, v) \in \mathbb{R}^2$

intensity:  $I(\vec{x}) : \mathbb{R}^2 \rightarrow \mathbb{R}$

disparity:  $D(\vec{x}) : \mathbb{R}^2 \rightarrow \mathbb{R}$

back-project:

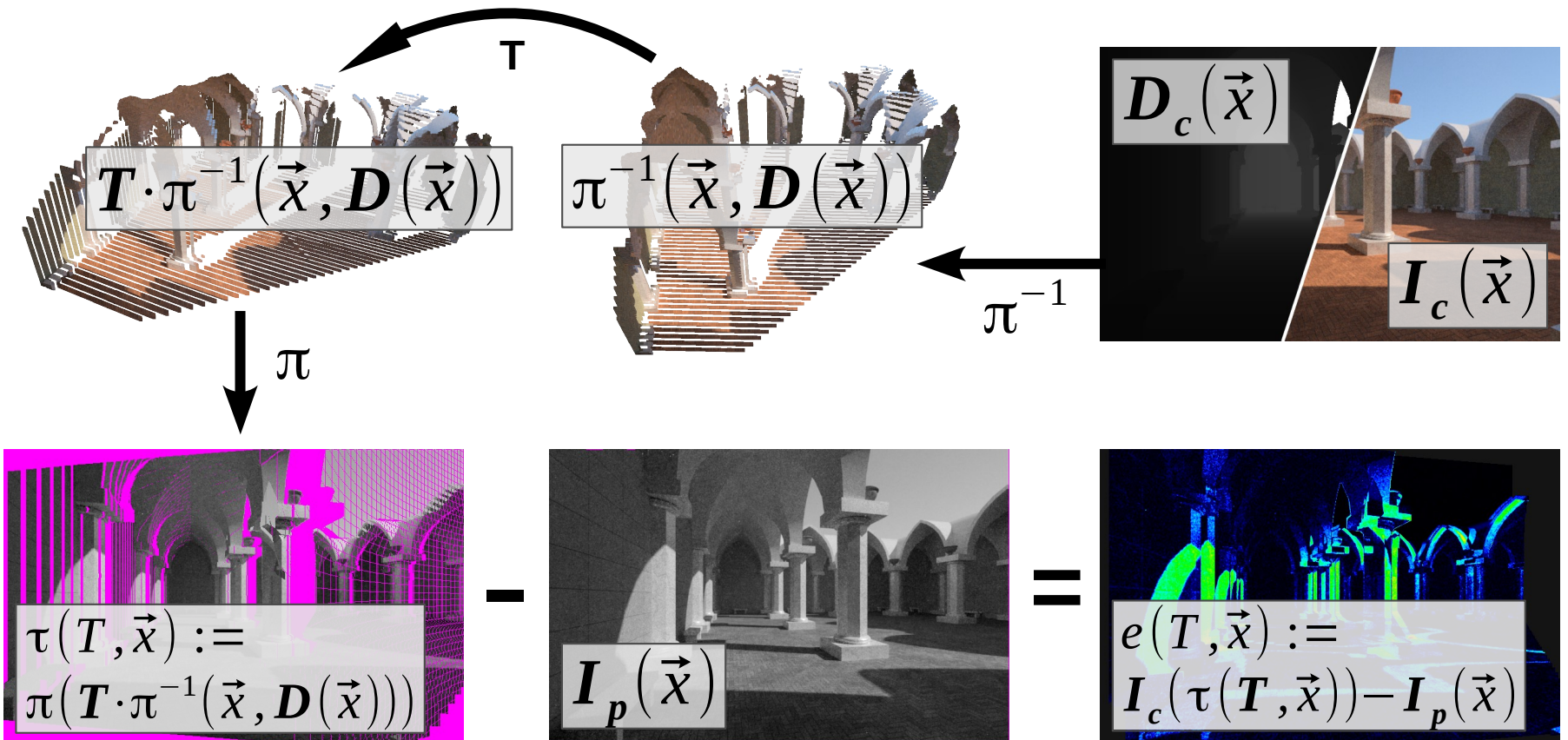
$$\pi^{-1}(\vec{x}, D(\vec{x})) := \frac{b}{D(\vec{x})} \begin{bmatrix} u - c_u \\ v - c_v \\ f \end{bmatrix}$$

project:

$$\pi(x, y, z) := \frac{f}{z} \begin{bmatrix} x \\ y \end{bmatrix} + \begin{bmatrix} c_u \\ c_v \end{bmatrix}$$



# METHOD: warping pipeline



A. Comport, E. Malis, and P. Rives, "Accurate quadrifocal tracking for robust 3d visual odometry," in IEEE Conference on Robotics and Automation, April 2007, pp. 40–45.



therefore:

minimize

$$e(\mathbf{T}, \vec{x}) := \mathbf{I}_k(\vec{x}) - \mathbf{I}_c(\tau(\mathbf{T}, \vec{x}))$$

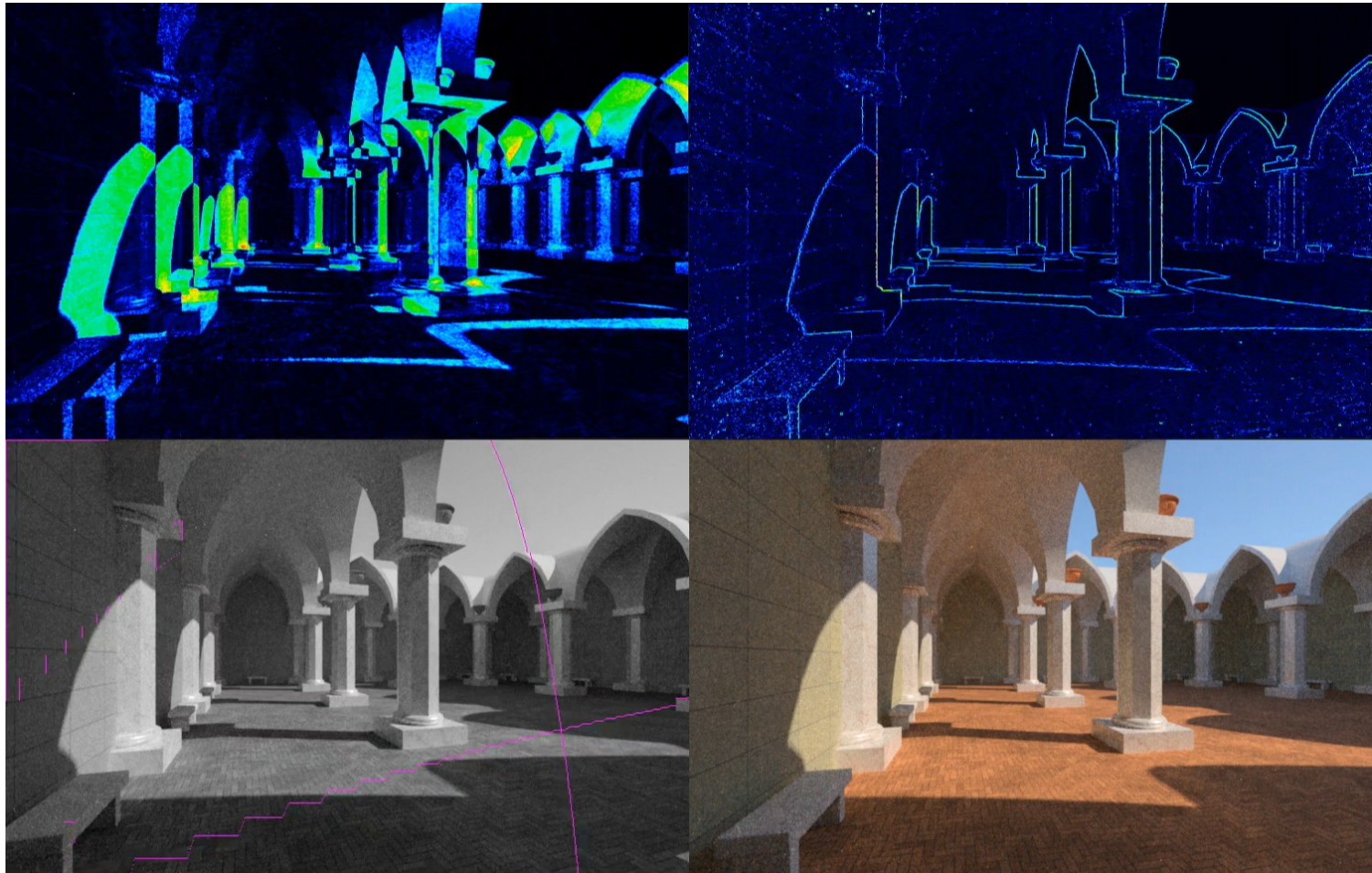
for every pixel:

$$\hat{\mathbf{T}} = \underset{\mathbf{T}}{\operatorname{argmin}} \sum_{\vec{x} \in \mathbf{I}_k} e(\mathbf{T}, \vec{x})^2$$

using Gauss Newton:

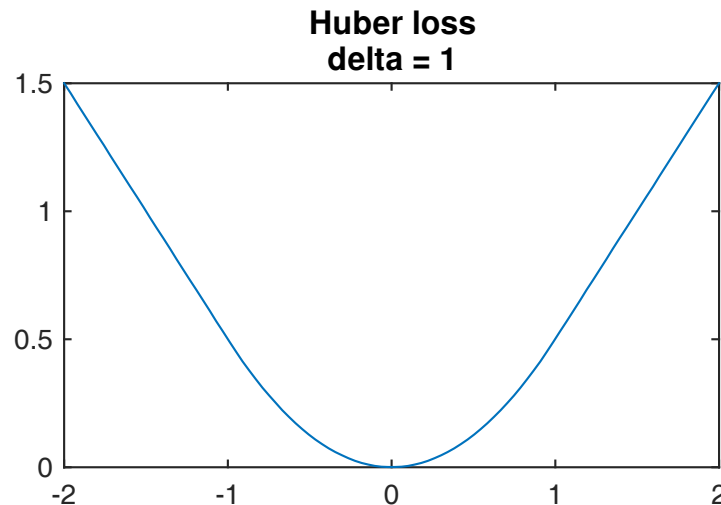
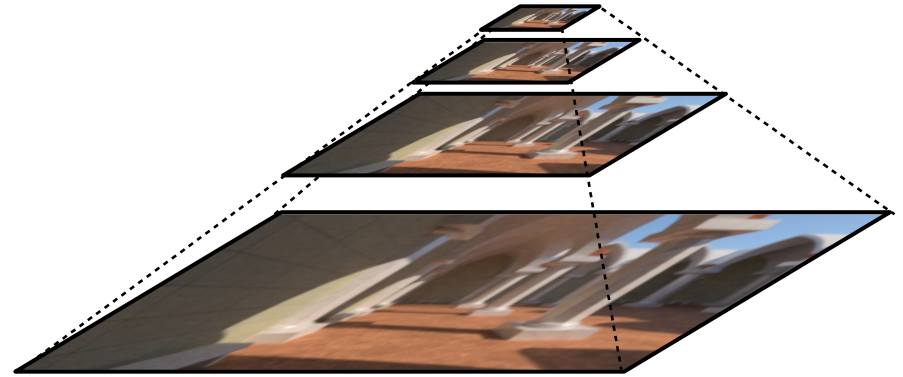
$$\mathbf{J}^T \mathbf{J} \Delta \mathbf{T} = -\mathbf{J}^T e(\mathbf{T})$$

# GAUSS-NEWTON IN ACTION



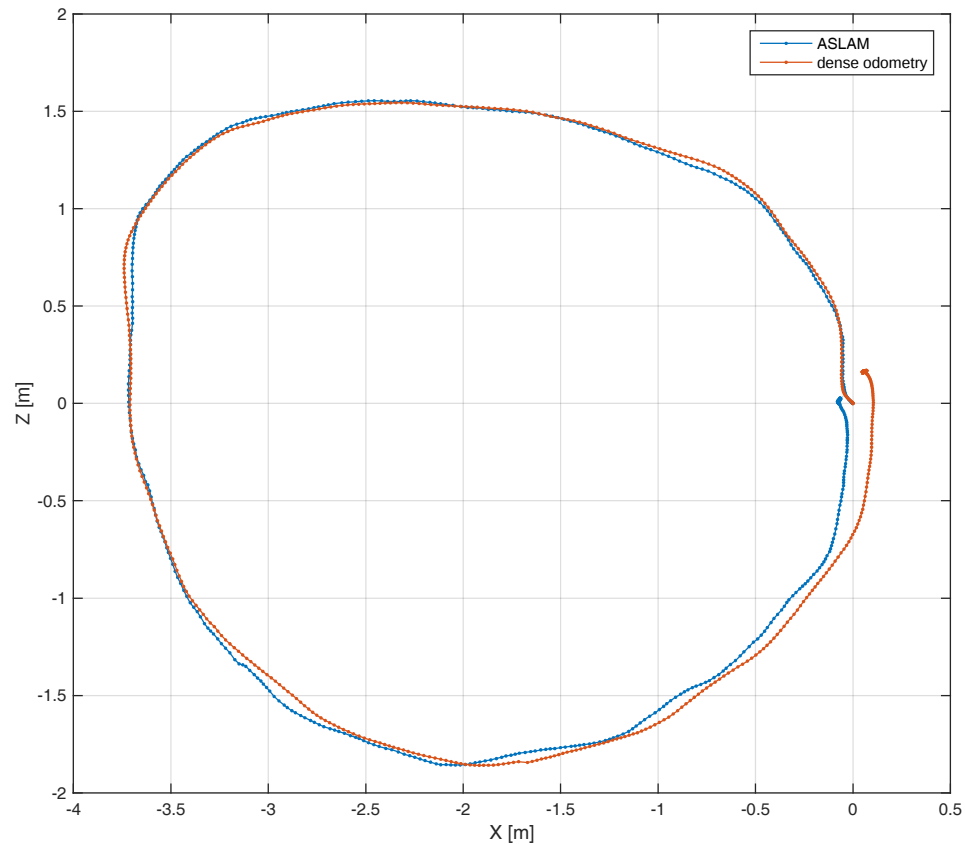
# METHOD: optimizations

- use image pyramid
  - good speed / precision tradeoff
  - better region of conversion
- only use pixels with strong gradient
- Huber weights



# RESULTS: photometric odometry VS. ASLAM

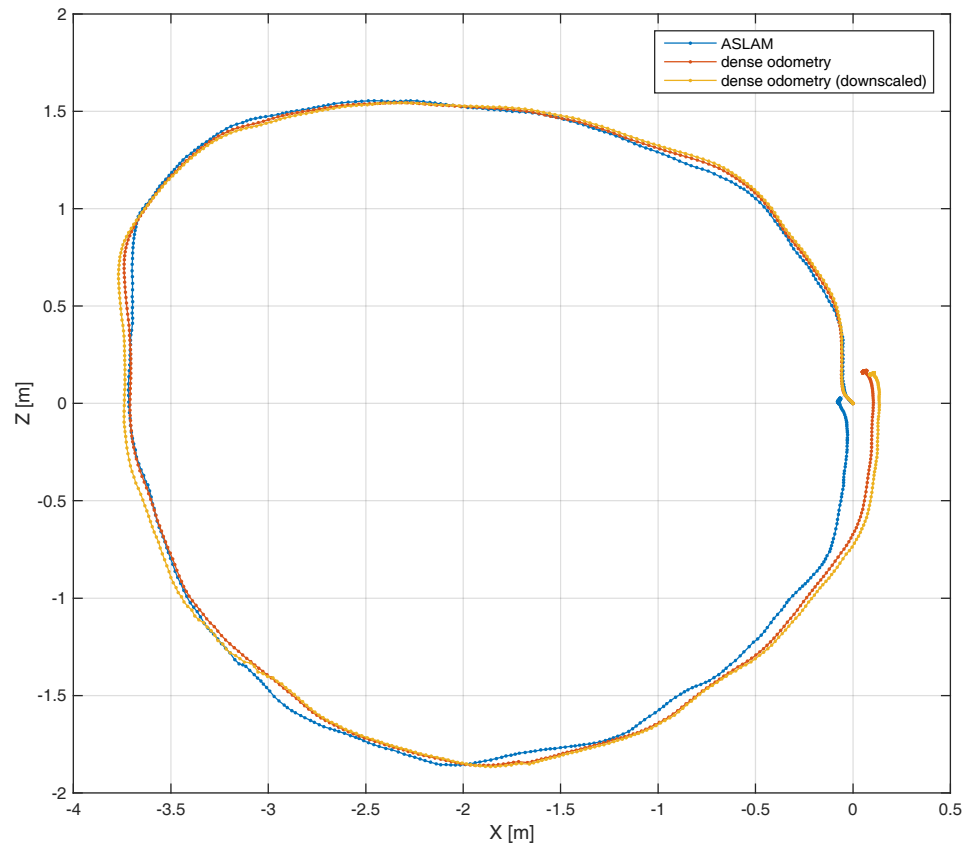
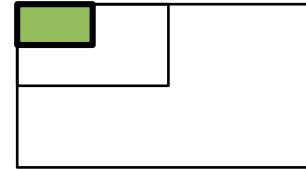
offline with OpenCV SGM for stereo



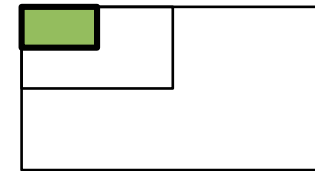
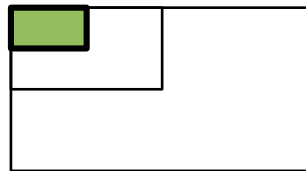
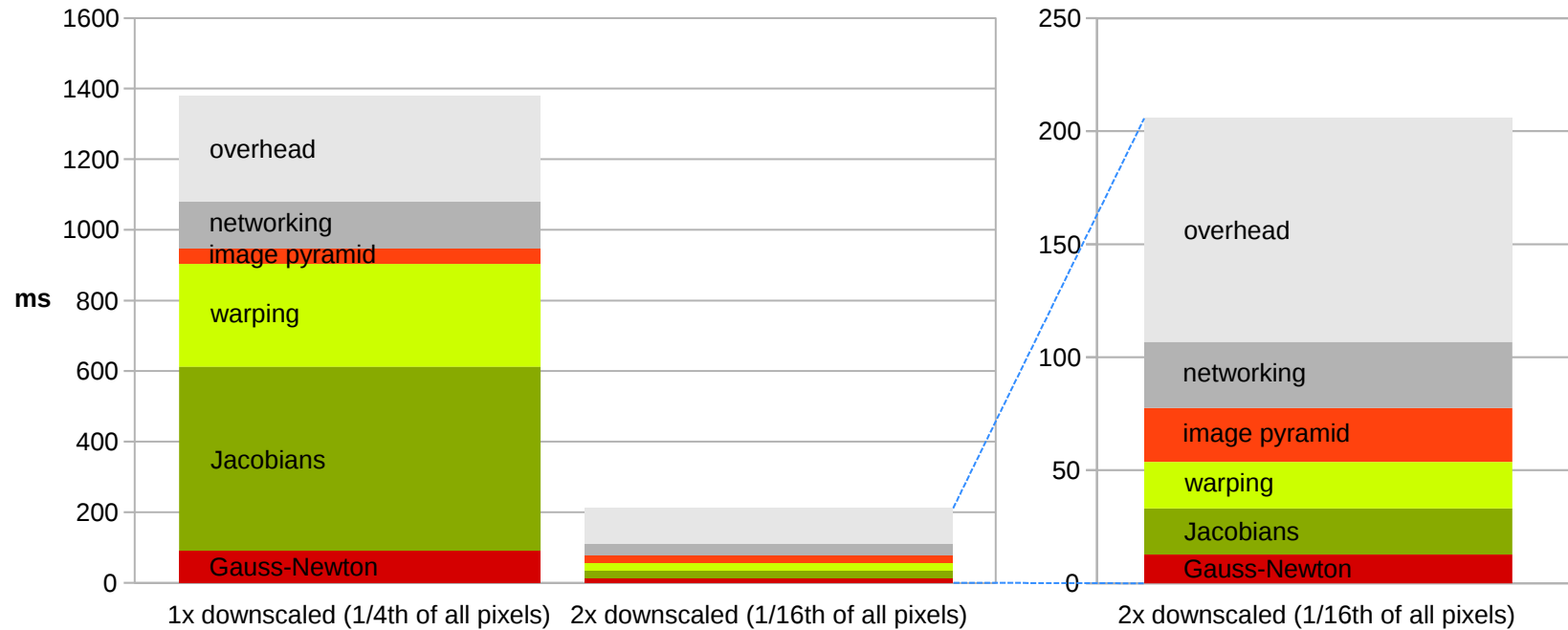


# RESULTS: 1/16<sup>th</sup> of pixels

offline with OpenCV SGM for stereo



# RESULTS: timing



# CONCLUSION

- 5 Hz photometric odometry
  - leverage FPGA with stereo core
  - early abort of image pyramid
- further speedup through FPGA possible

An aerial photograph of Zurich, Switzerland, showing the city's dense urban landscape, the Lake of Zurich, and the surrounding mountains under a clear sky. The image is used as a background for the presentation slides.

**QUESTIONS?**

**LIVE DEMO**