

# 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.

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# Outline

- 1 Introduction
- 2 Progress Overview
- 3 Planning
- 4 Questions
- 5 Relevant Literature

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# Supervisors



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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.

## Research Question

What vision-based algorithms perform successful in autonomously following linear shaped structures in a landscape with an Parrot AR.Drone?



## Research Goal

The goal of this research project is to develop an algorithm on an Unmanned Aerial Vehicle that in the end can navigate autonomously over infrastructure.



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# Progress Overview

- Platform change.
- Set up the framework.
- Overview Approach
- Implement vision-based algorithms.
- Integrate vision-based algorithms.

# Platform change

**Parrot AR.Drone** instead of **AscTec Pelican**.

## Reasons:

- AR.Drone has integrated Optical Flow (hovering).
- Framework is written for AR.Drone.
- AscTec Pelican does not have Optical Flow integrated.

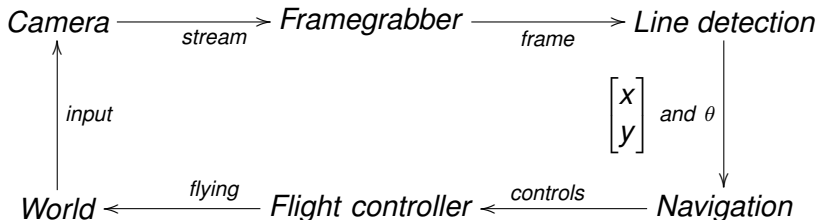
## Side effects:

- AR.Drone carries a poorer camera.
- AR.Drone does not carry pan/tilt camera.

# Setup the framework

- Framework of MSc. student N. Dijkshoorn.  
Provides:
  - Real-time SLAM.
  - Communication AR.Drone.
  - Communication USAR-SIM Simulator.
  - Various controllers (ie. 3D mouse or keyboard).
- Windows based.
- Image library (OpenCV).
- Source in C++.

# Overview Line-Following Approach



# Implementing vision-based algorithms

**Line detection:** Probabilistic/Randomized Hough Line Transform

- Less computational costs due geometric features of a line.
- Evaluates randomly selected points

**Line selection:** based on the features of the line (ie. length and slope).

**Determine movement:** Angle  $\theta$  and transformation  $\begin{bmatrix} x \\ y \end{bmatrix}$

**Track line:** using area of interest.

# Video demonstration on dataset

Video: Probabilistic Hough Line Transform on Dataset Pelican

# Integration of the vision-based algorithms

- Link vision-based algorithm to the framework.
- Determine action of the platform.

**Video:** AR.Drone following a line.

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# Planning

- Implement other vision-based algorithms.
  - BioMAV's approach.
  - Majidi's approach
- Improve flight actions of the line-following algorithm.
- Compare algorithms.
- Write Bachelor Thesis.

# BioMAV's Approach

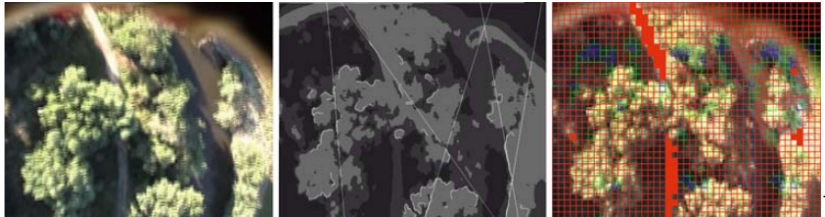
Combining:

- Enhanced Motion Detection Activation
- Quick shift segmentation (Edge detection)

# Majidi's Approach

Combines

- Line Detection
- Texture Segmentation



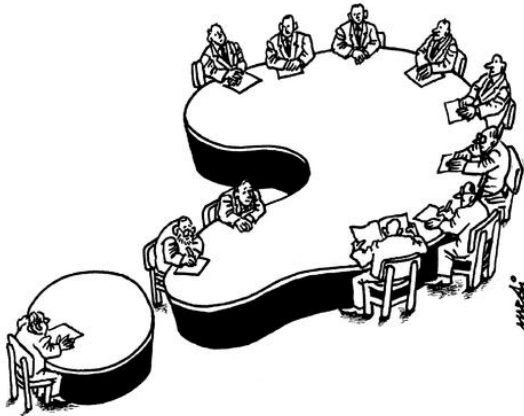
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<sup>1</sup>[Majidi and Bab-Hadiashar, 2009]

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# Questions?



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# Relevant Literature I



Bosch, S., Lacroix, S., and Caballero, F. (2006).

Autonomous detection of safe landing areas for an uav from monocular images.

*In Intelligent Robots and Systems, 2006 IEEE/RSJ International Conference on, pages 5522 – 5527.*



Caballero, F., Merino, L., Ferruz, J., and Ollero, A. (2006).

Improving vision-based planar motion estimation for unmanned aerial vehicles through online mosaicing.

*In Robotics and Automation, 2006. ICRA 2006. Proceedings 2006 IEEE International Conference on, pages 2860 –2865.*

# Relevant Literature II



Feil, P., Menzel, W., Nguyen, T., Pichot, C., and Migliaccio, C. (2008).

Foreign objects debris detection (fod) on airport runways using a broadband 78 ghz sensor.

*In Microwave Conference, 2008. EuMC 2008. 38th European*, pages 1608 –1611.



Frew, E., McGee, T., Kim, Z., Xiao, X., Jackson, S., Morimoto, M., Rathinam, S., Padial, J., and Sengupta, R. (2004).

Vision-based road-following using a small autonomous aircraft.

(3).



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

A survey of mobile robots for distribution power line inspection.

*Power Delivery, IEEE Transactions on*, 25(1):485 –493.



## Relevant Literature III



Lhuillier, M. and Quan, L. (2002).

Match propagation for image-based modeling and rendering.

*Pattern Analysis and Machine Intelligence, IEEE Transactions on*,  
24(8):1140 – 1146.



Majidi, B. and Bab-Hadiashar, A. (2009).

Aerial tracking of elongated objects in rural environments.

*Machine Vision and Applications*, 20:23–34.  
10.1007/s00138-007-0102-2.

## Relevant Literature IV



Mills, S., Castro, M., Li, Z., Cai, J., Hayward, R., Mejias, L., and Walker, R. (2010).

Evaluation of aerial remote sensing techniques for vegetation management in power-line corridors.

*Geoscience and Remote Sensing, IEEE Transactions on*, 48(9):3379–3390.



Odobez, J. and Bouthemy, P. (1994).

Detection of multiple moving objects using multiscale mrf with camera motion compensation.

*In Image Processing, 1994. Proceedings. ICIP-94., IEEE International Conference*, volume 2, pages 257–261 vol.2.

# Relevant Literature V



Qunyu, X., Huansheng, N., and Weishi, C. (2009).

Video-based foreign object debris detection.

*In Imaging Systems and Techniques, 2009. IST '09. IEEE International Workshop on*, pages 119–122.



Steder, B., Grisetti, G., Stachniss, C., and Burgard, W. (2008).

Visual slam for flying vehicles.

*IEEE Transactions on Robotics*, 24(5):1088–1093.



Tanjung, G., Lu, T.-F., and Lozo, P. (2010).

A method for detecting breaches and new objects in multiple outdoor images.

*International Journal of Advanced Robotic Systems*, 7(1):39–54.

# Relevant Literature VI



Wang, B., Chen, X., Wang, Q., Liu, L., Zhang, H., and Li, B. (2010).

Power line inspection with a flying robot.

*In Applied Robotics for the Power Industry (CARPI), 2010 1st International Conference on, pages 1 –6.*