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# THE SCENARIO



## Two RL-agents compete

- Maze-like environment
- Fully observable, deterministic

#### States:

• Single game frames



## The Wanderer

- Is faster than ghosts
- Anticipation needed

#### Rewards:

- +reward for collecting coins
- -reward for not collecting coin
- --reward for being caugh

### Action space:

• [up, down, left, right]<sup>1</sup>



### The GhostMaster

- Ghosts are slower than Wanderer
- Coordination needed

#### Rewards:

- ++reward for catching Wandere
- -reward for not catching Wanderer

### Action space:

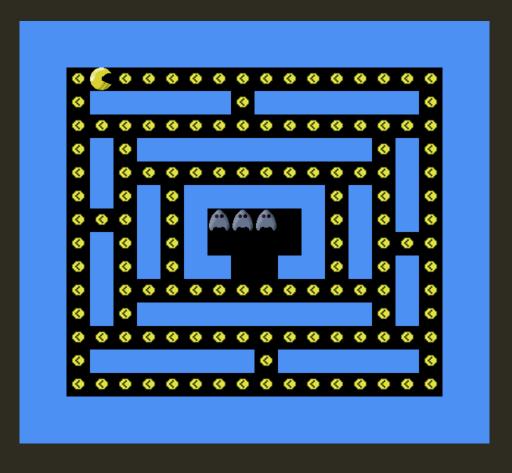
• [up, down, left, right]<sup>4</sup>

# OK YOU GOT US...

- ...we're playing PacMan.
- ... but also the ghosts.

## THE IMPLEMENTATION

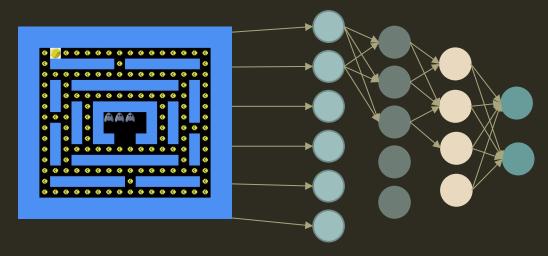
- The Game Environment
  - PyGame
- Reinforcement Learning
  - Deep Q-Learning
    - off-policy control
    - $\varepsilon$ -greedy action selection
- Q-Function Approximation using a convolutional neural network
- Tensorflow & Numpy



# DEEP Q-NETWORK (OF THE WANDERER)

 $S_0$ 

 $[Q(S_0, A_0,), Q(S_0, A_1), Q(S_0, A_2), Q(S_0, A_3)]$ 



→ e.g. [1.2, 200, 4.3, 0.1]

[vector of pixels] (state)

 $\rightarrow$ 

reward per action [UP, DOWN, LEFT, RIGHT]

# VIDEO HERE



## CURRENT STATUS

### Implemented Features

- Environment
  - Multiple Levels with various difficulties
- Deep Q Learning for Wanderer
  - Learns perfect policy (minimal num steps) for levels with static ghost(s)
- Performance with randomly moving ghosts could be better
- Replay Buffer
- Train/Test Procedure, Video Out, Plotting

### Missing

- GhostMaster agent(s)
- Play against trained Wanderer

# IMPROVING WANDERER AGENT

- State becomes (previousFrame, currentFrame) to allow movement direction detection of ghosts
- Larger network?

## OUTLOOK

### **TODOS:**

- Find solution for large action space of GhostMaster controlling several Ghosts
- Implement The GhostMaster
- Train both agents in an adversarial fashion
- How does the behavior of the Wanderer change in such a setup?

### WISHLIST:

### Ghosts

- Tactical behavior like surrounding, covering choke points
- Maybe only limited vision (proximity)
- GhostMaster must coordinate

### Wanderer

- Should avoid dangerous spots in the maze
- Should anticipate capabilities of the GhostMaster

### Additional features:

Power-ups for the Wanderer

# THANK YOU!