

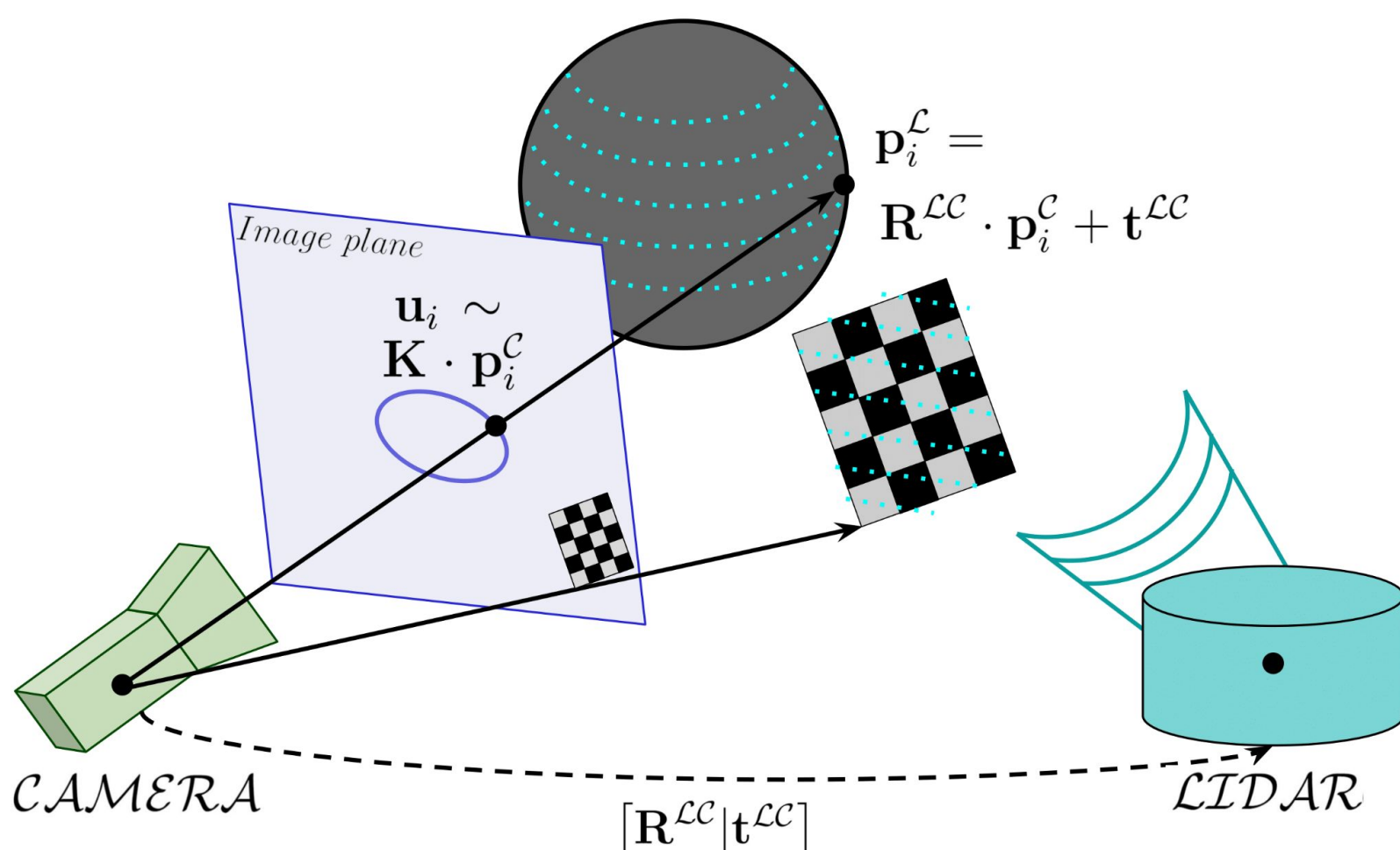
## Motivation

### Checkerboard pattern

- Most common calibration target for cameras
- In sparse 3D point clouds, hard to detect the board edges accurately

### Sphere-based approach

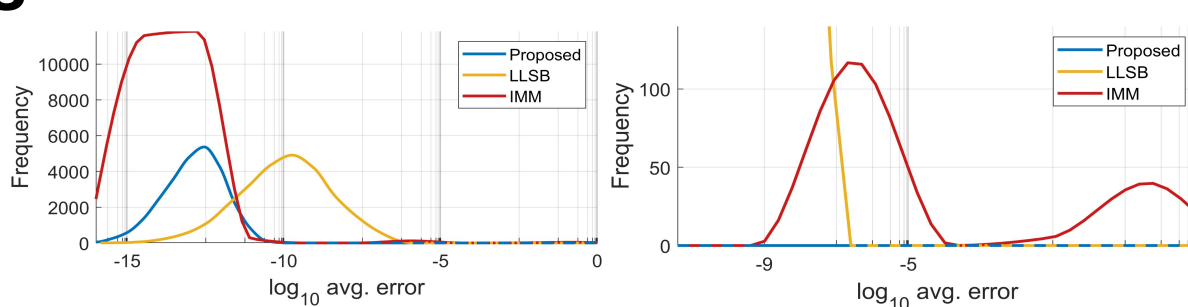
- Guarantees continuous surface in 3D
- Sphere projection  $\rightarrow$  Ellipse detection in the image



## Synthetic and real test results

### Stability analysis of the three-point methods

- 25,000 synthetic scenarios on log. scale
- Proposed, IMM: more precise on average
- IMM stability error around zero



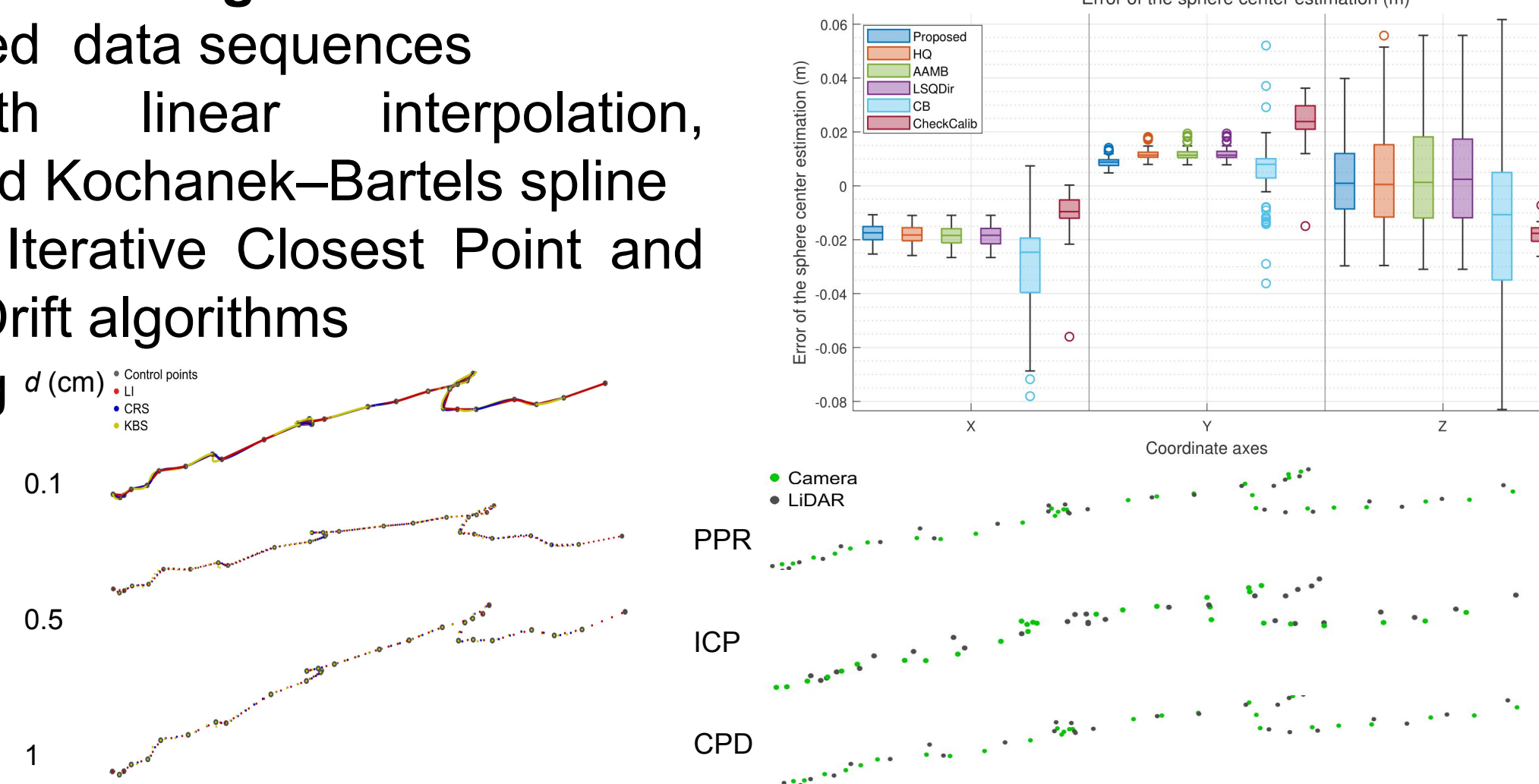
### CFD and boxplot of the sphere and chessboard position errors

- Real stereo camera pair + LIDAR data
- 3-point and 5-point ellipse detectors, circle-based approach, Matlab Calibration Toolbox are compared
- Challenging depth estimation for spheres
- Proposed method has a minor error with 2-4 mm while reaching the exact value of the CDF

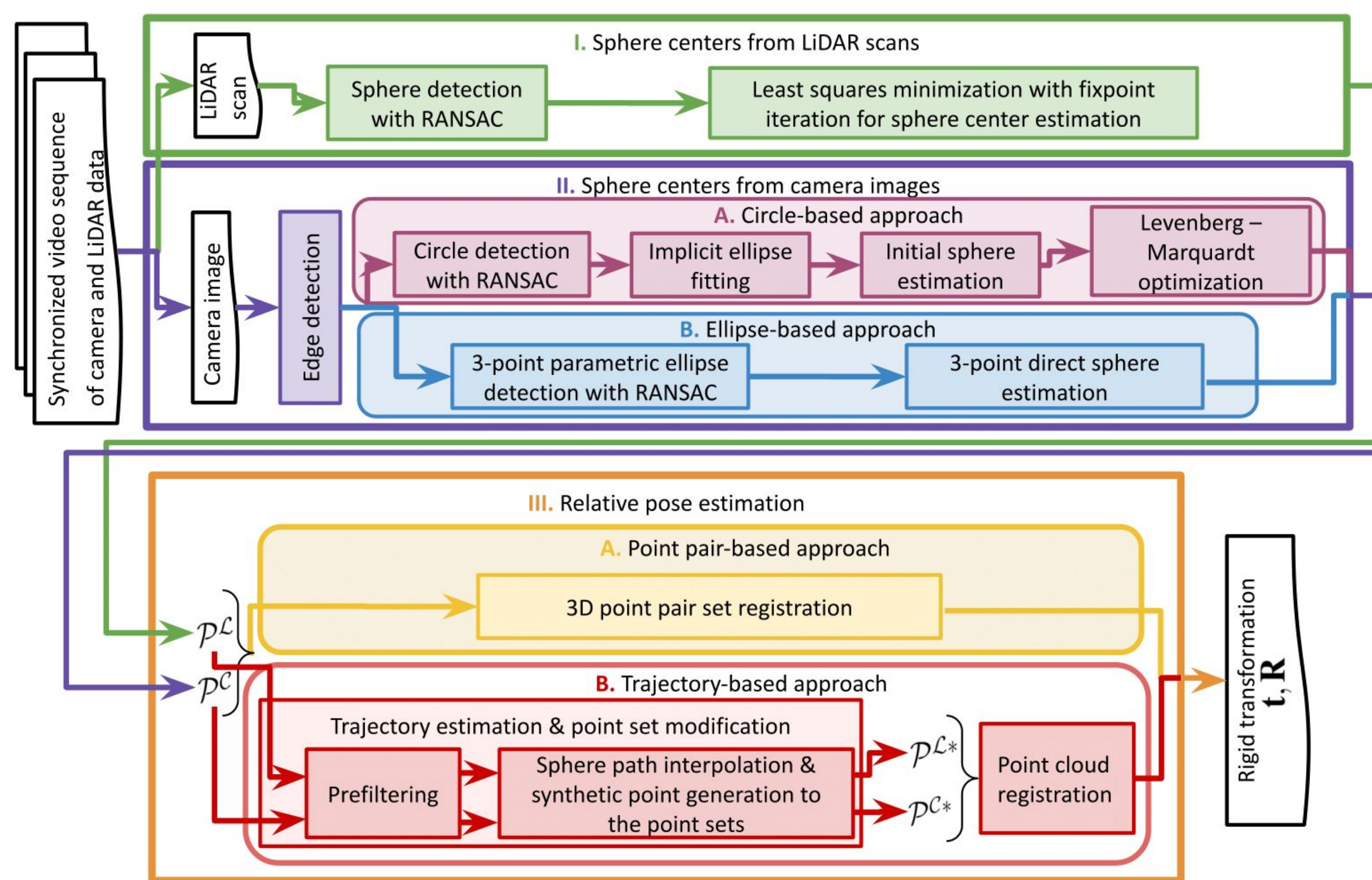
### Trajectory estimation and registration

- Real synchronized data sequences
- Estimation with linear interpolation, Catmull-Rom and Kochanek-Bartels spline
- Registration with Iterative Closest Point and Coherent Point Drift algorithms
- Varying sampling frequency  $d$
- Ideal target distance:

$$d_s^L < \frac{r}{\tan \frac{(n-1) \cdot \delta}{2}}$$

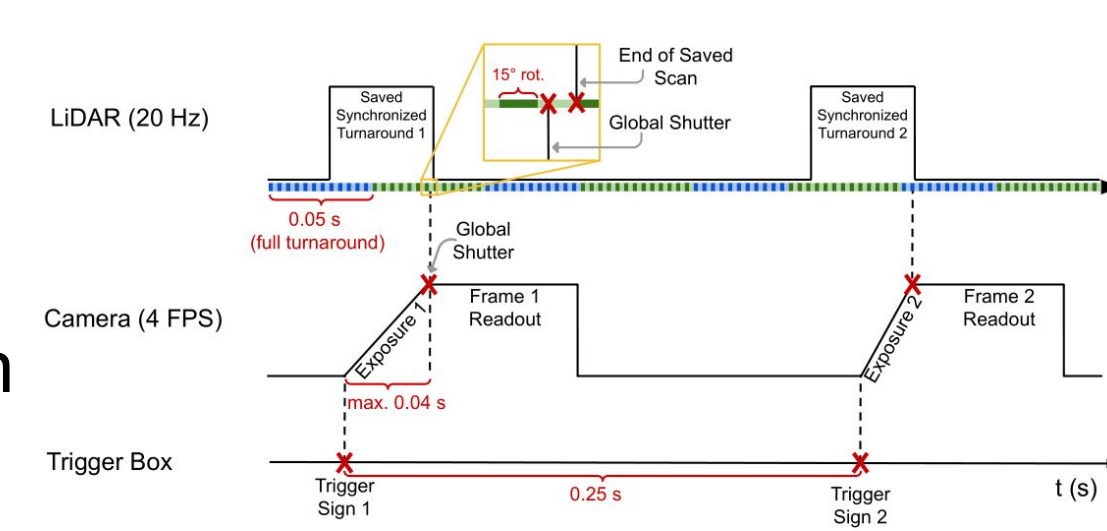


## Proposed pipeline and its variants



## Contributions

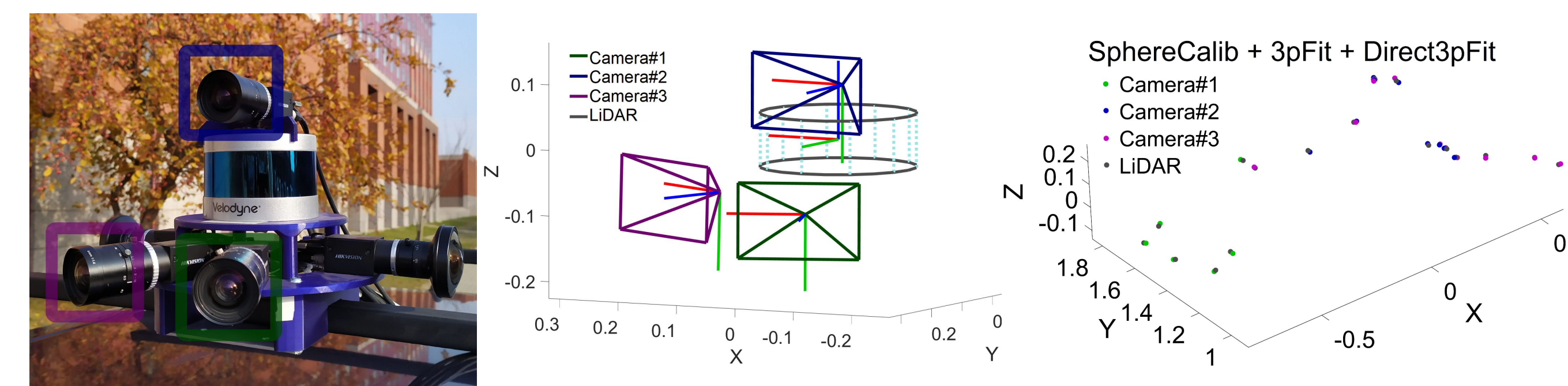
- Automatic calibration pipeline for 2D-3D sensor calibration [1]**
  - For cameras with narrow lenses
  - Circle-based estimation
  - Adaptive RANSAC threshold
- Image-based three-point sphere detection and 3D localization [2]**
  - Special ellipse fitting: axial and projection constraints
  - Min. no. of inliers reduced from five to three for ellipse fitting
  - Solution for minimal and overdetermined cases
  - Direct ellipse and sphere estimation
  - No numerical optimization needed
  - Minimizing geometric error
- Trajectory registration [3]**
  - Continuous synchronized 2D-3D input
  - Extended point set  $\rightarrow$  Spline interpolation
  - Point cloud registration for object paths



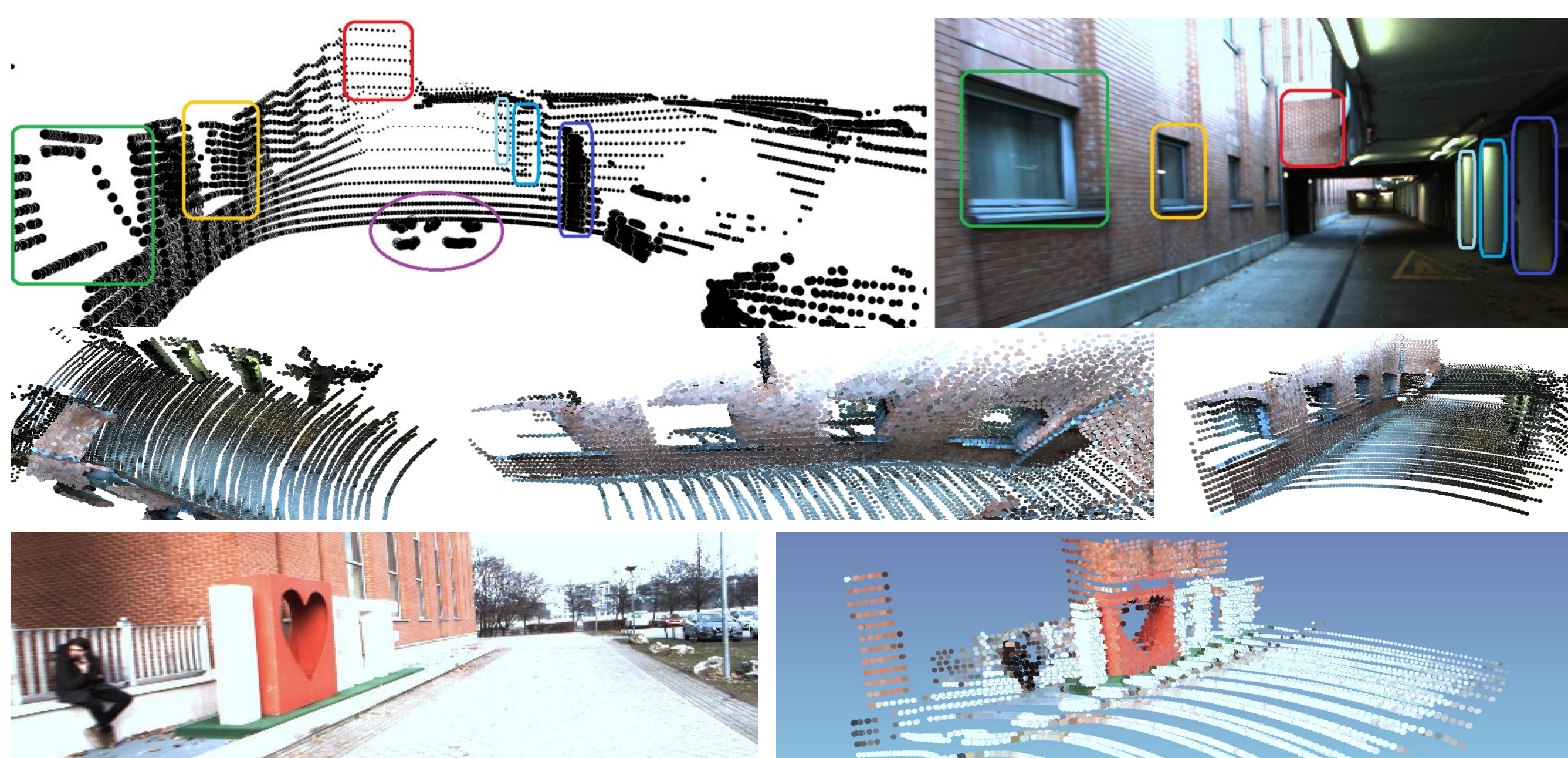
## Sensor pose estimation

The schematic figure of the sensor setup using the extrinsic parameters (middle) estimated from the sphere center registration (right) represents a realistic adjustment considering the mounted setup (left).

**Test devices:** Hikvision digital cameras (74° FoV) + Velodyne VLP-16 LiDAR



## Colorized point clouds: corridor and university logo



## References

- Toth, T., Pusztai, Z., Hajder, L., *Automatic LiDAR-Camera Calibration of Extrinsic Parameters Using a Spherical Target*, 2020 IEEE International Conference on Robotics and Automation (ICRA), 2020
- Toth, T., Hajder, L., *A Minimal Solution for Image-Based Sphere Estimation*, International Journal of Computer Vision (IJCV), 2023
- Toth, T., Valasek, G., Hajder, L., *3D Trajectory Registration for Sensor Calibration*, 26th Computer Vision Winter Workshop (CVWW), 2023

