



# CS491/691: Introduction to Aerial Robotics

Dr. Kostas Alexis (CSE)

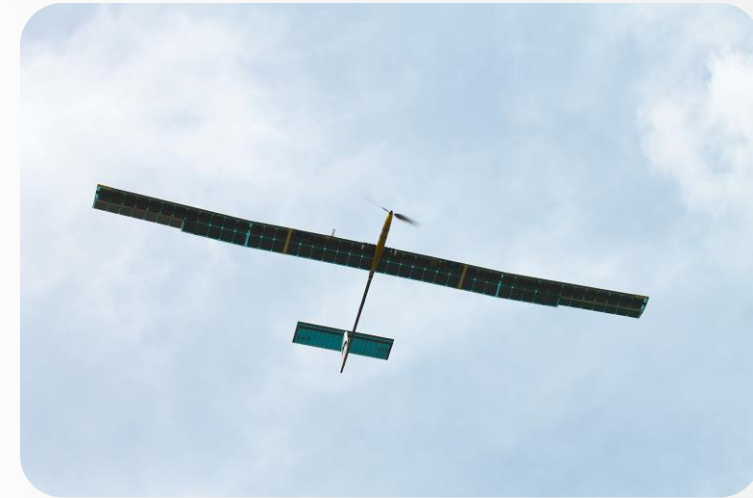
# Course Goals

- Develop a broad understanding on how aerial robots fly and operate.
- Develop the capacity to design navigation and other automation and autonomy robot functionalities.
- Combine theory with intuition and practice.
- Be able to implement new ideas in practice.
- Provide the knowledge background and the tools for your further steps in aerial (and not only) robotics.



# Course Approach

- **Brief Overview and Focus Sections:** Each topic is overviewed and selected subtopics are thoroughly described.
- **Coding Examples:** Each focus section is accompanied with coding examples using Python, MATLAB and C++
- **Project-oriented:** You will be asked to implement your ideas in practice and therefore develop more solid understanding by doing so.
- Be Proactive & Autonomous: come and discuss what you want to understand better or what you want to know more about. Grow your own ideas.





# Course Contents



- **Introduction:** Get a broad understanding about aerial robotics, what they are, what they look like, what they can do and how they do so.
- **Modeling:** Understand the physical principles behind the flight dynamics of aerial robotics and develop the capacity to derive their mathematical model.
- **State Estimation:** Learn how on-board estimation of the vehicle full pose (position and orientation) takes place.
- **Flight Controls:** Learn how to design high-performance flight controllers.
- **Motion Planning:** Learn how to develop algorithms for autonomous motion planning for aerial robotics.
- **Case Study and Design Projects:** Go through a design experience.



# Course Material



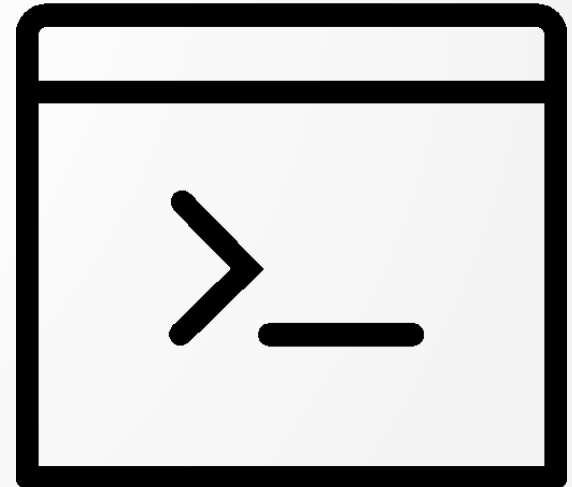
- **Online Textbook:** a brief textbook covering the topics of the course. To be continuously updated every year.
- **Textbook:** Small Unmanned Aircraft: Theory and Practice
- **Lecture Slides:** Used for the classroom presentations and also as a way for notes keeping and direct reference to the course contents.
- **Coding Examples:** small programs written in Python, MATLAB, and C++ covering the focus sections of the course.
- **Open-Source Aerial Robots Simulator:** a complete simulation environment for advanced designs.
- **Get the course material:** The complete set of the relevant materials are available at: <http://www.autonomousrobotslab.com/introduction-to-aerial-robotics.html>

# Course Grading System

- **Design Project with intermediate report: 40%**
- **Homework: 15%**
- **Mid-term Exam: 20%**
- **Final Exam: 25%**

Tentative scale (curve will be applied)

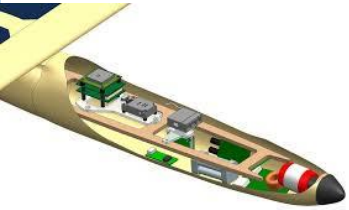
- **Grade  $\geq 90$ : A**
- **$80 \leq \text{Grade} \leq 89$ : B**
- **$70 \leq \text{Grade} \leq 79$ : C**
- **$60 \leq \text{Grade} \leq 69$ : D**
- **$59 \geq \text{Grade}$ : F**



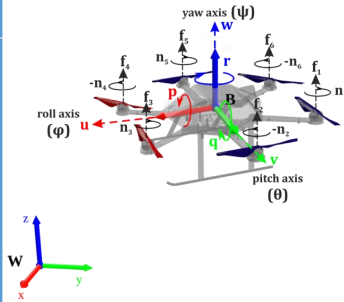


# Course Projects

## System Design



## Modeling



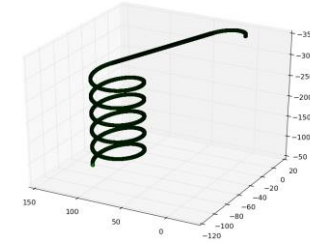
## Estimation



## Flight Control



## Path Planning

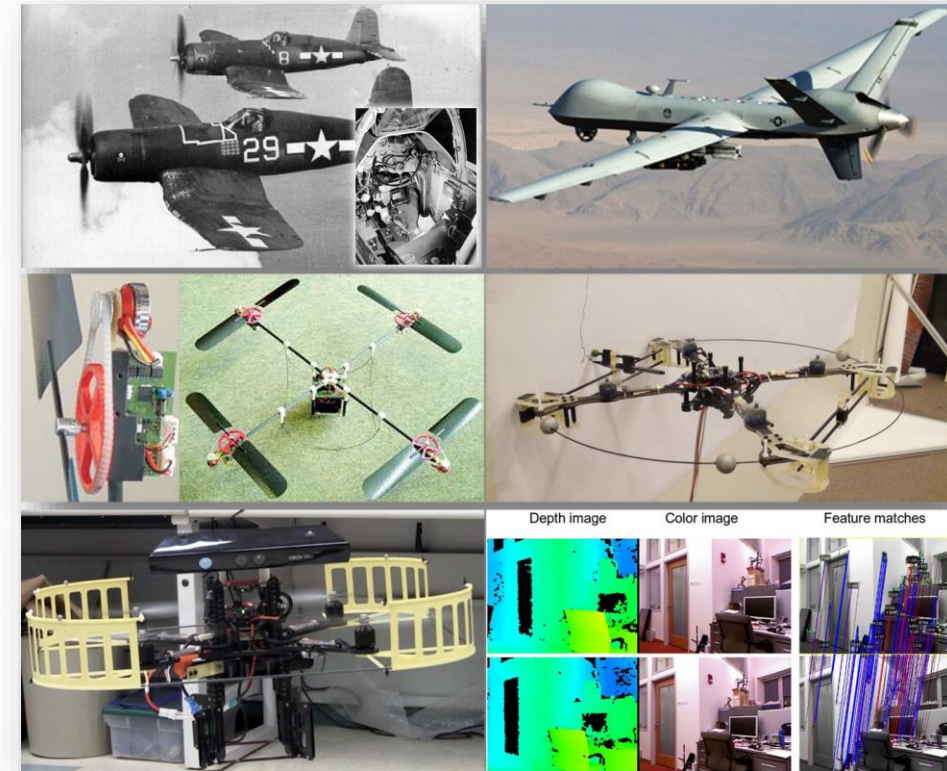


## Perception



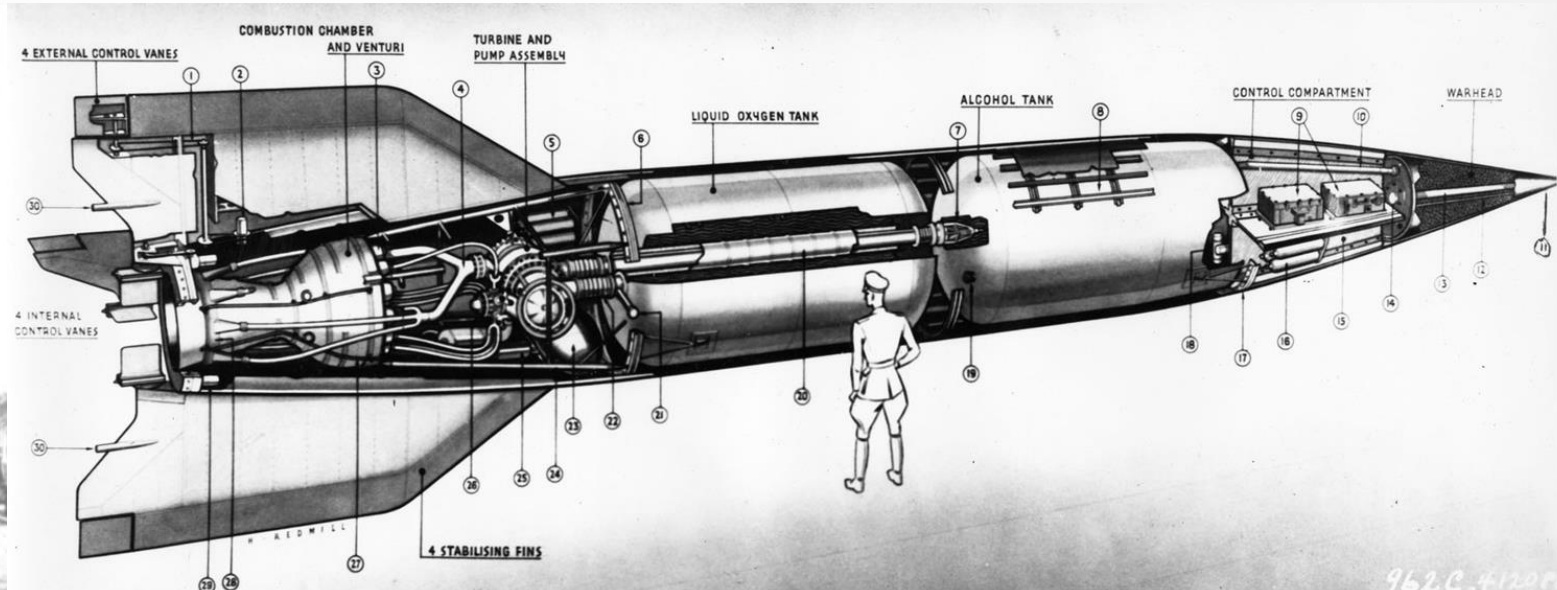
# Historical Background of Aerial Robots

- ▶ Unmanned Aerial Vehicles lie on the foundations set in aircraft design & automatic flight control.
- ▶ First UAVs were based on modifications of manned rocket and aircraft designs.
- ▶ Their evolution process has constantly challenged the limits of technology towards miniaturization, flight control agility, perceptual skills, navigational autonomy, flight endurance or even unconventional skills such as aerial manipulation.





# Historical Background of Aerial Robots



V2 Rocket photo and diagram

# Historical Background of Aerial Robots



Predator UAV used by NASA



AscTec Hummingbird used by TUM

# The main challenges of Aerial Robotics

How do I ...





# The main challenges of Aerial Robotics

Propulsion and Vehicle Dynamics

How do I move?



# The main challenges of Aerial Robotics

Perception and State Estimation

Where am I?  
What is my  
environment?





# The main challenges of Aerial Robotics

Guidance and Control

How do I control  
where to go?



# The main challenges of Aerial Robotics

## Path Planning

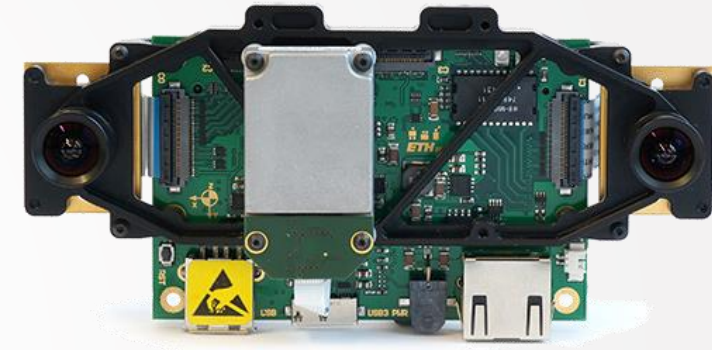
How do I plan  
my motion and  
actions?



# Current Trends in Aerial Robotics



- System Miniaturization
- Prolonged Endurance
- Agile Flight Control
- Perception & 3D Mapping
- Autonomous Motion Planning
- Multi-Robot Systems
- Augmented Human-Robot



# Current Trends in Aerial Robotics

## Fast Nonlinear Model Predictive Control for Multicopter Attitude Tracking on $SO(3)$

Mina Kamel, Kostas Alexis, Markus Achtelik and Roland Siegwart



Position tracking without one propeller



Retaining Stability during Propeller Failure



Convertible Unmanned Aerial Vehicle

**Relevant Web link:** <http://www.autonomousrobotslab.com/agile-and-physical-interaction-control.html>



# Current Trends in Aerial Robotics

Today's Unmanned Aerial Vehicles (UAVs) have **great prospects**

**Endurance World Record (81.5 Solar-powered Flight)**



**Aerial Mapping**

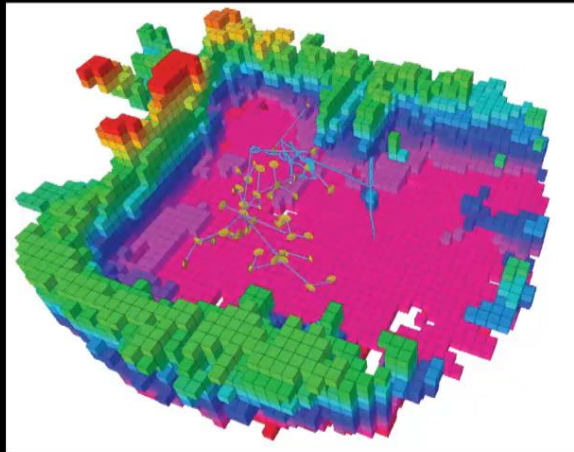
**Relevant Web link:** <http://www.autonomousrobotslab.com/fixed-wing-uavs.html>



# Current Trends in Aerial Robotics

## Receding Horizon "Next-Best-View" Planner for 3D Exploration

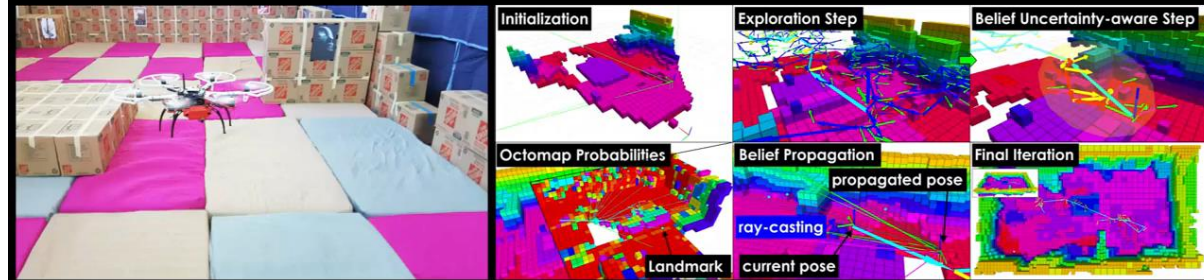
Andreas Bircher, Mina Kamel, Kostas Alexis, Helen Oleynikova and Roland Siegwart



Information Gain-based Efficient Exploration and 3D mapping of Unknown Environments

## Uncertainty-aware Receding Horizon Exploration and Mapping using Aerial Robots

Christos Papachristos, Shehryar Khattak, Kostas Alexis



Uncertainty-aware Receding Horizon Exploration and Mapping

**Relevant Web link:** <http://www.autonomousrobotslab.com/autonomous-navigation-and-exploration.html>

# Current Trends in Aerial Robotics

## Exploration and Mapping in Visually-degraded Environments Preliminary results

C. Papachristos, S. Khattak, F. Mascarich, K. Alexis



This material is based upon work supported by the Department of Energy under Award Number [DE-EM0004478]



Degraded visual environment exploration and mapping

## Preliminary Results on Multi-modal fusion for Autonomous Vehicle Localization - Garage Navigation / Fused Map



Multi-modal fusion for localization and mapping

**Relevant Web link:** <http://www.autonomousrobotslab.com/localization-and-3d-reconstruction.html>

# Current Trends in Aerial Robotics

## Hybrid Predictive Control for Aerial Robotic Physical Interaction towards Inspection Operations

Georgios Darivianakis, Kostas Alexis, Michael Burri, Roland Siegwart



## Tree Cavity Inspection using Aerial Robots

Kelly Steich, Mina Kamel, Paul Beardsley,  
Martin K. Obrist, Roland Siegwart and Thibault Lachat



**ETH** zürich  Autonomous Systems Lab

 Disney Research, Zurich



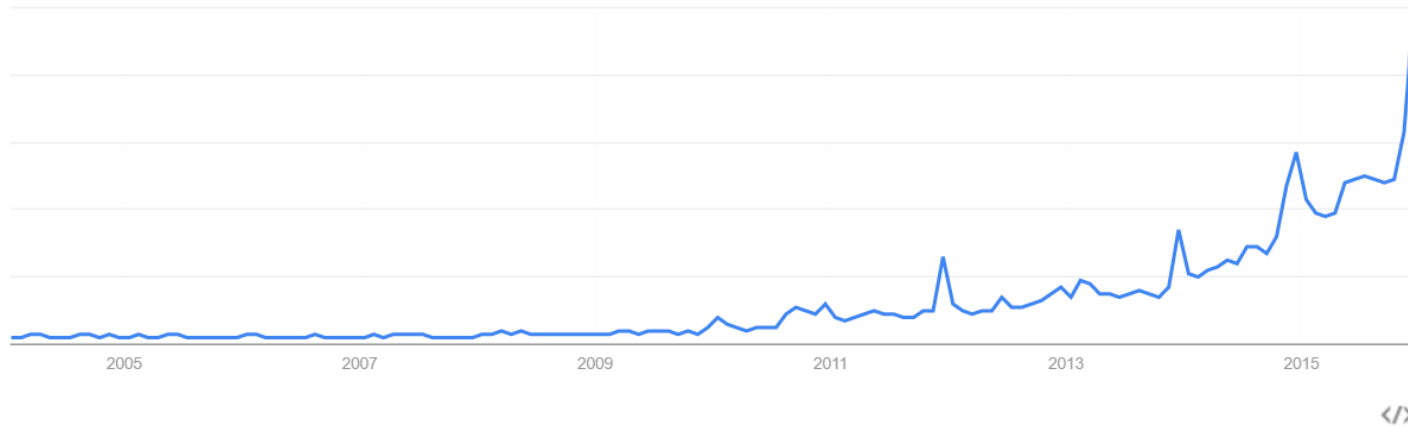
Physical Interaction Control

**Relevant Web link:** <http://www.autonomousrobotslab.com/agile-and-physical-interaction-control.html>



# Impact in Society

Google trends "Drones"



- Unmanned Aerial Vehicles (UAV) Market worth 14.9 Billion USD by 2020



## ■ Indicative Applications:

- Infrastructure Inspection and Maintenance
- Humanitarian Assistance
- Precision Agriculture
- Climate Control
- Security
- ...and much more!

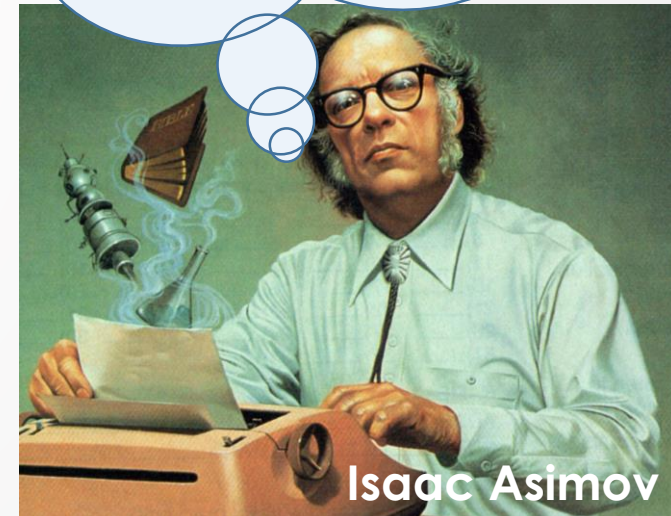


# What are the challenges ahead?

No sensible decision can be made any longer without taking into account not only the world as it is, but the world as it will be. **I.A.**

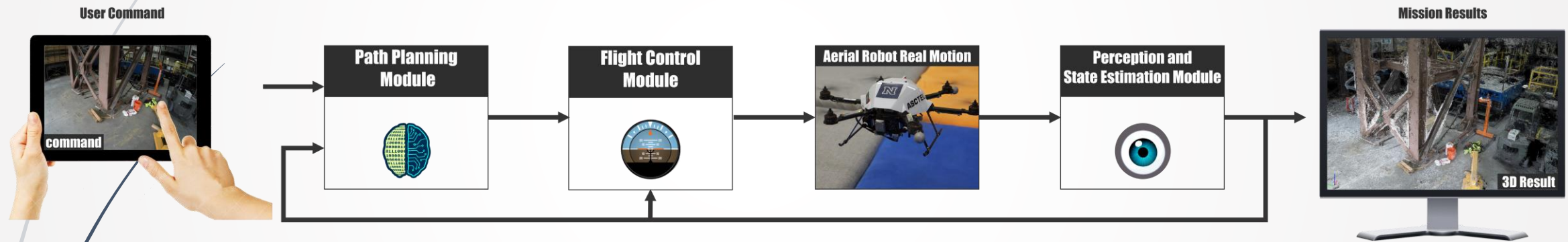
- ▶ Can we operate aerial robots without having special skills?
- ▶ Can aerial robots be something more than a flying camera?
- ▶ Can we assign complex tasks to autonomous robots?
- ▶ Can we ensure collision avoidance?
- ▶ Can we trust an aerial robot flying in the urban landscape? In the controlled national airspace?

- ▶ a robot may not injure a human being or, through inaction, allow a human being to come to harm
- ▶ a robot must obey orders given it by human beings except where such orders would conflict with the first law
- ▶ a robot must protect its own existence as long as such protection does not conflict with the first or second law



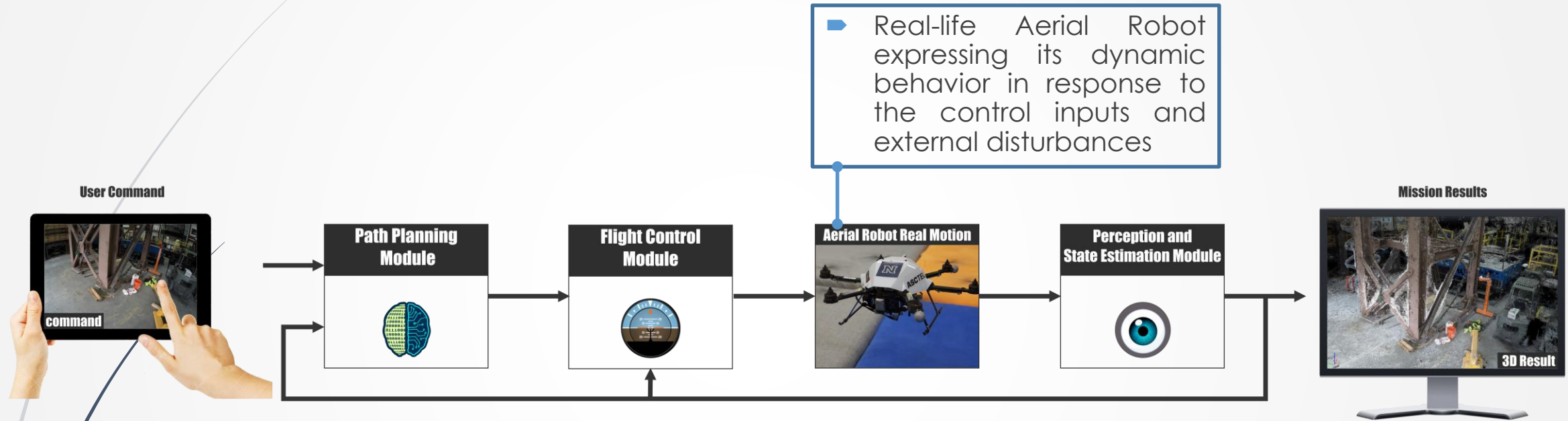


# The Aerial Robot Loop

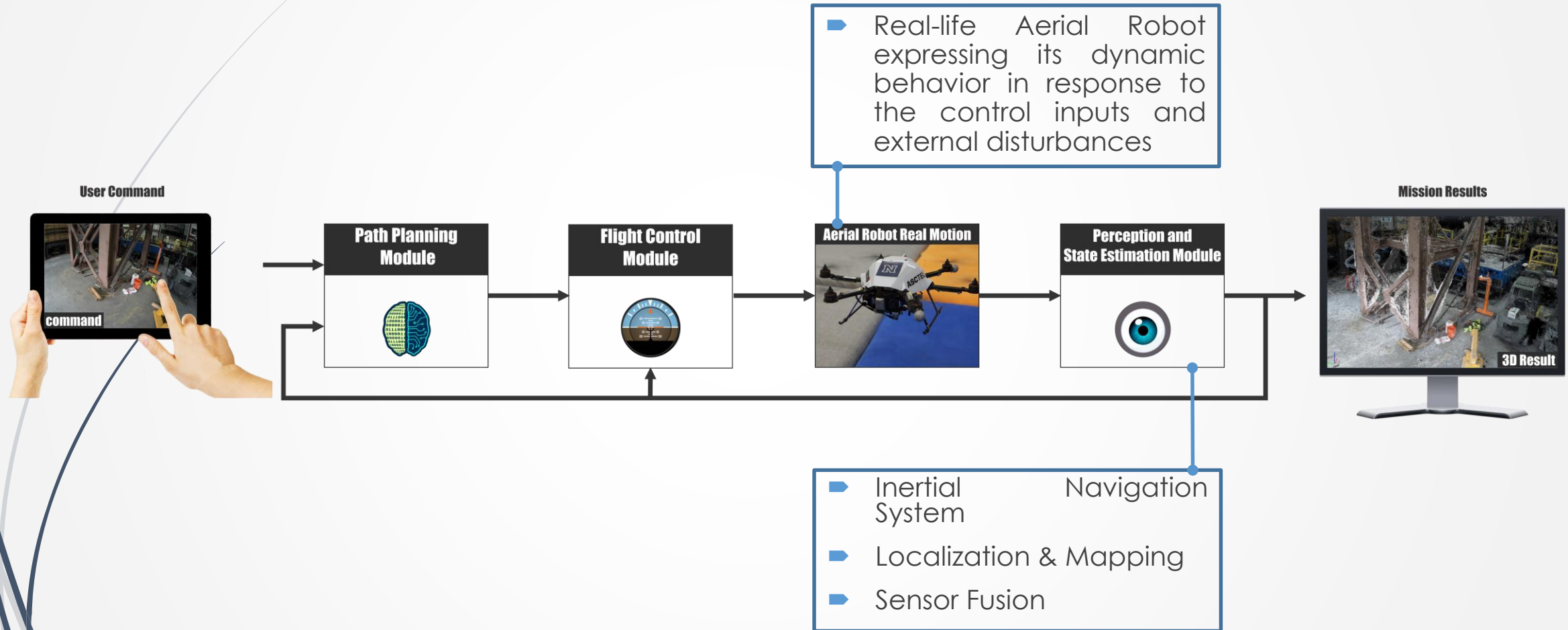


Block diagram of the main loops running at every aerial robot

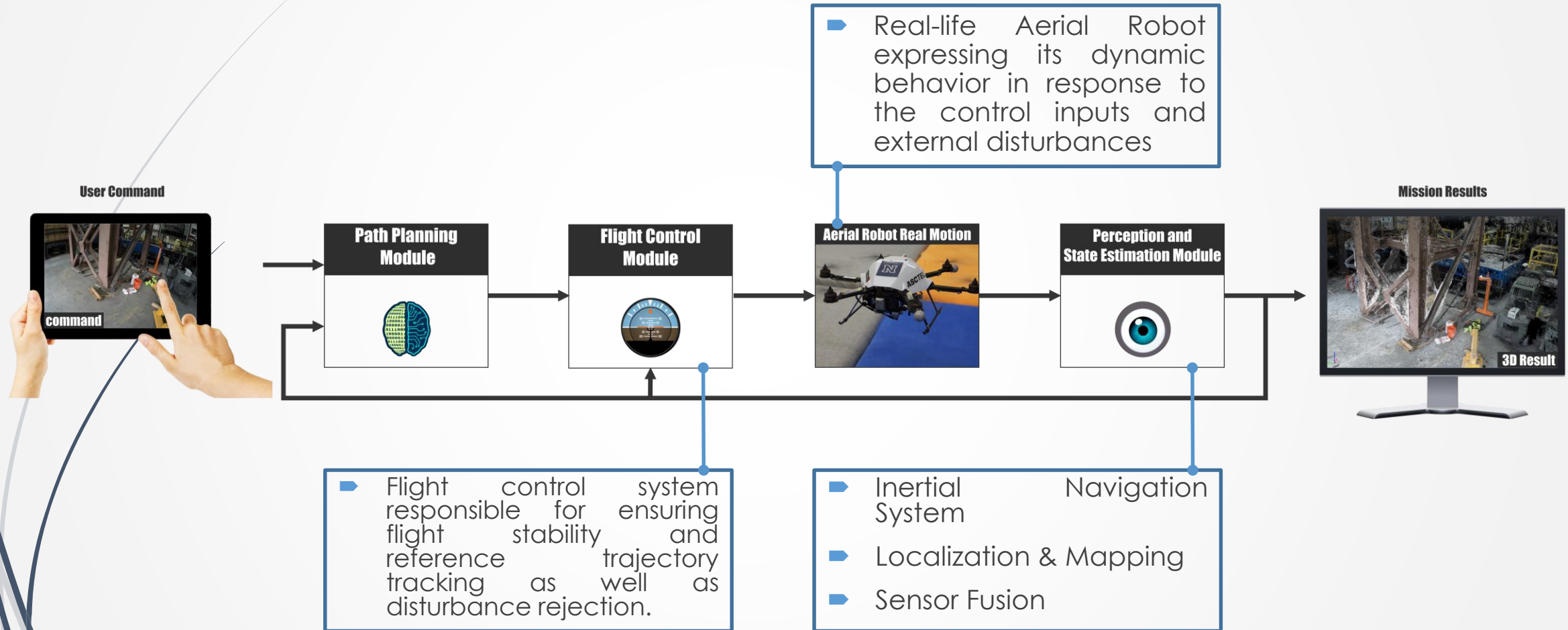
# The Aerial Robot Loop



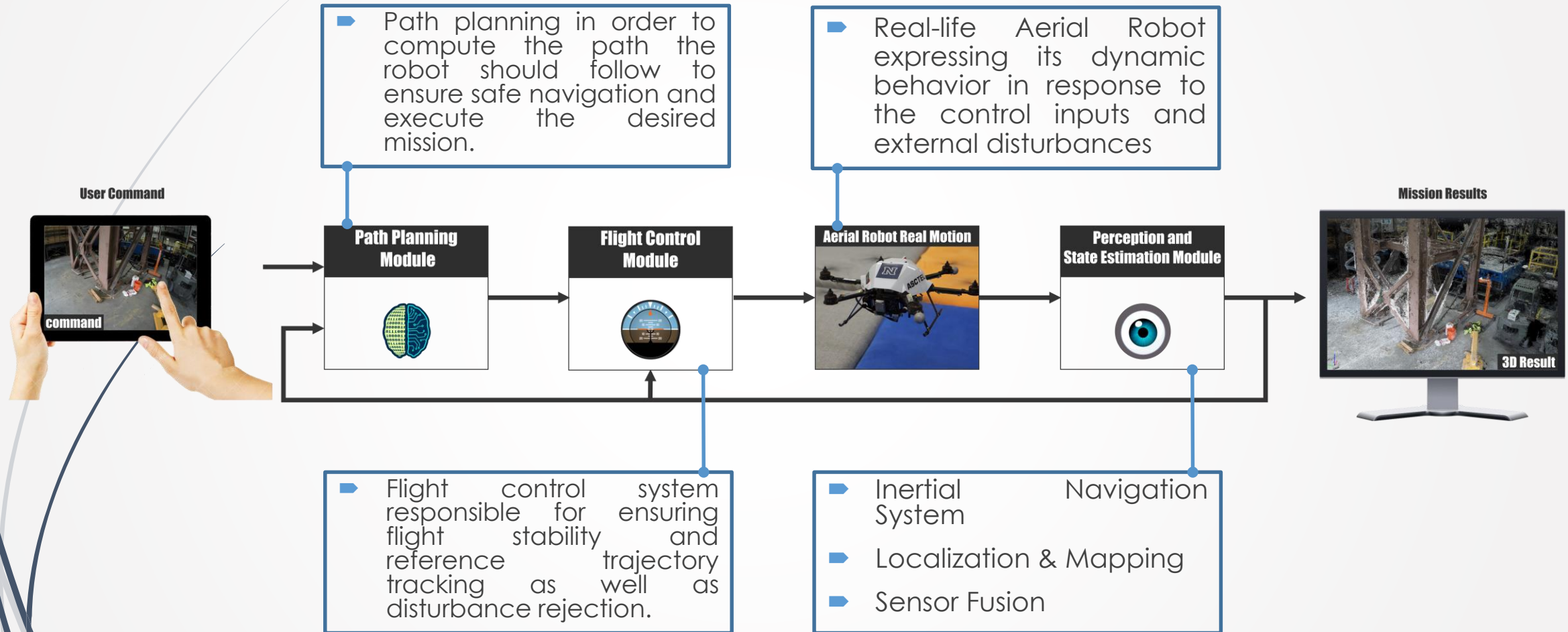
# The Aerial Robot Loop



# The Aerial Robot Loop



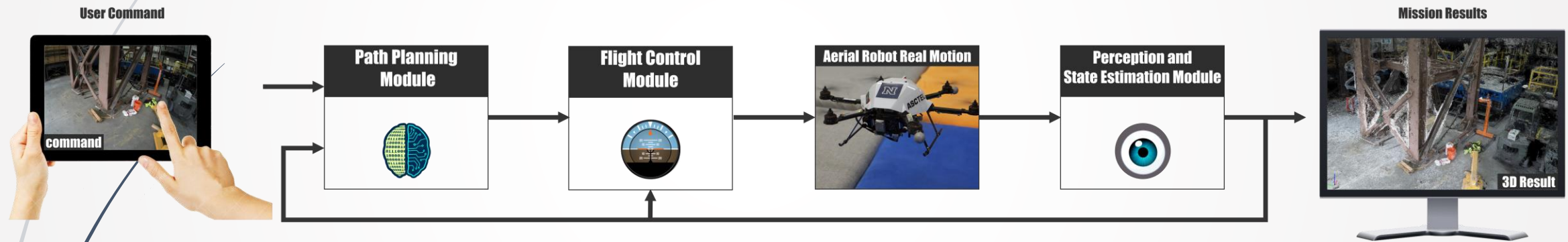
# The Aerial Robot Loop





# The Aerial Robot Loop

**A hard real-time system with relatively limited computational resources!**



# The Robot Platform

- Different aerial vehicle configurations satisfy different needs in terms of precision flight, endurance, operational requirements, robustness, payload capacity and more.
  - Rotorcraft Systems
  - Fixed-Wing Systems
  - Hybrid Systems
  - Biomimetic Systems
  - Lighter-than-Air Systems

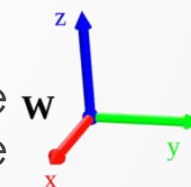
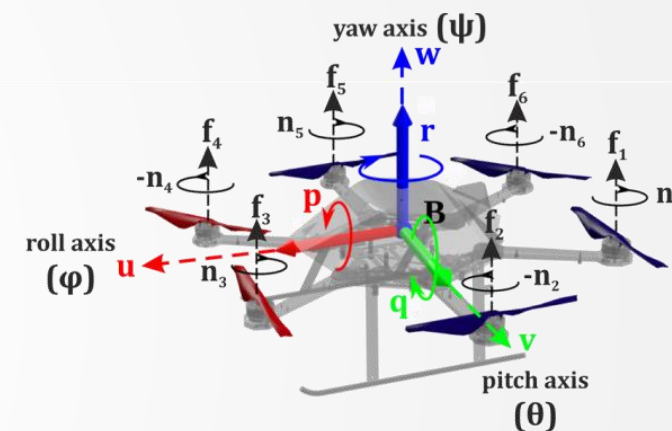
Aerial Robot Real Motion





# The Robot Platform

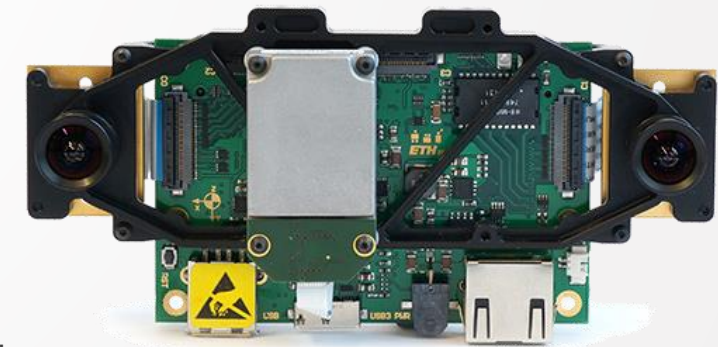
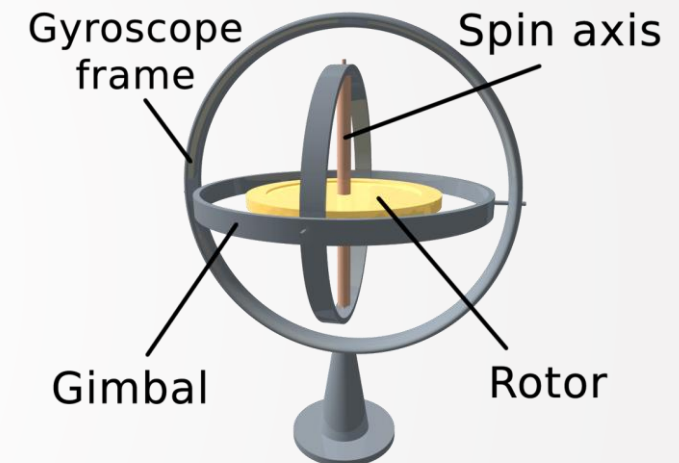
- **Derivation of the Vehicle Dynamics Model:** A complex mathematic process that heavily depends on the good understanding of the following topics:
  - Frame Rotations, Representations and Coordinate Systems
  - Rigid Body Dynamics Modeling
  - Derivation of Aerodynamic Forces
- Modeling is a critical step that enables state estimation, flight control and prediction of the flight behavior of the vehicle.
- As part of this course we will derive a first-level model of a multirotor Micro Aerial Vehicle and a Fixed-Wing UAV





# Perception & State Estimation

- ▶ The process of using data coming from different sensors on-board in order to estimate (in real-time) the state of the vehicle (position, orientation and possibly aerodynamic and other high-order states). Typical sensors employed are:
  - ▶ Accelerometers
  - ▶ Gyroscopes
  - ▶ Magnetometer
  - ▶ GPS
  - ▶ Camera systems
  - ▶ LiDAR
  - ▶ Structured-light sensors
  - ▶ ...and more
- ▶ It corresponds to fundamental loop for the robot operation and critical to advance its autonomy.

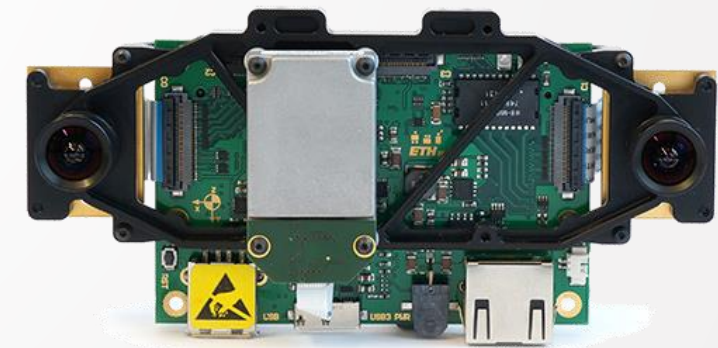
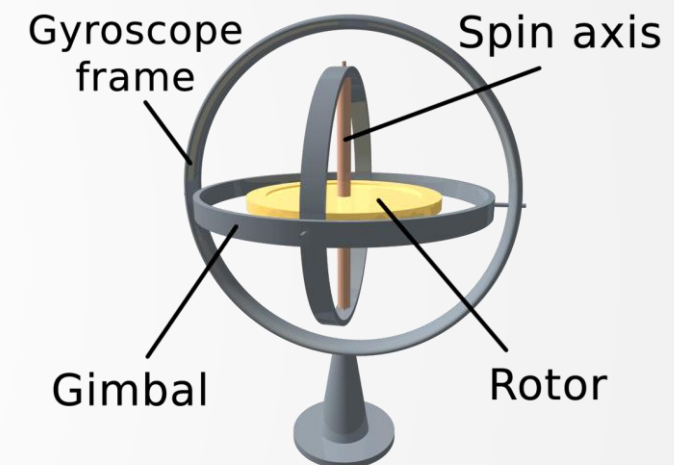






# Perception & State Estimation

- ▶ The sensor data fused to estimate the full state in a bias-free and accurate way in high-update rates. This process depends on methods of the state estimation theory. Within this course, we will investigate:
  - ▶ Inertial sensing
  - ▶ The concepts of Kalman Filtering
  - ▶ The design of an Inertial Navigation System





## Flight Control System

- ▶ The Flight Control System is responsible to ensure the closed-loop stability of the vehicle and guarantee high performance trajectory tracking despite possible uncertainty in the modeled dynamics and the effects of external disturbances.
- ▶ Flight Control System design relies on concepts of control theory and a precise enough but simple model of the vehicle dynamics that allows model-based control.
- ▶ Flight control theory is a huge field and the community has proposed numerous alternative approaches towards providing aerial robots with the desired flying qualities.





# Flight Control System

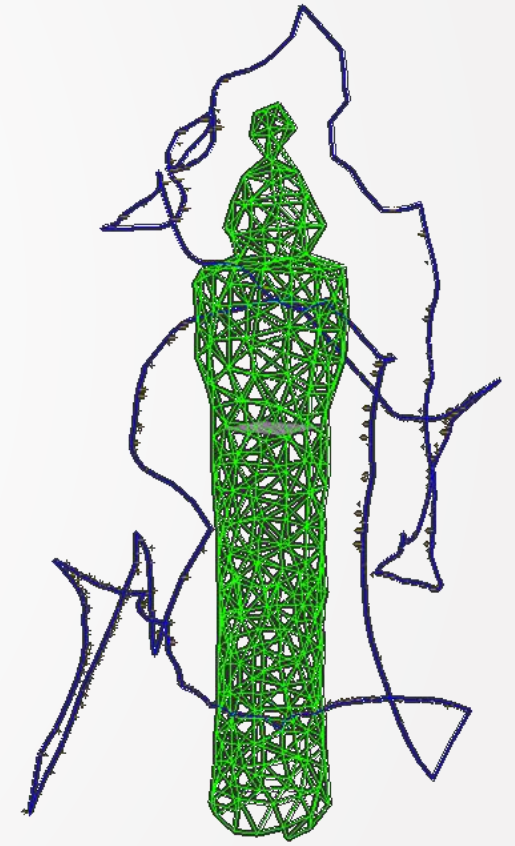
- ▶ Within the framework of this course we will examine some basic and a few advanced methods on flight control synthesis. More specifically, we will cover the following topics:
  - ▶ Proportional Integral Derivative control
  - ▶ Linear Quadratic Regulator control
  - ▶ Linear Model Predictive Control
- ▶ While, we will then investigate an autopilot design example and apply the relevant control strategies.





# Path Planning

- Path planning is the process of deriving the path that the robot should follow in order to ensure safe navigation and successfully execute its mission. The problems attached through the relevant methods include the following:
  - Collision-free Navigation
  - Inspection Path Planning
  - Target Follow
  - Coordinated Motion
  - Collaborative Aerial Manipulation
  - ...and more
- It corresponds to a critical topic to advance the aerial robotics autonomy.

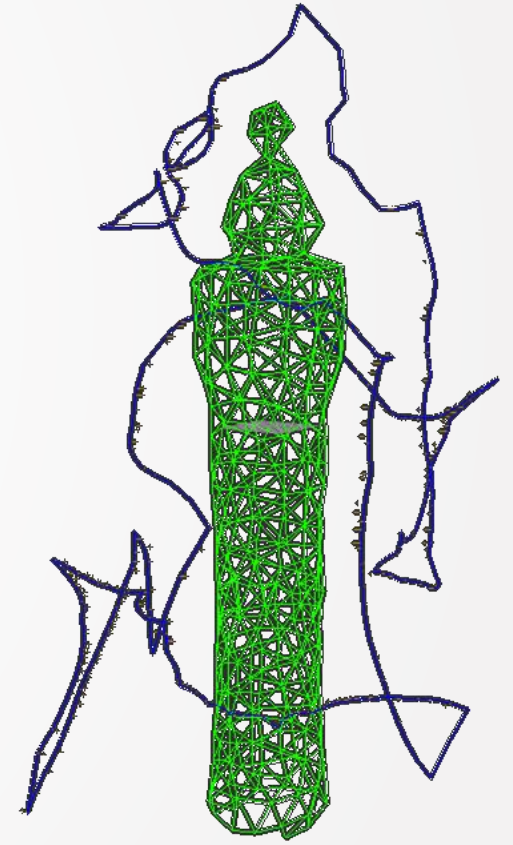






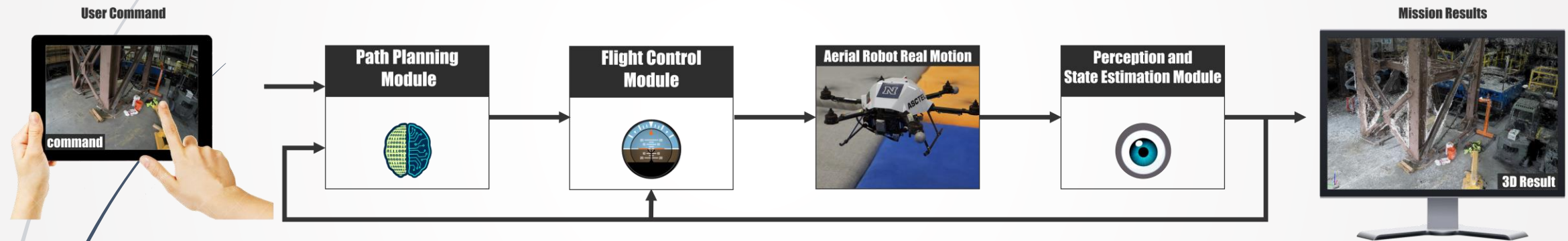
# Path Planning

- ▶ Path planning is a rich field and several different approaches have been proposed such as sampling-based methods or algorithms relying on convex optimization strategies. Within the framework of this course we will examine Sampling-based algorithms and their applications in the problems of:
  - ▶ Collision-free Navigation
  - ▶ Structural Inspection Path Planning




# The Aerial Robot Loop

**These Loops Run Simultaneously!**





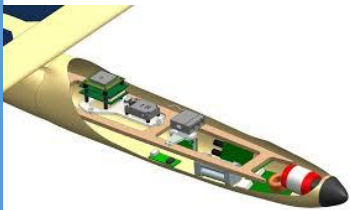
# Course Contents

- 
- **Introduction:** Get a broad understanding about aerial robotics, what they are, what they look like, what they can do and how they do so.
  - **Modeling:** Understand the physical principles behind the flight dynamics of aerial robotics and develop the capacity to derive their mathematical model.
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  - **Case Study and Design Projects:** Go through a design experience.

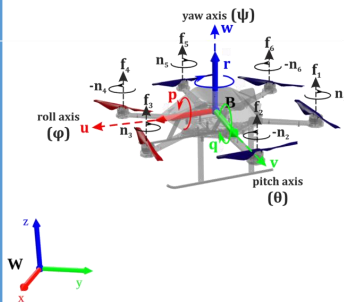
# Course Projects

**Assemble teams (~5 students), select or think of a Project and schedule a meeting with me**

System Design



Modeling



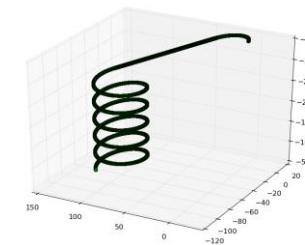
Estimation



Flight Control



Path Planning



Perception

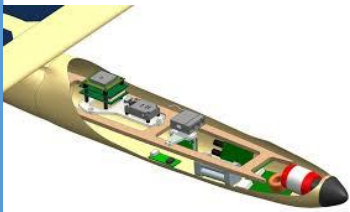


**Relevant Web link:** <http://www.autonomousrobotslab.com/student-projects.html>



# Course Projects

## System Design



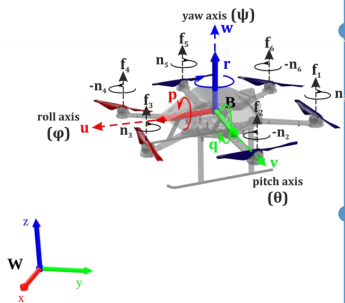
Development of a Multirotor Micro Aerial Vehicle

Development of a Fixed Wing Unmanned Aerial Vehicle

Development of a Blimp Unmanned Aerial Vehicle

# Course Projects

## Modeling



Development of the dynamic model -and simulation suite- of a delta-wing Fixed-Wing UAV

System Identification of the Dynamics of Multirotor UAVs

Online learning of dynamic models for Multirotor UAVs

# Course Projects

## Estimation



- Extended Kalman Filter Design for the Pose Estimation of a Multirotor UAV

- Extended Kalman Filter Design for the Estimation of the AoA of a Fixed-Wing UAV

- Unscented Kalman Filter Design for the Pose Estimation of a Multirotor UAV

# Course Projects

## Flight Control



- Design of a Linear Model Predictive Control (MPC) Law for the Pixhawk Autopilot

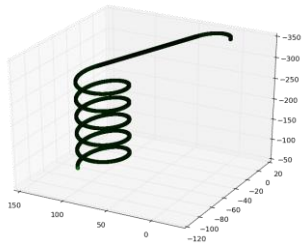
- Design of a Nonlinear MPC Law for the Position Dynamics of a Multicopter UAV using ROS

- Guidance Laws for Slow-speed Fixed-Wing UAVs



# Course Projects

## Path Planning



Collision-free Navigation for Aerial Robotics

Structural Inspection Path Planning for Aerial Robotics

Multi-Robot Collaboration for Space Exploration

# Course Projects

## Perception



Detection of Landing Spots

Development of a Stereo Depth Estimation Module for a Non-Rigid Wing

Tracking of Aerial Vehicles from a Portable Mobile Station

A black and white photograph of a drone flying in front of a construction site. The drone is in the foreground, slightly out of focus, with its four rotors visible. In the background, several large construction cranes are visible, also out of focus, against a bright sky. The overall scene is a construction site.

**Thank you!**

Please ask your question!