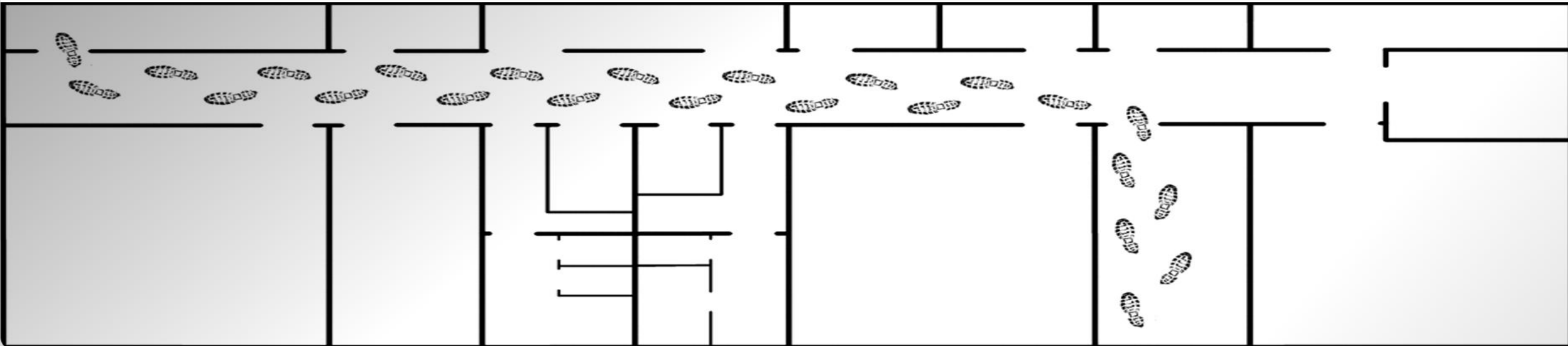


# Pedestrian Navigation in Indoor Environments Based on Foot-Mounted Sensors

Nikolai Kronenwett and Gert F. Trommer

INSTITUTE OF SYSTEMS OPTIMIZATION (ITE)



# Main Research ITE

## Systems

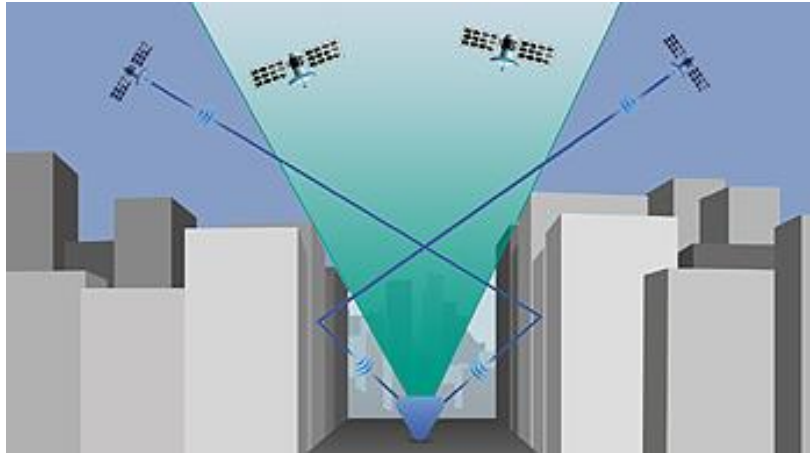
### ■ Micro Aerial Vehicle

- Fusion of **IMU, Cameras, Laserscanner** and **GNSS**
- Focus on GNSS-denied environments
- Navigation and exploration indoors
- Collision avoidance
- Map generation
- Semantic segmentation

### ■ Pedestrian Navigation



# Introduction



## Challenges:

- Independence of pre-installed infrastructure
- Outdoor-Indoor transitions
- Accurate localization
- Restrictions in weight, cost and size

## Wide field of applications:

- Task force members
- Security & rescue personnel
- Visually impaired people
- Private users



# Outline



Introduction

Hardware Configuration

Model Based Navigation and Experimental Results

Conclusion & Outlook

# Hardware Configuration

Foot Module



User Interface



Datalink(WiFi)

Ground station

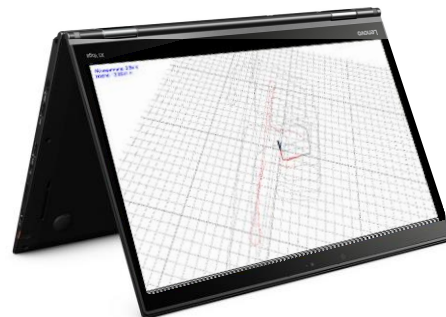
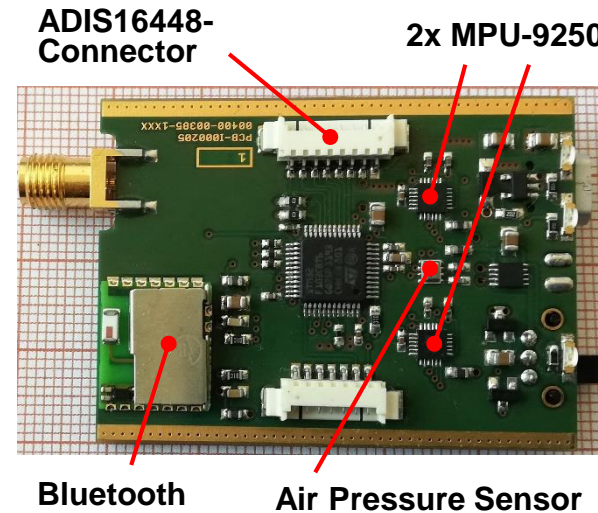




# Hardware Configuration

## Foot Module

- MEMS MPU-9250
- Air Pressure Sensor BMP 280
- NEO M8T GNSS Receiver
- MEMS Adis16448 Connector
- Bluetooth antenna
- Microprocessor STM32



## Processing Unit / User Interface

- Lenovo X1 Yoga
- Intel i7-7500U (2.7GHz)
- 16GB DDR3-RAM

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Introduction

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**Model Based Navigation and Experimental Results**

Conclusion & Outlook

# Model Based Navigation

## Zero Velocity Update (ZUPT)

### Challenges of MEMS sensors for INS:

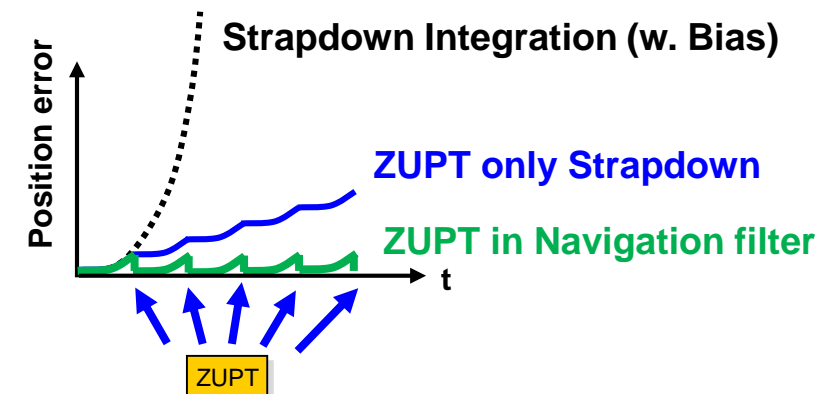
- Accumulation of biased ACC+GYRO values → increasing drift

### Solutions:

- Additional aiding sensors (Laser, camera,...) → increasing cost, weight and size
- Physical or model-based knowledge

### Zero Velocity Update (ZUPT):

- $\sigma^2$ - based technique → imprecise
- New: model-based technique → high-precision

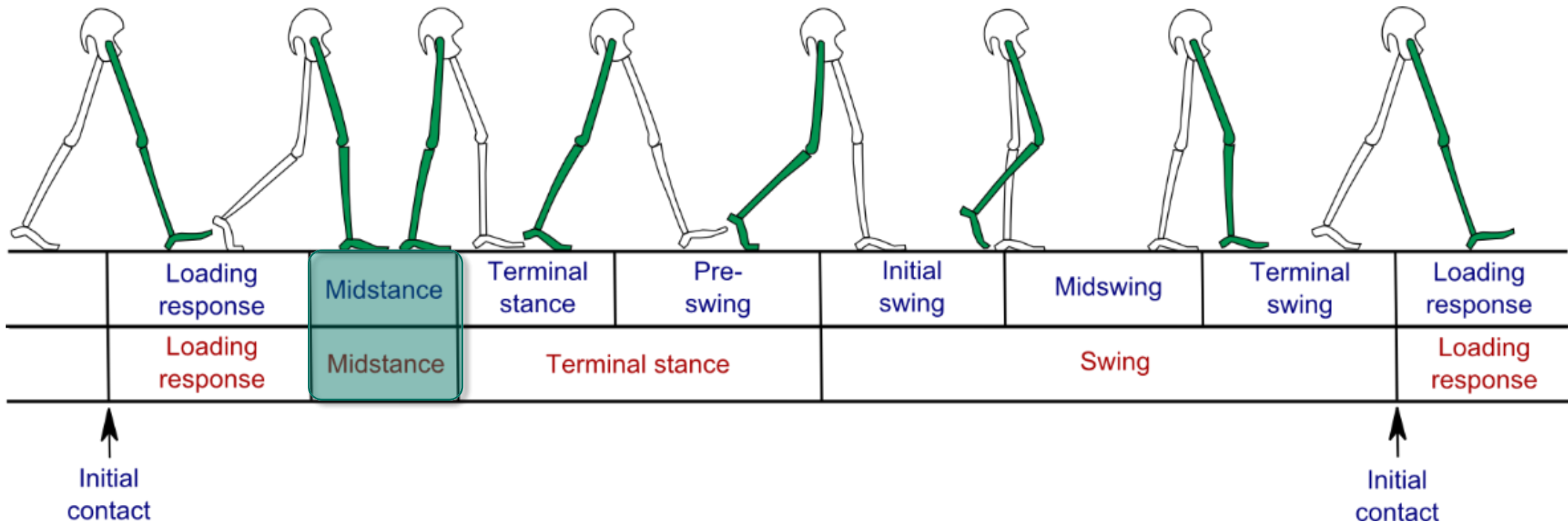




# Model Based Navigation

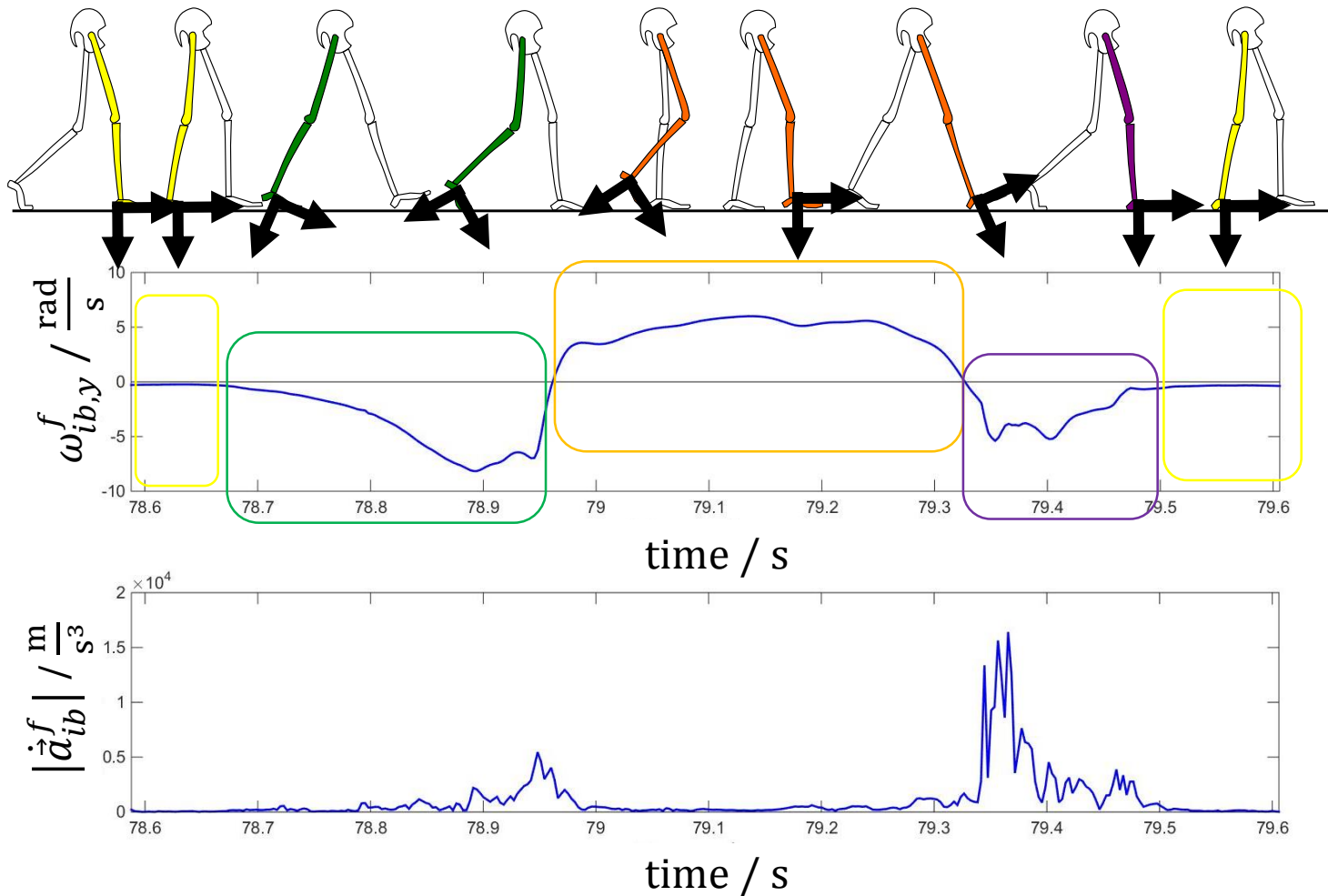
## Finite State Machine (FSM) - Idea

Goal: Robust and accurate detection of the Midstance phase



# Model Based Navigation

## Finite State Machine (FSM) - Step Detection

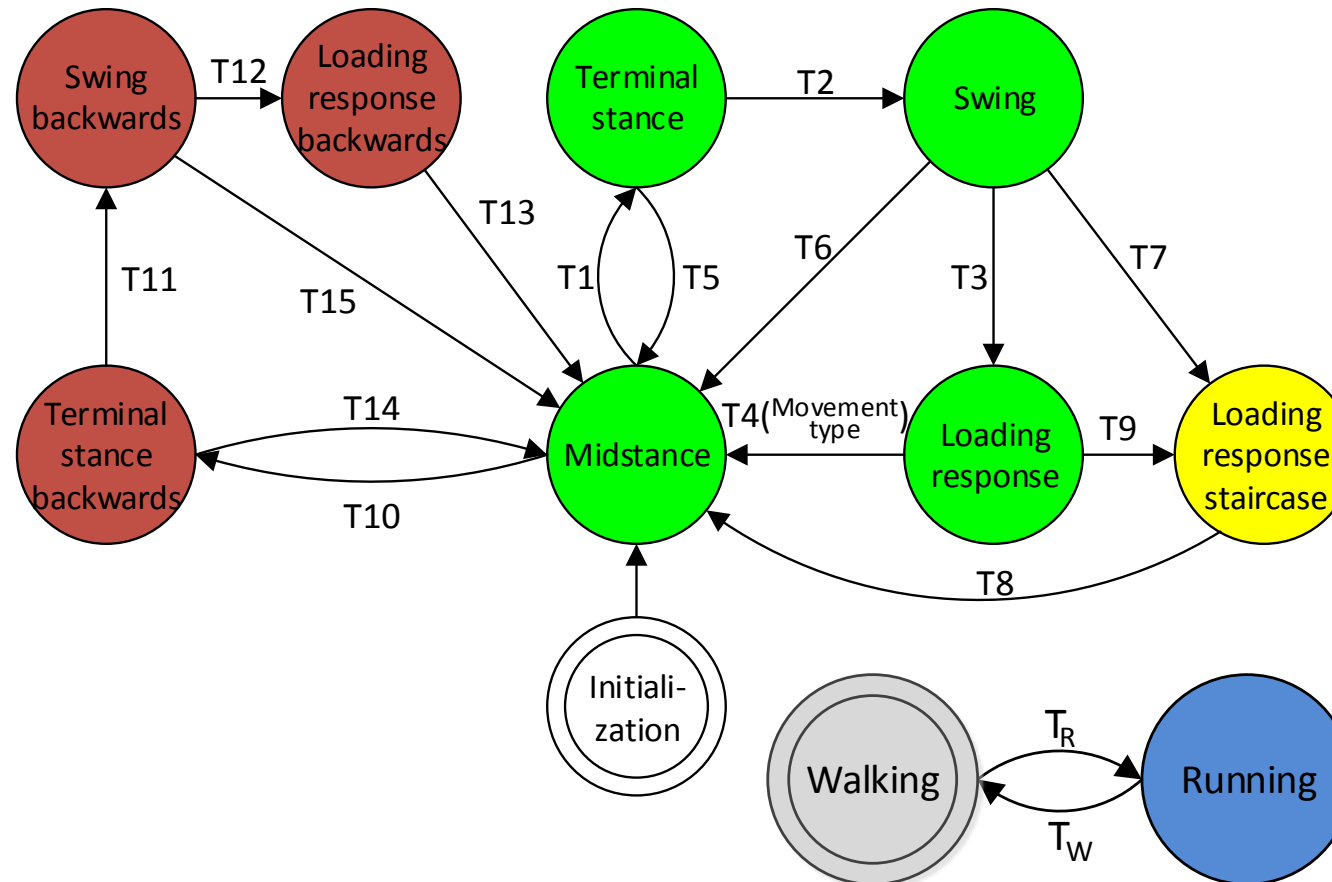


# Model Based Navigation

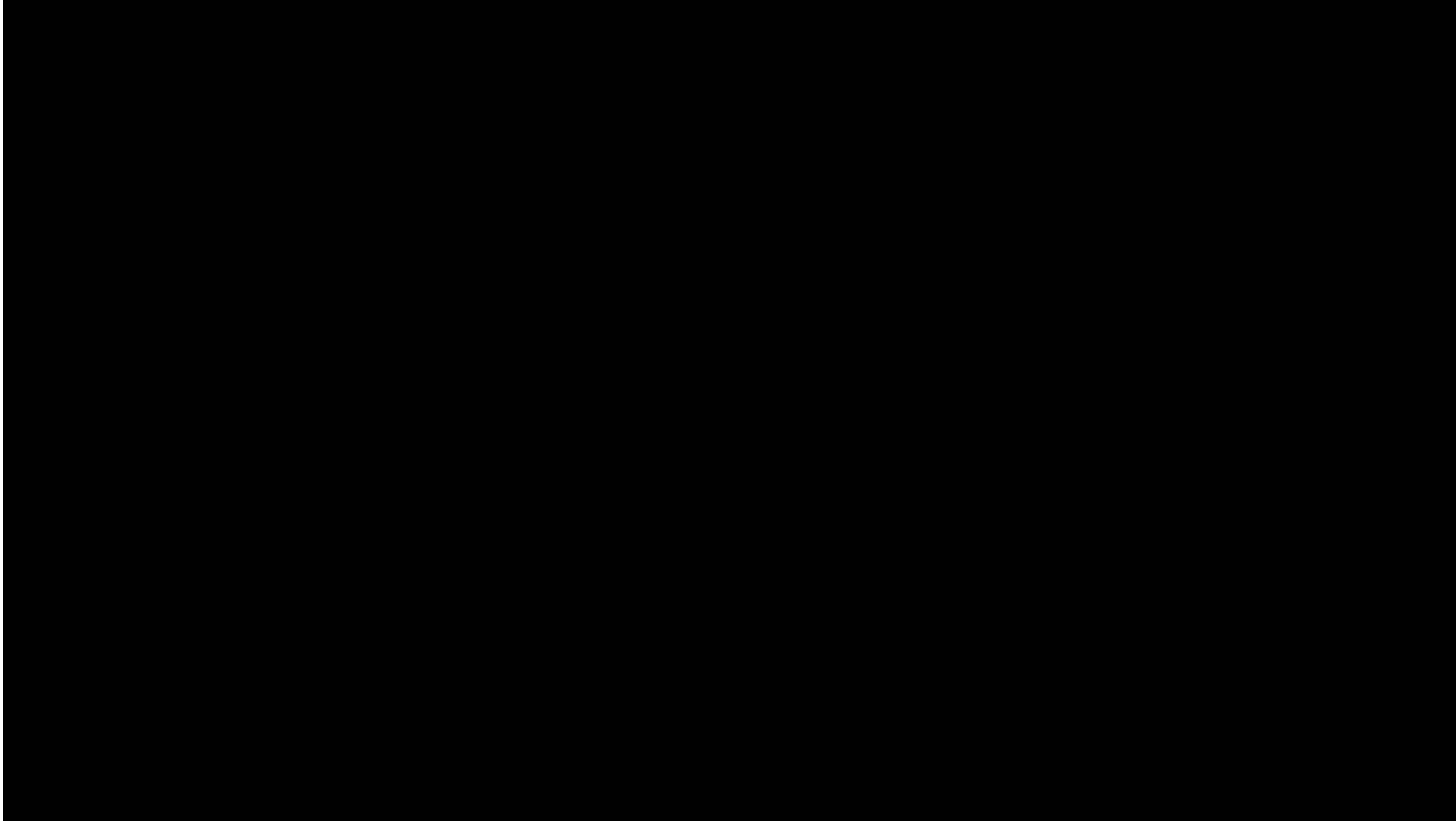
## Finite State Machine (FSM) - Step Detection

### Decision Signals:

- Angular rate  $\omega_{ib,y}^f$
- Derivation  $\dot{\omega}_{ib,y}^f$
- Magnitude  $|\vec{\omega}_{ib}^f|$
- Magnitude  $|\vec{a}_{ib}^b|$
- Variance  $\sigma_{\omega}^2, \sigma_a^2$
- Magnitude of  $|\dot{\vec{a}}_{ib}^f|$

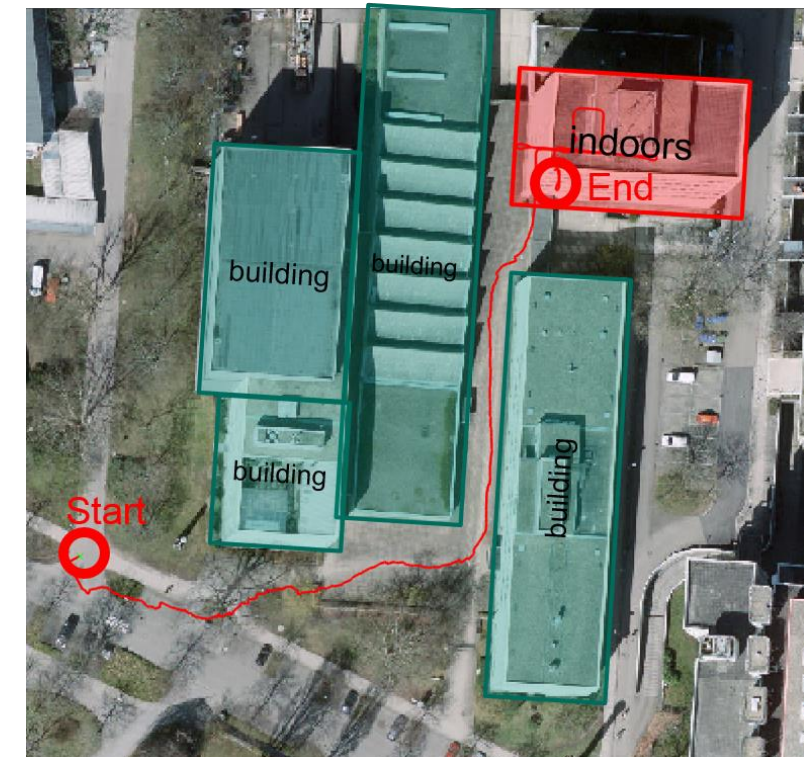
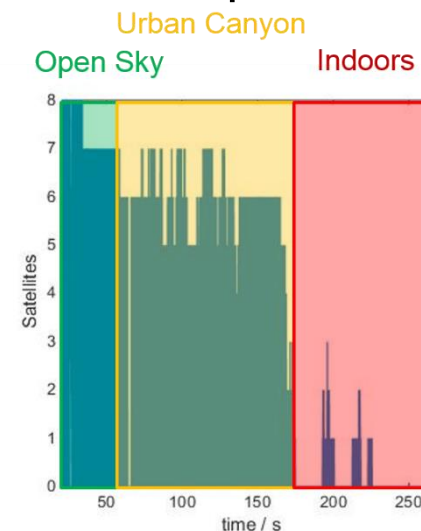


# Experimental Results



# Model Based Navigation

- Absolute position and attitude estimation with GNSS signals
- Tightly Coupled GNSS/INS Integration
- Indoor/Outdoor transitions possible
- Time delay correction between GNSS and IMU data
- GPS support (GLONASS in future)
- Detection and exclusion of GNSS satellites with multipath errors



# Model Based Navigation

## Check Elevation

- $\phi > \delta_\phi$
- Satellites with low elevation angles have a high probability of multipath errors especially in urban environments

## Check SNR

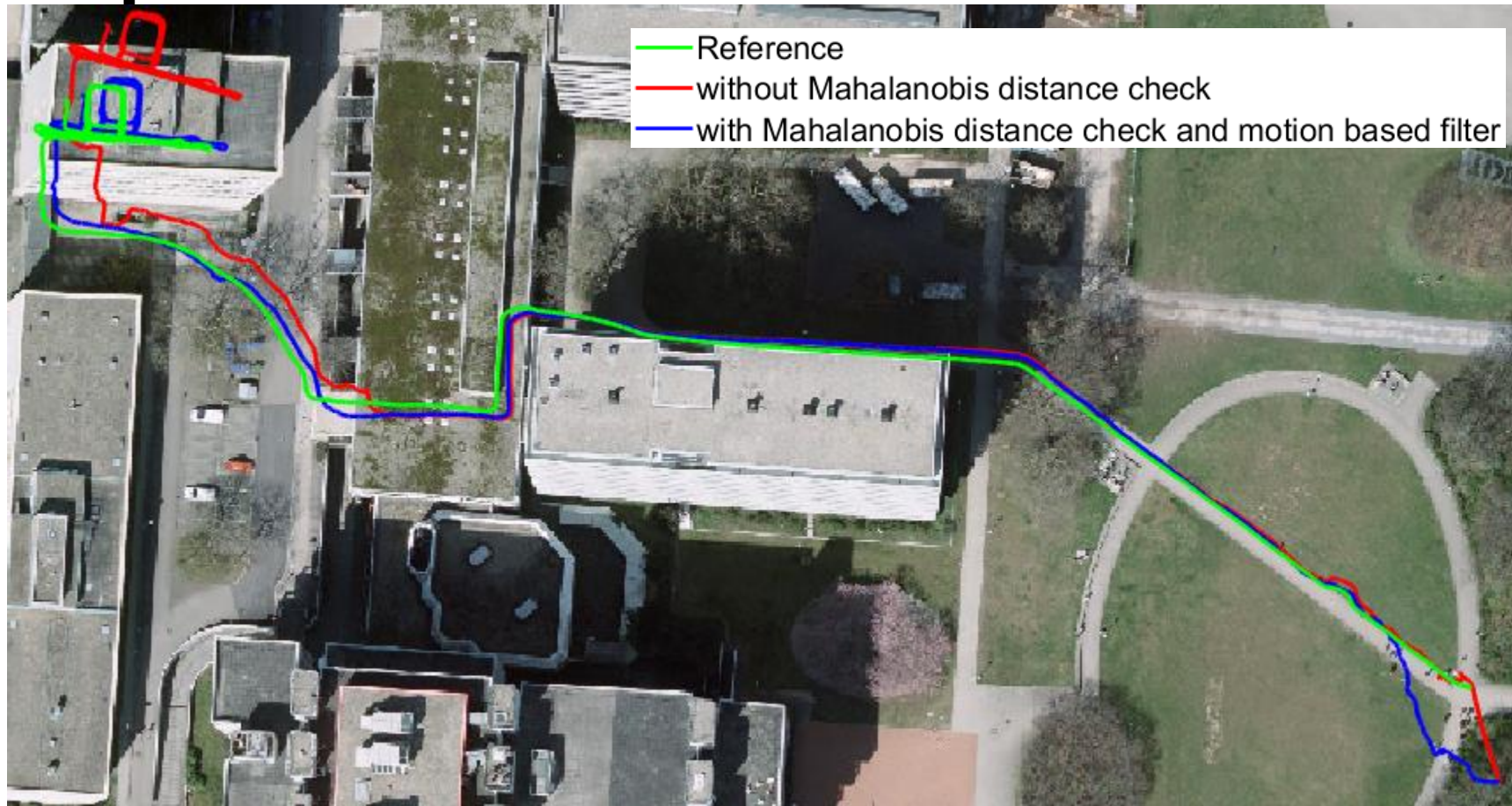
- $SNR > \delta_{SNR}$
- Reduction of the signal power by reflection, deflection or scattering

## Mahalanobis Distance

- $m < \delta_{mahal}$        $m = \sqrt{\frac{r^2}{\sigma_S^2}}$        $r = H\hat{x} - \tilde{y}$        $\sigma_S^2 = HPH^T + \sigma_R^2$
- Adaptive outlier detection depending on P
- Check if there is a big gap between predicted and received measurement respect to their covariances



# Experimental Results



- ADIS 16448 IMU
- GPS only with 10Hz

# Model Based Navigation

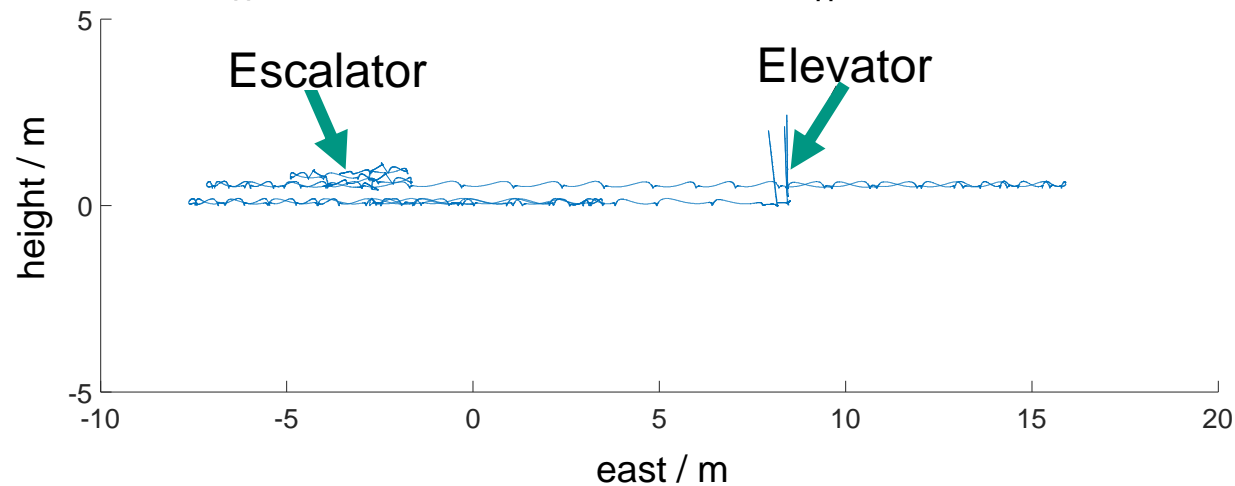


[1]



[2]

■ ZUPT not always indoors

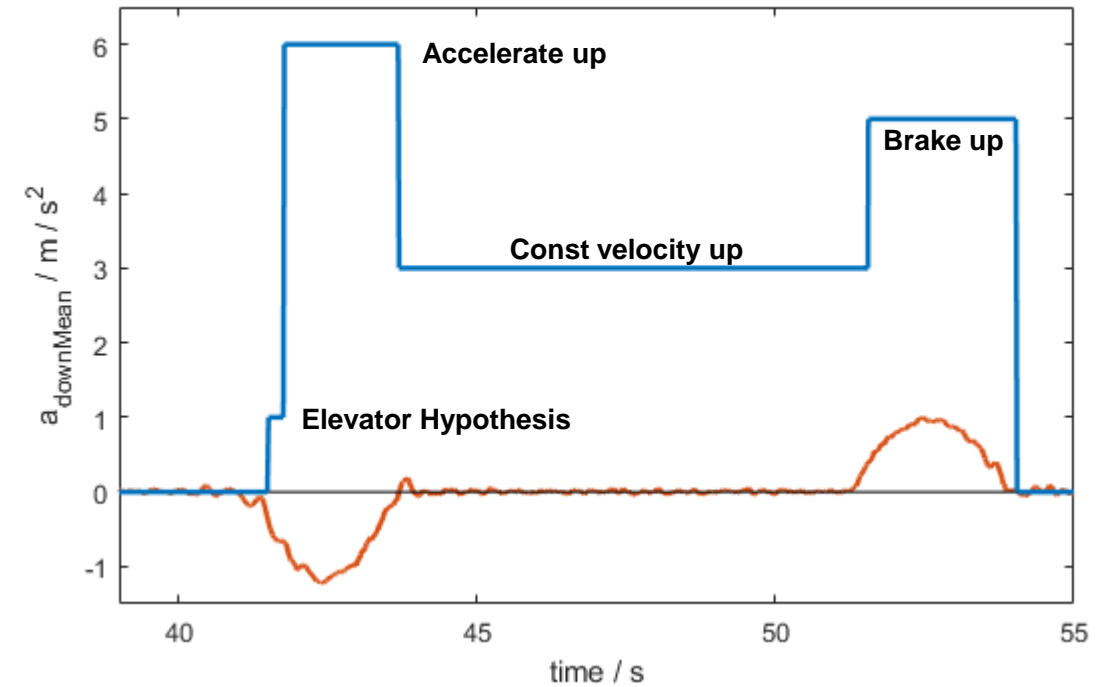
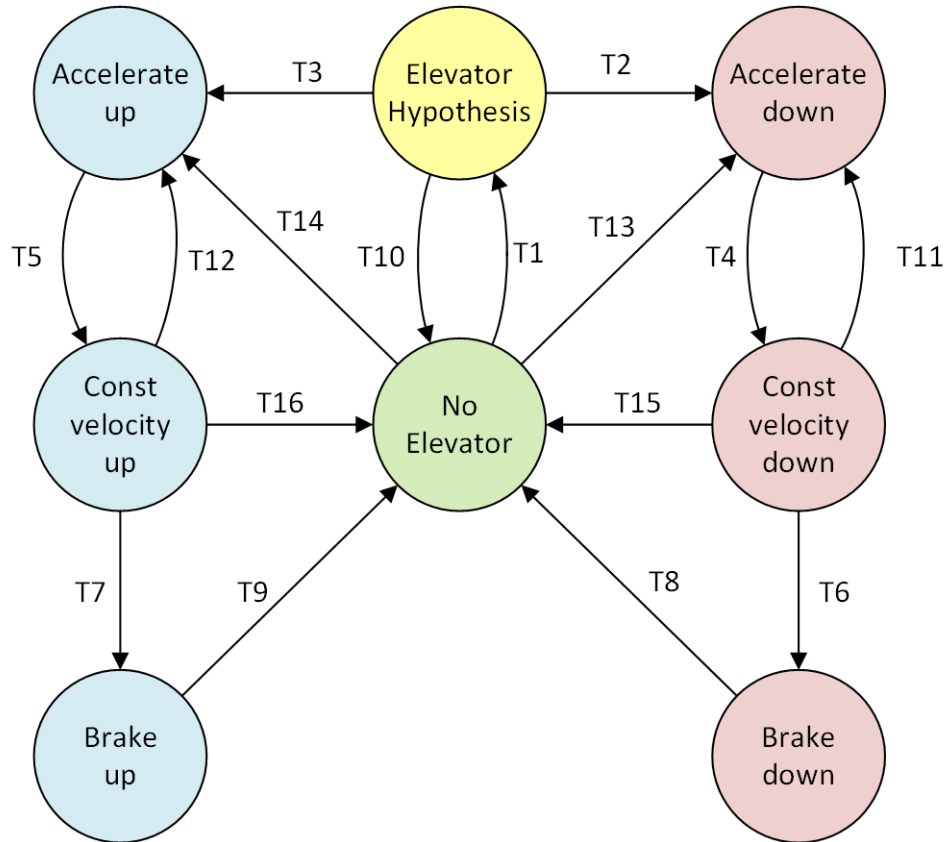


→ Robust and exact detection of moving platforms

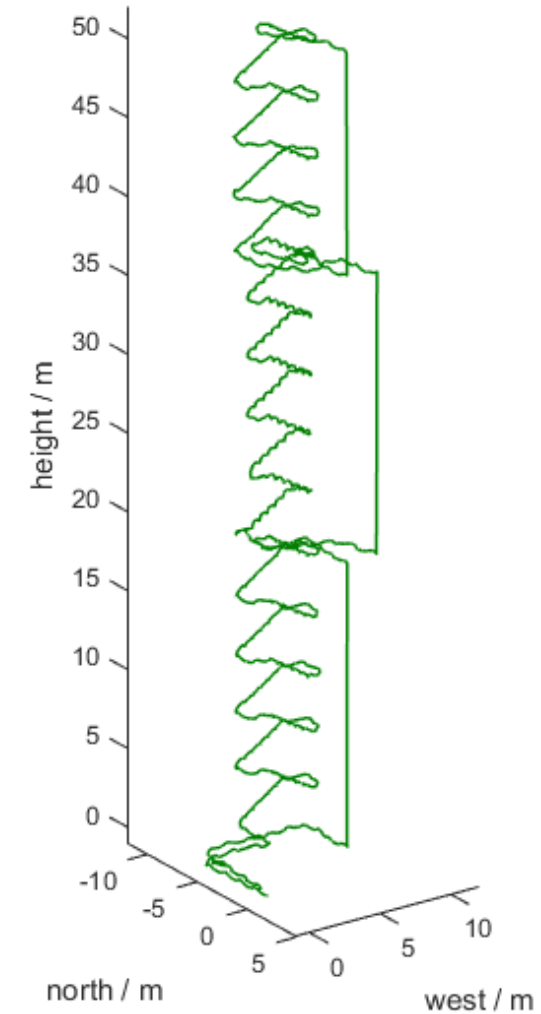
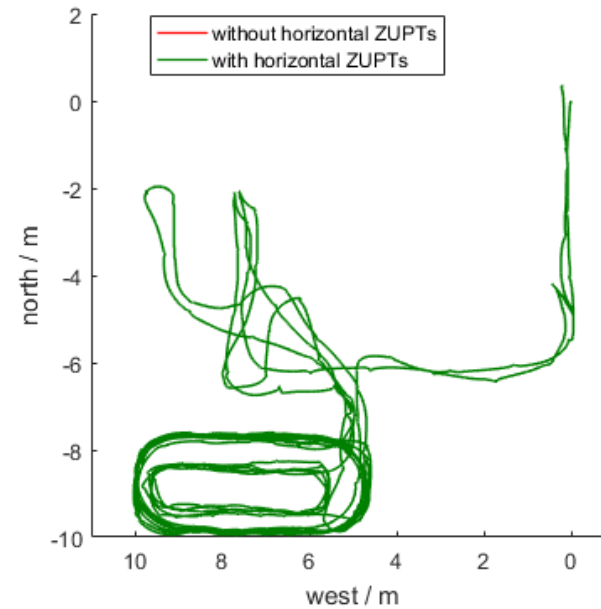
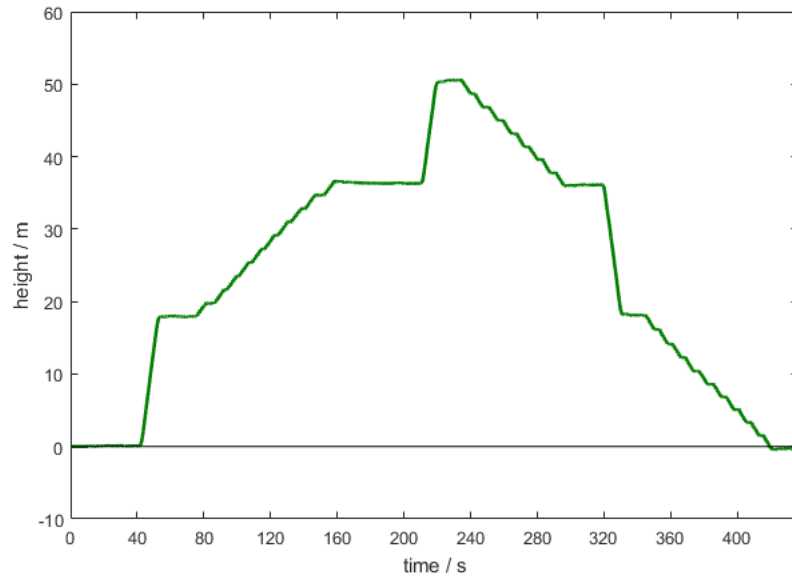
Source of [1]: <https://ozoneelevators.co.in/images/backgrounds/bg-main-2.jpg>

Source of [2]: [https://upload.wikimedia.org/wikipedia/commons/thumb/4/42/Copenhagen\\_en\\_Metro\\_escalators.jpg/1920px-Copenhagen\\_Metro\\_escalators.jpg](https://upload.wikimedia.org/wikipedia/commons/thumb/4/42/Copenhagen_en_Metro_escalators.jpg/1920px-Copenhagen_Metro_escalators.jpg)

# Model Based Navigation



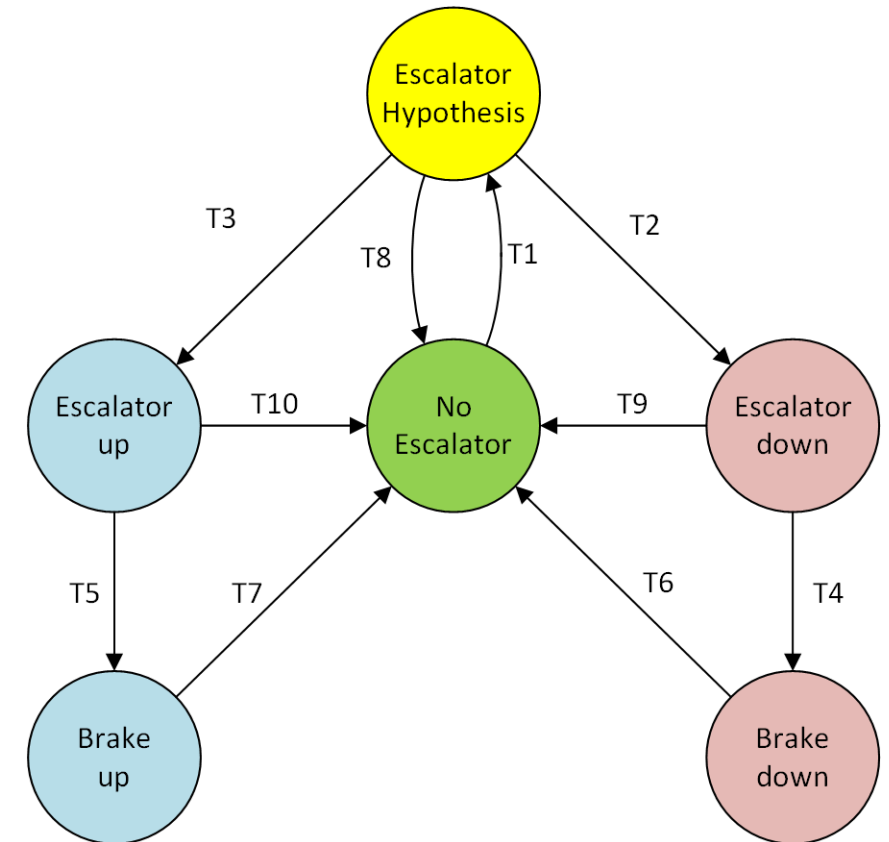
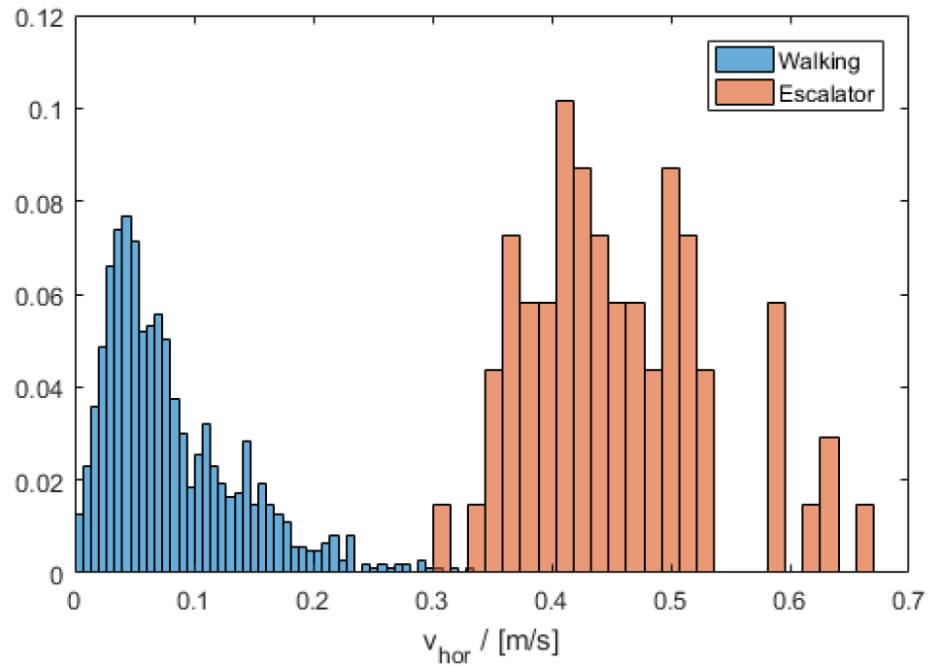
# Experimental Results



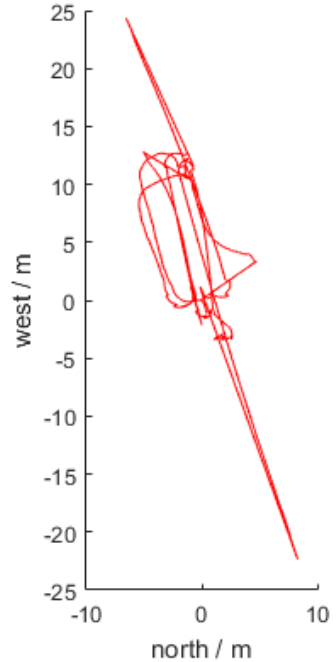
|        | vert. distance | hor. distance | $\Delta h$ | $\Delta 2D$ | $\Delta 3D$ |
|--------|----------------|---------------|------------|-------------|-------------|
| Test 1 | 105.23m        | 240.00m       | 0.33m      | 0.40m       | 0.52m       |
| Test 2 | 63.52m         | 140.07m       | 0.89m      | 0.57m       | 1.05m       |
| Test 3 | 124.03m        | 153.79m       | 0.98m      | 0.62m       | 1.16m       |

# Model Based Navigation

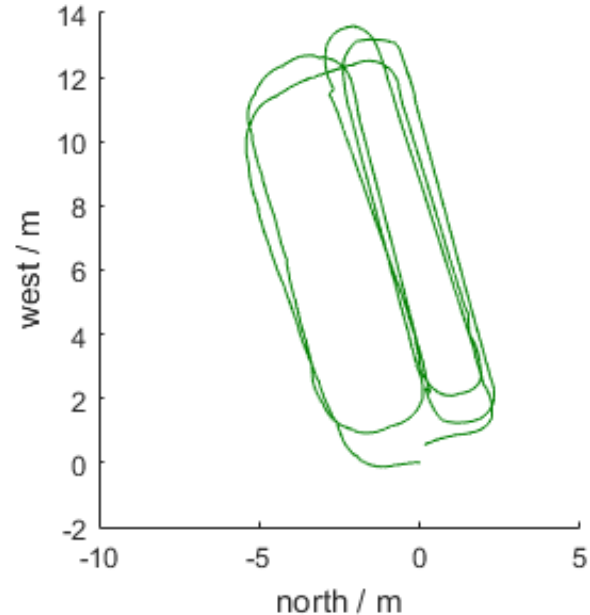
$$v_{hor} = \sqrt{v_{north}^2 + v_{east}^2}$$



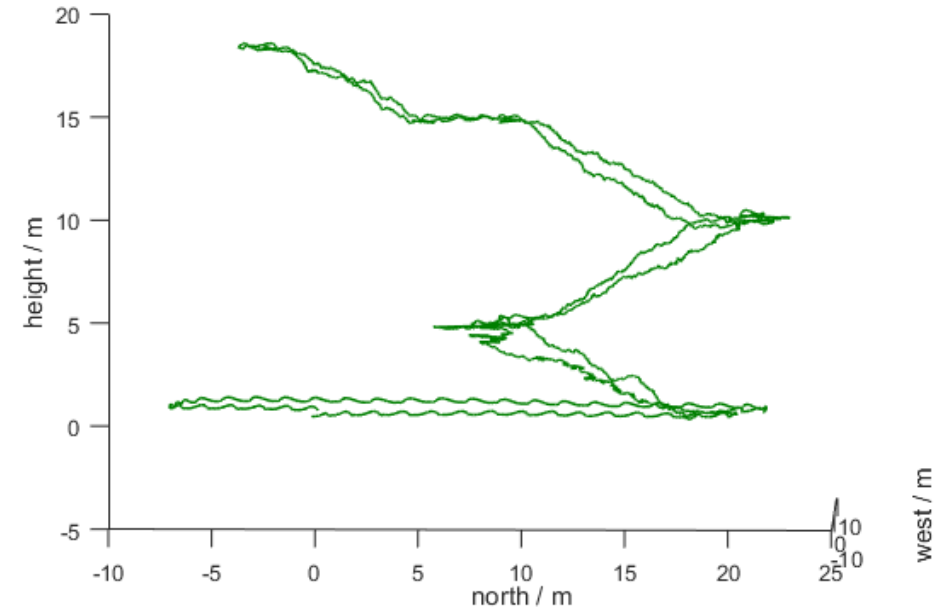
# Experimental Results



Without constraints



With constraints



With constraints and steps on the escalator

|               | vert. distance | hor. distance  | $\Delta h$   | $\Delta 2D$  | $\Delta 3D$  |
|---------------|----------------|----------------|--------------|--------------|--------------|
| Test 1        | 28.95m         | 111.53m        | 0.49m        | 0.82m        | 0.97m        |
| <b>Test 2</b> | <b>36.90m</b>  | <b>168.37m</b> | <b>0.06m</b> | <b>2.38m</b> | <b>2.38m</b> |
| Test 3        | 25.99m         | 123.34m        | 0.11m        | 0.57m        | 0.58m        |
| Test 4        | 20.46m         | 324.99m        | 0.05m        | 1.37m        | 1.37m        |



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**Conclusion & Outlook**

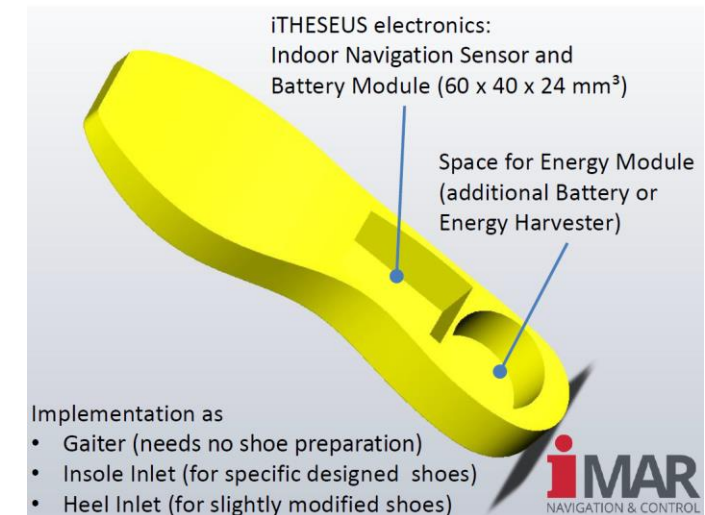
# Conclusion & Outlook

## Conclusion

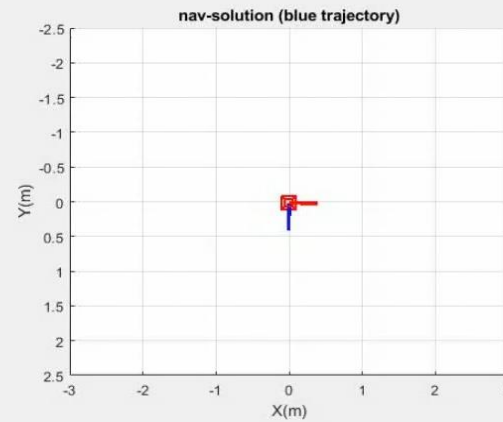
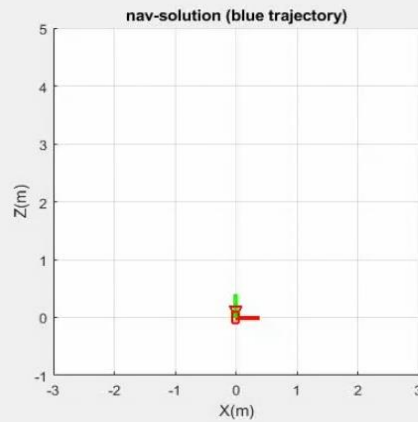
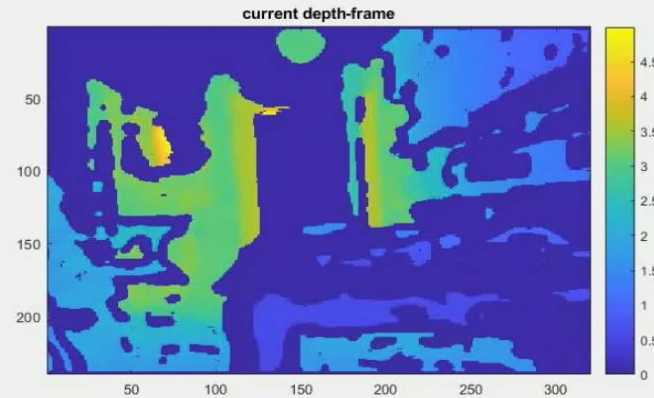
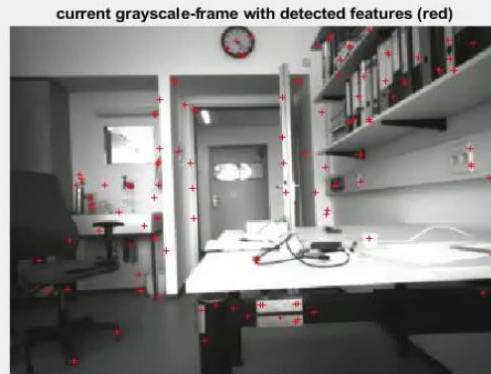
- ④ High accurate relative positioning system
- ④ Tightly integration of GNSS/IMU data for absolute localization
- ④ Detection of elevators and escalators
- ④ Real-time localization in outdoor and indoor scenarios

## Outlook

- Mounting electronics in heel
- Body camera with RGBD sensor for reconstruction of 3D map

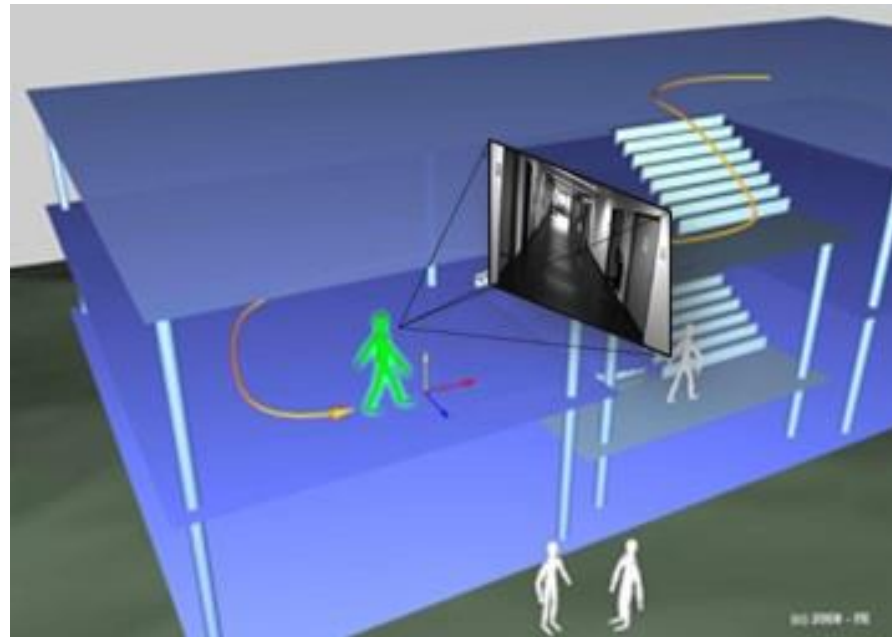


# Conclusion & Outlook



- Realsense D435
- (IMU Integration)

# Thank you!



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