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ФАКУЛЬТЕТ Информатика и системы управления и искусственный интеллект

КАФЕДРА Системы обработки информации и управления

## Лабораторная работа №7 По курсу «Методы машинного обучения в АСОИУ» «Алгоритмы Actor-Critic»

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## Задание:

Реализуйте любой алгоритм семейства Actor-Critic для произвольной среды.

Программа реализует алгоритм обучения с подкреплением Advantage Actor-Critic (A2C) для решения задачи управления маятником в окружении "CartPole-v1" из библиотеки OpenAl Gym. Основная цель состоит в обучении агента (модели) так, чтобы он мог удерживать маятник в вертикальном положении как можно дольше.

```
Ввод [1]: import sys
          import torch
          import gym
          import numpy as np
          import torch.nn as nn
          import torch.optim as optim
          import torch.nn.functional as F
          from torch.autograd import Variable
          import matplotlib.pyplot as plt
          import pandas as pd
          from IPython.display import Image
Ввод [2]: # Гиперпараметры
          hidden_size = 256
          learning_rate = 3e-4
          entropy_coef = 0.01
          # Константы
          GAMMA = 0.99
          num_steps = 250
          max episodes = 2500 # Увеличенное количество эпизодов
          CONST ENV NAME = "CartPole-v1"
          CONST_DEVICE = torch.device("cuda" if torch.cuda.is_available() else "cpu")
Ввод [3]: # Класс, реализующий модель Actor—Critic
          class ActorCritic(nn.Module):
              def __init__(self, num_inputs, num_actions, hidden_size, learning_rate=3e-4):
                  super(ActorCritic, self).__init__()
                  self.num_actions = num_actions
                  self.critic linear1 = nn.Linear(num inputs, hidden size)
                  self.critic_linear2 = nn.Linear(hidden_size, 1)
                  self.actor_linear1 = nn.Linear(num_inputs, hidden_size)
                  self.actor_linear2 = nn.Linear(hidden_size, num_actions)
              def forward(self, state):
                  value = F.relu(self.critic_linear1(state))
                  value = self.critic_linear2(value)
                  policy_dist = F.relu(self.actor_linear1(state))
                  policy_dist = F.softmax(self.actor_linear2(policy_dist), dim=1)
                  return value, policy dist
              def select_action(self, state):
                  _, policy_dist = self.forward(state)
                  action = policy_dist.multinomial(num_samples=1).detach()
```

return action[0]

```
Ввод [4]: # Функция для реализации алгоритма Advantage Actor-Critic (A2C)
                    def a2c(env):
                            num_inputs = env.observation_space.shape[0]
                            num_outputs = env.action_space.n
                            actor_critic = ActorCritic(num_inputs, num_outputs, hidden_size)
                            ac_optimizer = optim.Adam(actor_critic.parameters(), lr=learning_rate)
                            all lengths = []
                            average lengths = []
                            all rewards = []
                            entropy_term = 0
                            for episode in range(max_episodes):
                                     log_probs = []
                                     values = []
                                     rewards = []
                                     state = env.reset()
                                     if isinstance(state, tuple):
                                             state = state[0]
                                     state = torch.tensor(state, dtype=torch.float32).unsqueeze(0)
                                     for steps in range(num_steps):
                                             value, policy_dist = actor_critic.forward(state)
                                             value = value.detach().numpy()[0, 0]
                                             dist = policy_dist.detach().numpy()
                                             action = np.random.choice(num_outputs, p=np.squeeze(dist))
                                             log_prob = torch.log(policy_dist.squeeze(0)[action])
                                             entropy = -np.sum(np.mean(dist) * np.log(dist))
                                             result = env.step(action)
                                             new state = result[0]
                                             reward = result[1]
                                             done = result[2]
                                             if isinstance(new_state, tuple):
                                                     new_state = new_state[0]
                                             new_state = torch.tensor(new_state, dtype=torch.float32).unsqueeze(0)
                                             rewards.append(reward)
                                             values.append(value)
                                             log_probs.append(log_prob)
                                             entropy_term += entropy
                                             state = new_state
                                             if done or steps == num_steps - 1:
                                                     Qval, _ = actor_critic.forward(new_state)
                                                     Qval = Qval.detach().numpy()[0, 0]
                                                     all_rewards.append(np.sum(rewards))
                                                     all_lengths.append(steps)
                                                     average_lengths.append(np.mean(all_lengths[-10:]))
                                                     if episode % 10 == 0:
                                                             sys.stdout.write("episode: {}, reward: {}, total length: {}, average average average and a second control of the control of th
                                                     break
                                     # Вычисление значений О
                                     Qvals = np.zeros_like(values)
                                     for t in reversed(range(len(rewards))):
                                             Qval = rewards[t] + GAMMA * Qval
                                             Qvals[t] = Qval
                                     # Обновление модели actor-critic
                                     values = torch.FloatTensor(values)
                                     Qvals = torch.FloatTensor(Qvals)
                                     log_probs = torch.stack(log_probs)
                                     advantage = Qvals - values
                                     actor_loss = (-log_probs * advantage).mean()
                                     critic_loss = 0.5 * advantage.pow(2).mean()
                                     ac_loss = actor_loss + critic_loss + entropy_coef * entropy_term
```

```
ac_optimizer.zero_grad()
    ac_loss.backward()
    ac_optimizer.step()
# Построение графиков результатов
smoothed_rewards = pd.Series(all_rewards).rolling(10).mean()
plt.plot(all_rewards, label='Награды')
plt.plot(smoothed_rewards, label='Сглаженные награды')
plt.xlabel('Эпизод')
plt.ylabel('Награда')
plt.legend()
plt.show()
plt.plot(all_lengths, label='Длины эпизодов')
plt.plot(average_lengths, label='Средние длины')
plt.xlabel('Эпизод')
plt.ylabel('Длина эпизода')
plt.legend()
plt.show()
return actor_critic
```

```
Ввод [5]: # Функция для запуска агента в среде с использованием обученной модели
          def play_agent(actor_critic):
              Игра с обученным агентом
              env2 = gym.make(CONST_ENV_NAME, render_mode='human')
              state = env2.reset()
              if isinstance(state, tuple):
                  state = state[0]
              state = torch.tensor(state, dtype=torch.float32, device=CONST_DEVICE).unsqueeze(0)
              done = False
              res = []
              while not done:
                  action = actor_critic.select_action(state)
                  action = action.item()
                  result = env2.step(action)
                  observation = result[0]
                  reward = result[1]
                  done = result[2]
                  truncated = result[3]
                  env2.render()
                   res.append((action, reward))
                  if done or truncated:
                      done = True
                  else:
                      if isinstance(observation, tuple):
                          observation = observation[0]
                      state = torch.tensor(observation, dtype=torch.float32, device=CONST_DEVICE
              print('Данные эпизода: ', res)
```

```
Ввод [6]: if __name__ == "__main__":
    env = gym.make(CONST_ENV_NAME)
    trained_actor_critic = a2c(env)

# Запуск сессии с обученным агентом
    play_agent(trained_actor_critic)
```

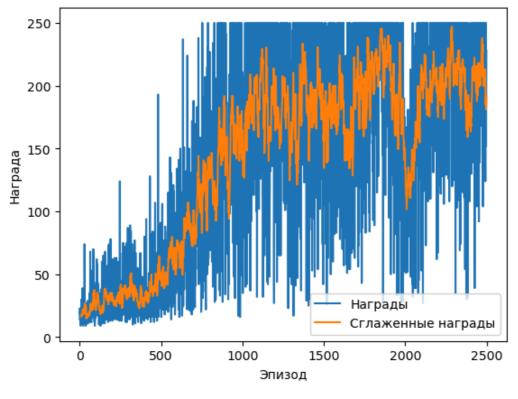
```
/Users/evseykirichkov/anaconda3/lib/python3.11/site-packages/gym/utils/passive_env_c hecker.py:233: DeprecationWarning: `np.bool8` is a deprecated alias for `np.bool_`. (Deprecated NumPy 1.24) if not isinstance(terminated, (bool, np.bool8)):
```

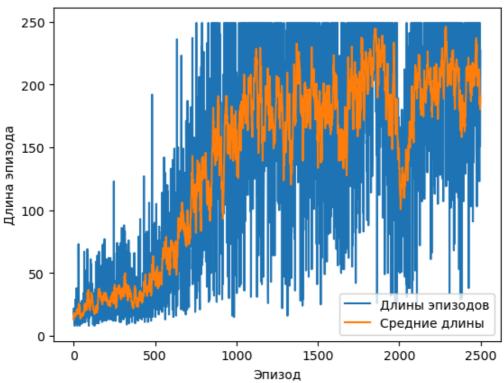
```
episode: 0, reward: 14.0, total length: 13, average length: 13.0
episode: 10, reward: 30.0, total length: 29, average length: 16.9
episode: 20, reward: 32.0, total length: 31, average length: 21.2
episode: 30, reward: 43.0, total length: 42, average length: 24.6
episode: 40, reward: 10.0, total length: 9, average length: 13.7
episode: 50, reward: 17.0, total length: 16, average length: 17.8
episode: 60, reward: 32.0, total length: 31, average length: 18.7
episode: 70, reward: 13.0, total length: 12, average length: 21.7
episode: 80, reward: 18.0, total length: 17, average length: 22.6
episode: 90, reward: 12.0, total length: 11, average length: 36.0
episode: 100, reward: 29.0, total length: 28, average length: 22.1
episode: 110, reward: 17.0, total length: 16, average length: 31.5
episode: 120, reward: 26.0, total length: 25, average length: 23.6
episode: 130, reward: 38.0, total length: 37, average length: 19.7
episode: 140, reward: 16.0, total length: 15, average length: 20.3
episode: 150, reward: 51.0, total length: 50, average length: 32.0
episode: 160, reward: 25.0, total length: 24, average length: 31.9
episode: 100, reward: 25.0, total length: 24, average length: 31.9 episode: 170, reward: 57.0, total length: 56, average length: 31.7 episode: 180, reward: 74.0, total length: 73, average length: 30.0 episode: 190, reward: 35.0, total length: 34, average length: 30.4 episode: 200, reward: 13.0, total length: 12, average length: 27.6 episode: 210, reward: 29.0, total length: 28, average length: 26.6 episode: 220, reward: 14.0, total length: 13, average length: 25.7 episode: 230, reward: 18.0, total length: 17, average length: 31.6
episode: 230, reward: 18.0, total length: 17, average length: 31.6 episode: 240, reward: 31.0, total length: 30, average length: 33.1
episode: 250, reward: 26.0, total length: 25, average length: 37.9
episode: 260, reward: 17.0, total length: 16, average length: 22.6
episode: 270, reward: 38.0, total length: 37, average length: 36.9
episode: 280, reward: 13.0, total length: 12, average length: 37.8
episode: 290, reward: 13.0, total length: 12, average length: 29.1
episode: 300, reward: 15.0, total length: 14, average length: 33.7
episode: 310, reward: 83.0, total length: 82, average length: 47.7
episode: 320, reward: 45.0, total length: 44, average length: 34.1
episode: 330, reward: 37.0, total length: 36, average length: 38.4
episode: 340, reward: 11.0, total length: 10, average length: 31.3
episode: 350, reward: 22.0, total length: 21, average length: 33.9
episode: 360, reward: 27.0, total length: 26, average length: 24.6
episode: 370, reward: 23.0, total length: 22, average length: 26.0
episode: 380, reward: 23.0, total length: 22, average length: 37.7
episode: 300, reward: 25.0, total length: 22, average length: 37.7 episode: 390, reward: 44.0, total length: 43, average length: 26.7 episode: 400, reward: 49.0, total length: 48, average length: 28.0 episode: 410, reward: 38.0, total length: 37, average length: 34.7 episode: 420, reward: 38.0, total length: 37, average length: 27.3 episode: 430, reward: 25.0, total length: 24, average length: 31.7 episode: 440, reward: 71.0, total length: 70, average length: 48.0
episode: 440, reward: 71.0, total length: 70, average length: 48.9 episode: 450, reward: 20.0, total length: 19, average length: 31.7
episode: 460, reward: 27.0, total length: 26, average length: 35.9
episode: 470, reward: 18.0, total length: 17, average length: 43.4
episode: 480, reward: 29.0, total length: 28, average length: 41.4
episode: 490, reward: 42.0, total length: 41, average length: 62.5
episode: 500, reward: 42.0, total length: 41, average length: 45.0
episode: 510, reward: 43.0, total length: 42, average length: 47.1
episode: 520, reward: 63.0, total length: 62, average length: 43.8
episode: 530, reward: 35.0, total length: 34, average length: 47.9
episode: 540, reward: 84.0, total length: 83, average length: 45.5
episode: 550, reward: 82.0, total length: 81, average length: 69.1
episode: 560, reward: 131.0, total length: 130, average length: 74.8
episode: 570, reward: 24.0, total length: 23, average length: 57.5
episode: 580, reward: 47.0, total length: 46, average length: 67.5
episode: 590, reward: 99.0, total length: 98, average length: 53.8
episode: 600, reward: 64.0, total length: 63, average length: 72.6
episode: 610, reward: 47.0, total length: 46, average length: 68.0
episode: 610, reward: 47.0, total length: 46, average length: 68.0 episode: 620, reward: 36.0, total length: 35, average length: 68.0 episode: 630, reward: 23.0, total length: 22, average length: 49.0 episode: 640, reward: 98.0, total length: 97, average length: 81.4 episode: 650, reward: 132.0, total length: 131, average length: 87.6 episode: 660, reward: 22.0, total length: 21, average length: 86.8 episode: 670, reward: 91.0, total length: 90, average length: 90.3
episode: 670, reward: 91.0, total length: 90, average length: 99.3
episode: 680, reward: 117.0, total length: 116, average length: 86.4
episode: 690, reward: 172.0, total length: 171, average length: 77.6
```

```
episode: 700, reward: 55.0, total length: 54, average length: 88.4
episode: 710, reward: 138.0, total length: 137, average length: 81.3
episode: 720, reward: 183.0, total length: 182, average length: 99.1
episode: 730, reward: 132.0, total length: 131, average length: 138.1
episode: 740, reward: 152.0, total length: 151, average length: 100.3
episode: 750, reward: 57.0, total length: 56, average length: 81.8
episode: 760, reward: 163.0, total length: 162, average length: 137.0
episode: 770, reward: 207.0, total length: 206, average length: 137.4
episode: 780, reward: 139.0, total length: 138, average length: 90.6
episode: 790, reward: 71.0, total length: 70, average length: 134.7
episode: 800, reward: 119.0, total length: 118, average length: 130.2
episode: 810, reward: 175.0, total length: 174, average length: 145.7
episode: 820, reward: 160.0, total length: 159, average length: 110.1
episode: 830, reward: 28.0, total length: 27, average length: 100.2
episode: 840, reward: 61.0, total length: 60, average length: 99.1
episode: 850, reward: 109.0, total length: 108, average length: 146.3 episode: 860, reward: 37.0, total length: 36, average length: 163.5 episode: 870, reward: 232.0, total length: 231, average length: 155.2
episode: 880, reward: 201.0, total length: 200, average length: 144.5
episode: 890, reward: 162.0, total length: 161, average length: 176.8
episode: 900, reward: 84.0, total length: 83, average length: 149.9
episode: 910, reward: 78.0, total length: 77, average length: 116.9
episode: 920, reward: 98.0, total length: 97, average length: 111.8
episode: 930, reward: 166.0, total length: 165, average length: 175.9
episode: 940, reward: 250.0, total length: 249, average length: 190.8
episode: 950, reward: 208.0, total length: 207, average length: 144.6
episode: 960, reward: 116.0, total length: 115, average length: 146.1
episode: 970, reward: 229.0, total length: 228, average length: 182.7
episode: 980, reward: 128.0, total length: 127, average length: 139.1
episode: 990, reward: 195.0, total length: 194, average length: 168.2
episode: 1000, reward: 164.0, total length: 163, average length: 149.8
episode: 1010, reward: 143.0, total length: 142, average length: 138.5
episode: 1020, reward: 183.0, total length: 182, average length: 166.3
episode: 1030, reward: 250.0, total length: 249, average length: 186.4
episode: 1040, reward: 250.0, total length: 249, average length: 165.1
episode: 1040, reward: 250.0, total length: 249, average length: 165.1 episode: 1050, reward: 189.0, total length: 188, average length: 197.3 episode: 1060, reward: 176.0, total length: 175, average length: 183.6 episode: 1070, reward: 180.0, total length: 179, average length: 163.9 episode: 1080, reward: 248.0, total length: 247, average length: 201.1 episode: 1090, reward: 118.0, total length: 117, average length: 185.4 episode: 1100, reward: 194.0, total length: 193, average length: 187.5 episode: 1110, reward: 180.0, total length: 179, average length: 202.3 episode: 1120, reward: 203.0, total length: 202, average length: 217.0 episode: 1130, reward: 250.0, total length: 249, average length: 191.6
episode: 1140, reward: 250.0, total length: 249, average length: 191.6
episode: 1150, reward: 250.0, total length: 249, average length: 207.7
episode: 1160, reward: 162.0, total length: 161, average length: 146.6
episode: 1170, reward: 132.0, total length: 131, average length: 156.6
episode: 1180, reward: 202.0, total length: 201, average length: 198.7
```

```
episode: 1190, reward: 250.0, total length: 249, average length: 197.0
episode: 1200, reward: 91.0, total length: 90, average length: 170.8
episode: 1210, reward: 250.0, total length: 249, average length: 181.2
episode: 1220, reward: 167.0, total length: 166, average length: 173.5
episode: 1230, reward: 145.0, total length: 144, average length: 155.0
episode: 1240, reward: 178.0, total length: 177, average length: 174.4
episode: 1250, reward: 155.0, total length: 154, average length: 197.5
episode: 1260, reward: 250.0, total length: 249, average length: 202.1
episode: 1270, reward: 250.0, total length: 249, average length: 179.4
episode: 1280, reward: 244.0, total length: 243, average length: 193.5
episode: 1290, reward: 151.0, total length: 150, average length: 123.6
episode: 1300, reward: 146.0, total length: 145, average length: 169.4
episode: 1310, reward: 250.0, total length: 249, average length: 186.6
episode: 1320, reward: 62.0, total length: 61, average length: 164.4
episode: 1330, reward: 250.0, total length: 249, average length: 155.9
episode: 1340, reward: 188.0, total length: 187, average length: 129.2
episode: 1350, reward: 106.0, total length: 105, average length: 184.4
episode: 1360, reward: 100.0, total length: 103, average length: 164.4 episode: 1360, reward: 37.0, total length: 36, average length: 167.3 episode: 1370, reward: 248.0, total length: 247, average length: 232.6 episode: 1380, reward: 202.0, total length: 201, average length: 200.5 episode: 1390, reward: 204.0, total length: 203, average length: 212.7 episode: 1400, reward: 150.0, total length: 149, average length: 184.1 episode: 1410, reward: 250.0, total length: 249, average length: 160.8 episode: 1420, reward: 250.0, total length: 249, average length: 200.6
episode: 1420, reward: 250.0, total length: 249, average length: 200.6 episode: 1430, reward: 250.0, total length: 249, average length: 165.7
episode: 1440, reward: 250.0, total length: 249, average length: 195.8
episode: 1450, reward: 206.0, total length: 205, average length: 183.9
episode: 1460, reward: 250.0, total length: 249, average length: 202.9
episode: 1470, reward: 235.0, total length: 234, average length: 202.4
episode: 1480, reward: 250.0, total length: 249, average length: 190.1
episode: 1490, reward: 250.0, total length: 249, average length: 197.6
episode: 1500, reward: 105.0, total length: 104, average length: 137.4
episode: 1510, reward: 207.0, total length: 206, average length: 194.8
episode: 1520, reward: 247.0, total length: 246, average length: 141.8
episode: 1530, reward: 220.0, total length: 219, average length: 182.0
episode: 1540, reward: 250.0, total length: 249, average length: 193.3
episode: 1550, reward: 250.0, total length: 249, average length: 173.7
episode: 1560, reward: 250.0, total length: 249, average length: 168.9
episode: 1570, reward: 119.0, total length: 118, average length: 186.1
episode: 1570, reward: 119.0, total length: 118, average length: 186.1 episode: 1580, reward: 250.0, total length: 249, average length: 183.5 episode: 1590, reward: 250.0, total length: 249, average length: 172.7 episode: 1600, reward: 170.0, total length: 169, average length: 208.0 episode: 1610, reward: 210.0, total length: 209, average length: 208.3 episode: 1620, reward: 250.0, total length: 249, average length: 185.9 episode: 1630, reward: 70.0, total length: 249, average length: 185.9
episode: 1630, reward: 79.0, total length: 78, average length: 139.2
episode: 1640, reward: 58.0, total length: 57, average length: 148.8
episode: 1650, reward: 133.0, total length: 132, average length: 161.5
episode: 1660, reward: 221.0, total length: 220, average length: 154.8
episode: 1670, reward: 139.0, total length: 138, average length: 171.8
episode: 1680, reward: 184.0, total length: 183, average length: 146.8
episode: 1690, reward: 250.0, total length: 249, average length: 194.4
episode: 1700, reward: 227.0, total length: 226, average length: 201.2
episode: 1710, reward: 138.0, total length: 137, average length: 221.3
episode: 1720, reward: 250.0, total length: 249, average length: 175.5
episode: 1730, reward: 152.0, total length: 151, average length: 207.9
episode: 1740, reward: 98.0, total length: 97, average length: 165.1
episode: 1750, reward: 250.0, total length: 249, average length: 204.9
episode: 1760, reward: 250.0, total length: 249, average length: 166.1
episode: 1770, reward: 123.0, total length: 122, average length: 224.7
episode: 1780, reward: 151.0, total length: 150, average length: 197.8
episode: 1790, reward: 248.0, total length: 247, average length: 209.2
episode: 1790, reward: 248.0, total length: 247, average length: 209.2 episode: 1800, reward: 234.0, total length: 233, average length: 221.0 episode: 1810, reward: 250.0, total length: 249, average length: 199.7 episode: 1820, reward: 250.0, total length: 249, average length: 219.3 episode: 1830, reward: 250.0, total length: 249, average length: 209.8 episode: 1840, reward: 204.0, total length: 203, average length: 213.8 episode: 1850, reward: 250.0, total length: 249, average length: 244.3 episode: 1860, reward: 145.0, total length: 144, average length: 226.6 episode: 1870, reward: 250.0, total length: 249, average length: 207.2 episode: 1880, reward: 250.0, total length: 249, average length: 216.0
episode: 1880, reward: 250.0, total length: 249, average length: 216.0
```

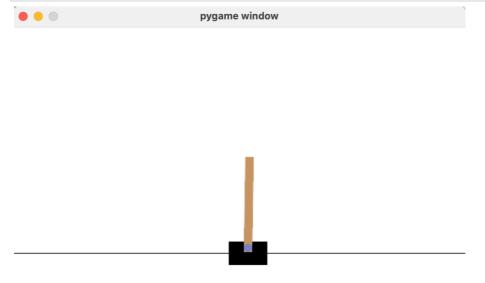
```
episode: 1890, reward: 250.0, total length: 249, average length: 227.1
episode: 1900, reward: 95.0, total length: 94, average length: 217.4
episode: 1910, reward: 250.0, total length: 249, average length: 231.3
episode: 1920, reward: 199.0, total length: 198, average length: 172.1
episode: 1930, reward: 180.0, total length: 179, average length: 214.8
episode: 1940, reward: 250.0, total length: 249, average length: 170.7
episode: 1950, reward: 62.0, total length: 61, average length: 159.2
episode: 1960, reward: 250.0, total length: 249, average length: 191.1
episode: 1970, reward: 219.0, total length: 218, average length: 215.3
episode: 1980, reward: 214.0, total length: 213, average length: 174.1
episode: 1990, reward: 184.0, total length: 183, average length: 156.5
episode: 2000, reward: 52.0, total length: 51, average length: 132.9
episode: 2010, reward: 117.0, total length: 116, average length: 107.2
episode: 2010, reward: 117.0, total length: 116, average length: 107.2 episode: 2020, reward: 119.0, total length: 118, average length: 134.1 episode: 2030, reward: 126.0, total length: 125, average length: 110.9 episode: 2040, reward: 127.0, total length: 126, average length: 133.3 episode: 2050, reward: 163.0, total length: 162, average length: 137.2 episode: 2060, reward: 205.0, total length: 204, average length: 150.0 episode: 2070, reward: 195.0, total length: 194, average length: 159.3 episode: 2080, reward: 25.0, total length: 24, average length: 183.8
episode: 2080, reward: 35.0, total length: 34, average length: 182.8 episode: 2090, reward: 250.0, total length: 249, average length: 175.2
episode: 2100, reward: 53.0, total length: 52, average length: 195.8
episode: 2110, reward: 250.0, total length: 249, average length: 208.5
episode: 2120, reward: 250.0, total length: 249, average length: 223.8
episode: 2130, reward: 158.0, total length: 157, average length: 194.6
episode: 2140, reward: 108.0, total length: 107, average length: 191.5
episode: 2150, reward: 206.0, total length: 205, average length: 184.2
episode: 2160, reward: 183.0, total length: 182, average length: 200.2
episode: 2170, reward: 223.0, total length: 222, average length: 203.4
episode: 2180, reward: 218.0, total length: 217, average length: 211.0
episode: 2190, reward: 223.0, total length: 222, average length: 210.4
episode: 2200, reward: 67.0, total length: 66, average length: 179.0
episode: 2210, reward: 173.0, total length: 172, average length: 198.7
episode: 2220, reward: 250.0, total length: 249, average length: 198.5
episode: 2230, reward: 128.0, total length: 127, average length: 199.5
episode: 2230, reward: 128.0, total length: 127, average length: 199.5 episode: 2240, reward: 211.0, total length: 210, average length: 185.5 episode: 2250, reward: 232.0, total length: 231, average length: 209.8 episode: 2260, reward: 250.0, total length: 249, average length: 220.4 episode: 2270, reward: 250.0, total length: 249, average length: 206.4 episode: 2280, reward: 250.0, total length: 249, average length: 218.9 episode: 2290, reward: 250.0, total length: 249, average length: 234.0 episode: 2300, reward: 250.0, total length: 249, average length: 205.7 episode: 2310, reward: 250.0, total length: 249, average length: 200.5 episode: 2320, reward: 186.0, total length: 185, average length: 214.5 episode: 2330, reward: 250.0, total length: 249, average length: 226.1
episode: 2330, reward: 250.0, total length: 249, average length: 226.1
episode: 2340, reward: 250.0, total length: 249, average length: 195.3
episode: 2350, reward: 250.0, total length: 249, average length: 216.2 episode: 2360, reward: 207.0, total length: 206, average length: 209.7 episode: 2370, reward: 248.0, total length: 247, average length: 185.7 episode: 2380, reward: 242.0, total length: 241, average length: 172.8 episode: 2390, reward: 202.0, total length: 201, average length: 182.0 episode: 2300, reward: 260.0, total length: 201, average length: 182.0
episode: 2400, reward: 250.0, total length: 249, average length: 171.5 episode: 2410, reward: 250.0, total length: 249, average length: 188.8 episode: 2420, reward: 250.0, total length: 249, average length: 208.0
episode: 2430, reward: 249.0, total length: 248, average length: 210.1
episode: 2440, reward: 104.0, total length: 103, average length: 192.2
episode: 2450, reward: 250.0, total length: 249, average length: 217.1
episode: 2460, reward: 250.0, total length: 249, average length: 203.2
episode: 2470, reward: 250.0, total length: 249, average length: 224.6
episode: 2480, reward: 178.0, total length: 177, average length: 208.3
episode: 2490, reward: 250.0, total length: 249, average length: 212.2
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```

Ввод [7]: image\_path = "data/a2c\_result.png" display(Image(filename=image\_path, width=500, height=500))



## Итог

Агент был успешно обучен в течение 2500 эпизодов. В процессе обучения наблюдалось улучшение его способности удерживать маятник в вертикальном положении, что подтверждается увеличением наград и длины эпизодов. Графики, построенные после завершения обучения, показали положительную динамику суммарных наград и средней длины эпизодов, что свидетельствует о корректной работе алгоритма и успешном обучении агента.

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Ввод []:
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