

### Multiple Drone Mission Planning and Control summary

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#### Multiple Drone Mission Planning and Control

- Multiple drone mission planning.
  - Audiovisual shooting mission definition.
  - Mission Planning Vocabulary.
  - High-level planning.
  - Path planning.
- Manual drone operation/control.
- Automatic drone mission control.
  - Single drone flight control.
  - Gimbal and camera control.
  - Multiple drone control architecture.
  - Drone formation control.
  - Collision avoidance.

• Vision-based single drone control. Artificial Intelligence & Information Analysis Lab





#### Drone mission planning and control: Objectives



- High-level drone mission planning
  - XML language to describe drone missions.
  - **Plans** for mission task assignment to drones, taking into account safety (no-fly zones) and resources (battery level).
- Multiple-drone misión execution
  - Re-planning after unexpected events (e.g., drone emergency, new tasks).
  - Multiple-drone formation control for mission execution.
  - Target tracking (for specific missions, e.g., AV shooting).





#### Drone mission planning and control: Objectives



- Multiple drone *safety* and *robustness*:
  - Safe path planning.
  - Multiple-drone *collision avoidance.*
  - Contigency plans for emergencies.





# Drone mission planning and control



- Special case: Audiovisual shooting mission definition.
- Multiple drone mission planning.
- Multiple drone mission control based on 3D state:
  - Single drone flight control.
  - Gimbal and camera control.
  - Multiple drone control architecture.
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### Mission Planning Vocabulary



- Multiple drone *Mission*: list of multiple *actions* developing over time.
- Example: AV shooting mission.
- Types of actions:
  - Shooting Actions: drone + camera

e.g., Lateral Tracking, Fly-Over, Orbit, ...

 Navigation Actions: drone action only, does not involve shooting e.g., Take-off, Land, Go-to-waypoint, ...





### Mission Planning Vocabulary



- Shooting Actions are *event-triggered*:
  - A start event is associated to each Shooting Action, which will trigger the action when it occurs.
  - E.g., target reaches a milestone, start of race, ...





#### **Problem definition**



- Given *N* drones with known positions.
- Given *M* single-drone tasks with initial position, initial time (event) and time duration.
- Solve a Multi-Robot Task Allocation problem to maximize time that drones are covering shooting tasks.
- Tasks correspond to Director Shooting Actions (SAs). SAs with several drones are split into several single-drone

tasks.







#### **AV Shot types**



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#### Example mission: Boat race scenario









#### Example mission: Boat race scenario

- From start of race until approaching finish line:
  - Drone 1 takes a lateral shot (SA1);
  - Drone 2 takes a frontal shot (SA2).
- At finish line:
  - Drone 1 holds position for photo finish (SA3);
  - Drone 2 takes an over-the shoulder shot (SA4).

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#### High-level preproduction/production mission planning

- *High-level planner* assigns different behaviours/tasks to the multiple-drone team according to director and environmental requirements.
- The multiple-drone planner needs to be scalable with multiple actors, since on-line re-planning could be needed as events happen or execution is performed.

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### **High-level planning**













• Some tasks could not be filmed entirely.



(VML

#### **Path Planner**



- This submodule is used by:
  - High-level Planner to estimate drone paths and flying times.
  - On-board Scheduler to compute landing path in case of emergency.
- Safe path computed using A\* search algorithm:
  - Fast for simple solution spaces.
  - Navigation map implemented as a grid.
  - Semantic annotations are indicated as KML features.
  - No-fly polygons become occupied cells in grid.





#### **Example**

- Path from one corner to the other.
- Buildings labelled as no-fly zones (obstacles represented as red crosses in the grid).
- Solved in 66 ms.







#### **AV Mission example**

#### Shooting mission with multiple drones

Two cyclist targets.

Three Shooting Action Sequences in parallel, each one composed of one or two Shooting Actions.

Three drones available.

AV Shooting mission with 3 drones (5 different shootings).





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### Mission Planning architecture



#### **MULTIDRONE** Planning







20

### Mission Planning and Control

#### Mission Controller:

- Requests new plans, safety checks
- Sends *drone actions* to each drone.
- Monitors mission execution.

#### High-Level Planner.

Computes plans.

#### **Event Manager**

• Receives and generates events to trigger drone actions.

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# Drone operation/control modes



#### Manual operation:

1 pilot and 1 cameraman per drone.

Scalability and operation cost issues, when multiple drones operate.

#### Automatic operation:

1 drone or multiple drones.

Formation control.





### Manual operation/control

- Manual operation
  - 1 pilot and 1 cameraman per drone.
  - 2 Radio (TX/RX) links per drone.
- Pilot radio controls:
  - On screen telemetry.
  - POV camera.
  - Sticks control drone pitch, roll and yaw.
  - Cameraman radio controls:
    - Control gimbal and camera parameters.
    - Views AV shooting camera.
- Scalability concerns. Artificial Intelligence & Information Analysis Lab



Pilot control (FUTABA 14SG)

• 2.4GHz air receiver.

ML

- Programmable interface.
- More than enough range for VLOS mode (<500m in Greece).



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#### **Drone as Control System**



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#### Control Objectives – Trajectory Tracking



Track a trajectory. Realistic model. Robustness to disturbances. Bounded actuation. Large basin of attraction.





# Rigid-body equations of motion (I)



{*I*} Inertial Reference Coordinate System.
{*B*} Body-fixed Reference Coordinate
System.

 $p \in \mathbb{R}^3$  – Position of  $\{B\}$  relative to  $\{I\}$  $R \in \mathbb{SO}(3)$  – Rotation from  $\{B\}$  to  $\{I\}$  $v \in \mathbb{R}^3$  – Linear velocity of  $\{B\}$  relative to  $\{I\}$  $\omega \in \mathbb{R}^3$  – Angular velocity of  $\{B\}$  relative to  $\{I\}$ 

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# Rigid-body equations of motion (II)



Drone kinematic model:

$$\begin{cases} \dot{p} = v \\ \dot{R} = RS(\omega) \end{cases}$$

**Drone dynamic model**:  $\begin{cases}
m\dot{v} = f \\
J\dot{\omega} = -S(\omega)J\omega + n
\end{cases}$ 

 $S(\omega)a = \omega \times a$ , for  $\omega, a \in \mathbb{R}^3$ 

 $m \in \mathbb{R} - mass$ 

 $J \in \mathbb{R}^{3 \times 3}$  – Tensor of inertia expressed in  $\{B\}$ 

 $\{I\}$ 

p

 $f \in \mathbb{R}^3$  – External forces expressed in  $\{I\}$ 

 $n \in \mathbb{R}^3$  – External moments expressed in  $\{B\}$ 

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#### **Hierarchical Control**

It explores time-scale separation:

- Fast inner-loop dynamics Orientation.
- *Slow* outer-loop dynamics Position.





#### Autopilot



- Autopilot: Sensors (IMU, GPS, Barometer,...) + Flight Controller.
- Radio Link •,,

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#### **Action Execution**





#### **Drone Controller**



### **Drone Control for shot** execution









ORBIT











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#### **Gimbal Control**



#### **Gimbal control**



- Gimbal control objective: *Point towards the target.*
- Approach: Treat gimbal control independently from drone control.



### Vision-based Gimbal Control

• From image error to attitude error:

 $\begin{vmatrix} y \\ 1 \end{vmatrix} \rightarrow \begin{vmatrix} y^* \\ 1 \end{vmatrix} = A \begin{vmatrix} 0 \\ 0 \\ 1 \end{vmatrix} \Leftrightarrow q \rightarrow \begin{bmatrix} 0 \\ 0 \\ \|q\| \end{vmatrix}$ 





 $y^*$ 



### Vision-based Gimbal Control









#### **GPS-based Gimbal Control**









### Drone control using Deep Reinforcement Learning





Deep RL Drone Control to take frontal person shots [PAS2018a].





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#### **Onboard functional** ( VML architecture (18)Onboard CPUs/GPUs Navigation camera (1)Shooting Mission 2D/3D 2D Visual (26) (19) (23 Information Analysis Translator (2)(19) (24) Request plan Shooting camera (USE/IST) (AUTH) Scheduling Perception Execution (3) Request path (20)Drone telemetry 9 3 (30) (21) Geometric map (4)Computed path (34) (10) Path Planner 4 (USE) **Onboard Scheduler** (5)Mission plan (22) Drone localization (11 (USE) 6 (23) Drone position Safety check (23) Visual Shot (12) Analysis $\overline{7}$ Plan status (24) Gimbal status (AUTH) (21 12 (8)Director events (25) Camera status (27 (31) (9) (26) Events Target position (2D) (29 Action Executer 3D Target position (10) Drone actions (27 (34 (IST) (from drone) **3D** Target position (11)28 Drone status (from target) 24 14 13 23) 25) 15 (29) (12)Action controllers **3D** Target position Control commands (30) Visual information (23) (13)UAL Gimbal Control Camera Control (USE) (IST) (AUTH) (14) Gimbal control (31) Visual control errors (15) (32) Camera control Annotated images (20) (16) (22) (17) (16)(33) Semantic annotations Drone control Localization (20)(21) (17)(USE) (34 Semantic map LIDAR Autopilot Topics Services Artificial Intelligence & **TECNICO** LISBOA Information Analysis Lab

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# Leader-following for formation control

• Main idea:

Trailer-like behavior for the followers.

In inertial frame: Translated identical paths

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In trailer frame: Different paths, no superposition



**VML** 

# Drone Control for shot execution



• Trajectory generation – Trailer approach





o drone2 drone2 target

#### **Drone Formation Control**

- Shooting Actions (SA) for Target Tracking Trailer approach.
- Examples: SA1 – constant relative positions SA2 – Orbit trajectory



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#### PARKOUR MISSION

Drone 1

- 1) Still shooting action
- 2) Lateral shooting action
- 3) Orbit shooting action

#### Drone 2:

- 1) Fly through shooting action
- 2) Flyby shooting action







# Optimal trajectory planning for aerial cinematography

- Team of drones filming a target
- Drone trajectory planning for filming
- Non-linear constrained Optimization Problem:

Objective: visually pleasant trajectory Constraints: dynamics, collision avoidance,

cinematography constraints

• To deal with complexity:

Camera is pointing at target (gimbal control)

Receding horizon planner for drone trajectory on

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[ECMR2019, ACA2019]

# Multi-drone trajectory planning VML

Drone trajectory planning for cinematography

- Human target moving along a straight line
- Mission with two lateral shots and a fly-by in parallel (same duration)

Drone 2

- Three drones, each performing one shot:
  - Drone 1; Lateral shot
  - Drone 2: Flyby shot
    - Drone 3: Lateral shot

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Drone 1



# Multi-drone trajectory planning





#### Optimal trajectory planning.

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# Collision avoidance with multiple drones



- Objective:
  - Avoid collisions during navigation with other drones and obstacles.
- Assumptions:
  - LIDAR sensors on board to detect obstacles.
  - Communication system to share drone positions in the swarm.
- Constraints:
  - Low computational resources.
  - Inaccurate positioning system.





# Collision avoidance with multiple drones



Drone collision issues:

- Collision hull defined as a cylinder (yellow).
- Horizontal conflict when reserve.d cylinder (green) overlaps with others.
- Vertical conflict when blocking cylinder overlaps with others.
- Cylinders allow drones to brake on time and maneuver to avoid collision.







# Collision avoidance experiments



Outdoors collision avoidance evaluation with three drones.

- Communicated drone positions based on noisy GPS (2 m).
- Different sizes for collision cylinders depending on wind.
- Tests with incremental complexity and risk.





## Collision avoidance experiments VML



Outdoors collision avoidance evaluation with three drones.





65

#### Drone emergency management

- Distributed onboard scheduler to synchronize shots using an event-based mechanism.
- Three components:
  - Scheduler core,
  - Emergency management,
  - Path planner.
  - Safety in two levels:
    - Collision avoidance in the Executer
  - Emergency management to handle high level alarms.

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[EUSIPCO2019]





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#### Vision-based drone control

- A set of purely vision-based drone controllers can be designed for autonomous UAV cinematography, separately for each target-tracking CMT.
- They require neither drone nor target 3D state knowledge (e.g., for GPS-denied time intervals or environments).
- The only requirement is for the target to initially be visible on the video frame.
- Several UAV/camera motion types can be defined as a set of requirements that interrelate 2D visual information, drone trajectory and camera orientation.







#### Vision-based drone control

The overall architecture consists of:

- An environment along with the AirSim server.
- A 2D visual detector/tracker [ICIP2018] [RCAR2019] [CVPR2017] [CVPR20178].
- The designed PID controllers.
- Multiple AirSim clients for extracting and sending back information to the server
- ROS back-end for interprocess communication (excluding the RPC-based server-clients interaction).



### Conclusions



Multiple drone mission planning and control:

- Support the activity of the director (easier video production).
- Real-time planner implementation.
- Multiple-drone cinematography.
- Drone trajectory and formation control for *aerial visual shot* execution.
- Optimal trajectory planning for aerial cinematography.
- Drone gimbal and camera control.
- Visual drone and gimbal/camera control.





#### Thank you very much for your attention!

## More material/lectures in http://icarus.csd.auth.gr/cvml-web-lecture-series/

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