



UNIVERSITÀ DEGLI STUDI DI NAPOLI  
FEDERICO II

itee<sup>PhD</sup>  
information technology  
electrical engineering



PhD Francesca Pagano

# Online Optimization-Based Multi-Robot Monitoring

Tutor: Prof. Vincenzo Lippiello

Cycle: XXXVII

Year: 2022

# Candidate's information

- *MSc degree* in Automation Engineering  
University of Naples “Federico II”
- *Research group*: PRISMA Lab – Aerial Robotics
- *PhD start and end date*: 01/01/2022 - 31/12/2024
- *Scholarship type*: PON-Green
- *Company*: Società Agricola “Lenza Lunga” dei F.lli Cacciapuoti
- *Period Abroad*: INRIA-IRISA Rennes, France



# Summary of study activities

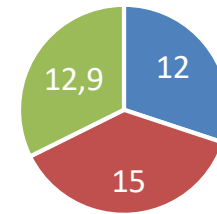
- **Attended Courses:**

- Probability calculus and elements of stochastic modelling
- Operational Research: Mathematical Modelling, Methods and Software Tools for Optimization Problems
- Robotics Lab
- Matrix Analysis for Signal Processing with MATLAB Examples
- Model Predictive Control
- Control of Complex Systems and Network
- Theory and Applications of Contracting Dynamical Systems
- Ethics and AI
- Strategic Orientation for STEM Research & Writing
- Innovation and Entrepreneurship

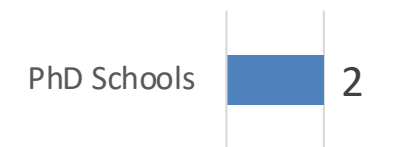
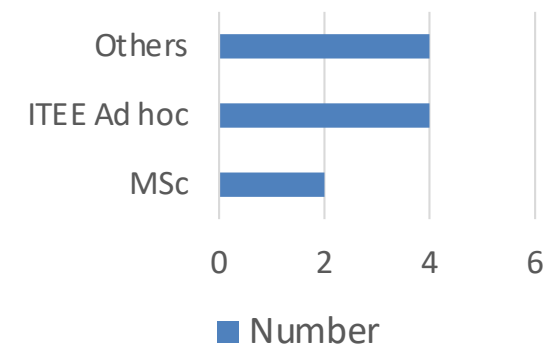
- **PhD Schools:**

- 2022 IEEE RAS Summer School on Multi-Robot Systems
- 2023 Spring School on Course Transferable Skills

Courses Credits



■ MSc ■ Ad hoc ■ Others



# Summary of study activities

- Some seminars:

- IEEE Authorship and Open Access Symposium: Tips and Best Practises to Get Published from IEEE Editors
- Global and cluster synchronization in complex networks and beyond
- On using simple optimization techniques for tuning of UAVs
- IEEE-ICRA 2022 workshop: Shared Autonomy in Physical Human-Robot Interaction: Adaptability and Trust
- IROS 2022 Workshop: Human-Multi-Robot Systems: Challenges for Real World Applications
- Is control a solved problem for aerial robotics research?
- Multi-robot Control of Heterogeneous Herds
- Exploring Advanced Aerial Robotics: A Journey into Cutting- Edge Projects and Neural Control
- From Romeo & Juliet Seminar to OceanOneK Deep- Sea Robotic Exploration
- AI, Robots and Society: Challenges and Opportunities for Social Innovation
- Designing Cooperative Multi-Agent Teams and Socially-Aware Autonomy
- Learning to optimize dynamic behaviors
- On Shapes, Robots, and Sensor-Based Controls
- Agile flight of aerial robots under dynamical uncertainties
- Analytic center selection of optimization-based controllers for robot ecology
- Trends and challenges in collaborative robotics: perception, motion planning and control

Seminars

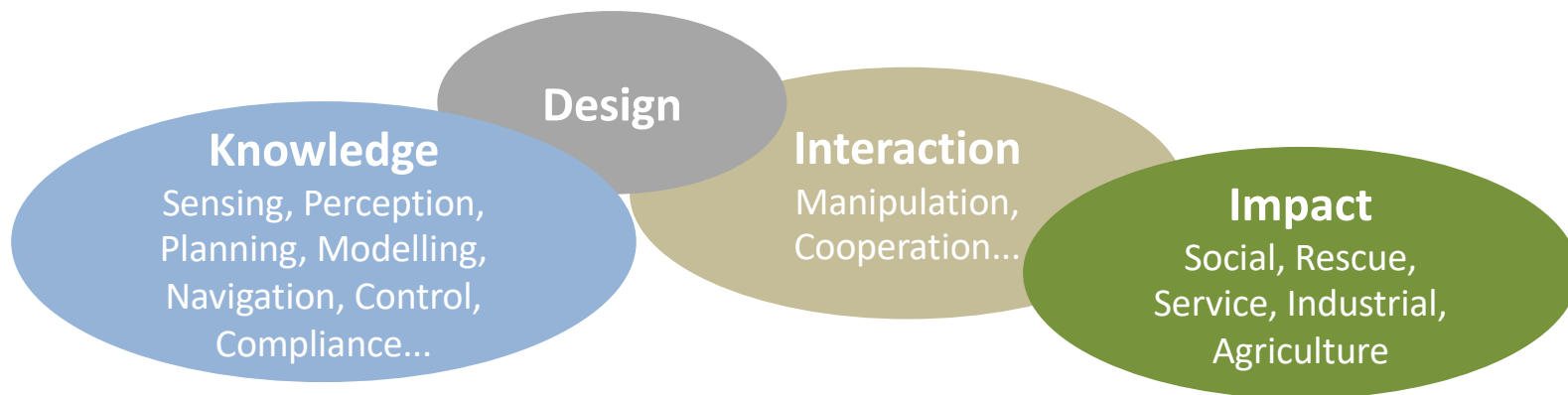
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- Conferences:

- 2023 - *International Conference On Unmanned Aircraft Systems - ICUAS 23* - Warsaw, Poland
- 2024 - *International Conference On Unmanned Aircraft Systems - ICUAS 24* - Chania, Greece
- 2024 - *6th Italian Conference on Robotics and Intelligent Machines - IRIM-3D 2024* - Rome, Italy

# Research area(s)

- **Robotics:** *"Intelligent connection between perception and action"*



- *Main focus:* implement control approaches for autonomous aerial robots

# Research area(s)

- Aerial Robotics

## Research problems

- *Control of custom aerial platforms for interaction tasks*
- *Impact in inspection and maintenance operations in hard-to-reach and dangerous environments*

## Results

- Control Framework to Autonomously Install Clip Bird Diverters on High-Voltage Lines
- Custom flight controller firmware
  - Ease implementation of new control stacks in the standard PX4 firmware for research purposes
  - Tests on multiple aerial platforms: flat and tilting drones



# Research area(s)

- Multi-robot - Aerial Robotics

Impact

9.7 billions people by 2050

- *Robotics* applied to remote sensing and crop monitoring, can play a key role in meeting rising food demands and improving environmental sustainability
- Multi robot teams can reduce time, costs and improve efficiency in real world applications.

Research problems

- Coordinate sensing
- Persistent monitoring
- Heterogeneous robot teams



# Research results

- Multi-robot monitoring tasks
  - I. Proposed two *novel* multi-robot control methodologies to allow
    - I. Persistent monitoring of some points-of-interest with an heterogeneous or homogeneous multi-robot system
    - II. Distributed estimation of a diffusive source with a team of drones
- A optimization-based framework for the execution and prioritization of multiple tasks in a redundant robotic system, allowing online insertion and removal of tasks and dynamic switching of task priorities [P1]



# Research Products

[P1]	G. Notomista, M. Selvaggio, M. Santos, M. Siddharth, <b>F. Pagano</b> , V. Lippiello, C. Secchi <i>Beyond Jacobian-based tasks: Extended set-based tasks for multi-task execution and Prioritization</i> Submitted to <i>IEEE Transaction on Robotics</i> Status: under review
[P2]	S. D'Angelo*, <b>F. Pagano*</b> , F. Ruggiero, V. Lippiello <i>Development of a Control Framework to Autonomously Install Clip Bird Diverters on High-Voltage Lines</i> International Conference on Unmanned Aircraft Systems (ICUAS), Warsaw, Poland, 2023, pp. 377-382, doi: 10.1109/ICUAS57906.2023.10156403
[P3]	S. D'Angelo*, <b>F. Pagano*</b> , F. Longobardi, F. Ruggiero and V. Lippiello <i>Efficient Development of Model-Based Controllers in PX4 Firmware: A Template-Based Customization Approach</i> International Conference on Unmanned Aircraft Systems (ICUAS), Chania, Greece, 2024, 1155-1162, doi: 10.1109/ICUAS60882.2024.10556938.
[P4]	J. Mellet, <b>F. Pagano</b> , F. Ruggiero, V. Lippiello, Simplifying Quadrotor Frame Design: <i>Toward Scalability with a Modular Robot</i> 6th Italian Conference on Robotics and Intelligent Machines, IRIM-3D 2024: Rome, Italy, Oct 25-27. 2024 – To appear in proceedings

\* co-first authors

# PhD thesis overview

- Problem statement

Design and implement **control** strategies to allow a team of robots to **monitor** large areas and retrieve *measure-based information*



- Shifting from a *one-to-many* paradigm can improve efficiency reducing costs and time
- Multi-robot teams can bring enhanced resiliency and leverage *heterogenous* capabilities

- Objective

- Generate robots' motions that maximize information
- Enforcing operative and safety constraints
- Achieve multi-robot coordination
- Provide **online** and reactive solutions
- Allow the execution of multiple concurrent and prioritized tasks

- Methodology

- Optimal control and model-based approaches
- Realistic simulations
- Real experiments
- Statistical data analysis to evaluate relevant metrics

# PhD thesis

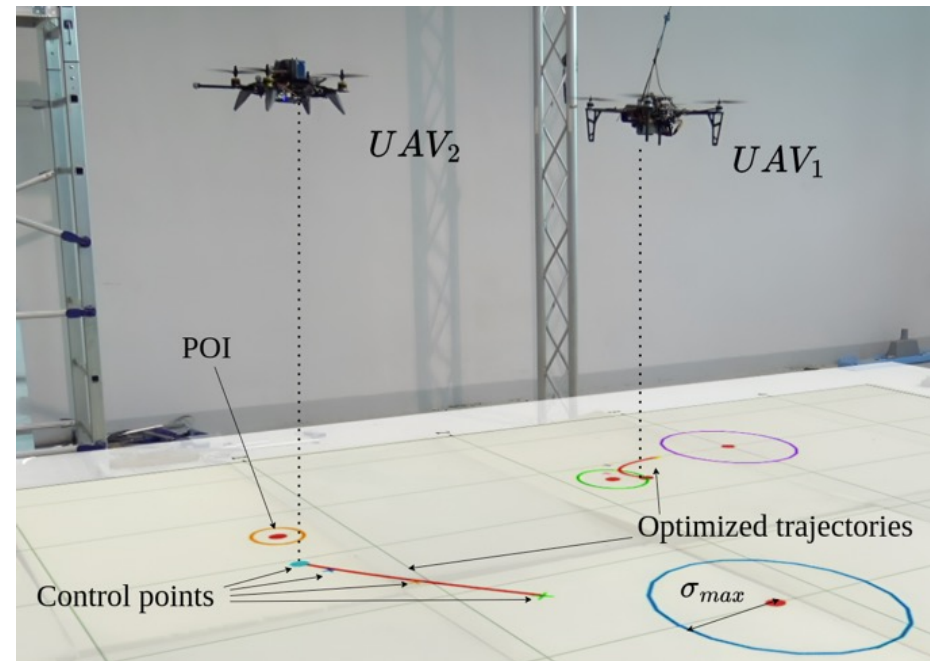
## Multi-robot Nonlinear Model Predictive Control for Persistent Monitoring

- Problem description

- Robots persistent monitoring of some point-of-interest within a known area
- Related to: reconnaissance, surveillance, awareness coverage

- State-of-the-art solutions

- Mainly employ gradient-based control laws without accounting for dynamical constraints and optimization horizon
- No real applications to heterogeneous robotic teams



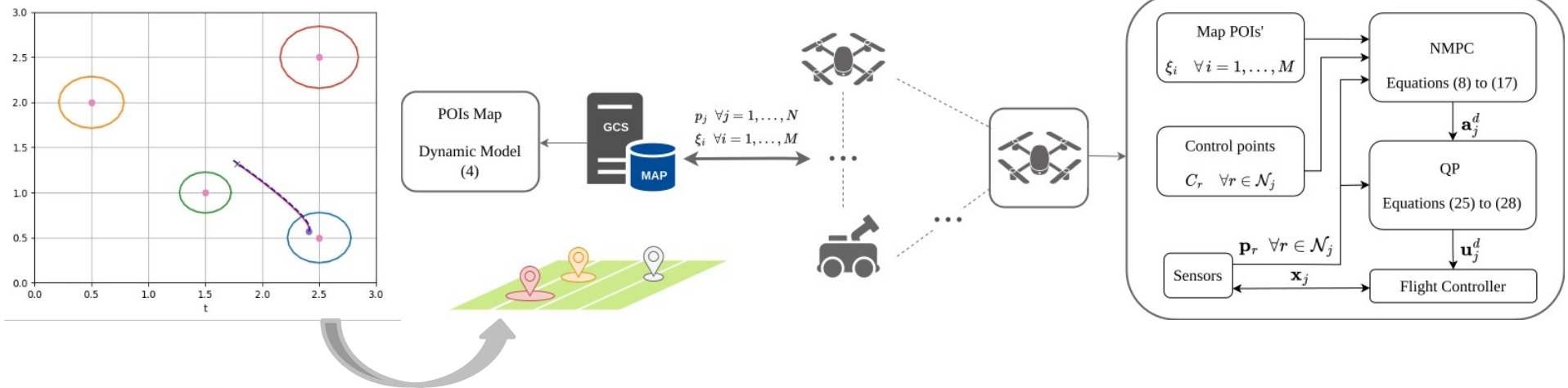
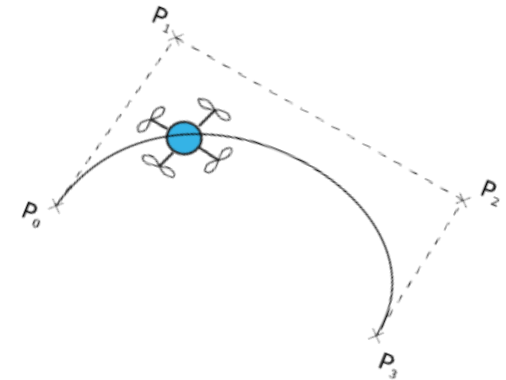
# PhD thesis

## Multi-robot Nonlinear Model Predictive Control for Persistent Monitoring

### • Contribution

Novel methodology using

- POIs artificial, heat-like, dynamic equation, which depends on the agents' positions
- Nonlinear Model Predictive Control (NMPC) to compute online feasible motions using Bezier curves
- QP for safety constraints
- Decentralized implementation with a central Ground Control Station

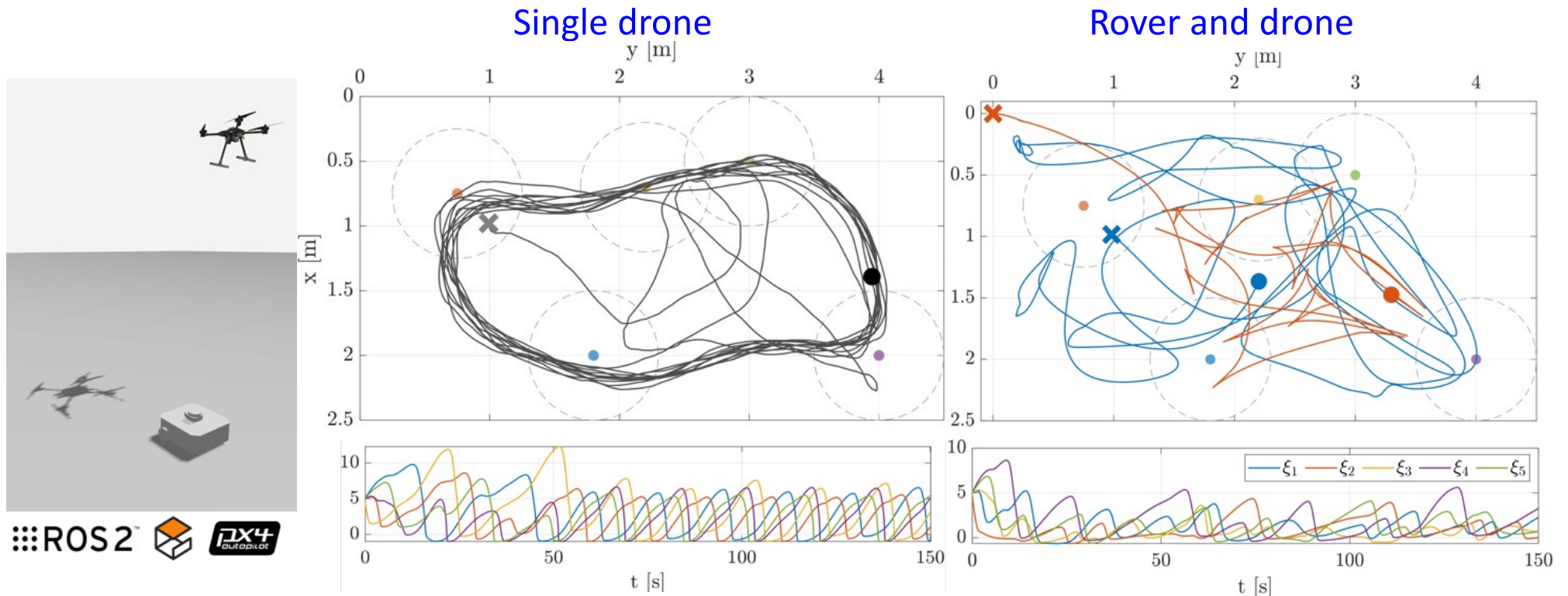


# PhD thesis

## Multi-robot Nonlinear Model Predictive Control for Persistent Monitoring

- Simulation Results

- ROS2-Gazebo/PX4 SITL realistic simulations
- Single, homogeneous and heterogeneous robots scenarios

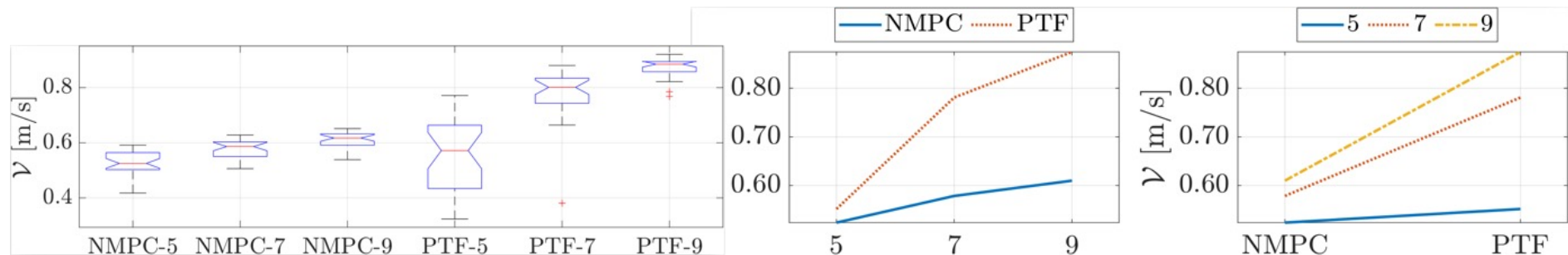


# PhD thesis

## Multi-robot Nonlinear Model Predictive Control for Persistent Monitoring

- Statistical comparison results

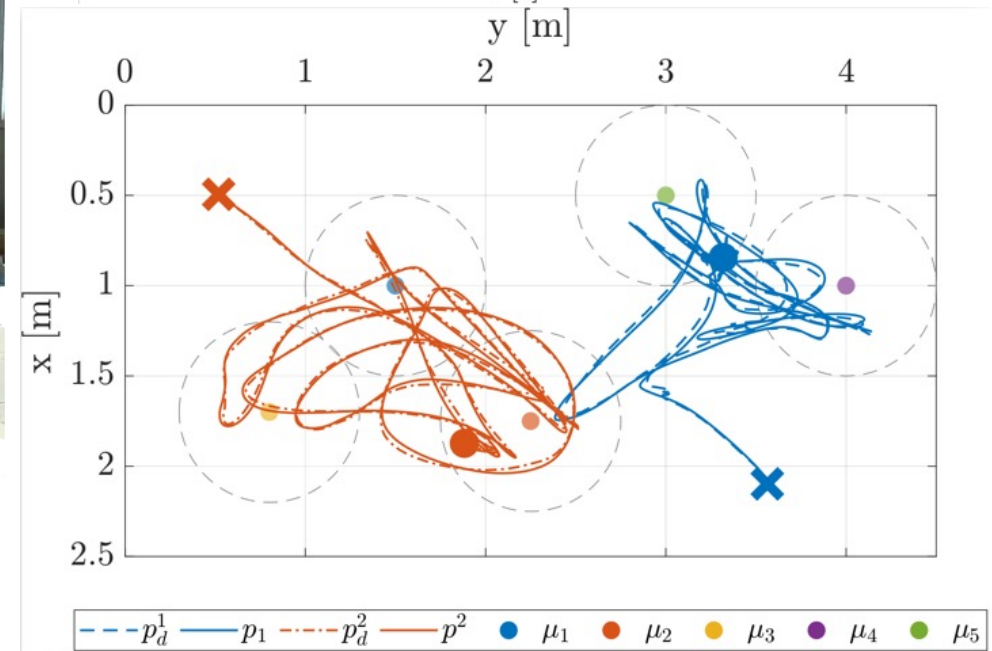
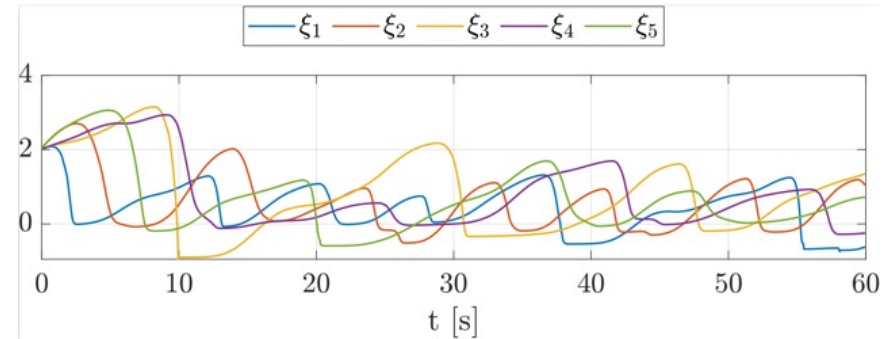
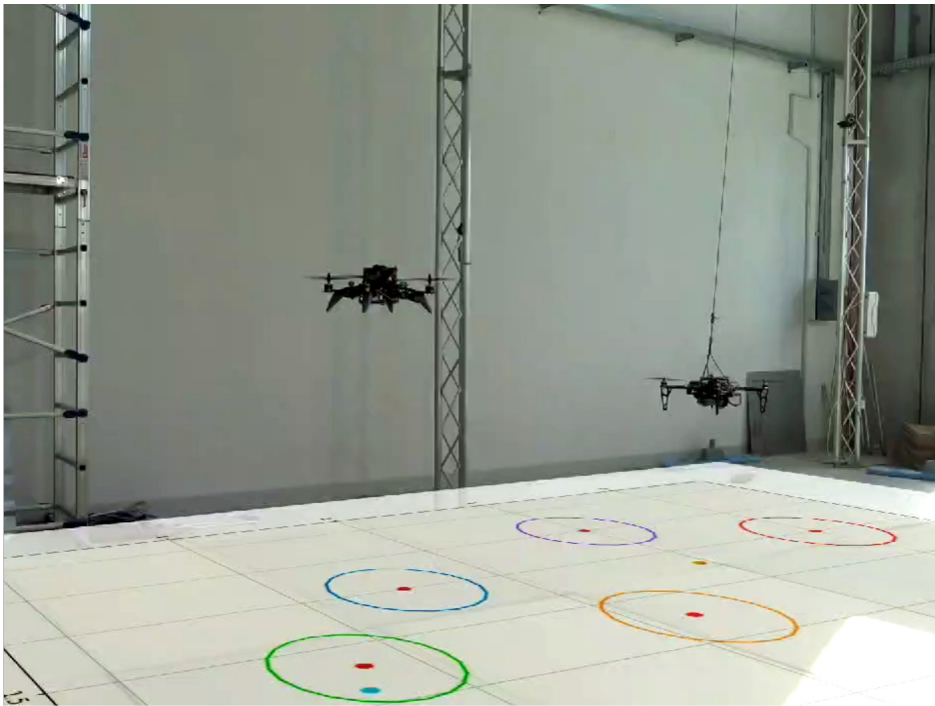
- Extensive simulation campaign to compare the performance of the proposed NMPC to a baseline method
- Evaluation of statistically relevant changes in task-related coverage metrics in 90 randomly generated scenarios with a different number of POIs
- The NMPC outperforms the baseline along the considered metrics attaining lower values of the robotic system velocities



# PhD thesis

## Multi-robot Nonlinear Model Predictive Control for Persistent Monitoring

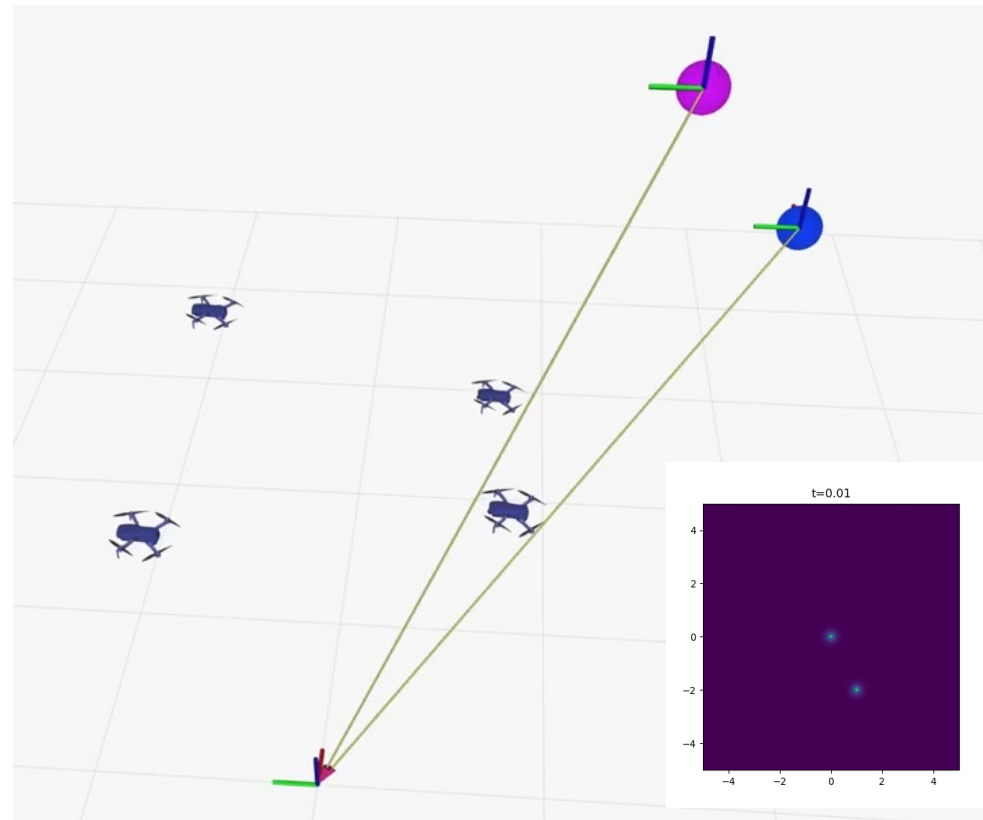
- Experimental Results



# PhD thesis

## Multi-robot Diffusive Source Estimation

- Problem description
  - Estimate a diffusive source 3D location and release rate with a team of robots
  - Applications in environmental monitoring
- State-of-the-art solutions
  - Do not address *continuous release* diffusion models



### Research activity at

- INRIA, Rainbow Team, Rennes (France)
- Supervisor: Dr. Paolo Robuffo Giordano

*Inria*

# PhD thesis

## Multi-robot Diffusive Source Estimation

- Contribution and proposed methodology

- Distributed estimation with *consensus-based* Nonlinear Information Filter with forgetting factor
- Model based approach

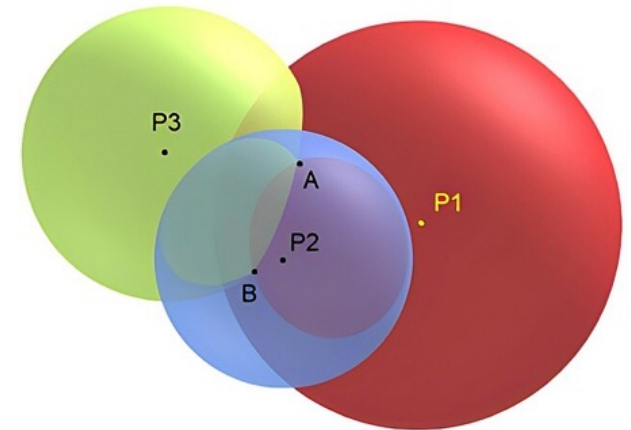
$$y = h(r, q, t) = \frac{q}{4\pi Dr} \left[ 1 - \frac{2}{\sqrt{\pi}} \int_0^{\frac{r}{2\sqrt{Dt}}} \exp(-\eta^2) d\eta \right]$$

- **Online** active sensing: agents move to minimize an *A-optimality* criterion based on the collective *Gramian* as information measure

$$\min_u \text{tr} (G(p, t)^{-1})$$

- QP to ensure safety constraint and boundness of the information

$$\begin{aligned} \min_{u^i} & \|u^i - u_{nom}^i\|^2 \\ & \dot{h}_{src}(p^i, \hat{\mu}) \geq -\alpha(h_{src}) \\ & \dot{h}_{avoid_j}(p^i, p^j) \geq -\alpha(h_{avoid_j}) \\ & \dot{h}_{env}(p^i) \geq -\alpha(h_{env}) \end{aligned}$$



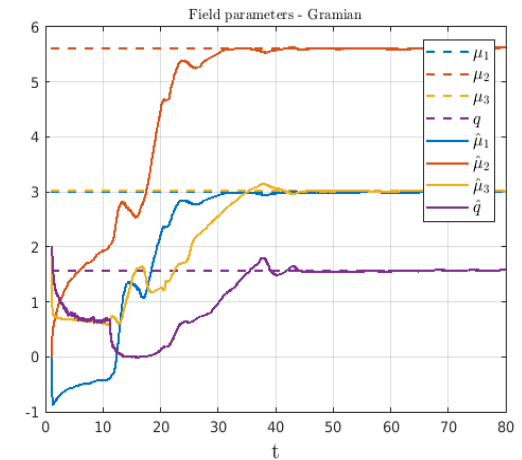
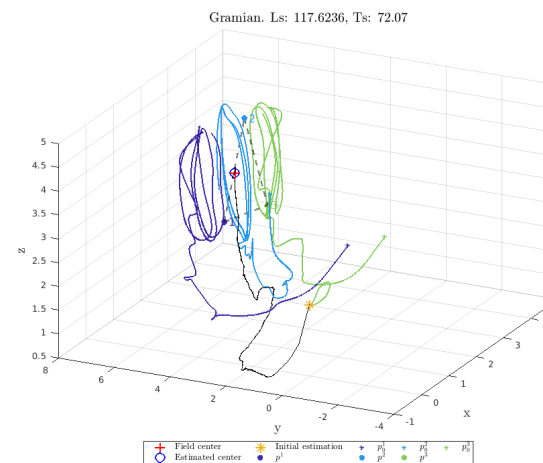
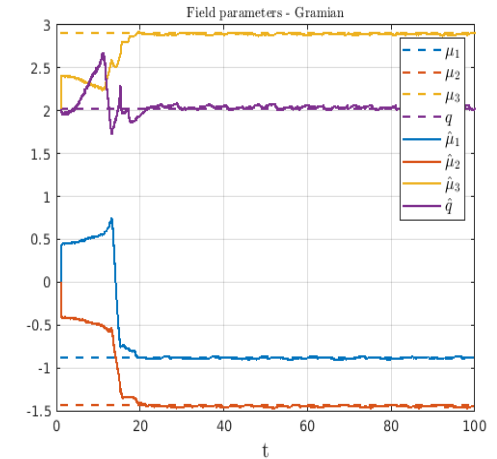
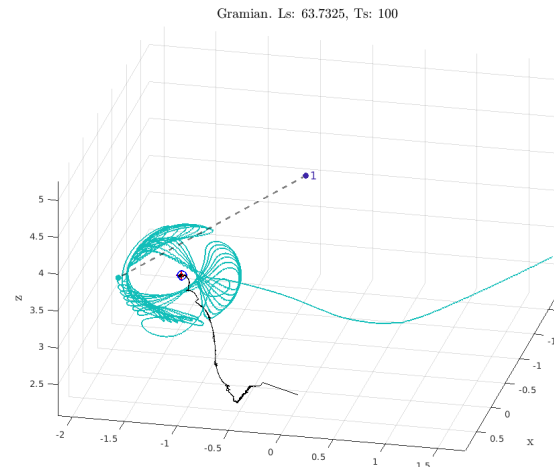
Estimate source location is similar to a trilateration problem

# PhD thesis

## Multi-robot Diffusive Source Estimation

- Simulations

- Understand how the increase on the number of agents affects the estimation convergence
- Which motions are more informative
- Comparison with naïve approaches, varying the agents' number and their velocities



# PhD thesis

## Multi-robot Diffusive Source Estimation

- Experiments
  - Using simulated measurements
  - Crazyflie drones

