

# Development and Validation of Velocimeter LIDAR Simulator

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## Introduction

### Motivation

Doppler lidars are capable of providing high-fidelity altimetry and velocimetry, making them versatile instruments in precise navigation and safe landing. Realistic simulation of Doppler lidars and subsequent validation is paramount for their adoption in hardware-in-the-loop simulations for testing flight software and hardware.

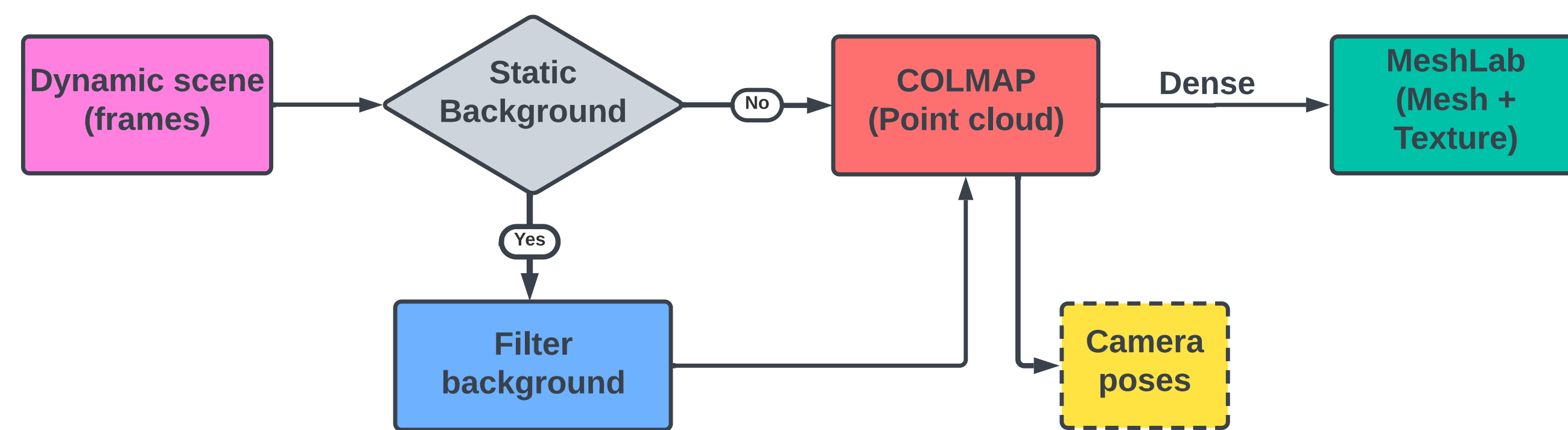
### Contributions

- NaRPA: A ray-tracing engine for photorealistic imaging and frequency modulated carrier wave (FMCW)/ Doppler/velocimeter lidar emulation.
- Real world and synthetic Doppler lidar datasets with imagery and motion ground truth.
- Performance evaluation of generated synthetic data in comparison to experimental data.

## 3D assets and motion inference

### Mesh and Texture Reconstruction

- Image-based dense 3D reconstruction using COLMAP. Point cloud to mesh (.obj format) using MeshLab.



### Motion

- Ground truth trajectories using motion capture system (Vicon).
- If motion capture is unavailable: NaRPA metadata is acquired from COLMAP and camera-lidar intrinsics.

$$\mathbf{u} = \begin{bmatrix} \mathbf{u}_\theta \\ \mathbf{u}_t \end{bmatrix} \begin{matrix} \text{Rotation} \\ \text{Translation} \end{matrix}$$

$$\boldsymbol{\omega} \approx \frac{\mathbf{u}_\theta}{\Delta t} \quad \mathbf{v} \approx \frac{\mathbf{u}_t}{\Delta t}$$

Sample interval

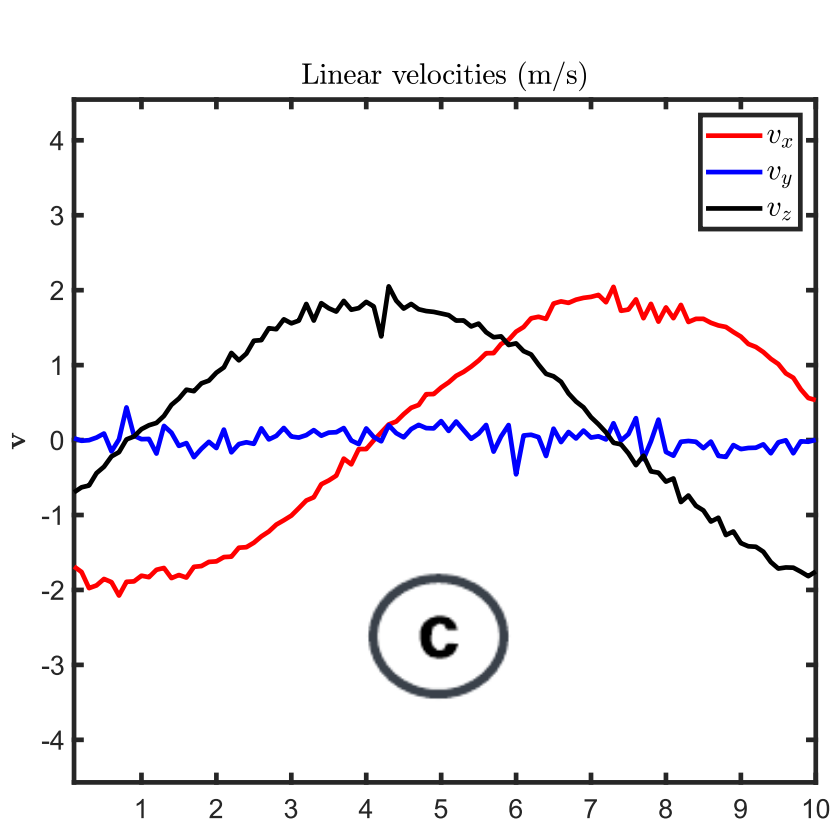
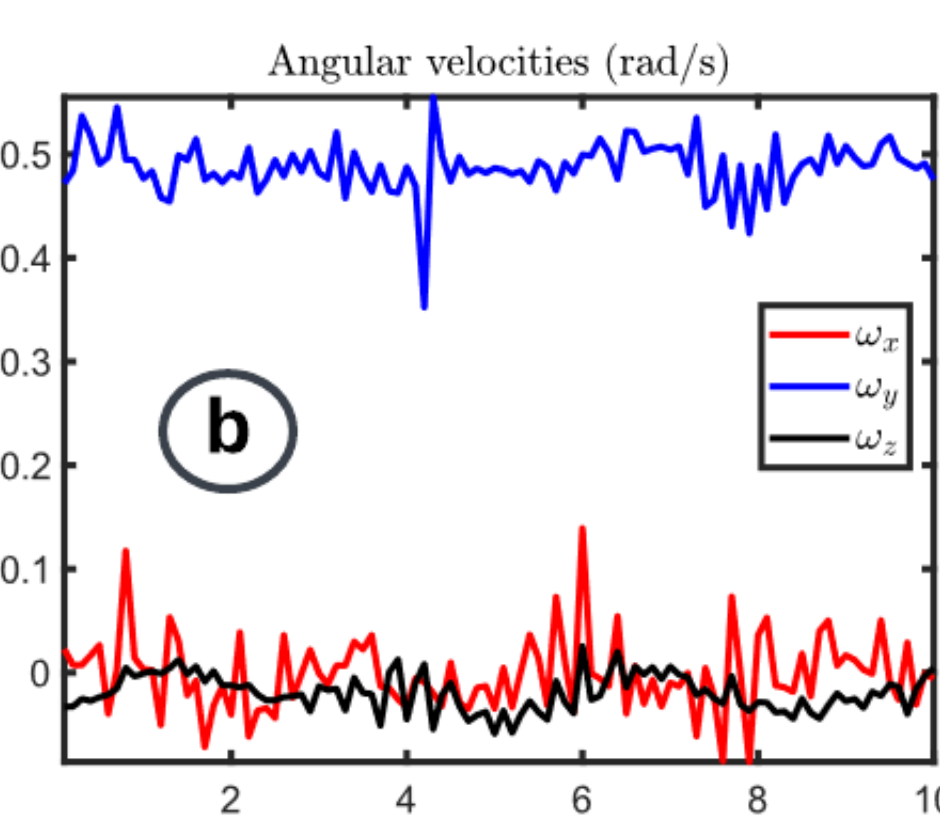
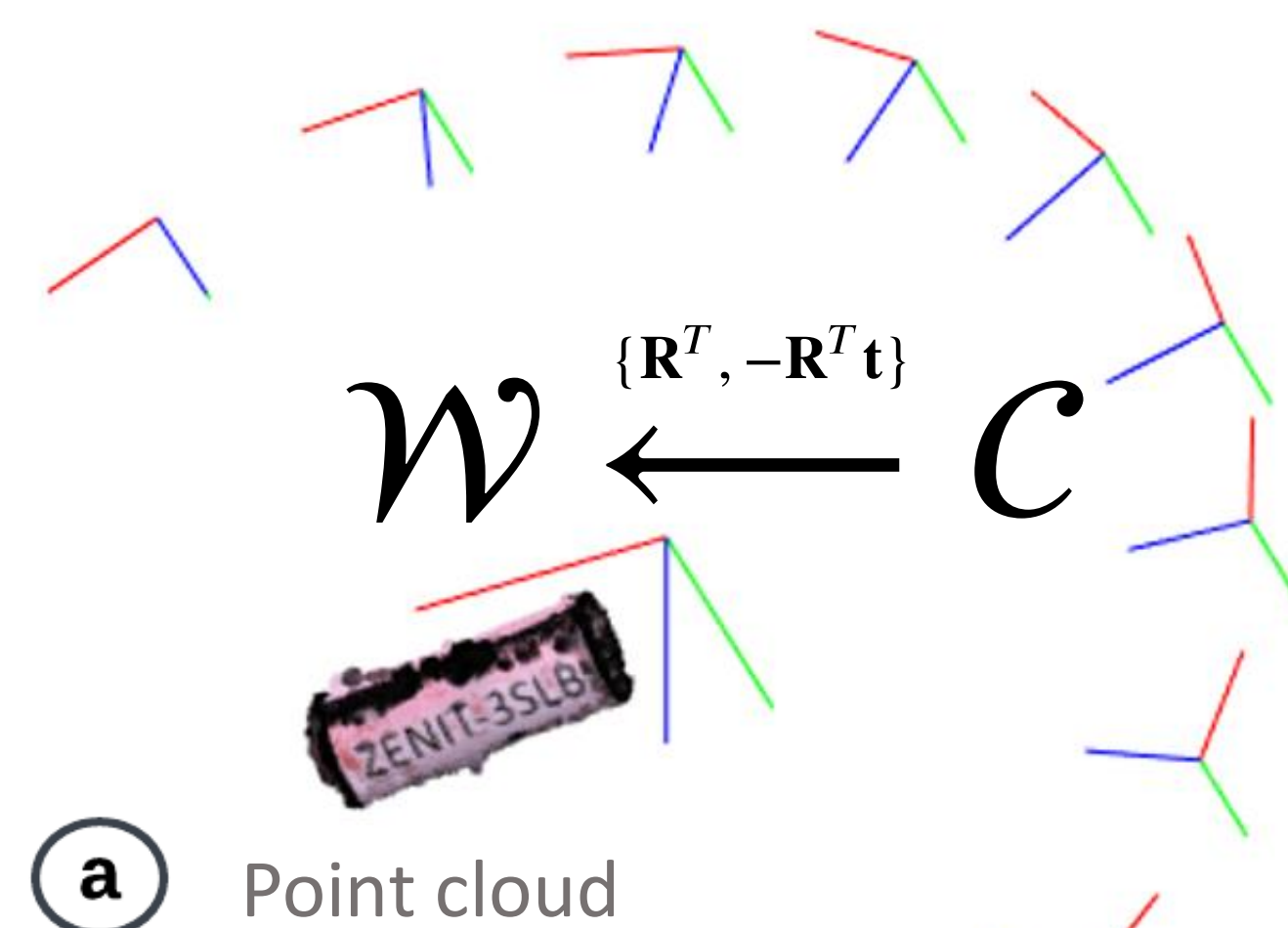
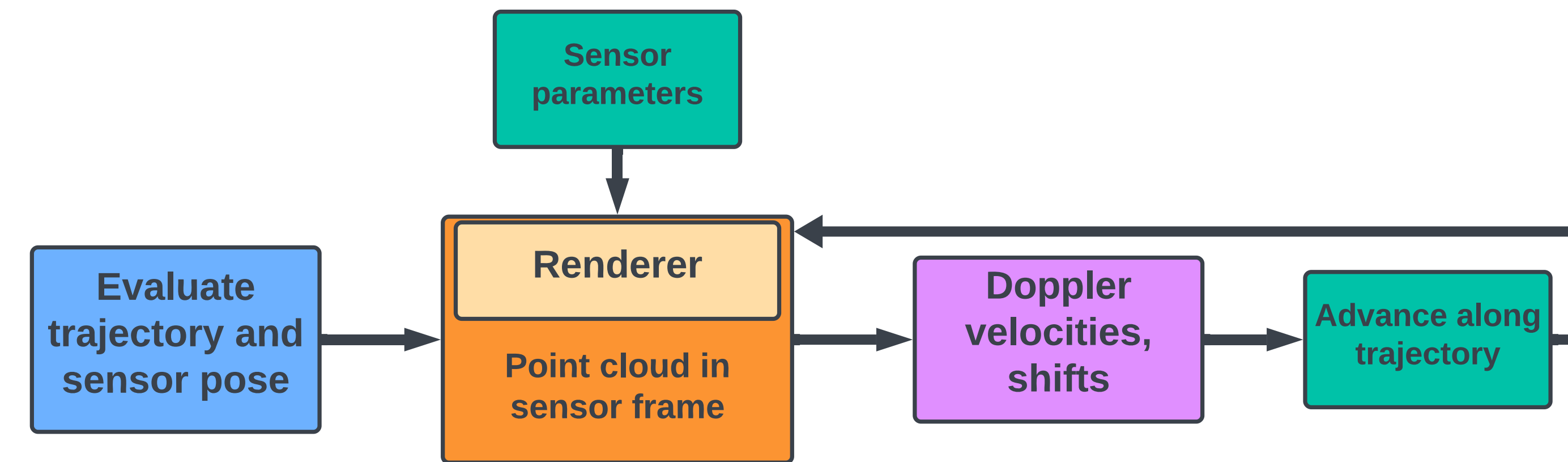


Figure: Camera poses around reconstructed point cloud object in world frame (a). Approximate angular and linear velocities from sensor and reconstruction metadata (b & c). Frame from our spinning satellite experiment (d).

## FMCW Lidar Simulation



### Sensor parameters

Source wavelength, frame rate, sensor orientation, frequency/range rate resolution, spatial resolution, scan rate and noise.

### Doppler Velocity Measurement

Instantaneous relative velocity and frequency shift measurement along the lidar's line of sight.

$$\mathbf{v}_i = \hat{\mathbf{r}}_i \cdot (-\mathbf{v} + \boldsymbol{\omega} \times \mathbf{t}_s)$$

Doppler velocity    Measurement direction    Sensor Velocity    Angular Velocity    Sensor Translation

$$\Delta f = \frac{2v_i}{\lambda}$$

Doppler shift    Doppler velocity    Lidar Wavelength

### Rendering System Setup

Trajectory information from motion capture system to setup object and sensor in the world frame of NaRPA (renderer). NaRPA follows OpenGL convention.

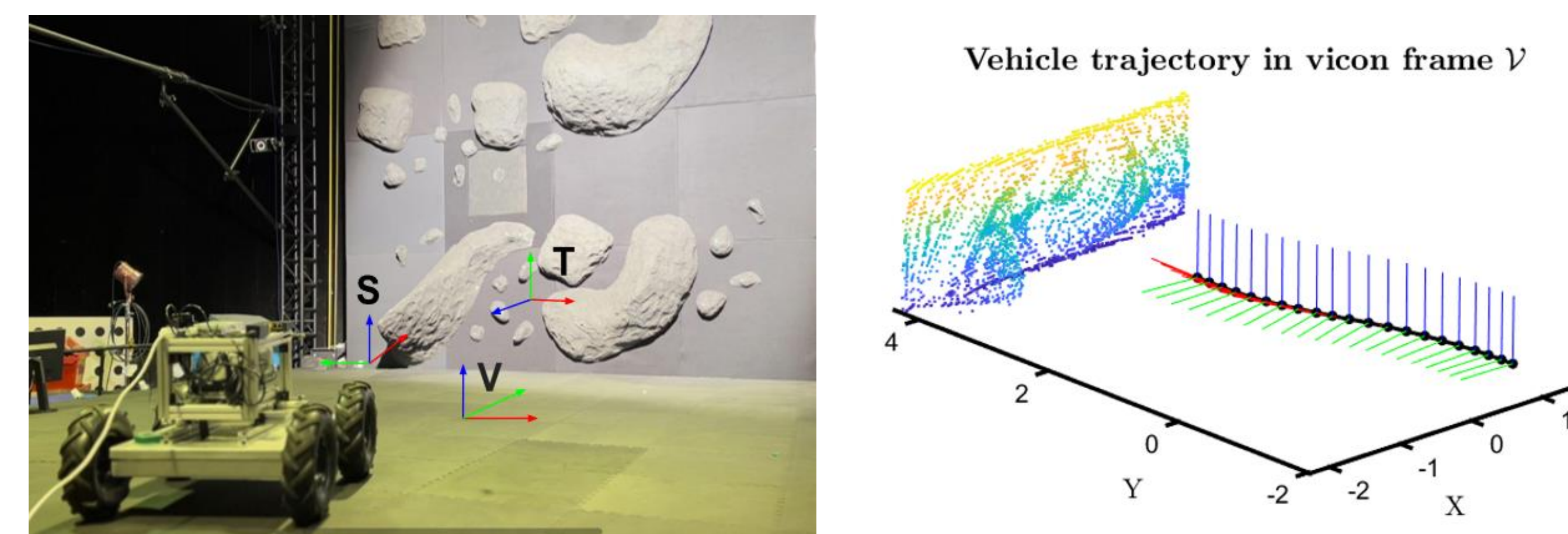
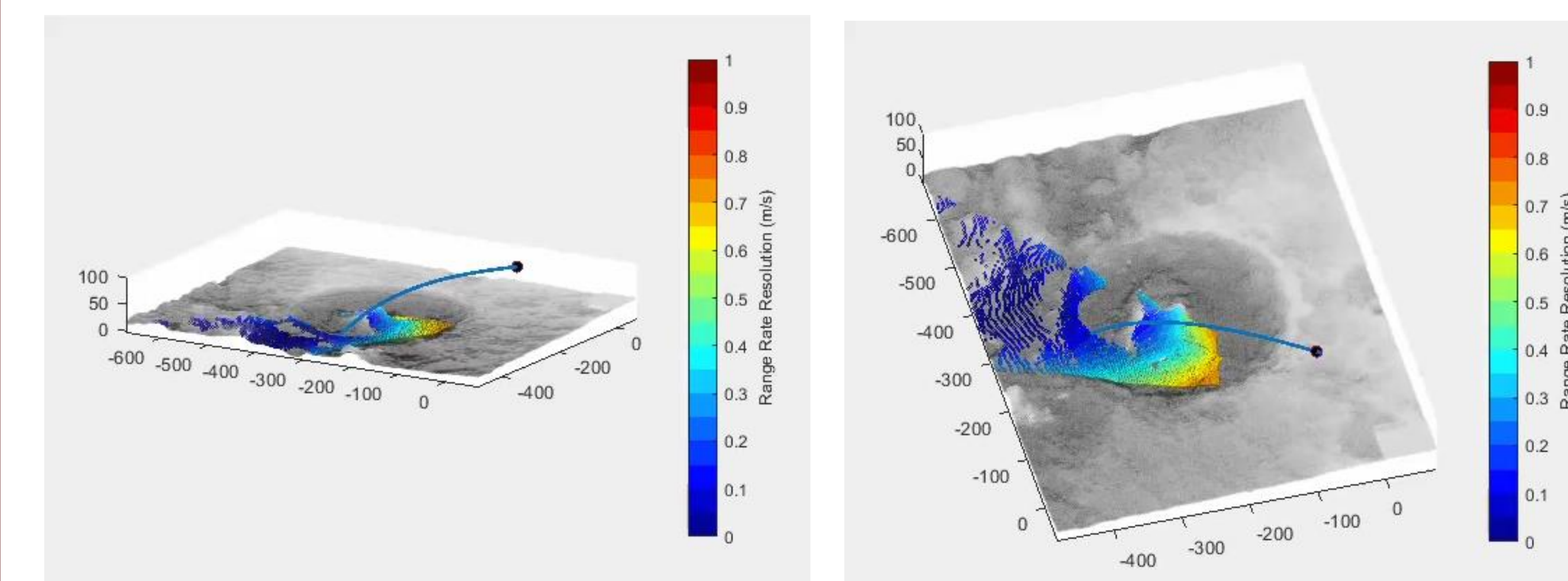


Figure: Asteroid wall data collection campaign at JPL (left). Reconstructed point cloud and ground truth trajectory from vicon (right).

## EDL Applications

Targeted towards entry, descent, and landing (EDL) sensor simulation, NaRPA is used for dataset generation in studies including terrain relative navigation, proximity operations, and differentiable rendering.



## Validation

### Result: Doppler velocities visualization

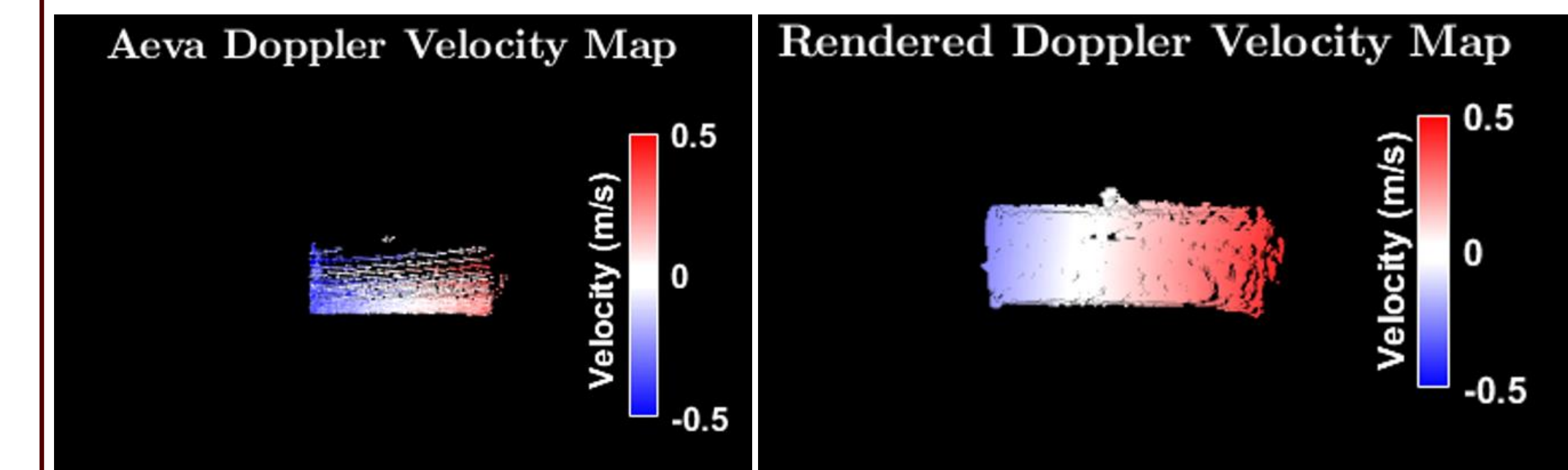


Figure: Point cloud and instant velocities from Aeva lidar (left). Reconstructed point cloud and velocities evaluated at corresponding frame (right).

### Result: Doppler velocity distributions

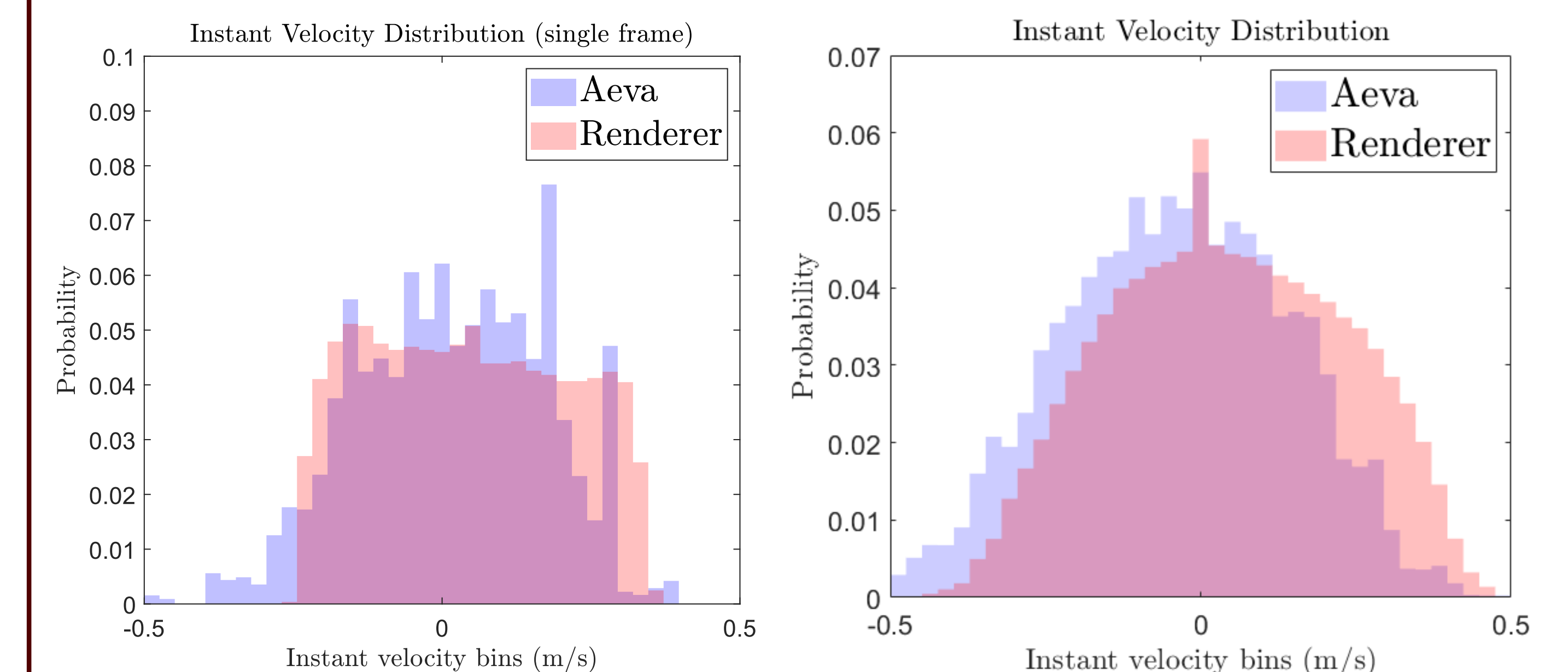


Figure: Normalized histograms of Doppler velocities as a metric to quantify the distribution of instantaneous point velocities. Aeva velocities and corresponding rendered point cloud velocities for a chosen single frame (left), and averaged velocities across 100 frames (right).

### Median Absolute Deviation

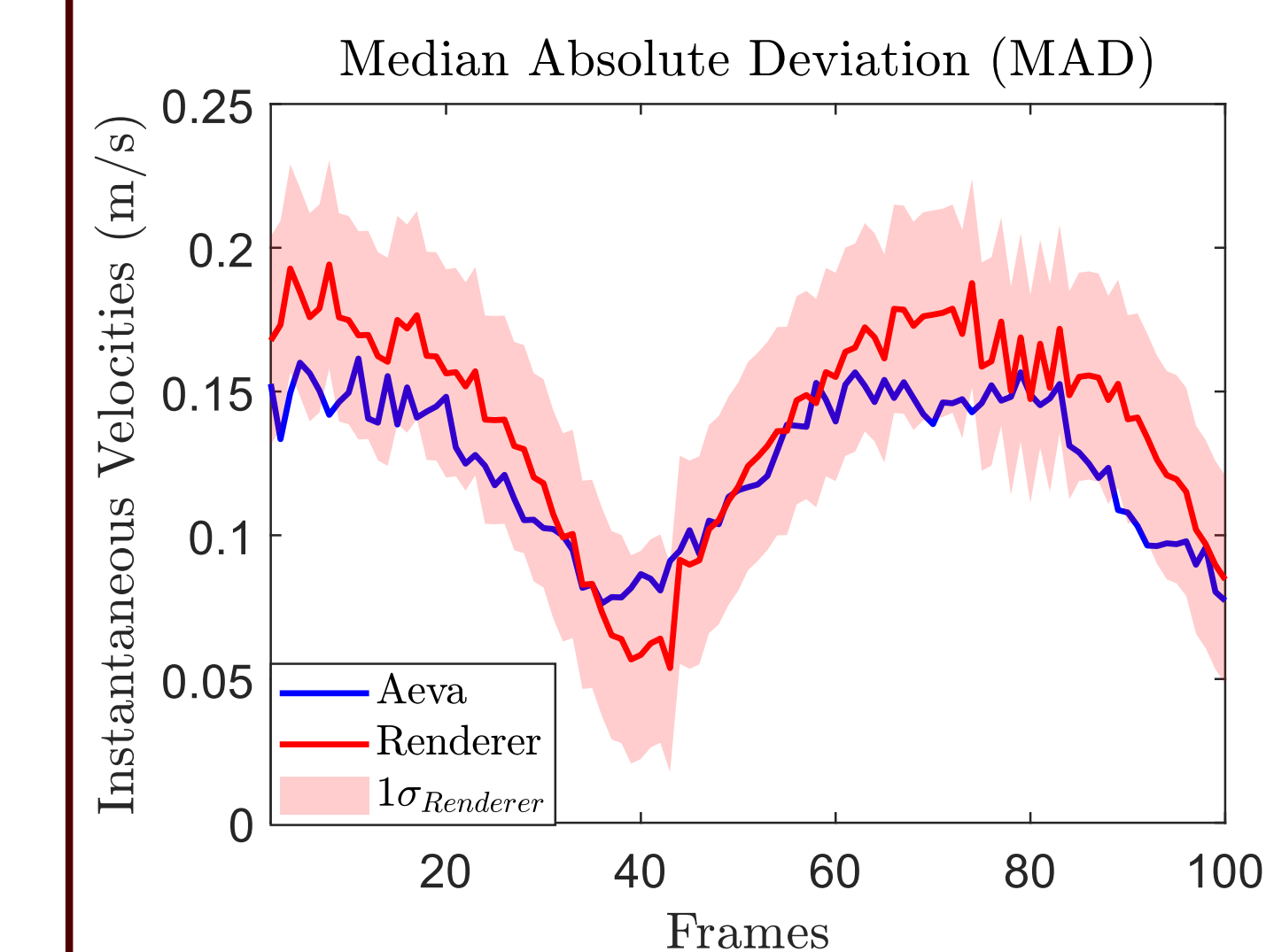


Figure: Median Absolute Deviations (MAD) of point velocities from NaRPA (red) and Aeva (blue). Renderer following the velocity distribution of the sensor within 1-sigma bounds.

### Point Cloud Sample Variance

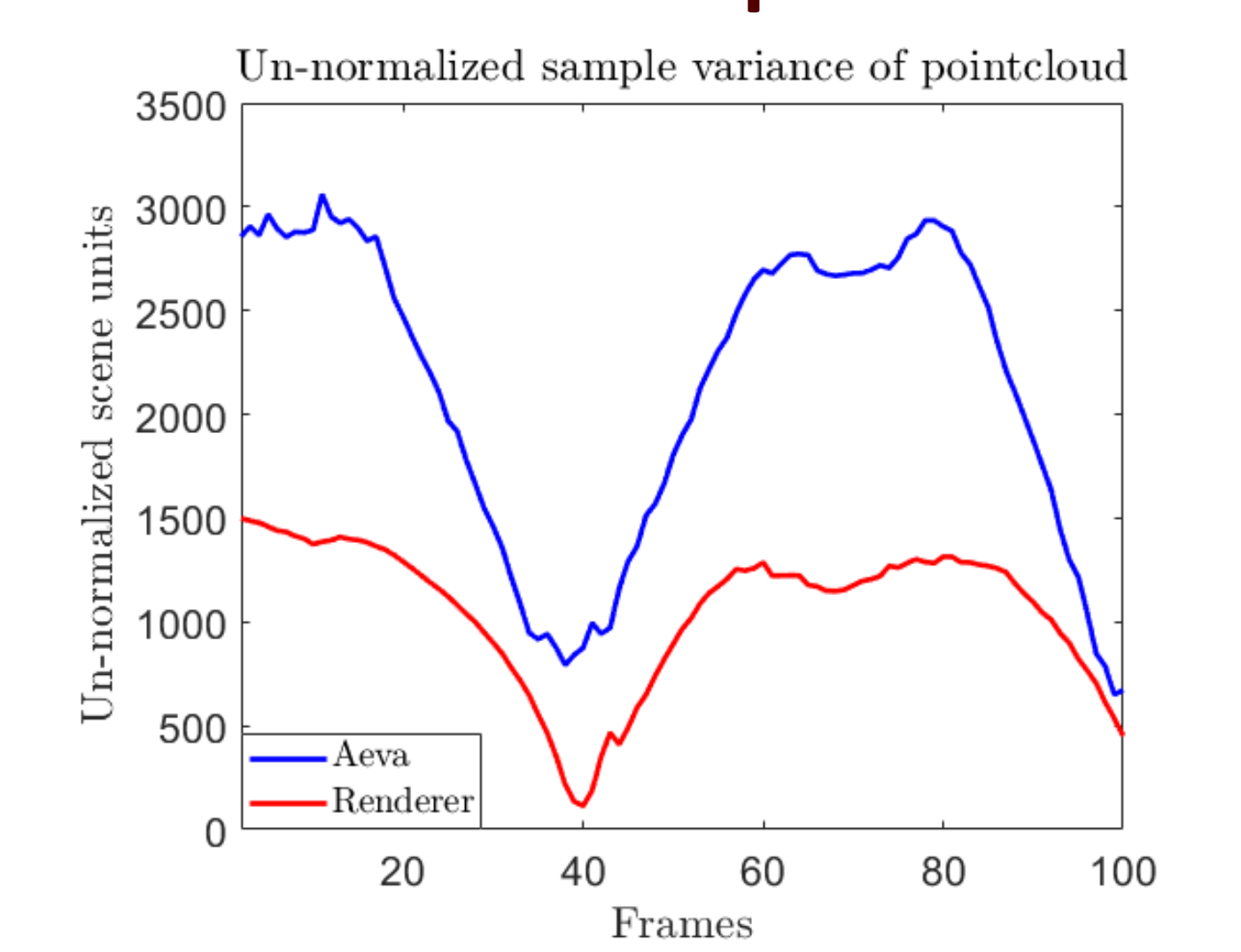


Figure: Un-normalized variances of point clouds of rendered points (red) and Aeva points (blue). Matching shapes indicate similarity in point cloud "spreadness" across frames.

## Acknowledgements

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