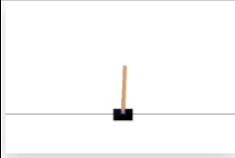
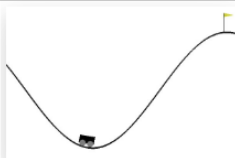

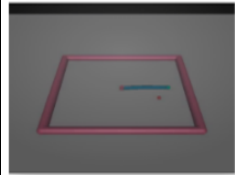
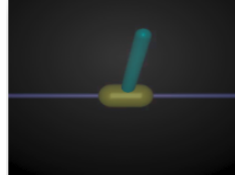
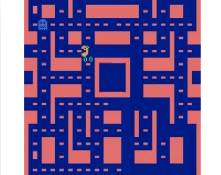
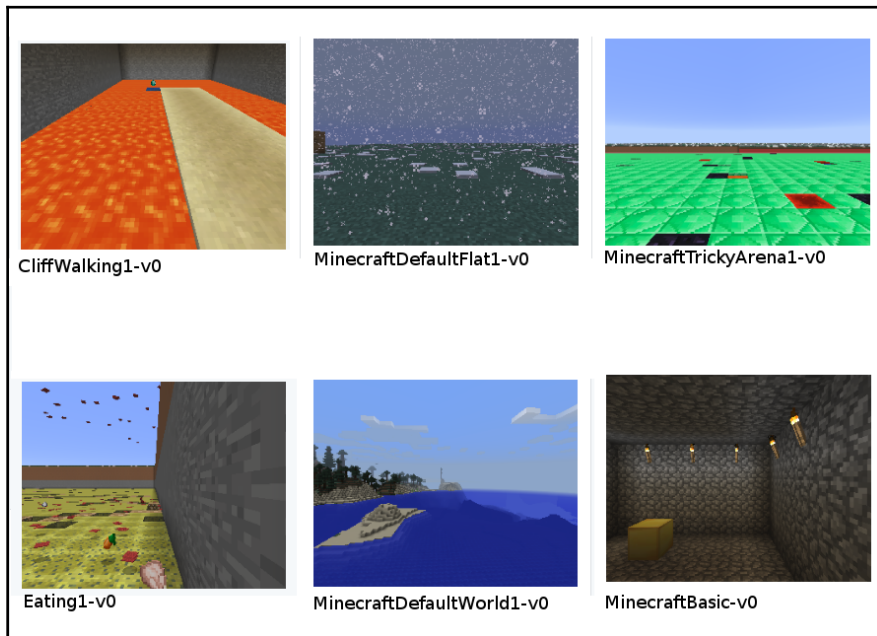
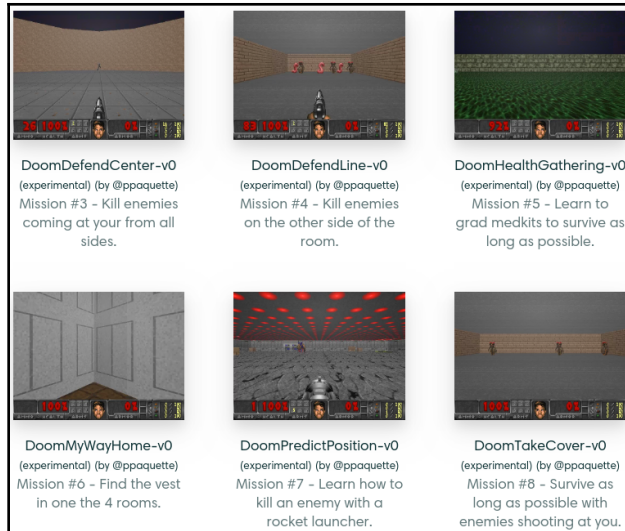
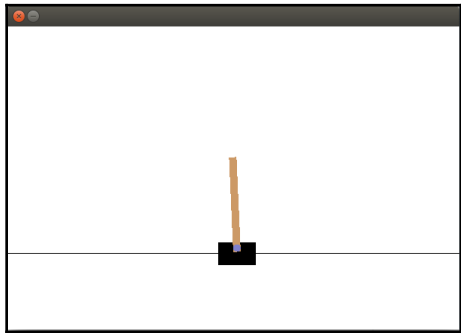
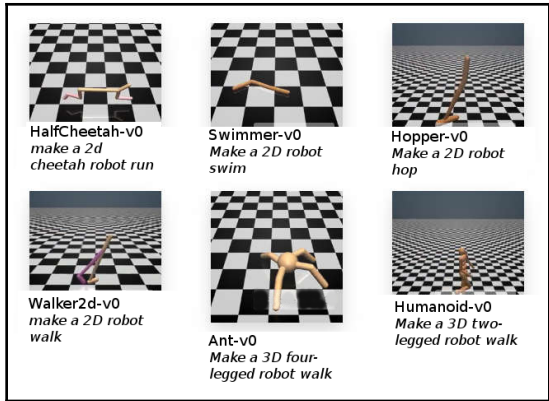


# Chapter 1: Introduction to Intelligent Agents and Learning Environments

 <p>CartPole-v0 Balance a pole on a cart (for a short time).</p>	 <p>MountainCar-v0 Drive up a big hill.</p>	 <p>Pendulum-v0 Swing up a pendulum.</p>
 <p>Reacher-v2 Make a 2D robot reach to a randomly located target.</p>	 <p>InvertedPendulum-v2 Balance a pole on a cart.</p>	 <p>MsPacman-ram-v0</p>

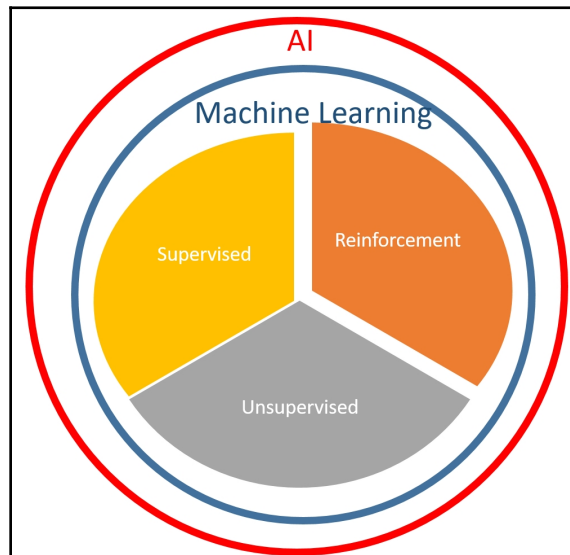
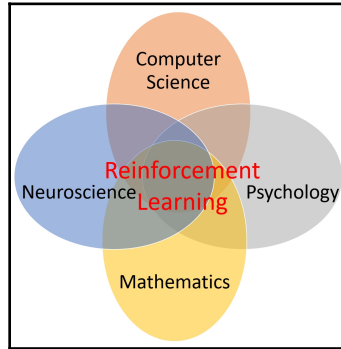
 <p>CarRacing-v0 Race a car around a track</p>	 <p>BipedalWalkver-v2 Train a bipedal robot to walk</p>	 <p>LunarLander-v2 Navigate a lander to its landing pad</p>
--	---	--



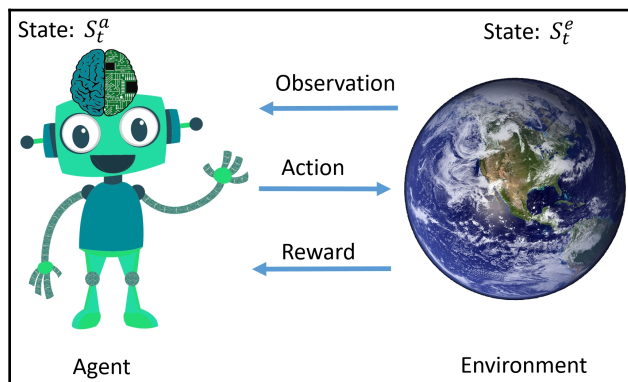
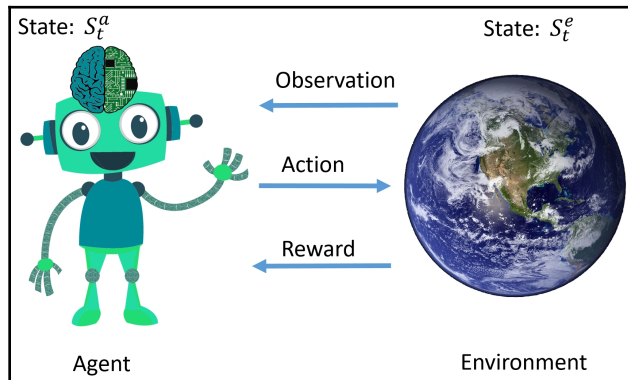
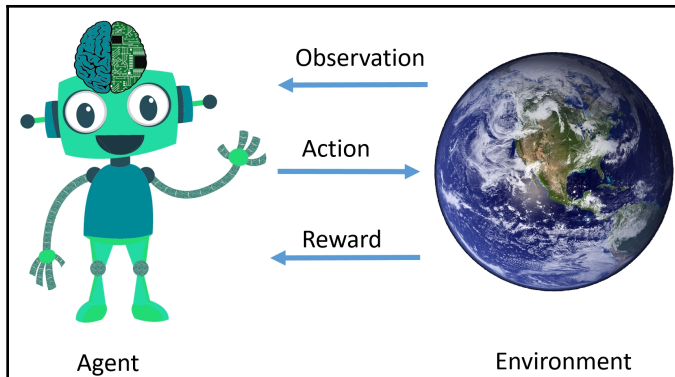


---

# Chapter 2: Reinforcement Learning and Deep Reinforcement Learning

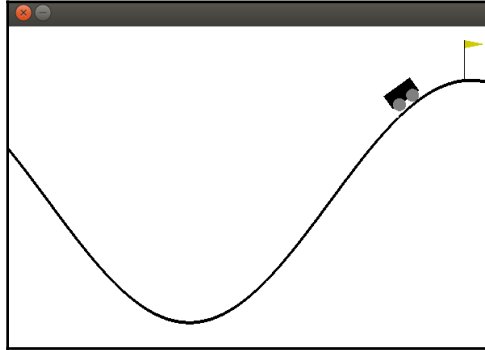




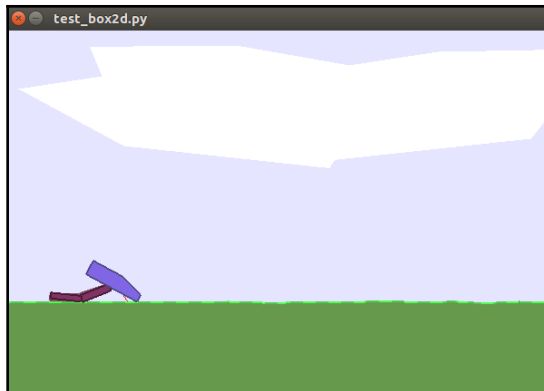


---

# Chapter 3: Getting Started with OpenAI Gym and Deep Reinforcement Learning



```
(array([-0.53439364, 0.05070148]), -1.0, True, {})  
(array([-0.48461121, 0.04978243]), -1.0, True, {})  
(array([-0.43512052, 0.04949069]), -1.0, True, {})  
(array([-0.38728565, 0.04783487]), -1.0, True, {})  
(array([-0.33944487, 0.04784078]), -1.0, True, {})  
(array([-0.29291606, 0.04652882]), -1.0, True, {})  
(array([-0.24898253, 0.04393353]), -1.0, True, {})  
(array([-0.20688342, 0.04209911]), -1.0, True, {})  
(array([-0.16781806, 0.03906536]), -1.0, True, {})  
(array([-0.1299425, 0.03787556]), -1.0, True, {})  
(array([-0.09337938, 0.03656312]), -1.0, True, {})  
(array([-0.05921881, 0.03416058]), -1.0, True, {})  
(array([-0.02751888, 0.03169993]), -1.0, True, {})  
(array([0.00068956, 0.02820844]), -1.0, True, {})  
(array([0.02639801, 0.02570845]), -1.0, True, {})  
(array([0.05061429, 0.02421628]), -1.0, True, {})  
(array([0.07335933, 0.02274505]), -1.0, True, {})  
(array([0.09466468, 0.02130535]), -1.0, True, {})  
(array([0.11357016, 0.01890549]), -1.0, True, {})  
(array([0.12911936, 0.01554919]), -1.0, True, {})  
(array([0.14335377, 0.01423442]), -1.0, True, {})  
(array([0.15631584, 0.01296207]), -1.0, True, {})  
>>>
```



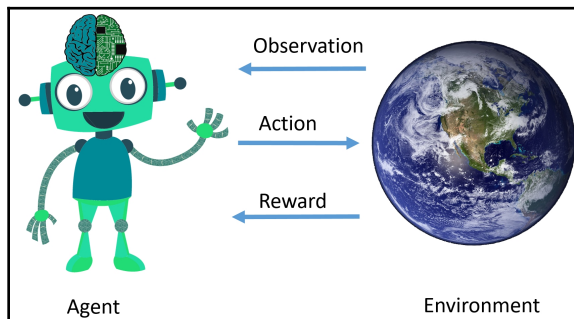
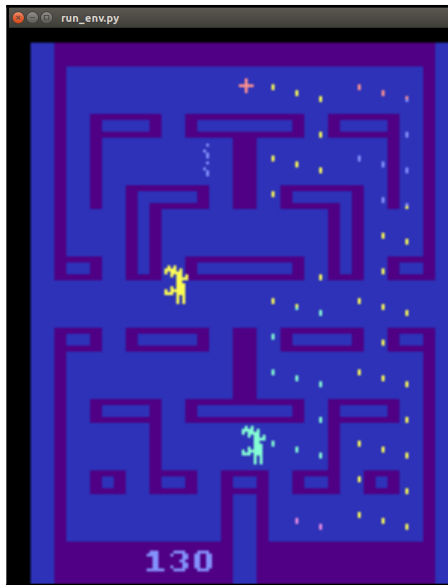
```
praveen@ubuntu: ~  
praveen@ubuntu:~$ nvcc -V  
nvcc: NVIDIA (R) Cuda compiler driver  
Copyright (c) 2005-2016 NVIDIA Corporation  
Built on Sun_Sep_4_22:14:01_CDT_2016  
Cuda compilation tools, release 8.0, V8.0.44  
praveen@ubuntu:~$
```

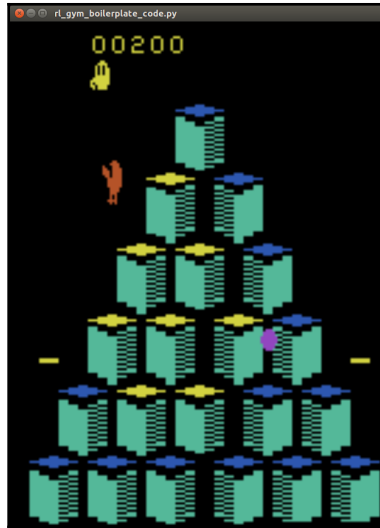
```
praveen@ubuntu: ~/rl_gym_book  
(rl_gym_book) praveen@ubuntu:~/rl_gym_book$ python pytorch_test.py  
1.00000e-36 *  
2.9928 0.0000 0.0000  
0.0000 0.1263 0.0000  
0.1326 0.0000 0.0000  
[torch.FloatTensor of size 3x3]  
(rl_gym_book) praveen@ubuntu:~/rl_gym_book$
```

---

## Chapter 4: Exploring the Gym and its Features

```
(rl_gym_book) praveen@ubuntu:~/rl_gym_book/ch4$ python list_gym_envs.py
Acrobot-v1
AirRaid-ram-v0
AirRaid-ram-v4
AirRaid-ramDeterministic-v0
AirRaid-ramDeterministic-v4
AirRaid-ramNoFrameskip-v0
AirRaid-ramNoFrameskip-v4
AirRaid-v0
AirRaid-v4
AirRaidDeterministic-v0
AirRaidDeterministic-v4
AirRaidNoFrameskip-v0
AirRaidNoFrameskip-v4
Alien-ram-v0
Alien-ram-v4
Alien-ramDeterministic-v0
Alien-ramDeterministic-v4
Alien-ramNoFrameskip-v0
Alien-ramNoFrameskip-v4
Alien-v0
Alien-v4
AlienDeterministic-v0
AlienDeterministic-v4
AlienNoFrameskip-v0
AlienNoFrameskip-v4
Amidar-ram-v0
Amidar-ram-v4
Amidar-ramDeterministic-v0
Amidar-ramDeterministic-v4
Amidar-ramNoFrameskip-v0
Amidar-ramNoFrameskip-v4
Amidar-v0
Amidar-v4
AmidarDeterministic-v0
```





```
(rl_gym_book) praveen@ubuntu:~/rl_gym_book/ch4$ python rl_gym_boilerplate_code.py
Episode #0 ended in 375 steps.
Episode #1 ended in 363 steps.
Episode #3 ended in 495 steps.
Episode #4 ended in 437 steps.
Episode #5 ended in 355 steps.
Episode #6 ended in 443 steps.
Episode #7 ended in 407 steps.
Episode #8 ended in 400 steps.
Episode #9 ended in 376 steps.█
```

```
(rl_gym_book) praveen@ubuntu:~/rl_gym_book/ch4$ python get_observation_action_space.py CartPole-v0
WARN: gym.spaces.Box autodetected dtype as <class 'numpy.float32'>. Please provide explicit dtype.
Observation Space:
Box(4,)

space.low: [ -4.80000019e+00 -3.40282347e+38 -4.18879032e-01 -3.40282347e+38]
space.high: [ 4.80000019e+00 3.40282347e+38 4.18879032e-01 3.40282347e+38]
Action Space:
Discrete(2)
```

---

```
(rl_gym_book) praveen@ubuntu:~/rl_gym_book/ch4$ python get_observation_action_space.py BipedalWalker-v2
WARN: gym.spaces.Box autodetected dtype as <class 'numpy.float32'>. Please provide explicit dtype.
WARN: gym.spaces.Box autodetected dtype as <class 'numpy.float32'>. Please provide explicit dtype.
Observation Space:
Box(24,)

space.low: [-inf -inf -inf -inf -inf -inf -inf -inf -inf -inf -inf -inf -inf -inf -inf
-inf -inf -inf -inf -inf -inf -inf -inf -inf]

space.high: [ inf inf inf inf inf inf inf inf inf inf inf inf inf inf inf
 inf inf inf inf inf inf inf inf inf]
Action Space:
Box(4,)

space.low: [-1. -1. -1. -1.]

space.high: [ 1.  1.  1.  1.]
```



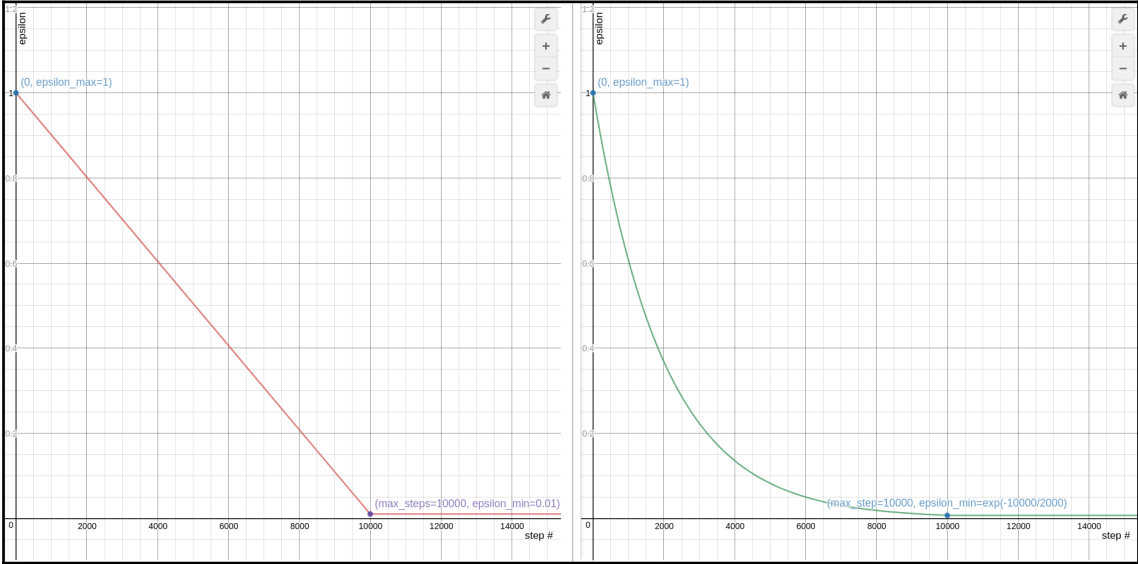


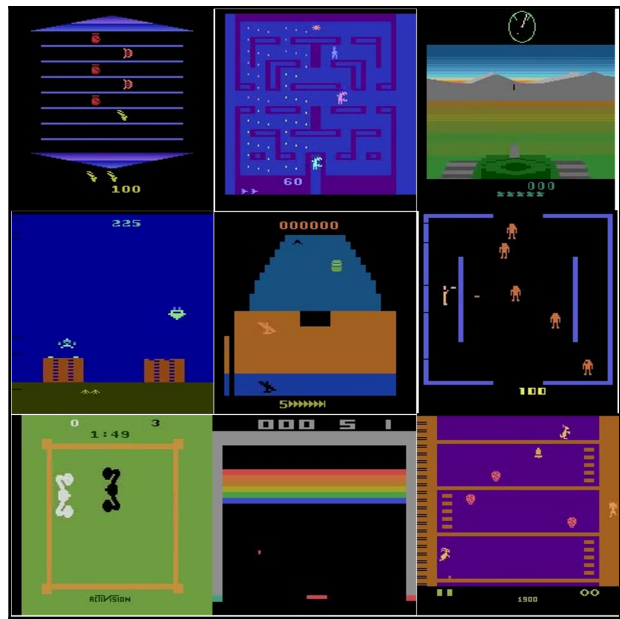
```
praveen@ubuntu:~/rl_gym_book/ch5
praveen@ubuntu:~/rl_gym_book/ch5$ . activate_rl_gym_book
(rl_gym_book) praveen@ubuntu:~/rl_gym_book/ch5$ python 0_learner_MountainCar.py
WARN: gym.spaces.Box autodetected dtype as <class 'numpy.float32'>. Please provide explicit dtype.
Episode#:0 reward:-200.0 best_reward:-200.0 eps:0.999949999999993
Episode#:1 reward:-200.0 best_reward:-200.0 eps:0.999899999999986
Episode#:2 reward:-200.0 best_reward:-200.0 eps:0.999849999999979
Episode#:3 reward:-200.0 best_reward:-200.0 eps:0.999799999999972
Episode#:4 reward:-200.0 best_reward:-200.0 eps:0.999749999999965
Episode#:5 reward:-200.0 best_reward:-200.0 eps:0.999699999999958
Episode#:6 reward:-200.0 best_reward:-200.0 eps:0.999649999999951
Episode#:7 reward:-200.0 best_reward:-200.0 eps:0.999599999999944
Episode#:8 reward:-200.0 best_reward:-200.0 eps:0.999549999999937
Episode#:9 reward:-200.0 best_reward:-200.0 eps:0.999499999999930
Episode#:10 reward:-200.0 best_reward:-200.0 eps:0.999449999999923
Episode#:11 reward:-200.0 best_reward:-200.0 eps:0.999399999999916
Episode#:12 reward:-200.0 best_reward:-200.0 eps:0.999349999999909
Episode#:13 reward:-200.0 best_reward:-200.0 eps:0.999299999999902
Episode#:14 reward:-200.0 best_reward:-200.0 eps:0.999249999999895
Episode#:15 reward:-200.0 best_reward:-200.0 eps:0.999199999999888
Episode#:16 reward:-200.0 best_reward:-200.0 eps:0.999149999999881
Episode#:17 reward:-200.0 best_reward:-200.0 eps:0.999099999999874
Episode#:18 reward:-200.0 best_reward:-200.0 eps:0.999049999999867
Episode#:19 reward:-200.0 best_reward:-200.0 eps:0.998999999999860
Episode#:20 reward:-200.0 best_reward:-200.0 eps:0.998949999999853
Episode#:21 reward:-200.0 best_reward:-200.0 eps:0.998899999999846
Episode#:22 reward:-200.0 best_reward:-200.0 eps:0.998849999999839
Episode#:23 reward:-200.0 best_reward:-200.0 eps:0.998799999999832
Episode#:24 reward:-200.0 best_reward:-200.0 eps:0.998749999999825
Episode#:25 reward:-200.0 best_reward:-200.0 eps:0.998699999999818
Episode#:26 reward:-200.0 best_reward:-200.0 eps:0.998649999999811
Episode#:27 reward:-200.0 best_reward:-200.0 eps:0.998599999999804
Episode#:28 reward:-200.0 best_reward:-200.0 eps:0.998549999999797
Episode#:29 reward:-200.0 best_reward:-200.0 eps:0.998499999999790
Episode#:30 reward:-200.0 best_reward:-200.0 eps:0.998449999999783
Episode#:31 reward:-200.0 best_reward:-200.0 eps:0.998399999999776
Episode#:32 reward:-200.0 best_reward:-200.0 eps:0.998349999999769
Episode#:33 reward:-200.0 best_reward:-200.0 eps:0.998299999999762
Episode#:34 reward:-200.0 best_reward:-200.0 eps:0.998249999999755
Episode#:35 reward:-200.0 best_reward:-200.0 eps:0.998199999999748
Episode#:36 reward:-200.0 best_reward:-200.0 eps:0.998149999999741
Episode#:37 reward:-200.0 best_reward:-200.0 eps:0.998099999999734
Episode#:38 reward:-200.0 best_reward:-200.0 eps:0.998049999999727
Episode#:39 reward:-200.0 best_reward:-200.0 eps:0.997999999999720
Episode#:40 reward:-200.0 best_reward:-200.0 eps:0.997949999999713
Episode#:41 reward:-200.0 best_reward:-200.0 eps:0.997899999999706
Episode#:42 reward:-200.0 best_reward:-200.0 eps:0.997849999999699
Episode#:43 reward:-200.0 best_reward:-200.0 eps:0.997799999999692
Episode#:44 reward:-200.0 best_reward:-200.0 eps:0.997749999999685
Episode#:45 reward:-200.0 best_reward:-200.0 eps:0.997699999999678
Episode#:46 reward:-200.0 best_reward:-200.0 eps:0.997649999999671
Episode#:47 reward:-200.0 best_reward:-200.0 eps:0.997599999999664
Episode#:48 reward:-200.0 best_reward:-200.0 eps:0.997549999999657
Episode#:49 reward:-200.0 best_reward:-200.0 eps:0.997499999999650
Episode#:50 reward:-200.0 best_reward:-200.0 eps:0.997449999999643
Episode#:51 reward:-200.0 best_reward:-200.0 eps:0.997399999999636
Episode#:52 reward:-200.0 best_reward:-200.0 eps:0.997349999999629
Episode#:53 reward:-200.0 best_reward:-200.0 eps:0.997299999999622
Episode#:54 reward:-200.0 best_reward:-200.0 eps:0.997249999999615
Episode#:55 reward:-200.0 best_reward:-200.0 eps:0.997199999999608
Episode#:56 reward:-200.0 best_reward:-200.0 eps:0.997149999999601
```

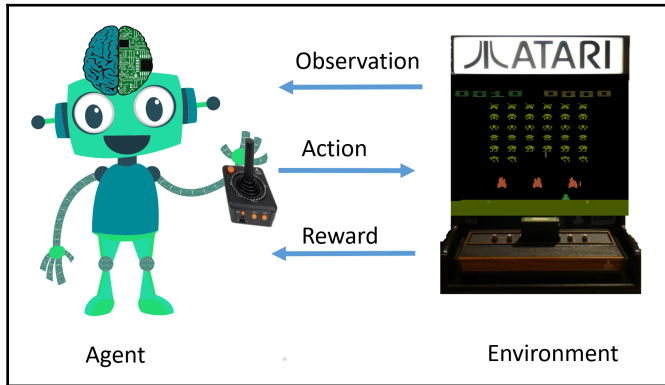
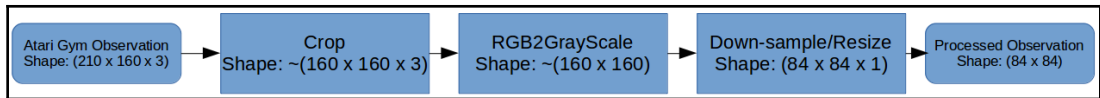


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# Chapter 6: Implementing an Intelligent Agent for Optimal Control using Deep Q-Learning







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# Chapter 7: Creating Custom OpenAI Gym Environments - CARLA Driving Simulator



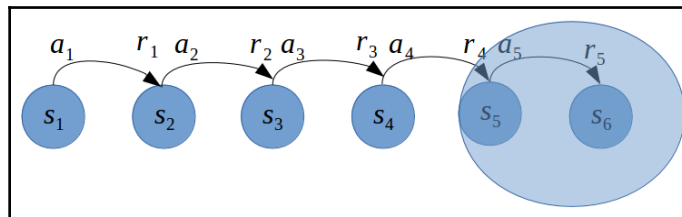
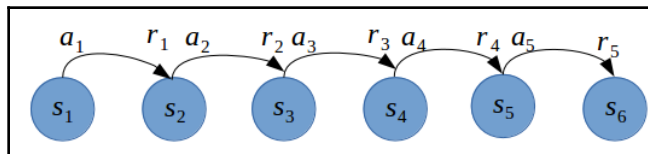
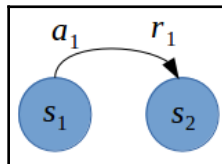
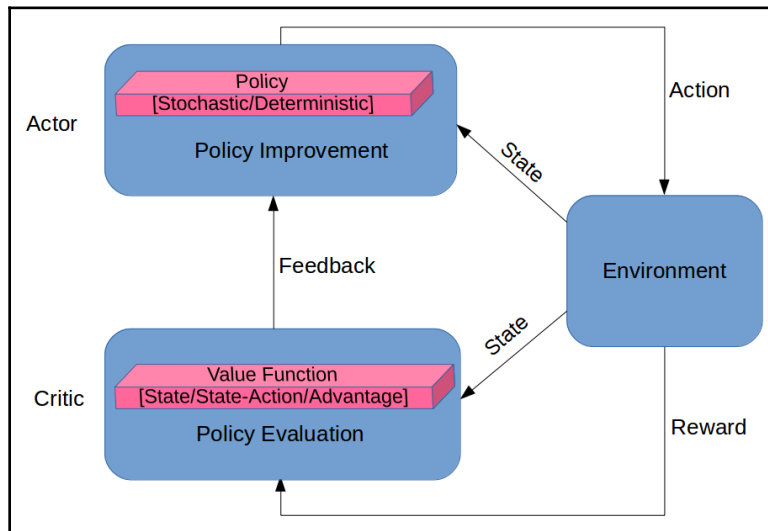


```
praveen@ubuntu:~/rl_gym_book/ch7
(rl_gym_book) praveen@ubuntu:~/rl_gym_book/ch7$ python carla-gym/carla_gym/envs/carla_env.py
Initializing new Carla server...
Start pos 36 ([0.0, 3.0]), end 40 ([0.0, 3.0])
Starting new episode...
Step#: 1 reward: -0.0 total_reward: -0.0 done: False
Step#: 2 reward: -0.0 total_reward: -0.0 done: False
Step#: 3 reward: -0.0 total_reward: -0.0 done: False
Step#: 4 reward: -0.0 total_reward: -0.0 done: False
Step#: 5 reward: -0.0 total_reward: -0.0 done: False
Step#: 6 reward: -0.0007 total_reward: -0.0007 done: False
Step#: 7 reward: 0.0006 total_reward: -0.0001 done: False
Step#: 8 reward: 0.0001 total_reward: 0.0001 done: False
Step#: 9 reward: 0.0 total_reward: 0.0001 done: False
Step#: 10 reward: -0.0 total_reward: 0.0001 done: False
Step#: 11 reward: -0.0 total_reward: 0.0 done: False
Step#: 12 reward: -0.0 total_reward: 0.0 done: False
Step#: 13 reward: -0.0 total_reward: 0.0 done: False
Step#: 14 reward: -0.0 total_reward: 0.0 done: False
Step#: 15 reward: -0.0 total_reward: 0.0 done: False
Step#: 16 reward: -0.0 total_reward: 0.0 done: False
Step#: 17 reward: -0.0 total_reward: 0.0 done: False
Step#: 18 reward: -0.0 total_reward: 0.0 done: False
Step#: 19 reward: -0.0 total_reward: 0.0 done: False
Step#: 20 reward: -0.0 total_reward: 0.0 done: False
Step#: 21 reward: -0.0 total_reward: 0.0 done: False
Step#: 22 reward: -0.0 total_reward: 0.0 done: False
Step#: 23 reward: -0.0 total_reward: 0.0 done: False
Step#: 24 reward: -0.0 total_reward: 0.0 done: False
Step#: 25 reward: -0.0 total_reward: 0.0 done: False
Step#: 26 reward: 0.0231 total_reward: 0.0231 done: False
Step#: 27 reward: 0.0624 total_reward: 0.0855 done: False
Step#: 28 reward: 0.0559 total_reward: 0.1414 done: False
Step#: 29 reward: 0.0511 total_reward: 0.1925 done: False
Step#: 30 reward: 0.0467 total_reward: 0.2391 done: False
```

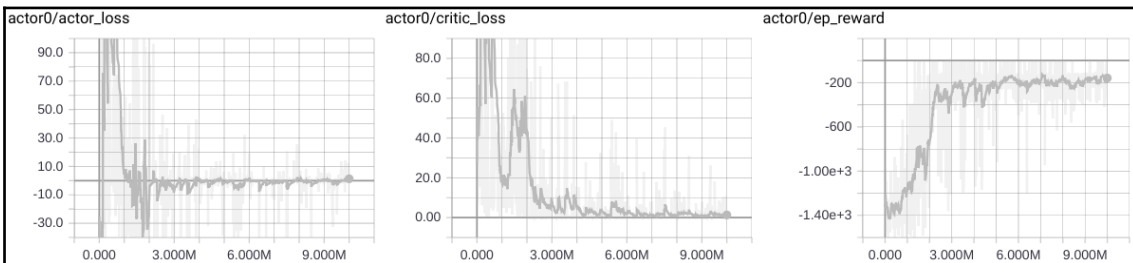
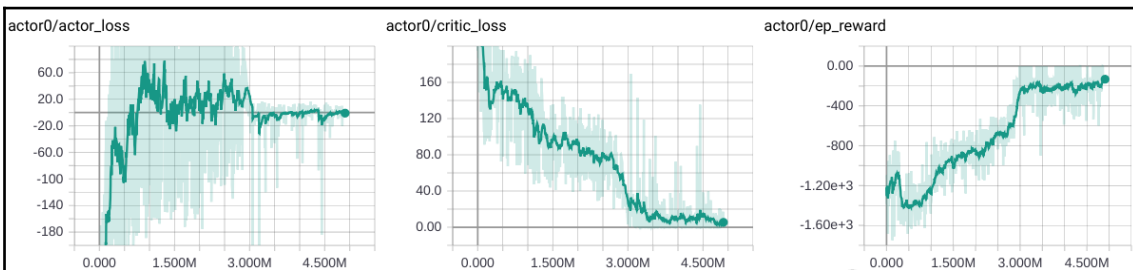
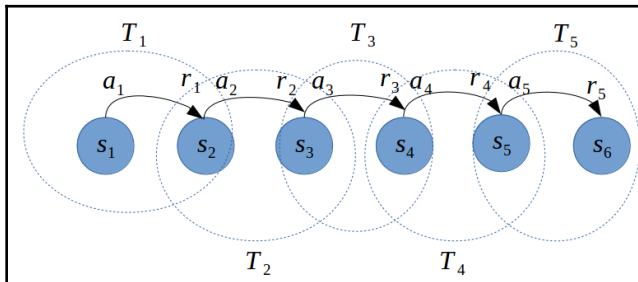
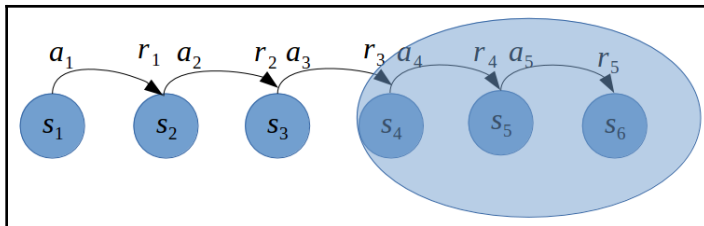
```
praveen@ubuntu:~/rl_gym_book/ch7/carla-gym
(rl_gym_book) praveen@ubuntu:~/rl_gym_book/ch7/carla-gym$ python
Python 3.5.5 [Anaconda, Inc.] (default, Apr 26 2018, 13:47:34)
[GCC 7.2.0] on linux
Type "help", "copyright", "credits" or "license" for more information.
>>> import gym
>>> import carla_gym
>>> env = gym.make("Carla-v0")
>>> obs = env.reset()
Initializing new Carla server...
Start pos 36 ([0.0, 3.0]), end 40 ([0.0, 3.0])
Starting new episode...
```

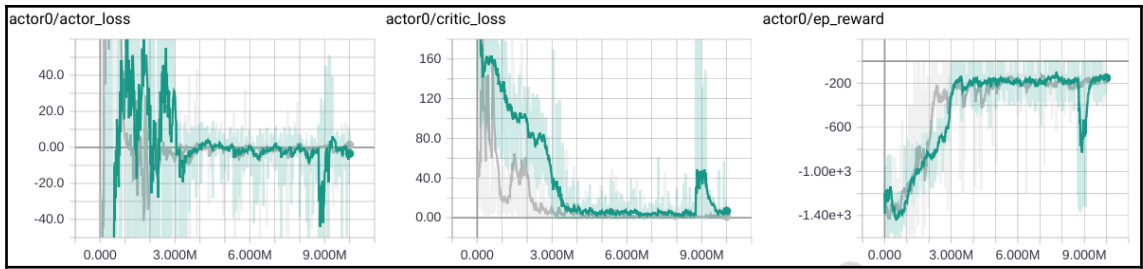
---

# Chapter 8: Implementing an Intelligent - Autonomous Car Driving Agent using Deep Actor-Critic Algorithm



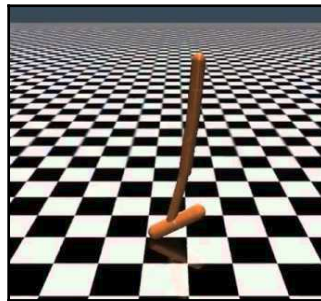
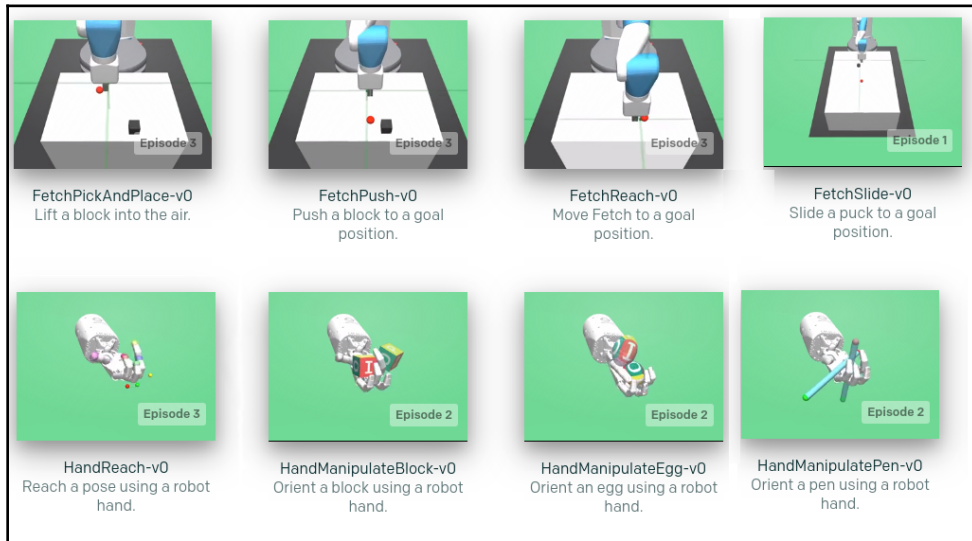


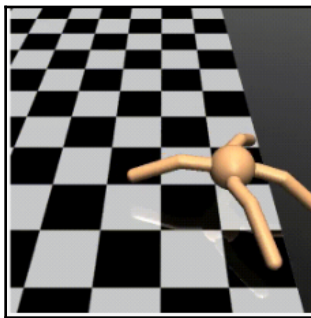
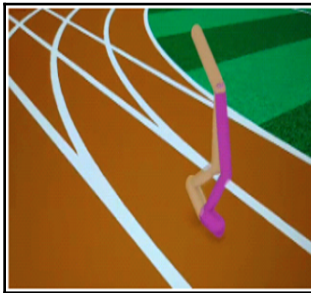
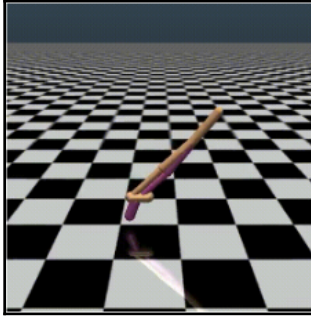
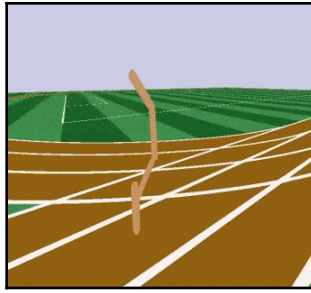


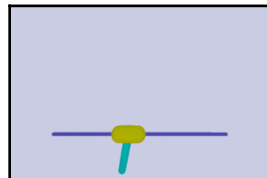
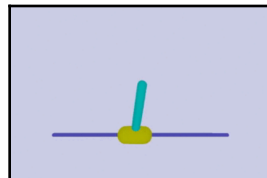
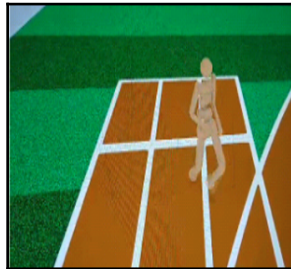
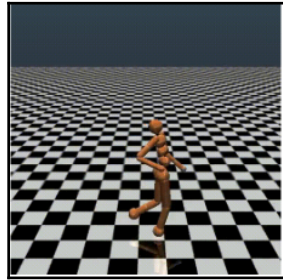
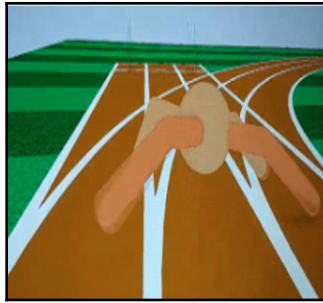


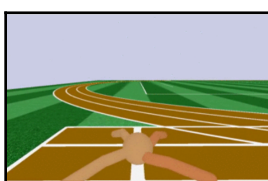
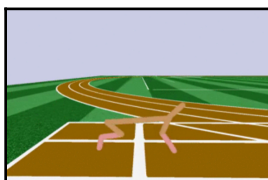
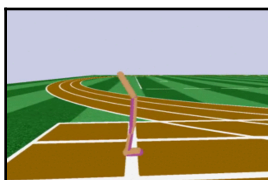
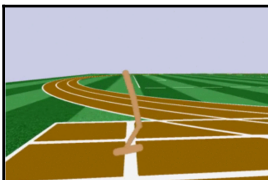
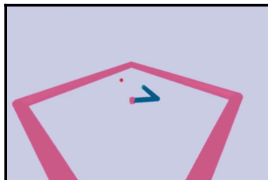
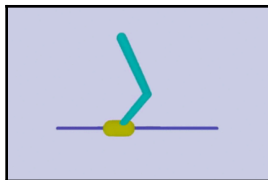
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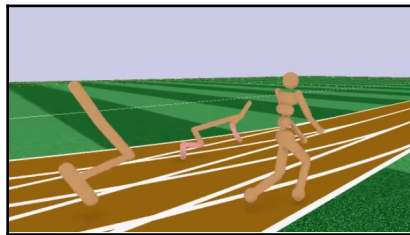
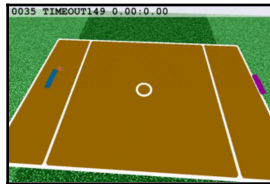
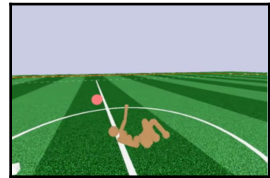
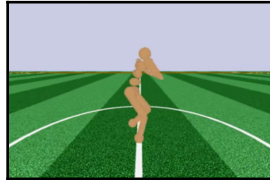
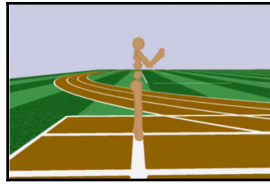
# Chapter 9: Exploring the Learning Environment Landscape - Roboschool, Gym-Retro, StarCraft-II, DeepMindLab





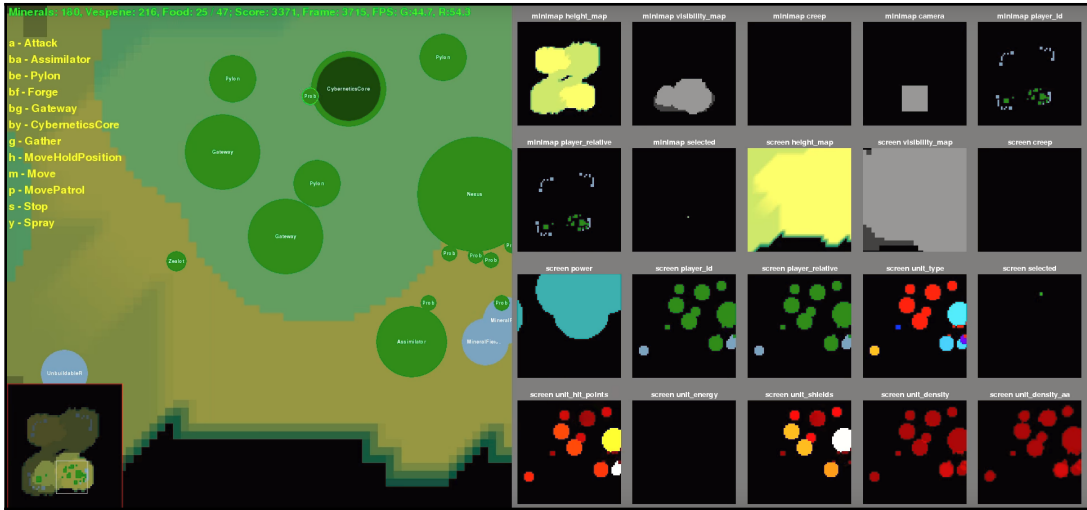






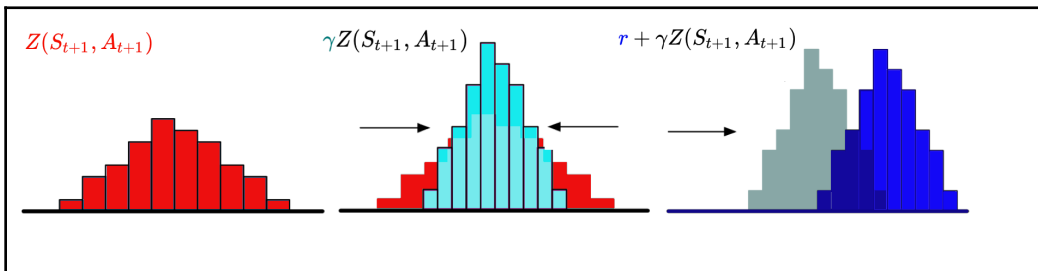
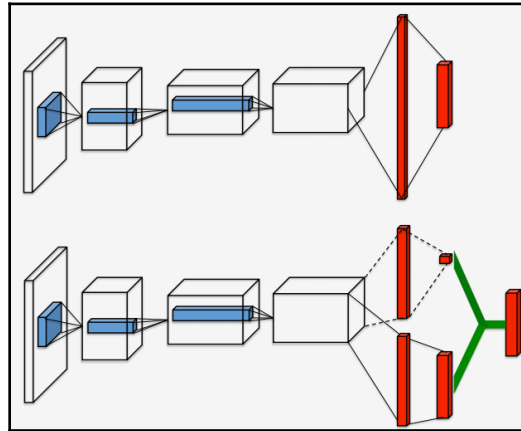






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# Chapter 10: Exploring the Learning Algorithm Landscape - DDPG (Actor-Critic), PPO (Policy-Gradient), Rainbow (Value-Based)



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**Algorithm 1** Categorical Algorithm

**input** A transition  $x_t, a_t, r_t, x_{t+1}, \gamma_t \in [0, 1]$   
 $Q(x_{t+1}, a) := \sum_i z_i p_i(x_{t+1}, a)$   
 $a^* \leftarrow \arg \max_a Q(x_{t+1}, a)$   
 $m_i = 0, \quad i \in 0, \dots, N-1$   
**for**  $j \in 0, \dots, N-1$  **do**  
  # Compute the projection of  $\hat{T} z_j$  onto the support  $\{z_i\}$   
   $\hat{T} z_j \leftarrow [r_t + \gamma_t z_j]_{V_{\min}}^{V_{\max}}$   
   $b_j \leftarrow (\hat{T} z_j - V_{\min}) / \Delta z \quad \# b_j \in [0, N-1]$   
   $l \leftarrow \lfloor b_j \rfloor, u \leftarrow \lceil b_j \rceil$   
  # Distribute probability of  $\hat{T} z_j$   
   $m_l \leftarrow m_l + p_j(x_{t+1}, a^*)(u - b_j)$   
   $m_u \leftarrow m_u + p_j(x_{t+1}, a^*)(b_j - l)$   
**end for**  
**output**  $-\sum_i m_i \log p_i(x_t, a_t) \quad \#$  Cross-entropy loss

