

# **Machine Learning Project work: “Tennis Table Tournament”**

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# MIVIA Tennis Table Tournament!

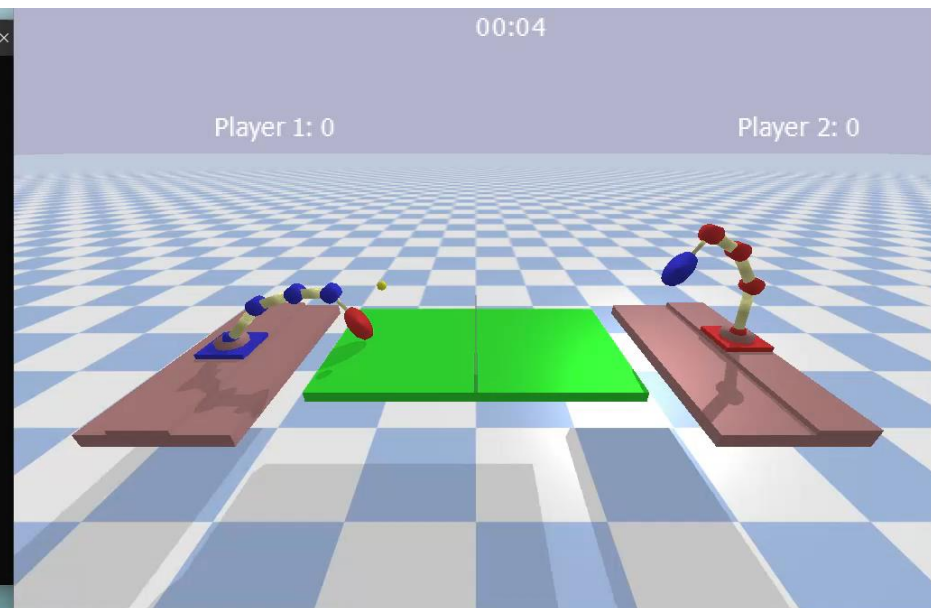
- ◆ Control a robotic arm to play tennis table, starting from a virtual environment
- ◆ Train your neural network on our GPU to respond to different environment inputs
- ◆ Win the games and rule the leaderboard! Future teams may challenge you!



# The task to address

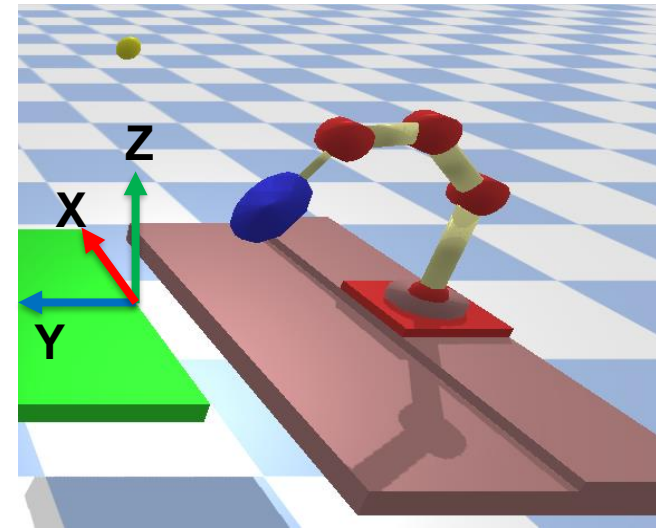
- ◆ The aim of this project is to train a neural network to play Tennis Table!
- ◆ We use a custom virtual environment to do it

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Amministratore: Anaconda Pr
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(pybullet) C:\Users\dgrag\PycharmProjects\pybullet\tennis_table>
(pybullet) C:\Users\dgrag\PycharmProjects\pybullet\tennis_table>python demo.py
pybullet build time: Oct 14 2023 15:53:02
starting thread 0
started testThreads thread 0 with threadHandle 0000000000000268
argc=2
argv[0] = --unused
argv[1] = --start_demo_name=Physics Server
ExampleBrowserThreadFunc started
Version = 4.6.0 - Build 31.0.101.4575
Vendor = Intel
Renderer = Intel(R) Iris(R) Xe Graphics
b3Printf: Selected demo: Physics Server
starting thread 0
started MotionThreads thread 0 with threadHandle 0000000000000520
MotionThreadFunc thread started
=== Waiting for players ===
=== Adding player: Player 1 ===
=== Adding player: Player 2 ===
=== Ready to start ===
=== Preparing for service: Player 1 ===
```



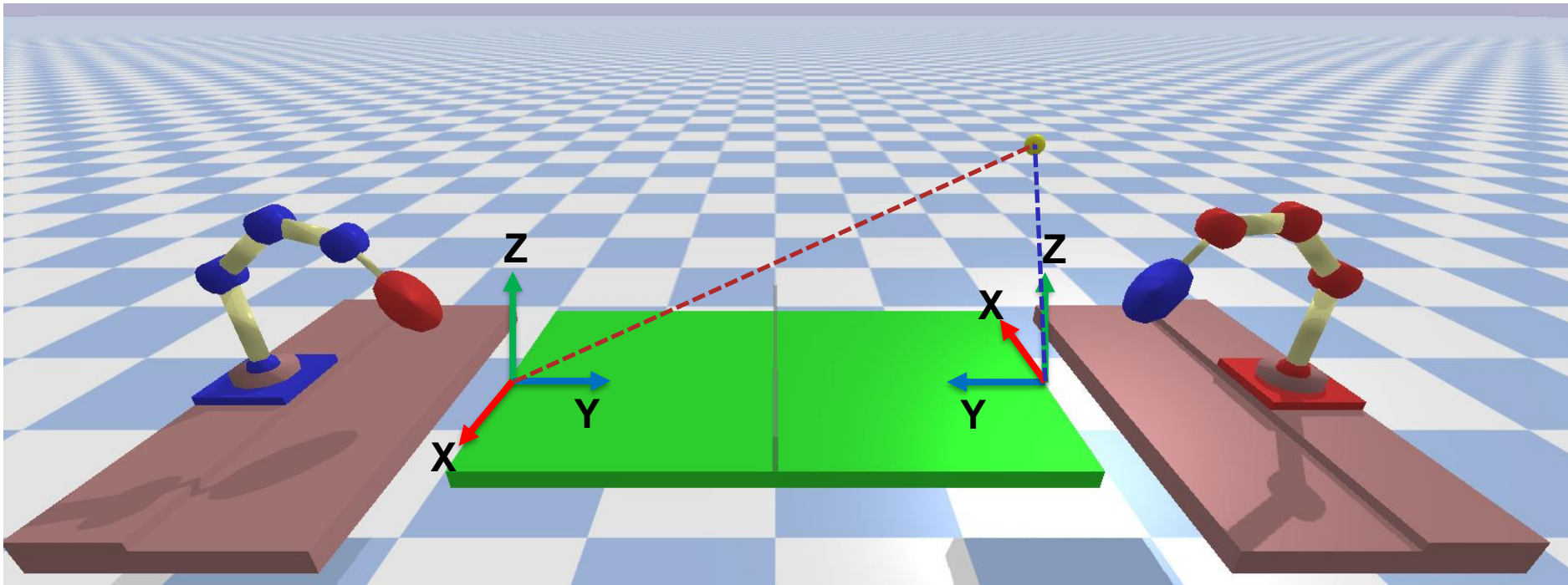
# The 37 state variables

- ◆ 0-10 joints position
- ◆ 11-13 pad center position (x,y,z)
- ◆ 14-16 pad normal versor (x,y,z)
- ◆ 17-19 Current ball position (x,y,z)
- ◆ 20-22 Current ball velocity (x,y,z)
- ◆ 23-25 Opponent pad center position (x,y,z)
- ◆ 26 Game waiting, cannot move (0=no, 1=yes)
- ◆ 27 Game waiting for opponent service (0=no, 1=yes)
- ◆ 28 Game playing (i.e., not waiting) (0=no, 1=yes)
- ◆ 29 Ball in your half-field (0=no, 1=yes)
- ◆ 30 Ball already touched your court (0=no, 1=yes)
- ◆ 31 Ball already touched your robot (0=no, 1=yes)
- ◆ 32 Ball in opponent half-field (0=no, 1=yes)
- ◆ 33 Ball already touched opponent's court (0=no, 1=yes)
- ◆ 34-35 Your score, Opponent score
- ◆ 36 Simulation time



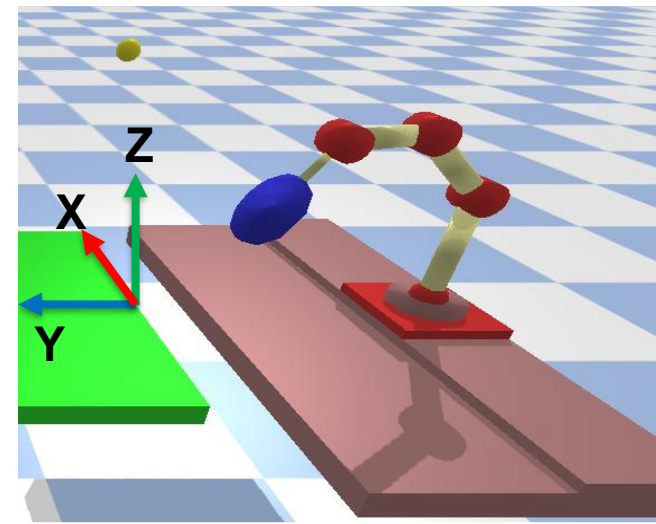
# The 37 state variables

- ◆ Each player has its own coordinate system
- ◆ State variables are referred to this system



# The 11 joint variables

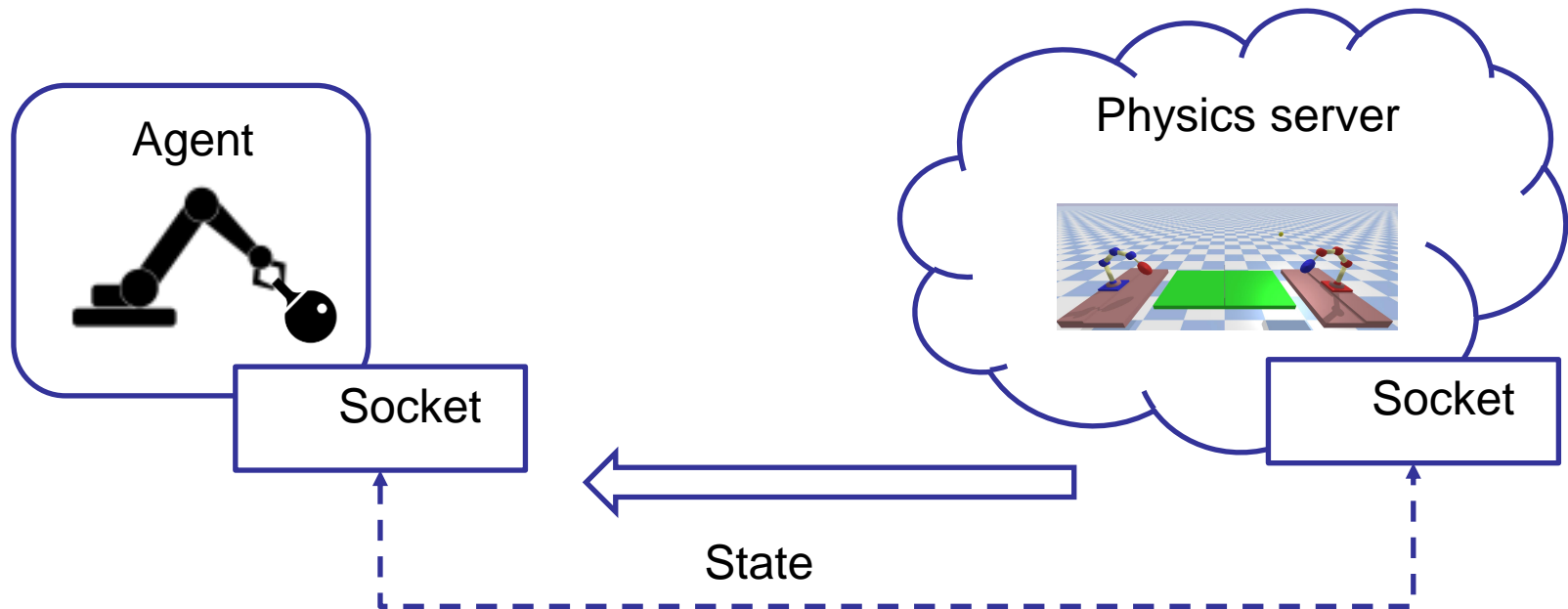
To move the robotic arm, you have to set the joints variables



Index	Type	Values	Description
0	Translation	-0.3 ... 0.3	Forward-Backward Slider. Positive Values are forward.
1	Translation	-0.8 ... 0.8	Left-Right Slider. Positive Values are to the right.
2	Rotation	Any	Rotation around the vertical axis (Z).
3	Rotation	$-\pi/2 \dots \pi/2$	Pitch of the first arm link.
4	Rotation	Any	Roll of the first arm link.
5	Rotation	$-\pi*3/4 \dots \pi*3/4$	Pitch of the second arm link.
6	Rotation	Any	Roll of the second arm link.
7	Rotation	$-\pi*3/4 \dots \pi*3/4$	Pitch of the third arm link.
8	Rotation	Any	Roll of the third arm link.
9	Rotation	$-\pi*3/4 \dots \pi*3/4$	Pitch of the pad.
10	Rotation	Any	Roll of the pad.

# The environment

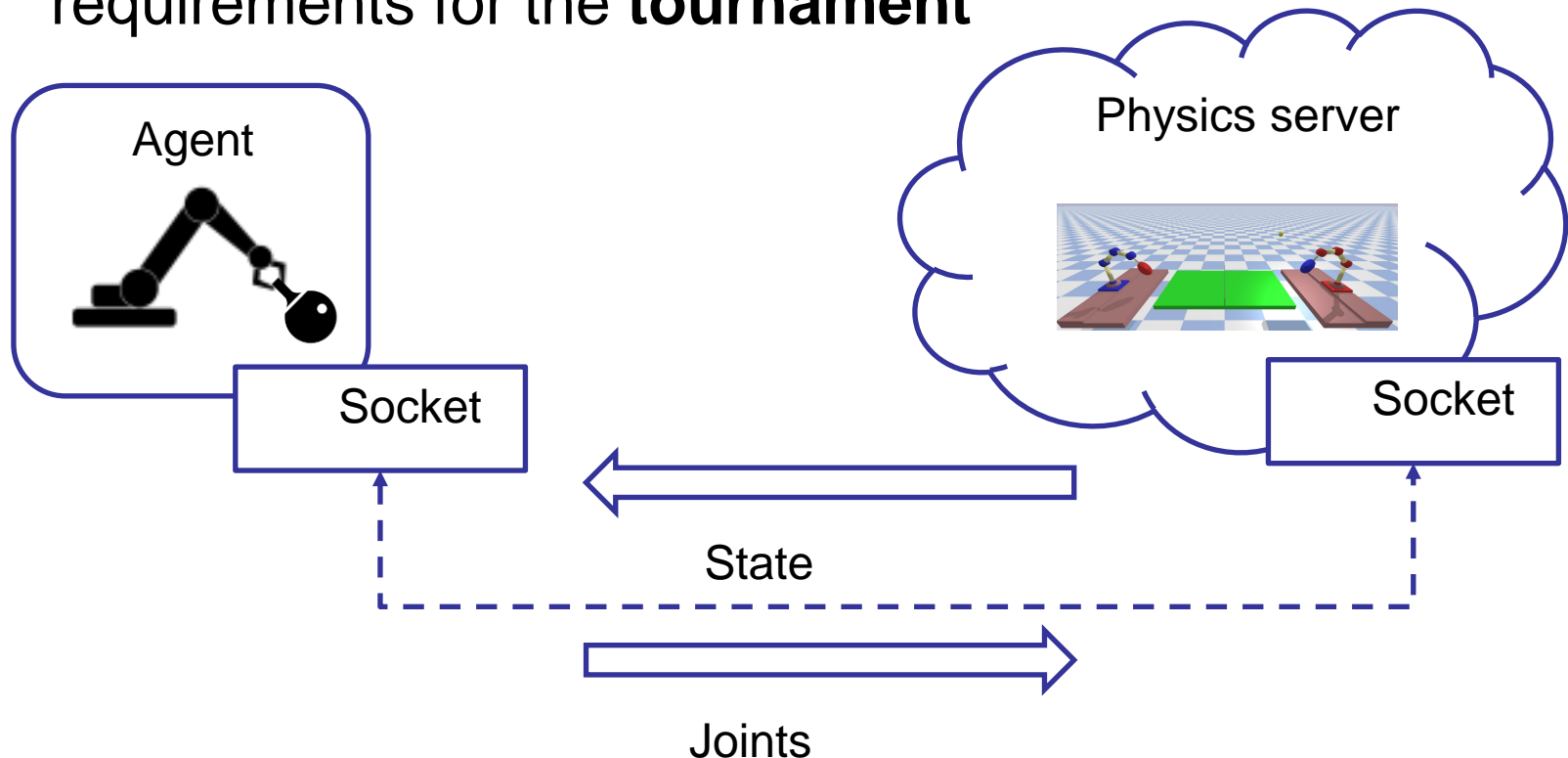
- ◆ Registers the player in the game
- ◆ Allows connection to a specific IP:PORT
- ◆ Provides the state variables through `get_state()`
- ◆ Execute the physics engine (PyBullet)





# The participants

- ◆ Define their own reward function
- ◆ Set the robot joints through `set_joints()`
- ◆ To do it, they train a ML model using one of the approaches studied during the course (also using the MIVIA lab GPUs)
- ◆ Verify that the trained model is compliant with the requirements for the **tournament**





# Match rules

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1. Alternate serves every point
2. The player can hit the ball before or after it hits the player's court
3. No "let" on serve
4. Also, a point is awarded if the ball gets stuck, hits twice a robot, or goes too far from the field
5. The game ends:
  1. when one player reaches 11 points;
  2. after a certain duration (e.g., 5 minutes);
  3. **for knockout matches only:** tie breaks after the time expires, i.e., whoever scores two consecutive points wins.



# Tournament rules

32 teams (31 + 1 baseline)

Two stages tournament:

1. **Group stage:** selects 16 out of 32 teams
2. **Knockout stage:** 1 vs. 1 direct elimination matches

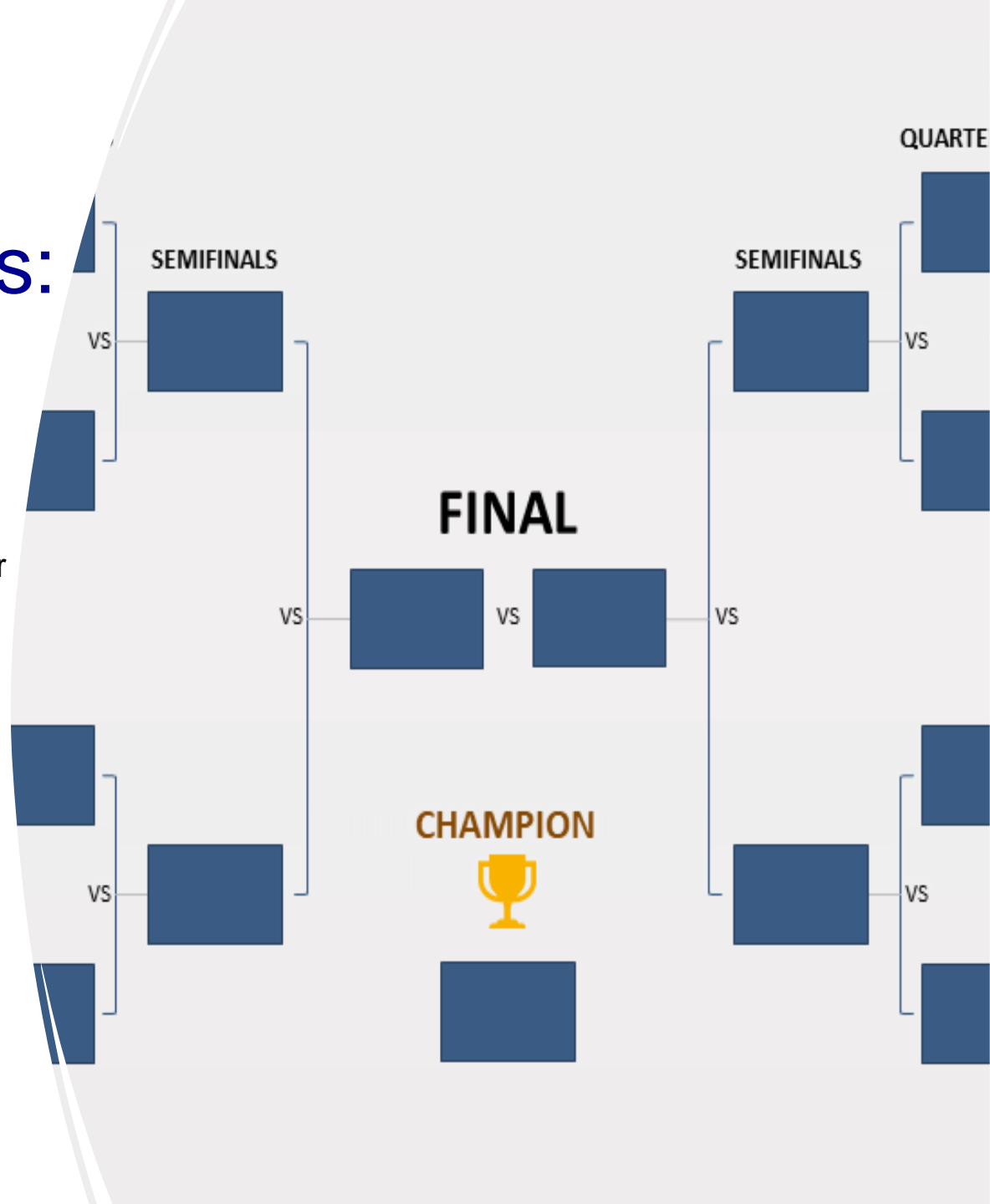


# Tournament rules: group stage

1. 4 randomly drawn teams in each group (for a total of 8 groups)
2. Each team pair plays one against (3 matches per group)
3. Group leaderboard:
  - a) Match winner earns 3 points
  - b) If the game is drawn, each team receives 1 point
  - c) Ties (i.e., two or more teams achieve the same final score) are solved considering (in order):
    1. the greater Point difference;
    2. then the greater Points scored;
    3. wins in the face-off match;
    4. running a knockout playoff with tiebreak.

# Tournament rules: knockout stage

1. The **group winner** and the **runner-up** of each group (for a total of 16 teams) access the final stage
2. Each **group winner** plays against the runner-up of another group (group #1 versus group #2, #3 versus #4, and so on)
3. Knockout matches with tiebreaks after the time limit expires.



# IMPORTANT: Model training and validation is not a feed-forward process

- ◆ Alternate trainings and validations:
  - ◆ After each validation, try to understand when the model fails and why
  - ◆ Change your model and/or training algorithm to improve the performance

# IMPORTANT: Model training and validation is not a feed-forward process

- ◆ Alternate trainings and validations:
  - ◆ If the performance seems very good, be sure that the test is challenging enough
  - ◆ Keep track of your countermeasures/improvements for the final project presentation

# What you can use

- ◆ You can train your model against anything
- ◆ Any algorithm (whatever kind of classifier, preprocessing, training strategies like discrete or continuous reinforcement learning, validation)
  - E.g., you can
    - train a network with supervised learning to address the inverse kinematics and another one to play using reinforcement learning
    - train two different networks when serving or receiving.
  - But you must be able to explain what you have used
  - The whole system must be **runnable inside the provided environment in the MIVIA server**
- ◆ You can use local computing power



# What you must submit

1. Code and trained model:
  - **Training code**: the code used for training your system
  - **Test code**: the code needed to test your system (test script; see next slide)
  - **Trained model**: the file containing the trained weights
  - The training and test code must be in the form of a Python Notebook
  
2. A **8 minutes** presentation (pptx/pdf) and a report (pdf), both in English
  - Please **don't restate** the problem, the application contest, or any other basic ML concept in your presentation! **Go straight to your contribution**
  - Put your names and team number at the beginning of both the presentation and the report

# How to must submit

1. Create a directory:
  - **Named** "{:02d}".format(team\_number)
  - **Containing the files:**
    - train.ipynb
    - test.ipynb
    - model.pth (or model0.pth, model1.pth, etc...)
    - slide.pptx or slide.pdf
    - report.pdf
2. Share the directory with professors via Google Drive
3. Upload the directory in the provided MIVIA computing server

# When to submit

At the first exam date we:

- ◆ Discuss all the project works (8 minute presentation per team)
- ◆ Do the tournament

We will ask you to submit your solution a couple of days before that date.

# Share the load

- ◆ Each member of the team will be requested to submit an estimate of the individual effort contributed by all members
  - To prevent "free riders"
  - Submissions will be "blind" (each member will not see the submissions of other members)

# IMPORTANT: Don't forget to

- ◆ Write the **names of all the team members** in the files
- ◆ Ensure that the **link** you submit is **readable to anyone** (no authorization must be requested)
- ◆ Make sure that the **test script** is **compliant with the specification** (if you have doubts about the specification, **ask**)