

# System simulation of a fleet of drones to probe cumulus clouds

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SHARC 2017

June 29, 2017

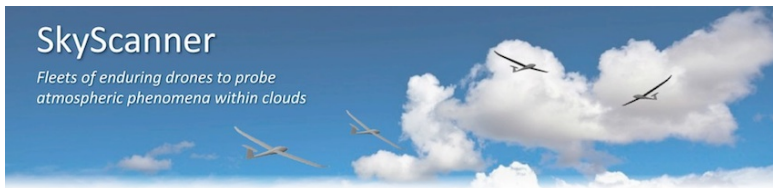
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<sup>1</sup> LAAS-CNRS, France

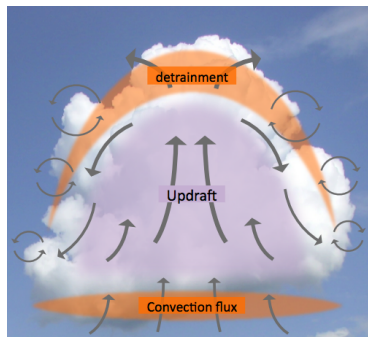
<sup>2</sup> ENAC, France

<sup>3</sup> Météo-France

# Context



- Characterize the boundary layer of clouds
- Follow 4D evolution of the cloud



## Problem statement

Collect data with spatial resolution of 10m at 1Hz over the cloud lifespan: 1 hour over 1km<sup>3</sup>

Exploring clouds is a particularly complex task:

- Follow the 4D evolution of the cloud along 1D manifolds
- Highly constrained problem: Mission duration, UAV size and wind influence

The only way is to use multiple UAVs

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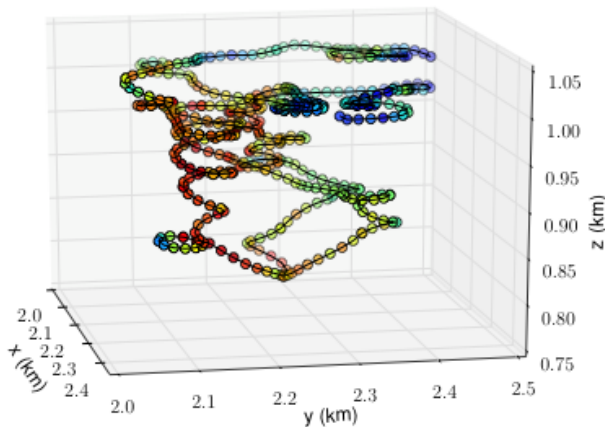
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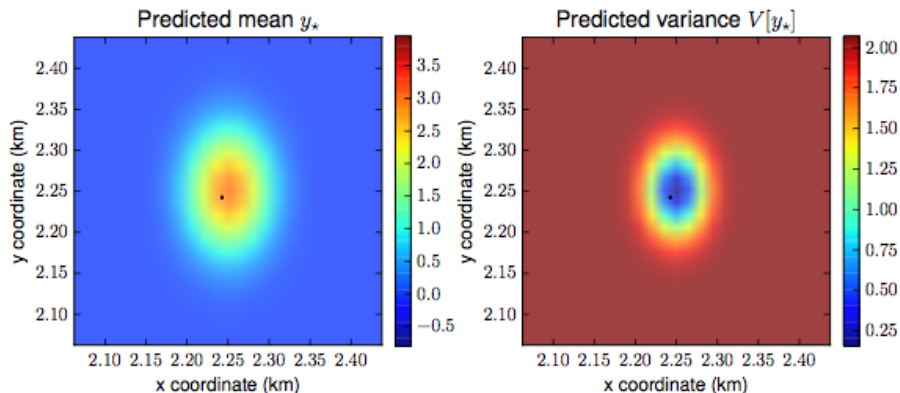
## Main algorithms

**Planning** *Coarse level:* "map those volumes"  
*Fine level:* on-line optimal path generation.



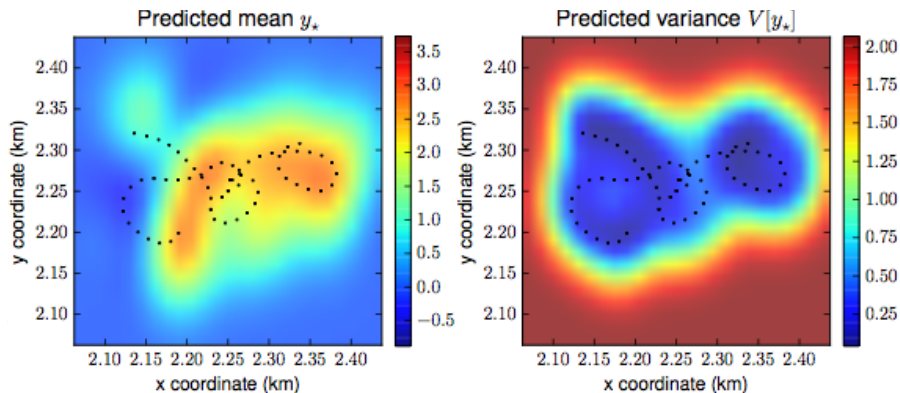
# Main algorithms

## Mapping Gaussian Process Regression to model the cloud



# Main algorithms

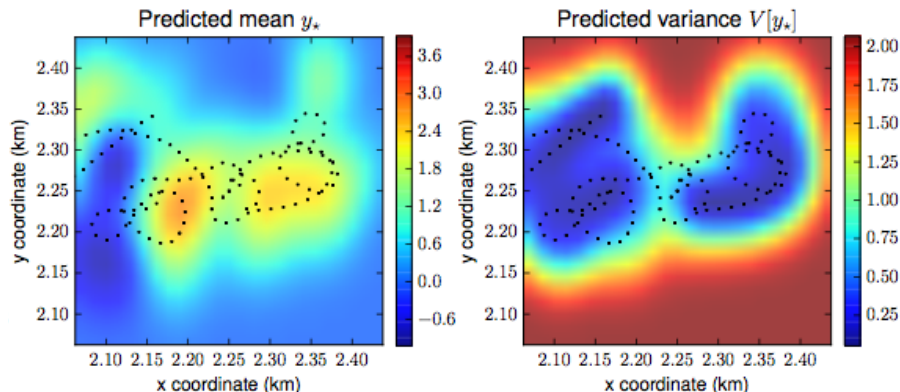
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# Main algorithms

**Mapping** Gaussian Process Regression to model the cloud



# The need for a simulation architecture

Mapping and path planning were yet to be integrated with realistic flight simulators

No existing straightforward way to simulate this kind of system as a whole

Primary goals of this work:

- Build a software architecture integrating realistic simulators
- Integrate the mapping and exploration algorithms within this architecture
- Test and validate the whole system.

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## Simulation backends

Environment:

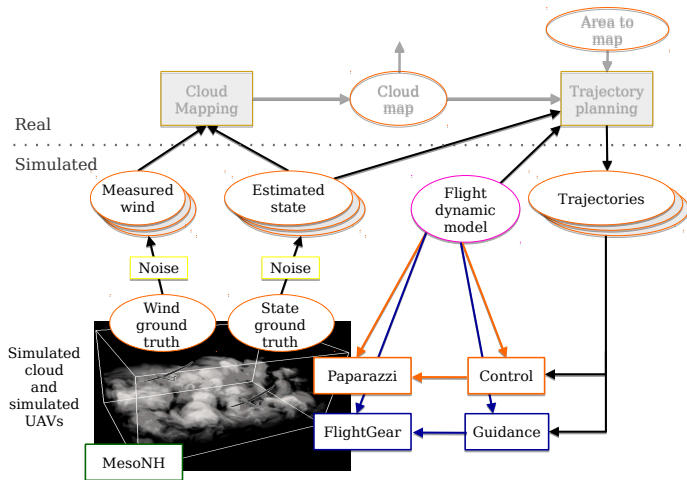
**MesoNH** MeteoFrance's realistic cloud simulator  
Offline generation of a 64 km<sup>3</sup> fair weather scenario

Flight:

**Paparazzi** ENAC's open source autopilot and ground control software

**FlightGear** Open source flight simulator

# Concept of the simulation architecture



# Requirements of the new simulation architecture

Design a new software architecture being able to:

- Be prepared to handle a fleet of aircraft
- Integrate the project's previous work
- Seamless transfer the algorithms to the real implementation
- Add new functionality easily

We decided to use the Robot Operating System (ROS) framework

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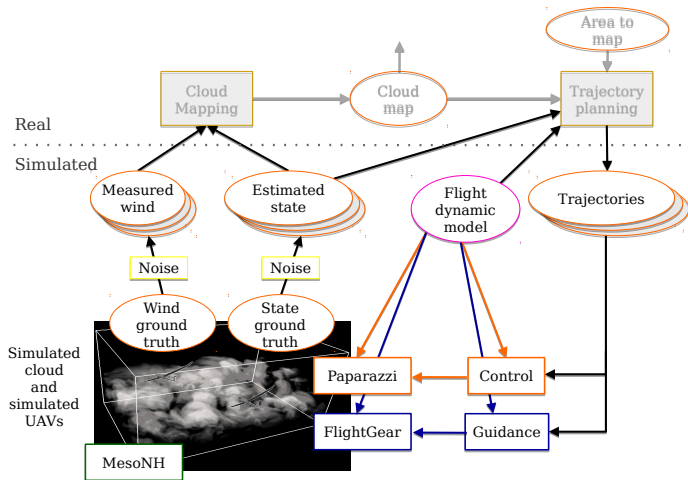
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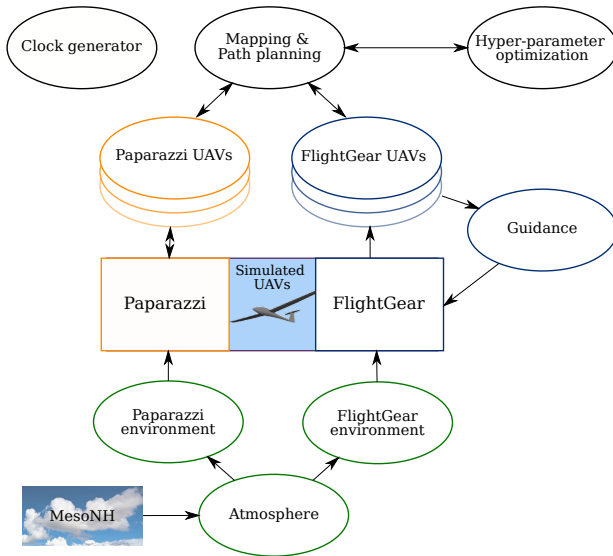
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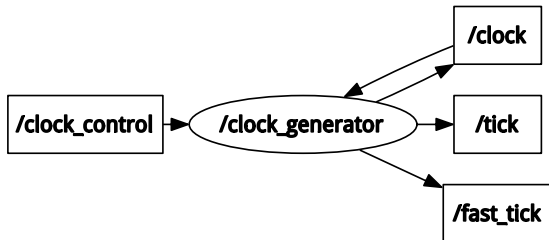
# ROS implementation of the simulation architecture



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# Time management

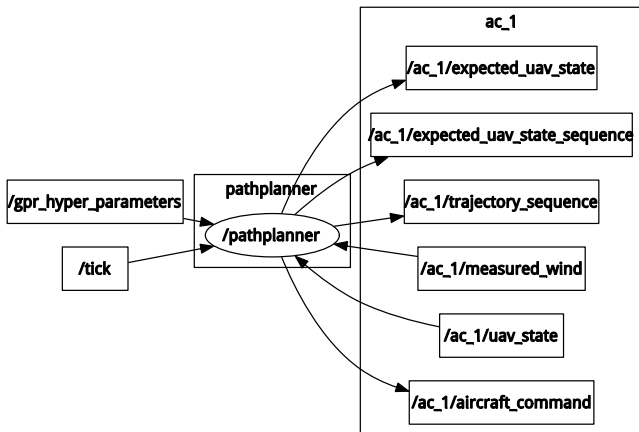


Input (Topic)

Process (Node)

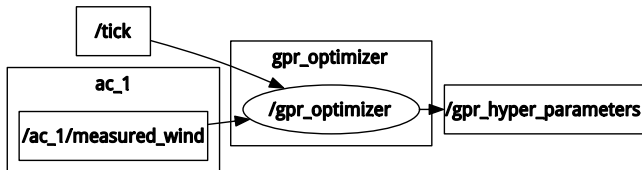
Outputs (Topics)

# Mapping & path planning node



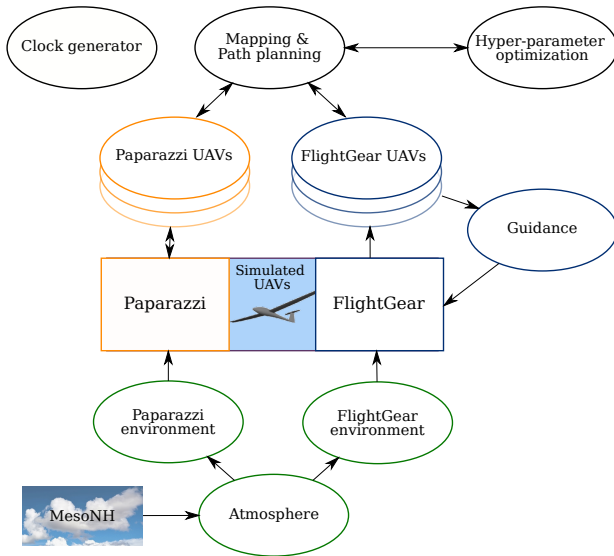
# Gaussian process hyper-parameters optimization

- Improve prediction with increasing wind samples

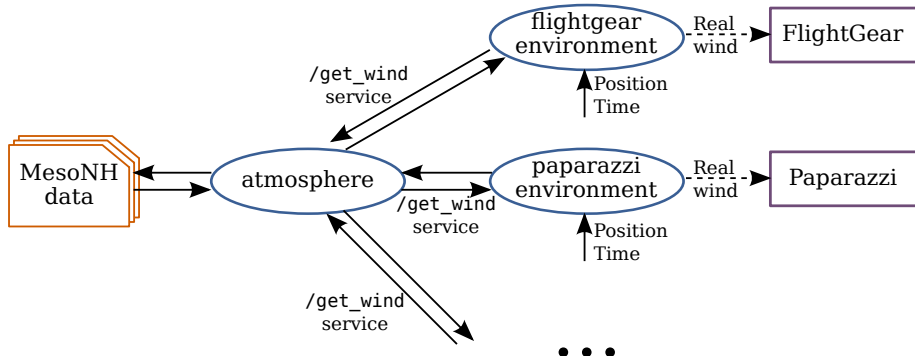




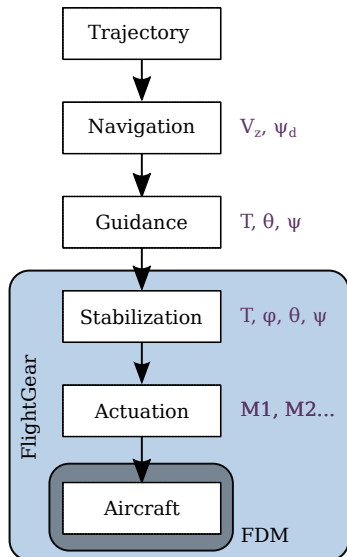
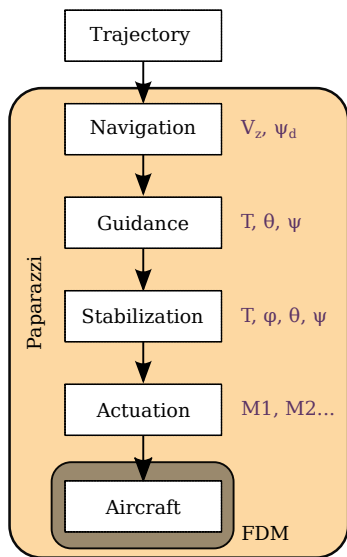
# ROS implementation of the simulation architecture



# MesoNH interface with flight backends



# Paparazzi vs. FlightGear control loops



# Interface with Paparazzi

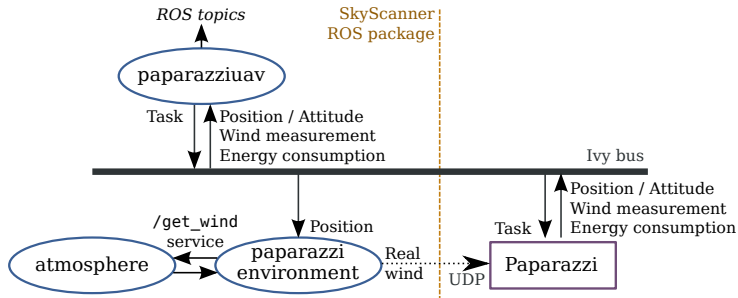


Figure: Interface between Paparazzi and SkyScanner ROS package

# Interface with FlightGear

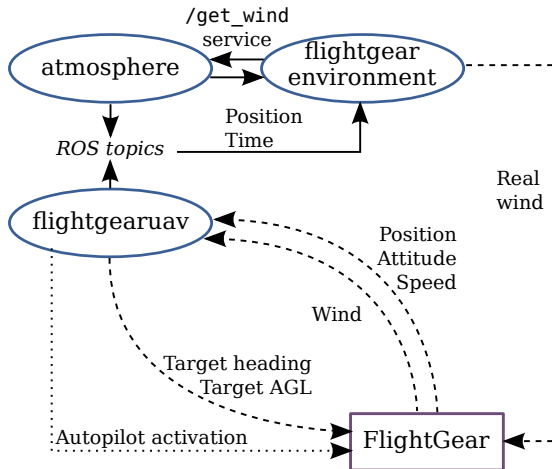


Figure: Interface scheme between FlightGear and SkyScanner ROS package

# The SkyScanner ROS package

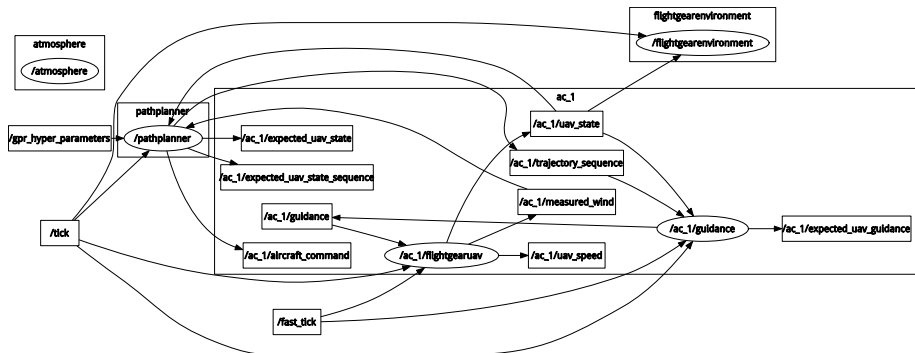
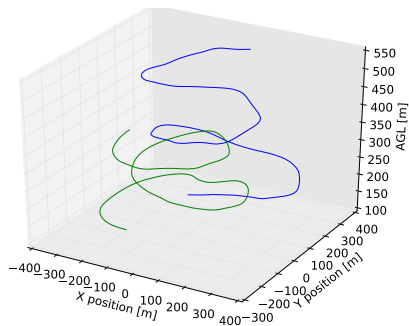
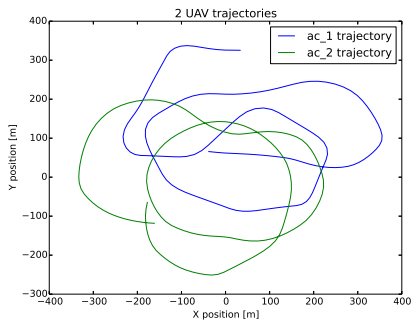


Figure: Whole simulation and control loop

# Resulting trajectories



# Summary

- Deployment of a simulation architecture
  - Path planning and mapping algorithms integration
  - Interfaces with realistic simulators
  - **Extensible & Reusable**
- Available in: [http://github.com/rafael1193/skyscanner\\_integration](http://github.com/rafael1193/skyscanner_integration)

