

# final\_report\_stats

December 13, 2019

## 1 ai-chess-agent statistics

```
[1]: import numpy as np
import pandas as pd
import csv
import os
import matplotlib.pyplot as plt
```

```
[2]: def get_csv_paths(dir):
    files = dict()
    for (dirpath, dirnames, filenames) in os.walk(dir):
        for file in filenames:
            if file.endswith(".csv"):
                files[file] = os.path.join(dirpath, file)
    file_list = []
    for item in sorted(files.keys()):
        file_list.append([files[item], item.split(".")[0]])

    return file_list
```

```
[3]: f_list = get_csv_paths("../src/driver_notebooks/results/")
COLUMNS = ['round_num', 'iterations', 'depth', 'white_agent', 'black_agent',
            'white_victory', 'winner', 'moves_played', 'remaining_w_pieces',
            'remaining_b_pieces', 'remaining_tot_pieces']
```

```
[4]: df_from_each_file = (pd.read_csv(f[0], names=COLUMNS, header=0) for f in f_list)
```

```
[5]: df = pd.concat(df_from_each_file, ignore_index=True)
```

### 1.0.1 Total number of games played

```
[6]: games = df['round_num'].count()
games
```

```
[6]: 340
```

```
[7]: white_checkmate_df = df.apply(lambda x: True if x['winner'] == 'checkmate:␣
    ↪White wins!' else False , axis=1)
white_checkmate_num = len(white_checkmate_df[white_checkmate_df == True].index)

[8]: black_checkmate_df = df.apply(lambda x: True if x['winner'] == 'checkmate:␣
    ↪Black wins!' else False , axis=1)
black_checkmate_num = len(black_checkmate_df[black_checkmate_df == True].index)

[9]: draw_stalemate_df = df.apply(lambda x: True if x['winner'] == "draw: stalemate"␣
    ↪else False , axis=1)
draw_stalemate_num = len(draw_stalemate_df[draw_stalemate_df == True].index)

[10]: draw_fivefold_df = df.apply(lambda x: True if x['winner'] == "draw: 5-fold␣
    ↪repetition" else False , axis=1)
draw_fivefold_num = len(draw_fivefold_df[draw_fivefold_df == True].index)

[11]: draw_insufficient_material_df = df.apply(lambda x: True if x['winner'] == "draw:
    ↪insufficient material" else False , axis=1)
draw_insufficient_material_num =␣
    ↪len(draw_insufficient_material_df[draw_insufficient_material_df == True].
    ↪index)

[12]: draw_claim_df = df.apply(lambda x: True if x['winner'] == "draw: claim" else␣
    ↪False , axis=1)
draw_claim_num = len(draw_claim_df[draw_claim_df == True].index)
```

### 1.0.2 Overall results

```
[13]: winner_df = pd.DataFrame([(white_checkmate_num, black_checkmate_num,␣
    ↪draw_stalemate_num, draw_fivefold_num, draw_insufficient_material_num,␣
    ↪draw_claim_num)],
columns = ['checkmate: White', 'checkmate: Black', 'draw: stalemate', 'draw:␣
    ↪5-fold repetition', 'draw: insufficient material', 'draw: claim'])
winner_df.style.hide_index()
```

```
[13]: <pandas.io.formats.style.Styler at 0x7fa39890d2e8>
```

### 1.0.3 Overall Percentages

```
[14]: winnings = df['winner']
counts = winnings.value_counts()
percent = winnings.value_counts(normalize=True)
percent100 = winnings.value_counts(normalize=True).mul(100).round(1).
    ↪astype(str) + '%'
win_df = pd.DataFrame({'counts': counts, 'percent': percent, 'percent 100':␣
    ↪percent100 })
```

```
win_df
```

```
[14]:
```

	counts	percent	percent 100
checkmate: Black wins!	172	0.505882	50.6%
checkmate: White wins!	106	0.311765	31.2%
draw: claim	38	0.111765	11.2%
draw: stalemate	22	0.064706	6.5%
draw: insufficient material	2	0.005882	0.6%

#### 1.0.4 Top 10 games, ordered by moves played ascending

```
[15]: df.sort_values(by=['moves_played'], inplace=False, ascending=True).head(10)
```

```
[15]:
```

	round_num	iterations	depth	white_agent	black_agent	\
323	4	10	NaN	random_agent	stockfish	
146	7	10	1.0	improved_minimax_agent	random_agent	
334	5	10	NaN	improved_random_agent	stockfish	
12	3	10	2.0	advanced_minimax_agent	random_agent	
144	5	10	1.0	improved_minimax_agent	random_agent	
198	9	10	2.0	improved_minimax_agent	random_agent	
158	9	10	2.0	improved_minimax_agent	random_agent	
191	2	10	2.0	improved_minimax_agent	random_agent	
320	1	10	NaN	random_agent	stockfish	
14	5	10	2.0	advanced_minimax_agent	random_agent	

  

	white_victory	winner	moves_played	remaining_w_pieces	\
323	False	checkmate: Black wins!	6	16	
146	True	checkmate: White wins!	7	16	
334	False	checkmate: Black wins!	8	15	
12	True	checkmate: White wins!	11	16	
144	True	checkmate: White wins!	11	16	
198	True	checkmate: White wins!	13	16	
158	True	checkmate: White wins!	13	16	
191	True	checkmate: White wins!	13	16	
320	False	checkmate: Black wins!	14	14	
14	True	checkmate: White wins!	15	16	

  

	remaining_b_pieces	remaining_tot_pieces
323	16	32
146	16	32
334	14	29
12	16	32
144	13	29
198	15	31
158	15	31
191	15	31
320	16	30

### 1.0.5 Top 10 games where the white agent wins, ordered by moves played ascending

```
[16]: df.loc[df['winner'] == 'checkmate: White wins!'].
      ↪sort_values(by=['moves_played'], inplace=False, ascending=True).head(10)
```

```
[16]:
```

	round_num	iterations	depth	white_agent	black_agent	\
146	7	10	1.0	improved_minimax_agent	random_agent	
144	5	10	1.0	improved_minimax_agent	random_agent	
12	3	10	2.0	advanced_minimax_agent	random_agent	
158	9	10	2.0	improved_minimax_agent	random_agent	
191	2	10	2.0	improved_minimax_agent	random_agent	
198	9	10	2.0	improved_minimax_agent	random_agent	
14	5	10	2.0	advanced_minimax_agent	random_agent	
107	8	10	NaN	advanced_agent	random_agent	
1	2	10	1.0	advanced_minimax_agent	random_agent	
3	4	10	1.0	advanced_minimax_agent	random_agent	

  

	white_victory	winner	moves_played	remaining_w_pieces	\
146	True	checkmate: White wins!	7	16	
144	True	checkmate: White wins!	11	16	
12	True	checkmate: White wins!	11	16	
158	True	checkmate: White wins!	13	16	
191	True	checkmate: White wins!	13	16	
198	True	checkmate: White wins!	13	16	
14	True	checkmate: White wins!	15	16	
107	True	checkmate: White wins!	17	15	
1	True	checkmate: White wins!	19	16	
3	True	checkmate: White wins!	19	16	

  

	remaining_b_pieces	remaining_tot_pieces
146	16	32
144	13	29
12	16	32
158	15	31
191	15	31
198	15	31
14	12	28
107	12	27
1	15	31
3	12	28

### 1.0.6 Games where the white agent wins and Oppnent Agent is Stockfish Engine, ordered by moves played ascending

```
[17]: df[(df['winner'] == 'checkmate: White wins!') & (df['black_agent'] == 'stockfish')]
```

```
[17]: Empty DataFrame
Columns: [round_num, iterations, depth, white_agent, black_agent, white_victory, winner, moves_played, remaining_w_pieces, remaining_b_pieces, remaining_tot_pieces]
Index: []
```

### 1.0.7 Top 10 games with the fewest remaining black pieces, ordered by pieces remaining ascending

```
[18]: df.sort_values(by=['remaining_b_pieces'], inplace=False, ascending=True).head(10)
```

```
[18]:
```

	round_num	iterations	depth	white_agent \
109	10	10	NaN	advanced_agent
315	6	10	NaN	improved_random_agent
312	3	10	NaN	improved_random_agent
86	7	10	NaN	naive_agent
87	8	10	NaN	naive_agent
268	9	10	1.0	naive_alpha-beta_minimax_agent
56	7	10	2.0	advanced_alpha-beta_minimax_agent
89	10	10	NaN	naive_agent
54	5	10	2.0	advanced_alpha-beta_minimax_agent
47	8	10	1.0	advanced_alpha-beta_minimax_agent

  

	black_agent	white_victory	winner	moves_played \
109	random_agent	True	checkmate: White wins!	69
315	random_agent	False	draw: stalemate	101
312	random_agent	False	draw: stalemate	149
86	random_agent	False	draw: claim	121
87	random_agent	False	draw: claim	57
268	random_agent	False	draw: stalemate	129
56	random_agent	True	checkmate: White wins!	77
89	random_agent	False	draw: claim	115
54	random_agent	True	checkmate: White wins!	61
47	random_agent	False	draw: stalemate	59

  

	remaining_w_pieces	remaining_b_pieces	remaining_tot_pieces
109	13	1	14
315	13	1	14
312	11	1	12
86	12	1	13

87	13	1	14
268	15	1	16
56	11	1	12
89	11	1	12
54	13	1	14
47	15	1	16

### 1.0.8 Top 10 games with fewest remaining black pieces where white wins, ordered by black pieces remaining ascending

```
[19]: df[(df['winner'] == 'checkmate: White wins!')].
      ↪sort_values(by=['remaining_b_pieces'], inplace=False, ascending=True).
      ↪head(10)
```

```
[19]:
```

	round_num	iterations	depth	white_agent \
310	1	10	NaN	improved_random_agent
105	6	10	NaN	advanced_agent
104	5	10	NaN	advanced_agent
103	4	10	NaN	advanced_agent
102	3	10	NaN	advanced_agent
98	9	10	NaN	improved_agent
56	7	10	2.0	advanced_alpha-beta_minimax_agent
54	5	10	2.0	advanced_alpha-beta_minimax_agent
109	10	10	NaN	advanced_agent
148	9	10	1.0	improved_minimax_agent

  

	black_agent	white_victory	winner	moves_played \
310	random_agent	True	checkmate: White wins!	291
105	random_agent	True	checkmate: White wins!	61
104	random_agent	True	checkmate: White wins!	63
103	random_agent	True	checkmate: White wins!	67
102	random_agent	True	checkmate: White wins!	61
98	random_agent	True	checkmate: White wins!	67
56	random_agent	True	checkmate: White wins!	77
54	random_agent	True	checkmate: White wins!	61
109	random_agent	True	checkmate: White wins!	69
148	random_agent	True	checkmate: White wins!	125

  

	remaining_w_pieces	remaining_b_pieces	remaining_tot_pieces
310	9	1	10
105	14	1	15
104	12	1	13
103	15	1	16
102	15	1	16
98	12	1	13
56	11	1	12
54	13	1	14

109	13	1	14
148	12	1	13

### 1.0.9 Top 10 games with the fewest remaining white pieces, ordered by pieces remaining ascending

```
[20]: df.sort_values(by=['remaining_w_pieces'], inplace=False, ascending=True).
      ↪head(10)
```

```
[20]:
```

	round_num	iterations	depth	white_agent	\
301	2	10	NaN	random_agent	
306	7	10	NaN	random_agent	
309	10	10	NaN	random_agent	
303	4	10	NaN	random_agent	
76	7	10	2.0	advanced_alpha-beta_minimax_agent	
135	6	10	NaN	advanced_agent	
305	6	10	NaN	random_agent	
302	3	10	NaN	random_agent	
308	9	10	NaN	random_agent	
307	8	10	NaN	random_agent	

  

	black_agent	white_victory	winner	moves_played	\
301	random_agent	False	draw: stalemate	164	
306	random_agent	False	draw: insufficient material	416	
309	random_agent	False	draw: insufficient material	519	
303	random_agent	False	draw: stalemate	266	
76	stockfish	False	checkmate: Black wins!	56	
135	stockfish	False	checkmate: Black wins!	54	
305	random_agent	False	draw: claim	394	
302	random_agent	False	draw: claim	497	
308	random_agent	False	draw: claim	297	
307	random_agent	False	draw: claim	410	

  

	remaining_w_pieces	remaining_b_pieces	remaining_tot_pieces
301	1	7	8
306	1	2	3
309	1	2	3
303	1	6	7
76	2	13	15
135	2	11	13
305	2	2	4
302	2	1	3
308	2	3	5
307	2	3	5

### 1.0.10 Top 10 games with fewest remaining white pieces where black wins, ordered by white pieces remaining ascending

```
[21]: df[(df['winner'] == 'checkmate: Black wins!')].
      ↪sort_values(by=['remaining_w_pieces'], inplace=False, ascending=True).
      ↪head(10)
```

```
[21]:
```

	round_num	iterations	depth	white_agent \
135	6	10	NaN	advanced_agent
71	2	10	2.0	advanced_alpha-beta_minimax_agent
76	7	10	2.0	advanced_alpha-beta_minimax_agent
64	5	10	1.0	advanced_alpha-beta_minimax_agent
176	7	10	2.0	improved_minimax_agent
25	6	10	1.0	advanced_minimax_agent
200	1	10	1.0	improved_minimax_agent
206	7	10	1.0	improved_minimax_agent
132	3	10	NaN	advanced_agent
179	10	10	2.0	improved_minimax_agent

	black_agent	white_victory	winner	moves_played \
135	stockfish	False	checkmate: Black wins!	54
71	stockfish	False	checkmate: Black wins!	54
76	stockfish	False	checkmate: Black wins!	56
64	stockfish	False	checkmate: Black wins!	68
176	stockfish	False	checkmate: Black wins!	72
25	stockfish	False	checkmate: Black wins!	56
200	stockfish	False	checkmate: Black wins!	50
206	stockfish	False	checkmate: Black wins!	52
132	stockfish	False	checkmate: Black wins!	50
179	stockfish	False	checkmate: Black wins!	52

	remaining_w_pieces	remaining_b_pieces	remaining_tot_pieces
135	2	11	13
71	2	13	15
76	2	13	15
64	3	11	14
176	3	8	11
25	3	10	13
200	3	10	13
206	3	10	13
132	3	9	12
179	4	11	15