

# Sensor Fusion on a mini Unmanned Vehicle

Integrating vision-based algorithms on an Parrot AR.Drone to autonomously follow linear shaped structures in a landscape.



A BACHELOR THESIS BY CAMIEL R. VERSCHOOR

# Sensor Fusion on a mini Unmanned Vehicle

Integrating vision-based algorithms on an Parrot AR.Drone  
to autonomously follow linear shaped structures in a  
landscape.

C. R. Verschoor

Faculty of Science (FNWI)  
University of Amsterdam

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# Supervisors



**Dr. Arnoud Visser**  
Assistant Professor  
University of Amsterdam



**Drs. Gerald Poppinga**  
R&D Manager for mini UAS  
National Aerospace Lab (NLR)

# National Aerospace Lab NLR



NLR is the main knowledge enterprise in the Netherlands in the field of aviation and aerospace.

# Outline

1 Introduction

2 Approach

3 Experiments

4 Results

5 Conclusion

6 Questions

7 Relevant Literature



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Motivation

## Motivation

- Autonomous Robots require navigation.
- GPS is unreliable in indoor and urban environments.
- **Possible alternative:** vision-based line-following.



## Motivation

- Various approaches of vision-based line-following.
- Edge and motion detection suitable candidates [Bills et al., 2011, Gerke et al., 2011], but have weaknesses.
- **Solution:** combine them to strengthen each others weaknesses.

## Research Question

### Research Question

- To examine how edge and motion detection can be combined to strengthen each other in a line-following task.
  - What is the optimal camera configuration?
  - What are the experimental settings that demonstrate the strength and weaknesses of these algorithms?
  - What is the performance and robustness of these vision-based methods to navigation?



## Platform and Framework

### Platform and Framework

Platform Parrot AR.Drone.

- Top and bottom camera.

Framework AR.Drone SLAM<sup>1</sup> a development framework



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<sup>1</sup>[Dijkshoorn, 2012]

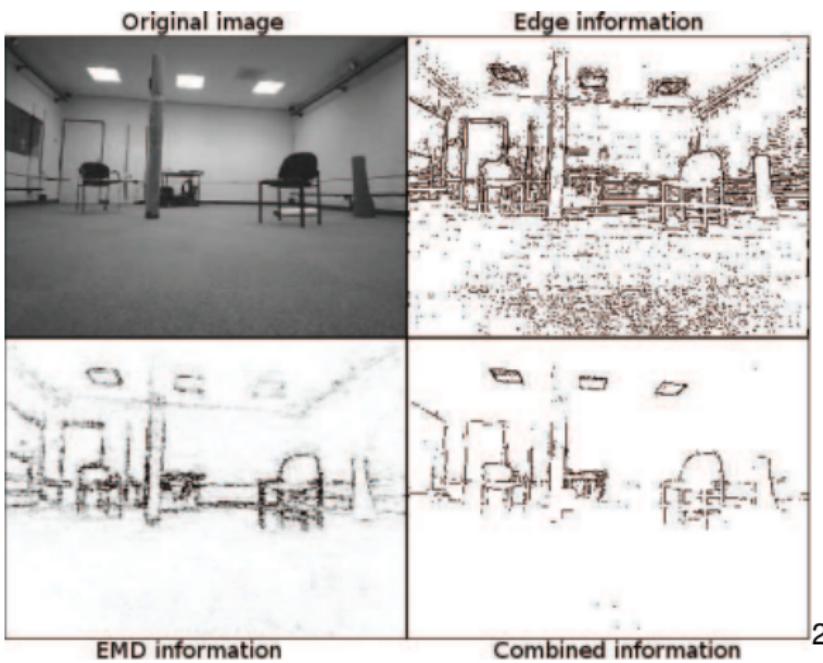
## Related Work

### Related Work

- Corridor and Stair Following [Bills et al., 2011]
- Power Line Detection [Golightly and Jones, 2005, Li et al., 2008, Katrasnik et al., 2010]
- Obstacle Avoidance [Jurriaans, 2011]
- Elementary Motion Detectors [Gerke et al., 2011]



## Related Work



<sup>2</sup>[Gerke et al., 2011]

## Related Work

## Related Work

- Nearly all proposed methods use Hough Transform for feature extraction.
- Edge and Motion detection have been suitable techniques for navigation
- Combination of Edge and Motion detection gave promising results.



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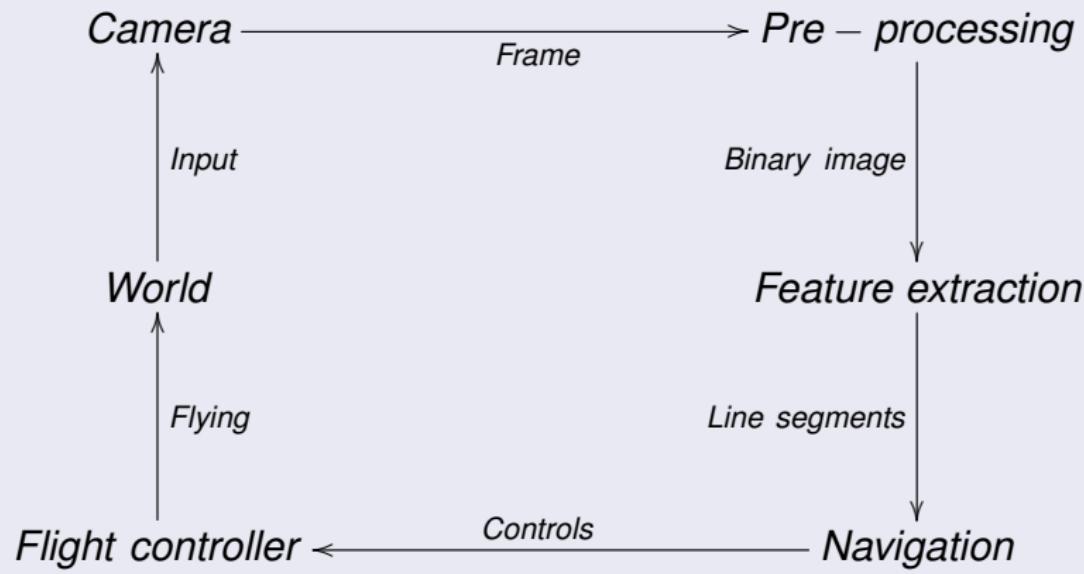
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## Main Approach

### Main Approach



## Main Approach

### Main Approach

- Pre-processing
  - Canny edge detector (Brightness changes)
  - Monocular stereo vision (Apparent motion)
- Feature extraction
  - Probabilistic Hough Transform
- Navigation

## Pre-processing

## Pre-processing

- Canny edge detector (Brightness changes)
- Monocular stereo vision (Apparent motion)

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## Feature extraction

### Feature extraction

- To be written

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Navigation

## Evaluation

- To be written



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## Camera Configuration

### Camera Configuration



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## Experiments

### Experiments



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## Evaluation Criteria

### Evaluation Criteria

To be written.

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## Camera Configuration

### Camera Configuration

To be written.

## Experiments

## Experiment 1

### Edge detection

| Performance | True        | False     |
|-------------|-------------|-----------|
| Detected    | 528 (97.8%) | 12 (2.2%) |
| Direction   | 503 (93.1%) | 37 (6.9%) |

### Motion Detection

| Performance | True      | False       |
|-------------|-----------|-------------|
| Detected    | 53 (9.8%) | 487 (90.2%) |
| Direction   | 37 (6.9%) | 503 (93.1%) |

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## Experiments

### Conclusion Experiment 1

To be written.



## Experiment 2

### Edge Detection

| Performance | True       | False       |
|-------------|------------|-------------|
| Detected    | 69 (29.0%) | 169 (71.0%) |
| Direction   | 58 (24.4%) | 180 (85.6%) |

### Motion Detection

| Performance | True       | False       |
|-------------|------------|-------------|
| Detected    | 96 (40.3%) | 142 (59.7%) |
| Direction   | 87 (36.6%) | 137 (63.4%) |

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## Experiments

### Conclusion Experiment 2

To be written.

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## Conclusion

- To be written

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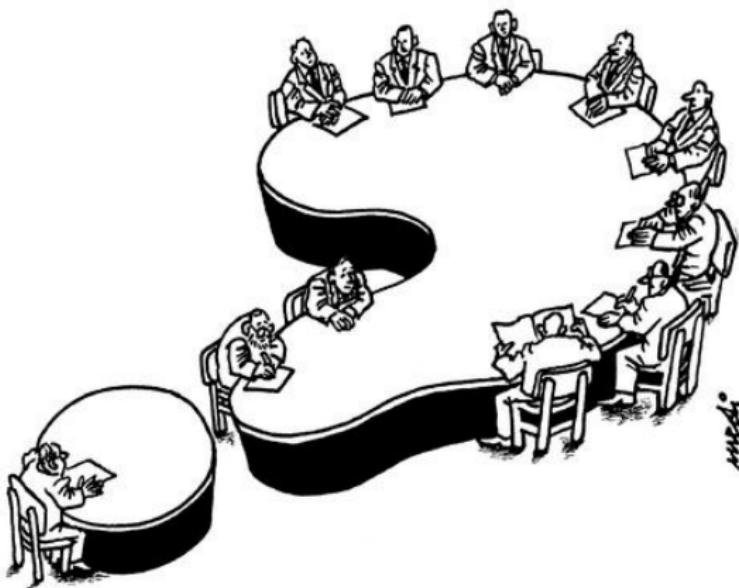
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# Questions?





## Acknowledgements

I would like to thank for their guidance and support :

- Arnoud Visser
- Gerald Poppinga



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## Relevant videos

- Corridor following
- Various tasks

# Relevant Literature I



Bills, C., Chen, J., and Saxena, A. (2011).

Autonomous mav flight in indoor environments using single image perspective cues.

In *Robotics and Automation (ICRA), 2011 IEEE International Conference on*, pages 5776 –5783.



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Simultaneous localization and mapping with the ar.drone.

Master's thesis, Universiteit van Amsterdam.

## Relevant Literature II



Gerke, P., Langevoort, J., Lagarde, S., Bax, L., Grootswagers, T., Drenth, R.-J., Slieker, V., Vuurpijl, L., Haselager, P., Sprinkhuizen-Kuyper, I., Otterlo, M., and de Croon, G. (2011).

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Visual control of an unmanned aerial vehicle for power line inspection.

In *Advanced Robotics, 2005. ICAR '05. Proceedings., 12th International Conference on*, pages 288 –295.

## Relevant Literature III



Jurriaans, R. (2011).

Flow based obstacle avoidance for real world autonomous aerial navigation tasks.

Bachelor's thesis, Universiteit van Amsterdam.



Katrasnik, J., Pernus, F., and Likar, B. (2010).

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Li, Z., Liu, Y., Hayward, R., Zhang, J., and Cai, J. (2008).

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In *Image and Vision Computing New Zealand, 2008. IVCNZ 2008. 23rd International Conference*, pages 1 –6.