

# Machine Learning-based Indoor Localization for Micro Aerial Vehicles

**Volker Strobel**  
[volker.strobel87@gmail.com](mailto:volker.strobel87@gmail.com)

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**Radboud Universiteit**



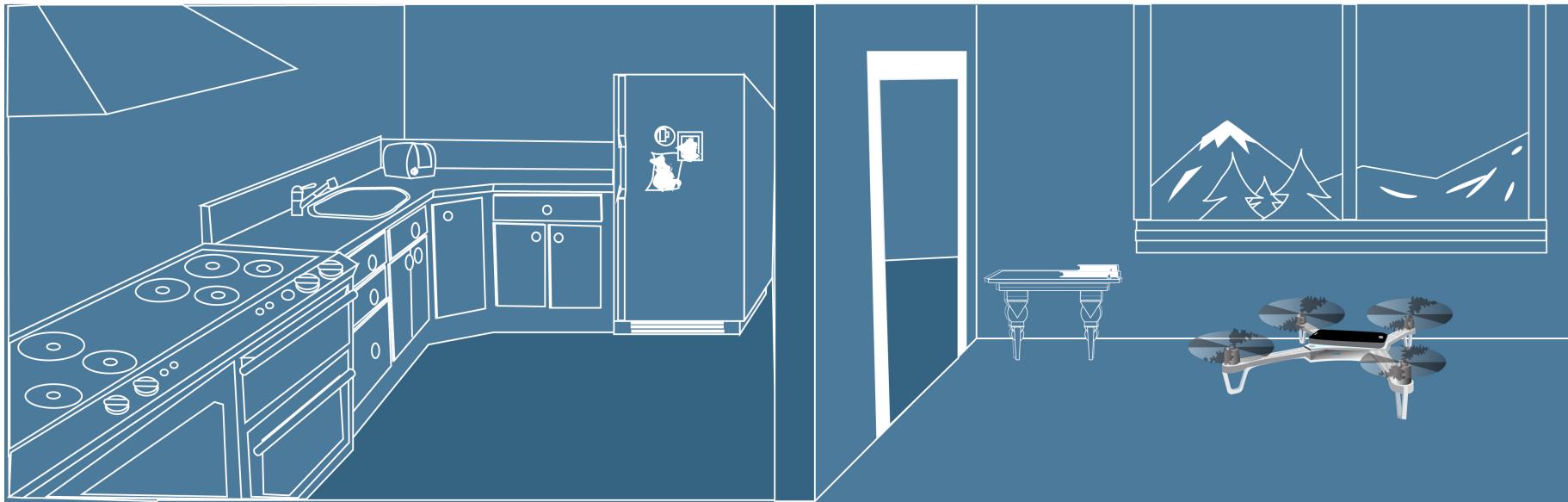
**Louis Vuurpijl**



**TU Delft** Delft  
University of  
Technology

**Guido de Croon**  
**Roland Meertens**

# MOTIVATION



# MOTIVATION

## Research Question

Can accurate indoor localization be done on a very limited platform?

# RESEARCH QUESTIONS

## Research Question 1

Can accurate indoor  
localization be done on a very  
limited platform?

## Research Question 2

Can accurate indoor  
localization be with synthetic  
data only?

## Research Question 3

Can we predict the fitness of  
a given environment?

# SETTING

Camera



Processor



Datalink



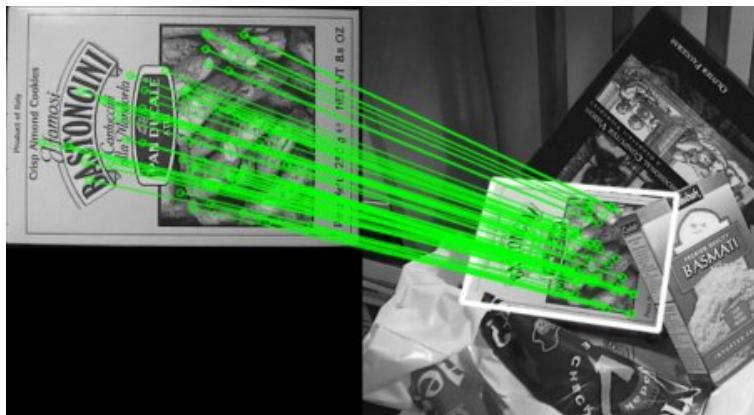
# OUTLINE

- Existing Methods
- Machine Learning-based Approach
- Flight Tests & Simulations
- Discussion & General Discussion
- Conclusion & Future Work

# OUTLINE

- Existing Methods
- Methods
- Experiments and Results
- Discussion
- Conclusion

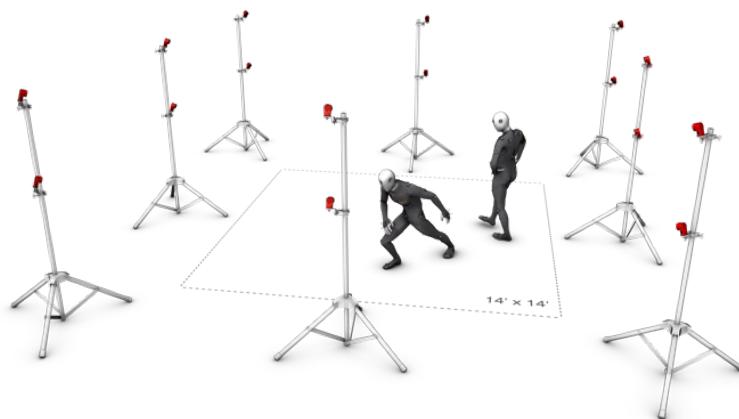
# METHODS FOR INDOOR LOCALIZATION



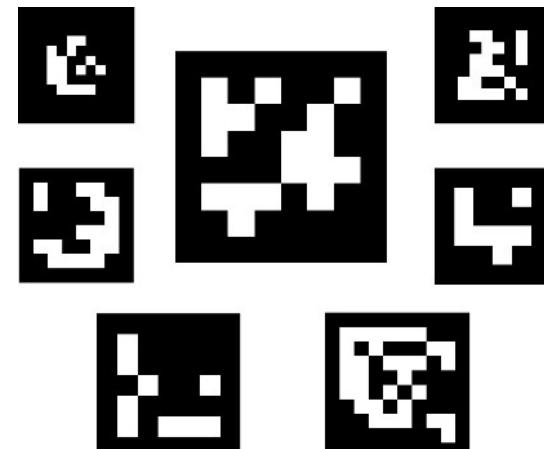
SIFT + homography finding



Laser range finder

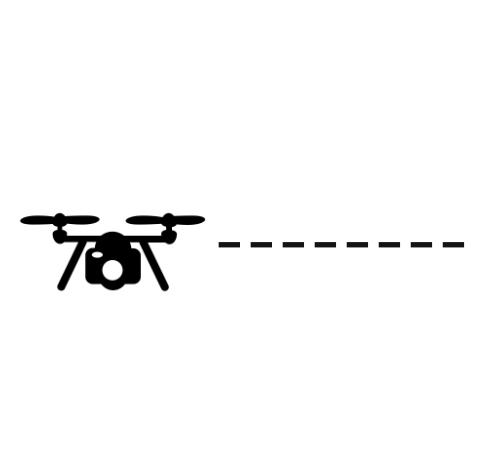
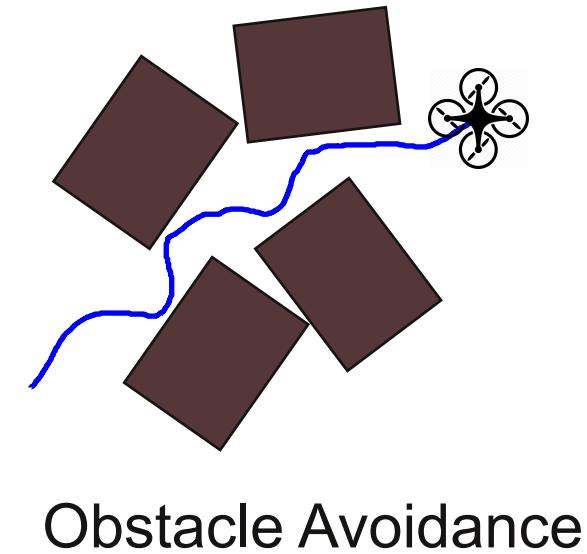
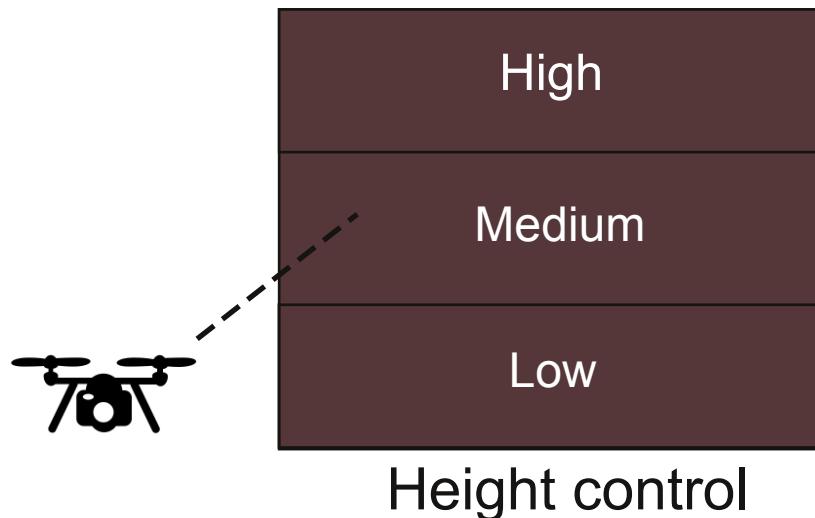


Motion tracking system



Markers

# FOUNDATION



Distance Measurement

# CHALLENGES / CONTRIBUTIONS

Continuous regression problem

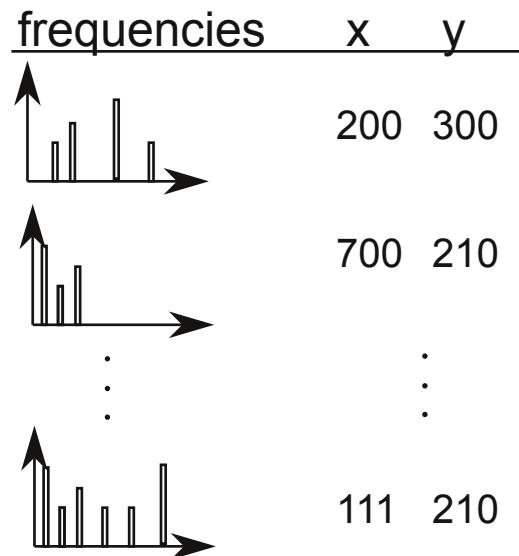
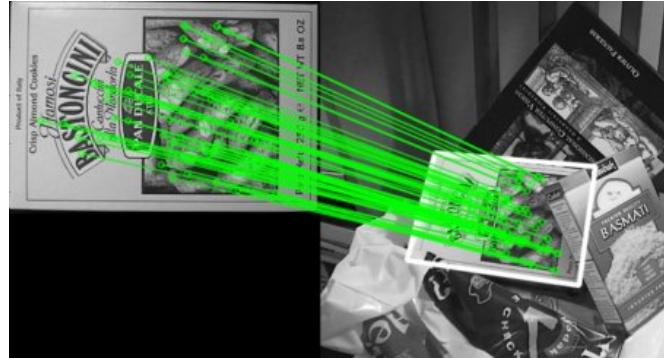
Low performance platform

Embedded systems programming (C)

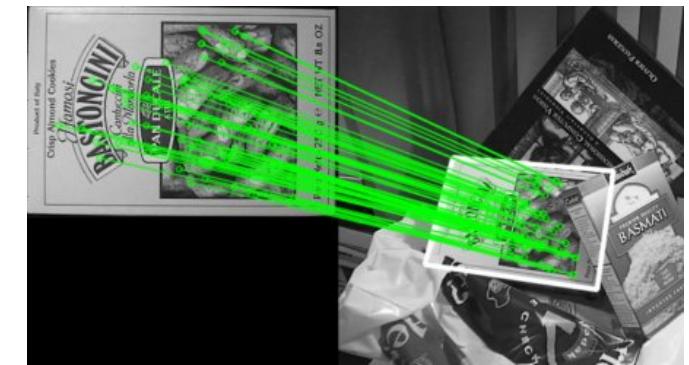
Ground truth estimation

# IDEA

Preflight phase



Flight phase

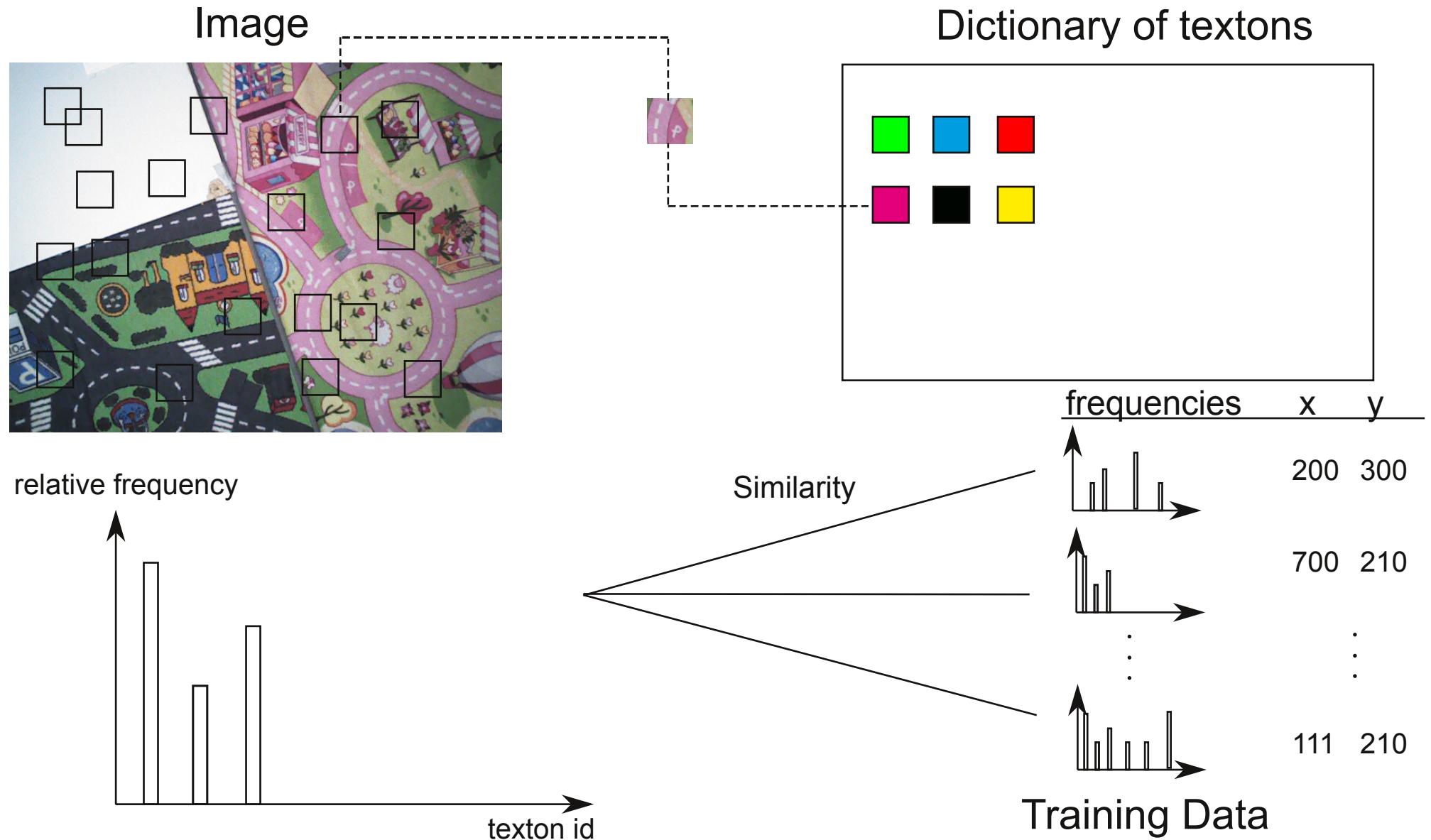


(computational)  
effort

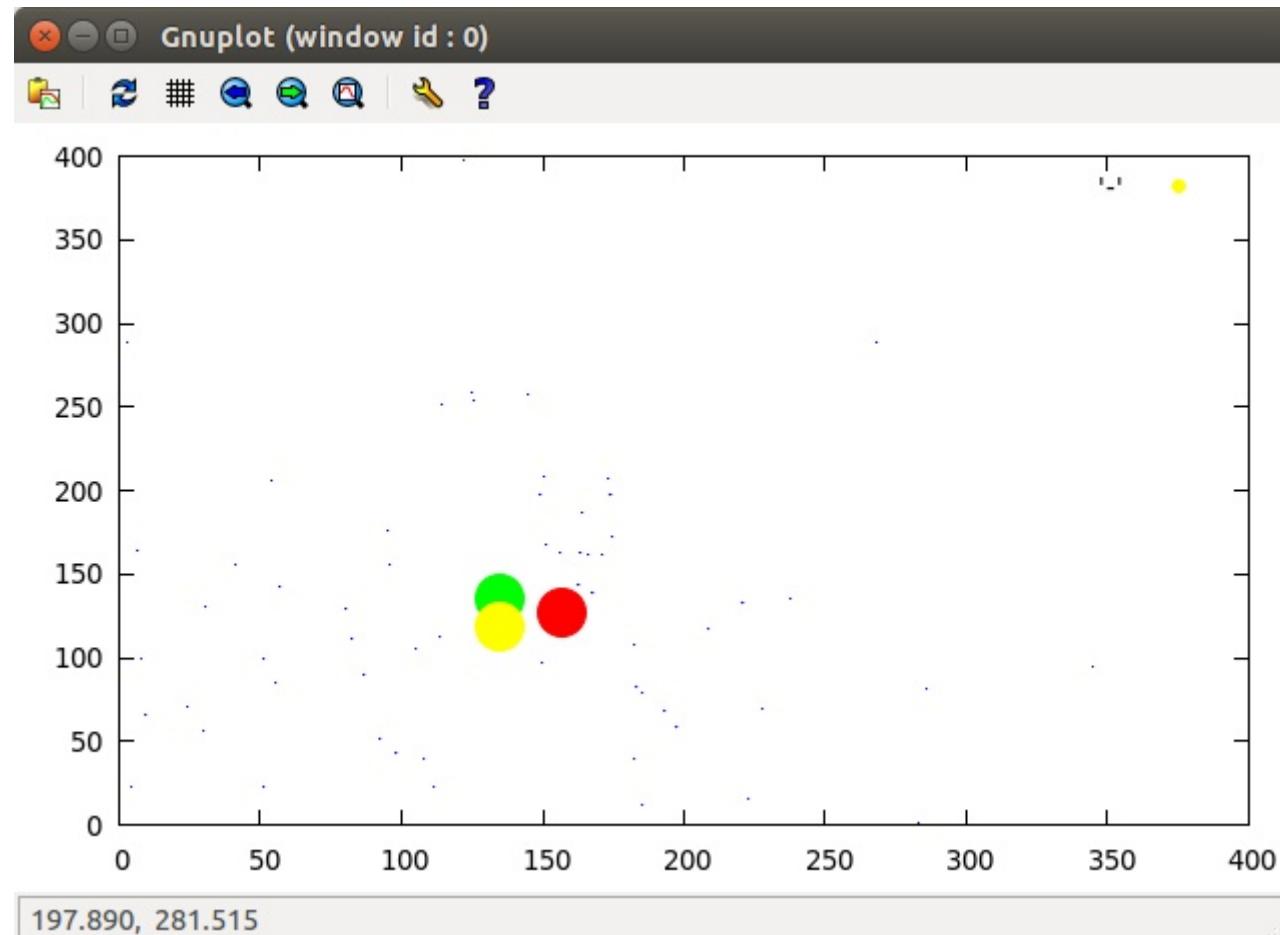
# OUTLINE

- Related Work
- Methods
- Experiments and Results
- Discussion
- Conclusion

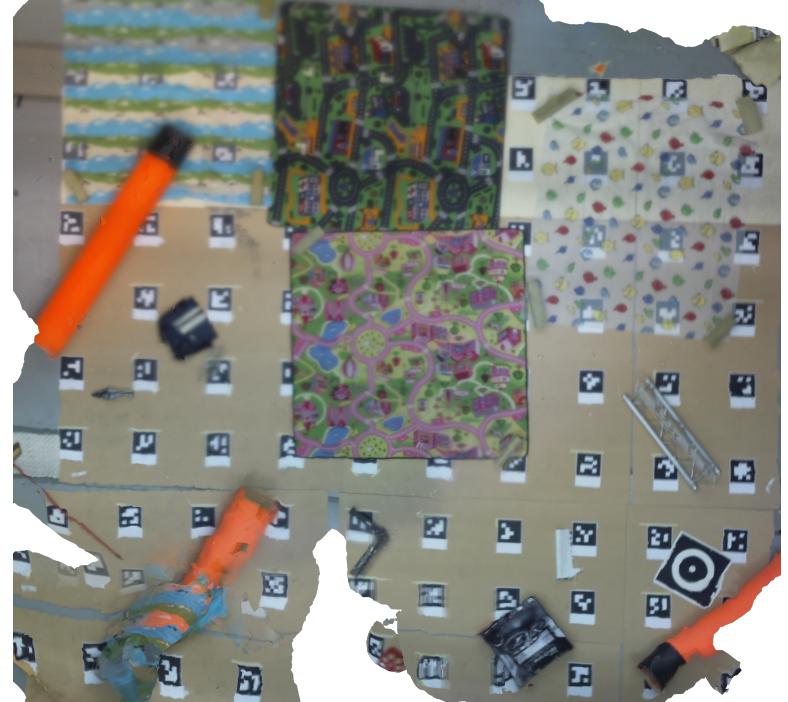
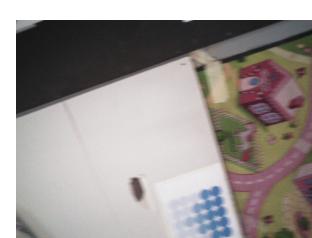
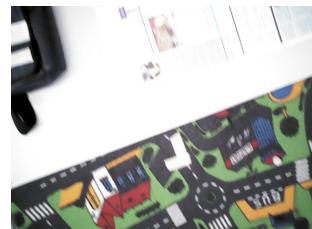
# MACHINE-LEARNING APPROACH



# PARTICLE FILTER



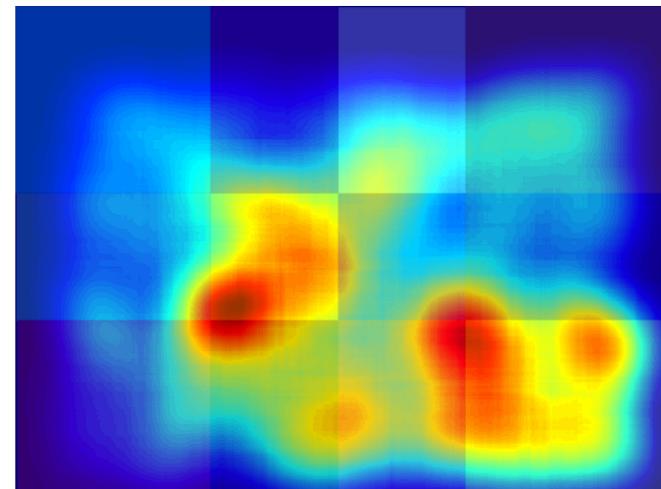
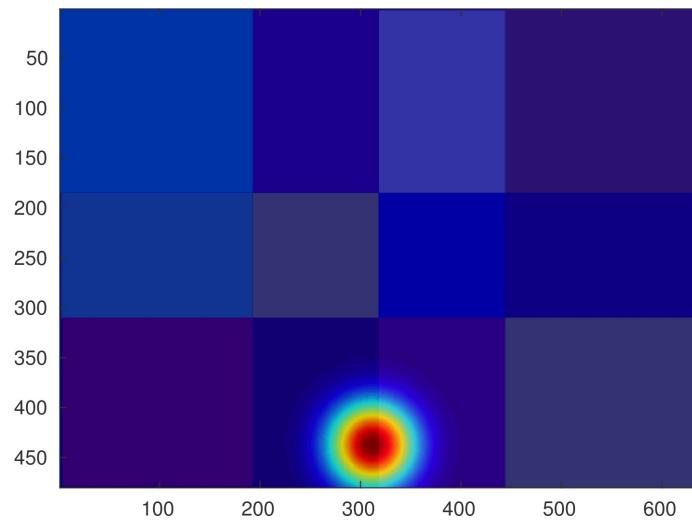
# GROUND TRUTH ESTIMATION



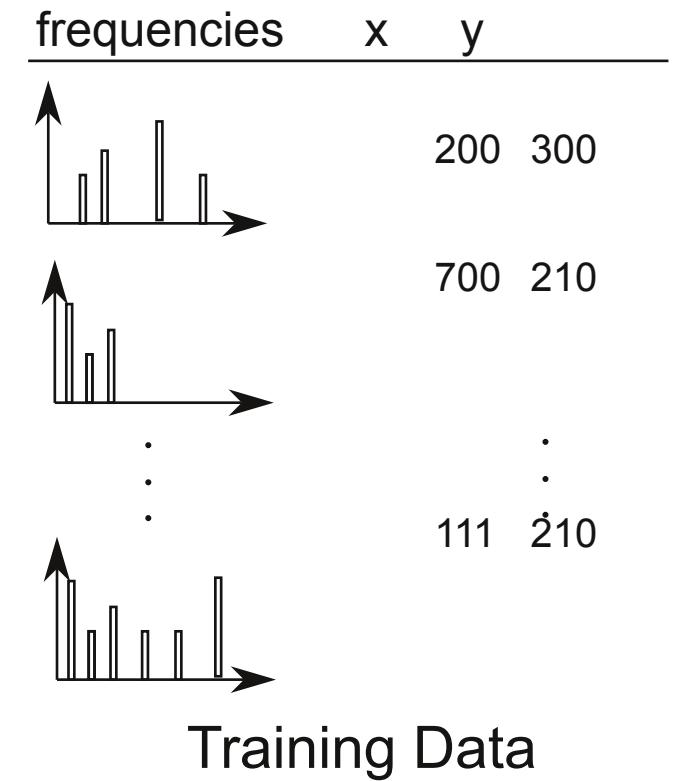
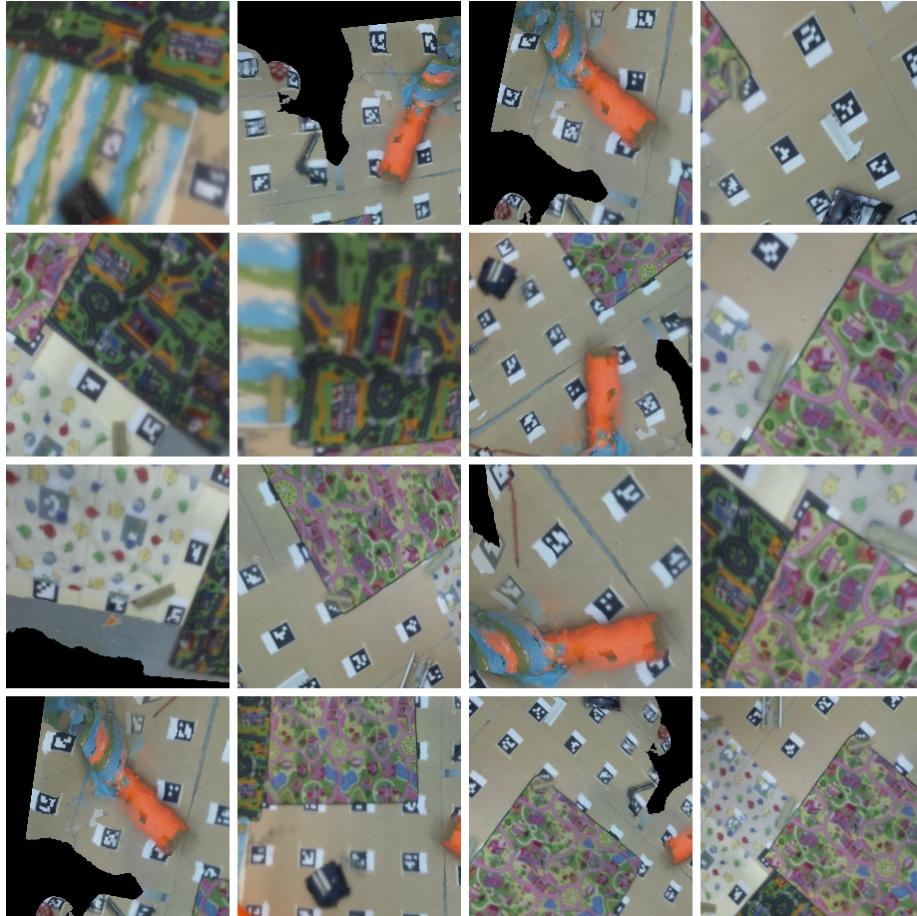
# ENVIRONMENTAL MODIFICATION



# MAP EVALUATION



# SYNTHETIC FLIGHT



# OUTLINE

- Related Work
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# EXPERIMENTS

- Simulated flights
- Map evaluation
- Real-world Target Landing
- Real-world Navigation

# MAP EVALUATION



# MAP EVALUATION



29.5



33.7



39.4



41.5



45.6



64.4

# DISCUSSION

## Research Question 1

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# DISCUSSION

map evaluation algorithm could predict real-world performance  
target landing within acceptable accuracy

# DISCUSSION

## Limitations:

- no height control or rotations yet
- robustness to different lighting conditions

## Future research directions:

- bridge reality gap between synthetic and real-world data
- automatic map generation (evolutionary algorithm)

# CONCLUSION

## EFFICIENT INDOOR LOCALIZATION

