

# Object Recognition in Augmented Reality

Tomáš Fabián  
VSB-TUO, FEECS  
Department of Computer Science

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"Deep Learning and Visual Data Analysis"



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<http://mrl.cs.vsb.cz/h2020>



- **Brief Introduction to AR**
  - Terminology
  - Related devices
- **Depth Sensors**
  - Sampling rate issues
- **Main Challenges of AR**
  - Object pose estimation pipeline
- **Example**
  - A brief example of AR application

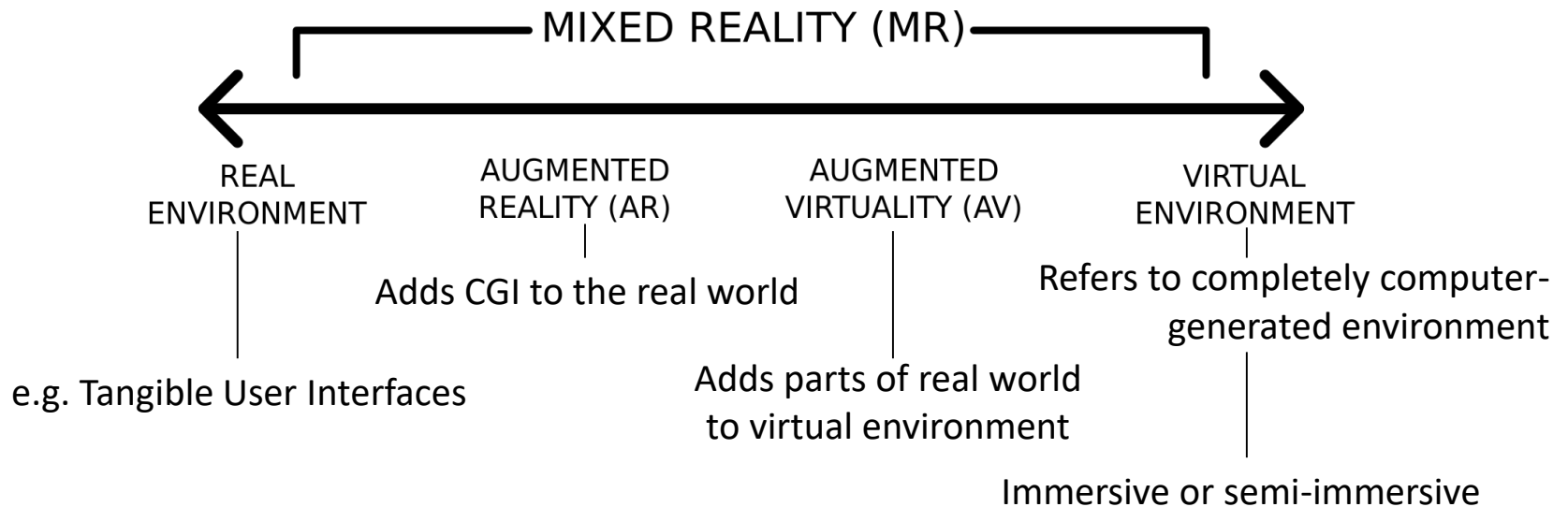


# Buzzwords



- Milgram's virtuality continuum (VC)

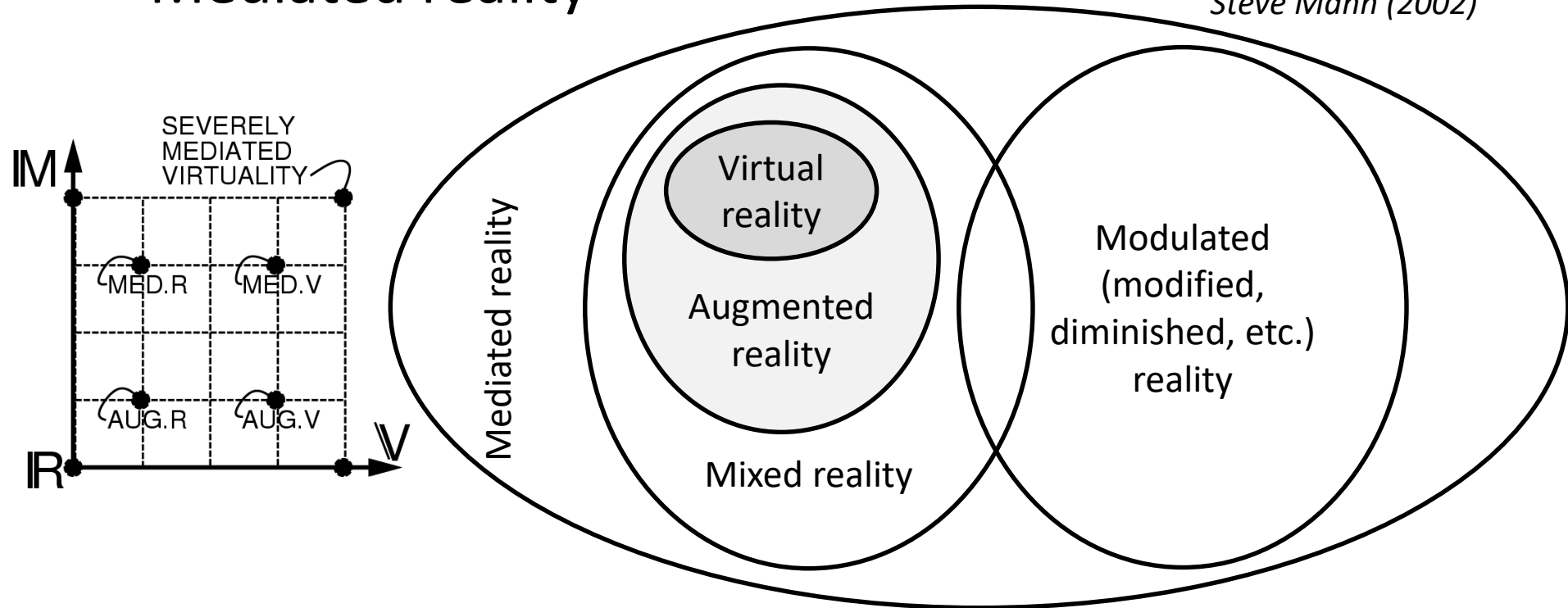
*Milgram and Kishino (1994)*



- AR are technologies allowing users to operate in real world with additional information provided through artificial means

• Mediated reality

*Steve Mann (2002)*



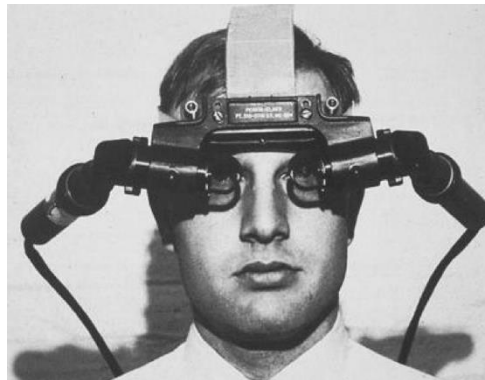
- Second axis (Mediality) denotes modification of reality or virtuality
- Diminished reality (DR) is the direct opposite of AR

- **Early Years of VR/AR: The Sword of Damocles**

“The ultimate display would, of course, be a room within which the computer can control the existence of matter. A chair displayed in such a room would be good enough to sit in. Handcuffs displayed in such a room would be confining, and a bullet displayed in such a room would be fatal. With appropriate programming such a display could literally be the Wonderland into which Alice walked.”

*Ivan E. Sutherland, The Ultimate Display, 1965*

- The first VR head-mounted display (HMD)



- ...and now, 50 years later?

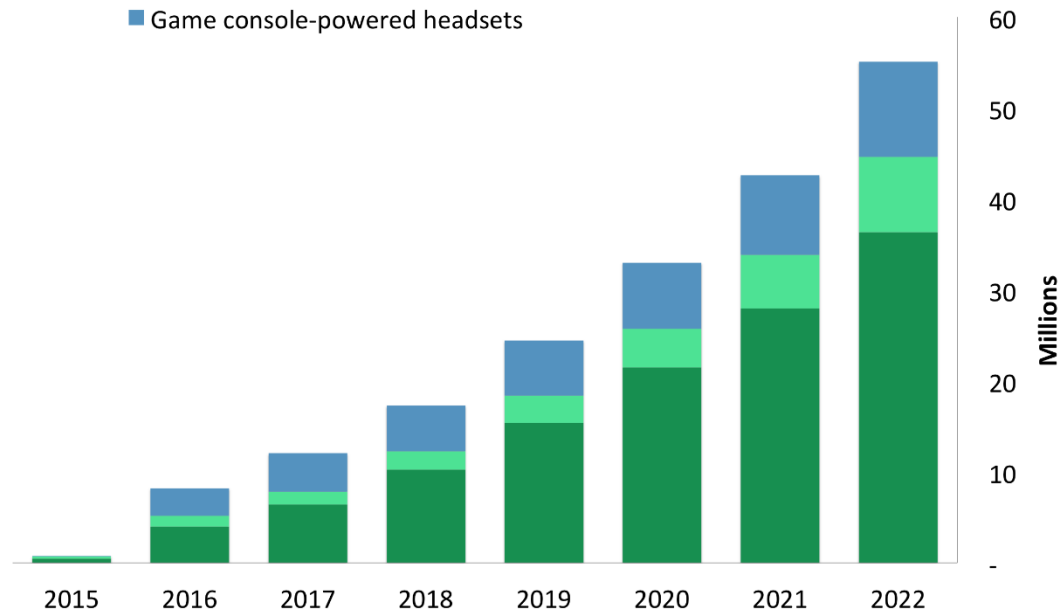
Yet still far from this ultimate goal of computer controlled matter but much has changed

**FORECAST: Global VR Headset Shipments**

*Source: BI Intelligence Estimates*

*By Category*

- Smartphone-powered headsets
- PC-powered Headsets
- Game console-powered headsets



- A variety of near-to-eye devices and head-mounted displays are widely available now...



*Meta*

Meta2 DK



**EPSON**<sup>®</sup>

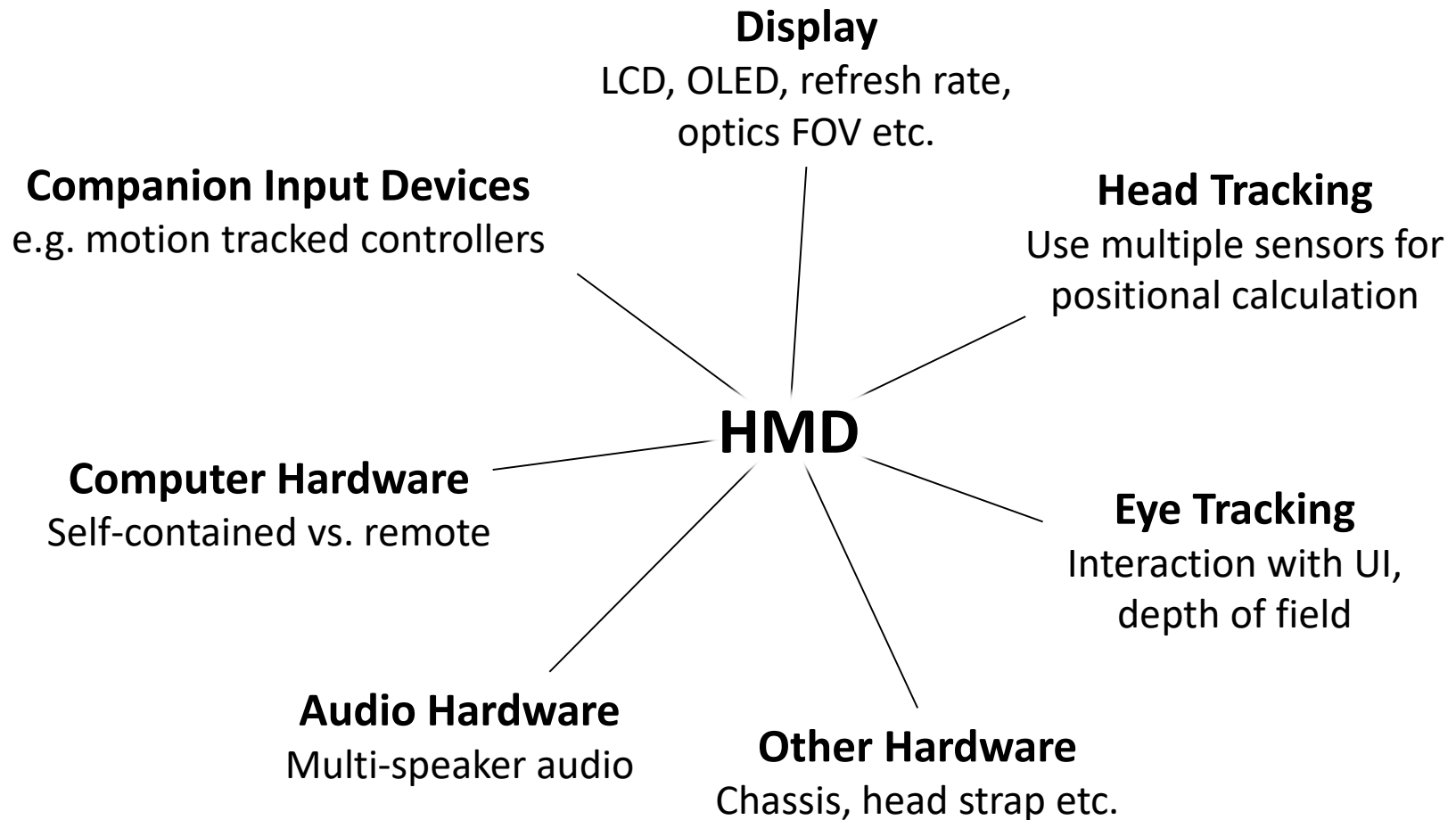
Epson Moverio BT-300



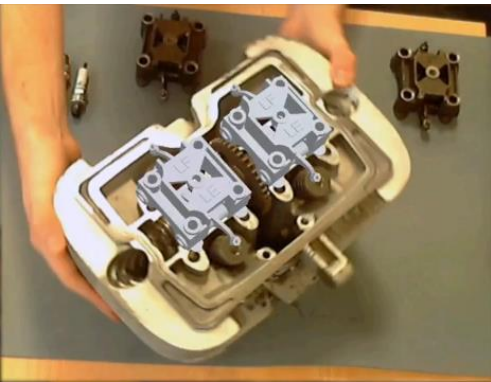
 **Microsoft**

MS HoloLens DE



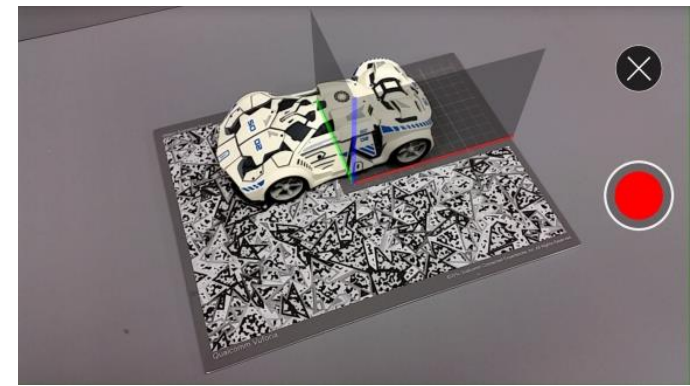
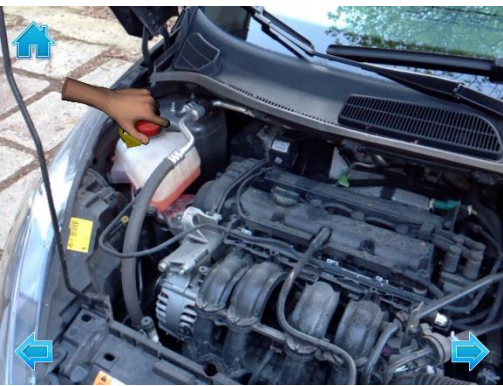


- Many SDKs and their application are around...



# mri Available Apps and SDKs

- Many SDKs and their application are around...



- **Color Sensors**

- Widely available matured technology (CMOS prevails)
- No geometric distortion, i.e. deviation from rectilinear projection (calibration required)
- Low presence of image noise, i.e. random variation in brightness (well lit scene required)
- Rolling shutter causes distortion of fast-moving scenes

- **Depth Sensors**

- Provide valuable range information
- Low cost consumer-grade devices are available
- But...

- **Orbbec Astra**

*„Astra is developed to be highly compatible with existing OpenNI applications, making 3D camera ideal for pre-existing apps that were built with OpenNI.“*

**Specifications** (just an excerpt, more on Orbbec web site)

Dimensions 160 × 30 × 40 mm

Weight 0.3 kg

Range 0.4 – 8 m, optimized 0.6 – 6 m (0.3 – 5.8 m Astra S)

Depth Image Size 640×480 (VGA) 16 bit @ 30 FPS

RGB Image Size 1280×960 @ 10 FPS

Field of View 60° horiz. × 49.5° vert. (73° diagonal)

Data Interface **USB 2.0**

Microphones 2

Operating Systems Windows, Linux, Android

Power USB 2.0 (Full Power 2.2 W, Standby Power 1.5 W)

Software Orbbec Astra SDK + OpenNI

Low HW requirements

Price 150 USD



Structured light

40 000 beams at 800 nm



(a) Original depth map



(b) Original color map

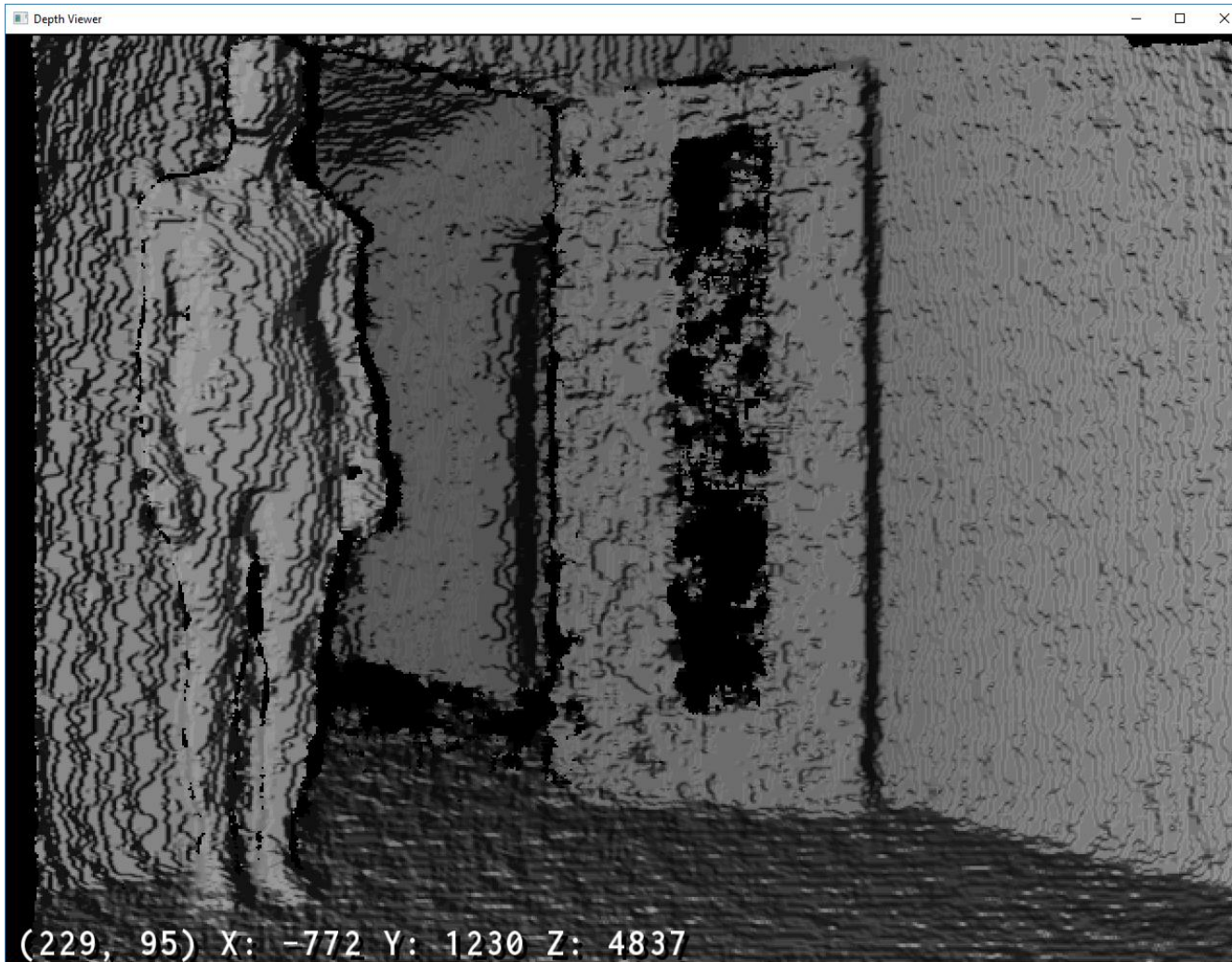


(c) Filtered depth map

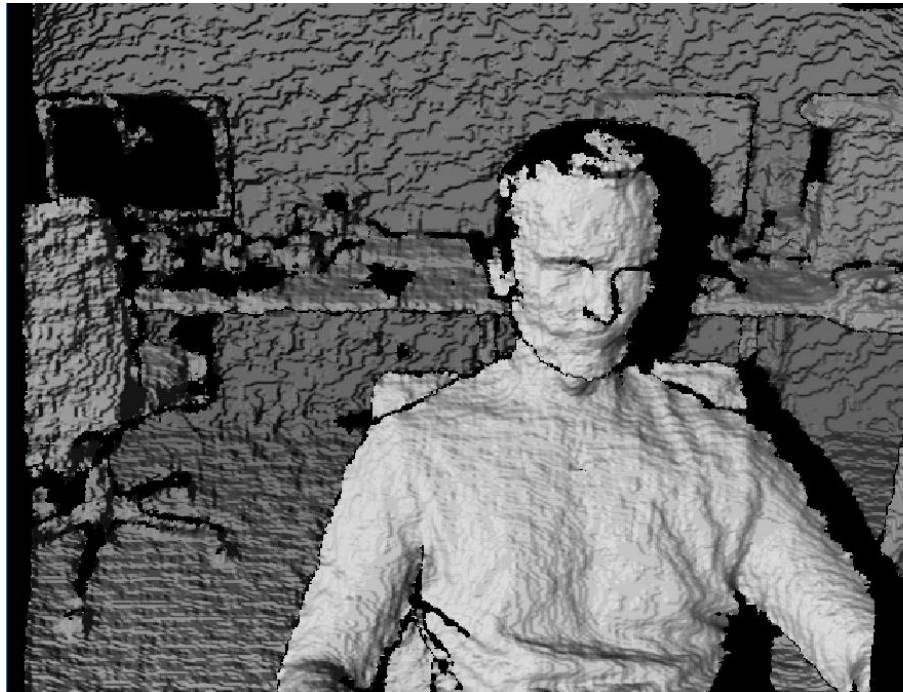


(d) Depth-color registration

# mri Range Images



Z represents actual distance in mm (integers)



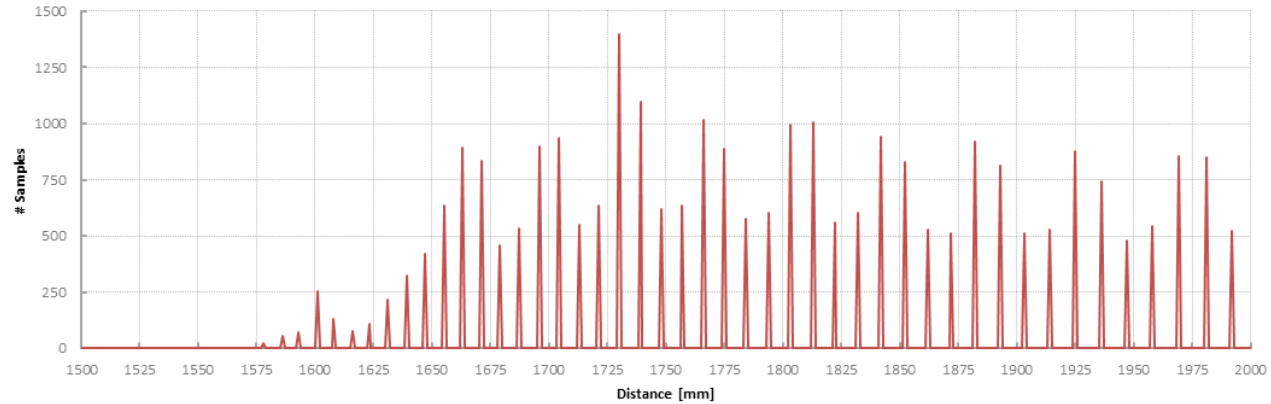
(a) Depth map



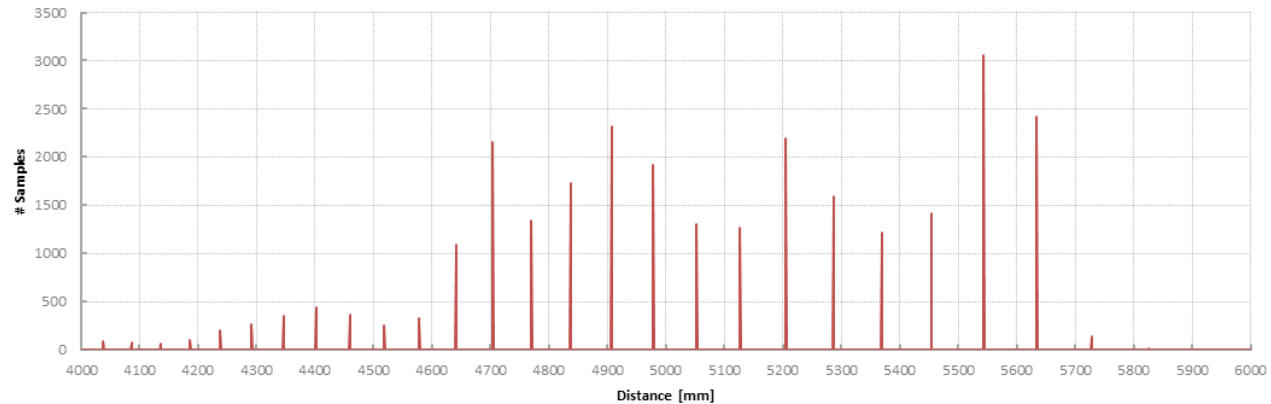
(b) Infrared coded structured light



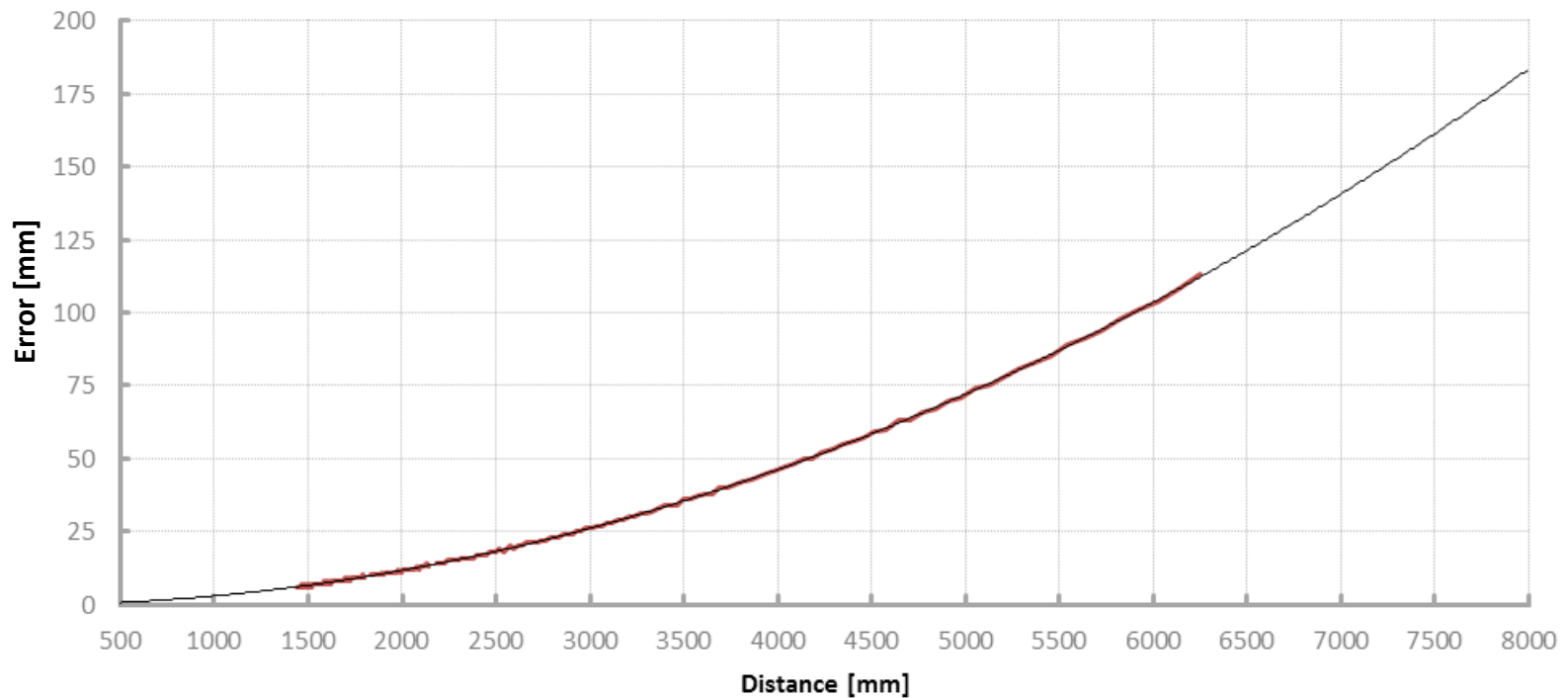
### Near End Distribution of Measurements



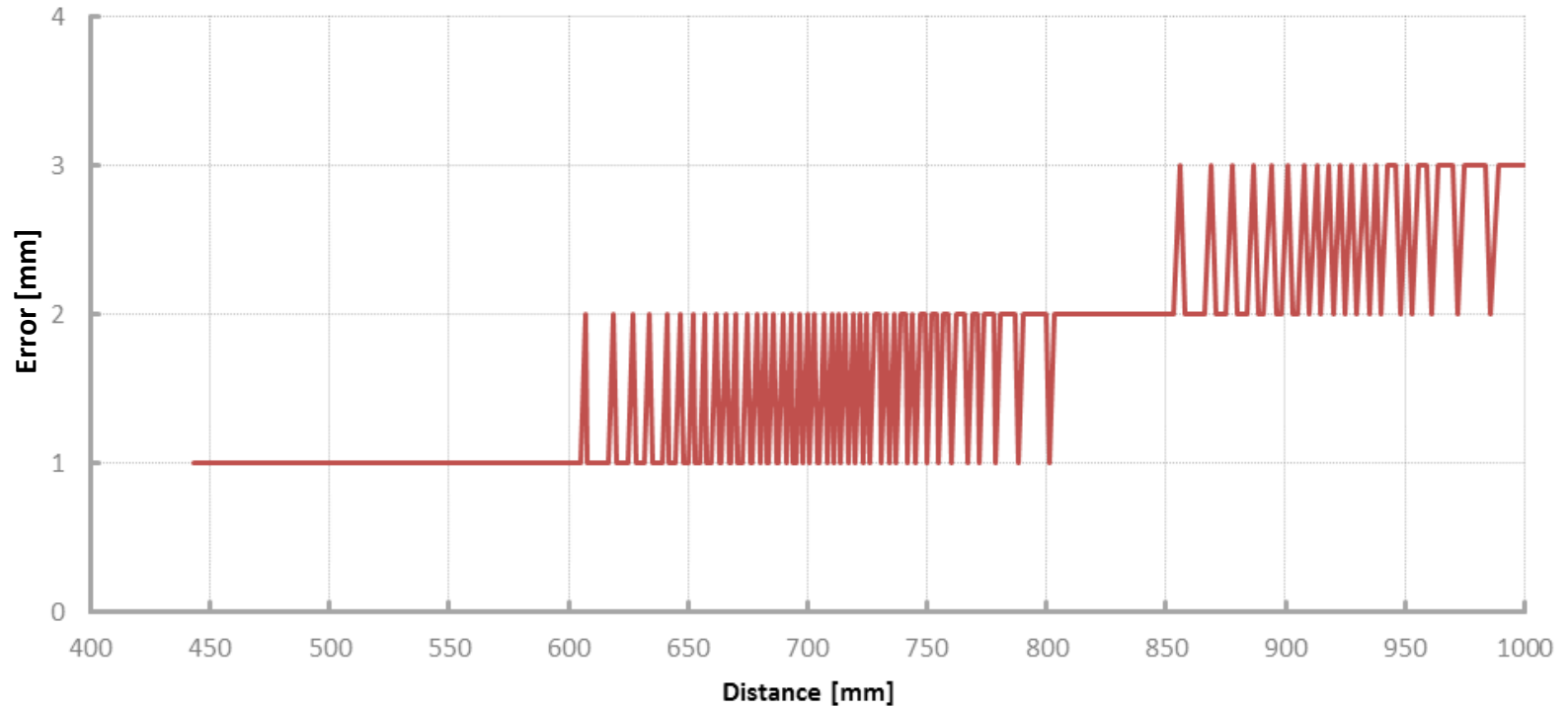
### Far End Distribution of Measurements



## Error of Measurement vs. Distance

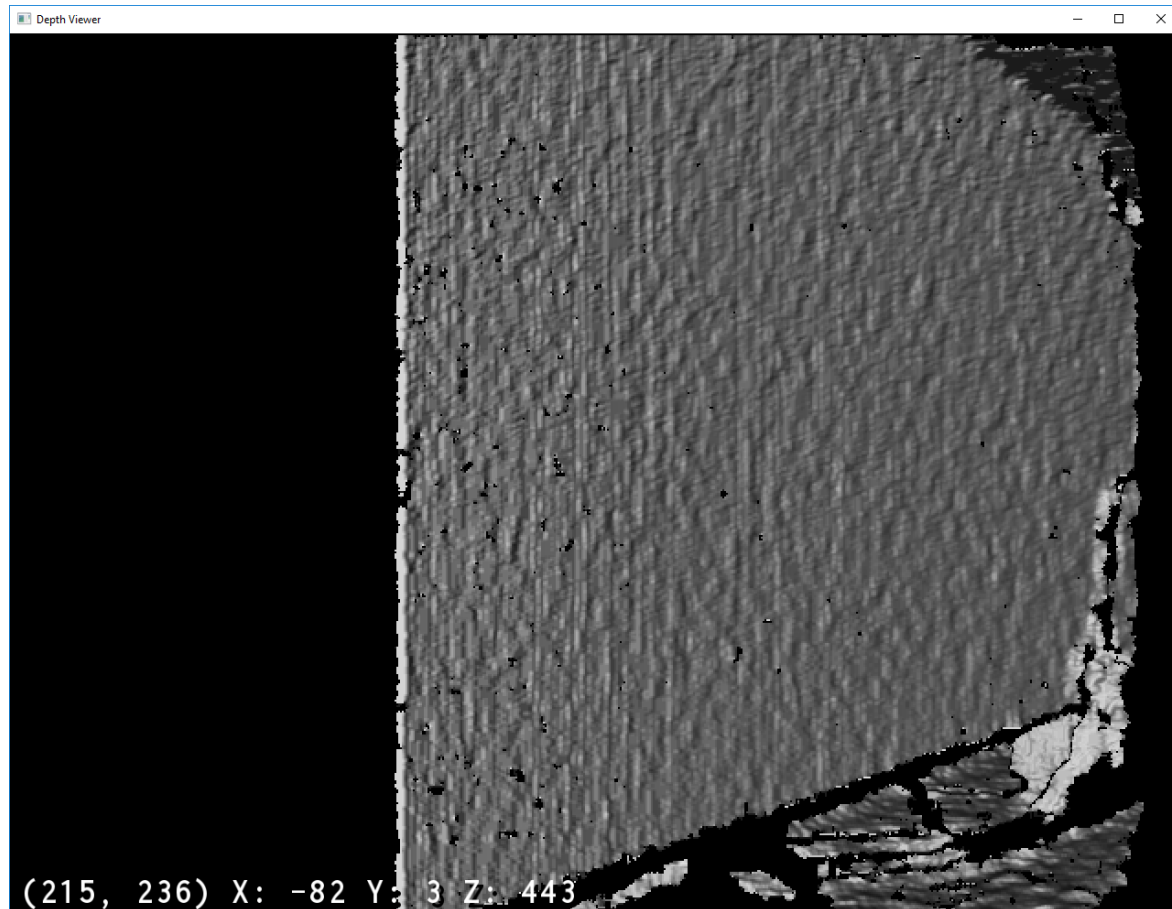


## Error of Measurement vs. Distance (near end)

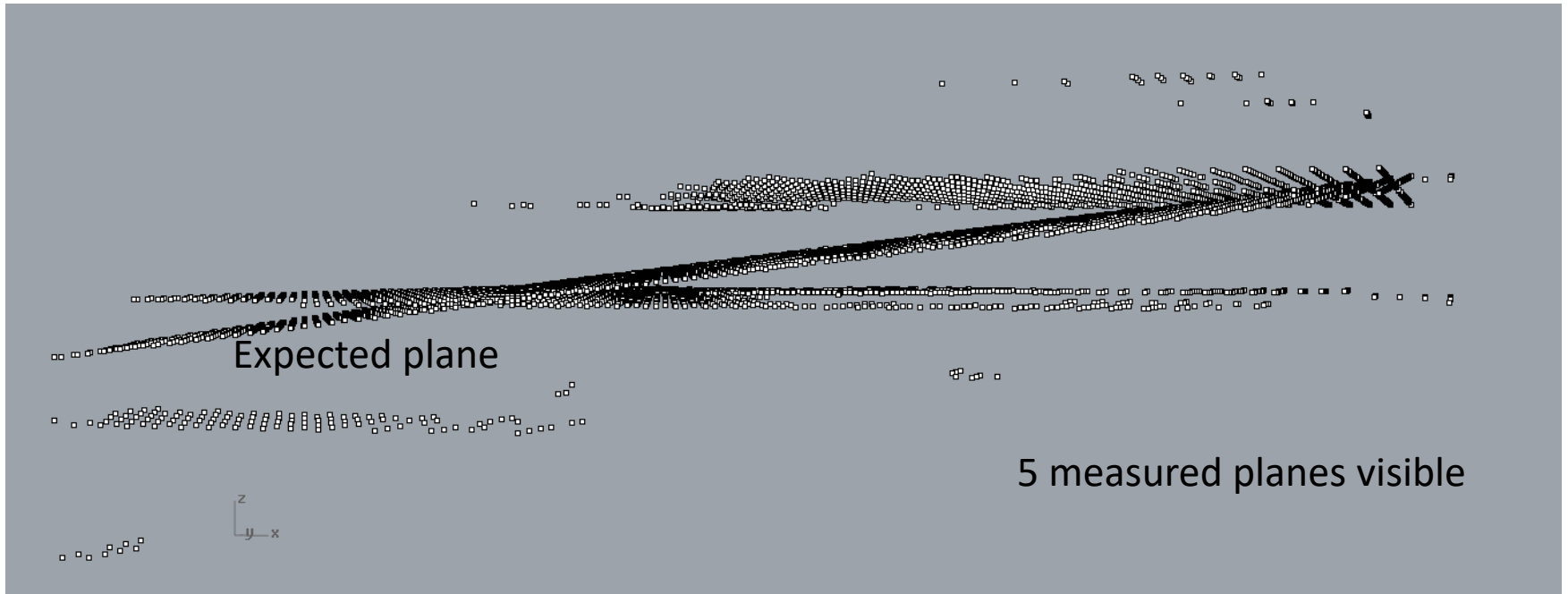


## Plane Sampling

Perfectly flat plane at the distance of 44.3 - 100 cm



## Plane Sampling cont.



Mean error 6.84 mm

Separation of measurements  $\sim 19$  mm at the distance of 2.5 m

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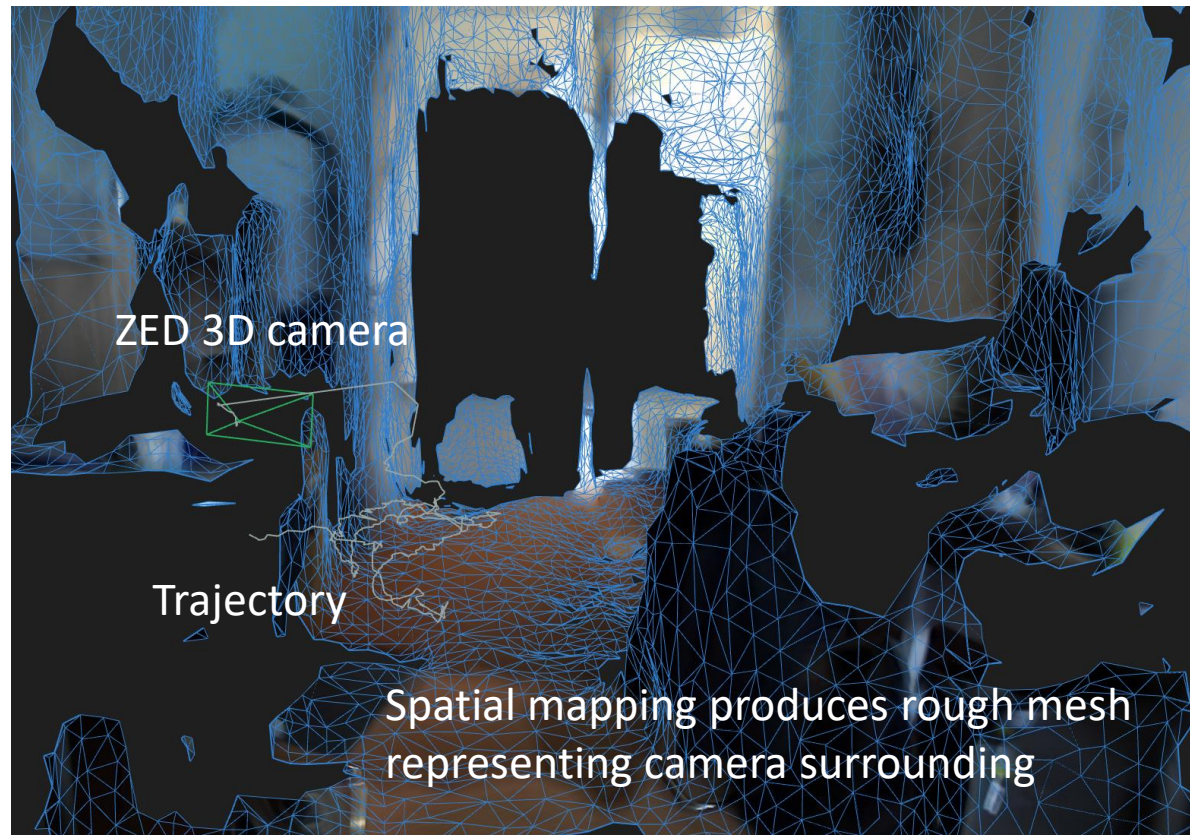
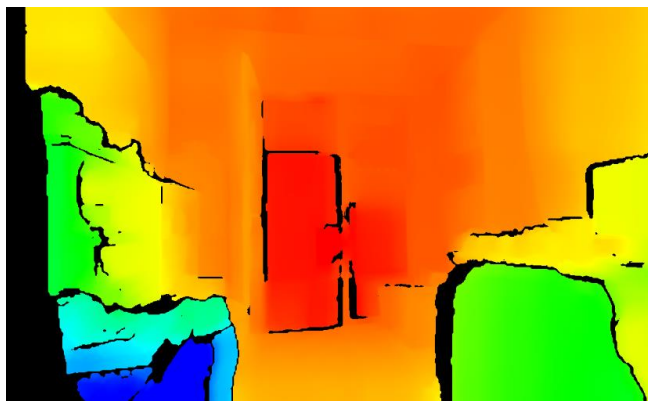
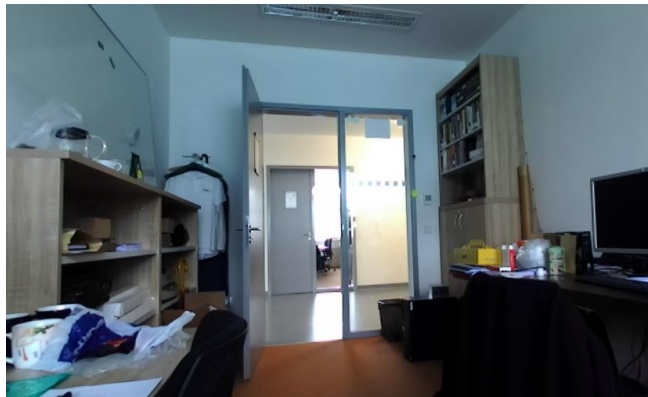
- Observations
  - At close distances (0.6 m) Astra produces accurate depth map
    - Resolution close to 1 mm is achievable as the sampling rate allows for that level of precision
  - With increasing distance things are getting worse
    - At the far end (8 m) we can expect the resolution of roughly 20 cm

- Conclusion
  - We decided to pursue these two paths independently
  - Approach A: RGB images with optional range data
  - Approach B: Depth images with possible use of color channels

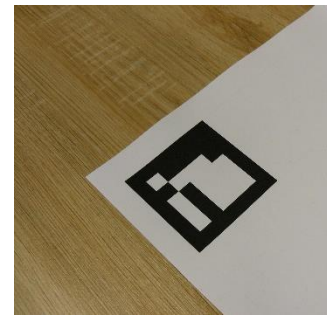


# mri Main Challenges

- Where is the camera?
  - Spatial mapping, 3D SLAM (e.g. HoloLens, ZED)



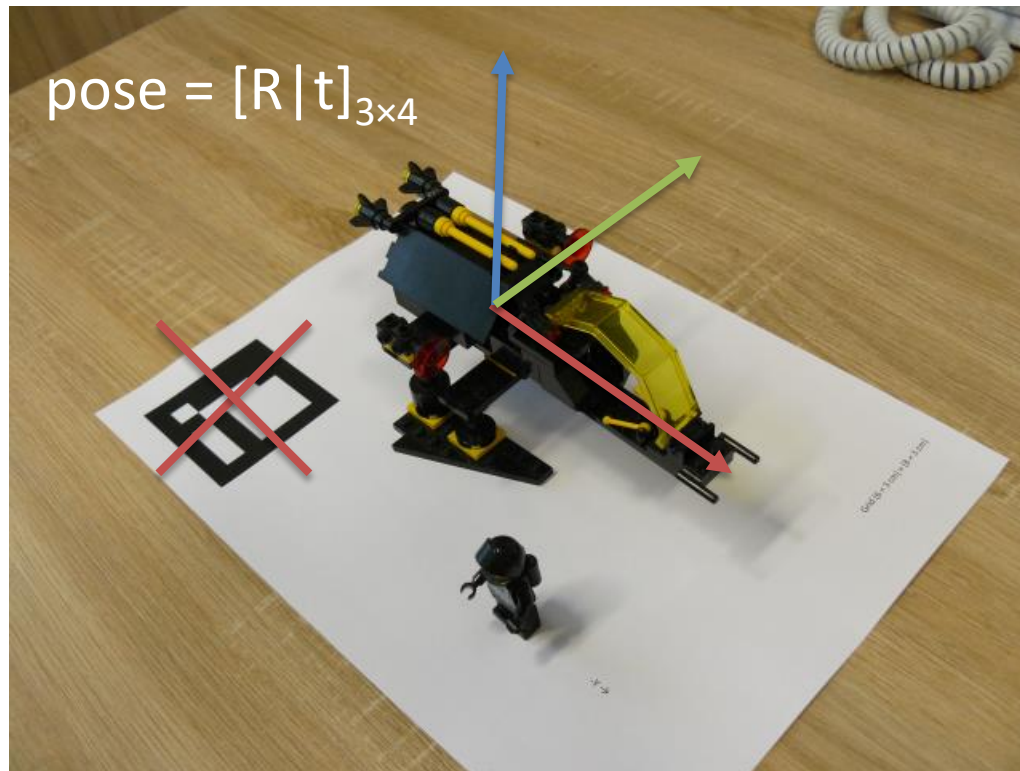
- Where is the sought object?
  - SDKs commonly recognize planar (fiducial) markers (e.g. VuMark, QR code)



- Support for direct recognition and tracking of texture-less 3D objects is lacking
- Algorithms for 6-DOF object pose estimation in RGB(-D) images are actual research topic

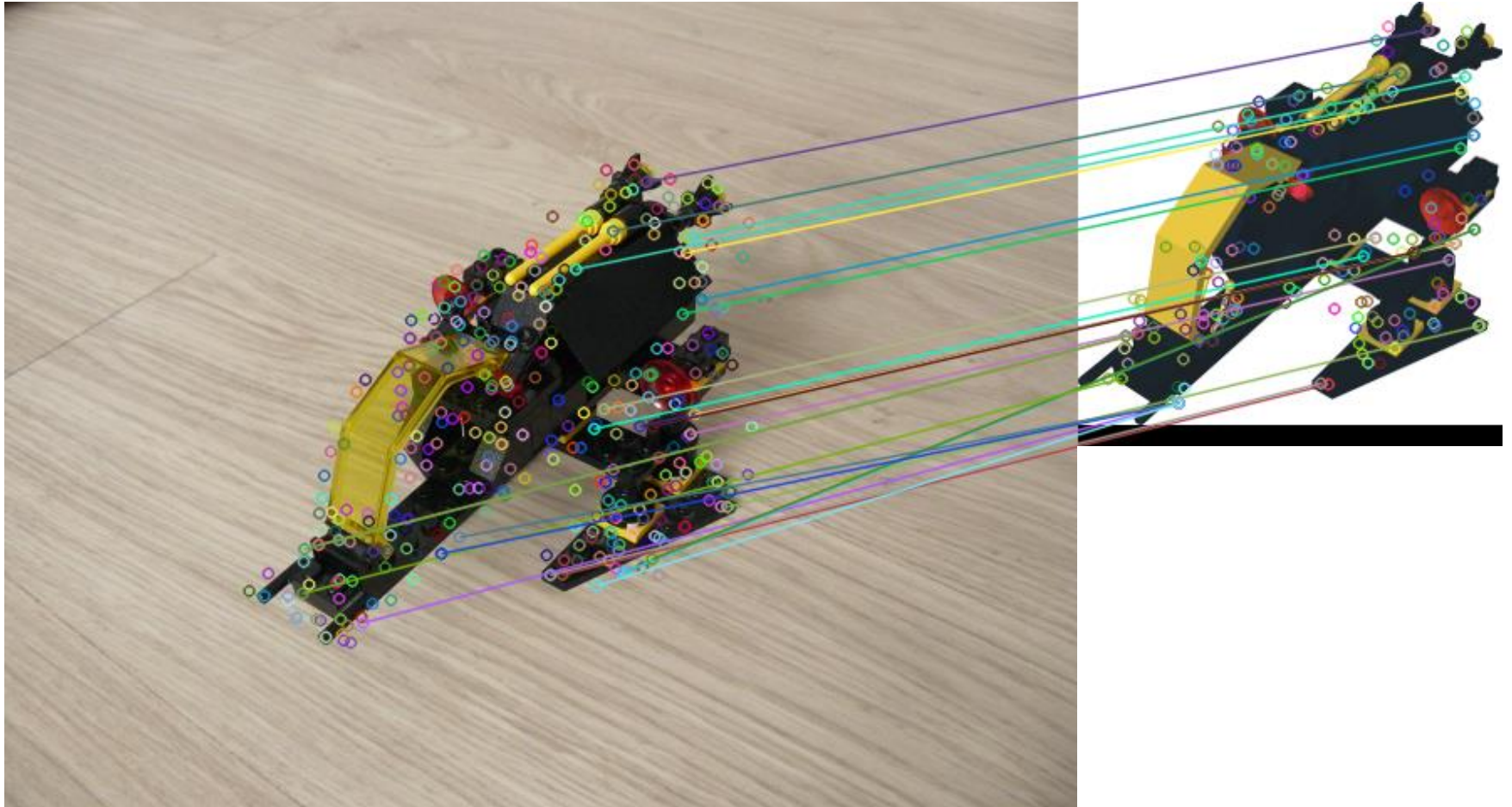
# mrl Main Challenges

- How to estimate the relative pose of the object w.r.t. the camera without markers?

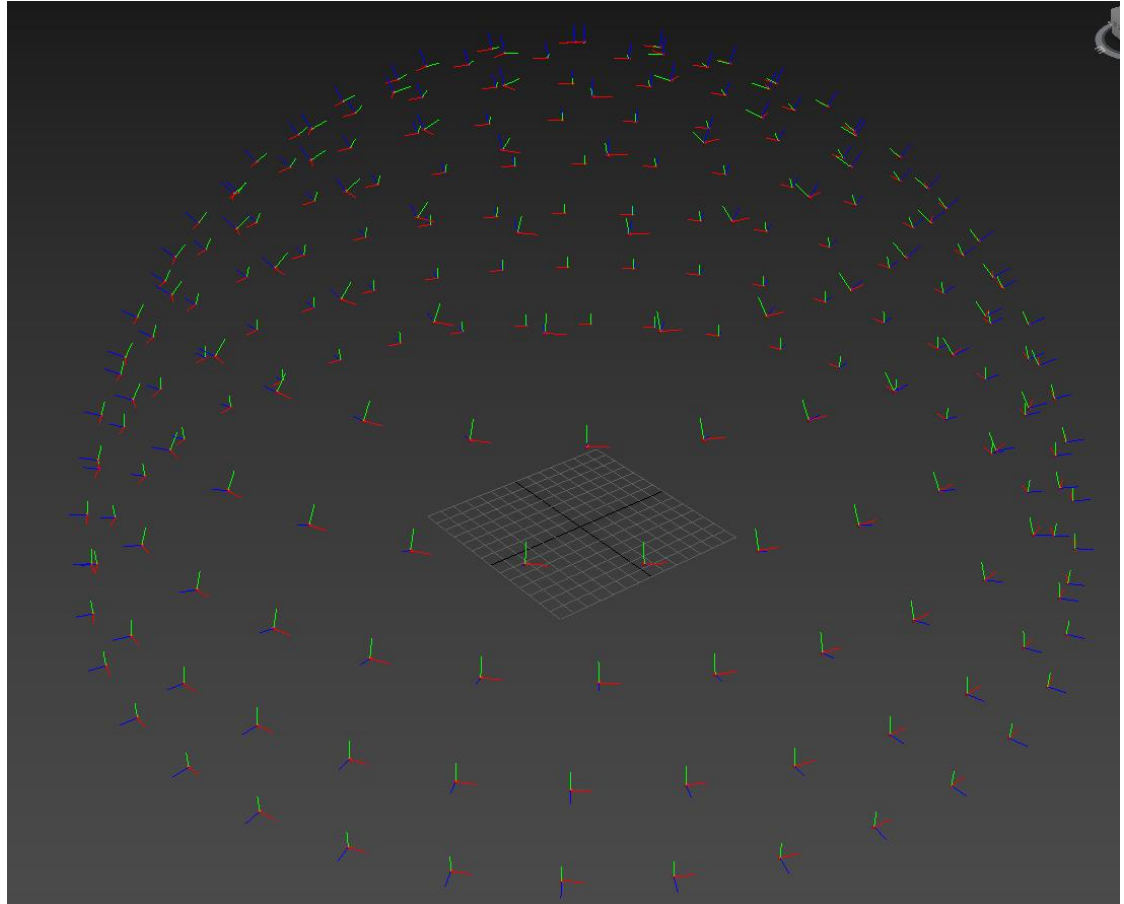
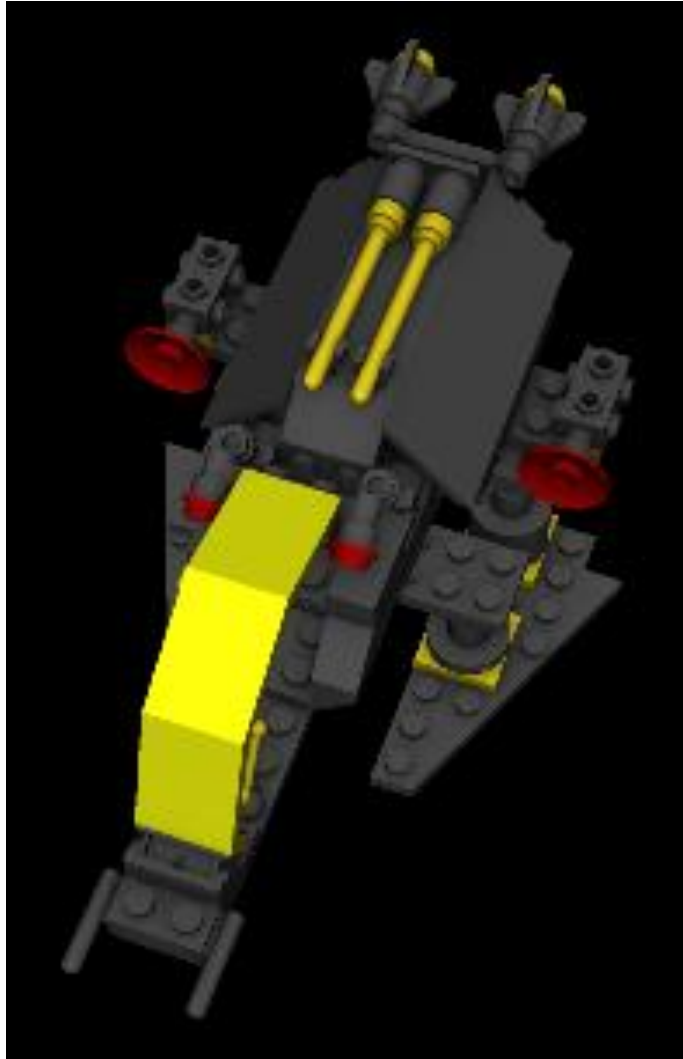


- Object instance detection and pose estimation methods
  - Template based matching
    - Edge based
    - Gradient based
  - Local descriptors (scalable, robust to object pose changes)
    - SIFT, SURF, ORB, BRIEF...
  - Voting based approaches
    - Excessive quantization and post-processing required
  - CNN based approaches
    - Rather bit slow

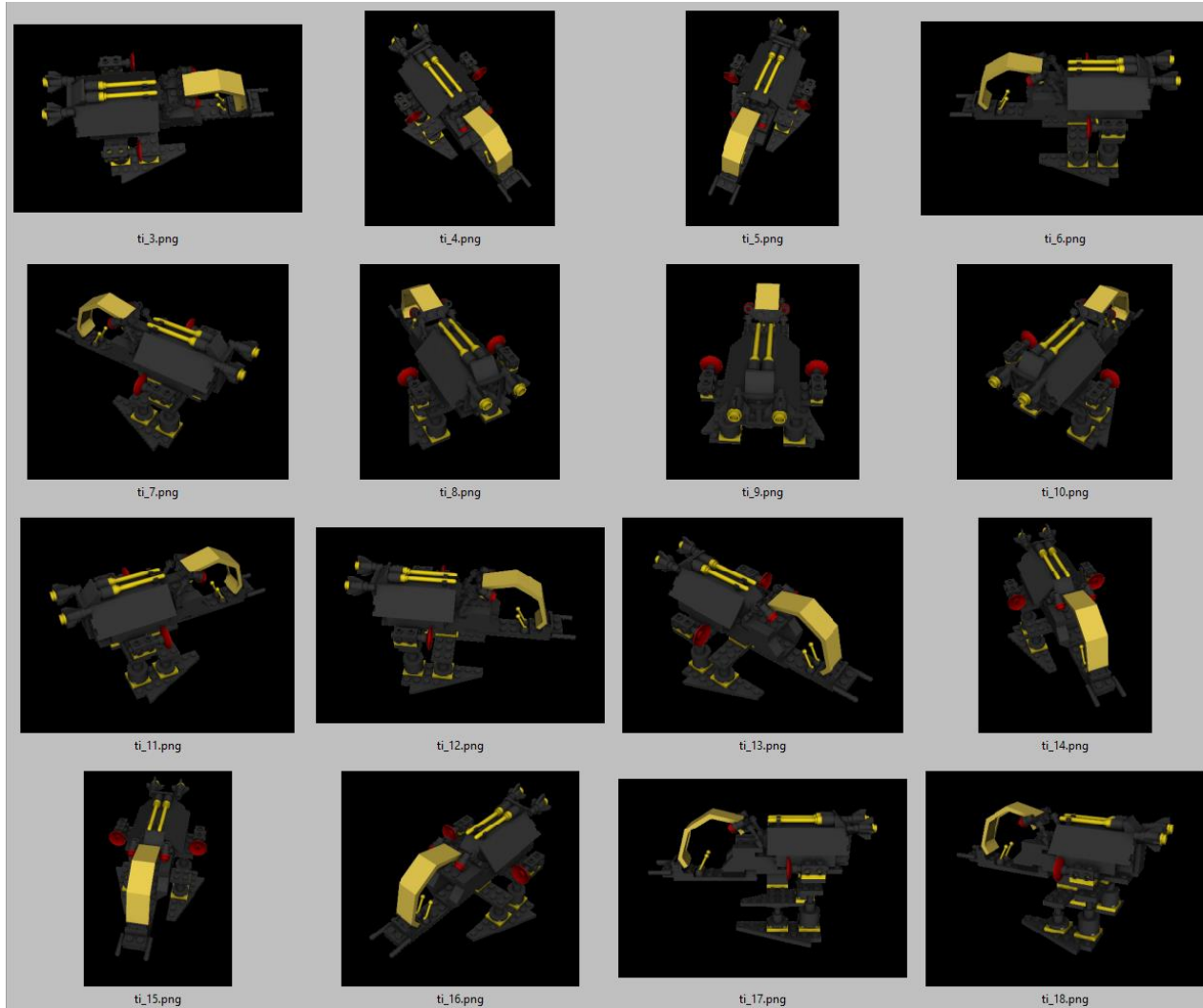
# Example of Pose Estimation



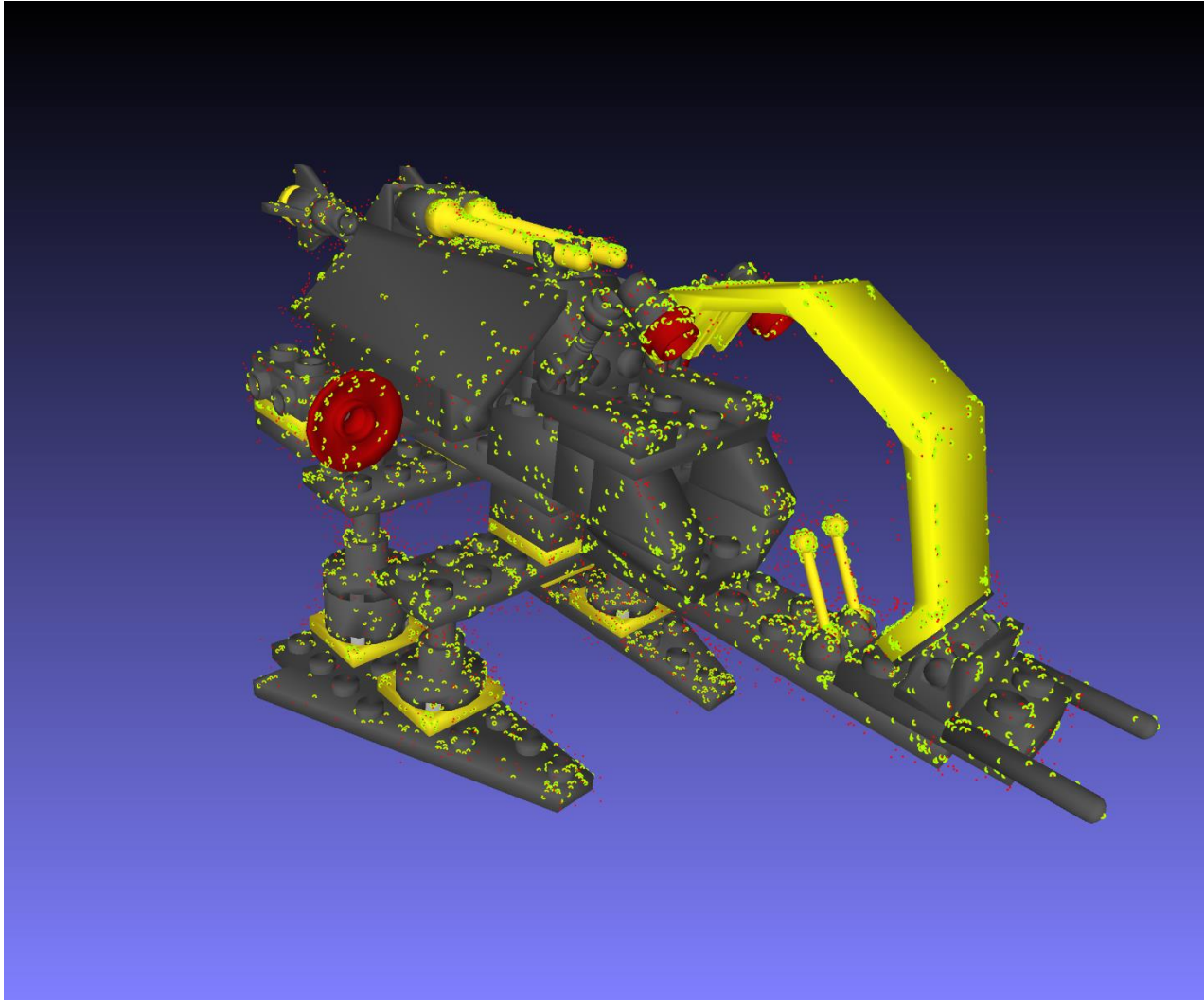
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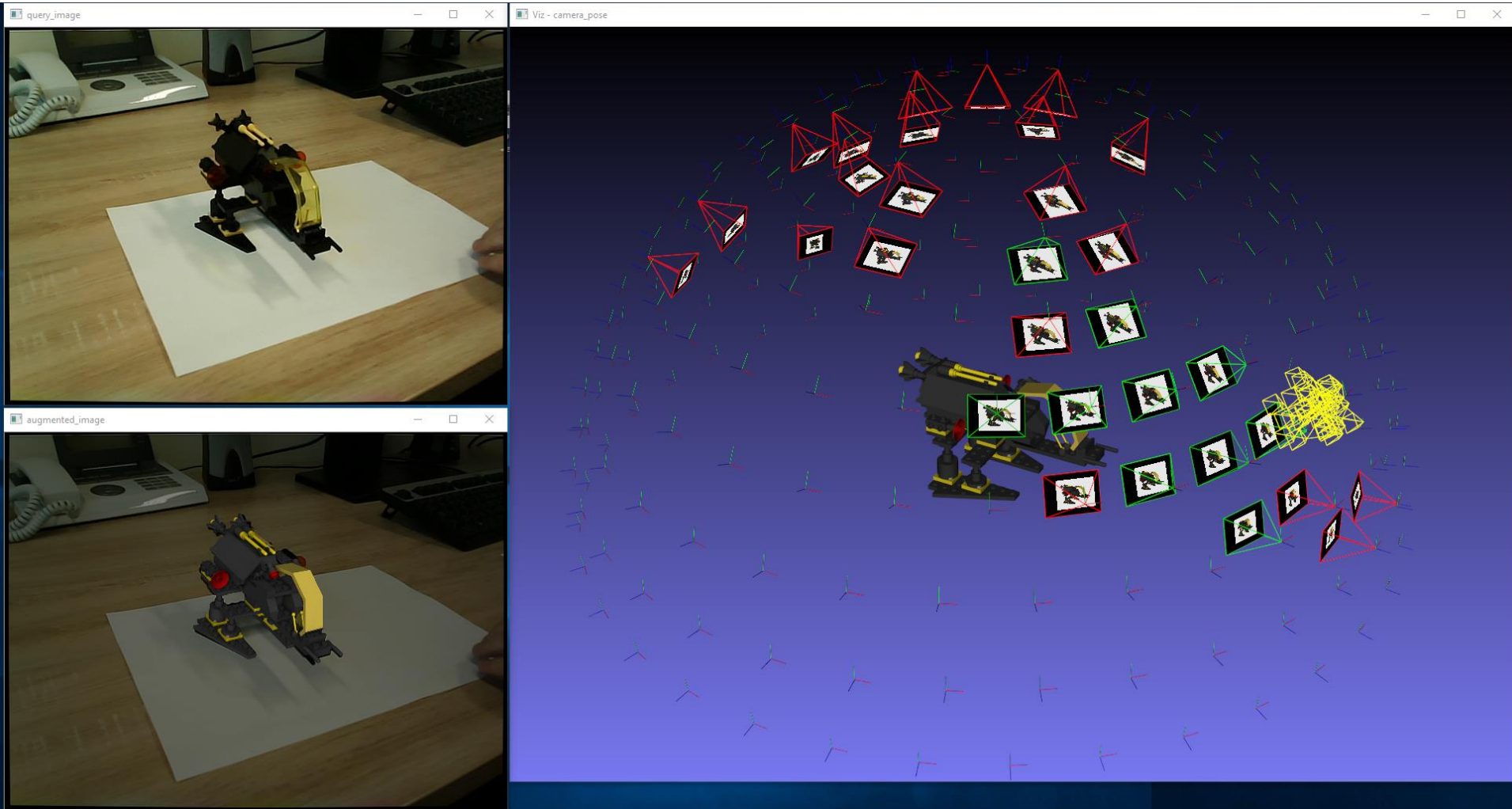
# Example of Pose Estimation



# Example of Pose Estimation







# Example of Pose Estimation



Thank you for your attention