evaluation

March 10, 2020

```
[51]: %matplotlib inline
import pandas as pd
import matplotlib.pyplot as plt
import matplotlib.patches as mpatches
import numpy as np
```

Naive supervised neural network

```
[52]: ##### OPEN CSV FUNCTION #####
      def openCsvNaive():
          test_path = '../NN_2048/auto_trained/test.csv'
          df = pd.read_csv(test_path)
          return df
      ##### HIGHEST SCORE FUNCTION #####
      def highestScoreNaive(df):
          highest_score = df[df['highest_score'] == df['highest_score'] .max()]
          return highest_score
      ##### MAX TILE FUNCTION #####
      def maxTileNaive(df):
          max_tile = df[df['max_tile'] == df['max_tile'].max()]
          return max_tile
      ##### PLOT SCORES FUNCTION #####
      def plotScoresNaive(df):
          font = {'family' : 'normal',
              'size' : 22}
          plt.rc('font', **font)
          x1, x2, x3, y1, y2, y3 = [], [], [], [], []
          for index, row in df.iterrows():
              if row['max_tile'] <= 64:</pre>
                  x1.append(row['episode'])
                  y1.append(row['highest_score'])
              elif row['max_tile'] == 128:
                  x2.append(row['episode'])
                  y2.append(row['highest_score'])
```

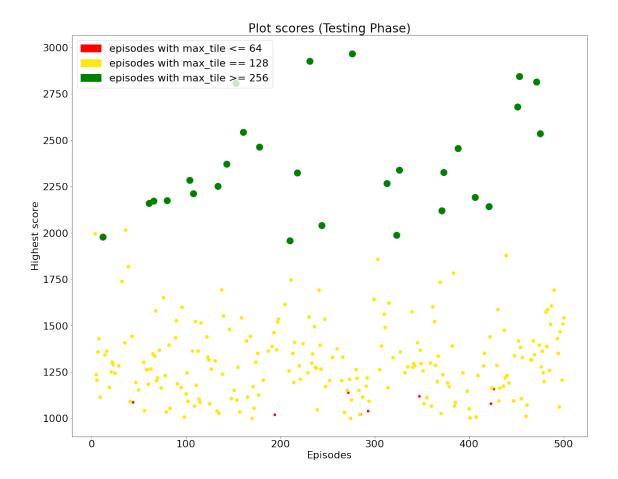
```
else:
                   x3.append(row['episode'])
                  y3.append(row['highest_score'])
          plt.figure(figsize=(20,16))
          plt.title('Plot scores (Testing Phase)')
          plt.xlabel('Episodes')
          plt.ylabel('Highest score')
          plt.scatter(x=x1, y=y1, s=25, c='red')
          plt.scatter(x=x2, y=y2, s=50, c='#fde910')
          plt.scatter(x=x3, y=y3, s=200, c='green')
          red_patch = mpatches.Patch(color='red', label='episodes with max_tile <=_\u00c4

→64¹)

          yellow_patch = mpatches.Patch(color='#fde910', label='episodes withu
       \rightarrowmax_tile == 128')
          green_patch = mpatches.Patch(color='green', label='episodes with max_tile_u
       ⇒>= 256¹)
          plt.legend(handles=[red_patch, yellow_patch, green_patch])
          plt.show()
[53]: df naive = openCsvNaive()
      df_naive.head(10)
[53]:
         episode episode_steps highest_score max_tile
                                          1996.0
                             213
                                                       128
      1
               5
                             148
                                          1236.0
                                                       128
      2
               6
                             157
                                          1208.0
                                                       128
               7
      3
                             158
                                          1360.0
                                                       128
      4
               8
                                                       128
                             171
                                          1432.0
               9
      5
                                                       128
                             135
                                          1116.0
      6
              12
                             193
                                          1980.0
                                                       256
      7
              14
                             159
                                          1344.0
                                                       128
      8
              16
                                          1364.0
                                                       128
                             153
      9
              19
                             138
                                          1168.0
                                                       128
[54]: highestScoreNaive(df_naive)
[54]:
           episode episode_steps highest_score
                                                   max tile
      141
               276
                               285
                                            2968.0
                                                         256
[55]: maxTileNaive(df_naive)
[55]:
           episode episode_steps highest_score max_tile
                12
                               193
                                            1980.0
                                                         256
      29
                61
                               226
                                            2160.0
                                                         256
```

32	66	208	2172.0	256
42	80	182	2176.0	256
54	104	214	2284.0	256
56	108	201	2212.0	256
71	134	236	2252.0	256
76	143	237	2372.0	256
80	153	262	2808.0	256
85	161	258	2544.0	256
95	178	230	2464.0	256
106	210	189	1960.0	256
111	218	219	2324.0	256
117	231	267	2928.0	256
127	244	172	2040.0	256
141	276	285	2968.0	256
158	313	223	2268.0	256
162	323	179	1988.0	256
163	326	242	2340.0	256
187	371	210	2120.0	256
189	373	216	2328.0	256
196	388	231	2456.0	256
201	406	234	2192.0	256
206	421	191	2144.0	256
223	451	236	2680.0	256
225	453	288	2844.0	256
235	471	269	2816.0	256
237	475	246	2536.0	256

[56]: plotScoresNaive(df_naive)



Deep Reinforcement Learning

```
[57]: #### OPEN CSV FUNCTION ####

def openCsv(num_episodes_path):
    train_path = 'data/train/train_steps_'
    df = pd.read_csv(train_path+num_episodes_path+'.csv')
    return df

##### TOTAL EPISODES FUNCTION #####

def totEpisodes(df):
    tot_episodes = df['episode'].max()
    return tot_episodes

##### HIGHEST SCORE FUNCTION #####

def highestScore(df):
    highest_score = df[df['highest_score']==df['highest_score'].max()]
    return highest_score

##### MAX TILE FUNCTION #####

def maxTile(df):
```

```
max_tile = df[df['max_tile']==df['max_tile'].max()]
   return max_tile
##### PLOT SCORES FUNCTION #####
def plotScores(df, num_episodes):
   font = {'family' : 'normal',
        'size' : 22}
   plt.rc('font', **font)
   x1,x2,x3,x4,y1,y2,y3,y4 = [],[],[],[],[],[],[]
   for index, row in df.iterrows():
        if row['max_tile'] <= 256:</pre>
            x1.append(row['episode'])
            y1.append(row['highest_score'])
        elif row['max tile'] == 512:
            x2.append(row['episode'])
            y2.append(row['highest_score'])
        elif row['max_tile'] == 1024:
            x3.append(row['episode'])
            y3.append(row['highest_score'])
        else:
            x4.append(row['episode'])
            y4.append(row['highest_score'])
   plt.figure(figsize=(20,16))
   plt.title('Plot scores for '+str(num_episodes)+' number of episodes_
plt.xlabel('Episodes')
   plt.ylabel('Highest score')
   plt.scatter(x=x1, y=y1, s=1, c='red')
   plt.scatter(x=x2, y=y2, s=50, c='#fde910')
   plt.scatter(x=x3, y=y3, s=200, c='green')
   plt.scatter(x=x4, y=y4, s=1000, c='#1E90FF')
   red_patch = mpatches.Patch(color='red', label='episodes with max_tile <=_u
→256')
   yellow_patch = mpatches.Patch(color='#fde910', label='episodes withu
 \rightarrowmax_tile == 512')
   green_patch = mpatches.Patch(color='green', label='episodes with max_tile_u
 →== 1024¹)
   blue_patch = mpatches.Patch(color='#1E90FF', label='episodes with max_tile∪
⇒>= 2048¹)
   plt.legend(handles=[red_patch, yellow_patch,green_patch,blue_patch])
   plt.show()
##### PLOT TILES FUNCTION #####
def plotMaxTiles(df, num_episodes):
```

```
font = {'family' : 'normal',
        'size' : 22}
   plt.rc('font', **font)
   x_lowest,y_lowest,x_512,y_512,x_1024,y_1024,x_2048,y_2048 =_
→ [], [], [], [], [], [], []
   for index, row in df.iterrows():
        if row['max_tile'] < 512:</pre>
            x_lowest.append(row['episode'])
            y_lowest.append(row['max_tile'])
        elif row['max_tile'] == 512:
            x_512.append(row['episode'])
            y_512.append(row['max_tile'])
        elif row['max_tile'] == 1024:
            x_1024.append(row['episode'])
            y_1024.append(row['max_tile'])
        elif row['max tile'] == 2048:
            x_2048.append(row['episode'])
            y_2048.append(row['max_tile'])
   plt.figure(figsize=(20,16))
   plt.title('Plot max tiles for '+str(num_episodes)+' number of episodes_u
plt.xlabel('Episodes')
   plt.ylabel('Max Tile')
   x = df['episode']
   y = df['max tile']
   plt.scatter(x=x_lowest, y=y_lowest, s=1, c='red')
   plt.scatter(x=x_512, y=y_512, s=25, c='#fde910')
   plt.scatter(x=x_1024, y=y_1024, s=50, c='green')
   plt.scatter(x=x_2048, y=y_2048, s=1000, c='#1E90FF')
   red_patch = mpatches.Patch(color='red', label='max_tile <= 256')</pre>
   yellow_patch = mpatches.Patch(color='#fde910', label='max_tile == 512')
   green_patch = mpatches.Patch(color='green', label='max_tile == 1024')
   blue_patch = mpatches.Patch(color='#1E90FF', label='max_tile == 2048')
   plt.legend(handles=[red_patch, yellow_patch,green_patch,blue_patch])
   plt.show()
##### OPEN CSV FUNCTION #####
def openTestCsv(num_episodes_path):
   test_path = 'data/test/test_steps_'
   df = pd.read_csv(test_path+num_episodes_path+'.csv')
   return df
```

```
##### PLOT SCORES TEST PHASE FUNCTION #####
def plotScoresTestPhase(df, num_episodes):
    font = {'family' : 'normal',
        'size' : 18}
    plt.rc('font', **font)
    x1, x2, x3, x4, y1, y2, y3, y4 = [], [], [], [], [], [], []
    for index, row in df.iterrows():
        if row['max tile'] <= 256:</pre>
            x1.append(row['episode'])
            y1.append(row['highest_score'])
        elif row['max_tile'] == 512:
            x2.append(row['episode'])
            y2.append(row['highest_score'])
        elif row['max tile'] == 1024:
            x3.append(row['episode'])
            y3.append(row['highest_score'])
            x4.append(row['episode'])
            y4.append(row['highest_score'])
    plt.figure(figsize=(20,16))
    plt.title('Plot scores for '+str(num_episodes)+' number of episodes (Testu
 →Phase)')
    plt.xlabel('Episodes')
    plt.ylabel('Highest score')
    plt.scatter(x=x1, y=y1, s=25, c='#FFA500')
    plt.scatter(x=x2, y=y2, s=50, c='#FF4500')
    plt.scatter(x=x3, y=y3, s=200, c='#FFD700')
    plt.scatter(x=x4, y=y4, s=1000, c='#DAA520')
    red_patch = mpatches.Patch(color='#FFA500', label='episodes with max_tile_u
<= 256¹)</p>
    yellow_patch = mpatches.Patch(color='#FF4500', label='episodes withu
 \rightarrowmax tile == 512')
    green_patch = mpatches.Patch(color='#FFD700', label='episodes with max_tile_
 ⇒== 1024¹)
    blue_patch = mpatches.Patch(color='#DAA520', label='episodes with max_tile_u
    plt.legend(handles=[red_patch, yellow_patch,green_patch,blue_patch])
    plt.show()
```

1 Evaluation Scheme:

For each execution (in which we set a number of different training steps) we report: 1. An extract of the csv saved in the train (Pandas dataframe) 2. Number of games he trained on (episodes) 3. Highest score achieved in training 4. Max tile achieved in training 5. Scatter plot of scores achieved in training & test (only for the last three execution) 6. Scatter plot of max tile achieved in training & test (only for the last three execution)

NB: For Test Phase in each execution we perform 500 episodes

1.1 First case: 5000 steps (Training)

```
[58]:
     ##### NB_STEPS_TRAINING = int(5e3) #####
      num_steps_5e3 = int(5e3)
      df_5e3 = openCsv(str(num_steps_5e3))
      df_5e3.head(10)
[58]:
         episode
                   episode_steps
                                   highest_score
                                                    max_tile
      0
                              128
                                            348.0
                                                        32.0
                1
                2
      1
                              719
                                           1156.0
                                                       128.0
      2
                3
                              386
                                            512.0
                                                        64.0
      3
                4
                             1054
                                           1432.0
                                                       128.0
      4
                5
                              571
                                            760.0
                                                        64.0
      5
                6
                              807
                                           1656.0
                                                       128.0
      6
                7
                              565
                                           1364.0
                                                       128.0
      7
                8
                              607
                                            880.0
                                                        64.0
     totEpisodes(df_5e3)
[59]: 8
[60]: highestScore(df_5e3)
[60]:
         episode
                   episode_steps
                                   highest_score
                                                    max_tile
      5
                              807
                                           1656.0
                                                       128.0
[61]: maxTile(df_5e3)
[61]:
         episode
                   episode_steps
                                   highest_score
                                                    max_tile
      1
                2
                              719
                                           1156.0
                                                       128.0
      3
                4
                             1054
                                           1432.0
                                                       128.0
      5
                6
                              807
                                           1656.0
                                                       128.0
      6
                7
                              565
                                           1364.0
                                                       128.0
```

1.2 First case: 5000 steps (Testing)

```
[62]: ## Testing
      df_5e3_test = openTestCsv(str(num_steps_5e3))
      df_5e3_test
            episode
[62]:
                     episode_steps highest_score
                                                      max_tile
      0
                  0
                                684
                                               660.0
                                                             64
      1
                  1
                               2598
                                             1304.0
                                                            128
      2
                  2
                                               636.0
                                                             64
                               1151
      3
                  3
                                                            128
                               5321
                                             1464.0
                  4
      4
                               2652
                                             1336.0
                                                            128
      . .
                                                             64
      495
                495
                               2230
                                              820.0
      496
                496
                               4471
                                             1312.0
                                                            128
      497
                497
                               3070
                                             1080.0
                                                            128
      498
                498
                               4287
                                             1556.0
                                                            128
      499
                499
                                                            128
                               4056
                                             1324.0
      [500 rows x 4 columns]
     highestScore(df_5e3_test)
[63]:
[63]:
                     episode_steps highest_score max_tile
            episode
      329
                329
                                             3144.0
                               7721
                                                            256
      maxTile(df_5e3_test)
[64]:
            episode
                     episode_steps highest_score
                                                      max_tile
      72
                 72
                               2391
                                             1916.0
                                                            256
                               4927
      81
                 81
                                             1984.0
                                                            256
      82
                 82
                               6045
                                             2280.0
                                                            256
      86
                 86
                               5633
                                             2472.0
                                                            256
      97
                 97
                               4076
                                             2352.0
                                                            256
      107
                107
                               2711
                                             2092.0
                                                           256
      108
                108
                               3898
                                             2476.0
                                                            256
      112
                112
                               3555
                                             2004.0
                                                            256
      150
                               4033
                150
                                             2804.0
                                                            256
      153
                153
                               5633
                                             2240.0
                                                           256
      157
                157
                               5153
                                             2528.0
                                                            256
      184
                184
                               5627
                                             2004.0
                                                           256
      186
                186
                               5753
                                             2296.0
                                                            256
      210
                210
                               3428
                                             2812.0
                                                            256
                233
                                                            256
      233
                               6261
                                             2600.0
      244
                244
                               4165
                                             2200.0
                                                            256
      258
                258
                               6604
                                             2304.0
                                                            256
```

318	318	3450	2172.0	256
329	329	7721	3144.0	256
332	332	6130	2480.0	256
344	344	5401	2432.0	256
353	353	3800	2000.0	256
368	368	3454	2492.0	256
411	411	7654	2056.0	256
418	418	7099	2356.0	256
424	424	5556	2284.0	256
425	425	4414	2388.0	256
436	436	3493	2936.0	256
459	459	3599	2228.0	256

1.3 Second case: 50.000 steps (Training)

```
[65]: ##### NB_STEPS_TRAINING = int(5e4) #####

num_steps_5e4 = int(5e4)
df_5e4 = openCsv(str(num_steps_5e4))
df_5e4.head(10)
```

```
[65]:
         episode episode_steps highest_score max_tile
                              128
                                           348.0
                                                       32.0
      0
      1
                2
                              719
                                           1156.0
                                                      128.0
      2
                3
                              386
                                           512.0
                                                       64.0
      3
                4
                             1054
                                           1432.0
                                                      128.0
      4
                5
                                                       64.0
                              571
                                           760.0
      5
                6
                              807
                                           1656.0
                                                      128.0
                7
      6
                              565
                                           1364.0
                                                      128.0
      7
                8
                              607
                                           880.0
                                                       64.0
      8
                9
                              522
                                           1964.0
                                                      128.0
              10
                              402
                                           1388.0
                                                      128.0
```

```
[66]: totEpisodes(df_5e4)
```

[66]: 155

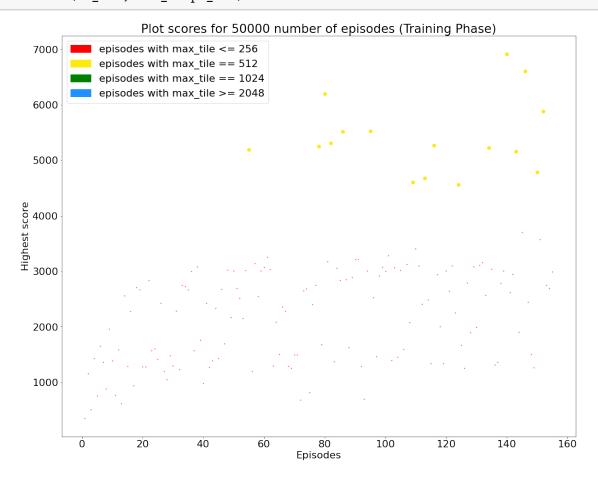
```
[67]: highestScore(df_5e4)
```

[67]: episode episode_steps highest_score max_tile
139 140 599 6916.0 512.0

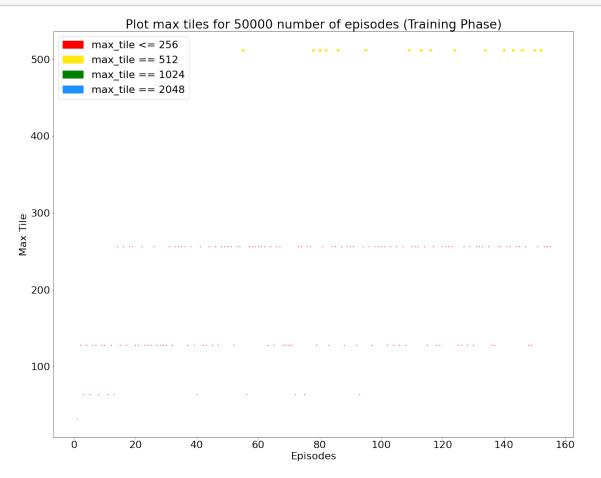
```
[68]: maxTile(df_5e4)
```

[68]:		episode	episode_steps	highest_score	${\tt max_tile}$
	54	55	426	5196.0	512.0
	77	78	408	5252.0	512.0
	79	80	551	6196.0	512.0
	81	82	501	5312.0	512.0
	85	86	522	5516.0	512.0
	94	95	416	5528.0	512.0
	108	109	388	4600.0	512.0
	112	113	416	4676.0	512.0
	115	116	513	5268.0	512.0
	123	124	300	4564.0	512.0
	133	134	508	5228.0	512.0
	139	140	599	6916.0	512.0
	142	143	414	5160.0	512.0
	145	146	649	6604.0	512.0
	149	150	368	4788.0	512.0
	151	152	428	5880.0	512.0

[69]: plotScores(df_5e4, num_steps_5e4)



[70]: plotMaxTiles(df_5e4, num_steps_5e4)



1.4 Second case: 50.000 steps (Testing)

```
[71]: ## Testing

df_5e4_test = openTestCsv(str(num_steps_5e4))
 df_5e4_test
```

```
[71]:
            episode
                      episode_steps highest_score
                                                        max_tile
      0
                   0
                                1040
                                               2764.0
                                                             256
      1
                   1
                                1168
                                               4484.0
                                                             512
      2
                   2
                                 766
                                               2300.0
                                                             256
      3
                   3
                                 526
                                               2920.0
                                                             256
                   4
      4
                                1320
                                               2304.0
                                                             256
      . .
                                2309
                                               2976.0
                                                             256
      495
                495
      496
                                               2788.0
                                                             256
                496
                                 322
```

497	497	1106	2764.0	256
498	498	1401	2560.0	256
499	499	692	5576.0	512

[500 rows x 4 columns]

[72]: highestScore(df_5e4_test)

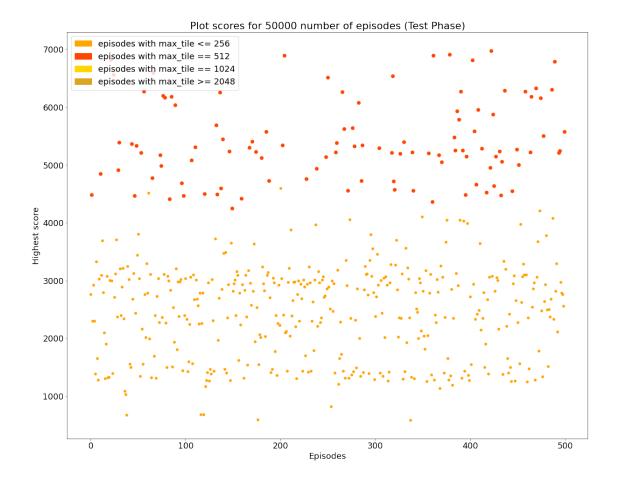
[72]: episode episode_steps highest_score max_tile 422 422 2083 6980.0 512

[73]: maxTile(df_5e4_test)

[73]:	episode	episode_steps	highest_score	max_tile
1	1	1168	4484.0	512
10	10	646	4848.0	512
21	21	1422	6824.0	512
24	24	675	6568.0	512
29	29	1017	4916.0	512
	•••	•••	•••	•••
486	486	1218	6304.0	512
489	489	2205	6788.0	512
493	493	994	5212.0	512
494	494	1574	5244.0	512
499	499	692	5576.0	512

[107 rows x 4 columns]

[74]: plotScoresTestPhase(df_5e4_test, num_steps_5e4)



1.5 Third case: 500.000 steps (Training)

```
[75]: ##### NB_STEPS_TRAINING = int(5e5) #####

num_steps_5e5 = int(5e5)
df_5e5 = openCsv(str(num_steps_5e5))
df_5e5.head(10)
```

```
[75]:
          episode
                    episode_steps
                                    highest_score
                                                     max_tile
      0
                               570
                                                          32.0
                1
                                              432.0
                2
                               686
                                                          64.0
      1
                                              656.0
                3
      2
                              1085
                                             1260.0
                                                         128.0
      3
                4
                               776
                                              860.0
                                                         128.0
      4
                5
                               682
                                            1096.0
                                                          64.0
      5
                6
                               955
                                             1480.0
                                                         128.0
      6
                7
                               320
                                              544.0
                                                          64.0
      7
                8
                               609
                                            1272.0
                                                          64.0
      8
                9
                               431
                                            1348.0
                                                         128.0
```

9 10 436 672.0 64.0

[76]: totEpisodes(df_5e5)

[76]: 1118

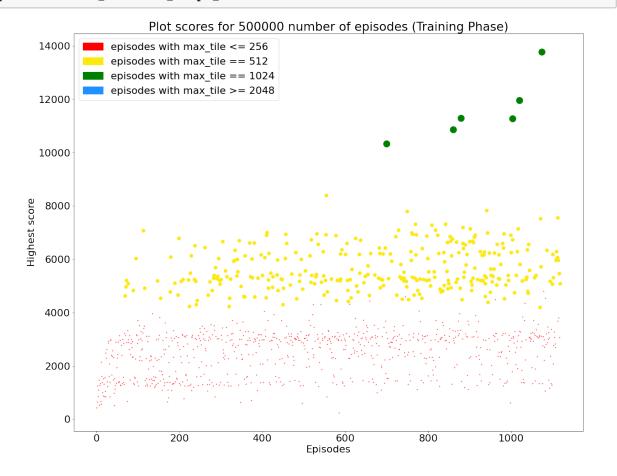
[77]: highestScore(df_5e5)

[77]: episode episode_steps highest_score max_tile 1073 1074 852 13784.0 1024.0

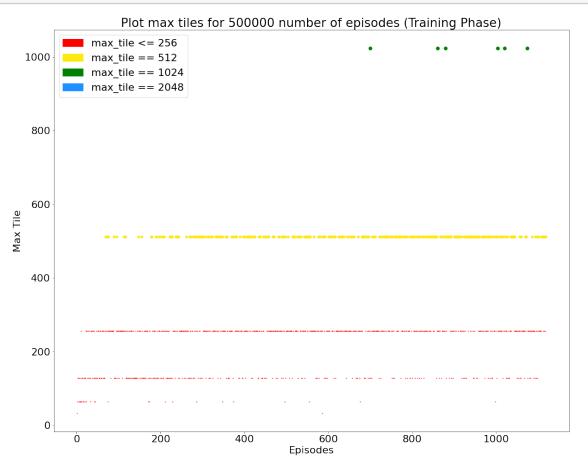
[78]: maxTile(df_5e5)

[78]: episode episode_steps highest_score max_tile 699 700 682 10336.0 1024.0 859 860 703 1024.0 10860.0 878 879 784 11288.0 1024.0 1003 1004 697 11268.0 1024.0 1019 1020 800 11960.0 1024.0 1073 1074 852 13784.0 1024.0

[79]: plotScores(df_5e5, num_steps_5e5)



[80]: plotMaxTiles(df_5e5, num_steps_5e5)



1.6 Third case: 500.000 steps (Testing)

```
[81]: ## Testing
      df_5e5_test = openTestCsv(str(num_steps_5e5))
      df_5e5_test
[81]:
           episode
                     episode_steps highest_score
                                                     max_tile
      0
                  0
                                399
                                             3080.0
                                                           256
      1
                  1
                                755
                                             5356.0
                                                           512
      2
                  2
                               1854
                                             6992.0
                                                           512
                  3
      3
                                414
                                             5652.0
                                                           512
                  4
      4
                                             5380.0
                                                           512
                               1268
```

495	495	898	5468.0	512
496	496	1047	5404.0	512
497	497	1230	4448.0	256
498	498	993	10160.0	1024
499	499	791	5244.0	512

[500 rows x 4 columns]

[82]: highestScore(df_5e5_test)

[82]: episode episode_steps highest_score max_tile 245 245 2873 14900.0 1024

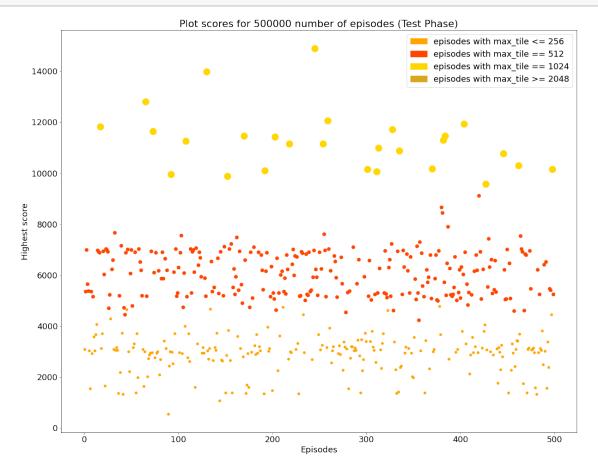
[83]: maxTile(df_5e5_test)

1.7 Third case: 500.000 steps (Testing)

```
[84]: ## Testing
      df_5e5_test = openTestCsv(str(num_steps_5e5))
      df_5e5_test
            episode
[84]:
                     episode_steps highest_score
                                                      max_tile
      0
                  0
                                399
                                              3080.0
                                                            256
      1
                  1
                                755
                                              5356.0
                                                            512
      2
                  2
                                              6992.0
                               1854
                                                            512
      3
                  3
                                414
                                              5652.0
                                                            512
                  4
      4
                               1268
                                              5380.0
                                                            512
      . .
      495
                495
                                898
                                             5468.0
                                                            512
      496
                496
                                              5404.0
                                                            512
                               1047
      497
                                                            256
                497
                               1230
                                              4448.0
      498
                                                           1024
                498
                                993
                                            10160.0
      499
                499
                                                            512
                                791
                                             5244.0
      [500 rows x 4 columns]
     highestScore(df_5e5_test)
[85]:
[85]:
                     episode_steps highest_score
            episode
                                                      max_tile
      245
                245
                                            14900.0
                                                           1024
                               2873
      maxTile(df_5e5_test)
[86]:
[86]:
            episode
                     episode_steps highest_score
                                                      max_tile
      17
                 17
                               2320
                                            11824.0
                                                           1024
                               1968
      65
                 65
                                            12796.0
                                                           1024
      73
                 73
                               1368
                                            11640.0
                                                           1024
      92
                 92
                                745
                                              9948.0
                                                           1024
      108
                108
                               2859
                                            11260.0
                                                           1024
      130
                               2878
                                            13988.0
                                                           1024
                130
      152
                152
                               1761
                                              9888.0
                                                           1024
      170
                170
                               2161
                                            11460.0
                                                           1024
      192
                192
                                977
                                            10100.0
                                                           1024
      203
                203
                                809
                                            11432.0
                                                           1024
      218
                218
                               1098
                                            11148.0
                                                           1024
      245
                245
                               2873
                                            14900.0
                                                           1024
      254
                254
                               1775
                                            11144.0
                                                           1024
      259
                259
                               1143
                                            12056.0
                                                           1024
      301
                301
                               1001
                                            10148.0
                                                           1024
      311
                311
                                904
                                            10056.0
                                                           1024
      313
                313
                               1551
                                            10992.0
                                                           1024
```

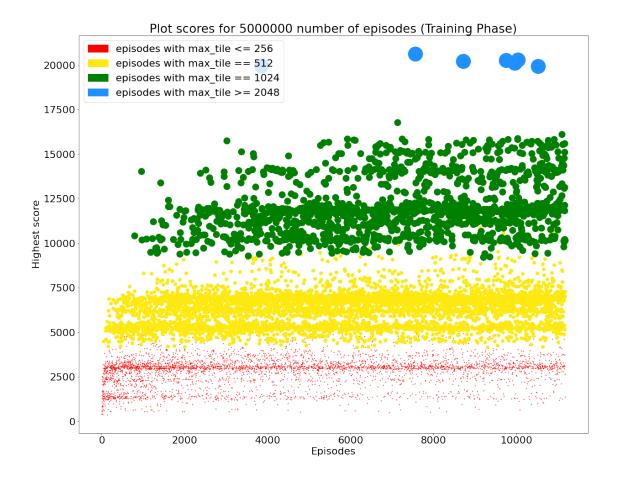
328	328	1710	11716.0	1024
335	335	2307	10884.0	1024
370	370	2046	10176.0	1024
382	382	2559	11292.0	1024
384	384	3038	11456.0	1024
404	404	2311	11928.0	1024
427	427	1172	9576.0	1024
446	446	3394	10776.0	1024
462	462	570	10296.0	1024
498	498	993	10160.0	1024

[87]: plotScoresTestPhase(df_5e5_test, num_steps_5e5)

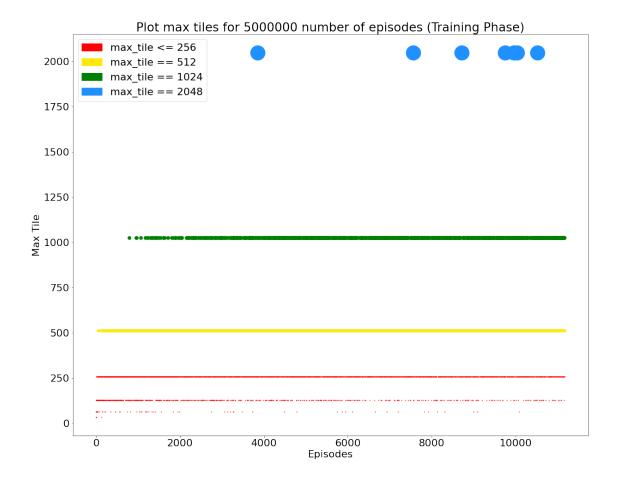


1.8 Fourth case: 5.000.000 steps (Training)

```
[88]: ##### NB_STEPS_TRAINING = int(5e6) #####
      num_steps_5e6 = int(5e6)
      df_5e6 = openCsv(str(num_steps_5e6))
      df_5e6.head(10)
                  episode_steps
[88]:
         episode
                                  highest_score max_tile
      0
                             570
                                           432.0
                                                       32.0
               1
               2
                             686
      1
                                           656.0
                                                       64.0
      2
               3
                            1085
                                          1260.0
                                                      128.0
      3
               4
                             776
                                           860.0
                                                      128.0
               5
      4
                             682
                                          1096.0
                                                      64.0
      5
               6
                             955
                                          1480.0
                                                     128.0
      6
               7
                             320
                                           544.0
                                                      64.0
      7
               8
                                                      64.0
                             286
                                           588.0
      8
               9
                                                      64.0
                             285
                                           792.0
      9
              10
                             405
                                                      128.0
                                          1716.0
[89]: totEpisodes(df_5e6)
[89]: 11168
[90]: highestScore(df_5e6)
[90]:
            episode
                      episode_steps highest_score
                                                     max_tile
      7561
               7562
                               1162
                                            20640.0
                                                        2048.0
[91]: maxTile(df_5e6)
             episode
[91]:
                      episode_steps highest_score max_tile
                3848
                                                         2048.0
      3847
                                 915
                                             19956.0
      7561
                7562
                                1162
                                             20640.0
                                                         2048.0
      8710
                8711
                                1028
                                             20212.0
                                                         2048.0
      9748
                9749
                                1095
                                             20272.0
                                                         2048.0
      9960
                                                         2048.0
                9961
                                1081
                                             20104.0
      10036
               10037
                                                         2048.0
                                1179
                                             20288.0
      10516
               10517
                                1000
                                             19940.0
                                                         2048.0
[92]: plotScores(df_5e6, num_steps_5e6)
```



[93]: plotMaxTiles(df_5e6, num_steps_5e6)



1.9 Fourth case: 5.000.000 steps (Testing)

[94]:		episode	episode_steps	nighest_score	max_tire
	0	0	196	2632.0	256
	1	1	289	2948.0	256
	2	2	1441	7032.0	512
	3	3	1041	3840.0	256
	4	4	327	4912.0	512
			•••	•••	•••
	495	495	686	7000.0	512
	496	496	193	2428.0	256
	497	497	530	3180.0	256
	498	498	402	6276.0	512

499 499 1354 6860.0 512

[500 rows x 4 columns]

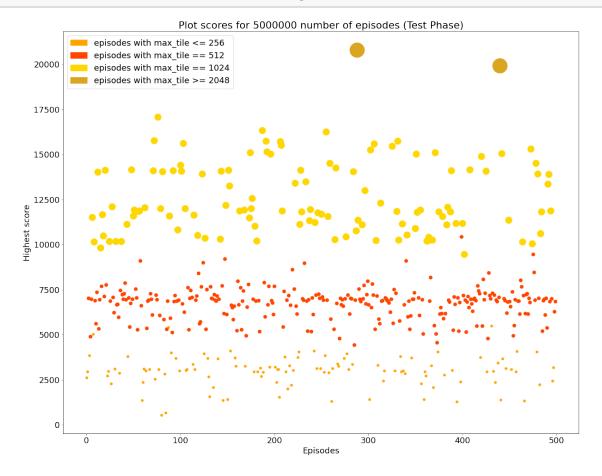
[95]: highestScore(df_5e6_test)

[95]: episode episode_steps highest_score max_tile
288 288 3077 20808.0 2048

[96]: maxTile(df_5e6_test)

[96]: episode episode_steps highest_score max_tile 288 288 3077 20808.0 2048 440 440 2680 19936.0 2048

[97]: plotScoresTestPhase(df_5e6_test, num_steps_5e6)

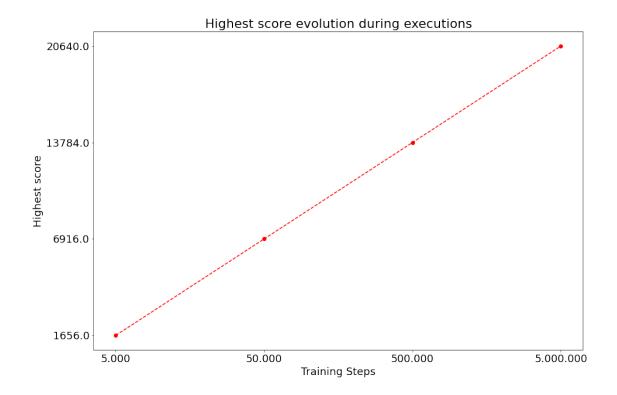


1.10 Fifth case: 10.000.000 steps

```
[98]: # DA VEDERE
```

2 Highest score evolution during executions

```
[99]: highest_score_df3 = df_5e3['highest_score'].max()
      highest_score_df4 = df_5e4['highest_score'].max()
      highest_score_df5 = df_5e5['highest_score'].max()
      highest_score_df6 = df_5e6['highest_score'].max()
      data = np.array([
          ["5.000", highest_score_df3],
          ["50.000", highest_score_df4],
          ["500.000", highest_score_df5],
          ["5.000.000", highest_score_df6],
      ])
      font = {'family' : 'normal',
              'size' : 18}
      plt.rc('font', **font)
      x, y = data.T
      plt.figure(figsize=(15,10))
      plt.title('Highest score evolution during executions')
      plt.xlabel('Training Steps')
      plt.ylabel('Highest score')
      plt.plot(x,y,'r--')
      plt.scatter(x,y,c='red')
      plt.show()
```



3 Scores evolution comparisons between different training steps

```
[100]: def get_scores_evolution(df):
           evolution = []
           evolution.append(int(df['highest_score'].min())) # lowest score
           evolution.append(int(df['highest_score'].mean())) # mean of the scores
           evolution.append(int(df['highest_score'].max())) # Highest score
           return evolution
       scores_evolution_df_5e3 = get_scores_evolution(df_5e3)
       scores_evolution_df_5e4 = get_scores_evolution(df_5e4)
       scores_evolution_df_5e5 = get_scores_evolution(df_5e5)
       scores_evolution_df_5e6 = get_scores_evolution(df_5e6)
       font = {'family' : 'normal',
               'size' : 18}
       plt.rc('font', **font)
       plt.figure(figsize=(15,10))
       plt.title('Scores evolution comparisons between different training steps')
       plt.ylabel('Scores')
       x = ["lowest_score", "mean_scores", "highest_score"]
```

```
plt.plot(x,scores_evolution_df_5e3, 'r--', color="red")
plt.scatter(x,scores_evolution_df_5e3, color="red")

plt.plot(x,scores_evolution_df_5e4, 'r--', color="green")
plt.scatter(x,scores_evolution_df_5e4, color="green")

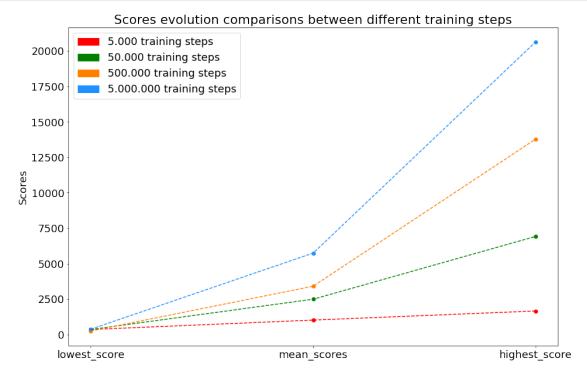
plt.plot(x,scores_evolution_df_5e5, 'r--', color="#ff8000")
plt.scatter(x,scores_evolution_df_5e5, color="#ff8000")

plt.plot(x,scores_evolution_df_5e6, 'r--', color="#ff8000")

plt.plot(x,scores_evolution_df_5e6, 'r--', color="#1E90FF")

plt.scatter(x,scores_evolution_df_5e6, color="#1E90FF")

red_patch = mpatches.Patch(color='red', label='5.000 training steps')
green_patch = mpatches.Patch(color='green', label='50.000 training steps')
orange_patch = mpatches.Patch(color='#ff8000', label='500.000 training steps')
blue_patch = mpatches.Patch(color='#1E90FF', label='5.000.000 training steps')
plt.legend(handles=[red_patch, green_patch,orange_patch,blue_patch])
plt.show()
```



[]: