

COMP 4010A – Environment Demo

RL for Tower Defense with Evolutionary Towers

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Group 12

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Overview

The initial environment is a simplified version of the final project. This document will outline the preliminary environment specifications and reinforcement learning algorithm.

Out of Scope

The following features are out of scope for the initial environment:

1. Budget constraints
2. Multiple tower types
3. Multiple enemy types
4. Incremental increase in wave difficulty
5. Tower level-ups

MDP

Below is a description of the `TowerDefenseWorld` environment as a Markov Decision Process.

State space

State is currently represented by the layout of the grid at a given time step. Specifically, a single state is stored as a 3d box with shape $(n, n, 3)$ where n represents the $n \times n$ grid.

We store an array of size three in the third dimension to hold additional information. The first value of the array is 0 or 1 to indicate if the cell is a part of a path or not. The second is the tower hp or 0 if no tower exists in that cell. The third is the enemy hp or 0 if no tower

exists in that cell.

The size of our state space is given by

$$((T + 1) \cdot (E + 1) \cdot 2)^{n \times n} \quad (1)$$

where

T = the max hp of a tower

E = the max hp of an enemy

$n \times n$ is the number of cells in the grid

Currently our environment has

$T = 28$

$E = 13$

$n = 5$

This results in a total state space size of:

$$((28 + 1) \cdot (13 + 1) \cdot 2)^{25} = 232^{25}$$

Action Space

Agent Actions

There are 26 total actions the agent can take at the beginning of a wave. Do nothing, or place a tower in one of the 25 positions.

```
self.action_space = spaces.Discrete(size * size + 1)
```

Enemy Actions

Note, that the enemy actions are not a part of the action action space, however they are mentioned here for clarity.

The agents have 4 possible actions: do nothing, move down, move left, move right.

```
self.enemy_action_space = spaces.Discrete(4)
```

Reward Structure

1. Enemy Defeated = +10
2. Tower Defeated = -5
3. Tower Damaged = -1
4. Enemy Reaches Base = -50
5. Tower Level's up = +5 (not utilized yet)
6. Wave Cleared = +20

7. All Waves Cleared = +200
8. Base Destroyed = -10

Transition Dynamic

See `step()` function

Essential Functions

`__init__()`

1. Environment initialization
2. Setting up

`reset()`

1. New episode

`step()`

1. Transition to next state and emit a reward
2. Return (observation, reward, terminated, truncated, info)

`render()`

1. Human readable output

Code Walkthrough

Q-Learning Demo