

# Virtual Research Presentation Conference

## LiDAR-Inertial Based Navigation and Mapping for Precision Landing

**Principal Investigator:**

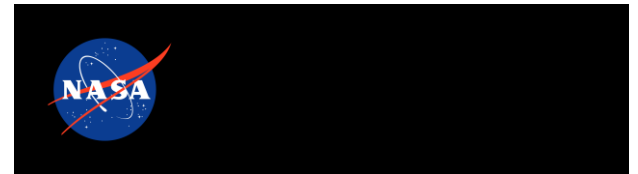
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**Program: Topical R&TD**

Assigned Presentation #: RPC-195



# Tutorial Introduction

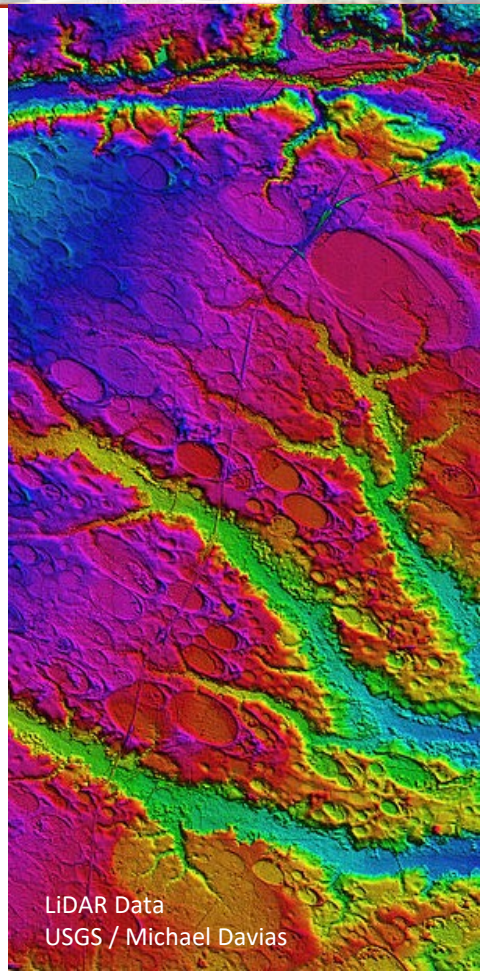


## Abstract

When exploring planetary bodies throughout the solar system, the most scientifically interesting regions – the craters, the canyons, the mountains, the deltas, and the lava tubes – are also the most dangerous, being home to rugged hazardous terrain. The existing solution for landing in hazardous terrain, visual terrain relative navigation (TRN), is not widely applicable throughout the solar system since lander-scale hazard maps are generally unavailable for destinations other than Mars and the Moon. Additionally, to ensure consistent lighting, visual TRN requires that the landing time of day be similar to that when orbital reconnaissance was acquired. These challenges can be mitigated or solved with the LiDAR-inertial navigation and mapping system developed in this R&TD.

A LiDAR instrument is used to measure the distance to a surface by recording the time of flight of a pulsed laser beam. Often, the intensity of the reflected laser beam, which is a function of range, laser power, surface albedo, and surface normal, is also measured.

An inertial measurement unit (IMU) is used to measure the spacecraft's angular velocity and acceleration. Integration of IMU measurements over time can be used to estimate the spacecraft's attitude and position.





# Problem Description

## Context

- Future lander missions will travel to destinations without high-resolution orbital reconnaissance (e.g., Europa, Enceladus)
- Safe landing will require terrain relative navigation and onboard generation of lander-scale topographic maps for hazard detection and avoidance
- LiDARs in development for the Europa Lander mission will be capable of operating continuously below 5 km altitude

## Advancements Over State of the Art

- Unlike cameras, LiDAR is insensitive to lighting conditions and can be used to map topography
- Smoothing-based technique estimates entire spacecraft trajectory, not just latest state
- Navigation algorithm does not require dedicated phases, and can operate throughout descent, building a topographic map of increasing fidelity

## Relevance to NASA and JPL

- Enables safe and precise landing throughout the solar system, in any lighting conditions, when only low-resolution orbital reconnaissance is available

Europa Clipper topographic map pixel size (32 m/px)

- Approximate Europa Lander footprint (2 m diameter)
- Estimated map pixel size in this R&TD (0.5m/px)

## Methodology



### LiDAR-Inertial Dataset Generation

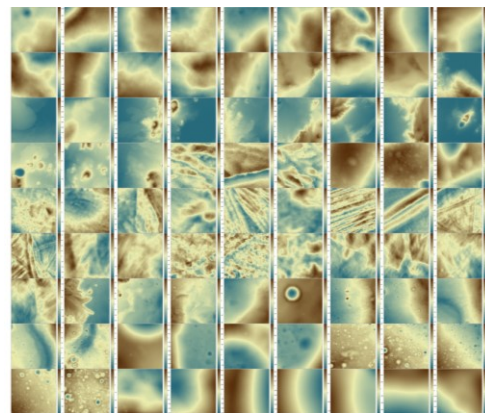
- Obtained data from eight planetary bodies (Ceres, Earth, Enceladus, Eros, Europa, Mars, the Moon, and Vesta)
- Upsampled topographic data to create 81 digital elevation models, each 4×4 km, at 0.5 m/px resolution
- Augmented the Mars 2020 Lander Vision System Simulator (LVSS) for LiDAR simulation during descent

### Algorithm Design

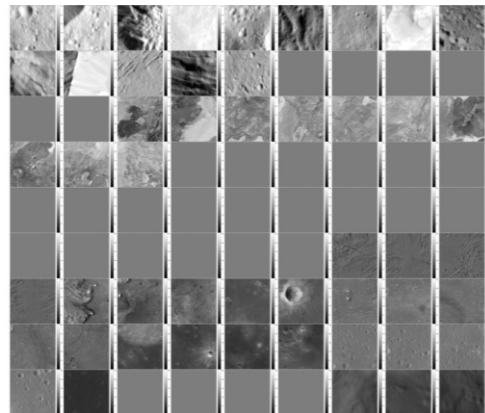
- Factor graph smoothing-based approach to estimate entire spacecraft trajectory (i.e., pose, velocity, and accelerometer and gyroscope biases) at the LiDAR scan frequency
- Includes IMU integration, LiDAR odometry, and topographic map relative localization (MRL), and refinement of a variable resolution quadtree map

### Testing

- Tested for descent over all 81 terrains, using two notional simulated trajectories from the Europa Lander mission
- Tested with both flash and scanning LiDAR, with different prior map fidelities



Topographic maps.



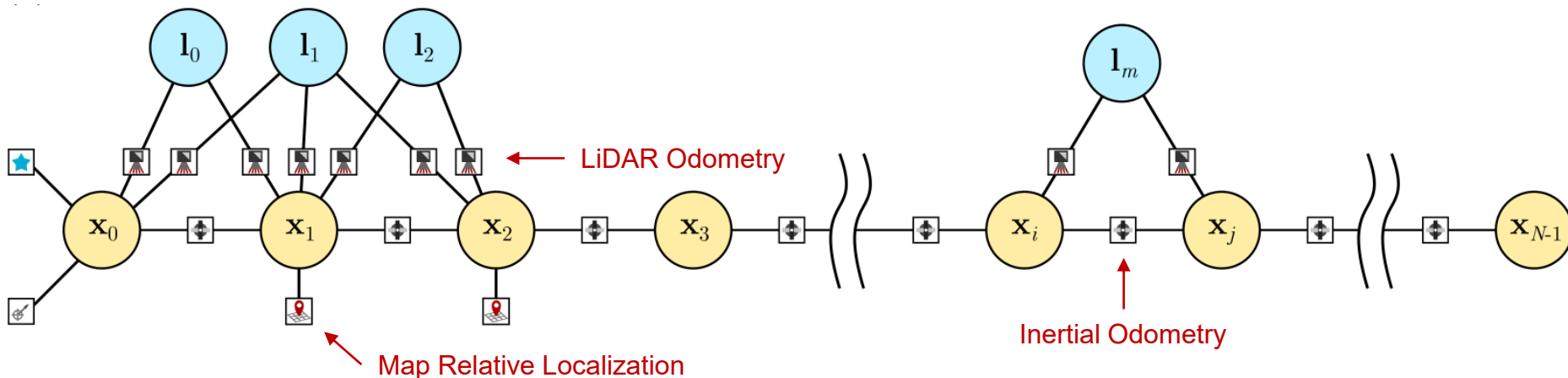
Albedo maps.

# Methodology



## Factor Graph

- Represents the conditional independence of the problem, with each factor representing a measurement or prior expectation
- Solved incrementally using an augmented version of open source Georgia Tech Smoothing and Mapping (GTSAM) library



Variables:  $x_i$  State (Pose, Velocity, Accelerometer Bias, Gyroscope Bias)  $l_m$  Landmark Position

Factors: Star Tracker Attitude Deep Space State Preintegrated IMU Map Position Bearing Range [IMU]

# Results

\* Videos at 4X speed



## LiDAR Odometry

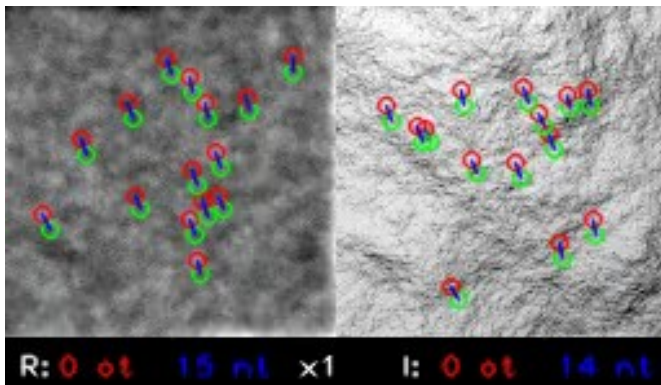
Example case: Europa e-86-1 terrain; trajectory has velocities up to 100 m/s

Flash LiDAR (2 Hz)

Scanning LiDAR (0.5 Hz)

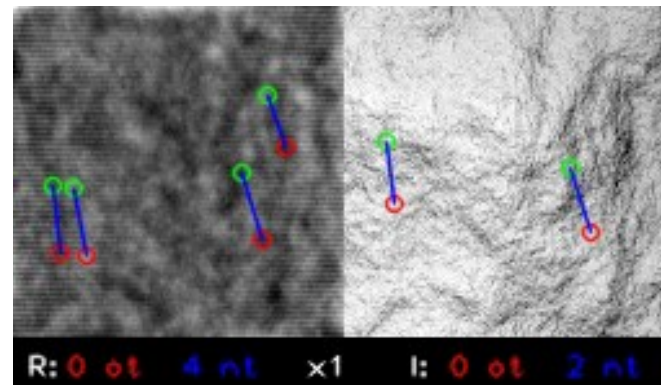
High-Passed Range

Intensity



High-Passed Range

Intensity



- New feature trails (nt, two features)
- Old feature trails (ot, more than two features)

- First feature detection
- Intermediate feature detection
- Last feature detection

# Results

\* Videos at 4X speed



## Map Relative Localization

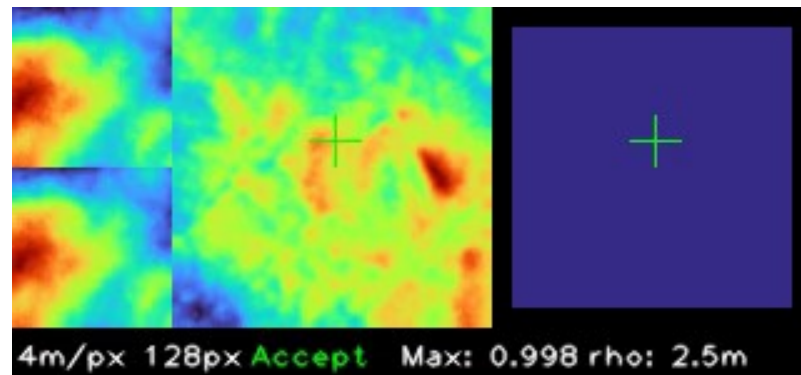
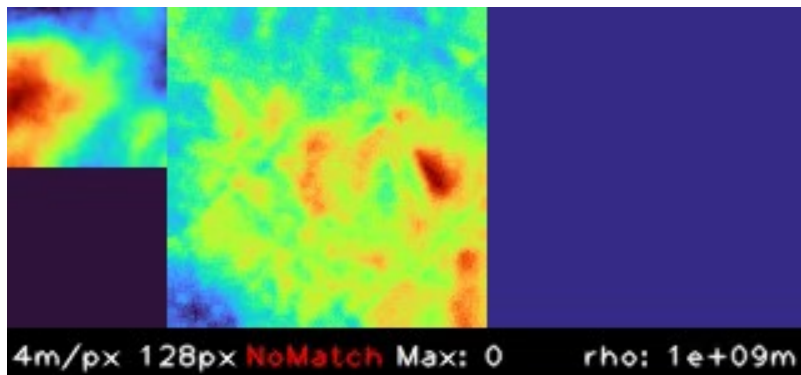
Example case: Europa e-86-1 terrain; trajectory starts at 5 km altitude

Scanning LiDAR, 32 m/px prior map with 4 m  $1\sigma$  elevation noise

Scanning LiDAR, 4 m/px prior map with 0.5 m  $1\sigma$  elevation noise

Scan Map      Prior Map      Thresholded Correlation Surface

Scan Map      Prior Map      Thresholded Correlation Surface



+ Accepted match

+ Rejected match

\* Note: MRL is performed by matching a scan map to a topographic map

## Results

### Estimation Errors

- - - Instantaneous estimate
- - - Smoothed estimate
- - -  $3\sigma$  uncertainty

— Inertial odometry with perfect velocity prior (io)

Mean Mag.: Instantaneous (Final)



LiDAR-inertial odometry with MRL, zero velocity prior, and map center position prior

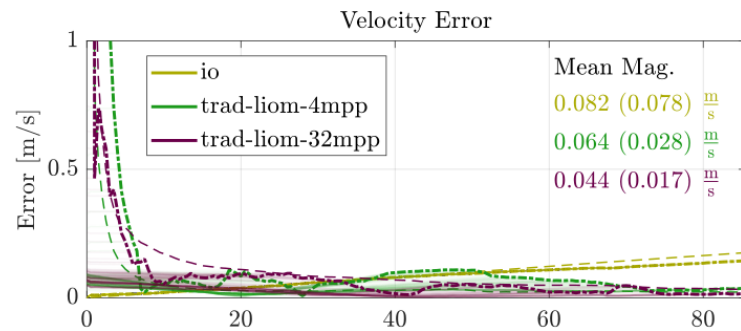
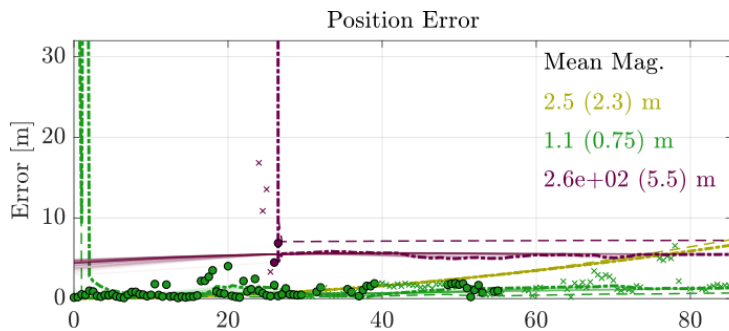
— 4 m/px prior orbital map (trad-liom-4mpp)

● Accepted MRL position estimate

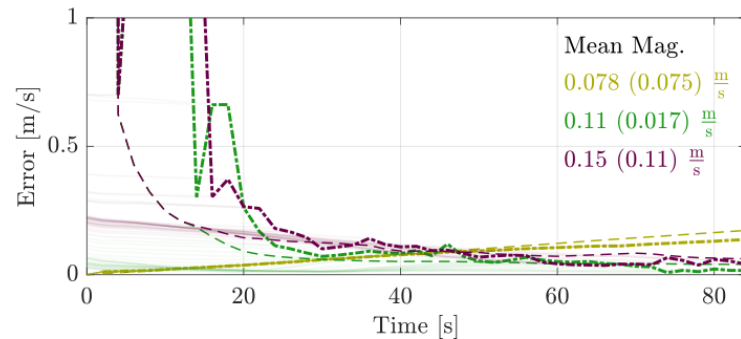
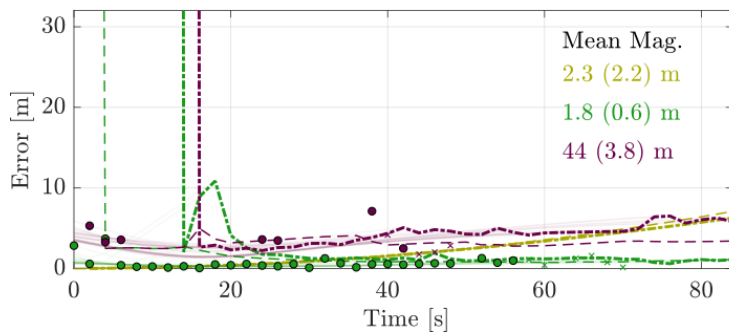
— 32 m/px prior orbital map (trad-liom-32mpp)

× Rejected MRL position estimate

Flash LiDAR



Scanning LiDAR





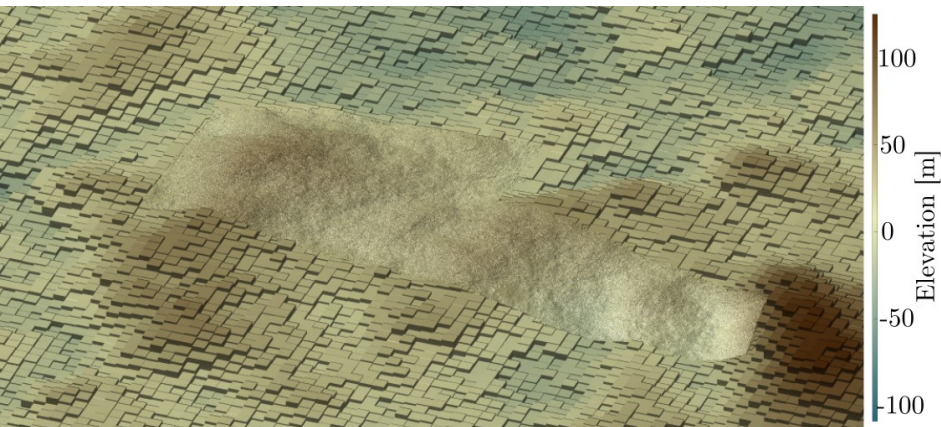
# Results



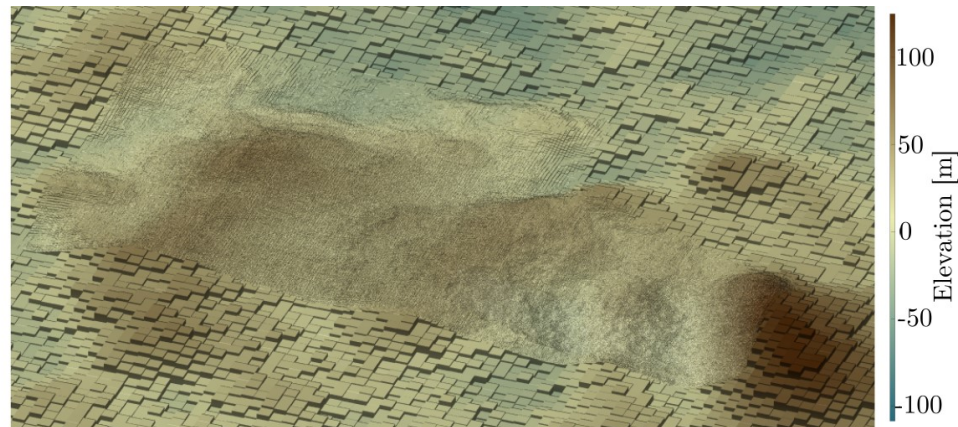
## Map Refinement

Example case: Europa e-86-1 terrain with 32 m/px prior map, and 0.5 m/px refined map

Flash LiDAR (6° field of view)



Scanning LiDAR (11.4° field of view)



## Results



### Accomplishments Versus Goals

- Created a smoothing-based LiDAR-inertial navigation and mapping algorithm
- Tested it on all 81 terrains for two trajectories, with the majority of runs converging on results that met our quantitative objectives
- Performance on par with visual terrain relative navigation in areas where the terrain was sufficiently rough for MRL

### Significance

- First smoothing-based landing system at JPL; first landing system to include onboard mapping at all stages of descent
- Demonstrates feasibility of LiDAR-inertial based navigation and mapping for mitigating shortcomings of camera-based systems

### Next Steps

- Decouple orientation estimation from the rest of the problem; it is difficult to improve upon star tracker and EDL-class gyroscope
- Adapt software for real-time operation (in JPL FPrime framework)
- Test algorithm with real-world data (either acquired at the JPL Formation Control Testbed, or using existing JPL aerial LiDAR datasets)

# Publications and References

- [1] T. P. Setterfield, R. A. Hewitt, P. Chen, A. Teran Espinoza, N. Trawny, A. Katake, LiDAR-Inertial Based Navigation and Mapping for Precision Landing, Abstract Submitted to IEEE Aerospace Conference, 2021