



## The ONERA ReSSAC Unmanned Autonomous Helicopter : Visual Air-to-Ground Target Tracking in an Urban Environment

**Yoko Watanabe, Charles Lesire, Alain Piquereau & Patrick Fabiani\***  
*Dept. of Systems Control and Flight Dynamics (DCSD)*

**Martial Sanfourche & Guy Le Besnerais**  
*Dept. of Modeling and Information Processing (DTIM)*

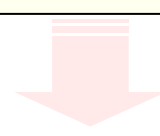


retour sur innovation

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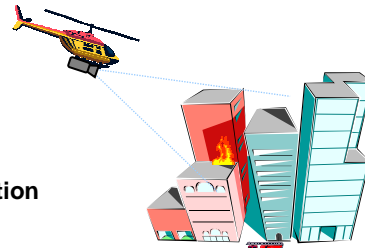
## Mission Scenario 2

**Mission Goal :**  
 To detect, localize, and pursuit a moving ground target  
 - in **an unknown urban environment**  
 - by using **vision information**




**Operation Phases :**

- φ 1. Obstacle Mapping
- φ 2. Target Search & Detection
- φ 3. Target Tracking



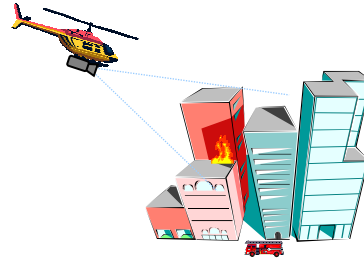
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# Outline

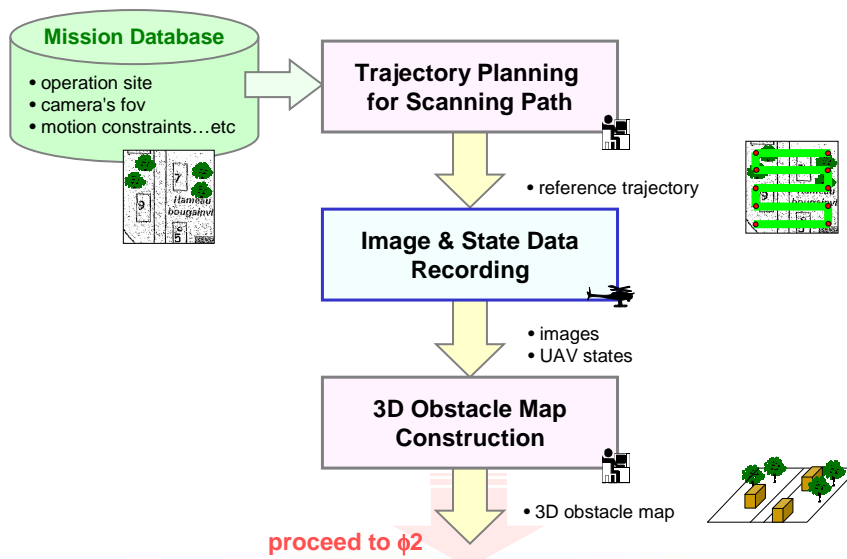
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- **Obstacle Mapping**
- **Target Search & Detection**
- **Target Tracking**
  - vision based tracking
  - compensating for GPS loss
  - optimizing guidance for better tracking
- **Decision & Control integration**
  - architecture
  - simulation and flight experiments
- **Conclusion and perspectives**



# φ1 : Obstacle Mapping

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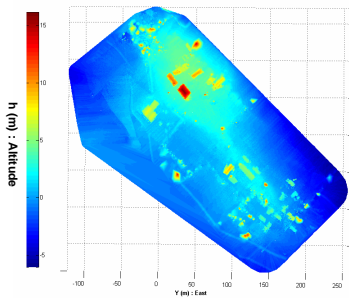


# Elevation Map from Laser Range Finder

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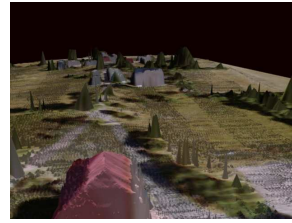


Aerial Image



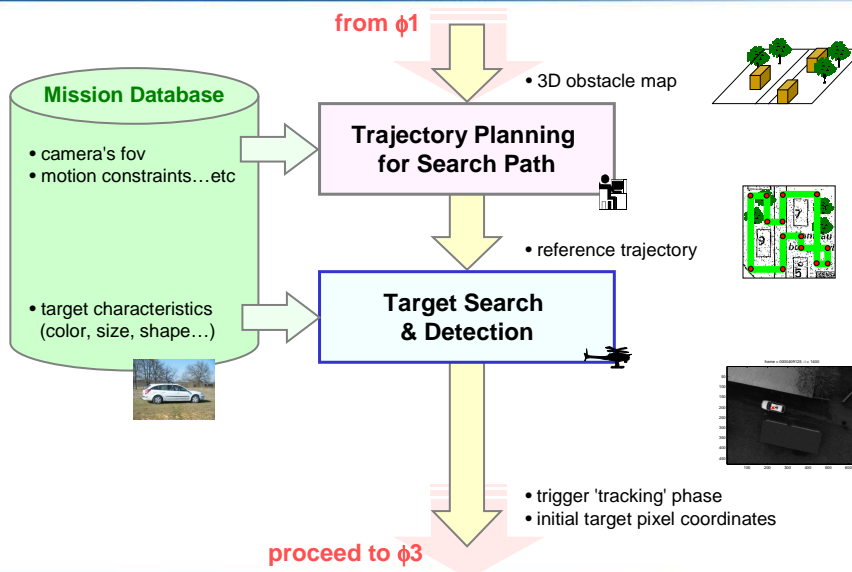
Elevation Map from Laser Range Finder

3D Obstacle Model



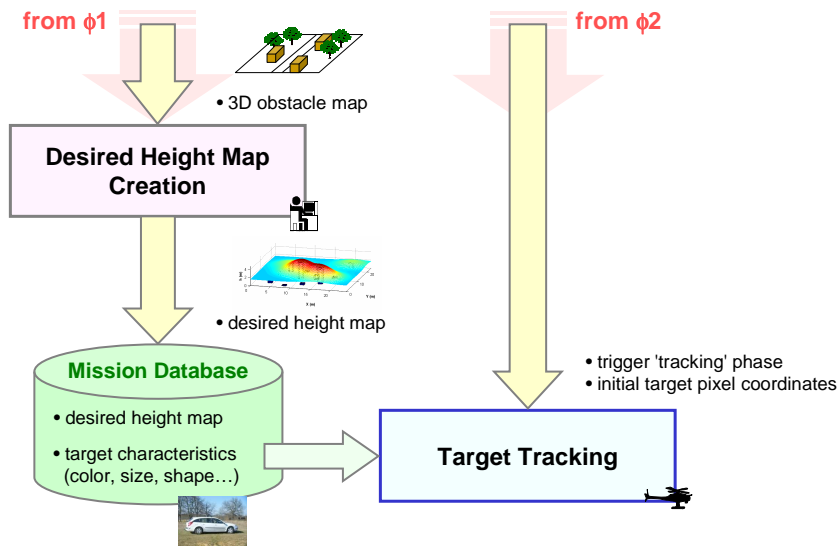
# $\phi 2$ : Target Search & Detection

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## φ3 : Target Tracking

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## Target Tracker

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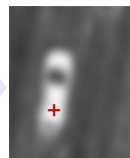
### 1) Window Selection

- centered at a **predicted target position**



### 2) Convolution

- with a Gaussian kernel of **target size**
- hypothesis: target is **'whiter'** than background



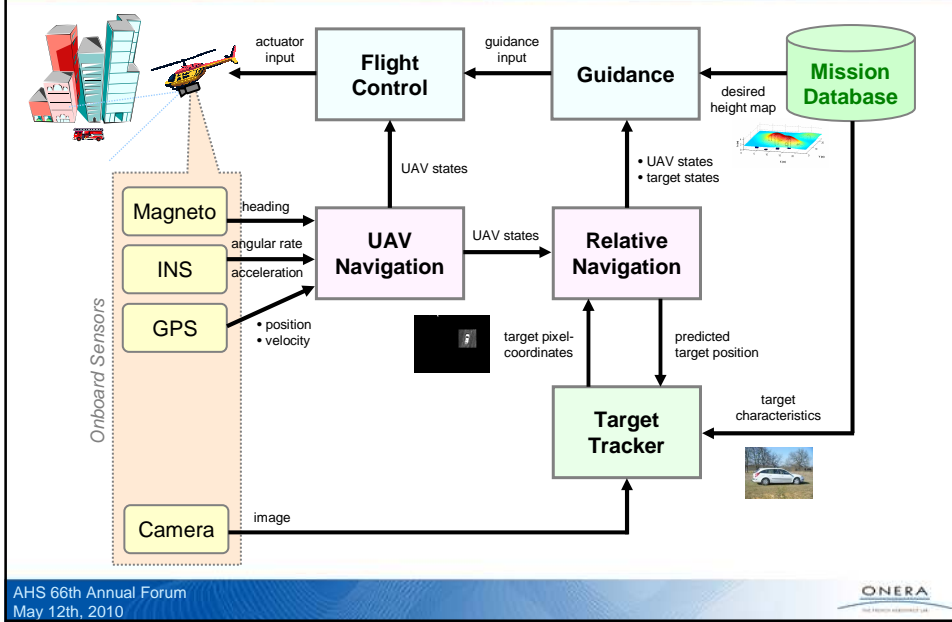
### 3) Selection of point with highest value

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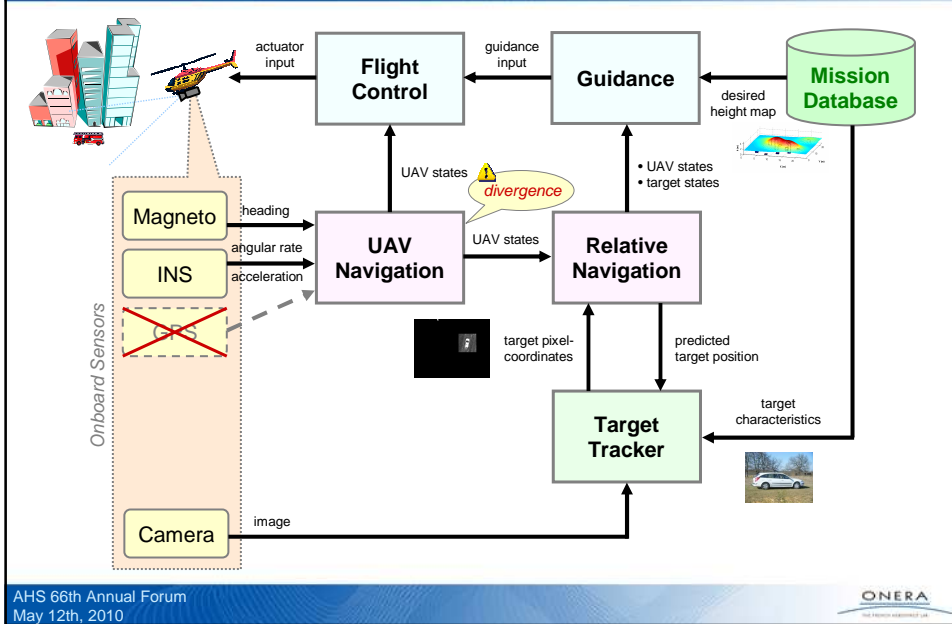
# UAV Onboard System for $\phi 3$

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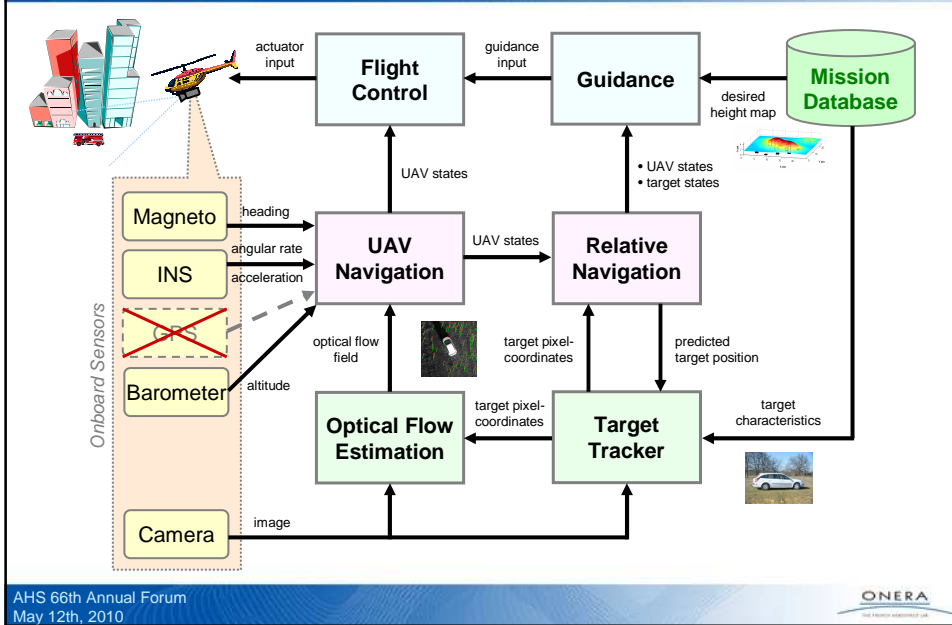
# UAV Onboard System for $\phi 3$

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# UAV Onboard System for $\phi 3$ w/o GPS

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# Optical Flow Estimation

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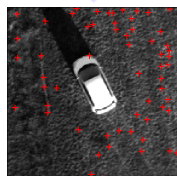
## 1) Window Selection

- centered at a **detected target position**



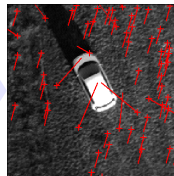
## 2) Feature Point Selection

- Harris detector



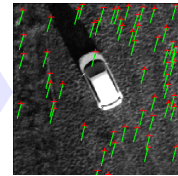
## 3) Feature Matching

- Cross co-relation



## 4) Affine Approximation

- RANSAC

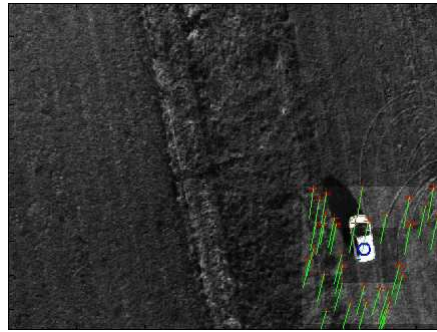


# Optical Flow Measurements

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## Offline Simulation

- With actual image sequence of onboard camera images



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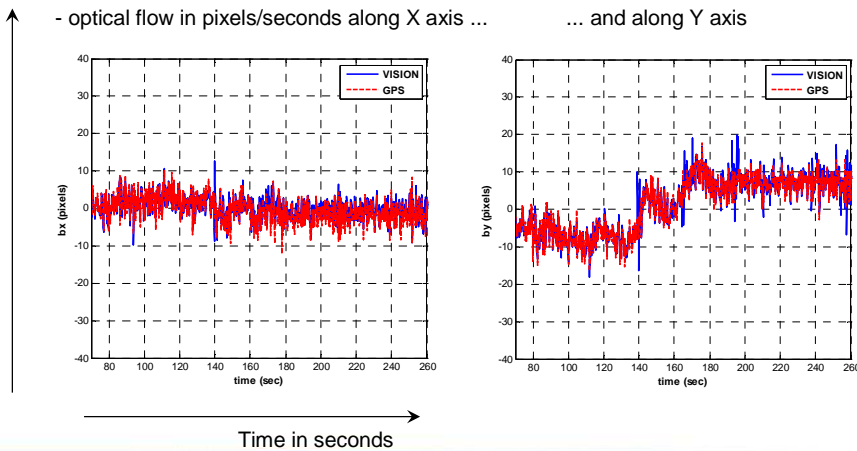
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# Optical Flow Measurements

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## Online in-flight processing

- Compared with the optical flow estimated from GPS velocity measurement
- @ 7 Hz
- optical flow in pixels/seconds along X axis ... .. and along Y axis



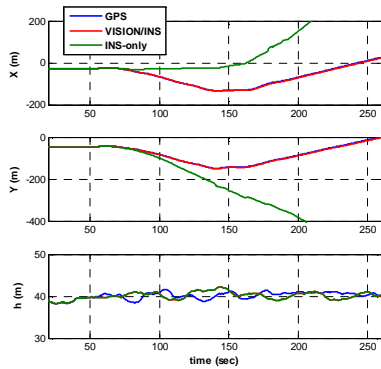
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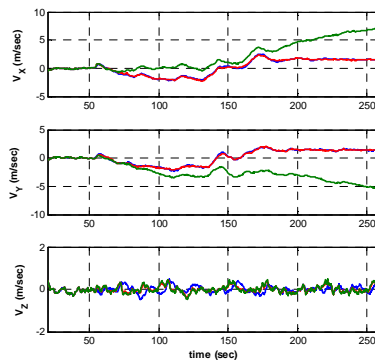
# Vision / INS UAV Navigation

## Offline Simulation of GPS loss navigation with flight test data

### UAV Position Estimation

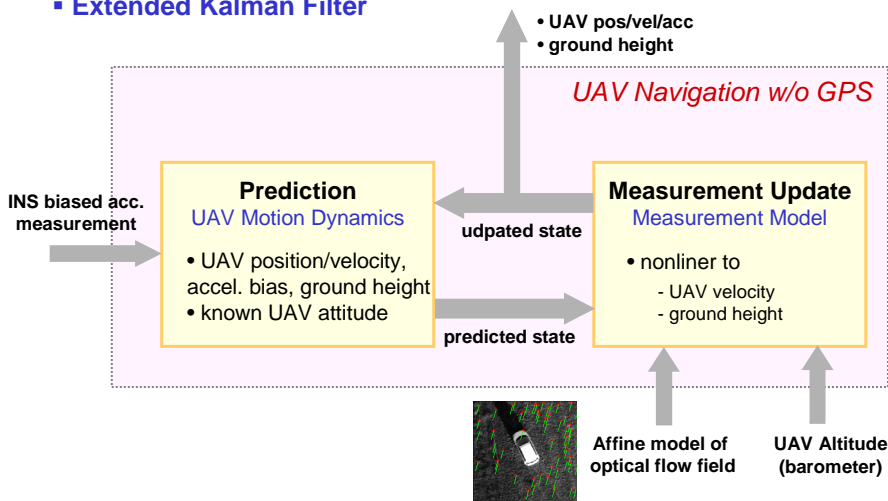


### UAV Velocity Estimation



# UAV Navigation

## Extended Kalman Filter

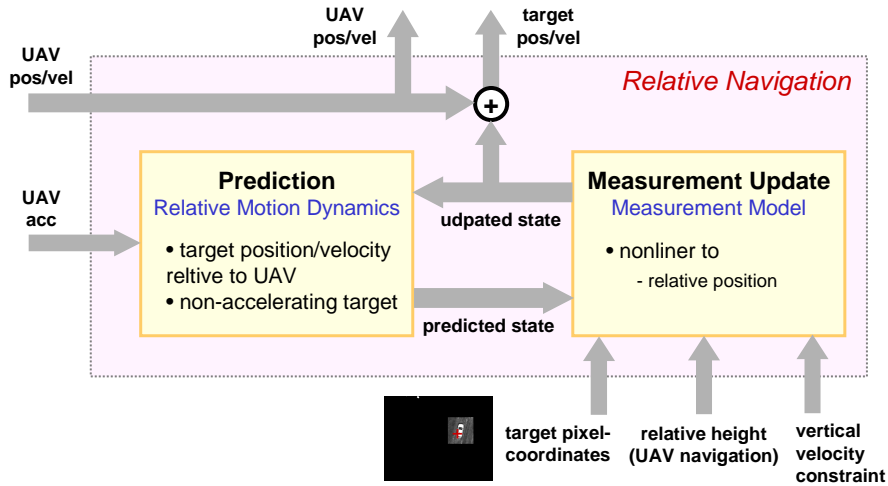




# Relative Navigation

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## Extended Kalman Filter



# Guidance

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## Objective

- Horizontal motion : **Target Tracking**
- Vertical motion : **Obstacle Avoidance** - by following a desired height along the horizontal trajectory

Reference Trajectory :  $\hat{X}_d = \begin{bmatrix} \hat{X}_t \\ \hat{Y}_t \\ -h_d(\hat{X}_v, \hat{Y}_v) \end{bmatrix}$

target position (for  $\hat{X}_t, \hat{Y}_t$ ) and desired height (for  $-h_d(\hat{X}_v, \hat{Y}_v)$ )

## Nominal Guidance (LQR)

- Minimize Total Cost = (Tracking Error) + (Control Effort)

$$a_v = -K_p(\hat{X}_v - \hat{X}_d) - K_d(\hat{V}_v - \hat{V}_d) + \hat{a}_d$$

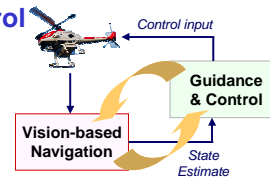
Estimation error can cause poor tracking performance!!

## Guidance (Cont'd)

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### ▪ No Separability between Estimation & Control

- Navigation performance highly depends on relative motion
- Guidance performance directly depends on estimation accuracy



### ▪ One-Step Ahead Optimal Guidance \*

- Minimize **Expected Total Cost** under an assumption that there will be one more measurement at one time-step ahead.

$$a_v = \underbrace{-K_p(\hat{X}_v - \hat{X}_d) - K_d(\hat{V}_v - \hat{V}_d) + \hat{a}_d}_{\text{Nominal Input}} + \underbrace{\Delta a}_{\text{Additional Input}}$$

\* Y. Watanabe  
«Stochastically Optimized Monocular Vision-Based Navigation and Guidance»  
PhD Thesis, Georgia Institute of Technology, 2008.

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## Experimental Platform

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### ▪ ONERA ReSSAC UAV Helicopter



- **YAMAHA RMax**
- length = 3.63 (m), height = 1.08 (m)
- empty weight = 58 (kg), max takeoff weight = 93 (kg)
- GPS, INS, compass, barometer, camera, LRF

### ▪ Onboard Processors



- Primary processor : PC/104 with Pentium 266 MHz
  - GPS/INS navigation filter
  - Security flight controller
- Second processor : PIP11(MPL) hardware unit
  - Pentium M 1.8GHz
  - RS-232, Firewire, Ethernet
  - Decision architecture

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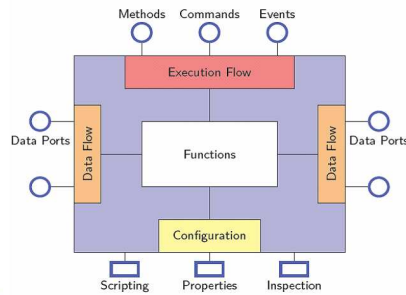


# Decision Architecture

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- GNU/Linux Debian
- Generic Decision & Control Architecture
- OROCOS (Open Robot Control Software)
  - Open source C++ robotics library ( <http://www.oroocos.org> )
  - Real-time toolkit
  - Component based application

- Data ports
- Services

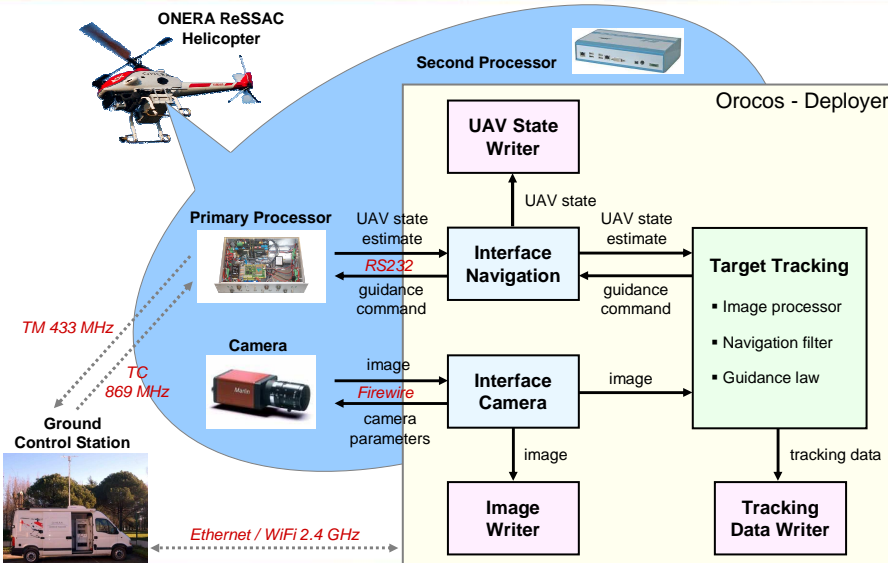


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# ReSSAC Embedded System

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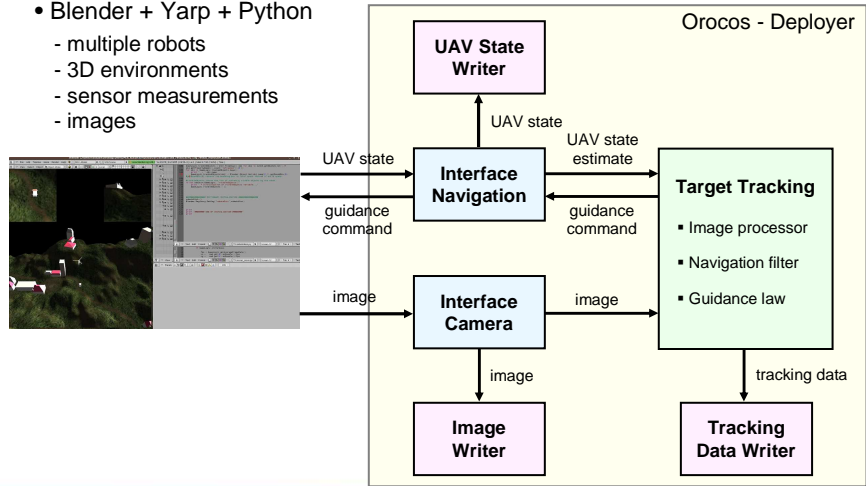


# Software-in-the-loop Simulation

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## OpenRobots Simulator ( <https://launchpad.net/openrobots-simulator> )

- Blender + Yarp + Python
  - multiple robots
  - 3D environments
  - sensor measurements
  - images

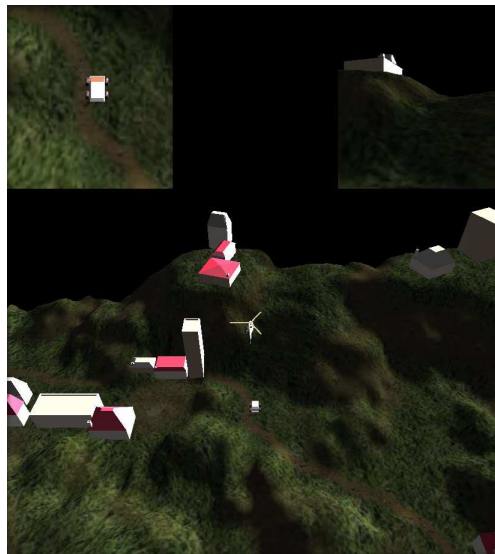


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# Closed-loop Target Tracking Simulation

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# Closed-loop Flight of Target Tracking

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- The first success

- September 30, 2009 @ Esperce

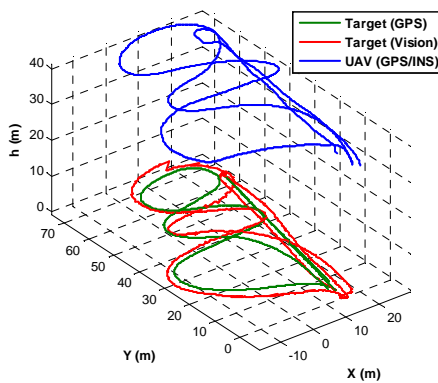


onboard camera image

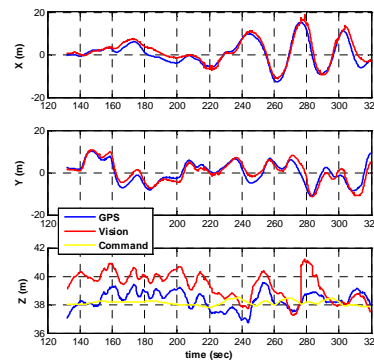
# Closed-loop Flight of Target Tracking

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- UAV and Target Trajectories



- Relative Position Estimation

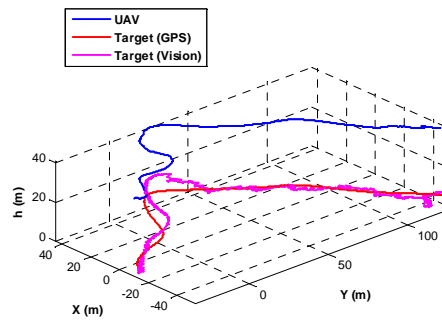
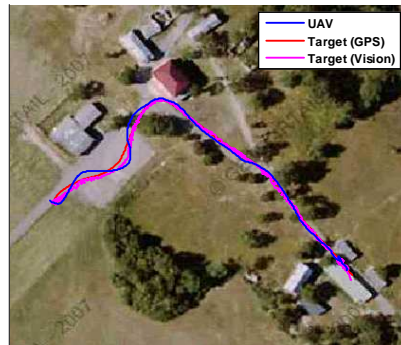


## Closed-Loop Flight of Target Tracking

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### ▪ in the combat training village

- December 09, 2009 @ Caylus



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## Conclusion

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### ▪ UAV Visual Air-to-Ground Target Tracking

- Optical flow estimation
- Vision/INS UAV navigation in case of GPS loss
- System evaluation through simulations and flights

### ▪ Future Work

- Closed-loop flight without GPS (temporarily)
- Target search & tracking scenario demonstration in flight
- Integration with reactive obstacle avoidance (see & avoid)
- Integration with 3D motion planning

### ▪ Scenario extension

- Integration with decision making: motion & perception planning
  - Cooperative multi-robot system

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Thank you for your attention !  
Questions ?



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