

# RECEDING HORIZON INTEGRITY: A NEW NAVIGATION SAFETY METHODOLOGY FOR CO- ROBOTIC PASSENGER VEHICLES

Matthew Spenko

Mechanical, Materials, and Aerospace  
Engineering

Mathieu Joerger

Aerospace and Mechanical Engineering

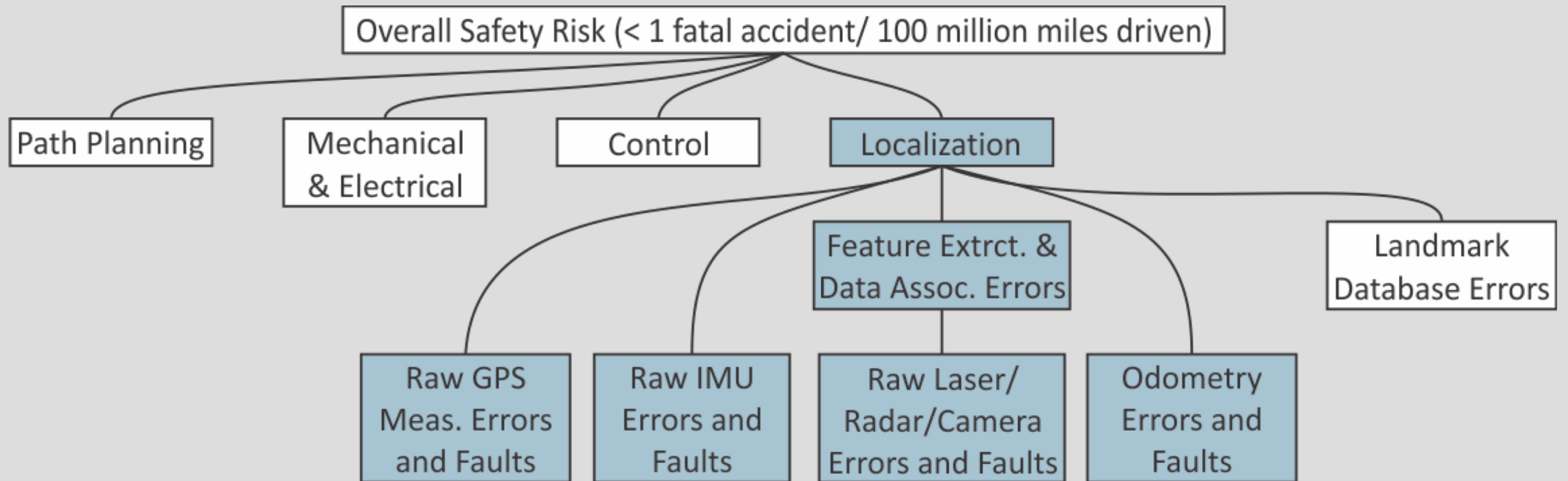


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# MOBILE CO-ROBOT SAFETY

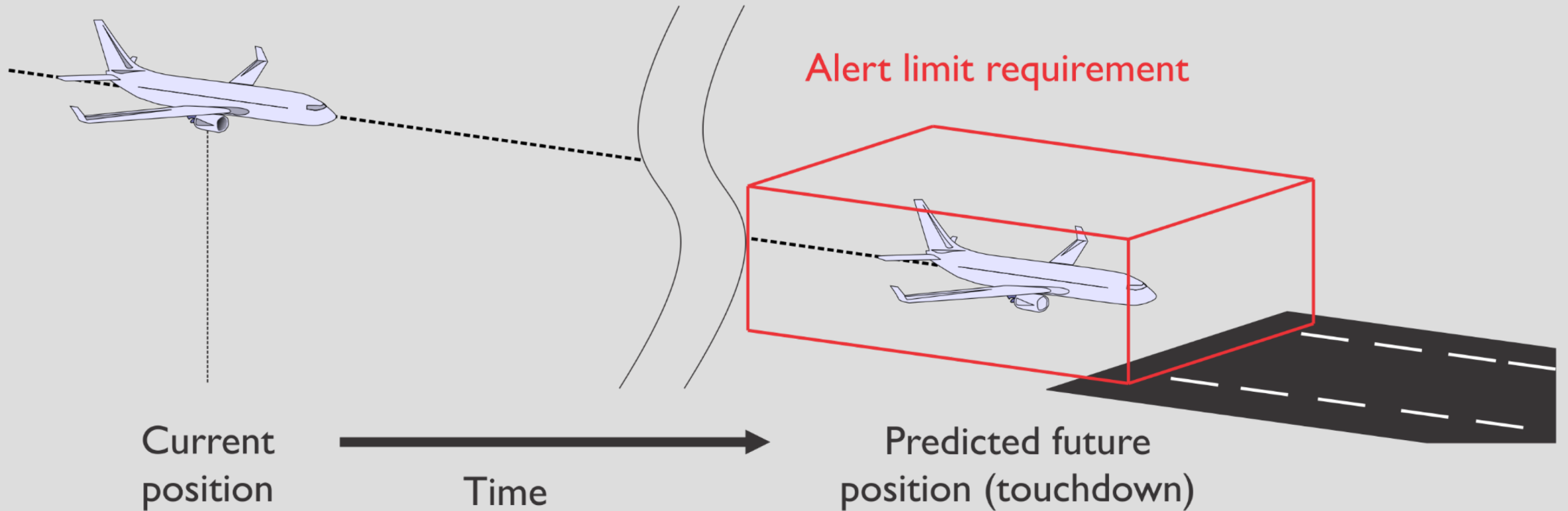


# CAN WE PROVE IT EXPERIMENTALLY?

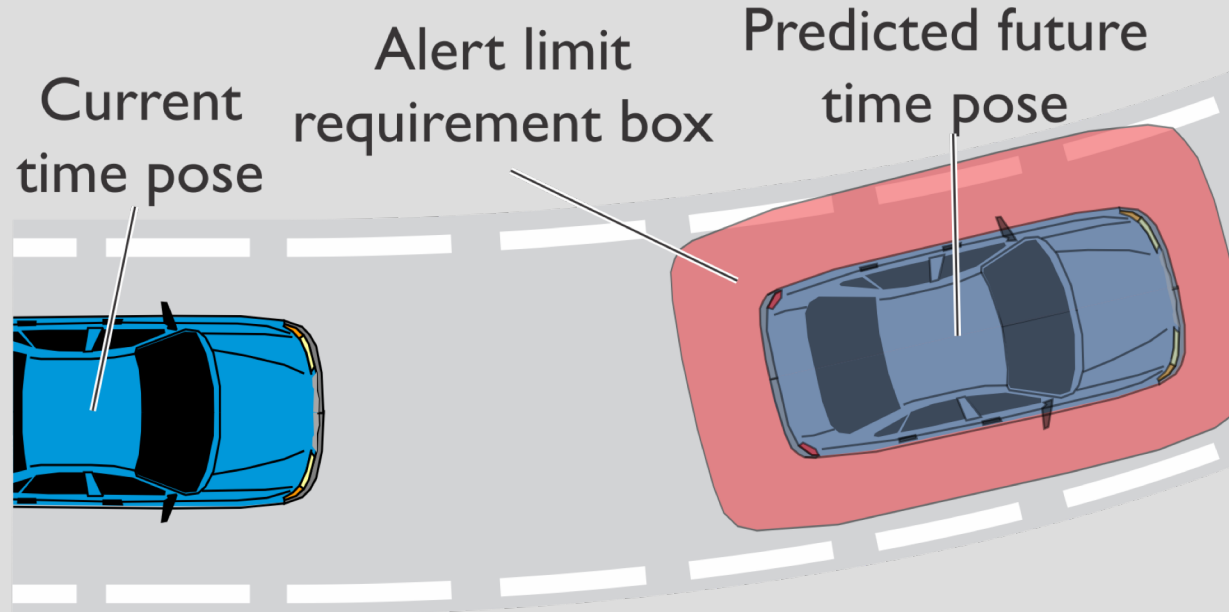
How many miles would have to be driven without failure to demonstrate with 95% confidence that the failure rate is ... [Kalra, 2016]	Miles
less than current	275 million
20% better than current	11 billion

- In aviation applications, safety is guaranteed by monitoring integrity, an analytical measure of trust in a sensor's information

# ANALYTICAL METHODS USED IN AVIATION



# CHALLENGES IN ADOPTING AVIATION SAFETY METHODS TO MOBILE ROBOTS



Challenge	Need
GNSS-alone is insufficient	Multi-sensor system
Not only peak in safety risk at landing	Continuous risk monitoring
Unpredictable measurement availability	Prediction in dynamic environment

# INTEGRITY RISK

- Localization integrity risk is evaluated as the probability of *Hazardous Misleading Information* (HMI)
- Occurs when *undetected* faults produce an estimate error beyond some predefined limit:

$$HMI_k \equiv \hat{\epsilon}_k > l \cap q_k < T$$

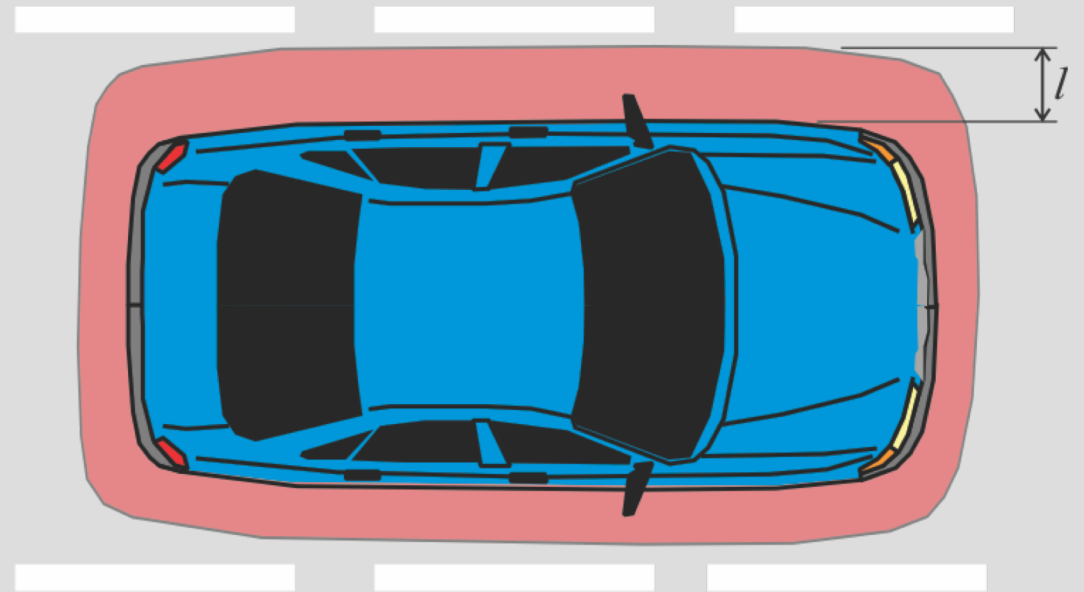
Hazardous misleading information at time  $k$

Pose estimate error at time  $k$

Alert limit

The detector, the difference between sensor readings and what we expect from the system model

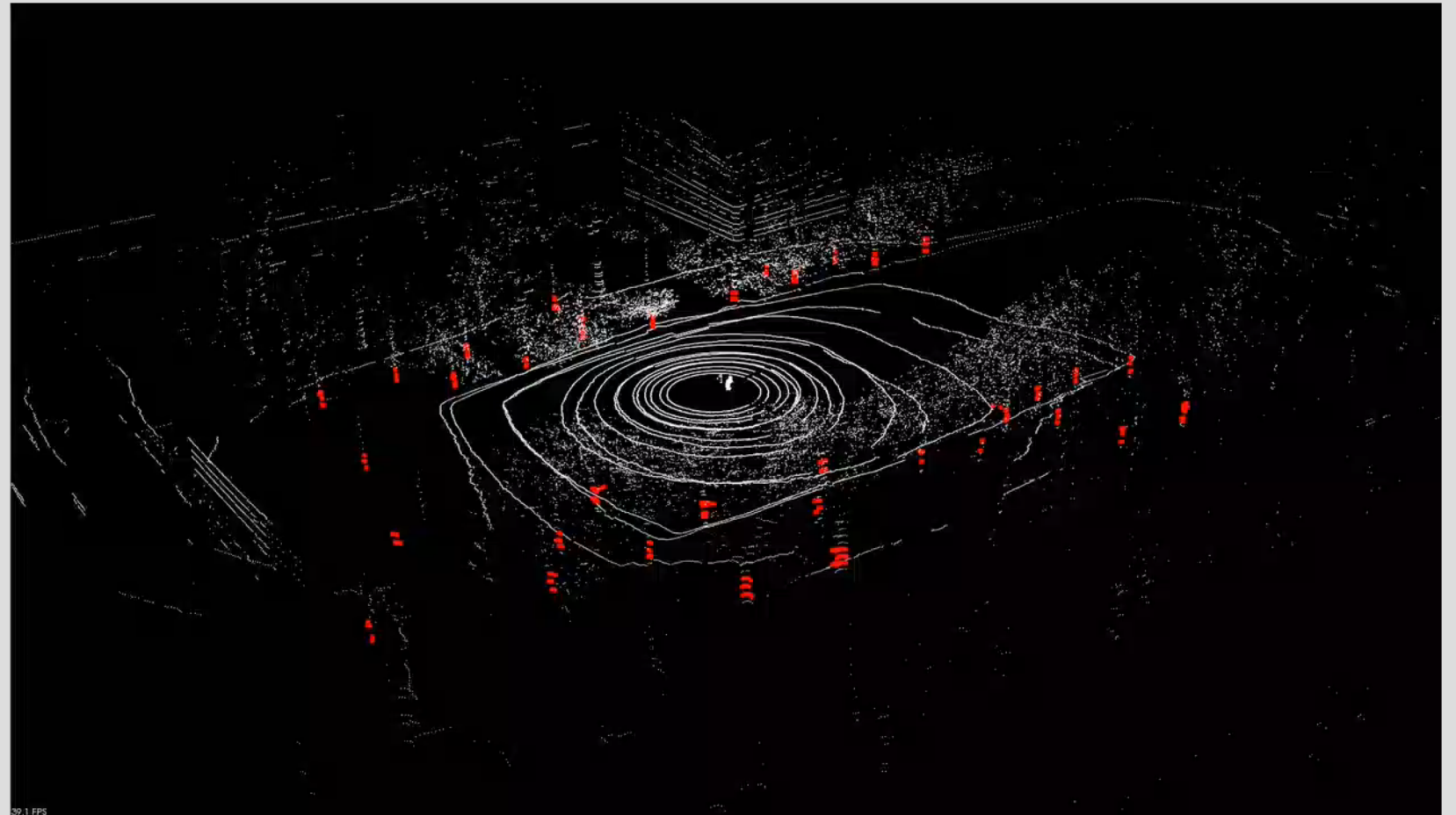
Predefined threshold



# FEATURE EXTRACTION AND DATA ASSOCIATION



Extracted features  
(trees) in red



Feature extractions from experimental data

# DATA ASSOCIATION

- Landmarks faults
  - Feature faults – landmark is associated to a wrongly extracted feature
  - Misassociation – a landmark is associated with a feature correctly extracted from a different landmark

Obscured posts because of construction could cause a possible *feature fault*

Landmarks too close together could cause a *misassociation*





# PROBABILITY OF HAZARDOUS MISLEADING INFORMATION

## $P(HMI)$

- Evaluated under fault-free, or correctly associated ( $CA$ ) and faulted, or incorrectly associated ( $IA$ ) conditions:
- Impossible to evaluate exactly, instead bound as:

$$P(HMI_k) \leq 1 + \underbrace{(P(HMI_k|CA_k) - 1)}_{\text{Solvable from covariance of Kalman filter update}} \underbrace{P(CA_k)}_{??} \equiv \check{P}(HMI_k) \underbrace{\quad}_{\text{Upper bound must meet safety requirements set by regulating agency}}$$

Solvable from covariance of  
Kalman filter update

??

Upper bound must  
meet safety  
requirements set by  
regulating agency

# BOUDNING $P(CA_k)$

$$P(HMI_k) \leq 1 + \underbrace{(P(HMI_k|CA_k) - 1)}_{\text{More landmarks = lower P(HMI)}} \underbrace{P(CA_k)}_{\text{Number of landmarks in the field of view. More landmarks = higher P(HMI)}}$$

$$\underbrace{P(CA_k)}_{\text{Number of landmarks in the field of view. More landmarks = higher P(HMI)}} > 1 - \underbrace{n_{FoV}}_{\text{Number of landmarks in the field of view. More landmarks = higher P(HMI)}} + \left(1 - \frac{I_y}{n_{FoV}}\right) \sum_{l=1}^{n_{FoV}} X_{m+m_F}^2 \underbrace{\left[\frac{1}{4} \|y_l^*\|_{Y_{i_l}^{-1}}^2\right]}_{\text{Accounts for the separation among landmarks. More separation equates = lower P(HMI)}}$$

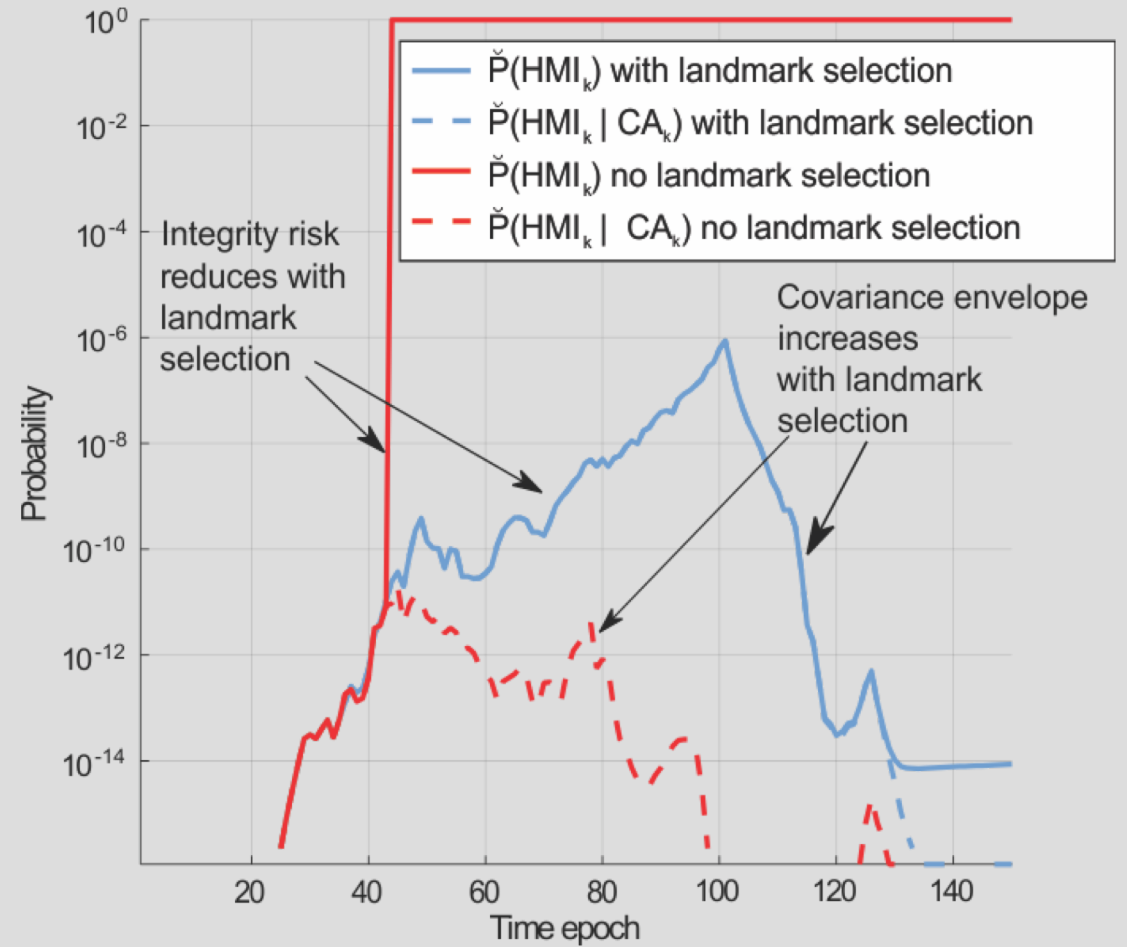
Number of landmarks in the field of view. More landmarks = higher P(HMI)

Accounts for the separation among landmarks. More separation equates = lower P(HMI)

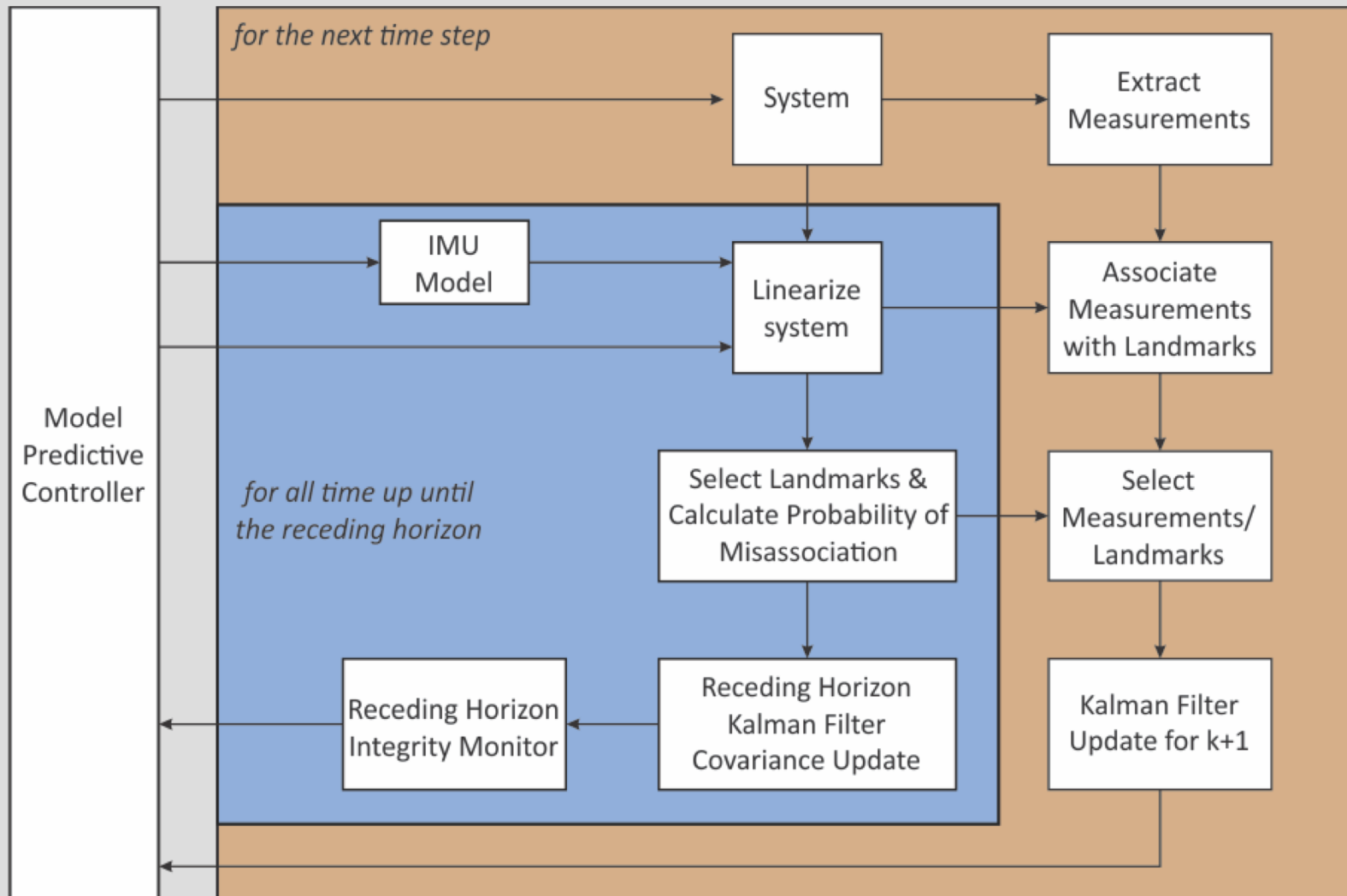
# LANDMARK SELECTION



Simulation environment



# PUTTING IT ALL TOGETHER



# ACKNOWLEDGMENTS



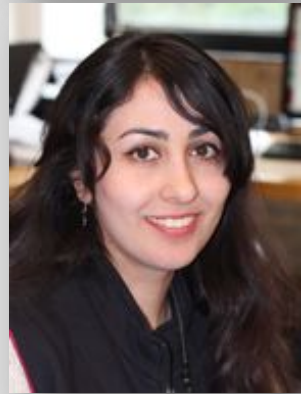
Guillermo Arana  
Ph.D. Student



Osama Hafez  
Ph.D. Student



Ali Hassani  
Ph.D. Student



Neda Karimi-  
Mohamadi  
Ph.D. Student



Laura Prout  
Undergraduate  
Student



Syeed Sweis  
M.S. Student



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