## Experimental Wind Field Estimation

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## Introduction

- 2 Wind Field Estimation
- 3 Improvements with Aircraft Model
- 4 Conclusion and Future Work

# SkyScanner Project



Founded by STAE Foundation, outcome from the Micro Air Vehicle Research Center of Toulouse

https://www.laas.fr/projects/skyscanner

http://websites.isae.fr/mav-research-center

- Study and experimentation of a fleet of mini-drones that coordinate to adaptively sample cumulus-type clouds
  - refine aerological models of clouds
  - conceive enduring and agile micro-drones
  - fleet control and trajectory optimization

# Objectives

Within the global scope of the project, some particular objectives:

Aircraft performances identification aerodynamic and propulsion performances are required for aircraft control and trajectory planning

Wind field estimation real-time estimation of the local wind field for the atmospheric studies but for the trajectory planning as well



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## Principles



Image: A matrix

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Without airspeed measurement, wind-field can still be estimated from GPS/IMU data, but needs special trajectories:

- flying in circle for the horizontal components
- gliding for the vertical component

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This solution gives too much constraints on the trajectories, especially the glides

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#### Low-cost sensors solution

Wind estimation is done with a non-linear Unscented Kalman Filter (UKF) by fusing at least:

- GPS velocities
- accelerometers, gyrometers and magnetometers
- airspeed norm from Pitot tube

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#### Improvements

Add an extra angle-of-attack probe in order to improve the estimation of the vertical component

$$(S) \begin{cases} \dot{v} = v \times \omega_m + q_m^{-1} * A * q_m + a_m \quad \text{(evolution)} \\ \dot{\nu}_b = 0 \end{cases} \begin{pmatrix} y_V \\ y_V \\ y_B \\ y_\alpha \end{pmatrix} = \begin{pmatrix} | < v, e_1 > | \\ q_m * v * q_m^{-1} + \nu_b \\ q_m^{-1} * B * q_m \\ \tan^{-1} \left( \frac{< v, e_3 >}{< v, e_1 >} \right) \end{pmatrix} \quad \text{(measurement)}$$

## Wind Estimation Results

Estimation of an updraft during a gliding phase



# Aircraft Instrumentation

- Aircraft integration
  - commercially available airframe (Mako)
  - GPS, IMU and barometer for position and attitude estimation
  - integration of a Pitot tube and an angle of attack probe
  - on-board data logging on SD card
  - controlled using Paparazzi UAV system http://paparazziuav.org





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# Angle of Attack Sensor

- Homemade with an absolute angular sensor (US Digital, 12 bits resolution, hall effect) and 3D-printed flag
- Calibration in wind tunnel is required to compensate interaction with the fuselage



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# Improving the Wind Estimation

Estimation can be improved by knowing:

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- Angle-of-attack sensor is also used for aircraft identification
- Extracted points comes from gliding phases (in red) and from level cruise flights (in green)

Hattenberger et al. (ENAC)

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## Motor Test Bench

- Build an accurate model of the propulsion system
- Automated measurement procedure in wind tunnel



# Motor Analyses



In the useful range of airspeed, linear relation between the electrical power input and the resulting propulsive power

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Wind Estimation

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### Conclusion

- Development of a wind field estimation algorithm
- Evaluation on real flight data
- Integration of extra low-cost sensors
- Aircraft and motor identification

## Future Work

- Use the aircraft and propulsion data in the wind estimation filter
- Integrate the filter on an on-board computer for real-time processing

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