



# Estimation and Learning in Aerospace

## 2022/2023 exam project

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## Project tasks

The project deals with the dynamics of a multicopter UAV and involves the following two tasks.

### *Task I*

- System identification of longitudinal dynamics from simulated data for a given input

### *Task II*

- Optimisation of experiment design to maximise model accuracy

## A small quadrotor



Weight: 270g

Dimensions: 20 x 20 x 4 cm

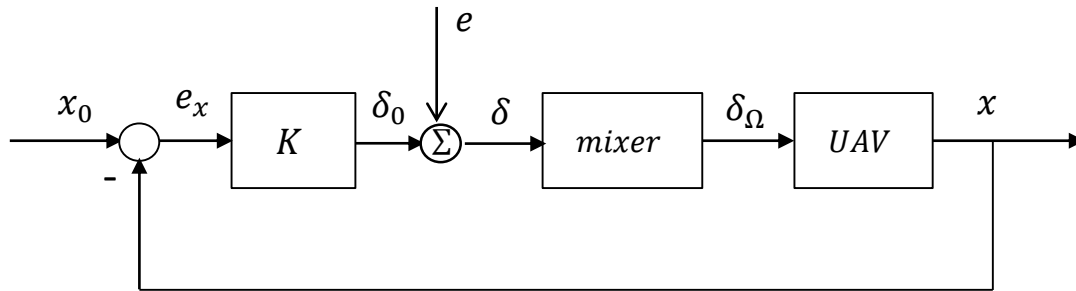
Diameter (motor-to-motor distance): 16cm

Hovering time: 7'30''





# Identification experiments and I/O estimation data



## *Decoupled dynamics*

### ➤ *Longitudinal dynamics*

- ❑ Input:  $\delta_{lon}$  / Outputs:  $q, a_x$
- ❑ Known time delay of 4 sampling intervals.

# Linearised model for longitudinal dynamics

## State equation

$$\begin{bmatrix} \dot{u} \\ \dot{q} \\ \dot{\theta} \end{bmatrix} = \begin{bmatrix} X_u & X_q & -g \\ M_u & M_q & 0 \\ 0 & 1 & 0 \end{bmatrix} \begin{bmatrix} u \\ q \\ \theta \end{bmatrix} + \begin{bmatrix} X_\delta \\ M_\delta \\ 0 \end{bmatrix} \delta_{lon}$$

$u$  Longitudinal (body) velocity [m/s]

$q$  Pitch rate [rad/s]

$\theta$  Pitch angle [rad]

$a_x$  Longitudinal (body) acceleration [m/s<sup>2</sup>]

$\delta_{lon}$  Pitch moment [normalised to -1, +1 range]

## Output equation

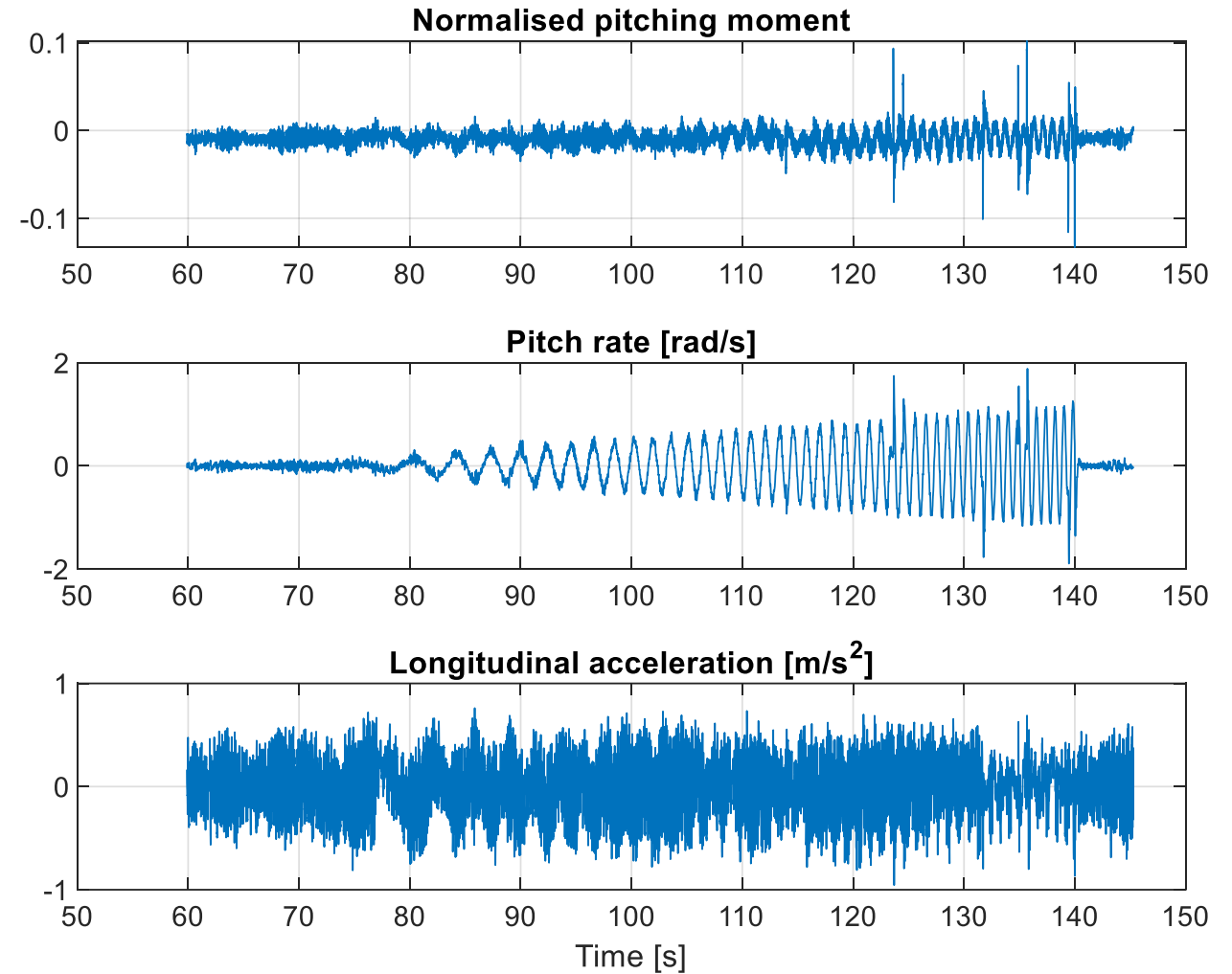
$$\begin{bmatrix} q \\ a_x \end{bmatrix} = \begin{bmatrix} 0 & 1 & 0 \\ X_u & X_q & 0 \end{bmatrix} \begin{bmatrix} u \\ q \\ \phi \end{bmatrix} + \begin{bmatrix} 0 \\ X_\delta \end{bmatrix} \delta_{lon}$$

Model parameters:  $\Theta = \begin{bmatrix} X_u \\ X_q \\ M_u \\ M_q \\ X_\delta \\ M_\delta \end{bmatrix}$

+ delay (computational time, sensor readings, ...)

# Longitudinal dynamics: excitation signal

- Experiments are carried out under position and attitude feedback, in order to guarantee safe operation.
- Baseline excitation input is a long duration sweep: excite low-frequency translational dynamics



## Task 1: model identification

Use the simulator and the provided baseline excitation to:

- Identify a grey-box model for the longitudinal dynamics of the multicopter (input: **total pitching moment**; outputs: **pitch rate** and **longitudinal acceleration**) using the **response** to the **sweep** provided in the ExcitationM.mat file
- Assess the uncertainty of the identified model

Note that the open loop dynamics is *unstable*

## Task 2: optimisation of experiment design

- The identified model can be used to re-design the experiment so as to optimise the accuracy of the model
- Therefore the second task of the project consists in
  - Defining and parameterising a class of inputs for the experiment (see also the attached document)
  - Defining a performance metric for model quality
  - Optimising the input class to maximise the quality of the obtainable model.
  - Evaluating the quality of the optimal obtainable model.

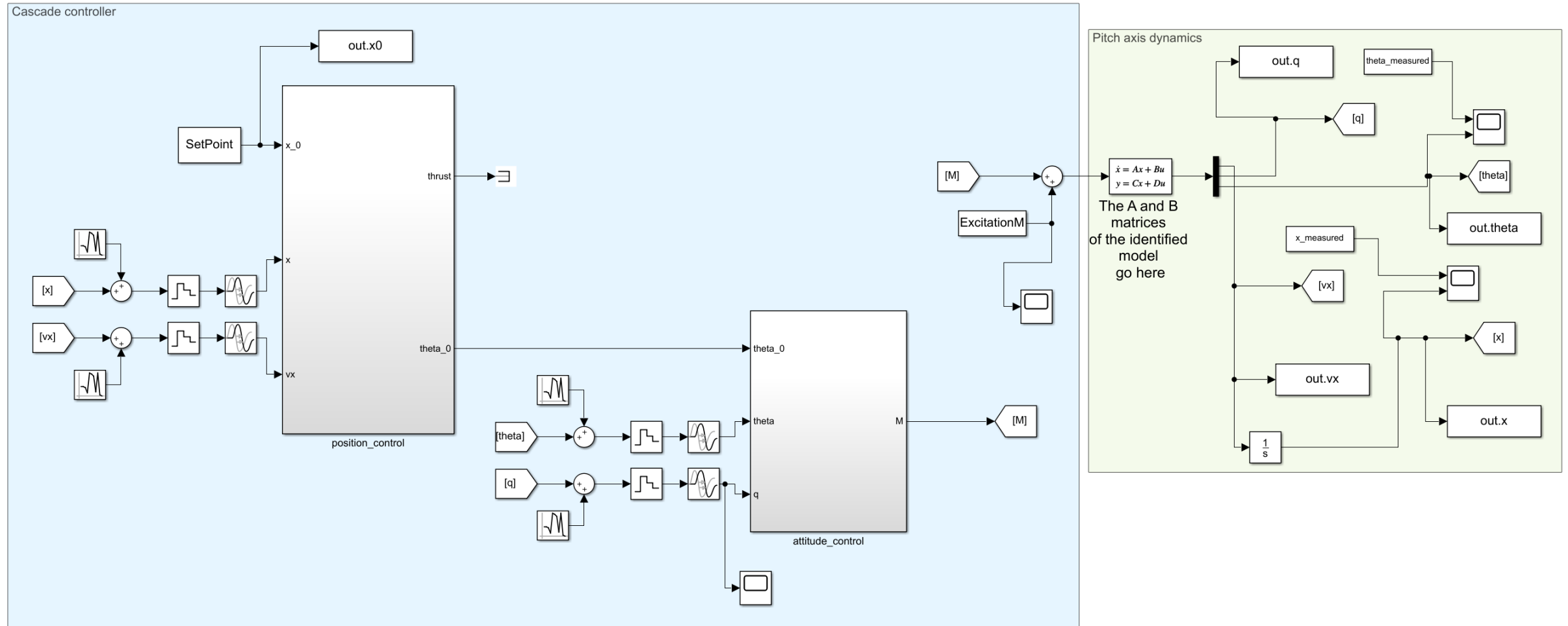


An initial identified model is provided to be able to run the simulator, the parameters are given in the script `main_quad_ANTX.m` which runs the simulator

The simulator is representative of the local linear closed-loop dynamics of the drone and combines the identified model with a complete model of the full attitude and position control system.

It includes the following files:

- `main_quad_ANTX.m` (which calls `parameters_controller.m`): set up the parameters and run the simulation
- `ExcitationM.mat` contains the vectors of time and normalised pitching moment corresponding to the baseline excitation
- `Simulator_Single_Axis.slx` the Simulink model corresponding to the closed-loop longitudinal dynamics



- Model identified using data generated with the provided excitation input:
  - Estimated parameters
  - Associated uncertainties
- Formulation of the experiment design problem
- Implementation of the solution
- Results:
  - Optimised excitation
  - Identified model (estimated parameters and uncertainties)