

Some examples of Visual SLAM

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Past, Present, and Future of Simultaneous Localization And Mapping: Towards the Robust-Perception Age

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Abstract—Simultaneous Localization And Mapping (SLAM) consists in the concurrent construction of a model of the environment (the *map*), and the estimation of the state of the robot moving within it. The SLAM community has made astonishing progress over the last 30 years, enabling large-scale real-world applications, and witnessing a steady transition of this technology to industry. We survey the current state of SLAM and consider future directions. We start by presenting what is now the *de-facto* standard formulation for SLAM. We then review related work, covering a broad set of topics including robustness and scalability in long-term mapping, metric and semantic representations for mapping, theoretical performance guarantees, active SLAM and exploration, and other new frontiers. This paper simultaneously serves as a position paper and tutorial to those who are users of SLAM. By looking at the published research with a critical eye, we delineate open challenges and new research issues, that still deserve careful scientific investigation. The paper also contains the authors' take on two questions that often animate discussions during robotics conferences: *Do robots need SLAM?* and *Is SLAM solved?*

Index Terms—Robots, SLAM, Localization, Mapping, Factor graphs, Maximum a posteriori estimation, sensing, perception.

I. INTRODUCTION

SLAM comprises the simultaneous estimation of the state of a robot equipped with on-board sensors, and the construction of a model (the *map*) of the environment that the sensors are perceiving. In simple instances, the robot state is described by its pose (position and orientation), although other quantities may be included in the state, such as robot velocity, sensor biases, and calibration parameters. The map, on the other hand, is a representation of aspects of interest (e.g., position of landmarks, obstacles) describing the environment in which the robot operates.

The need to use a map of the environment is twofold. First, the map is often required to support other tasks; for instance, a map can inform path planning or provide an intuitive visualization for a human operator. Second, the map allows limiting the error committed in estimating the state of the robot. In the absence of a map, dead-reckoning would quickly drift over time; on the other hand, using a map, e.g.,

What's different in vSLAM?

- vSLAM, structure-wise, is the same as LiDAR SLAM
- Sensor model (cameras, IMUs): features vs. direct
- Motion model (6-DOF: rotation + translation)

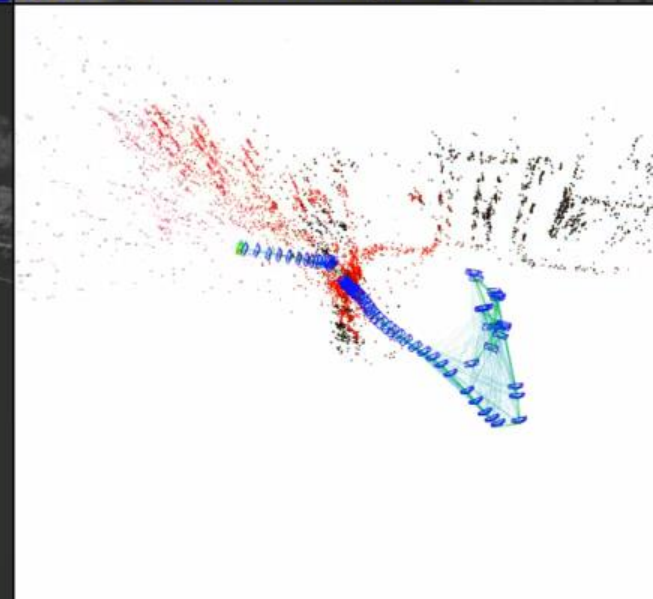
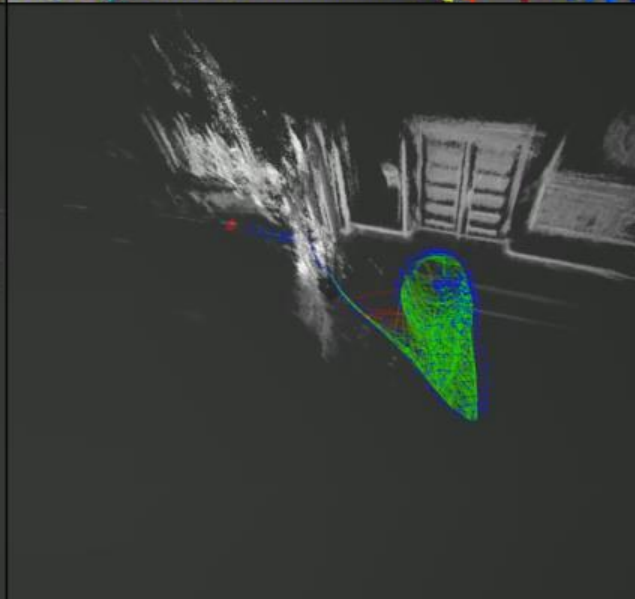
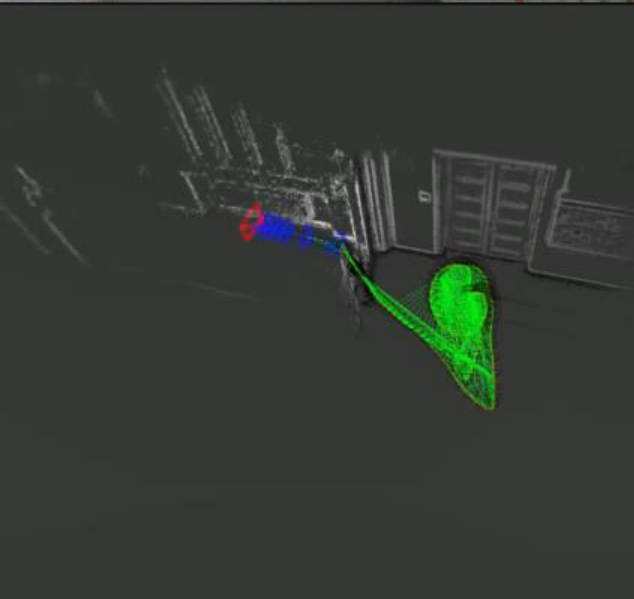
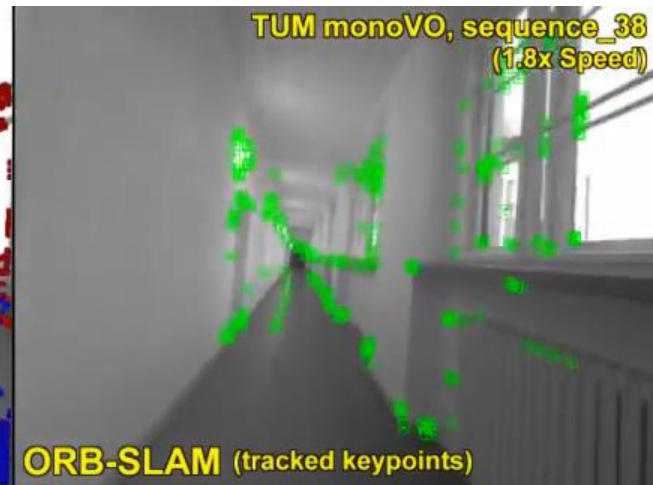
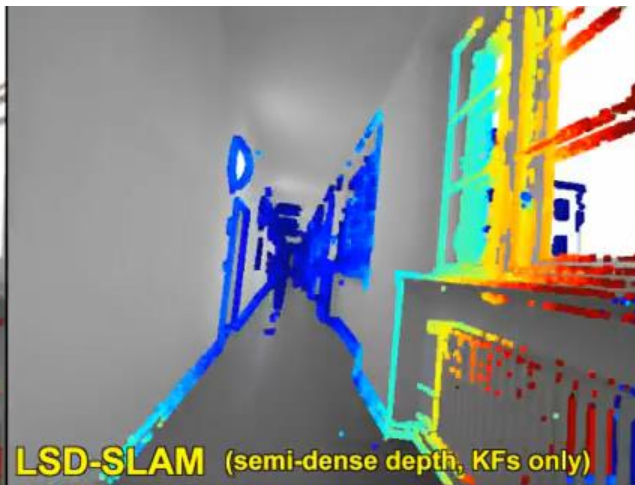
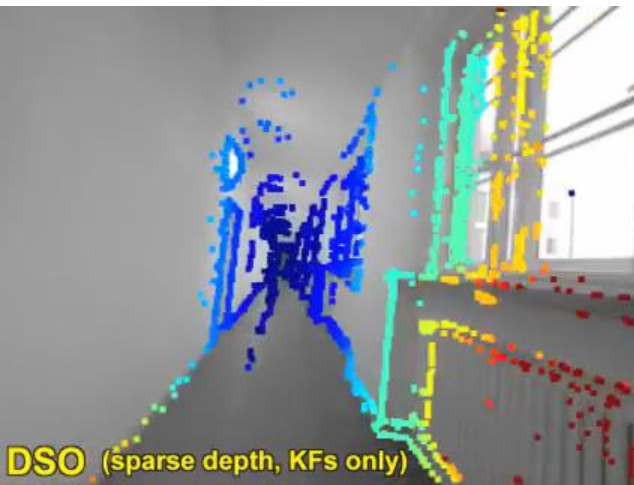
- Three main problem formulations:



- Filter-based (estimate most recent pose and local map)
- Fixed-lag smoothing (i.e., sliding window)
- Full smoothing (estimate full trajectory and map)

DSO (state of the art VO)

<https://youtu.be/C6-xwSOOdqQ>

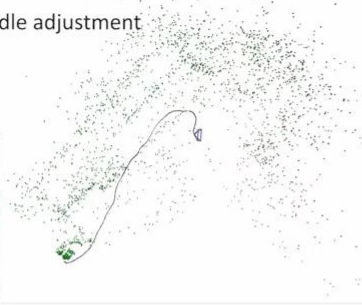


Visual-Inertial SLAM (Camera + IMU)

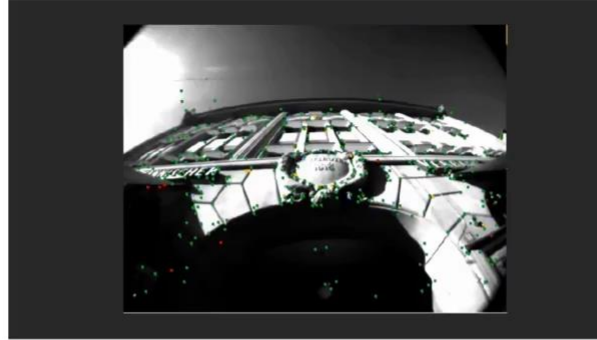
<https://youtu.be/ymI3FmwU9AY>

2.5 milliseconds per frame on laptop (i7 processor).

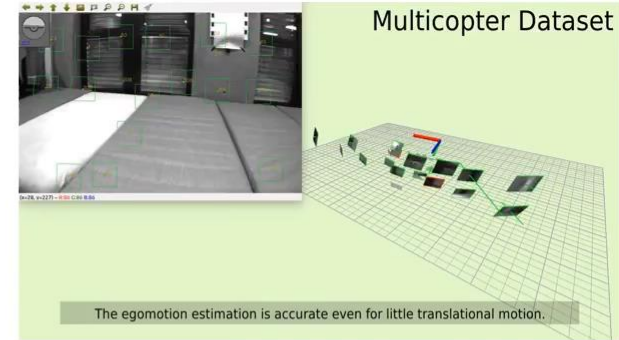
No loop-closure or bundle adjustment



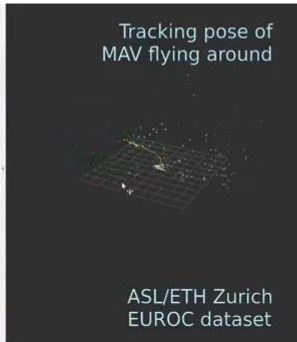
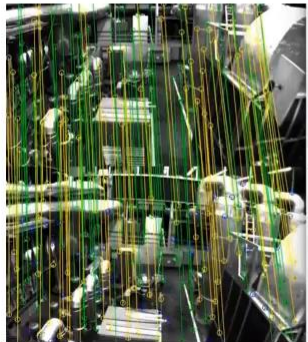
SVO+MSF



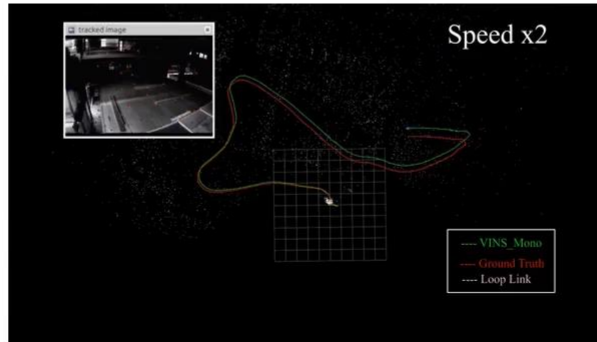
MSCKF



ROVIO



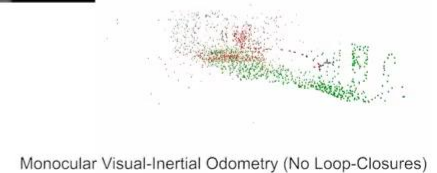
OKVIS



VINS-Mono



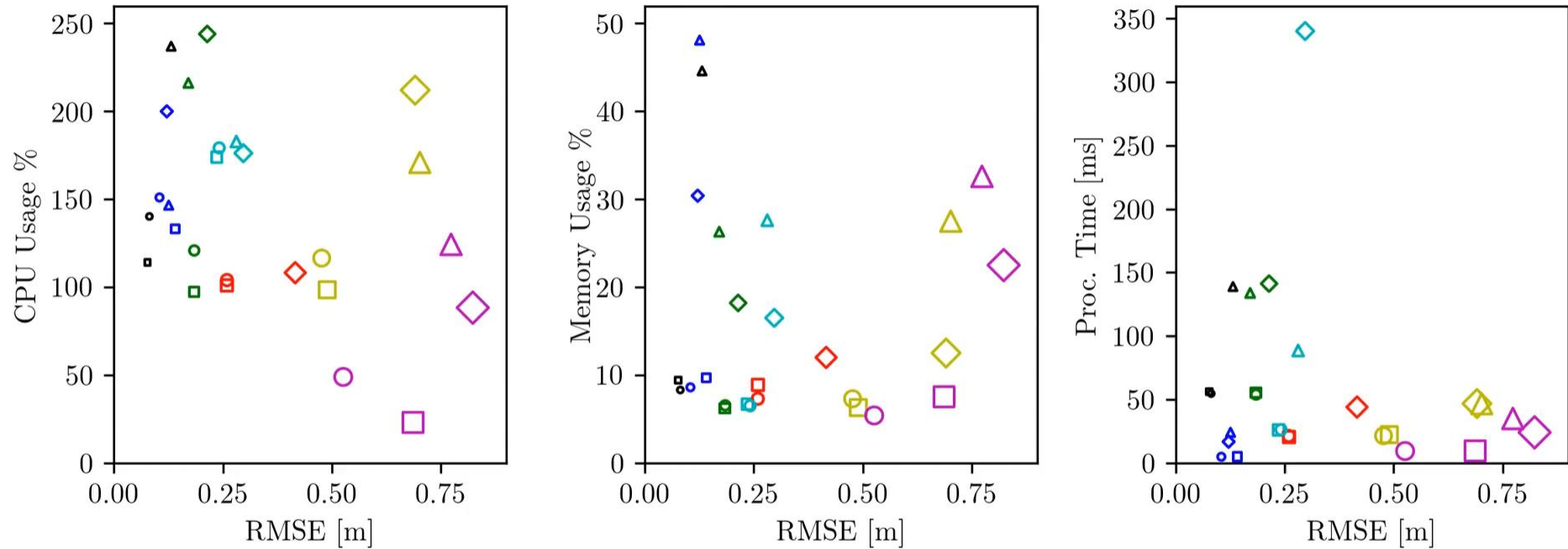
5x



SVO+GTSAM

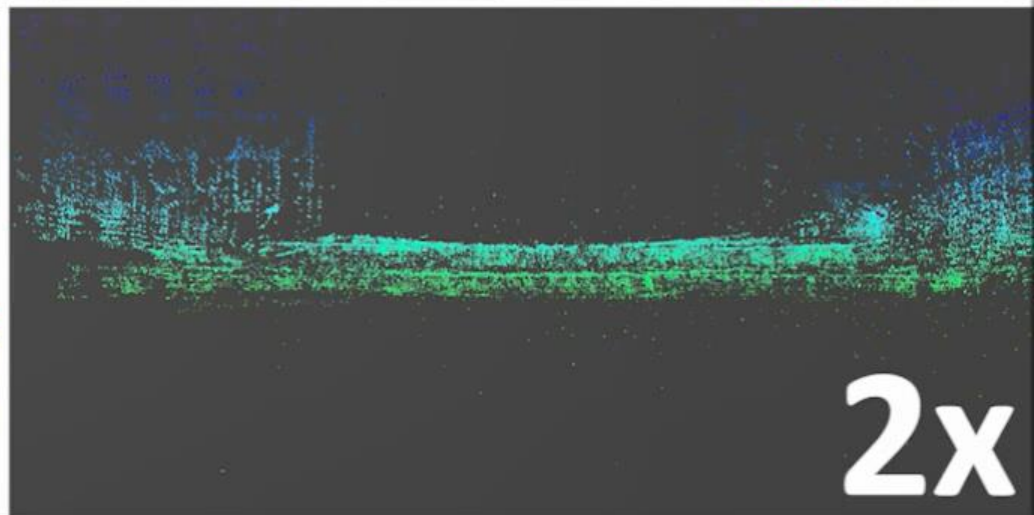
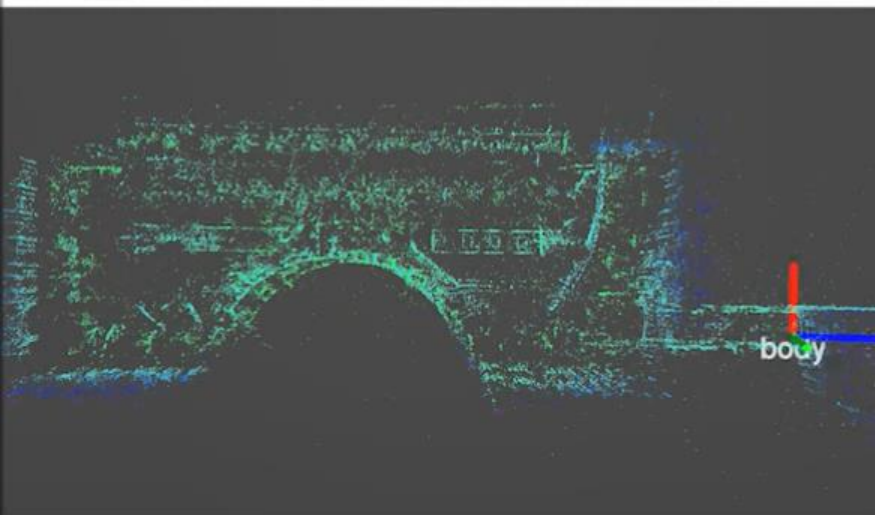
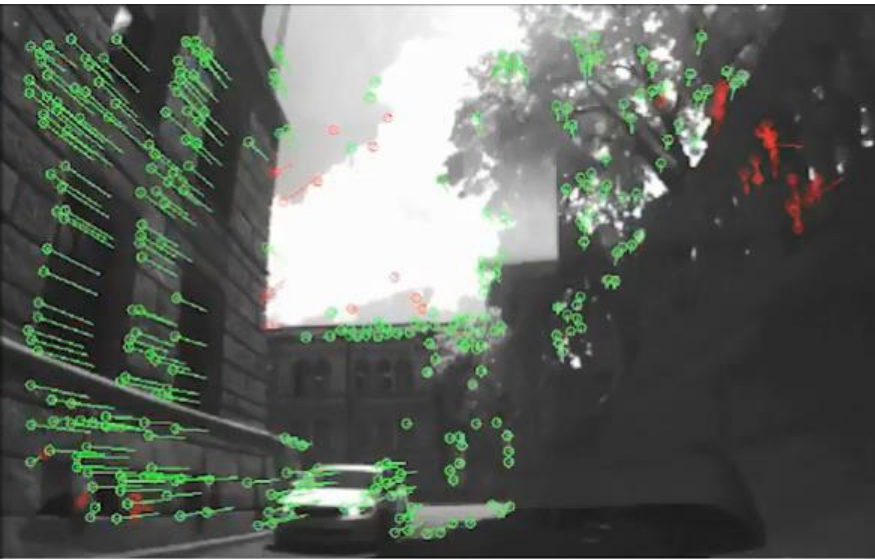
Camera + IMU (VIO) is a mature field

<https://youtu.be/ymI3FmwU9AY>



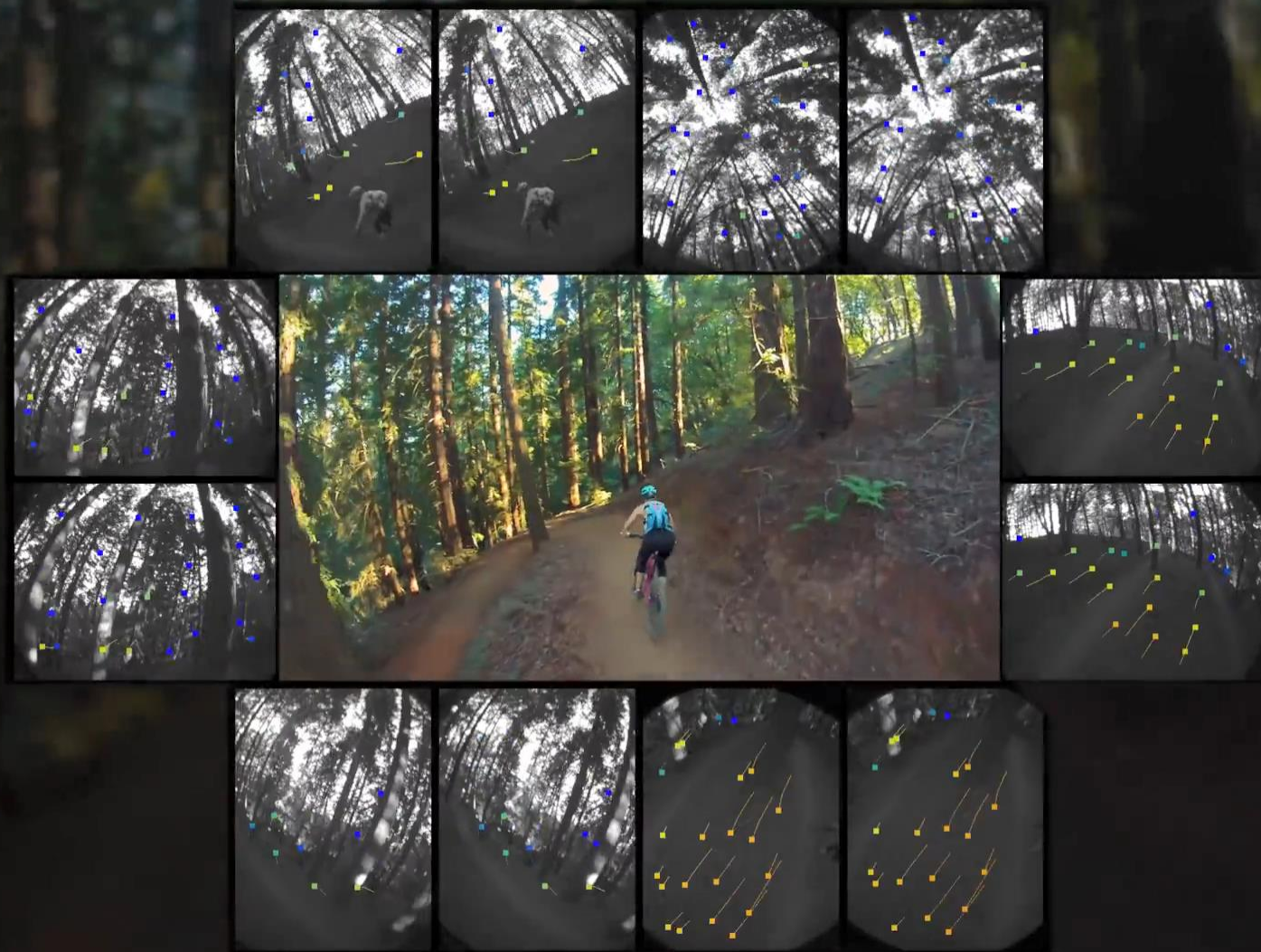
RMSE and resource usage give insight into the tradeoffs between accuracy and efficiency.

Autonomous driving



Drones. Ex: Skydio

<https://www.skydio.com>



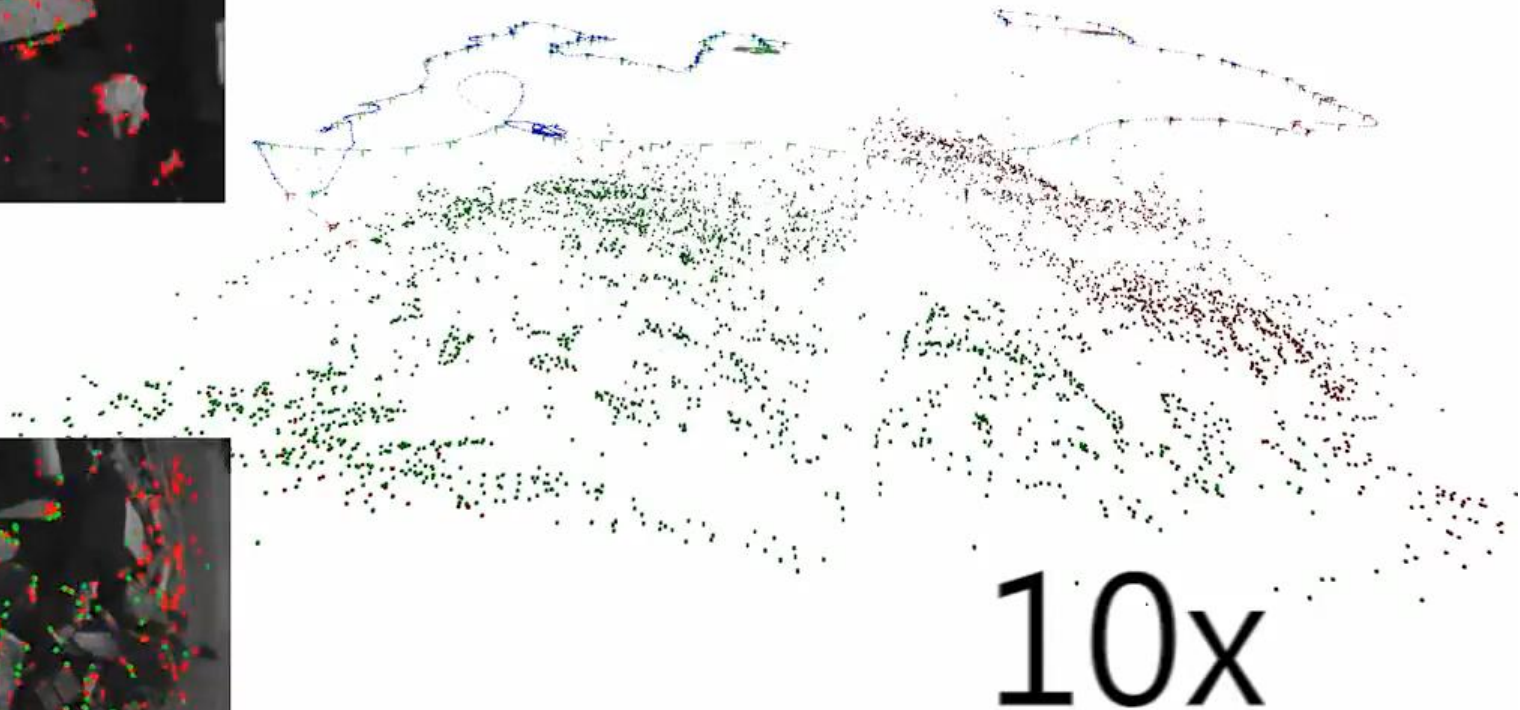
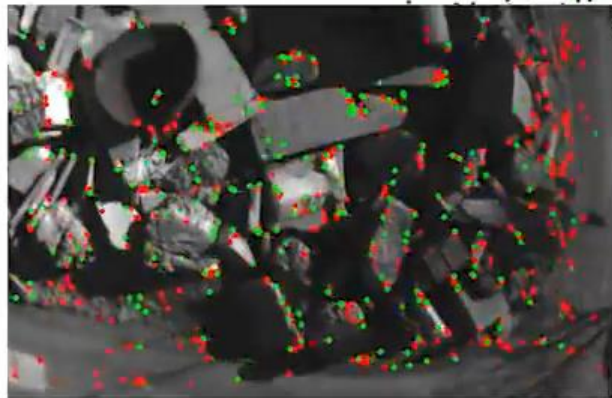
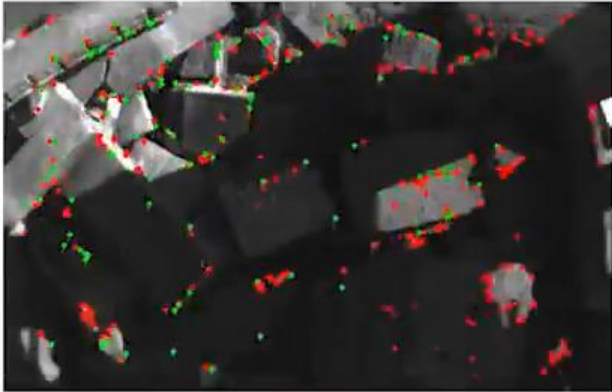
SLAM for AR/VR and Gaming



Examples: Microsoft HoloLens, Oculus Rift / Quest, etc.

Multi-robot SLAM

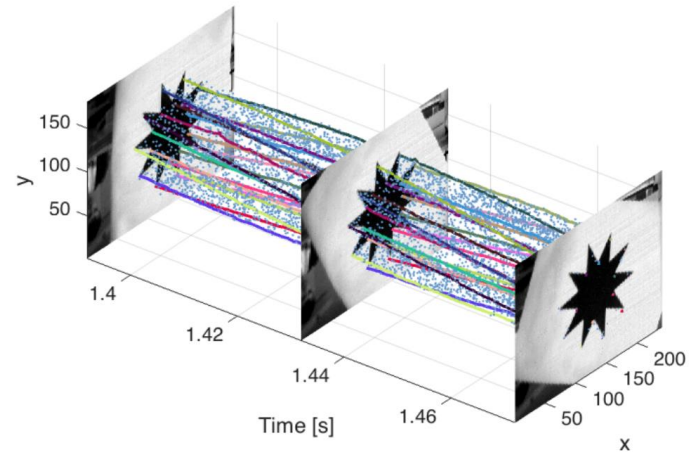
<https://youtu.be/taD3XF2w7A0>



DAVIS sensor: DVS+ Standard Camera

- Combines DVS and a **standard** camera in the same pixel chip, plus an IMU
- **Output:** Frames + Events + IMU

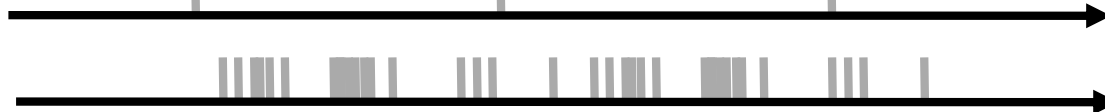
<https://inivation.com/solutions/videos>



Standard frames

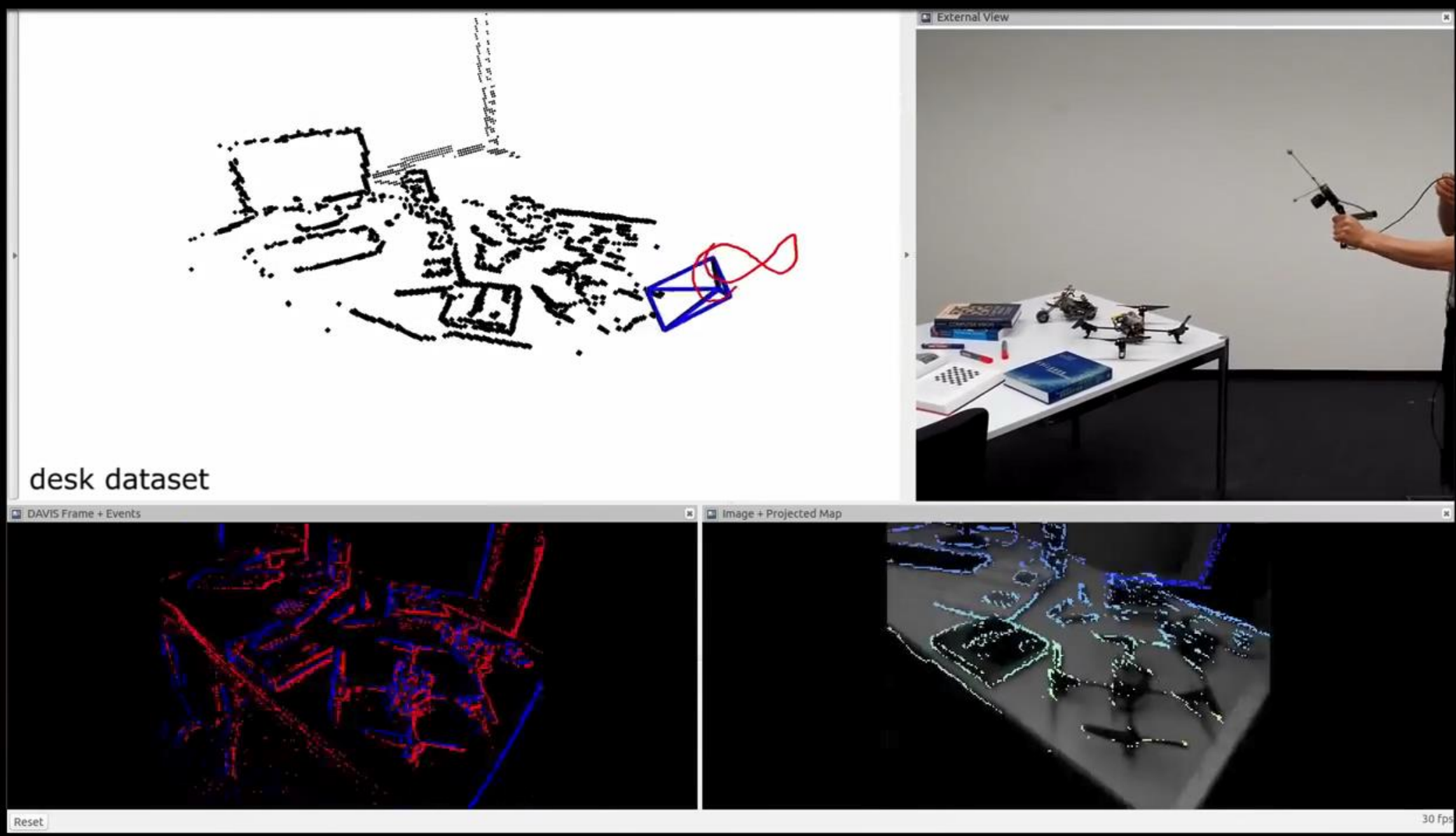


DVS events



time

Event-based Visual Odometry

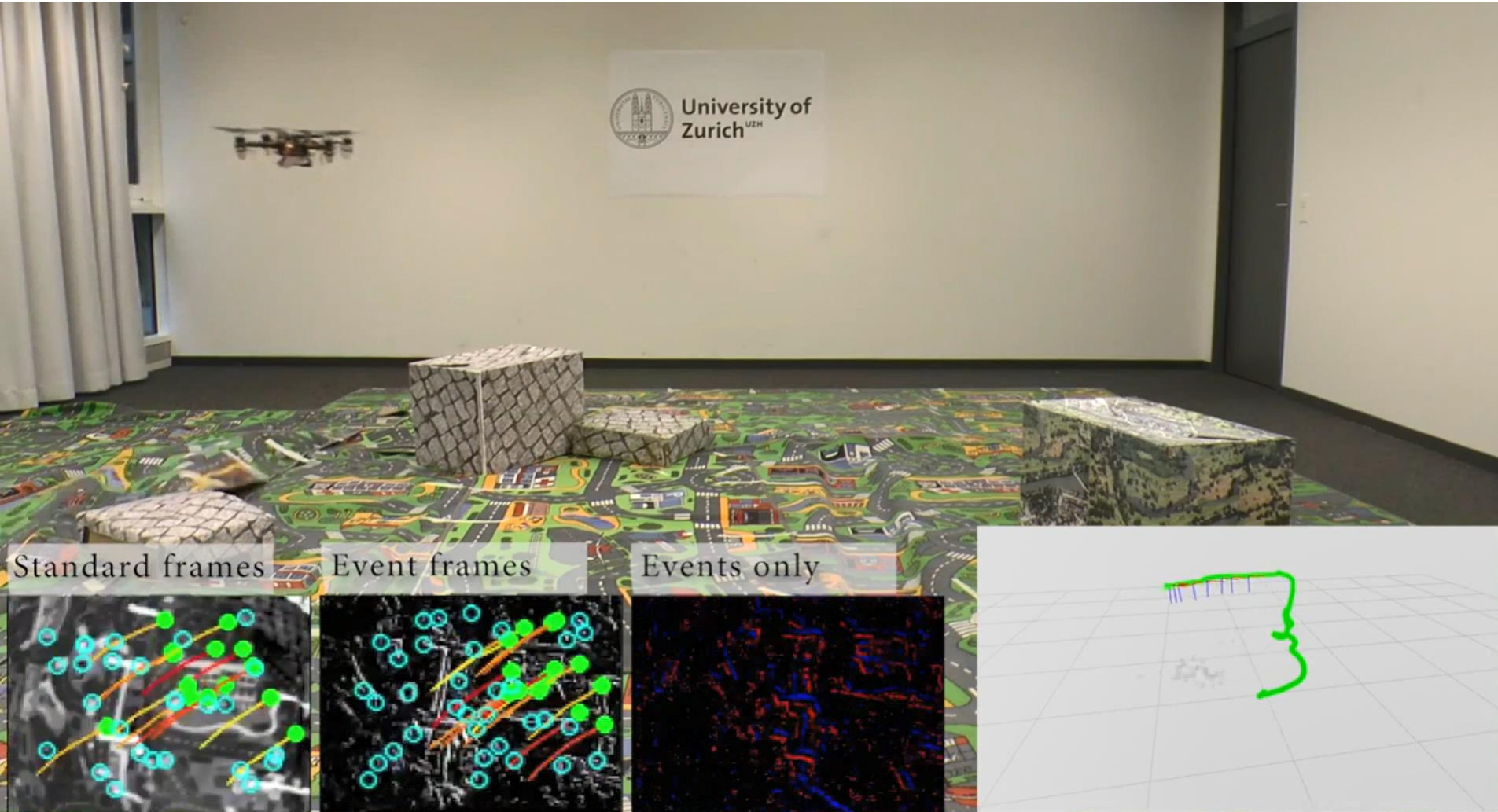


Rebecq et al., EVO: A Geometric Approach to Event-based 6-DOF Parallel Tracking and Mapping in Real-time," IEEE RAL'17. <https://youtu.be/bYqD2qZJlxE>

UltimateSLAM: Events + frames + IMU

Tightly coupled fusion. Fully onboard.

<https://youtu.be/jlvJuWdmemE>



Rosinol, Ultimate SLAM? Combining Events, Images, and IMU for Robust Visual SLAM in HDR and High Speed Scenarios, IEEE RAL'18