



SAPIENZA  
UNIVERSITÀ DI ROMA

# *DroNET Simulator*

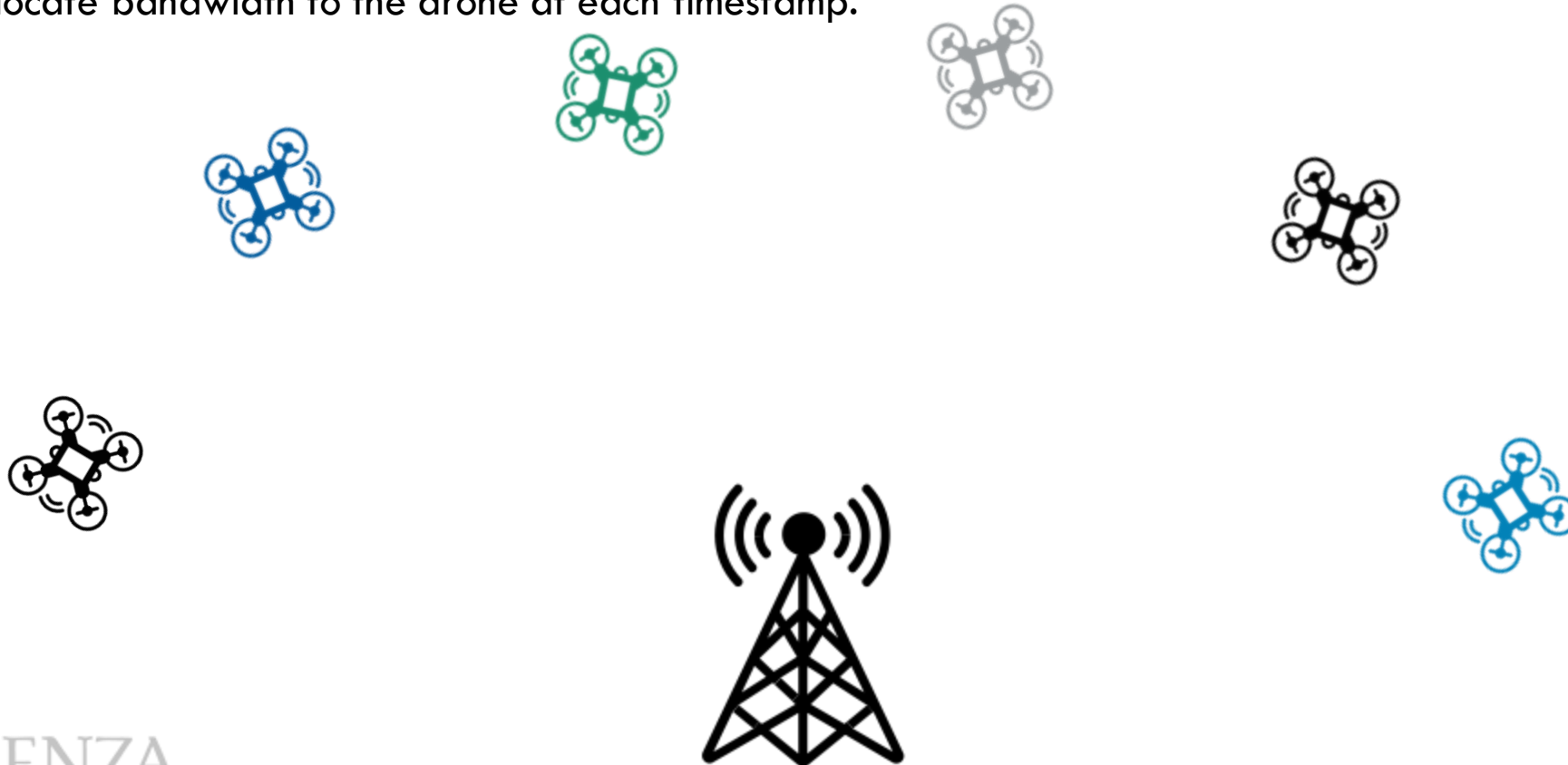
**Course:** Autonomous Networking - Prof. Gaia Maselli (A.A. 2020-2021)

**Speaker:** Dr. Andrea Coletta - 20-11-2020



# HOMework 1 – MAC PROTOCOL

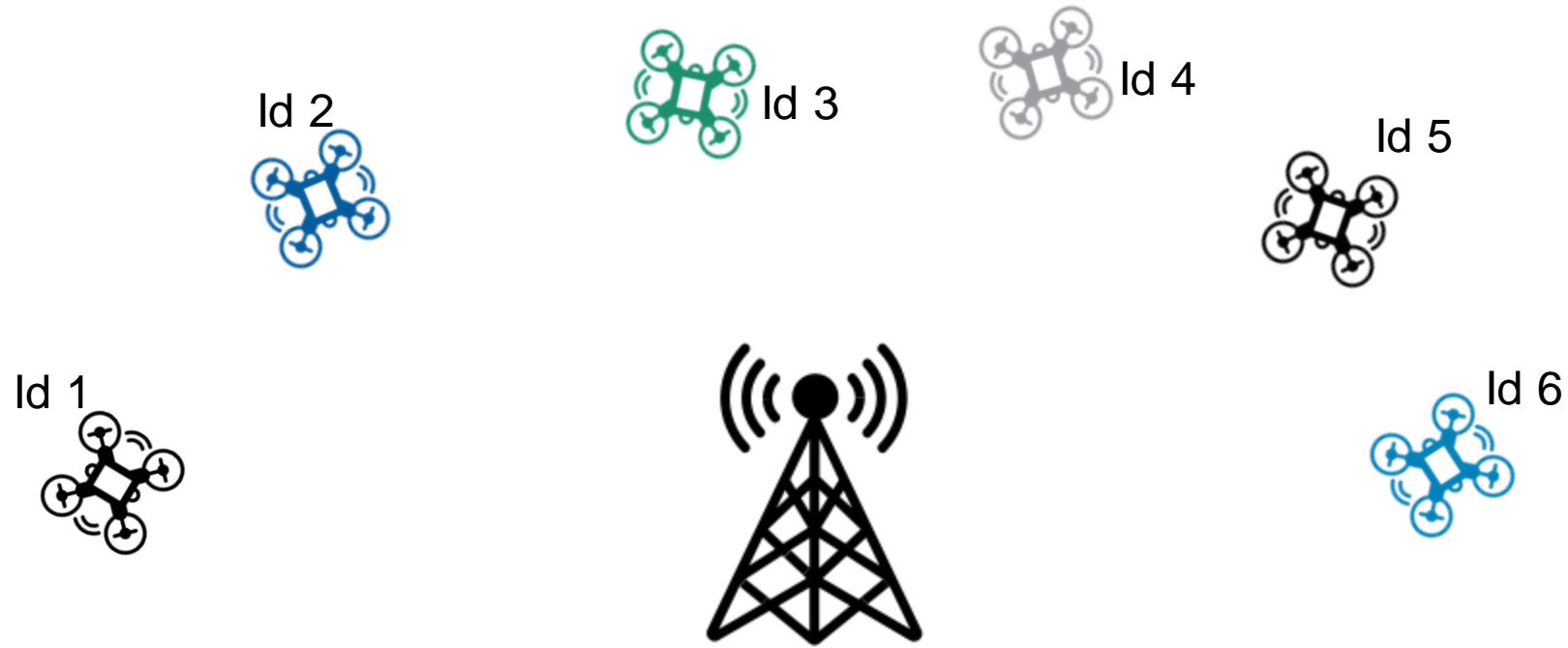
- 1) A set of drones that want communicate with the depot
- 2) The depot allocate bandwidth to the drone at each timestamp.



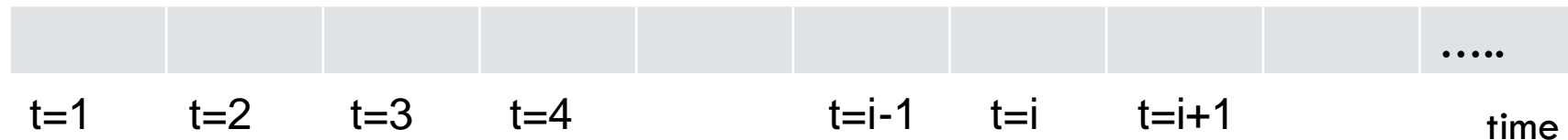


# HOMEWORK 1 – MAC PROTOCOL

- 1) A set of drones that want communicate with the depot
- 2) The depot allocate bandwidth to the drone at each timestamp (**Time Slotted** Channel).



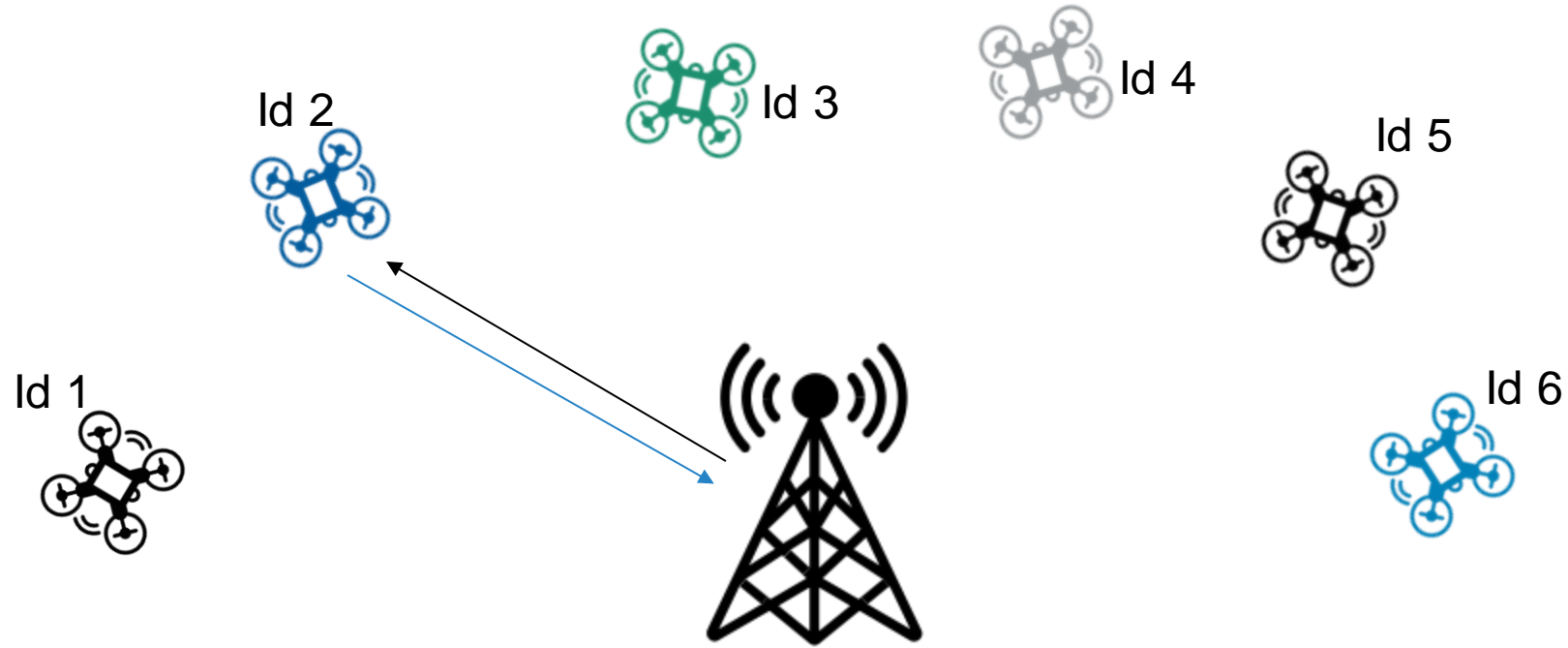
Bandwidth Allocation slots



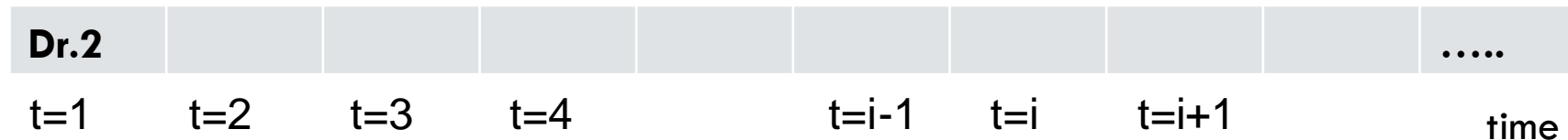


# HOMEWORK 1 – MAC PROTOCOL $T=1$

- 1) A set of drones that want communicate with the depot
- 2) The depot allocate bandwidth to the drone at each timestamp (**Time Slotted** Channel).



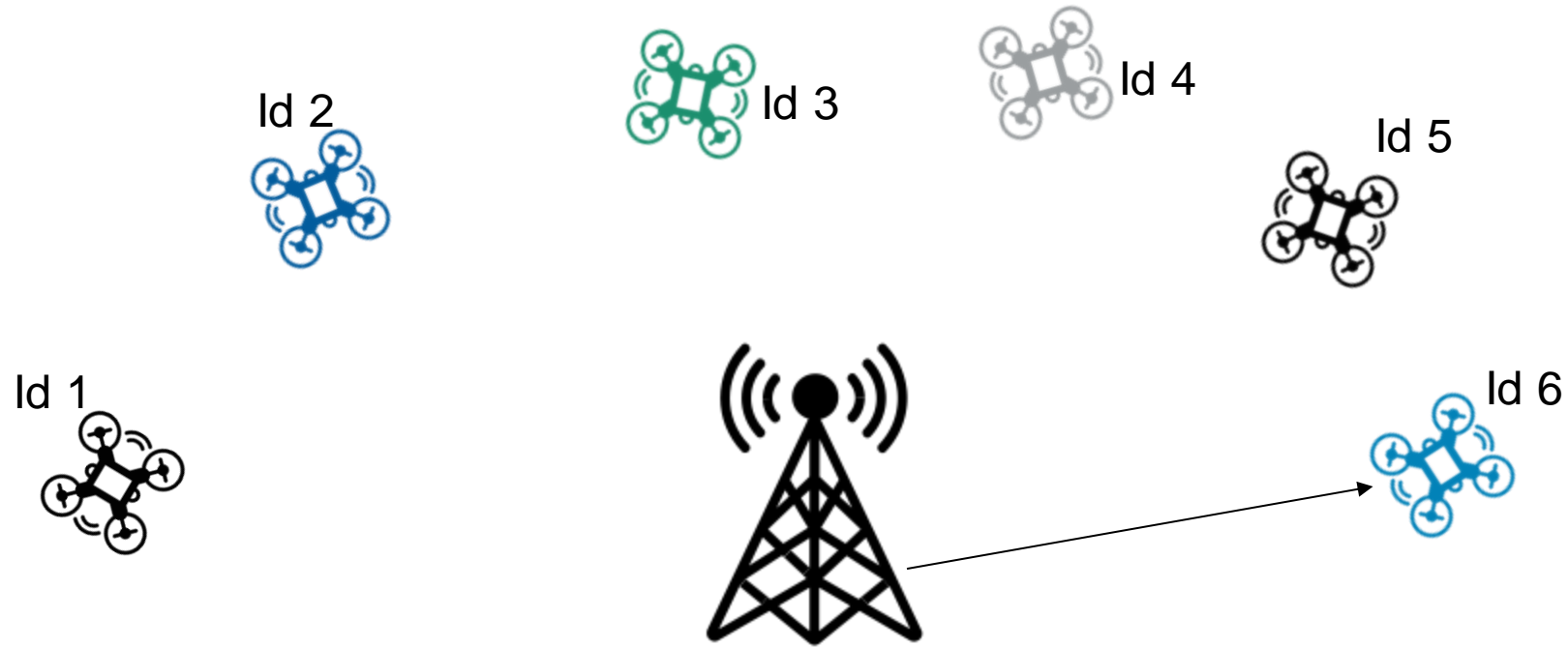
Bandwidth Allocation slots





# HOMEWORK 1 – MAC PROTOCOL $T=2$

- 1) A set of drones that want communicate with the depot
- 2) The depot allocate bandwidth to the drone at each timestamp (**Time Slotted** Channel).



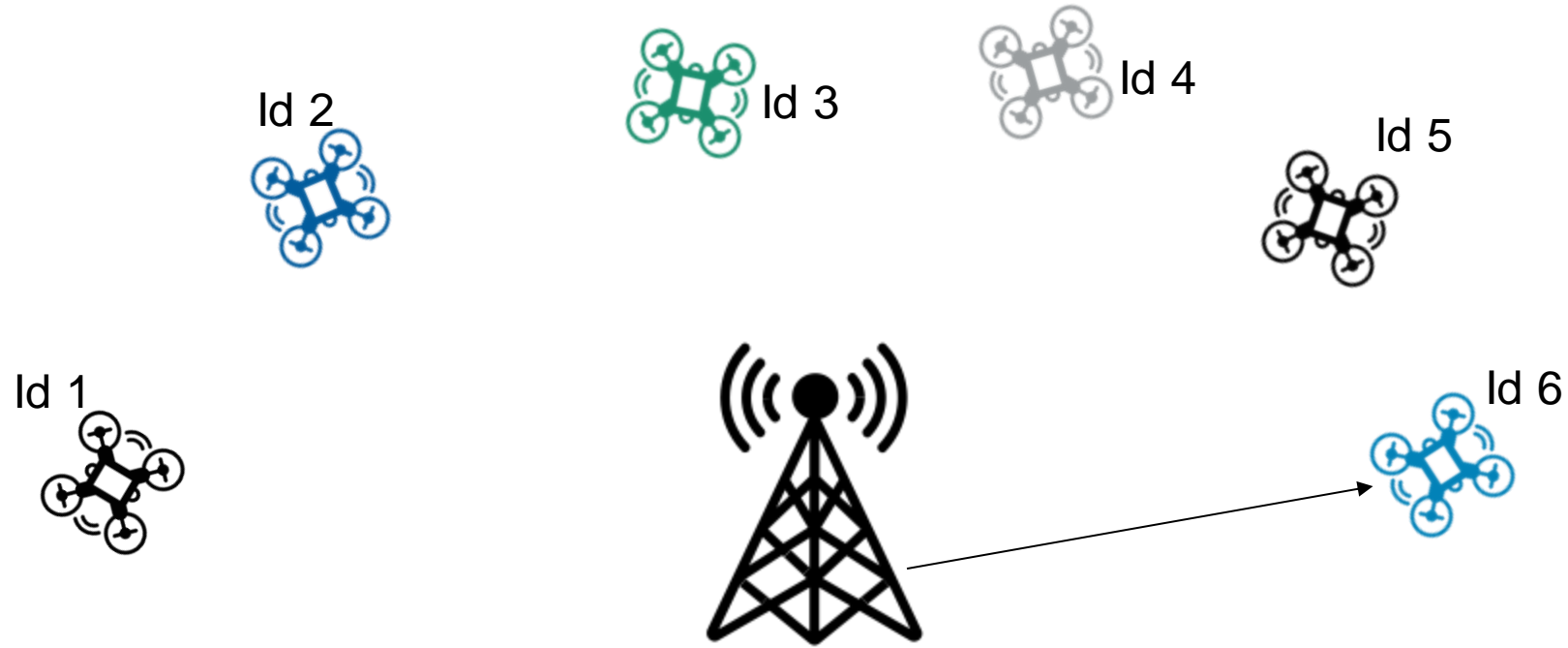
Bandwidth Allocation slots

<b>Dr.2</b>	<b>Dr.6</b>								.....
$t=1$	$t=2$	$t=3$	$t=4$			$t=i-1$	$t=i$	$t=i+1$	time



# HOMEWORK 1 – MAC PROTOCOL $T=3$

- 1) A set of drones that want communicate with the depot
- 2) The depot allocate bandwidth to the drone at each timestamp (**Time Slotted** Channel).



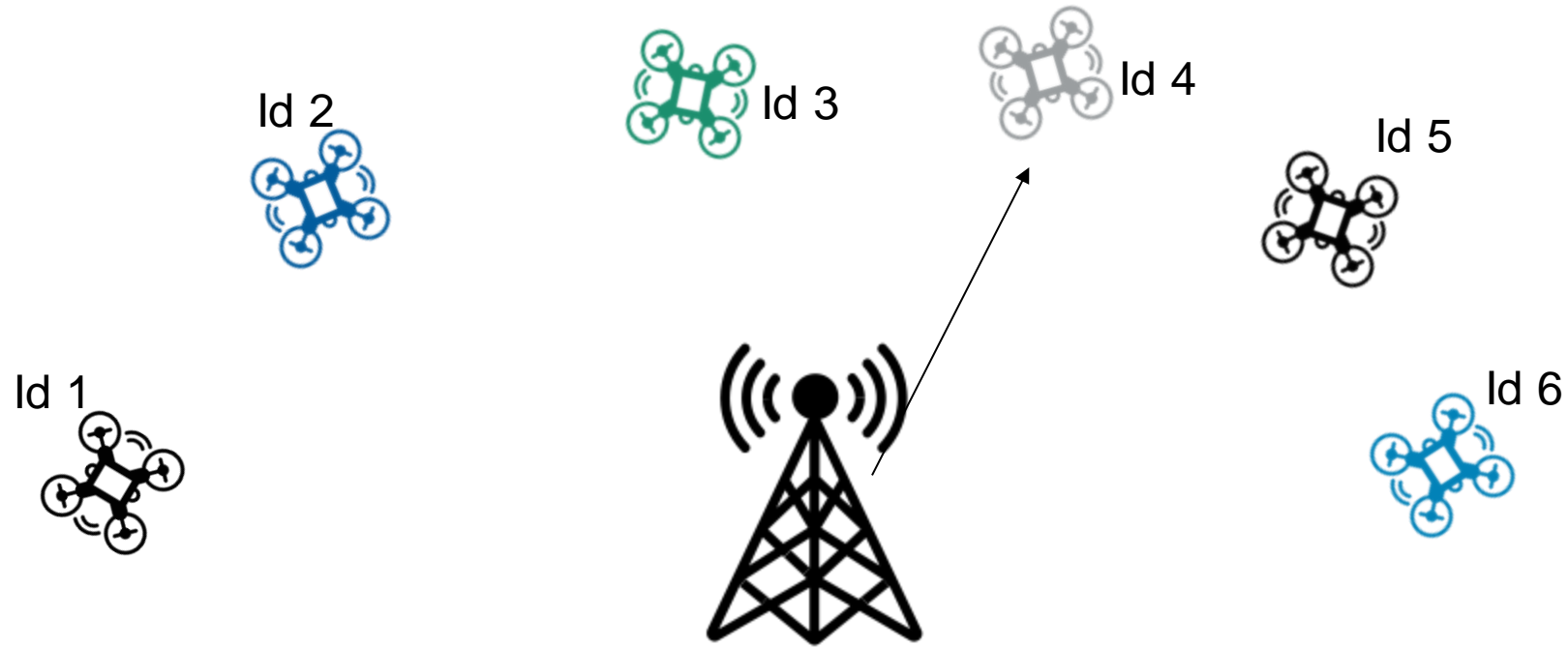
Bandwidth Allocation slots

Dr.2	Dr.6	Dr.6							.....
t=1	t=2	t=3	t=4			t=i-1	t=i	t=i+1	time



# HOMework 1 – MAC PROTOCOL $T=4$

- 1) A set of drones that want communicate with the depot
- 2) The depot allocate bandwidth to the drone at each timestamp (**Time Slotted** Channel).



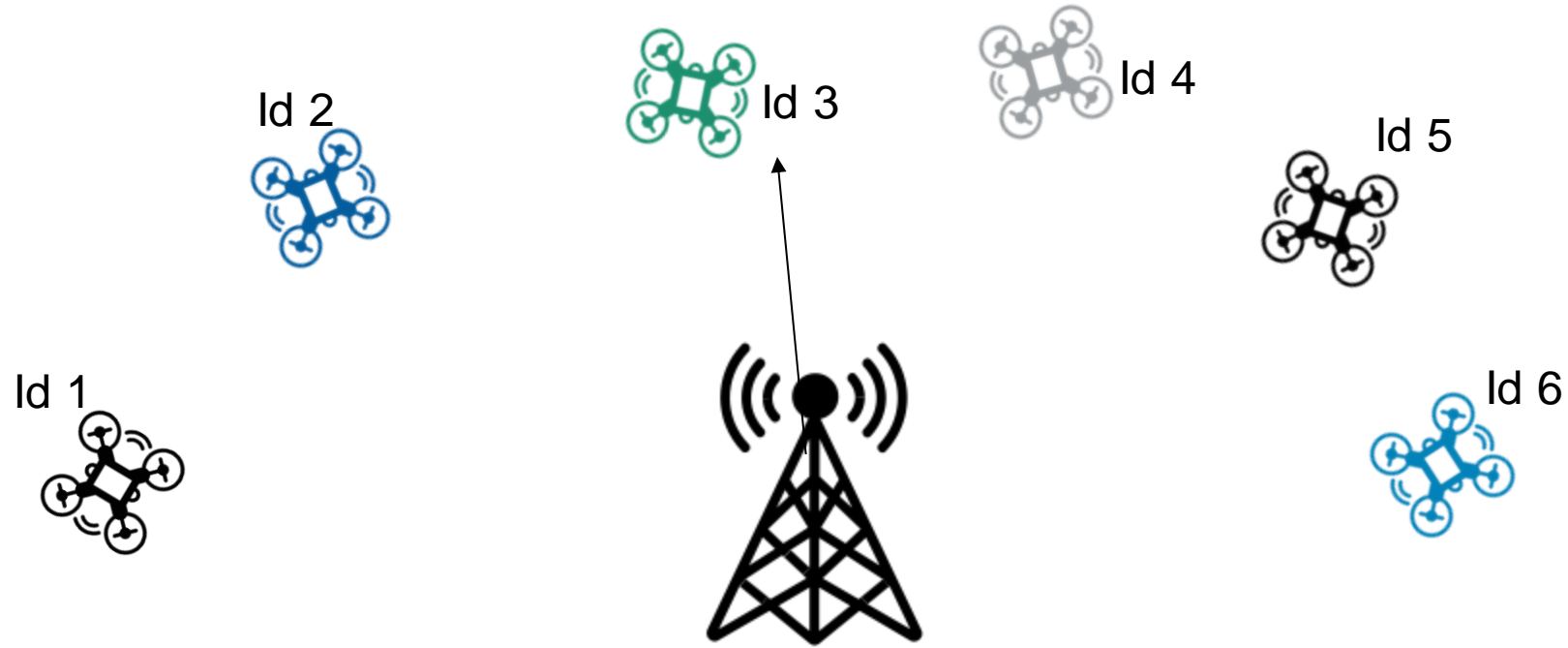
Bandwidth Allocation slots

Dr.2	Dr.6	Dr.6	Dr.4						.....
t=1	t=2	t=3	t=4			t=i-1	t=i	t=i+1	time



# HOMework 1 – MAC PROTOCOL $T=i-1$

- 1) A set of drones that want communicate with the depot
- 2) The depot allocate bandwidth to the drone at each timestamp (**Time Slotted** Channel).



Bandwidth Allocation slots

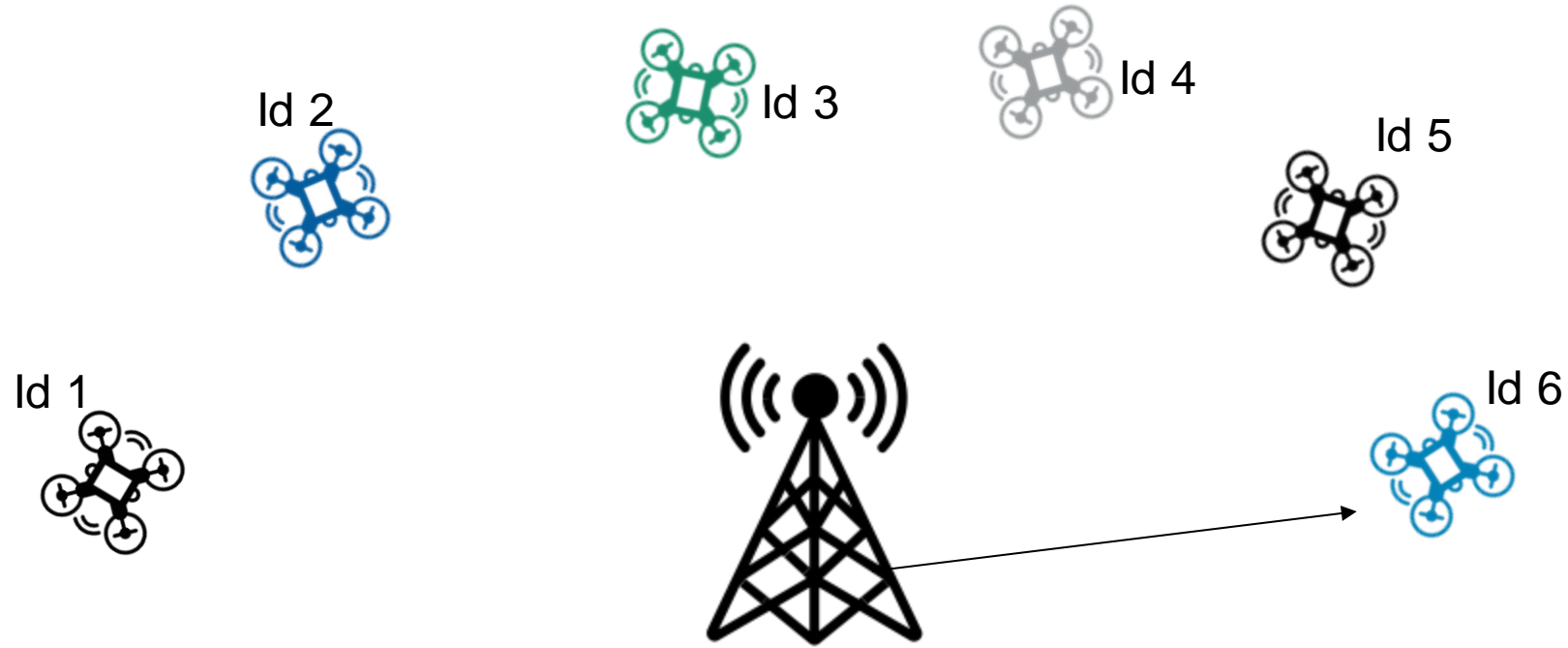
Dr.2	Dr.6	Dr.6	Dr.4	...	Dr.3				.....
t=1	t=2	t=3	t=4		t=i-1	t=i	t=i+1		time





# HOMEWORK 1 – MAC PROTOCOL $T=i$

- 1) A set of drones that want communicate with the depot
- 2) The depot allocate bandwidth to the drone at each timestamp (**Time Slotted** Channel).



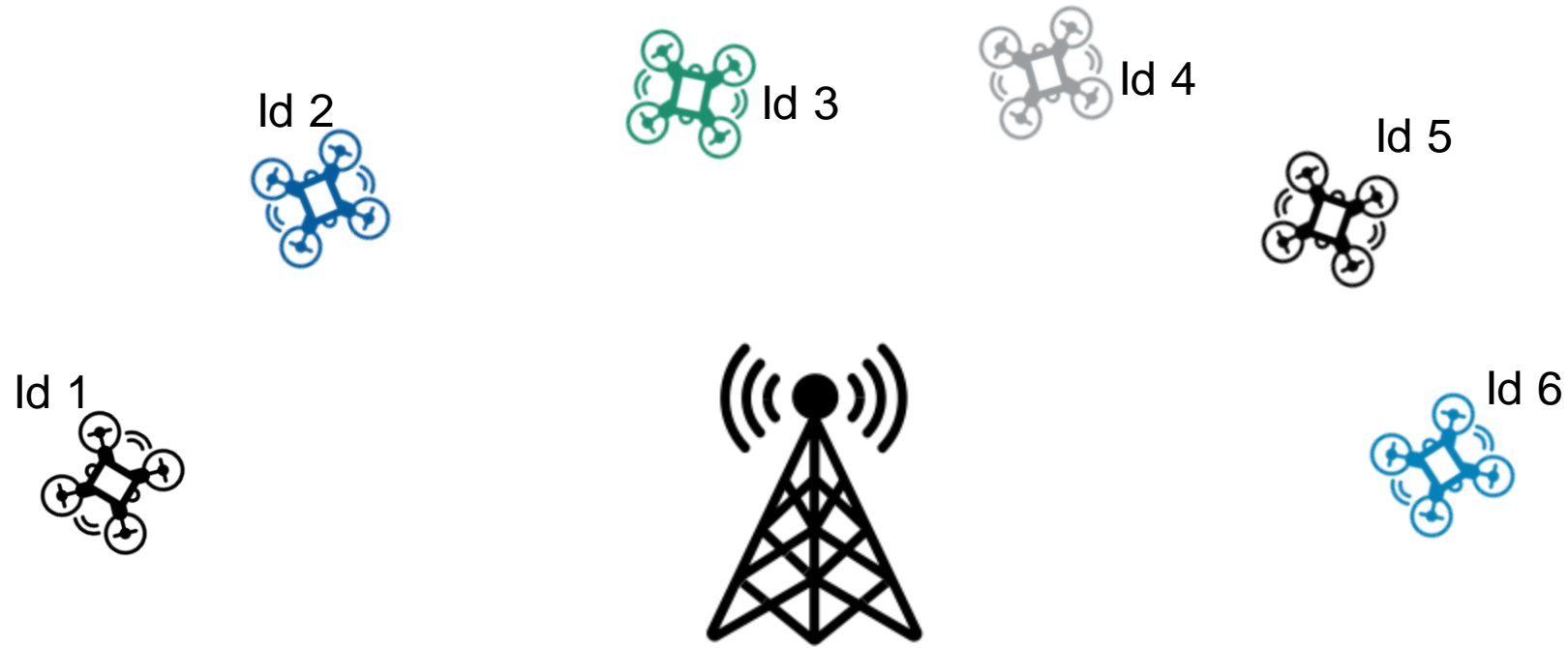
Bandwidth Allocation slots

Dr.2	Dr.6	Dr.6	Dr.4	...	Dr.3	Dr.6	...	...	...
t=1	t=2	t=3	t=4		t=i-1	t=i	t=i+1		time

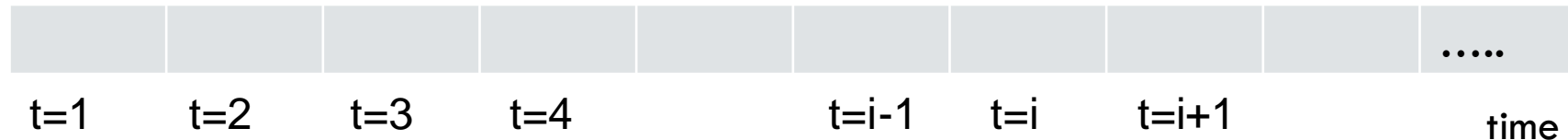


# HOMEWORK 1 — MAC PROTOCOL - HOW

1) round robin



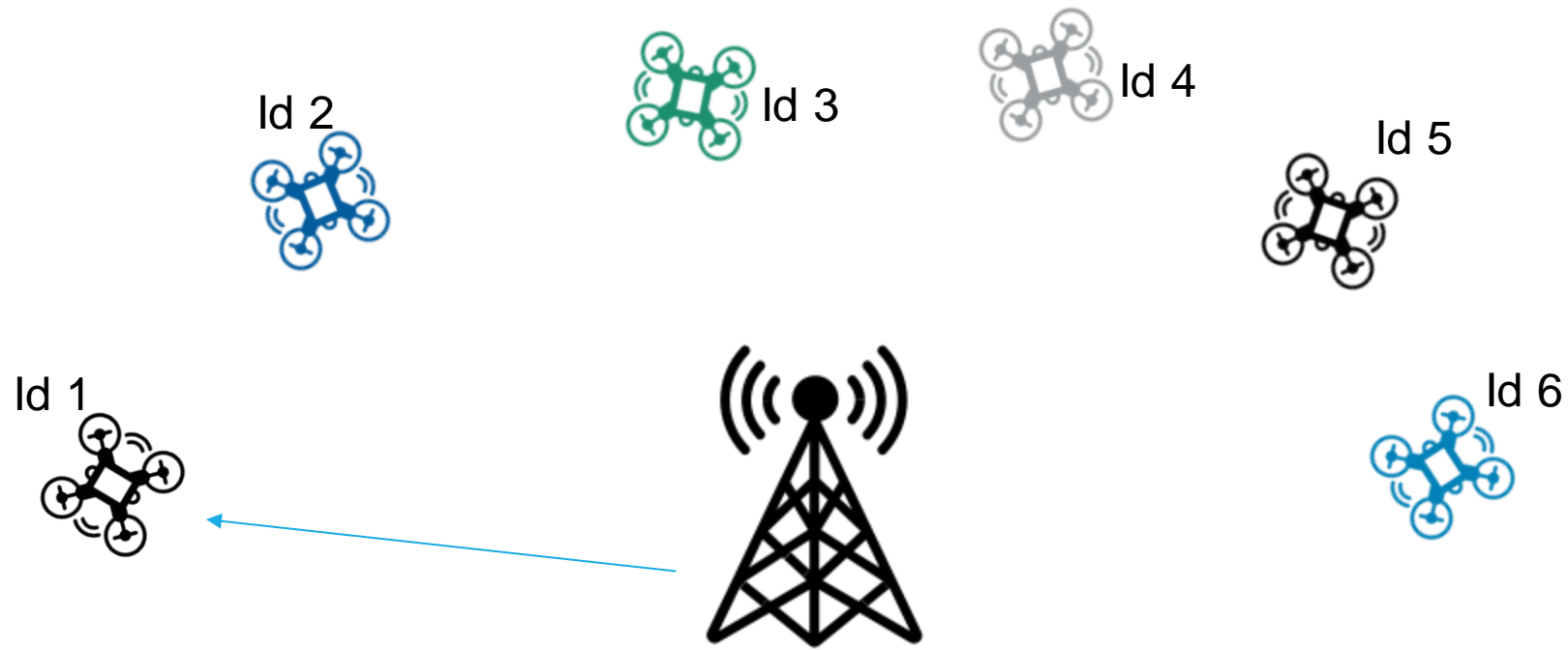
Bandwidth Allocation slots



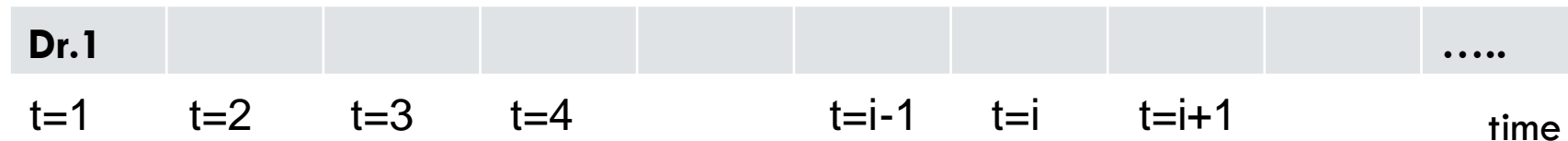


# HOMEWORK 1 – MAC PROTOCOL - HOW

1) round robin



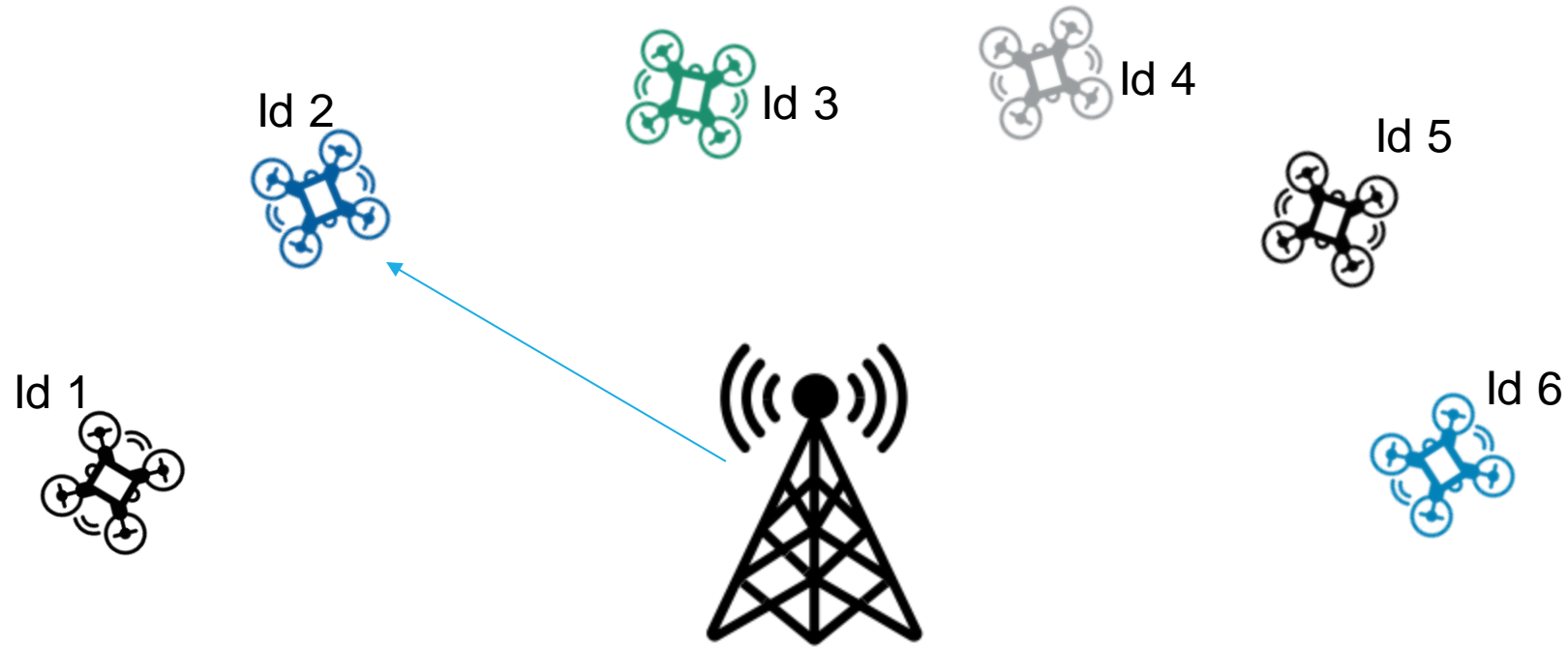
Bandwidth Allocation slots



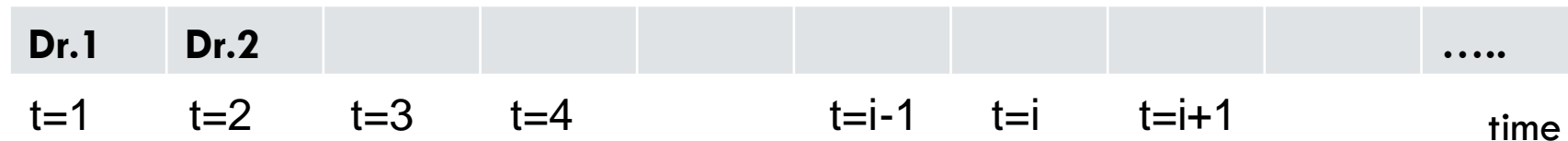


# HOMEWORK 1 – MAC PROTOCOL - HOW

1) round robin



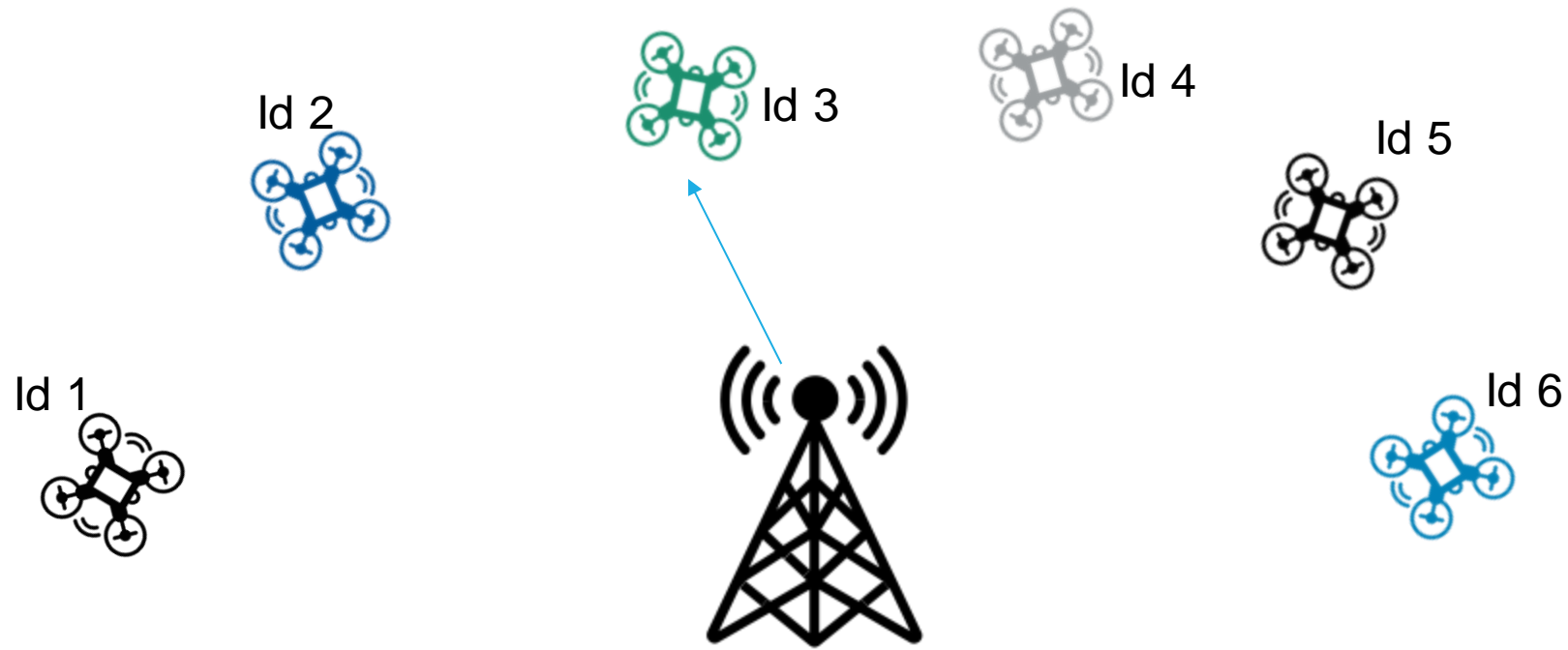
Bandwidth Allocation slots



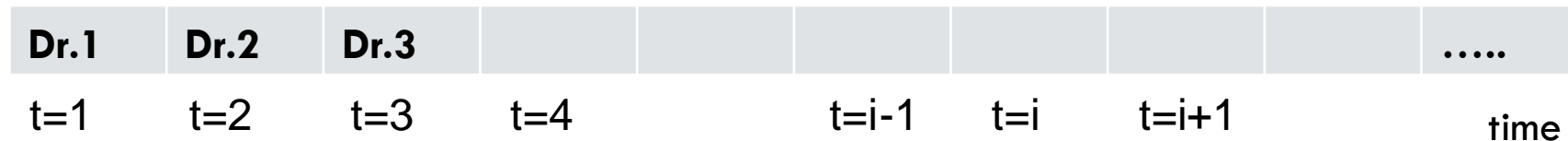


# HOMEWORK 1 — MAC PROTOCOL - HOW

1) round robin



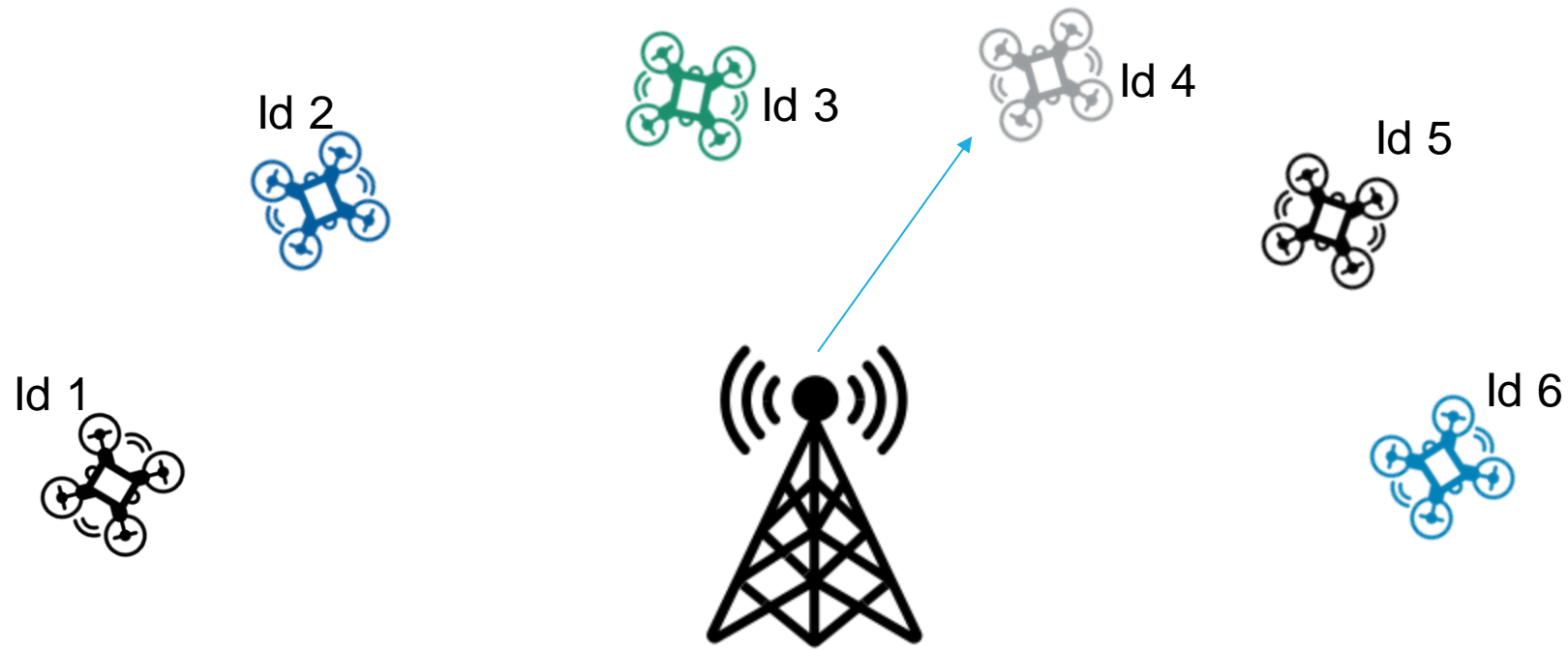
Bandwidth Allocation slots





# HOMEWORK 1 — MAC PROTOCOL - HOW

1) round robin



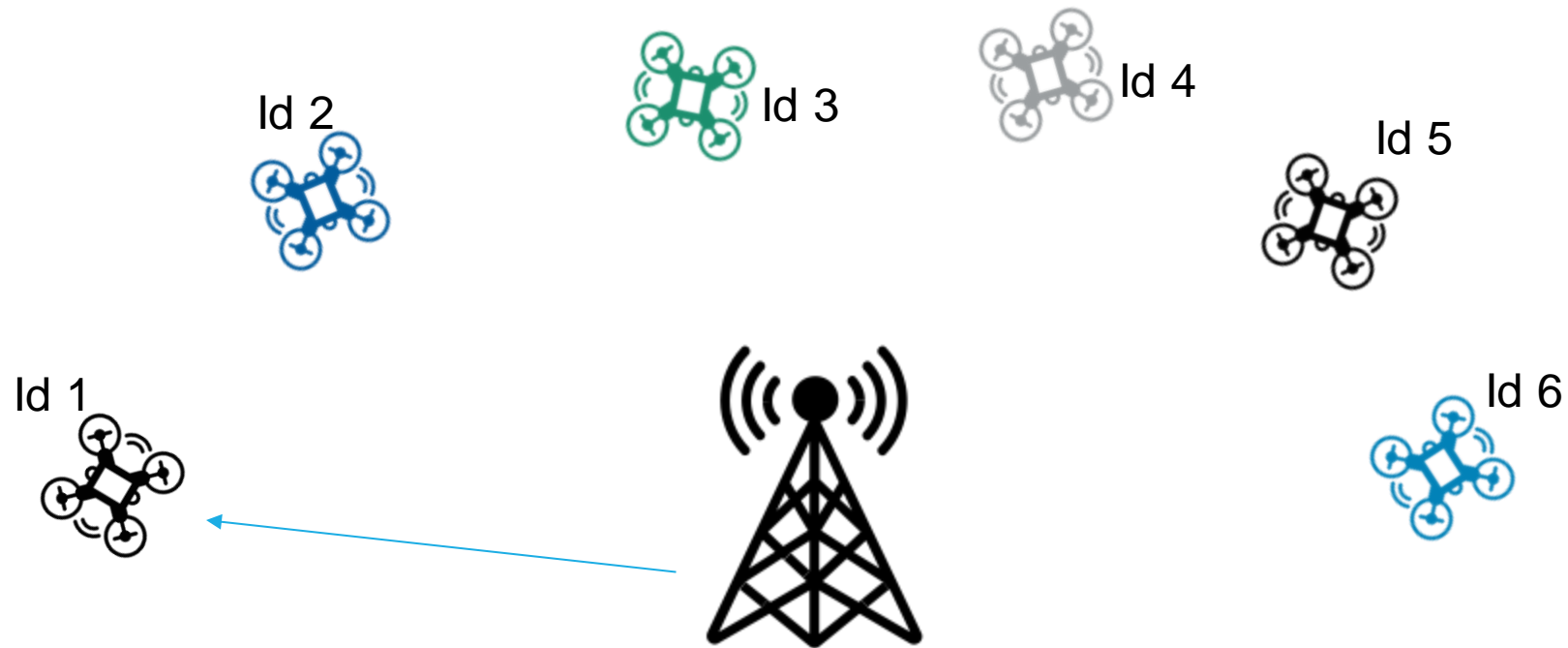
Bandwidth Allocation slots

Dr.1	Dr.2	Dr.3	Dr.4	...					.....
t=1	t=2	t=3	t=4		t=i-1	t=i	t=i+1		time



# HOMEWORK 1 – MAC PROTOCOL - HOW

1) round robin



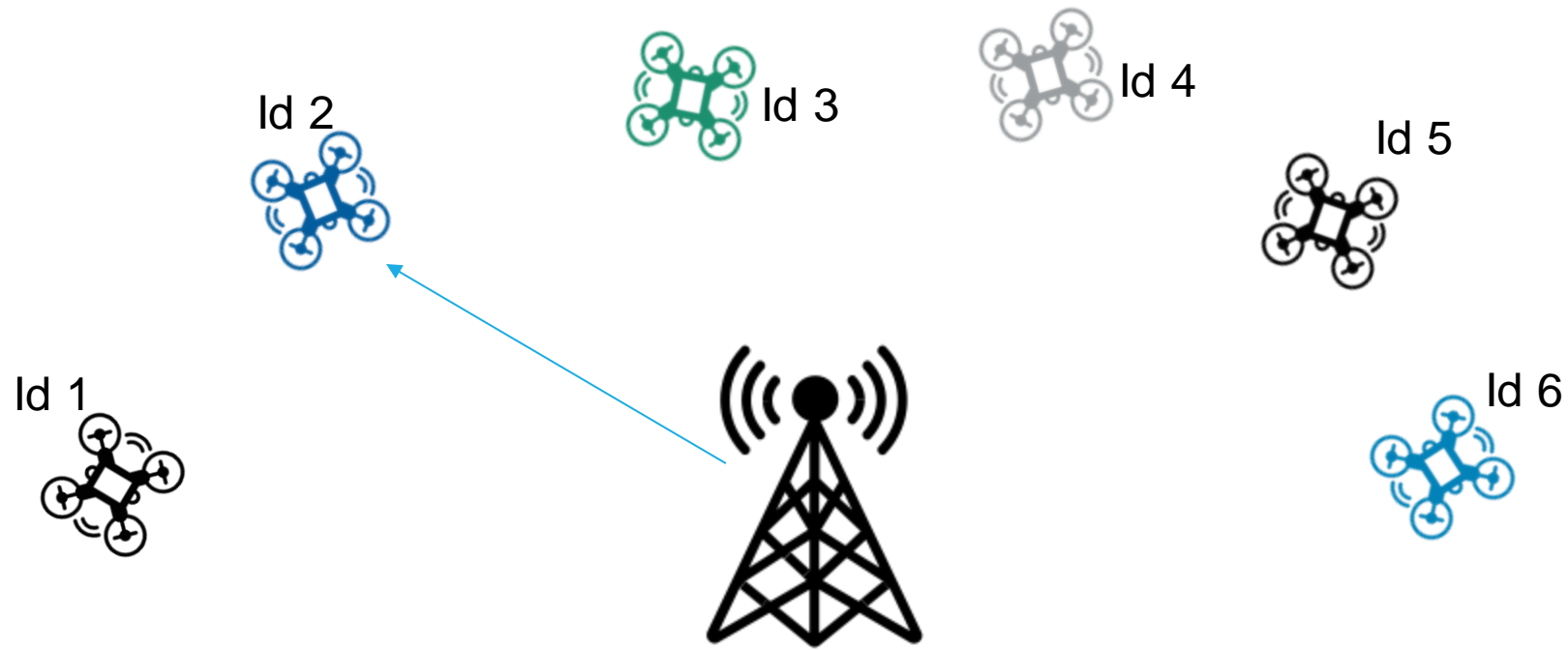
Bandwidth Allocation slots

<b>Dr.1</b>	<b>Dr.2</b>	<b>Dr.3</b>	<b>Dr.4</b>	...	<b>Dr.1</b>				.....
t=1	t=2	t=3	t=4		t=i-1	t=i	t=i+1		time



# HOMEWORK 1 – MAC PROTOCOL - HOW

1) round robin



Bandwidth Allocation slots

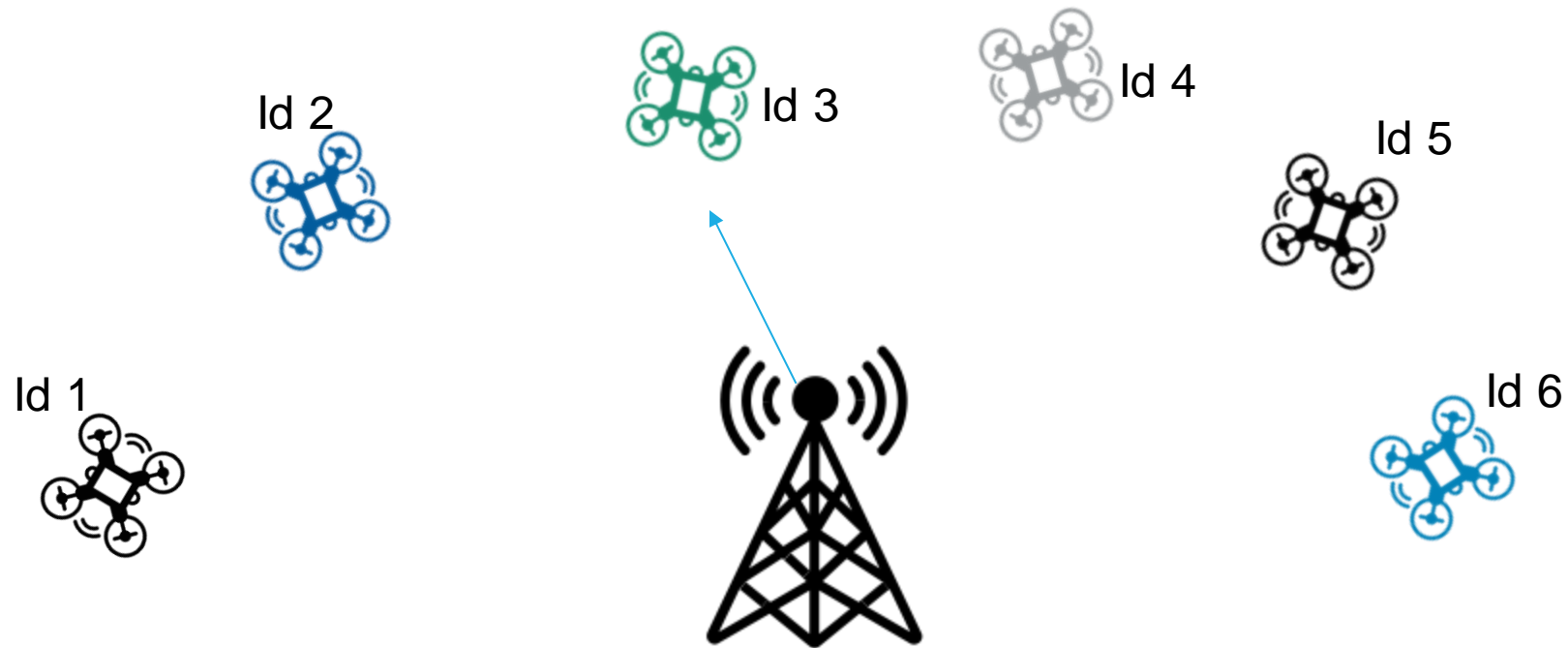
<b>Dr.1</b>	<b>Dr.2</b>	<b>Dr.3</b>	<b>Dr.4</b>	...	<b>Dr.1</b>	<b>Dr.2</b>			.....
t=1	t=2	t=3	t=4		t=i-1	t=i	t=i+1		time





# HOMEWORK 1 – MAC PROTOCOL - HOW

1) round robin



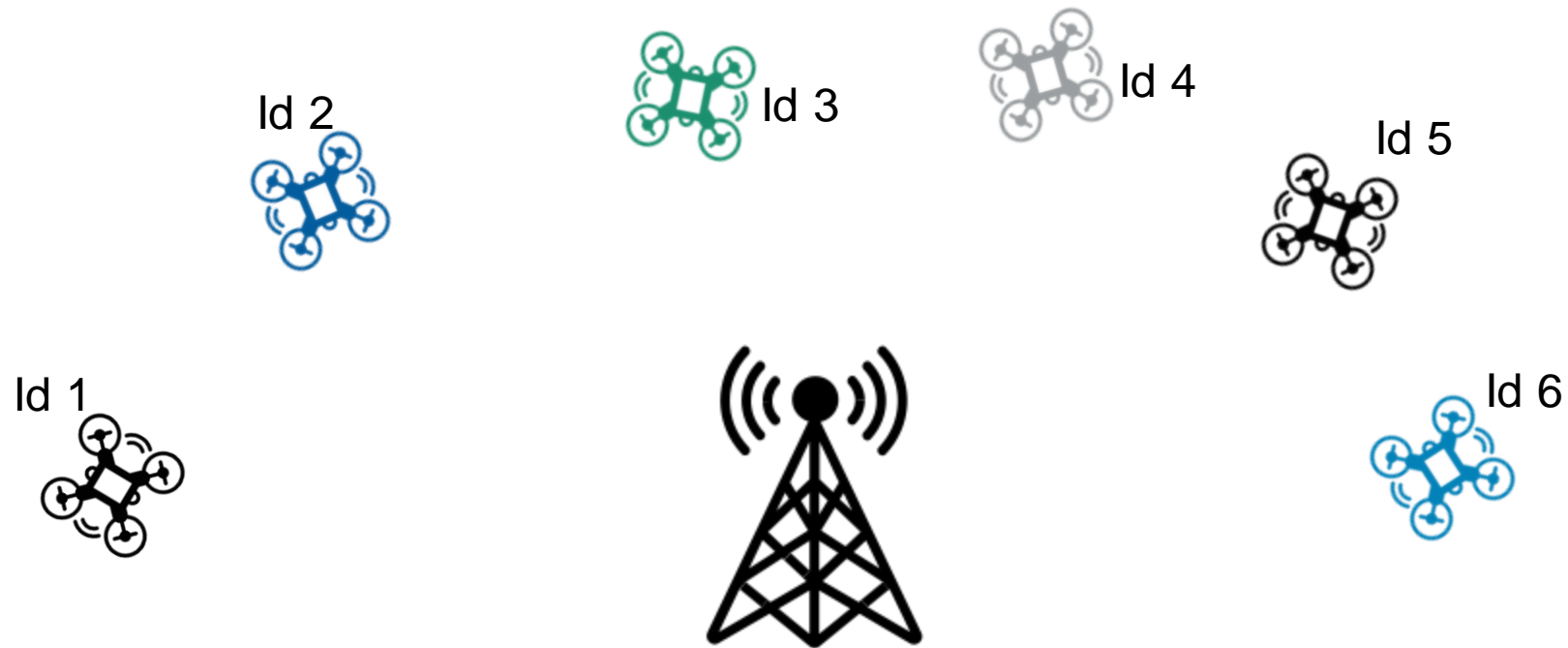
Bandwidth Allocation slots

Dr.1	Dr.2	Dr.3	Dr.4	...	Dr.1	Dr.2	Dr.3		.....
t=1	t=2	t=3	t=4		t=i-1	t=i	t=i+1		time



# HOMEWORK 1 – MAC PROTOCOL - HOW

1) Why round robin may fail?



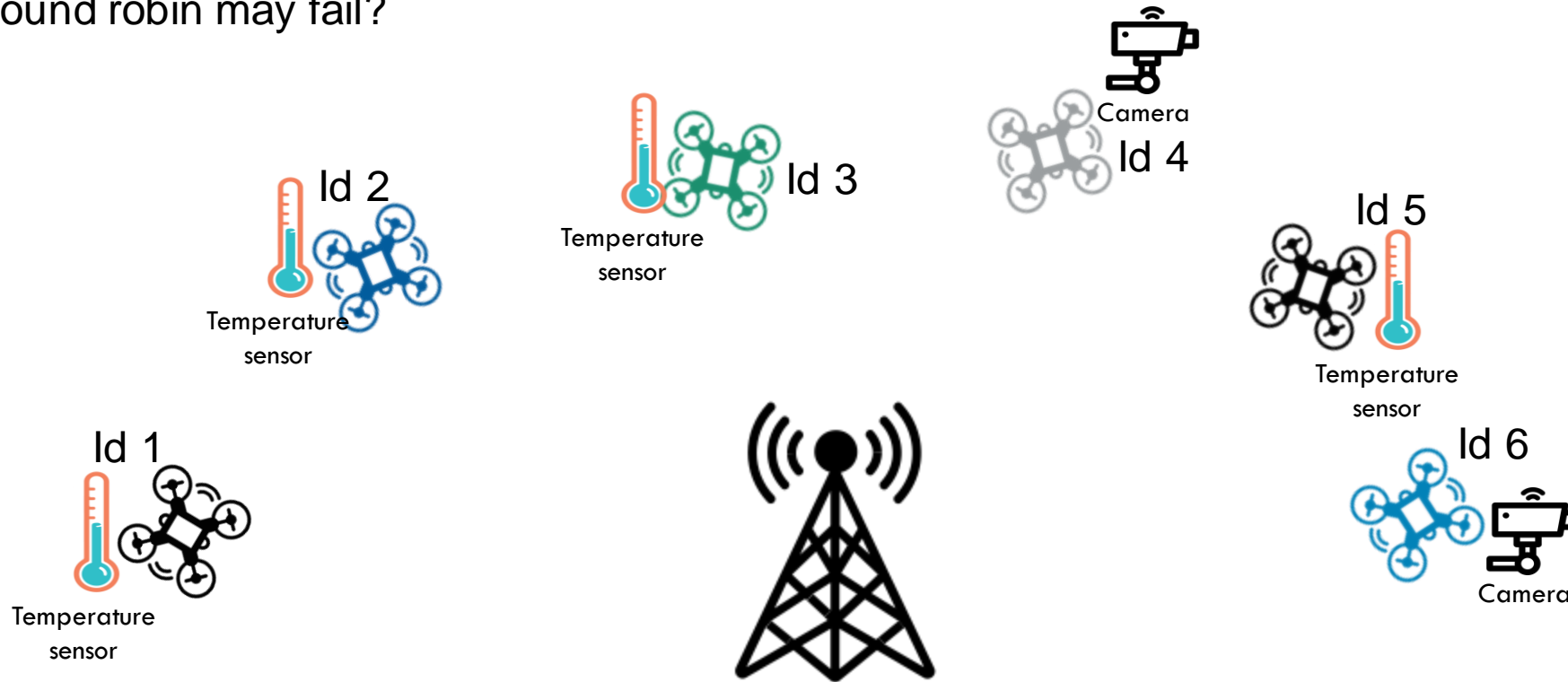
Bandwidth Allocation slots

Dr.1	Dr.2	Dr.3	Dr.4	...	Dr.1	Dr.2	Dr.3	.....	time
t=1	t=2	t=3	t=4		t=i-1	t=i	t=i+1		



# HOMEWORK 1 – MAC PROTOCOL - HOW

1) Why round robin may fail?



Bandwidth Allocation slots

Dr.1	Dr.2	Dr.3	Dr.4	...	Dr.1	Dr.2	Dr.3		.....
t=1	t=2	t=3	t=4		t=i-1	t=i	t=i+1		time

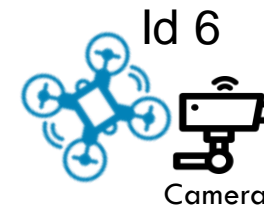
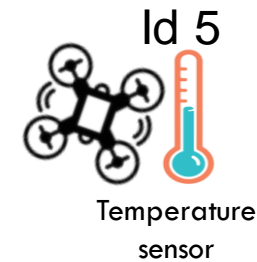
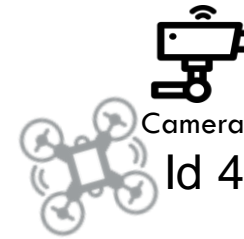
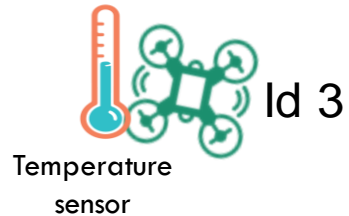
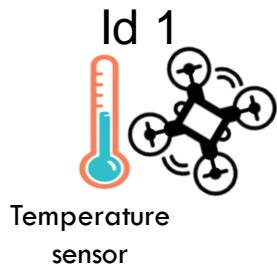
# HOMework 1 – MAC PROTOCOL - HOW

1) Why round robin may fail?

**WE SPENT SAME TIME ON EACH DRONE!**

We lost data!

The drones with cameras should be queried more frequently respect to drones with temp sensors!



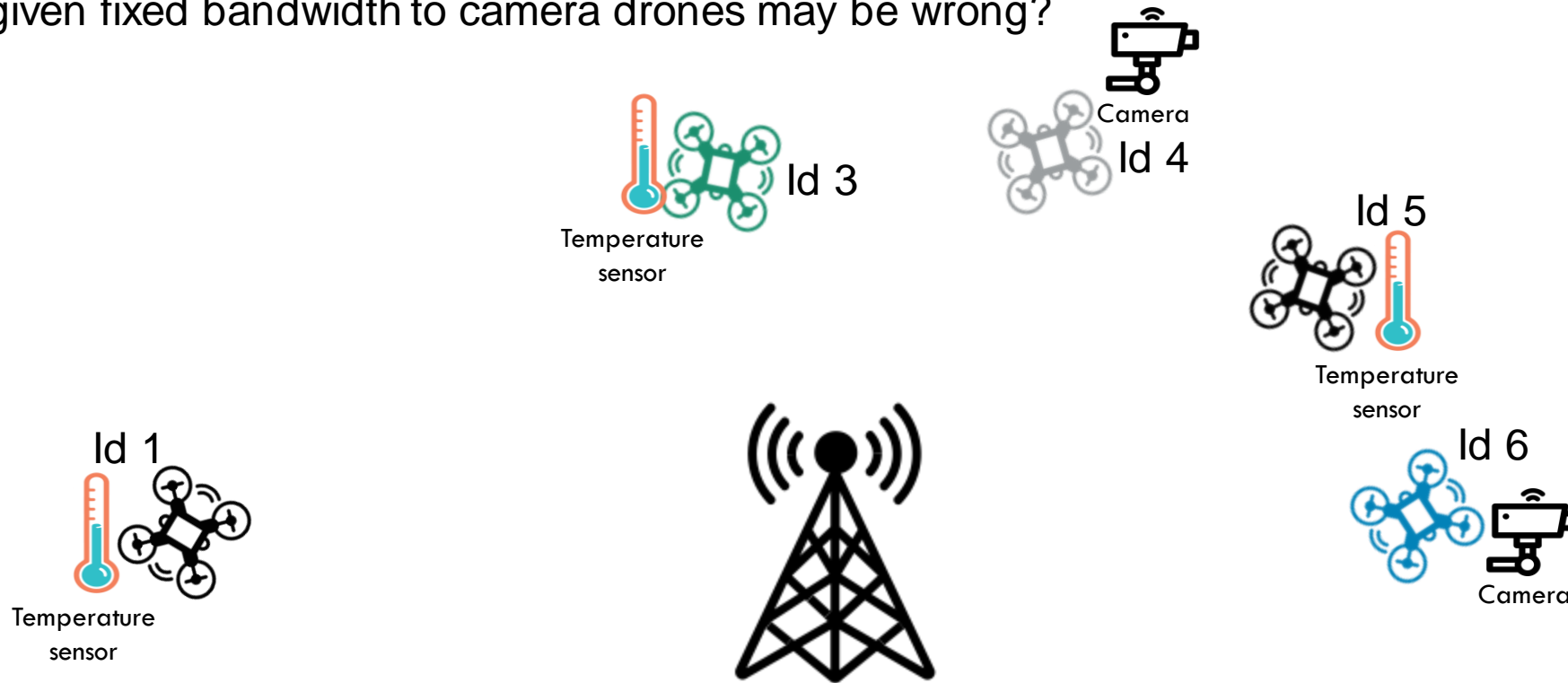
Bandwidth Allocation slots

Dr.1	Dr.2	Dr.3	Dr.4	...	Dr.1	Dr.2	Dr.3		.....
t=1	t=2	t=3	t=4		t=i-1	t=i	t=i+1		time



# HOMEWORK 1 – MAC PROTOCOL - HOW

1) Why given fixed bandwidth to camera drones may be wrong?



Bandwidth Allocation slots

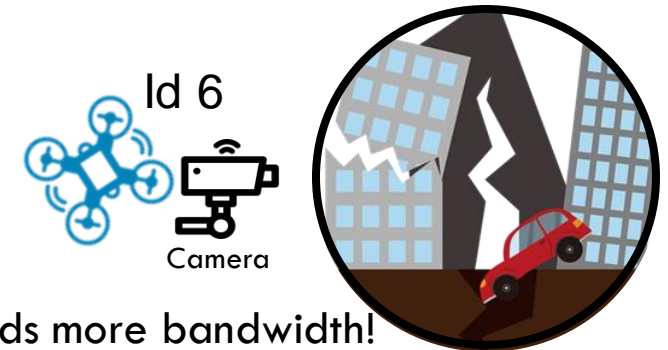
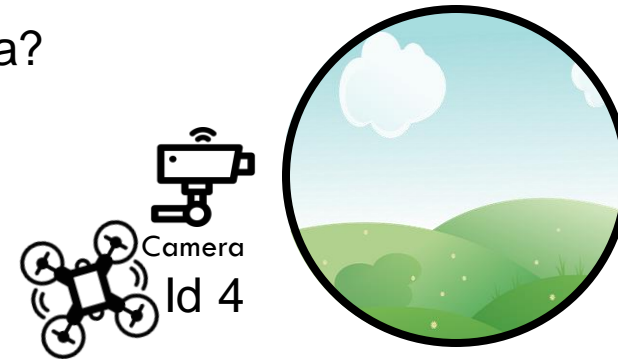
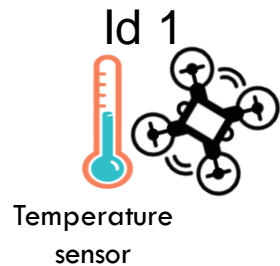
Dr.1	Dr.2	Dr.3	Dr.4	...	Dr.1	Dr.2	Dr.3	.....
t=1	t=2	t=3	t=4		t=i-1	t=i	t=i+1	time



# HOMEWORK 1 – MAC PROTOCOL - HOW

1) So we can just give more bandwidth to drones with a camera?

**WE DON'T KNOW THE POSSIBLE SITUATION!**  
We need adaptive approach!



Drone 6 needs more bandwidth!

Bandwidth Allocation slots

Dr.4	Dr.4	Dr.6	Dr.6	...	Dr.6	Dr.6	Dr.1		.....
t=1	t=2	t=3	t=4		t=i-1	t=i	t=i+1		time



# HOMEWORK 1 – MAC PROTOCOL

## GOAL:

Create a **Reinforcement Learning**  
based MAC protocol!!

**Don't use  
a MAC protocol**



**Use a Round  
Robin approach**



**Use a  
State-Of-Art protocol**



**Develop your  
own MAC  
protocol using  
Machine Learning**





# HOMEWORK 1 – MAC PROTOCOL

```
git clone https://github.com/Andrea94c/DroNETworkSimulator
```

```
git checkout hmw1
```

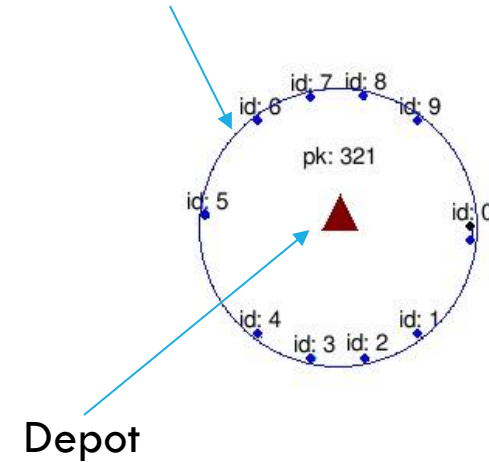
```
python3 -m src.main
```

To implement: `src.mac_protocol.ai_depot_mac` (used by the depot)

The method selects the next drone to query.

1905/15000

Drones which move  
around the depot







# HOMEWORK 1 – MAC PROTOCOL

**TASK:** Implement the "allocate\_resource\_to\_drone" method. (DO NOT change other files)

**Use it by setting:**

`config.MAC_ALGORITHM = MACAlgorithm.AI`

```
config.py × depot_mac_weighted.py × ai_depot_mac.py × depot_mac_rnd.py × depot_mac.py × uav_entities.py ×
1
2 import ...
3
4
5 """
6 The class is responsible to allocate communication resources to neighbors drones that want to offload data to the depot.
7 We work over an simplified TDMA approach, each time step only one drone can receive the resource and communicate a packet to the depot.
8 """
9 class AIDepotMAC(DepotMAC):
10
11     def allocate_resource_to_drone(self, drones: list, cur_step: int) -> Drone:
12         """ Return the drone to who allocate bandwidth for upload data in this step """
13         # implement here your intelligent logic
14         return None
```

If you need random generators, create them in the `__init__`  
**`self.rnd_for_mac = np.random.RandomState(self.simulator.seed)`**



# HOMework 1 — MAC PROTOCOL - FEEDBACK

To learn and adapt according the scenario, the MAC stores a feedback from the last communication.

Self.last\_feedback (when not None) contains a tuple (drone, transmission, feedback):

**Transmission** (if the current transmission was usefull or not):

*False* : if the drone does not send any packet (he has no alive packets)

*True* : if the drone sends a packet right now (he has at least one alive packet)

**Feedback** (how many packets we missed):

*0* : if the drone have no lost packets since last update (no packet has been generated since last communication)

*a positive integer (+pos)* : if the drone have some lost packets. The "pos" is the number of packets lost since

last

communication. A packet generated and expired counts as 1.



# FEEDBACK - EXAMPLE

1. Drone **A** generates a new **(1) packet** at time  $t_0$  and **we query it immediately**.

**The method returns (A, True, 0)** (transmission success and no packets lost since last query)

2. Then, drone A generates **new nine (9) packets**, at time  $t_1$ , **eight (8) expired** and **one (1) is still alive**, and we query it.

At time  $t_1$  it offload the last packet but the remaining (8) packets are lost as expired (not queried in time).

**The method returns (A, True, 8)** (good query, a new packet, but we lost 8 packets, we should query it more frequently).

3. Then, drone A generates **4 packets** up to time  $t_2$ . **They all expire before we query it** at time  $t_3$ .

thus, at time  $t_3$  the drone A has no alive packets and we query it.

**The method returns (A, False, 4)** (bad query, no new packet, and we also lost 4 packets, we should query it more frequently)

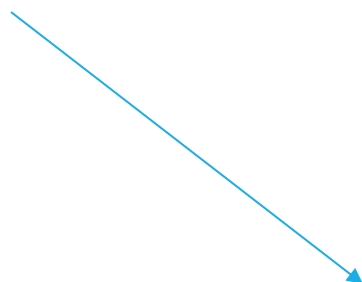
4. Then, drone A does not generate packets anymore. At time  $t_4$  **the drone A has no packets** and we query it.

**The method returns (A, False, 0)** (no new packets, useless query).



# FEEDBACK - EXAMPLE

Enable debug print in: **config.MAC\_PRINT\_STATS = True**



```
Transmission for drone: 7 was False - with feedback 0  
Transmission for drone: 7 was False - with feedback 0  
Transmission for drone: 4 was False - with feedback 5  
Transmission for drone: 5 was True - with feedback 1  
Transmission for drone: 5 was False - with feedback 0  
Transmission for drone: 5 was False - with feedback 0  
Transmission for drone: 5 was False - with feedback 0  
Transmission for drone: 5 was False - with feedback 0  
Transmission for drone: 6 was True - with feedback 0  
Transmission for drone: 5 was False - with feedback 0  
Transmission for drone: 3 was True - with feedback 1  
Transmission for drone: 5 was False - with feedback 0  
Transmission for drone: 5 was False - with feedback 0  
Transmission for drone: 3 was False - with feedback 0  
Transmission for drone: 4 was False - with feedback 4  
Transmission for drone: 4 was False - with feedback 0
```



# HOMEWORK 1 — MAC PROTOCOL

Python3 -m src.main (at the end of the simulation)

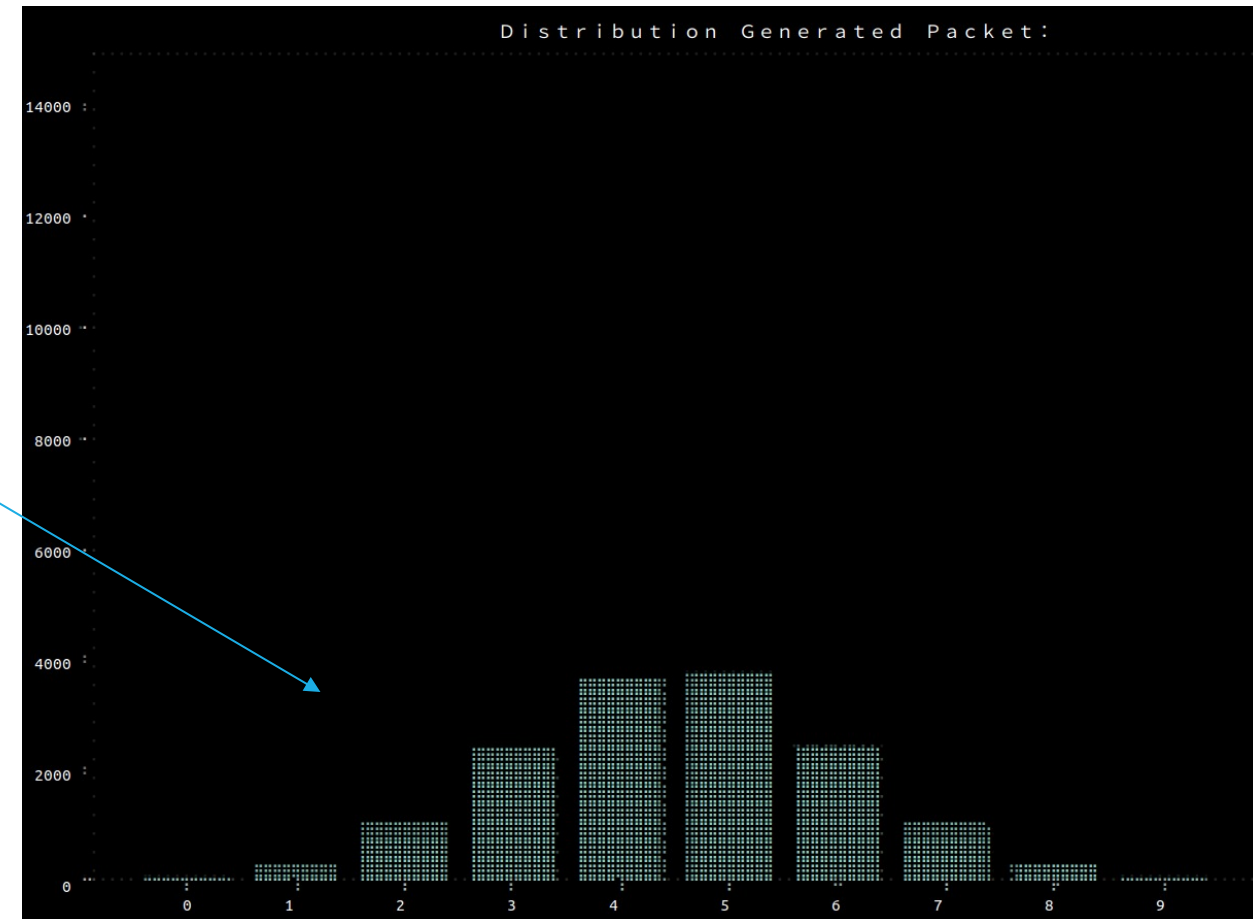
The packets generated by each drone

Enable them in:

`Config.PLOT_HISTOGRAMS=True`

Two versions:

- **`config.MATPLOTLIB_TERMINAL=True`**  
which needs "pip install matplotlib-terminal"
- **`config.MATPLOTLIB_TERMINAL=False`**  
Simple text print.





# HOMEWORK 1 — MAC PROTOCOL

Python3 -m src.main (at the end of the simulation)

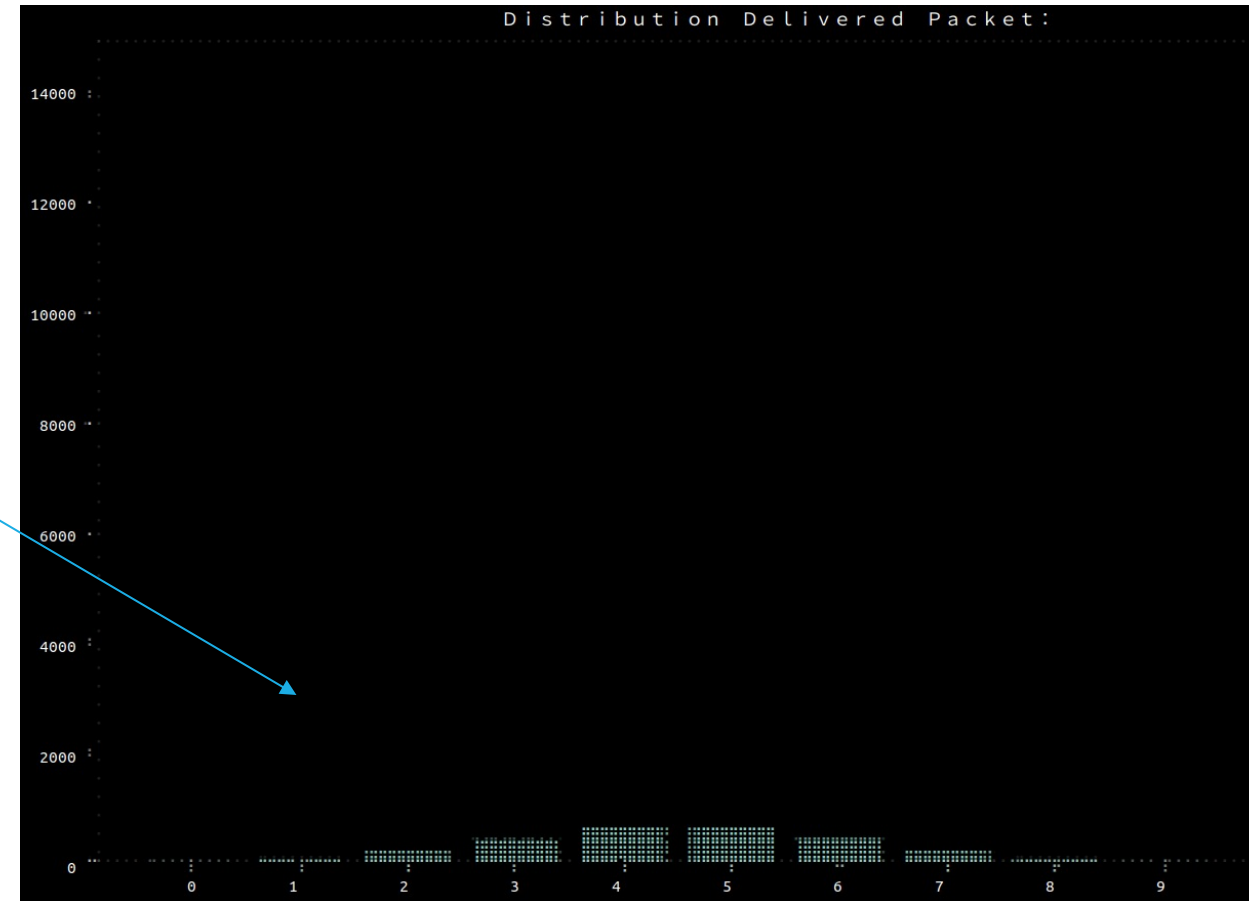
The packets collected by the depot,  
from each drone

**SCORE:**

```
event_mean_delivery_time 0.1554158711510720  
Collected Ratio: 0.18413333333333334
```

(packet collected) / (packet generated)

Higher is better! This is your main goal!





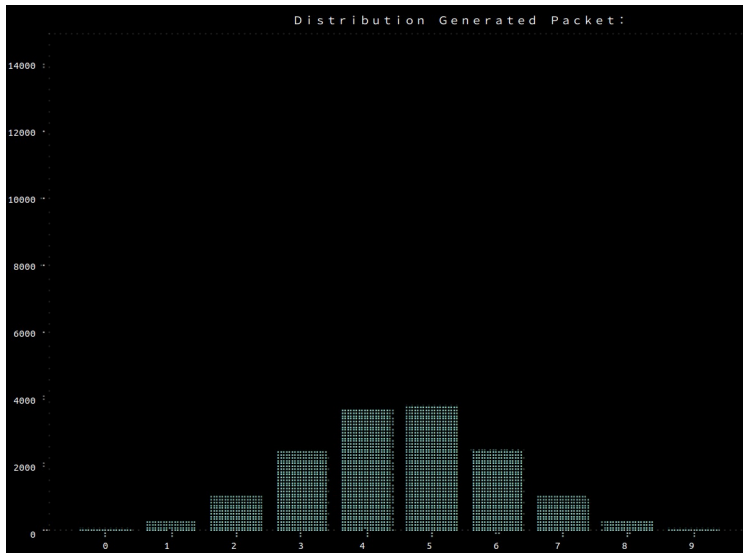
# HOMEWORK 1 – MAC PROTOCOL

How the packets are generated? We use Stationary probability (mostly)

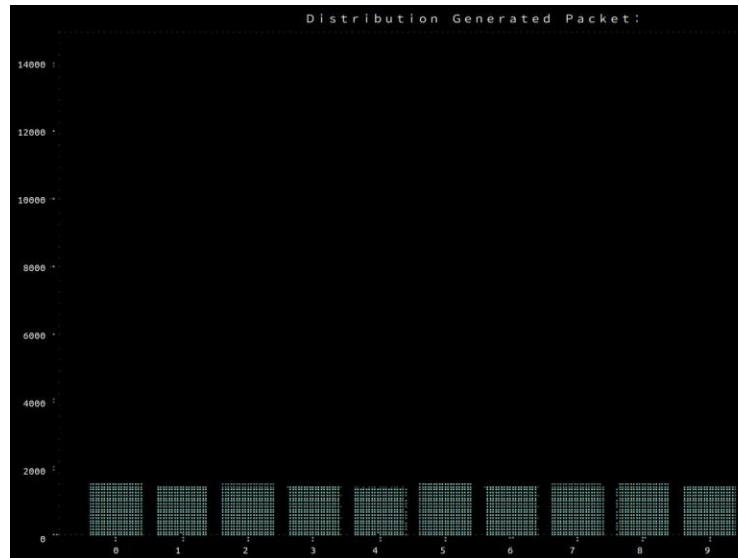
```
class GenerationPattern(Enum):  
    GAUSSIAN = 0  
    UNIFORM = 1  
    FIXED_PROB = 2  
  
RANDOM_GENERATION_PATTERN = GenerationPattern.UNIFORM
```

Select the generation pattern

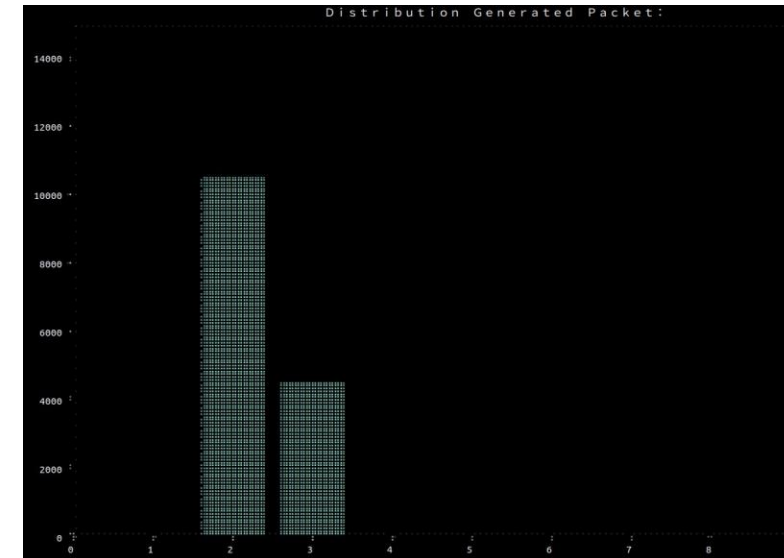
Gaussian



Uniform



With fixed probabilities





# HOMEWORK 1 — MAC PROTOCOL

How to compare your approach/protocol? `./src/experiments/run_mac_experiments.sh`

Try different number of drones

The algorithms to compare

The effectively code to run.  
Remove comments to run extensive simulations;  
also set  $i_s = 0$  and  $e_s 10$ .

Avoid too much parallelism!

How many seeds to run (# experiments). `range(i_s, e_s)`

The number of seeds used

Experiments to plot

Plot code

```
#test baselines
for nd in "2" "5" "8" "10" "15"; # number of drones
do
  for alg in "RND" "RR" "WEIGHT" "AI";
  do
    echo "run: ${alg} - ndrones ${nd} "
    python3 -m src.experiments.experiment_mac -nd ${nd} -i_s 0 -e_s 2 -alg ${alg} &
    #python3 -m src.experiments.experiment_mac -nd ${nd} -i_s 10 -e_s 20 -alg ${alg} &
    #python3 -m src.experiments.experiment_mac -nd ${nd} -i_s 20 -e_s 30 -alg ${alg} &
    #wait
  done;
  #wait
done;
wait

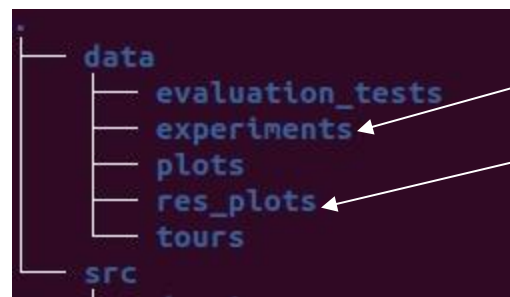
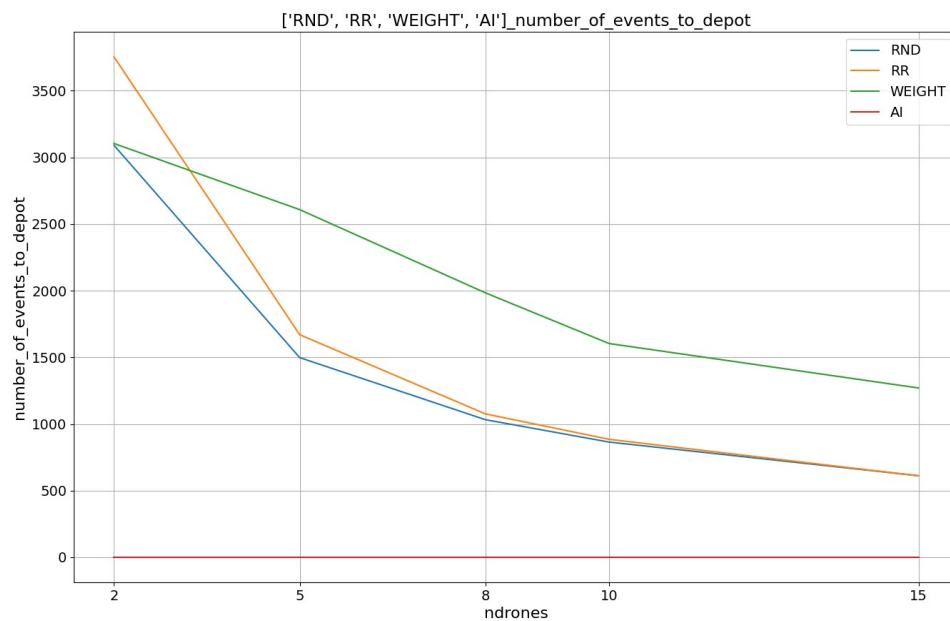
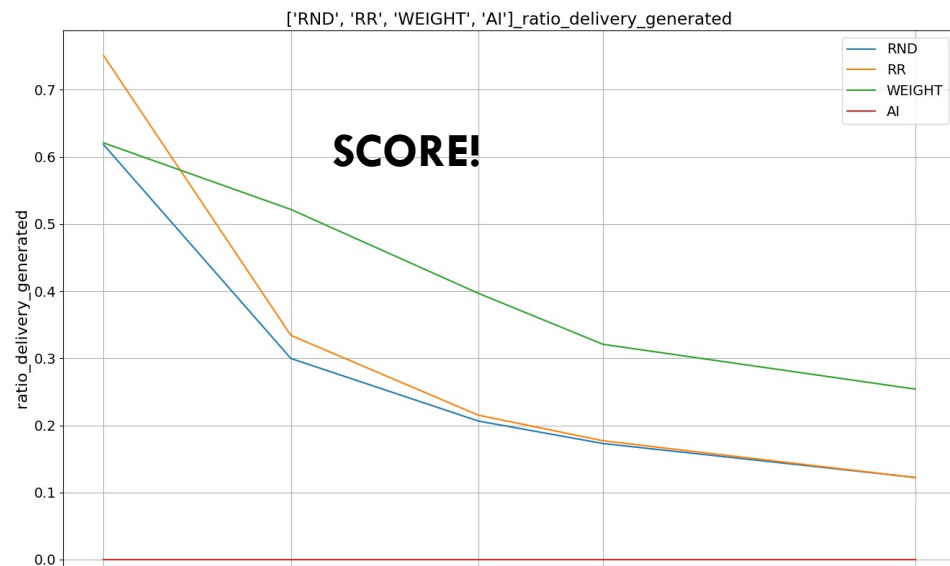
python3 -m src.experiments.json_and_plot -nd 2 -nd 5 -nd 8 -nd 10 -nd 15 -i_s 0 -e_s 2 -exp_suffix RND -exp_suffix RR -exp_suffix WEIGHT -exp_suffix AI
```





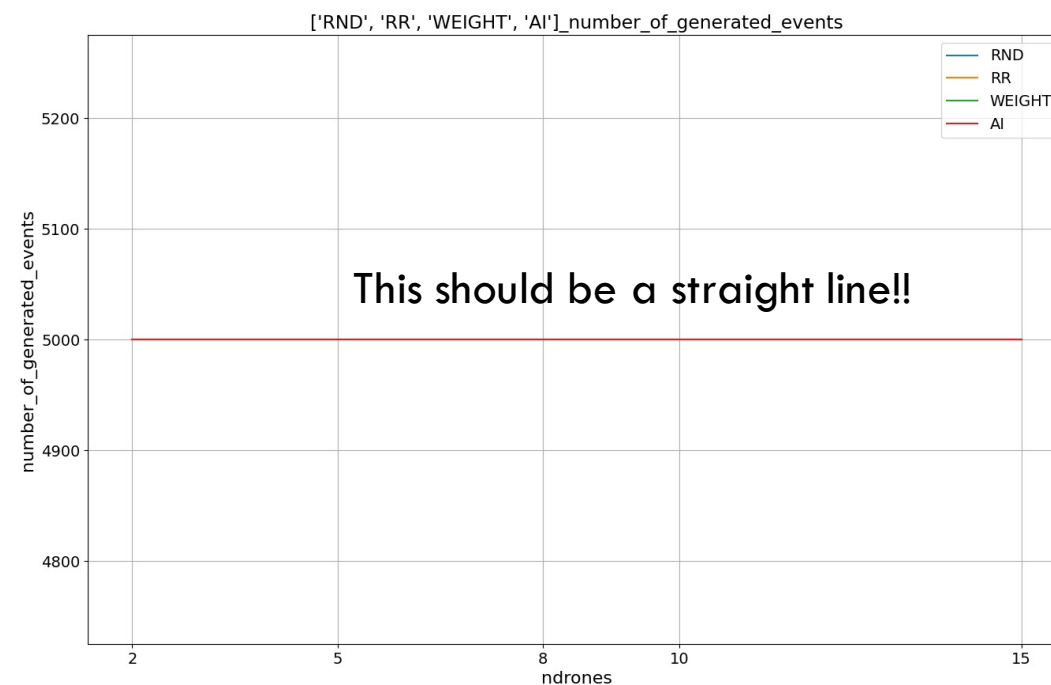
# HOMework 1

## MAC PROTOCOL - RESULTS



Json files with all the data

Plot with metrics





# HOMework 1!!

**Deadline:** 23:59:59 - 03/12/2020

**How :** in group of 1 to 3

**Submission:** report + code

**Score:** up to 31 (30 cum laude)

**Interaction lecture:** 10:00 - 26/11/2020

**FAQ:** Common questions will be answered on classroom, above the homework post

**Evaluation:** approach; report; algorithm score (% of delivered packets).

**Challenge:** rank of top 10 algorithms.





# HOMework 1 - GRADE

**Homework 1:** up to 31 (30 cum laude)

**If grade  $\geq 18$  then 2 options:**

1. **Stop here:** final grade is scaled to 18 (oral discussion is required<sup>[1]</sup>)
2. **Homework 2** (see next slide)

**Note:**

[1] – grade can eventually increase up to 20

Suspected cases of plagiarism will be contacted to validate (or invalidate) the overall exam.



# HOMework 2 - GRADE

**Homework 2:** up to 31 (30 cum laude)

**Final homeworks grade:** (grade homework 1 + grade homework 2) / 2

**If final homeworks grade  $\geq 18$  then 2 options:**

1. **Stop here:** final grade is  $\text{round}(\text{Final homework grade} / 30 * 24)$  - (oral discussion is required<sup>[1]</sup>)
2. **Further integration** (to be decided)

**Note:**

[1] – grade can eventually increase up to 26.

Suspected cases of plagiarism will be contacted to validate (or invalidate) the overall exam.



# HOMEWORK 1 - SUBMISSION

## How:

- **email** (**subject**=[Autonomous Networking - A.A. 2020-2021] – HMW1)
- **Classroom**

## Format:

A zip called **studentid1\_surnmane1\_studentid2\_surnmane2\_studentid3\_surnmane3.zip** with:

- a brief report, at most 1000 words (images, biography and final notes are not counted). The final notes should clarify which part was mainly done by whom (50 words for each student of the team).
- A unique src file with the algorithm. Create a new name for your proposal, “algorithmname” and add the first “studentid1” at the end of the name : “algorithmname\_studentid1” .

E.g., group of students made by: “Black - id: 999” and “Donald – id: 01”.

They create a new algorithm called “X\_MAC”, then, the delivery will be:

**Zip: 999\_black\_01\_donald.zip**

Inside the zip:

- **999\_black\_01\_donald\_report.txt**
- **999\_black\_01\_donald\_mac\_protocol.py** (which contains the algorithm class called “X\_MAC\_999”)

Currently the file algorithm is called  
"ai\_depot\_mac.py" and the algorithm is called  
AlDepotMAC.  
**Submit only this file but change the file name  
and the algorithm name (see example here).**



# HOMework 1 - REPORT

The report should include :

- Main approach and used techniques.
- Analysis of the performance and convergence.
- All the need additional libraries!!

Possible ML/AI libraries to use (if needed, not mandatory):

- Sklearn
- Keras
- Tensorflow

Please use only recent versions. In case of doubts write us an email. Disable any GPU usage before submit the homework.

If your model requires an intensive training phase, send to us also the persistent model to use.



# HOMework 1 – END

Possible interaction to understand your score/position: [https://bit.ly/hmw1\\_score](https://bit.ly/hmw1_score)

You can send to me your score with an email, subject '**[Autonomous Networking - A.A. 2020-2021] – score**'



# CONTACTS

**Andrea Coletta:**

coletta@di.uniroma1.it

