SB2_AC2_MLP

September 11, 2021

```
[1]: import warnings
     warnings.filterwarnings(action='ignore',
                             category=DeprecationWarning,
                             module='stable_baselines')
     warnings.filterwarnings(action='ignore',
                             category=UserWarning,
                             module='stable_baselines')
     warnings.filterwarnings("ignore", category=FutureWarning, module='tensorflow')
     warnings.filterwarnings("ignore", category=FutureWarning, module='tensorboard')
     warnings.filterwarnings("ignore", category=UserWarning, module='gym')
     import gym
     import PortfolioAllocationGym
     import numpy as np
     from stable_baselines import A2C
     from stable_baselines.common.policies import MlpLnLstmPolicy #, MlpPolicy, __
     → MlpLstmPolicy
     from stable_baselines.common.evaluation import evaluate_policy
     from stable_baselines.common.env_checker import check_env
     from stable_baselines.bench import Monitor
     from tensorflow import nn as nn
     import pandas as pd
     pd.options.mode.chained_assignment = None # default='warn'
     from datetime import datetime
```

```
'sample_size':sample_size,
         'random_sample':True,
         'observations' : observations,
         'save_info' : True,
         #'report_point' : 252,
         'reward_function':reward_fn}
     train_env = gym.make('PortfolioAllocation-v0', **env_kwargs)
     train_env = Monitor(train_env, 'monitor')
[3]: check_env(train_env)
[4]: venv, obs = train_env.get_sb_env()
[5]: | #{'qamma': 0.9999, 'n_steps': 1, 'lr_schedule': 'constant', 'lr': 0.001, |
      \rightarrow 'ent_coef': 0.1, 'vf_coef': 0, 'max_grad_norm': 5, 'n_lstm': 128, \square
      → 'activation_fn': 'tanh', 'net_arch': 'medium'}.
     model_kwargs = {
         'gamma': 0.9999,
         'n_steps': 1,
         'lr_schedule': 'linear',
         'learning_rate': 0.001,
         'ent_coef': 0.1,
         'vf_coef': 0,
         'max_grad_norm': 5,
         'full_tensorboard_log': True,
         'policy_kwargs' : dict (
             n_1stm=128,
             act_fun=nn.tanh,
             net_arch=[64, 'lstm', dict(pi=[256, 256], vf=[256, 256])]
             )
         }
     a2c_model = A2C(policy = MlpLnLstmPolicy, tensorboard_log="tensorboard",env =__
      →venv, **model_kwargs)
[6]: ts_factor = 40
     total_timesteps = ts_factor* (len(venv.venv.envs[0].data.date.unique()))
[7]: trained_a2c_model= a2c_model.learn(total_timesteps=total_timesteps,
      →tb_log_name='A2C_'+str(sample_size)+'_'+reward_fn+'_'+datetime.now().

strftime("%H-%M"))
```

WARNING:tensorflow:From C:\Users\kbine\anaconda3\envs\stable2\lib\site-packages\stable_baselines\common\base_class.py:1169: The name tf.summary.FileWriter is deprecated. Please use tf.compat.v1.summary.FileWriter

instead.

day: 2516 excess mean: 0.433 2,225,424.88	sharpe: 9.002 cum. rtns: 122.542	
day: 2516 excess mean: 1.825 3,162,130.13	sharpe: 12.440 cum. rtns: 216.213	index : 18.340 portf val:
day: 2516 excess mean: 0.767 2,380,784.30	sharpe: 9.765 cum. rtns: 138.078	index : 18.340 portf val:
day: 2516 excess mean: 1.245 2,792,823.34	sharpe: 11.826 cum. rtns: 179.282	index : 18.340 portf val:
day: 2516 excess mean: 1.105 2,661,332.58	sharpe: 11.979 cum. rtns: 166.133	index : 18.340 portf val:
day: 2516 excess mean: 1.078 2,655,298.81	sharpe: 10.637 cum. rtns: 165.530	index : 18.340 portf val:
day: 2516 excess mean: 1.681 3,132,857.33	sharpe: 12.575 cum. rtns: 213.286	index : 18.340 portf val:
day: 2516 excess mean: 0.898 2,524,150.24	sharpe: 10.509 cum. rtns: 152.415	index : 18.340 portf val:
day: 2516 excess mean: 1.825	sharpe: 13.204 cum. rtns: 209.484	index : 18.340 portf val:
3,094,835.67 day: 2516 excess mean: 1.663	sharpe: 10.744 cum. rtns: 203.899	index : 18.340 portf val:
3,038,989.56 day: 2516 excess mean: 0.577	sharpe: 8.263 cum. rtns: 123.949	index : 18.340 portf val:
2,239,489.38 day: 2516 excess mean: 1.575	sharpe: 11.690 cum. rtns: 189.356	index : 18.340 portf val:
2,893,558.79 day: 2516 excess mean: 1.967	sharpe: 12.717 cum. rtns: 222.632	index : 18.340 portf val:
3,226,322.52 day: 2516 excess mean: 1.286	sharpe: 10.976 cum. rtns: 172.204	index : 18.340 portf val:
2,722,039.33 day: 2516 excess mean: 1.595	sharpe: 10.604 cum. rtns: 185.469	index : 18.340 portf val:
2,854,686.39 day: 2516	sharpe: 11.687	index : 18.340

excess mean:			cum. rtns: 162.576	portf val:
2,625,760.90 day: 2516		sharpe:	10 048	index : 18.340
excess mean:	0 908	sharpe.	cum. rtns: 150.089	portf val:
2,500,889.50			Cum. 10ns. 100.009	porti var.
day: 2516		sharpe:	10.937	index : 18.340
excess mean:	1.290	bildi po.	cum. rtns: 168.523	portf val:
2,685,232.99				r
day: 2516		sharpe:	13.142	index : 18.340
excess mean:	1.322	•	cum. rtns: 183.532	portf val:
2,835,324.10				-
day: 2516		sharpe:	11.753	index : 18.340
excess mean:	1.279		cum. rtns: 178.661	portf val:
2,786,607.16				
day: 2516		sharpe:	11.980	index : 18.340
excess mean:	1.701		cum. rtns: 199.054	portf val:
2,990,539.37				
day: 2516		sharpe:	8.722	index : 18.340
excess mean:			cum. rtns: 114.684	portf val:
2,146,841.05				
day: 2516		sharpe:		index : 18.340
excess mean:			cum. rtns: 176.949	portf val:
2,769,487.51				
day: 2516		sharpe:		index : 18.340
excess mean:			cum. rtns: 229.734	portf val:
3,297,344.10		,		•
3,297,344.10 day: 2516		sharpe:	9.378	index : 18.340
3,297,344.10 day: 2516 excess mean:	-0.186	sharpe:		•
3,297,344.10 day: 2516 excess mean: val: 2,010,9	-0.186	-	9.378 cum. rtns: 101.100	index: 18.340 portf
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516	-0.186 97.09	sharpe:	9.378 cum. rtns: 101.100	index: 18.340 portf index: 18.340
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean:	-0.186 97.09 1.112	sharpe:	9.378 cum. rtns: 101.100	index: 18.340 portf index: 18.340
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07	-0.186 97.09 1.112	sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516	-0.186 97.09 1.112	sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428 10.948	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516 excess mean:	-0.186 97.09 1.112 1.585	sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516 excess mean: 2,964,201.39	-0.186 97.09 1.112 1.585	sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428 10.948 cum. rtns: 196.420	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516 excess mean: 2,964,201.39 day: 2516	-0.186 97.09 1.112 1.585	sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428 10.948 cum. rtns: 196.420 12.035	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516 excess mean: 2,964,201.39 day: 2516 excess mean:	-0.186 97.09 1.112 1.585	sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428 10.948 cum. rtns: 196.420	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516 excess mean: 2,964,201.39 day: 2516	-0.186 97.09 1.112 1.585	sharpe: sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428 10.948 cum. rtns: 196.420 12.035 cum. rtns: 211.599	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516 excess mean: 2,964,201.39 day: 2516 excess mean: 3,115,985.60	-0.186 97.09 1.112 1.585 1.775	sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428 10.948 cum. rtns: 196.420 12.035 cum. rtns: 211.599	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516 excess mean: 2,964,201.39 day: 2516 excess mean: 3,115,985.60 day: 2516	-0.186 97.09 1.112 1.585 1.775	sharpe: sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428 10.948 cum. rtns: 196.420 12.035 cum. rtns: 211.599 11.282	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516 excess mean: 2,964,201.39 day: 2516 excess mean: 3,115,985.60 day: 2516 excess mean:	-0.186 97.09 1.112 1.585 1.775	sharpe: sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428 10.948 cum. rtns: 196.420 12.035 cum. rtns: 211.599 11.282 cum. rtns: 198.076	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516 excess mean: 2,964,201.39 day: 2516 excess mean: 3,115,985.60 day: 2516 excess mean: 2,980,762.83	-0.186 97.09 1.112 1.585 1.775	sharpe: sharpe: sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428 10.948 cum. rtns: 196.420 12.035 cum. rtns: 211.599 11.282 cum. rtns: 198.076	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516 excess mean: 2,964,201.39 day: 2516 excess mean: 3,115,985.60 day: 2516 excess mean: 2,980,762.83 day: 2516	-0.186 97.09 1.112 1.585 1.775 1.565	sharpe: sharpe: sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428 10.948 cum. rtns: 196.420 12.035 cum. rtns: 211.599 11.282 cum. rtns: 198.076 12.687	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516 excess mean: 2,964,201.39 day: 2516 excess mean: 3,115,985.60 day: 2516 excess mean: 2,980,762.83 day: 2516 excess mean:	-0.186 97.09 1.112 1.585 1.775 1.565	sharpe: sharpe: sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428 10.948 cum. rtns: 196.420 12.035 cum. rtns: 211.599 11.282 cum. rtns: 198.076 12.687 cum. rtns: 197.354 6.657	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516 excess mean: 2,964,201.39 day: 2516 excess mean: 3,115,985.60 day: 2516 excess mean: 2,980,762.83 day: 2516 excess mean: 2,973,543.75 day: 2516 excess mean:	-0.186 97.09 1.112 1.585 1.775 1.565 1.526	sharpe: sharpe: sharpe: sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428 10.948 cum. rtns: 196.420 12.035 cum. rtns: 211.599 11.282 cum. rtns: 198.076 12.687 cum. rtns: 197.354	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516 excess mean: 2,964,201.39 day: 2516 excess mean: 3,115,985.60 day: 2516 excess mean: 2,980,762.83 day: 2516 excess mean: 2,973,543.75 day: 2516 excess mean: 1,972,813.53	-0.186 97.09 1.112 1.585 1.775 1.565 1.526	sharpe: sharpe: sharpe: sharpe: sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428 10.948 cum. rtns: 196.420 12.035 cum. rtns: 211.599 11.282 cum. rtns: 198.076 12.687 cum. rtns: 197.354 6.657 cum. rtns: 97.281	<pre>index : 18.340</pre>
3,297,344.10 day: 2516 excess mean: val: 2,010,9 day: 2516 excess mean: 2,734,275.07 day: 2516 excess mean: 2,964,201.39 day: 2516 excess mean: 3,115,985.60 day: 2516 excess mean: 2,980,762.83 day: 2516 excess mean: 2,973,543.75 day: 2516 excess mean:	-0.186 97.09 1.112 1.585 1.775 1.565 1.526	sharpe: sharpe: sharpe: sharpe:	9.378 cum. rtns: 101.100 12.446 cum. rtns: 173.428 10.948 cum. rtns: 196.420 12.035 cum. rtns: 211.599 11.282 cum. rtns: 198.076 12.687 cum. rtns: 197.354 6.657 cum. rtns: 97.281	<pre>index : 18.340</pre>

```
excess mean: 1.783
                                         cum. rtns: 213.556
                                                                             portf val:
     3,135,555.64
     day: 2516
                                sharpe: 9.266
                                                               index : 18.340
     excess mean: 0.091
                                         cum. rtns: 112.693
                                                                             portf val:
     2,126,929.85
     day: 2516
                                sharpe: 11.183
                                                                index : 18.340
     excess mean: 1.495
                                         cum. rtns: 188.299
                                                                             portf val:
     2,882,986.59
                                                                index : 18.340
     day: 2516
                                sharpe: 11.143
                                         cum. rtns: 191.964
     excess mean: 1.587
                                                                             portf val:
     2,919,637.28
     day: 2516
                                sharpe: 14.376
                                                                index : 18.340
     excess mean: 1.820
                                         cum. rtns: 217.935
                                                                             portf val:
     3,179,349.40
     day: 2516
                                sharpe: 12.013
                                                                index : 18.340
     excess mean: 1.228
                                         cum. rtns: 173.129
                                                                             portf val:
     2,731,290.18
     day: 2516
                                                                index : 18.340
                                sharpe: 12.035
     excess mean: 1.467
                                         cum. rtns: 191.518
                                                                             portf val:
     2,915,179.14
     day: 2516
                                sharpe: 13.468
                                                                index: 18.340
     excess mean: 1.573
                                         cum. rtns: 202.940
                                                                             portf val:
     3,029,400.29
                                                                index : 18.340
     day: 2516
                                sharpe: 11.631
     excess mean: 1.767
                                         cum. rtns: 207.199
                                                                             portf val:
     3,071,988.22
[8]: trained_a2c_model.
       -save('ac2_mlplnltsm_'+str(sample_size)+'_'+str(ts_factor)+'_'+reward_fn+'.zip')
[9]: eval_kwargs = {'filename':'sp500.csv',
          'date_from':'2019-01-01',
          'date_to':'2020-12-31',
          'investment':1000000,
          'risk_free_rate': 0.5, # approx US Treasury Note return
          'sample_size':100,
          'random_sample':False,
          'observations' : observations,
          'save_info' : True,
          #'report_point' : 252,
          'reward_function':'benchmark_mean'}
      eval_env = gym.make('PortfolioAllocation-v0', **eval_kwargs)
[10]: eval_venv, obs = eval_env.get_sb_env()
```

```
[11]: # Random Agent, before training
      mean_reward, std_reward = evaluate_policy(a2c_model, eval_venv,_
       →n_eval_episodes=5)
      print(f"mean_reward:{mean_reward:.2f} +/- {std_reward:.2f}")
     day: 402
                               sharpe: 4.417
                                                              index: 64.277
     excess mean: 0.727
                                         cum. rtns: 38.115
                                                                             portf val:
     1,381,154.73
     day: 402
                               sharpe: 4.615
                                                              index : 64.277
     excess mean: 1.133
                                          cum. rtns: 40.375
                                                                            portf val:
     1,403,754.24
     day: 402
                               sharpe: 4.583
                                                              index : 64.277
     excess mean: 1.077
                                         cum. rtns: 40.044
                                                                            portf val:
     1,400,435.08
     day: 402
                               sharpe: 4.511
                                                              index : 64.277
     excess mean: 0.930
                                         cum. rtns: 39.215
                                                                            portf val:
     1,392,153.15
     day: 402
                               sharpe: 4.594
                                                              index : 64.277
     excess mean: 1.094
                                         cum. rtns: 40.140
                                                                             portf val:
     1,401,403.42
     mean_reward:16.12 +/- 9.41
[12]: | obs = eval_venv.reset()
      mean_reward, std_reward = evaluate_policy(trained_a2c_model, eval_venv,_
       \rightarrown_eval_episodes=10)
      print(f"mean_reward:{mean_reward:.2f} +/- {std_reward:.2f}")
     day: 402
                               sharpe: 4.675
                                                              index: 64.277
     excess mean: 1.261
                                         cum. rtns: 41.078
                                                                             portf val:
     1,410,782.22
     day: 402
                               sharpe: 4.649
                                                              index : 64.277
     excess mean: 1.208
                                          cum. rtns: 40.777
                                                                             portf val:
     1,407,767.86
     day: 402
                               sharpe: 4.634
                                                              index: 64.277
     excess mean: 1.178
                                         cum. rtns: 40.608
                                                                            portf val:
     1,406,080.95
                               sharpe: 4.626
     day: 402
                                                              index : 64.277
     excess mean: 1.160
                                         cum. rtns: 40.508
                                                                            portf val:
     1,405,084.63
     day: 402
                               sharpe: 4.629
                                                              index : 64.277
     excess mean: 1.166
                                         cum. rtns: 40.547
                                                                            portf val:
     1,405,465.49
     day: 402
                                                              index: 64.277
                               sharpe: 4.627
     excess mean: 1.162
                                         cum. rtns: 40.528
                                                                            portf val:
     1,405,280.70
     day: 402
                               sharpe: 4.622
                                                              index : 64.277
     excess mean: 1.152
                                         cum. rtns: 40.478
                                                                            portf val:
```

1,404,783.27

day: 402 sharpe: 4.590 index: 64.277

excess mean: 1.086 cum. rtns: 40.102 portf val:

1,401,017.14

day: 402 sharpe: 4.566 index: 64.277

excess mean: 1.039 cum. rtns: 39.839 portf val:

1,398,388.49

day: 402 sharpe: 4.546 index: 64.277

excess mean: 0.998 cum. rtns: 39.610 portf val:

1,396,100.41

mean_reward:10.03 +/- 1.18