

Table evaluations

July 1, 2015

```
In [1]: cd /data/convchess/src/play/
```

```
/data/convchess/src/play
```

```
In [2]: import keras
import cPickle as pkl
import sys
import numpy as np
sys.setrecursionlimit(40000)
class CNN_evaluator:
    """docstring for CNN_evaluation"""
    def __init__(self, model_file):
        self.model = pkl.load(open(model_file, 'r'))

    def evaluate(self, im):
        return self.model.predict(np.asarray([im]), verbose=0)[0][0]

    def evaluate_batch(self, batch):
        #batch is much faster than one individually
        #print batch
        return self.model.predict(np.asarray(batch), verbose=0, batch_size=2048)[: ,0]
```

```
In [3]: evaluator = CNN_evaluator('regression_models/model_g07_bp_largedeeep.pkl')
```

Using gpu device 0: GeForce GTX 760

```
In [5]: from play4 import *
import sunfish
pos = sunfish.Position(sunfish.initial, 0, (True,True), (True,True), 0, 0)
bb = pos_board_to_bitboard(pos.board)
print bb
im = convert_bitboard_to_image(bb)
im = np.rollaxis(im, 2, 0)
print im
```

```
r n b q k b n r
p p p p p p p p
. . . . . . . .
. . . . . . . .
. . . . . . . .
. . . . . . . .
P P P P P P P P
R N B Q K B N R
[[[ 0.  0.  0.  0.  0.  0.  0.  0.]
  [-1. -1. -1. -1. -1. -1. -1. -1.]
```

```
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 1.  1.  1.  1.  1.  1.  1.  1.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]]
```

```
[[-1.  0.  0.  0.  0.  0.  0. -1.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 1.  0.  0.  0.  0.  0.  0.  1.]]
```

```
[[-1.  0.  0.  0.  0.  0. -1.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  1.  0.  0.  0.  0.  1.  0.]]
```

```
[[-1.  0.  0. -1.  0.  0. -1.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  1.  0.  0.  1.  0.  0.]]
```

```
[[-1.  0.  0.  0. -1.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  1.  0.  0.  0.  0.]]
```

```
[[-1.  0.  0.  0. -1.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  0.  0.  0.  0.]
[ 0.  0.  0.  0.  1.  0.  0.  0.]]
```

```
In [6]: print "Evaluation of the starting board %f"%evaluator.evaluate(im)
```

```
Out[6]: 0.0015796410152688622
```

```

In [7]: from example_moves.draw_board.draw import *

In [8]: cd example_moves/draw_board/

/data/convchess/src/util/draw_board

In [9]: def parseFEN(fen):
        """ Parses a string in Forsyth-Edwards Notation into a Position """
        board, color, castling, enpas, hclock, fclock = fen.split()
        board = re.sub('\d', (lambda m: '.'*int(m.group(0))), board)
        board = ' '*19+'\n' + '\n'.join(board.split('/')) + '\n'+ ' '*19
        wc = ('Q' in castling, 'K' in castling)
        bc = ('k' in castling, 'q' in castling)
        ep = sunfish.parse(enpas) if enpas != '-' else 0
        score = sum(sunfish.pst[p][i] for i,p in enumerate(board) if p.isupper())
        score -= sum(sunfish.pst[p.upper()][i] for i,p in enumerate(board) if p.islower())
        pos = sunfish.Position(board, score, wc, bc, ep, 0)
        return pos if color == 'w' else pos.rotate()

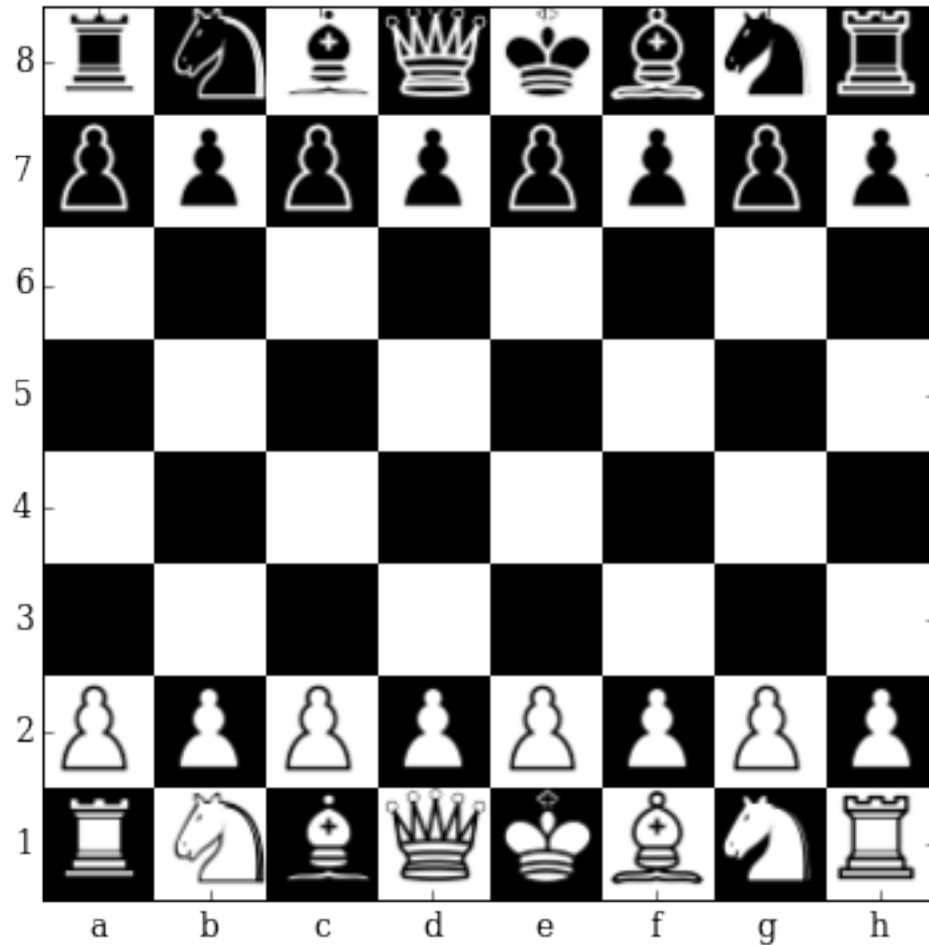
def posboard_to_im(pos):
    bb = pos_board_to_bitboard(pos)
    im = convert_bitboard_to_image(bb)
    im = np.rollaxis(im,2,0)
    return im

def fen_to_im(fen):
    pos = parseFEN(fen)
    return posboard_to_im(pos.board)

def image_board(pos):
    plt.xticks(range(8), string.lowercase)
    ax = plt.imshow(draw_board(posboard_to_im(pos)), cmap=cm.Greys_r)
    f = plt.gcf()
    f.set_size_inches(6,6)
    ax.set_extent([-0.5,7.5,0.5,8.5])
    plt.show()

In [10]: %matplotlib inline
import matplotlib.pyplot as plt
import matplotlib.cm as cm
plt.rc('text', usetex=False, antialiased=True, hinting='auto', dvipnghack=True)
plt.rc('font', family='serif', size=12)
image_board(pos.board)

```



```
In [11]: def top_bottom_moves(fen, top=5, bottom=5):
    pos = parseFEN(fen)
    bb = pos_board_to_bitboard(pos.board)
    image_board(pos.board)
    im = convert_bitboard_to_image(bb)
    im = np.rollaxis(im, 2, 0)
    print "\tCurrent evaluation: %f"%evaluator.evaluate(im)
    future_boards = []
    pos_children = []
    moves = list(pos.genMoves())
    print "Total %d moves possible"%len(moves)
    for move in moves:
        pos_child = pos.move(move).rotate()
        bb = pos_board_to_bitboard(pos_child.board)
        im = convert_bitboard_to_image(bb)
        im = np.rollaxis(im, 2, 0)
        future_boards.append(im)
        pos_children.append(pos_child.board)
    #future_boards = np.asarray(future_boards)
    values = evaluator.evaluate_batch(future_boards)
```

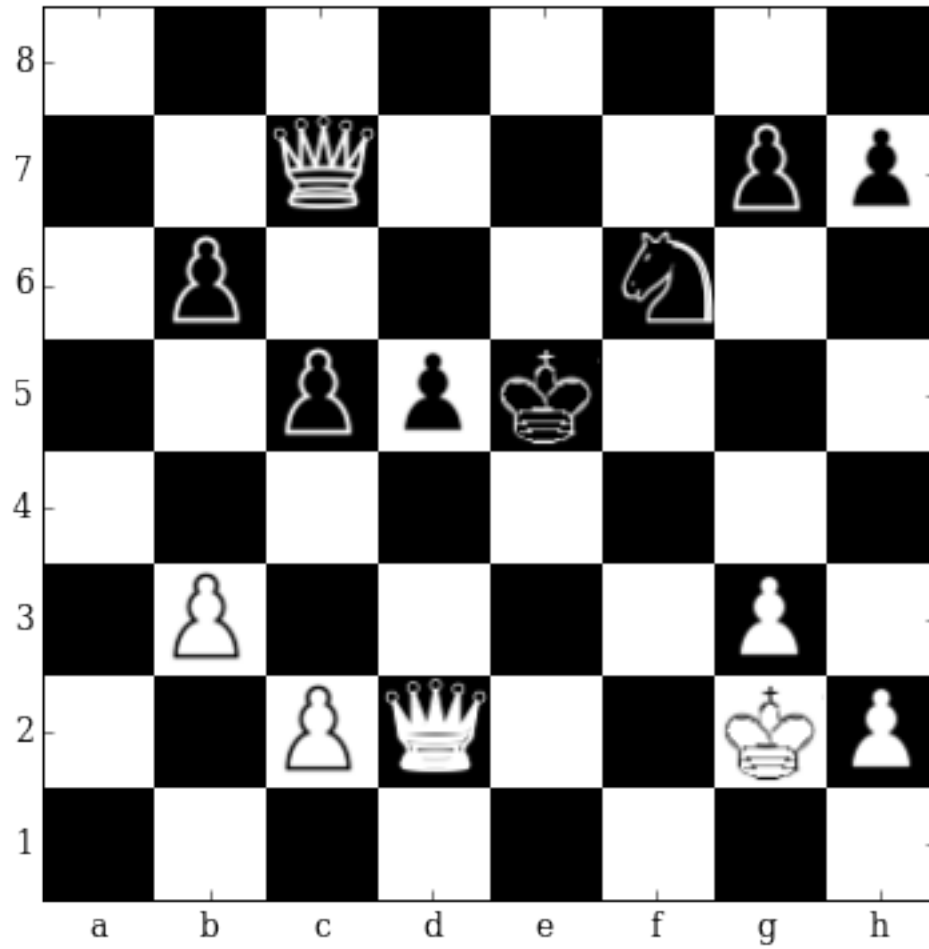
```

poschildren_vals = sorted(zip(pos_children , moves, values), key=operator.itemgetter(2), r
print "TOP 5 Moves"
for pos_child, move, value in poschildren_vals[0:top]:
    image_board(pos_child)
    print '\t',sunfish.render(move[0]) + sunfish.render(move[1]), value
print "WORST 5 Moves"
for pos_child, move, value in poschildren_vals[-bottom:]:
    image_board(pos_child)
    print '\t',sunfish.render(move[0]) + sunfish.render(move[1]), value

In [12]: '''
Piece          pawn          knight          bishop          rook          queen
Value          1            3            3            5            9
'''

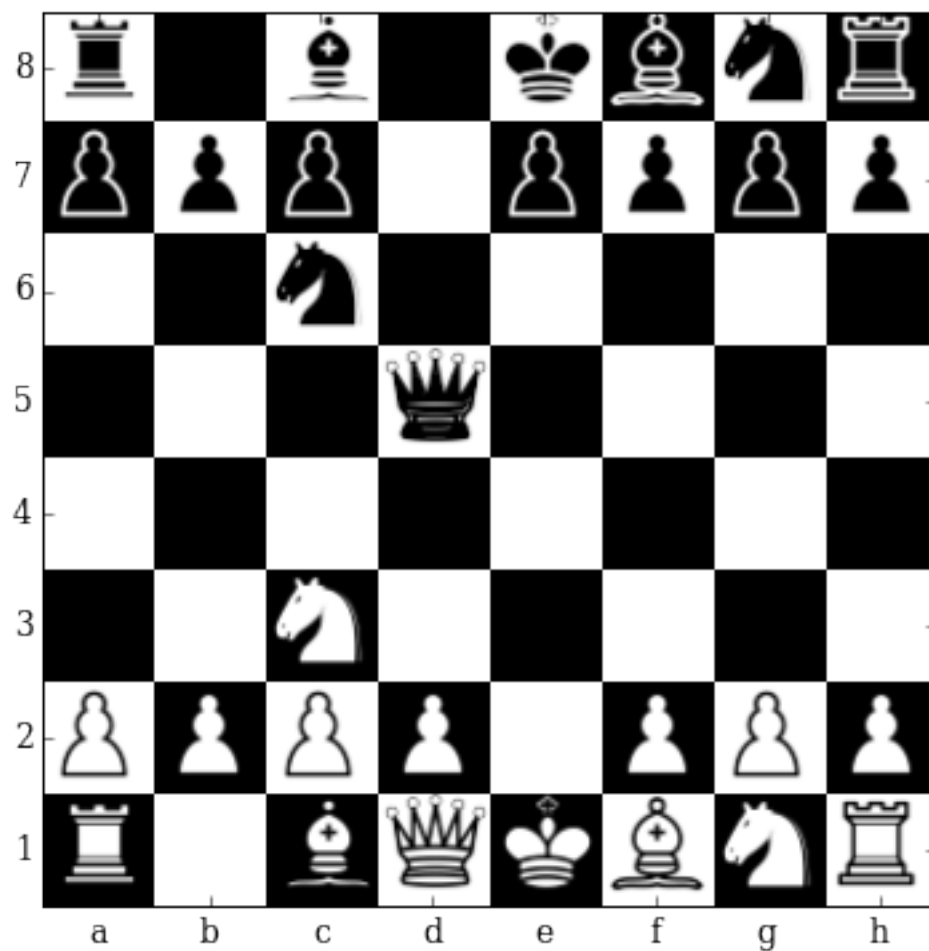
fen='8/2q3pp/1p3n2/2ppk3/8/1P4P1/2PQ2KP/8 w - - 0 0'
im = fen_to_im(fen)
pos = parseFEN(fen)
image_board(pos.board)
layer_scores=np.array([1,5,3,3,9,100])
def fen_to_tableval(fen):
    im = fen_to_im(fen)
    return im_to_tableval(im)
def im_to_tableval(im):
    #for a 6 layer representation
    return np.sum(np.sum(im,(1,2))*layer_scores)
print "Value of the table: %d"%im_to_tableval(im)

```



Value of the table: -4

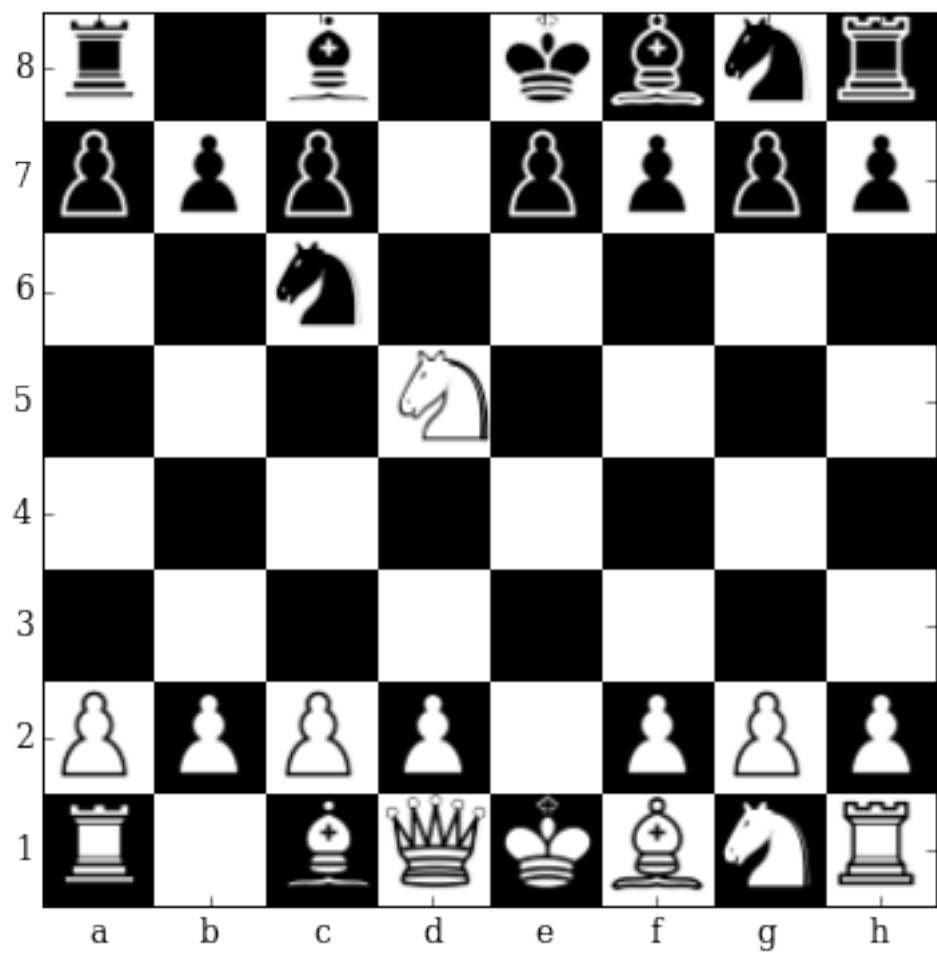
```
In [13]: '''
          Killing Queen with a knight
          (Works)
          '''
          top_bottom_moves('r1b1kbnr/ppp1pppp/2n5/3q4/8/2N5/PPPP1PPP/R1BQKBNR w KQkq - 0 4')
```



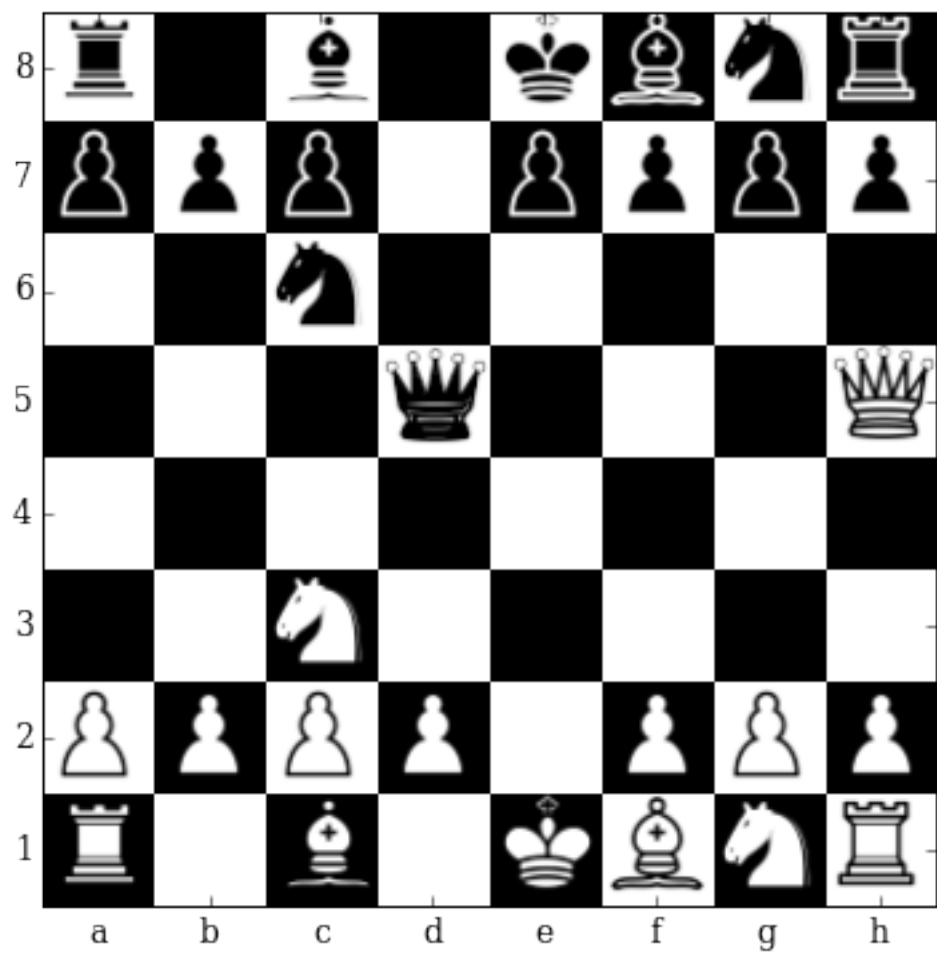
Current evaluation: 0.003406

Total 32 moves possible

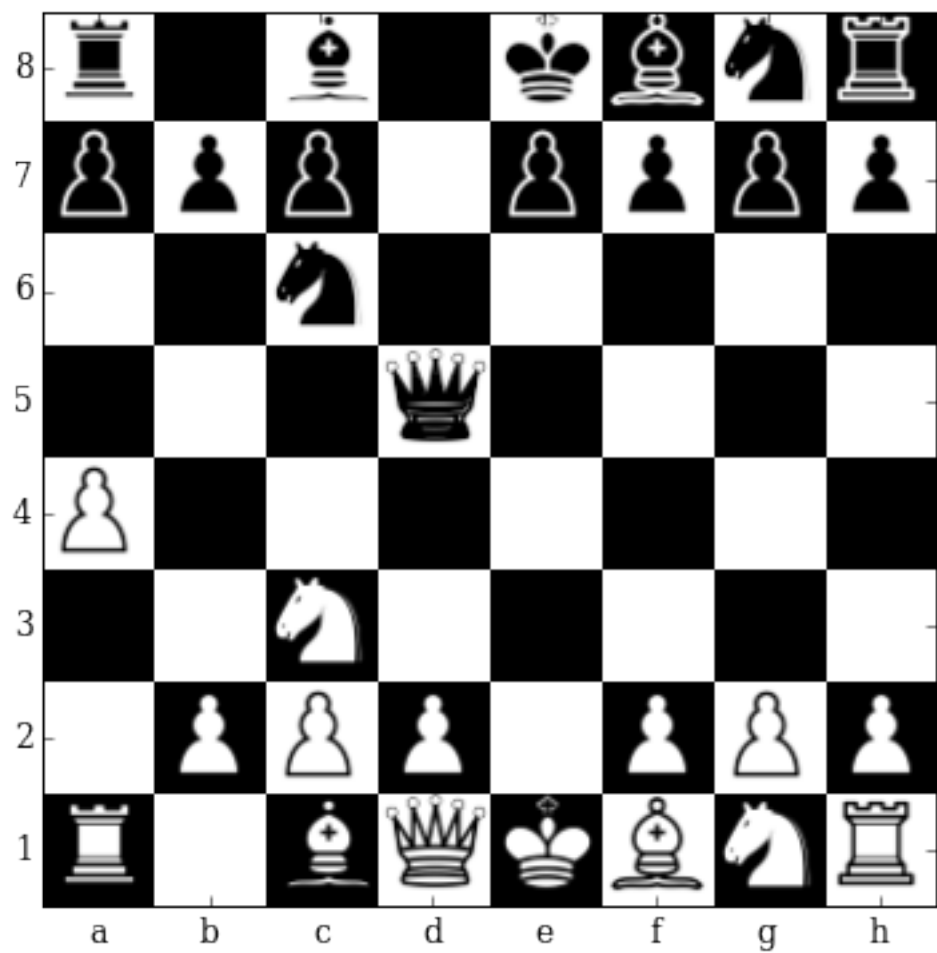
TOP 5 Moves



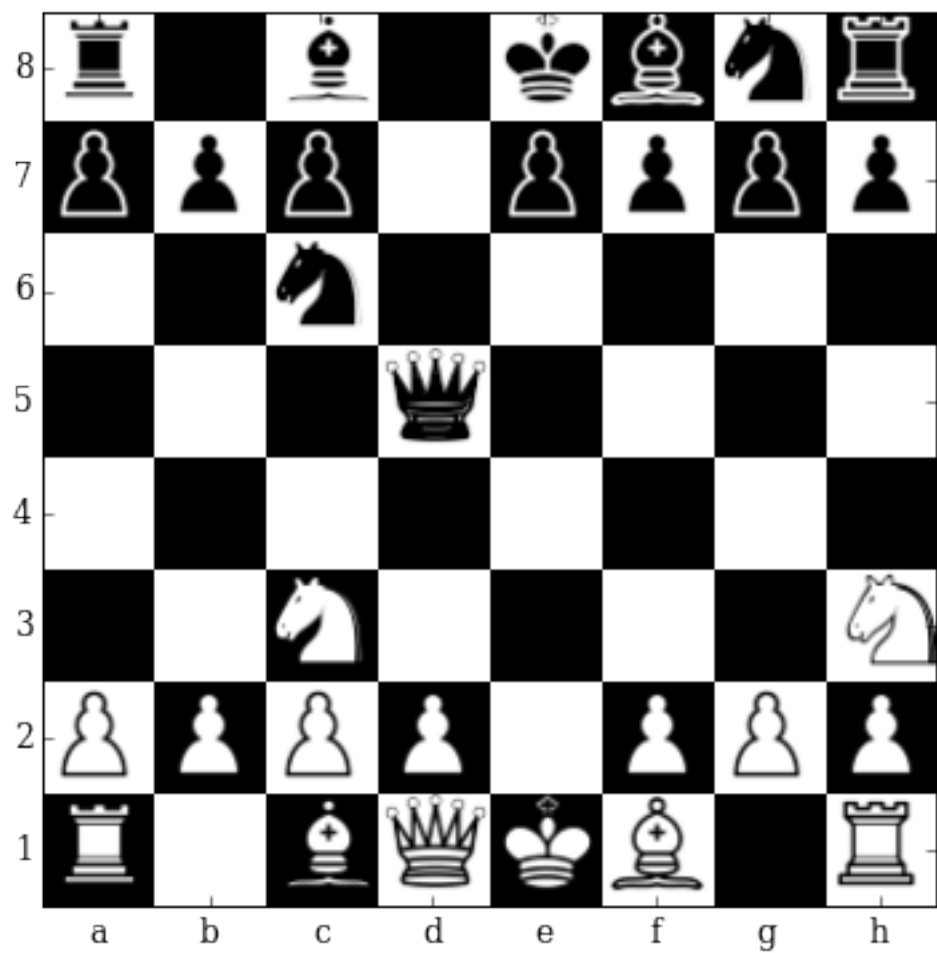
c3d5 0.0545512884855



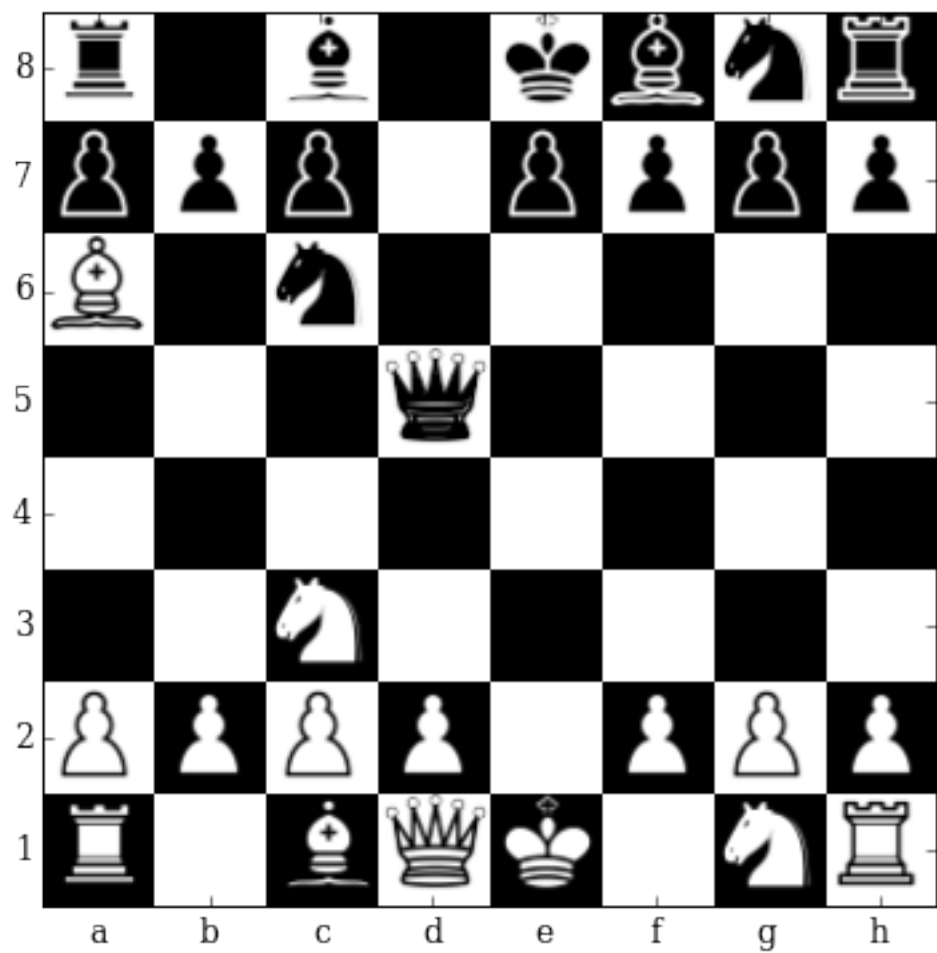
d1h5 0.0144034344703



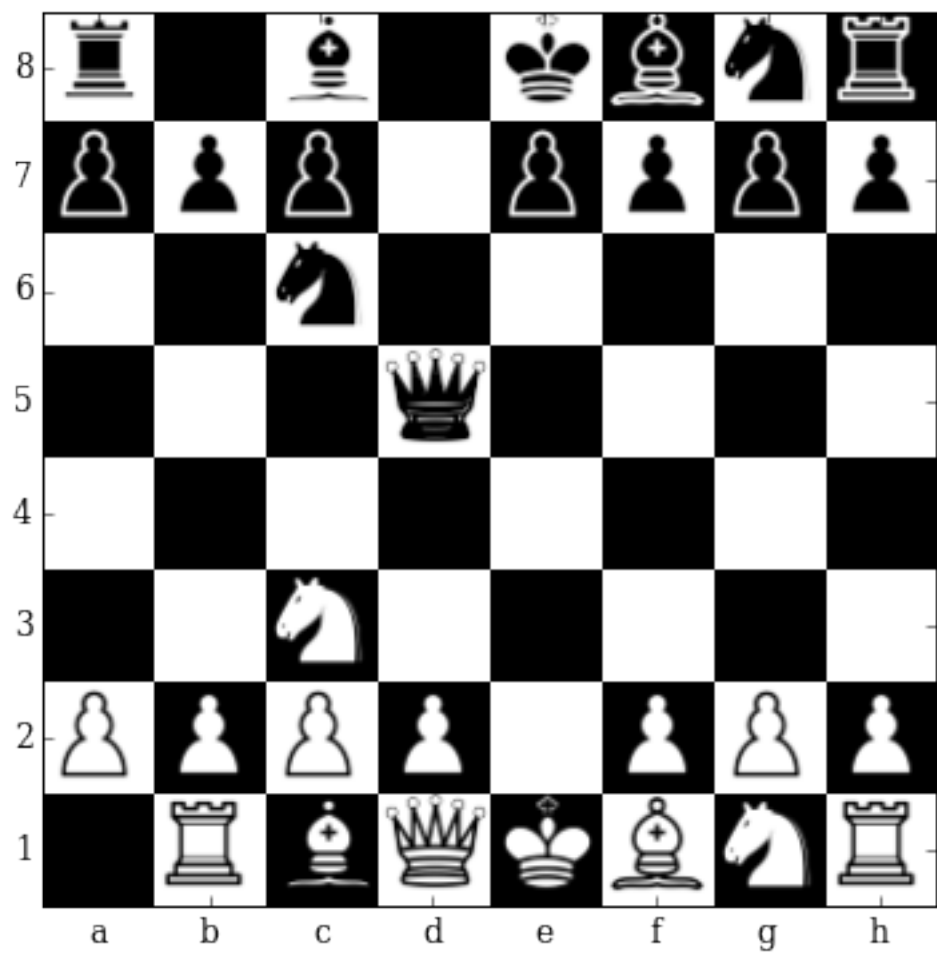
a2a4 0.0119769489393



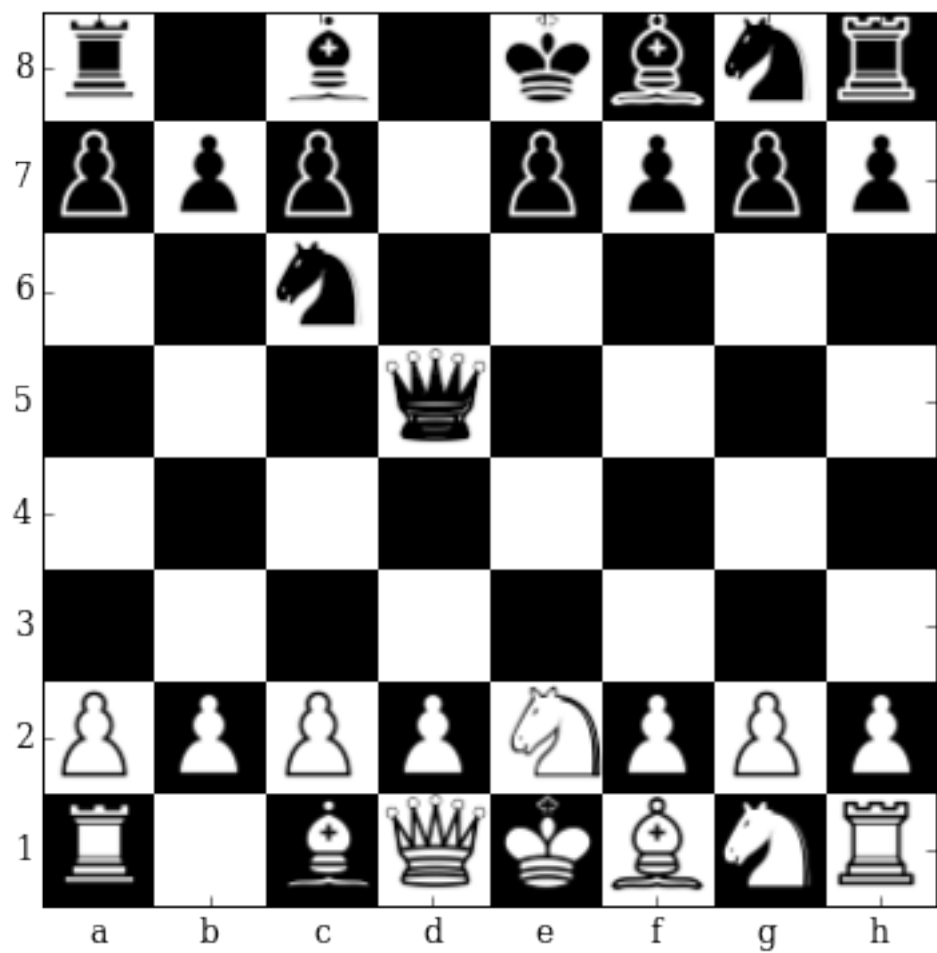
g1h3 0.0115632014349



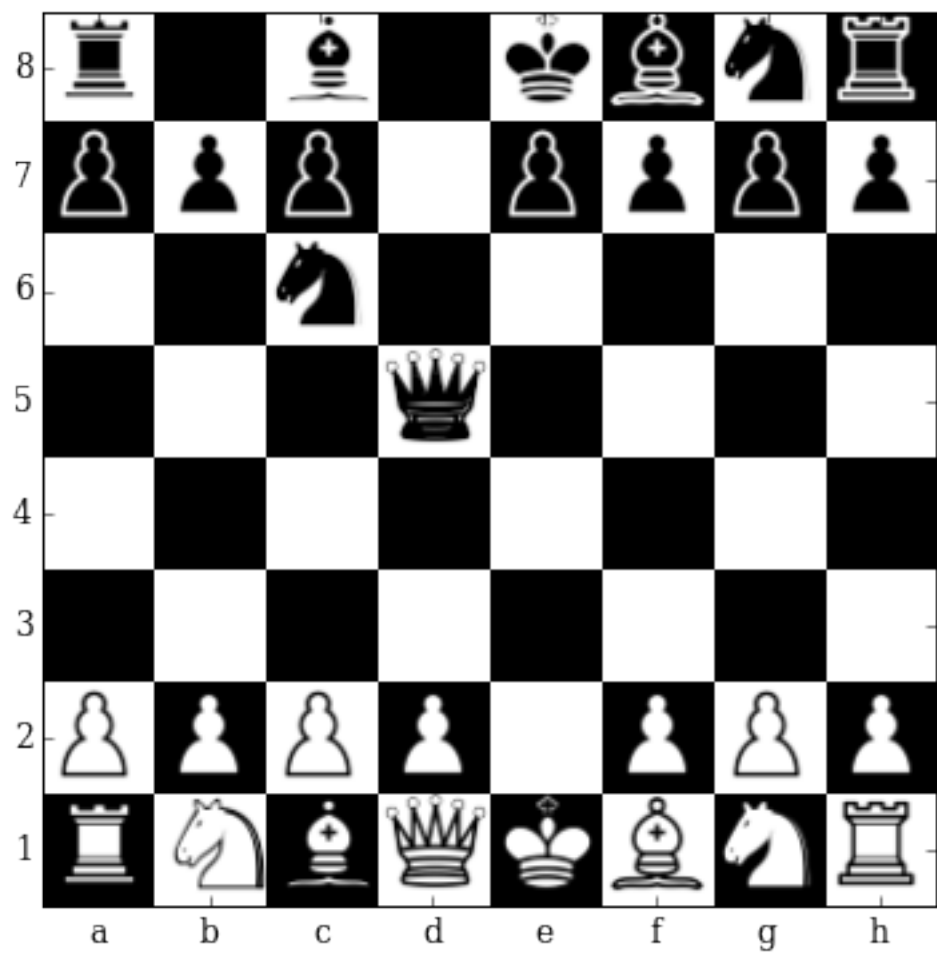
f1a6 0.0110727213323
 WORST 5 Moves



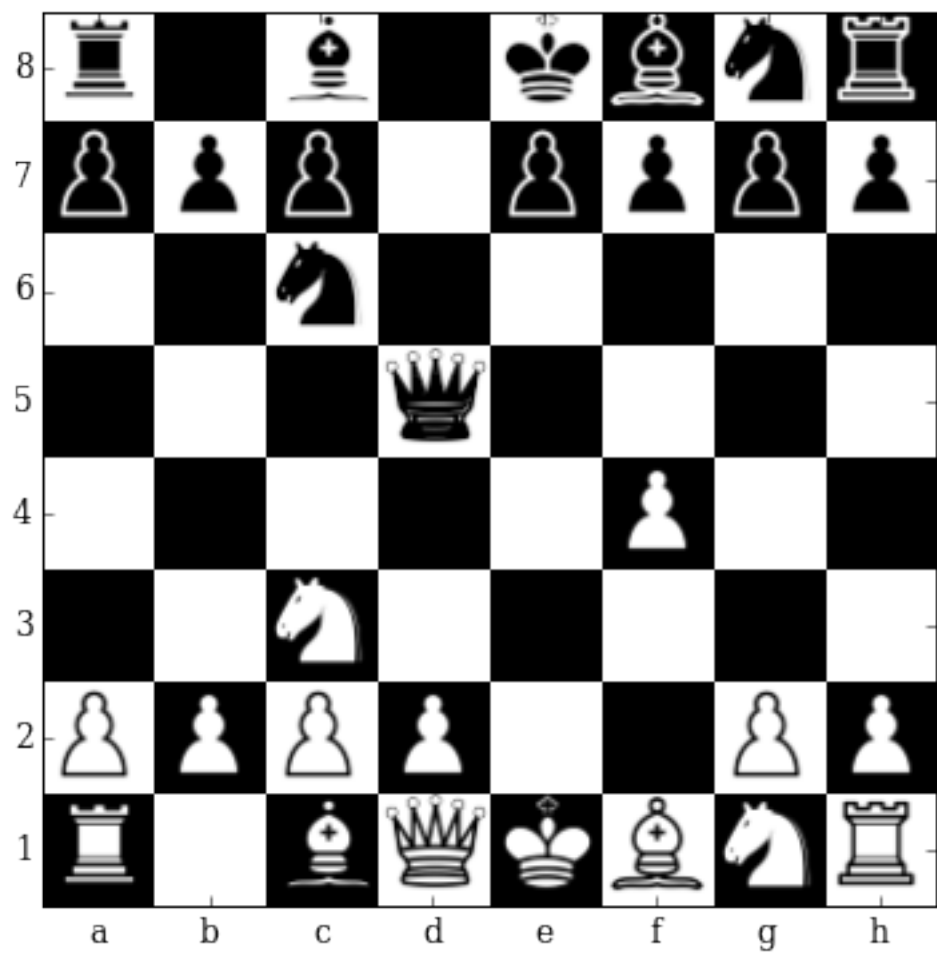
a1b1 -0.000657647731714



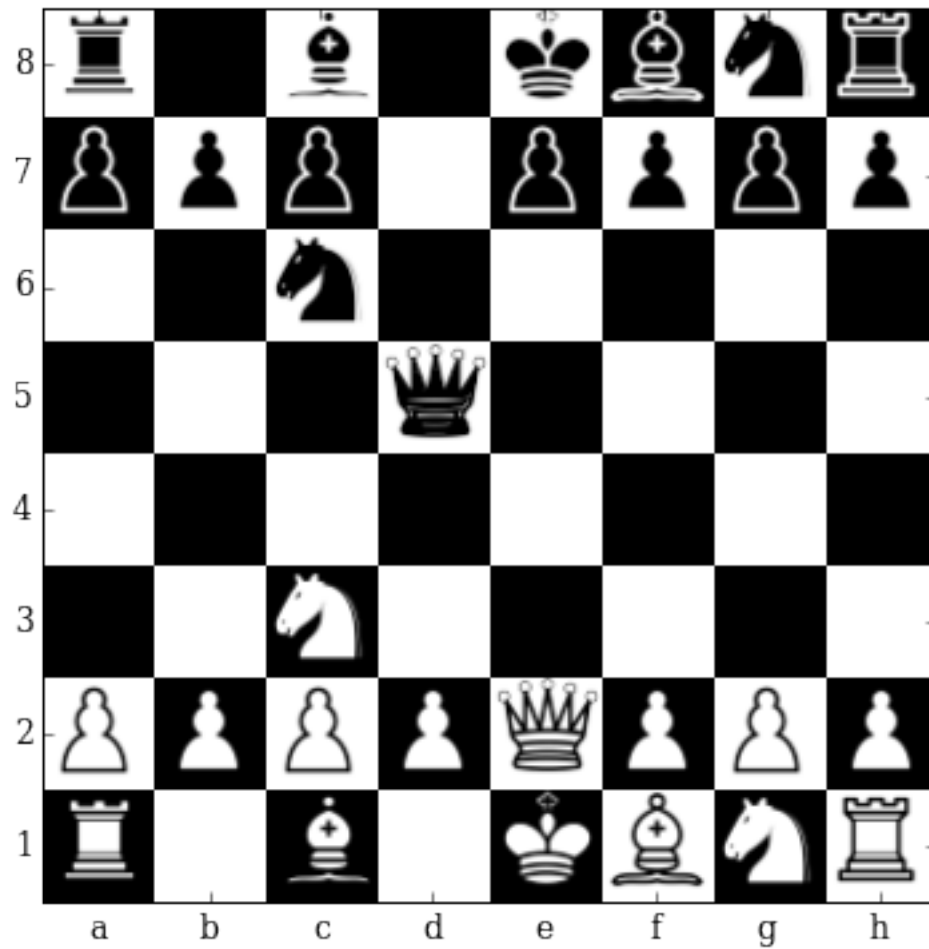
c3e2 -0.00339175574481



c3b1 -0.00497450307012



f2f4 -0.00507036363706



d1e2 -0.00937258545309

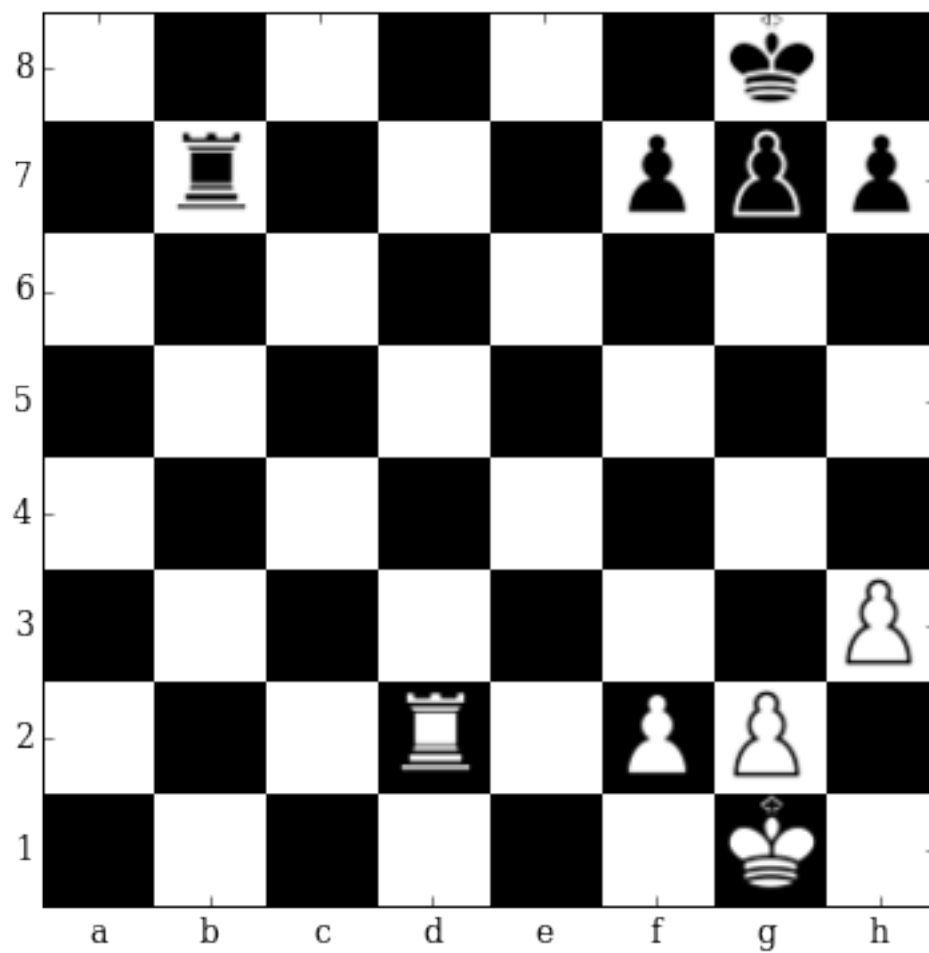
In [14]: '''

Checkmating with a rook

(Works)

'''

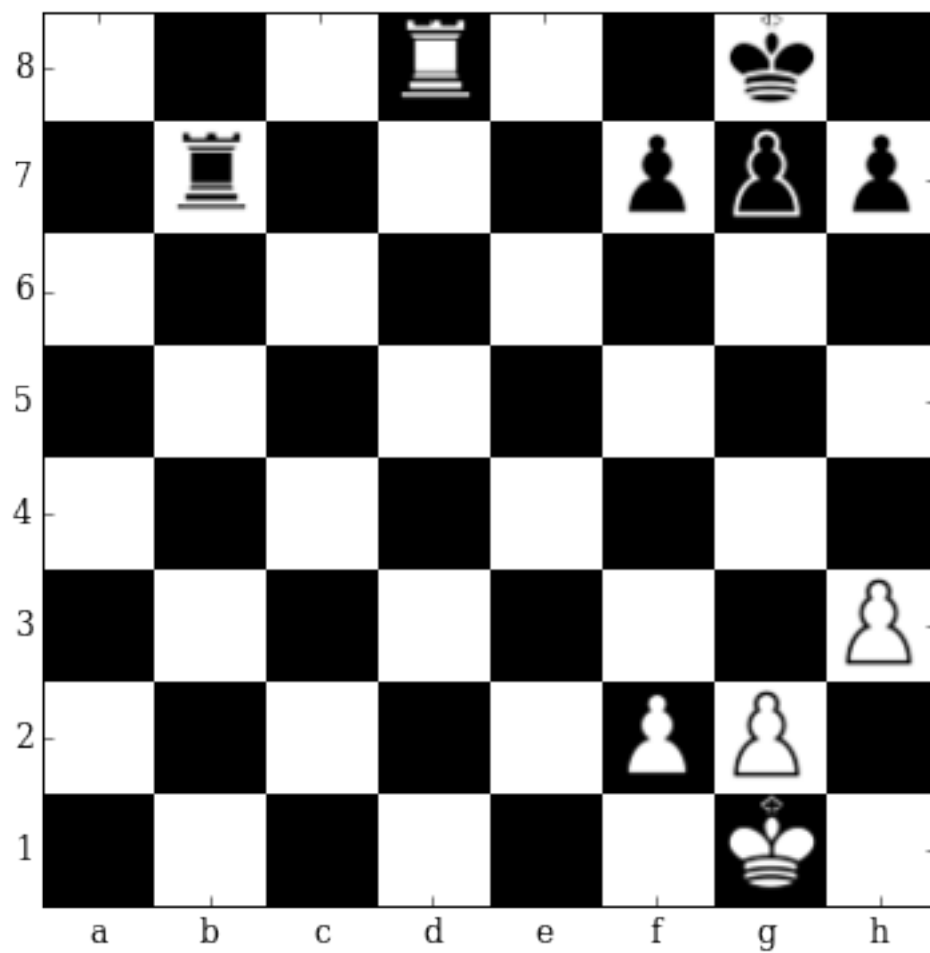
top_bottom_moves('6k1/1r3ppp/8/8/7P/3R1PP1/6K1 w - - 0 0')



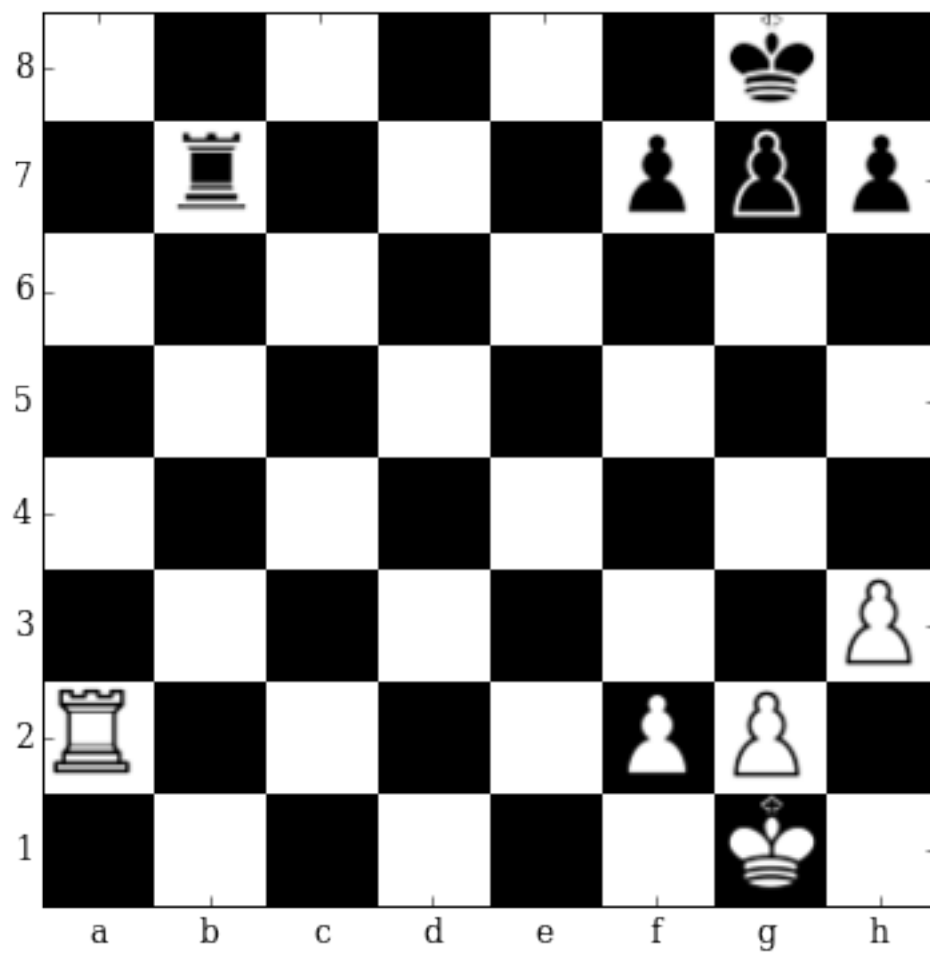
Current evaluation: -0.006740

Total 19 moves possible

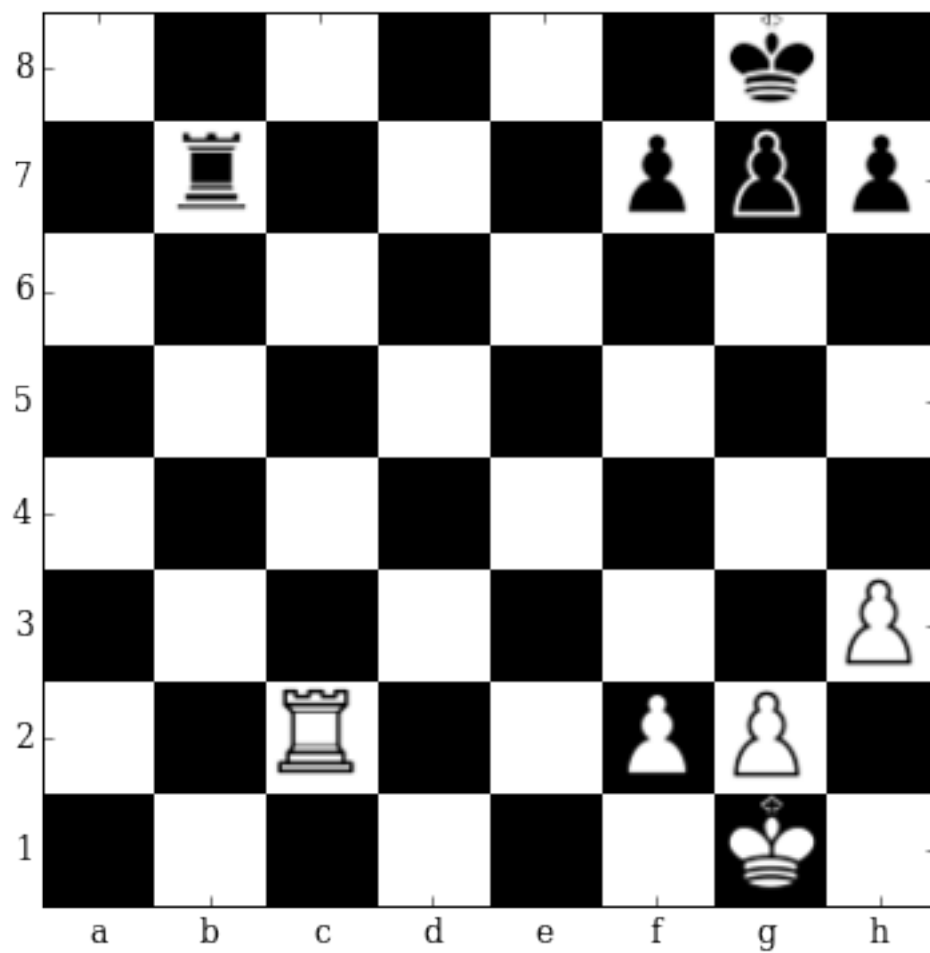
TOP 5 Moves



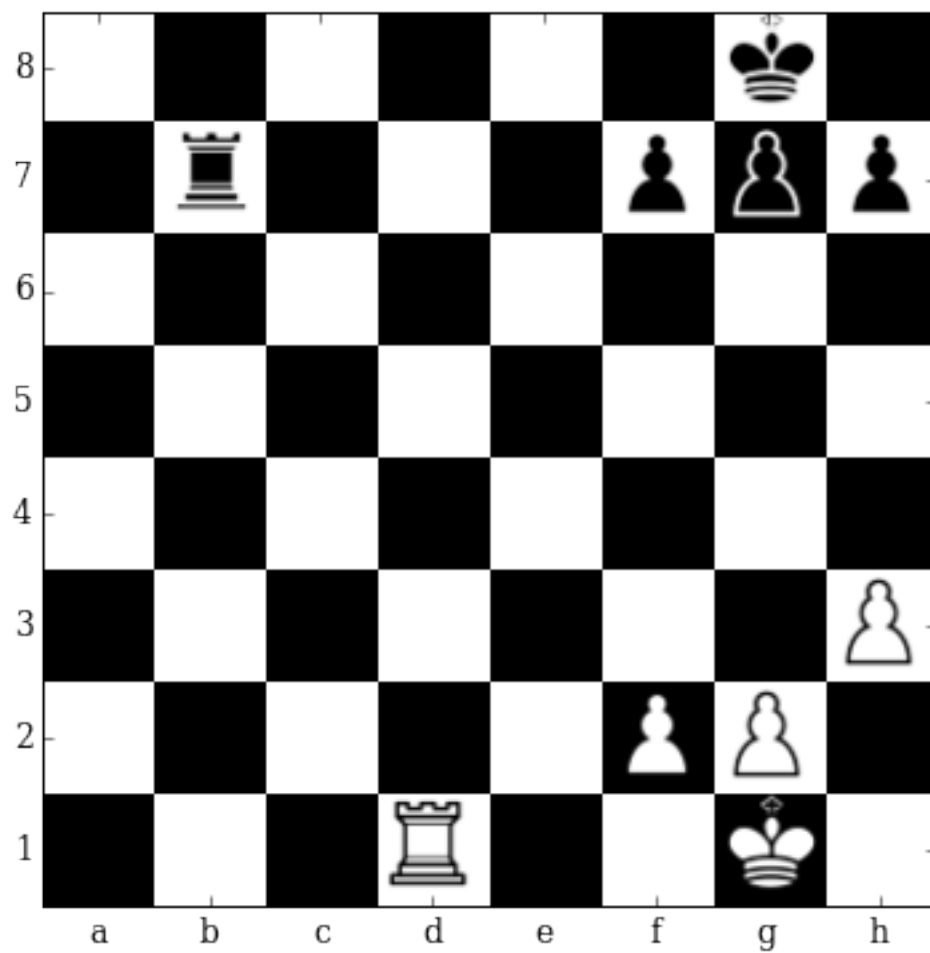
d2d8 0.0452536605299



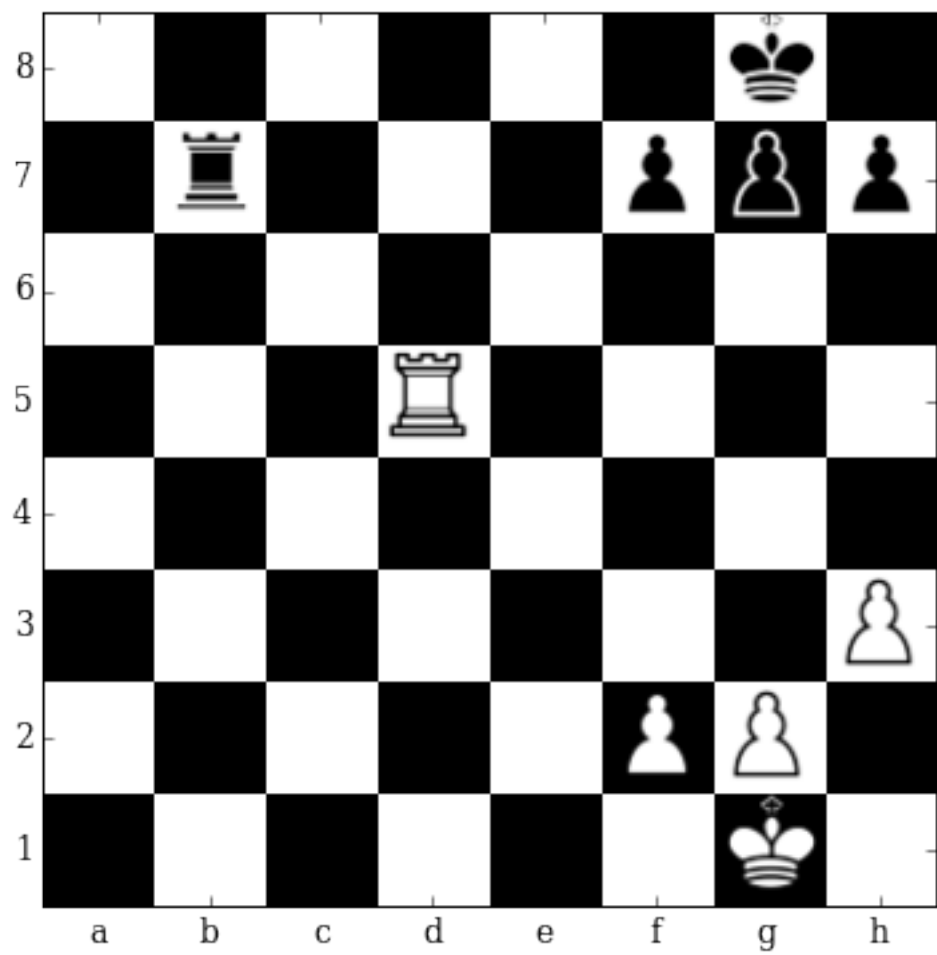
d2a2 0.0176544804126



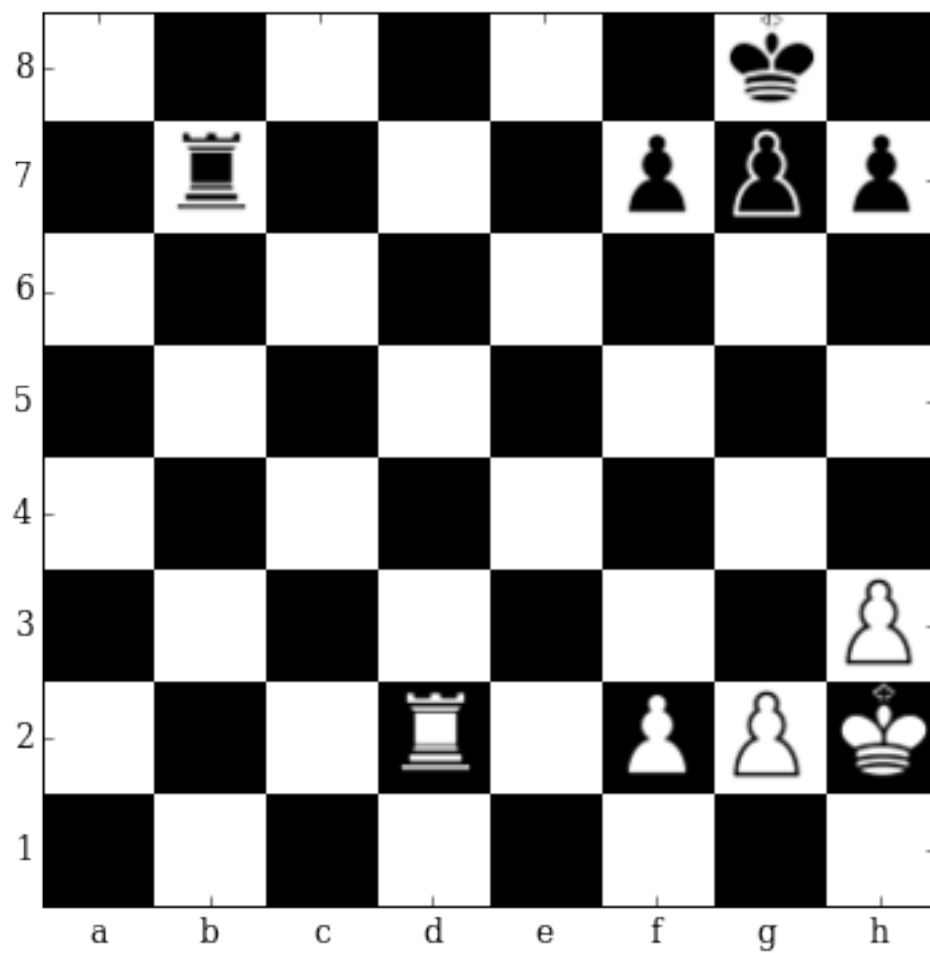
d2c2 0.00976785086095



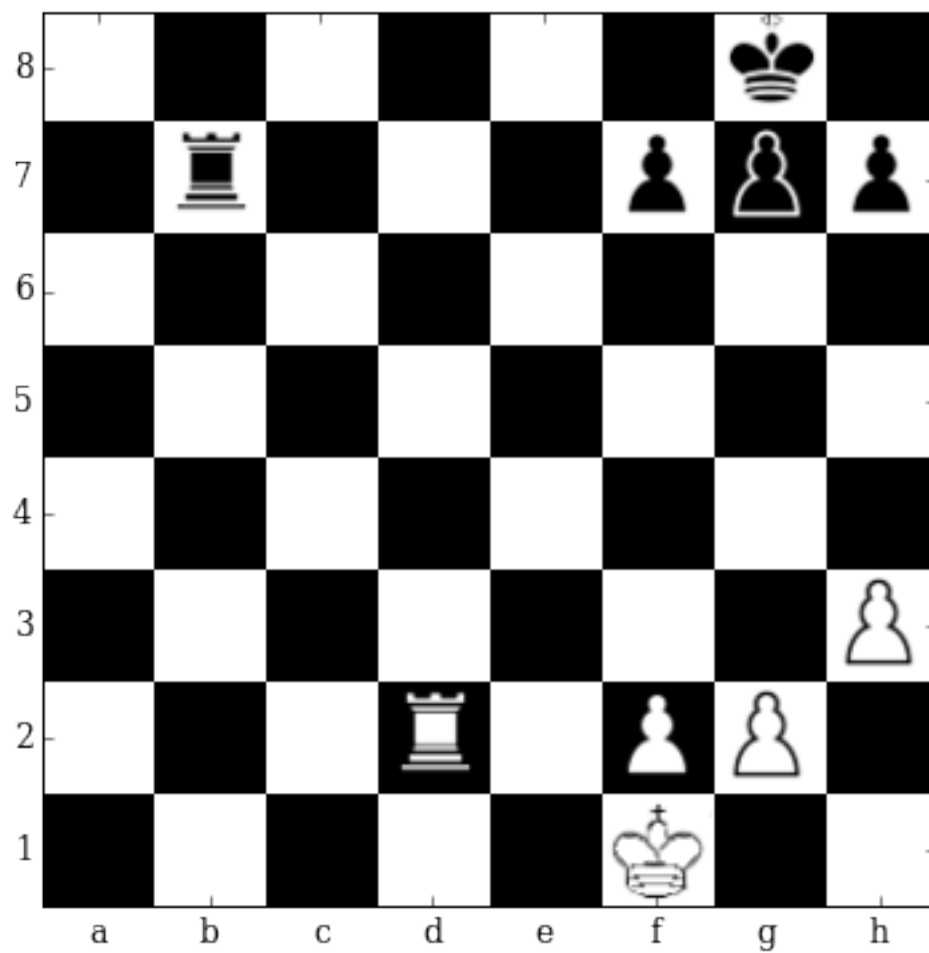
d2d1 0.00954846478999



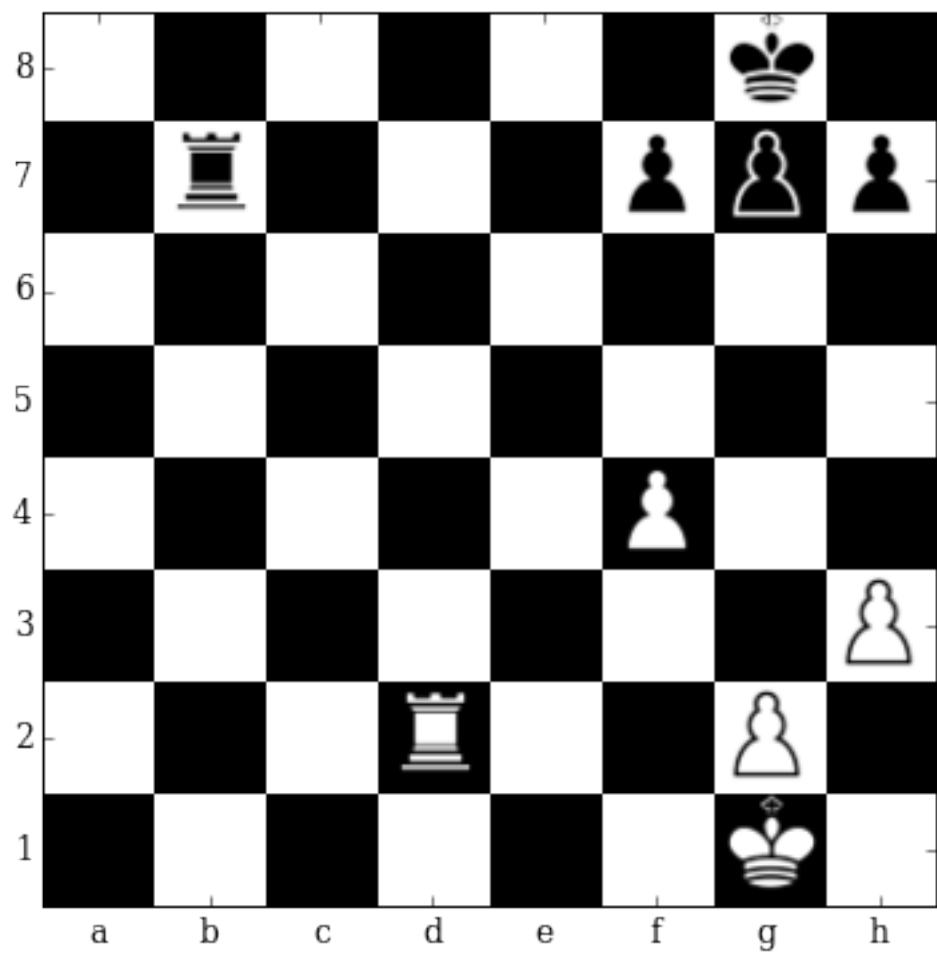
d2d5 0.00700665730983
 WORST 5 Moves



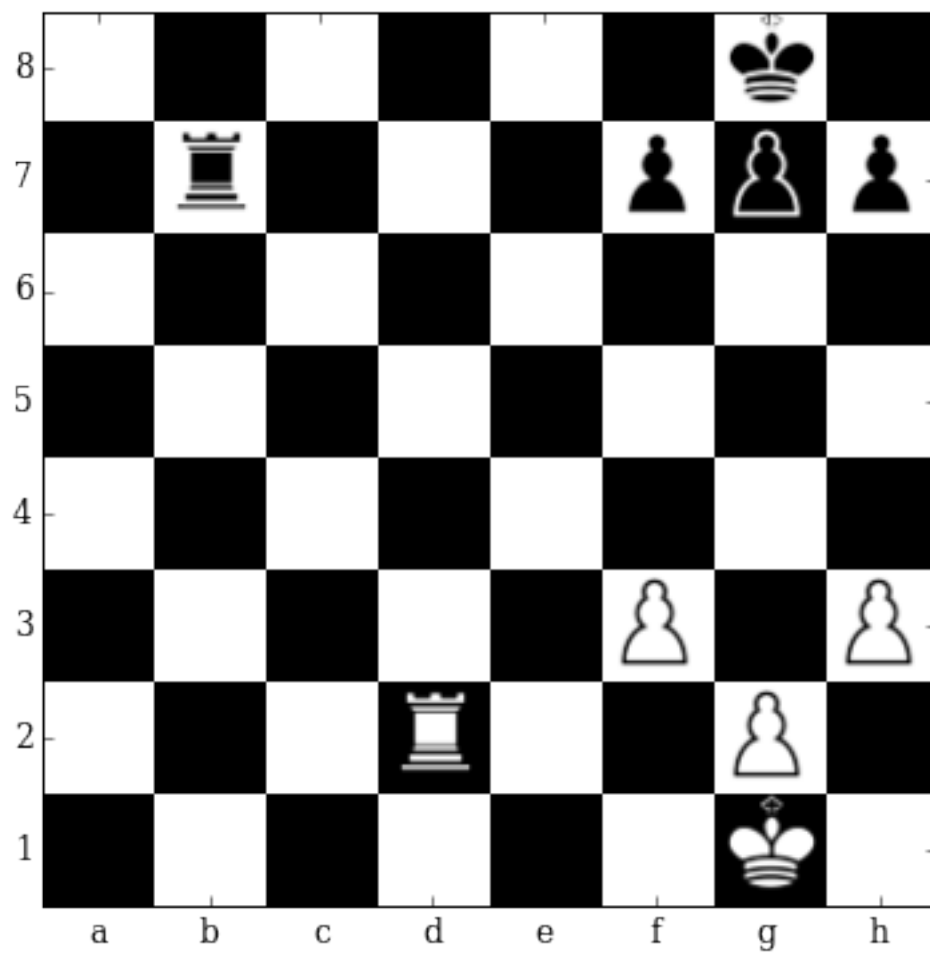
g1h2 -0.0147265279666



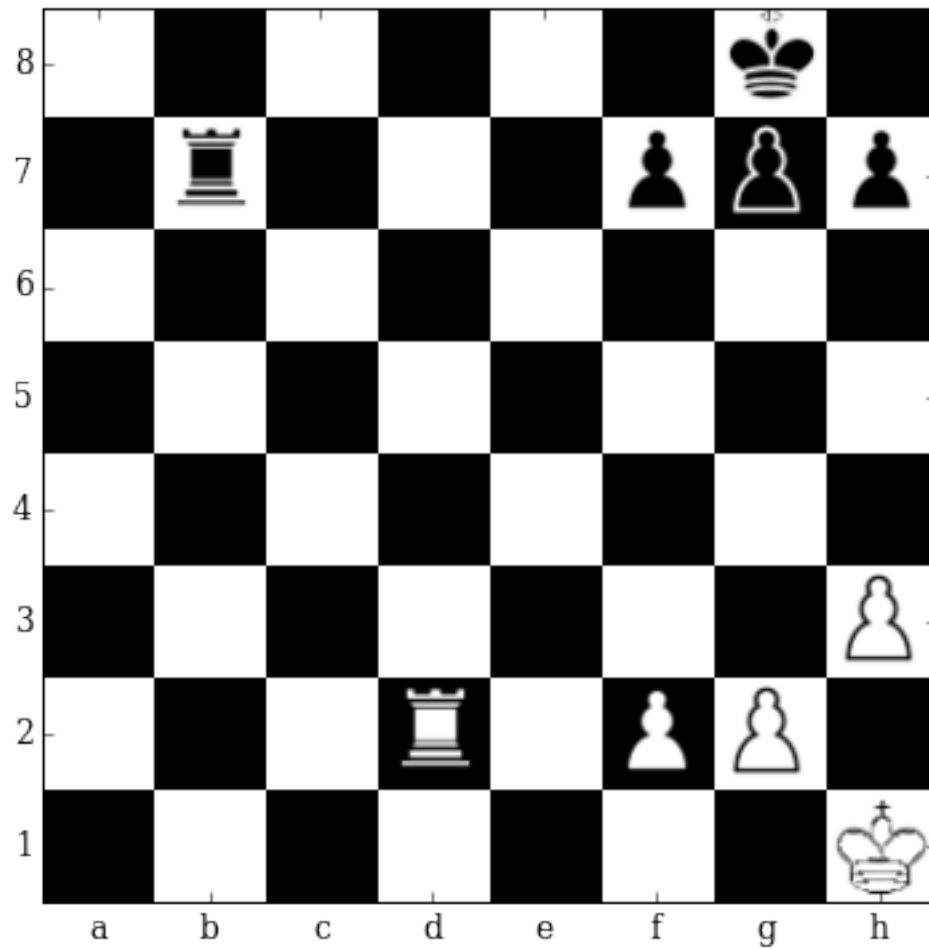
g1f1 -0.0185413267463



f2f4 -0.0185624714941



f2f3 -0.0199430584908

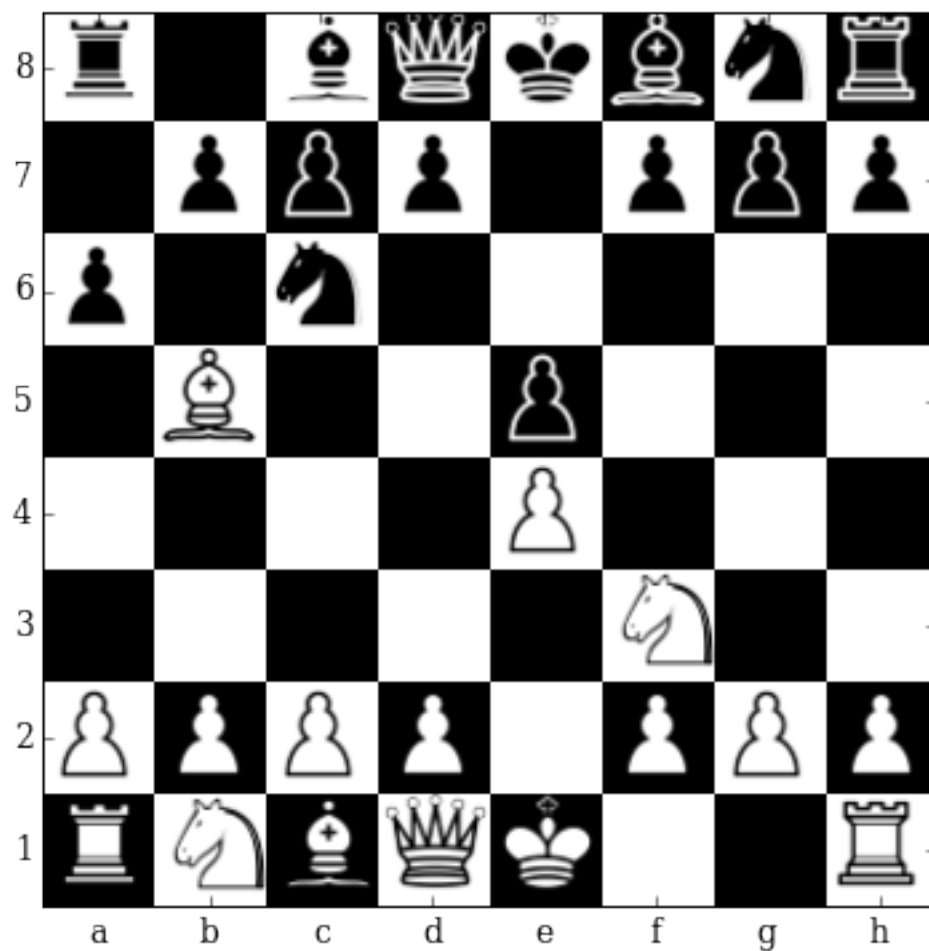


g1h1 -0.0221134386957

In [15]: '''

Trading the knight with a bishop
'''

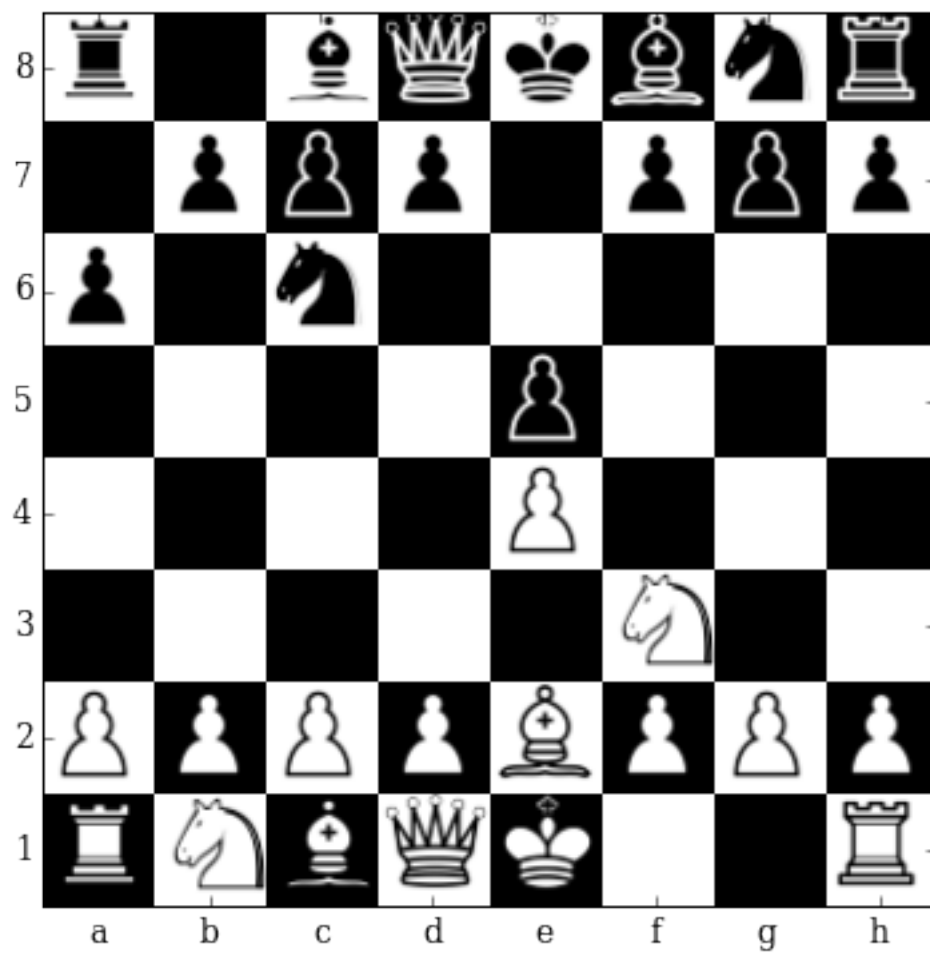
top_bottom_moves('r1bqkbnr/1ppp1ppp/p1n5/1B2p3/4P3/5N2/PPPP1PPP/RNBQK2R w KQkq - 0 0')



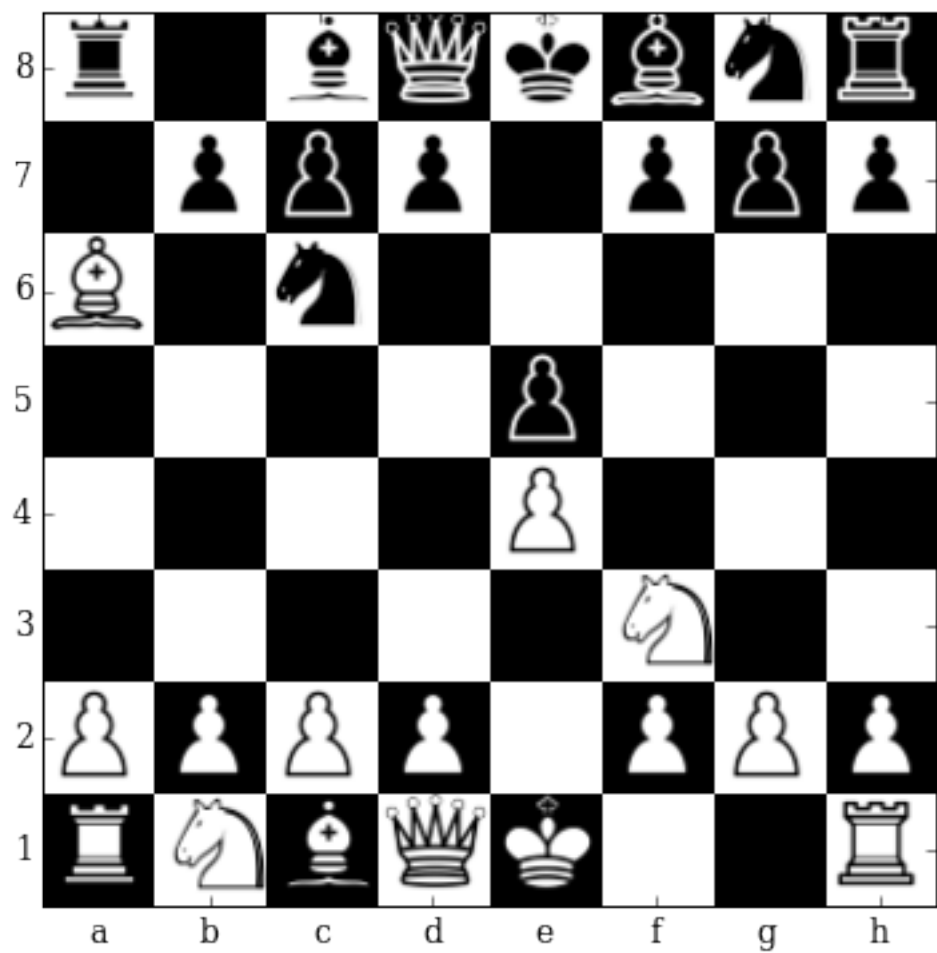
Current evaluation: -0.003171

Total 32 moves possible

TOP 5 Moves



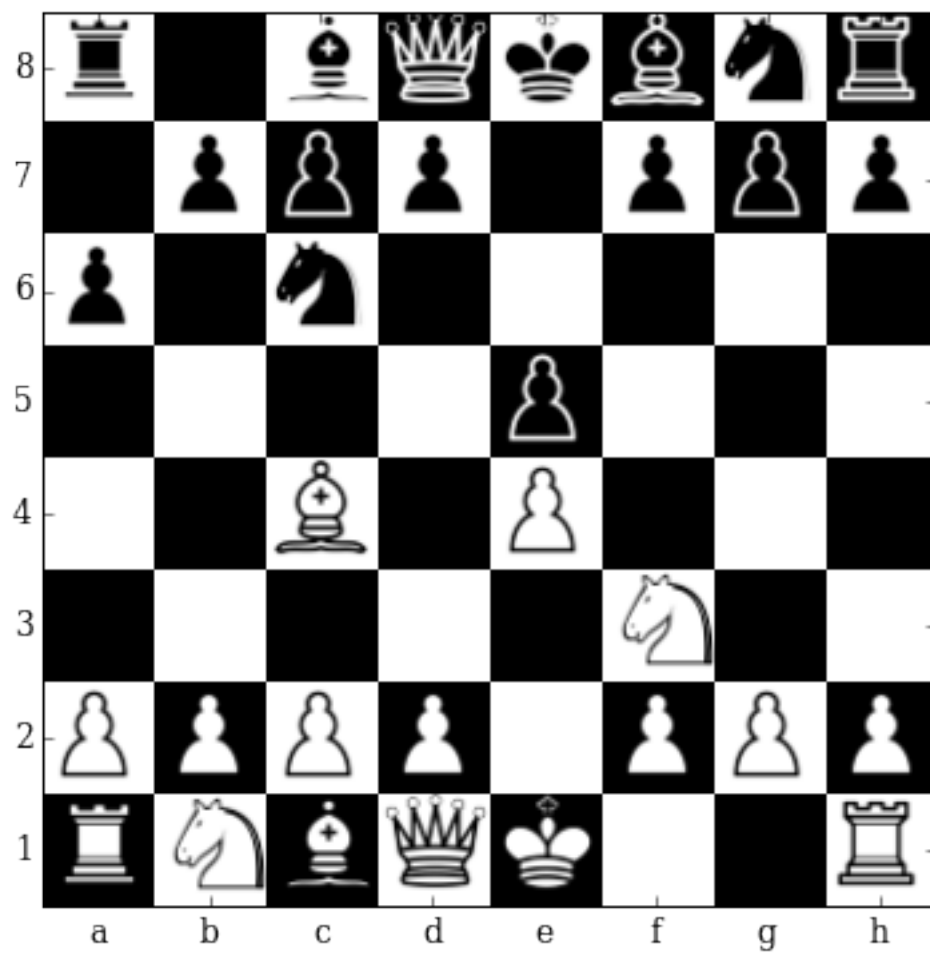
b5e2 0.00623769778758



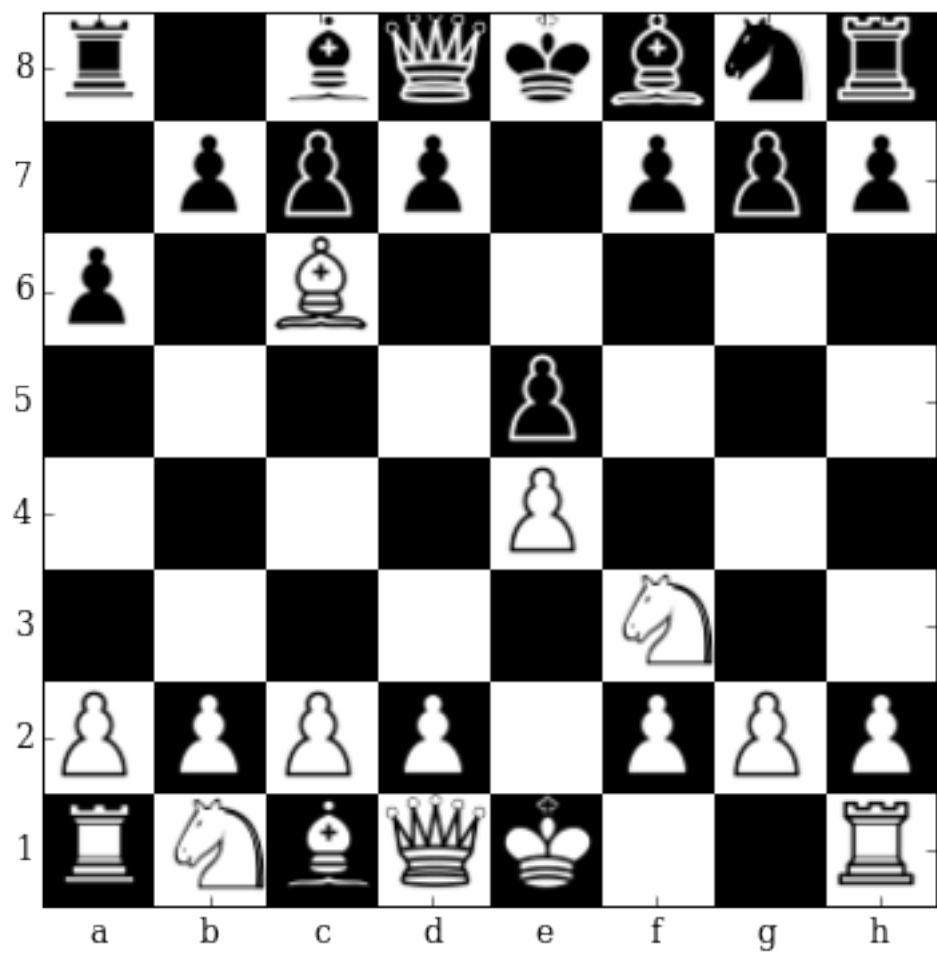
b5a6 0.00556590827182



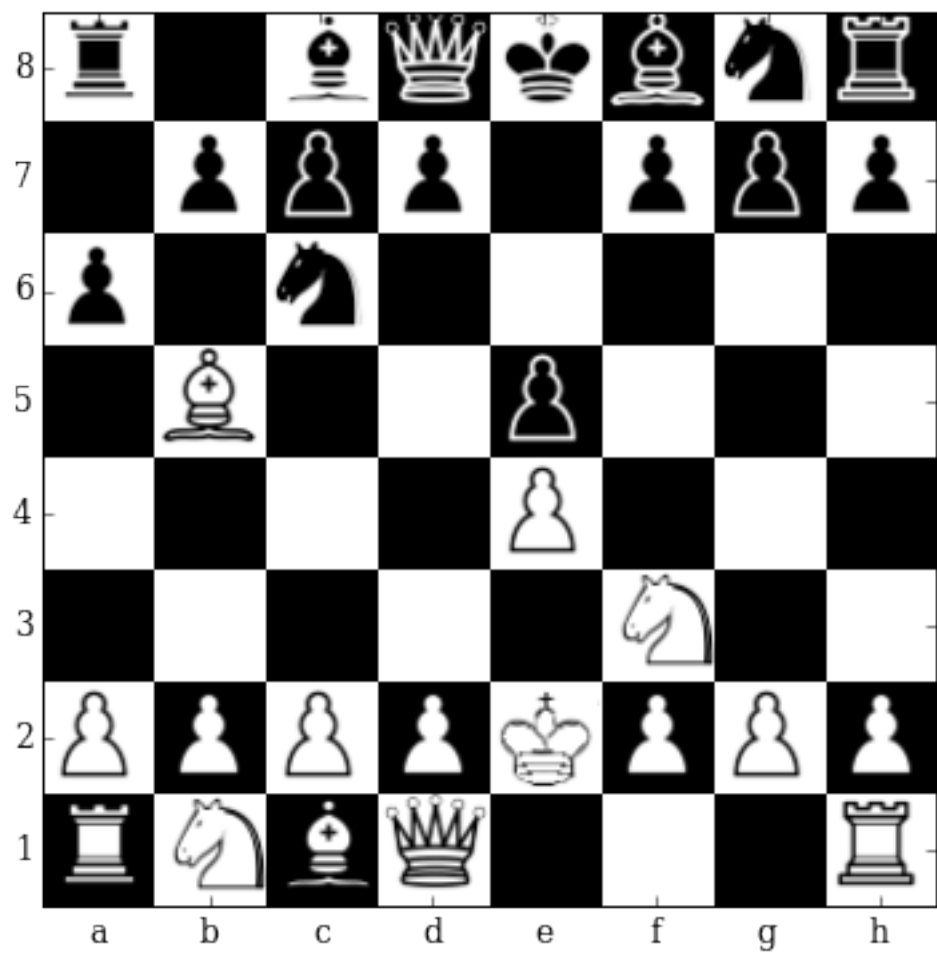
b5a4 0.00405460782349



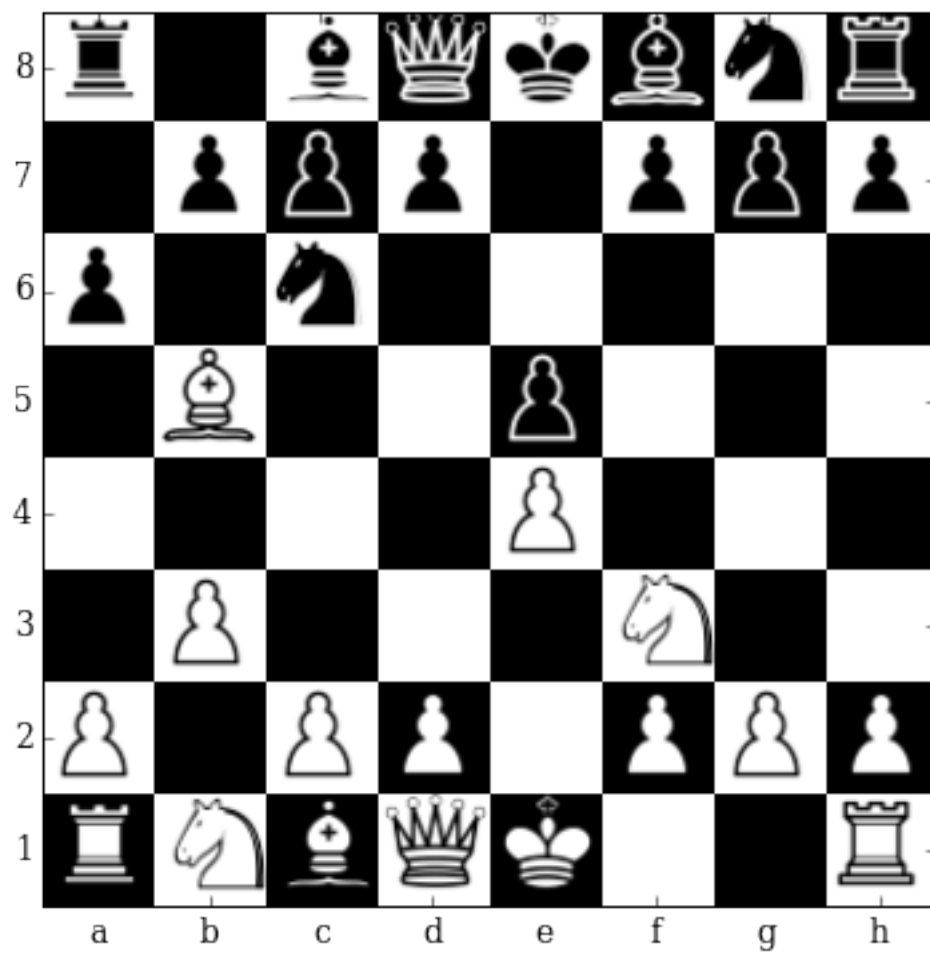
b5c4 0.00325289717875



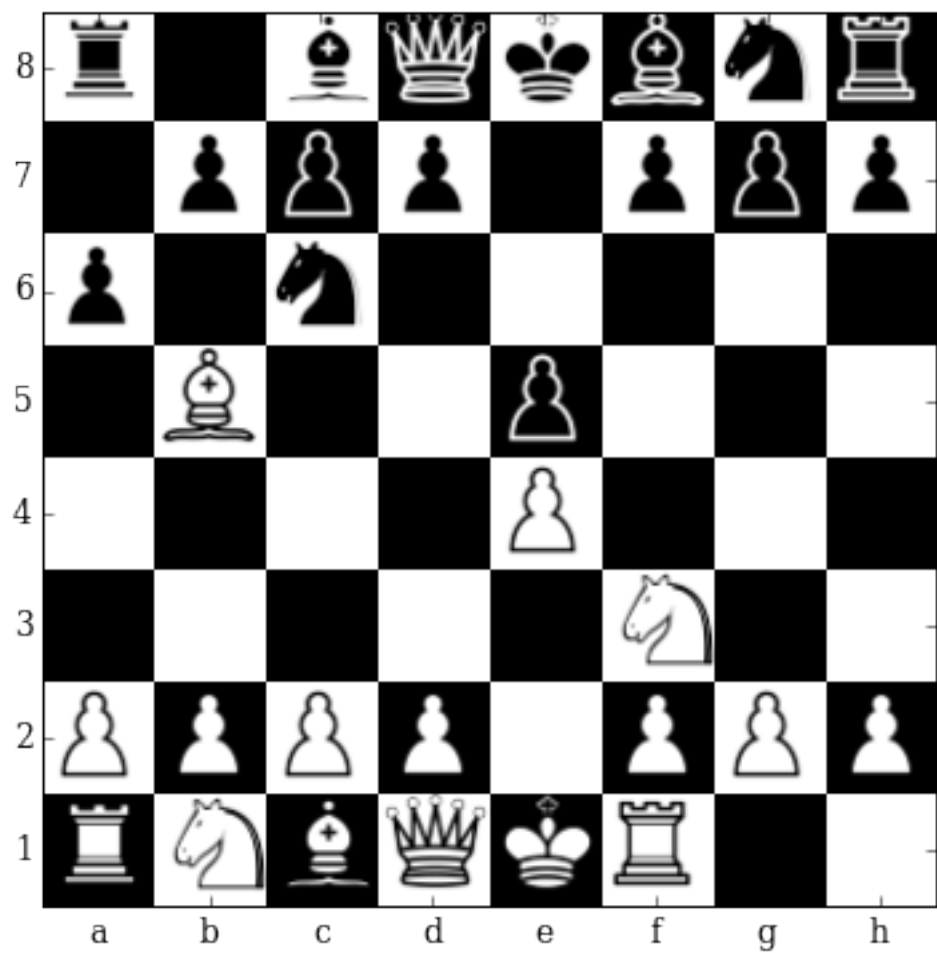
b5c6 0.00300058745779
 WORST 5 Moves



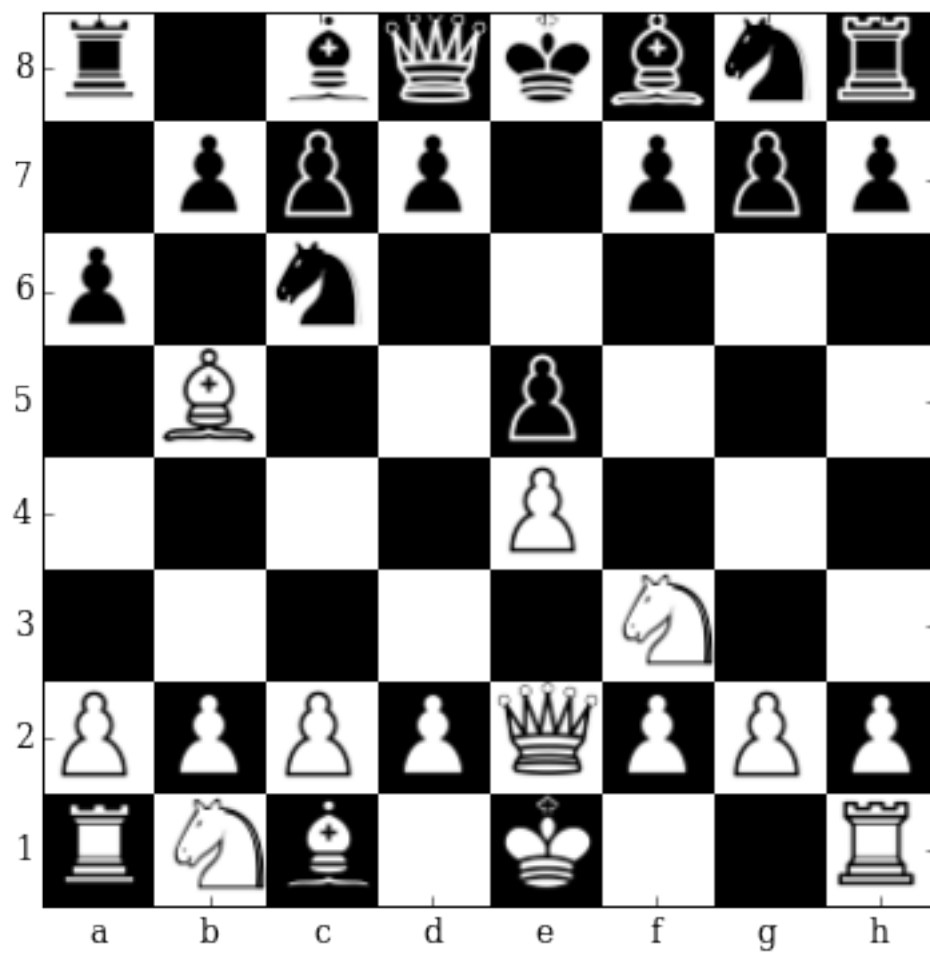
e1e2 -0.00794988125563



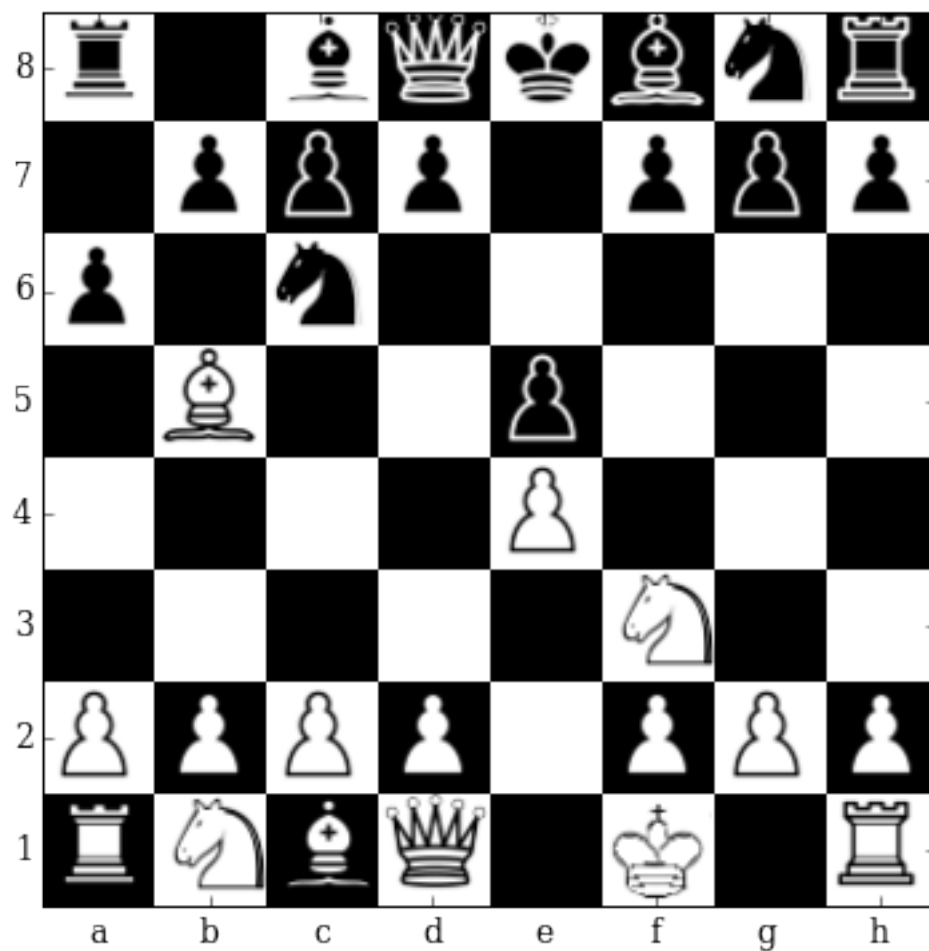
b2b3 -0.00797471962869



h1f1 -0.00896198488772



d1e2 -0.0102248834446



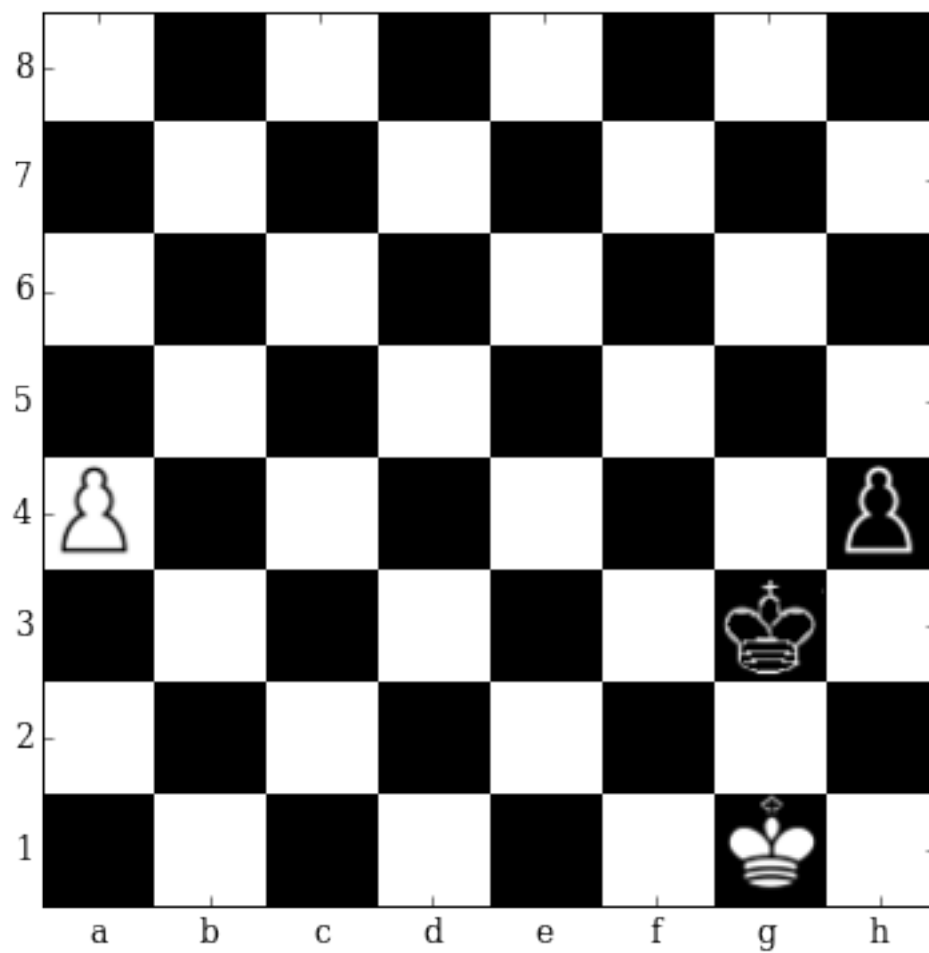
e1f1 -0.0129785845056

In [16]: '''

Runaway Pawn

'''

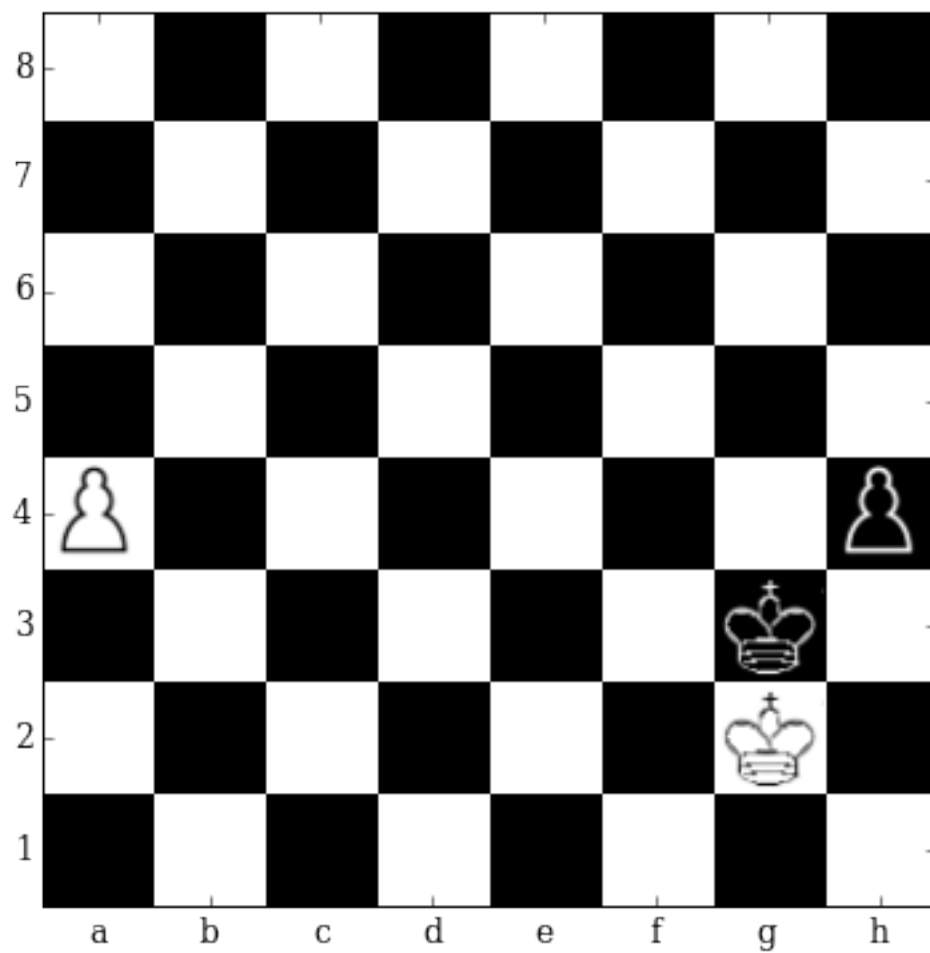
top_bottom_moves('8/8/8/8/P6p/6k1/8/6K1 w - - 0 0')



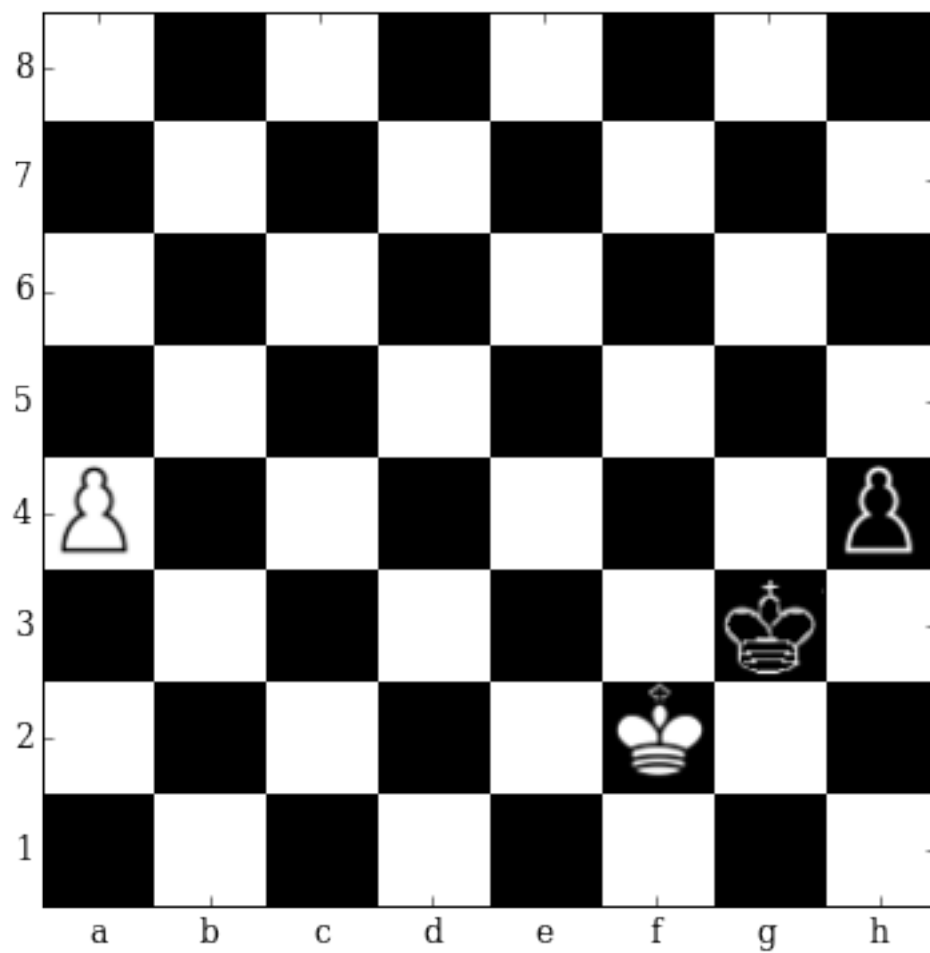
Current evaluation: -0.049161

Total 6 moves possible

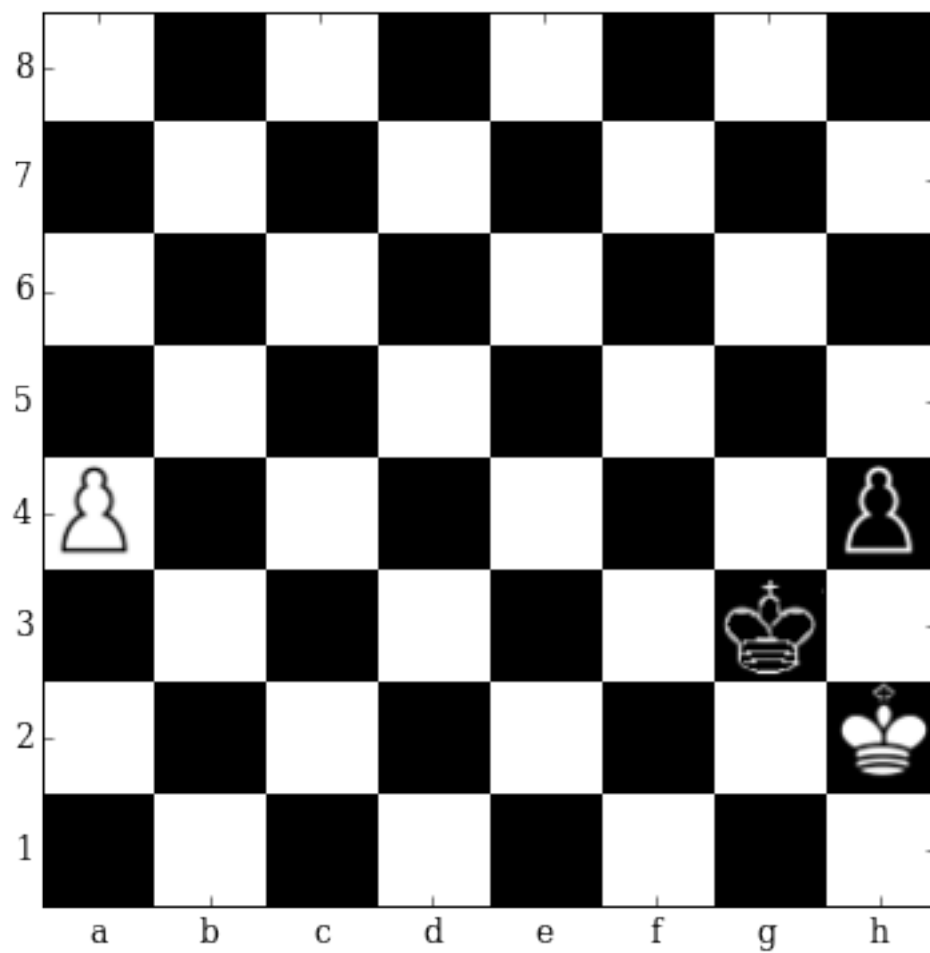
TOP 5 Moves



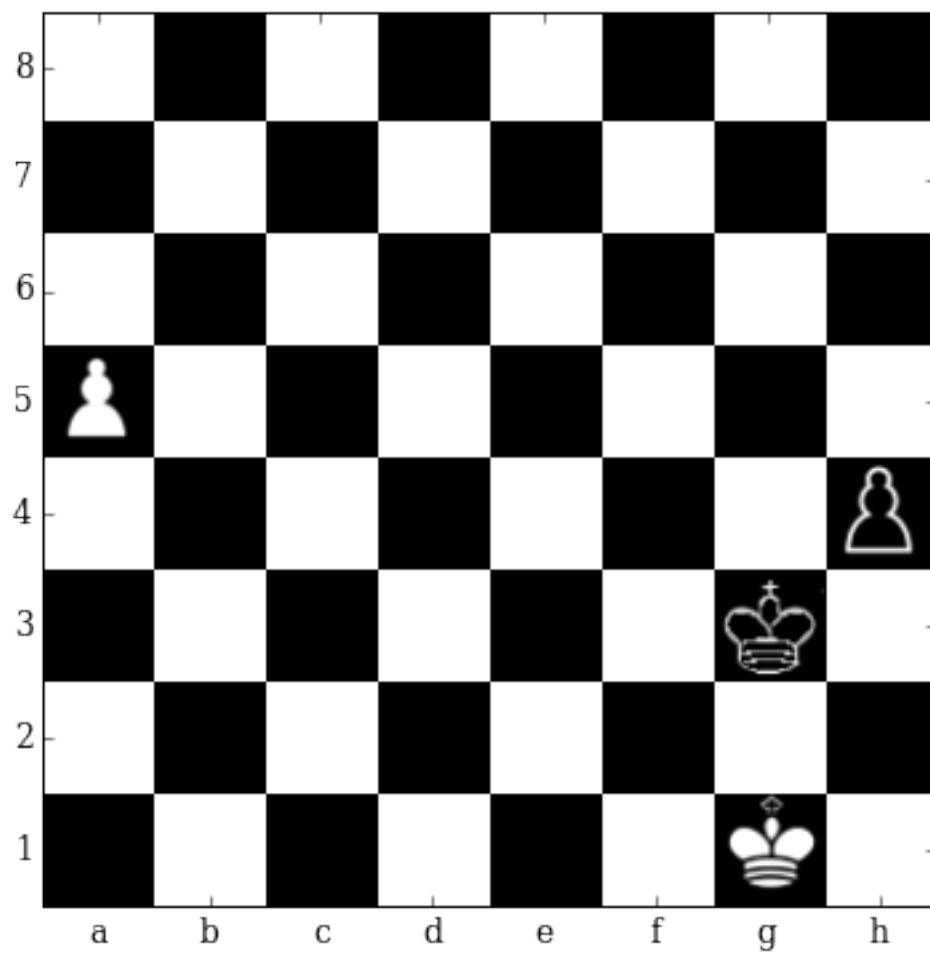
g1g2 0.00462216185406



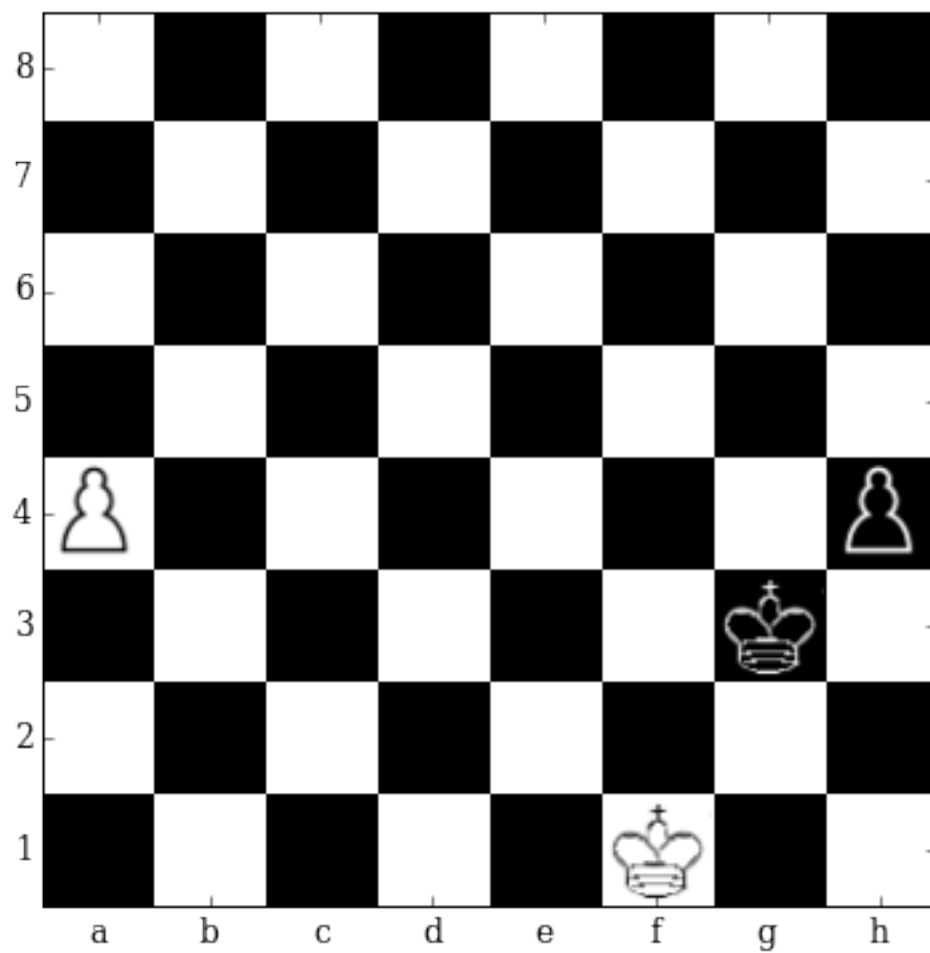
g1f2 -0.0209280643612



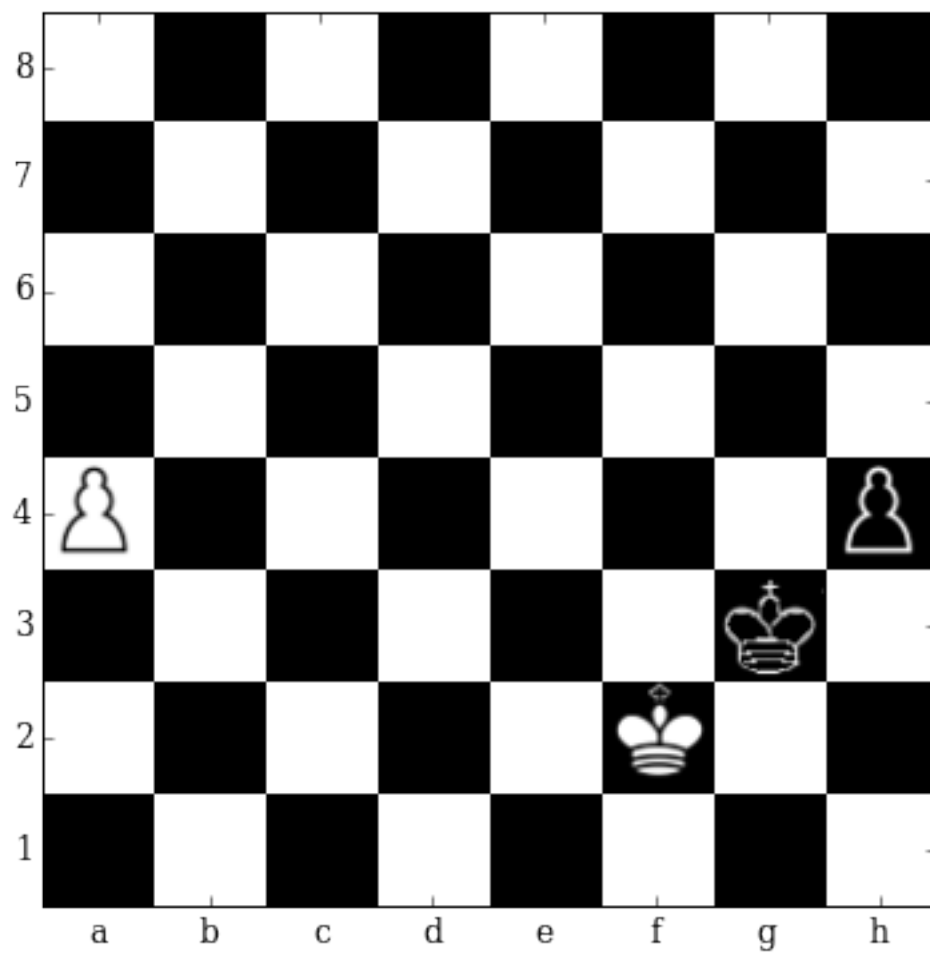
g1h2 -0.0317683890462



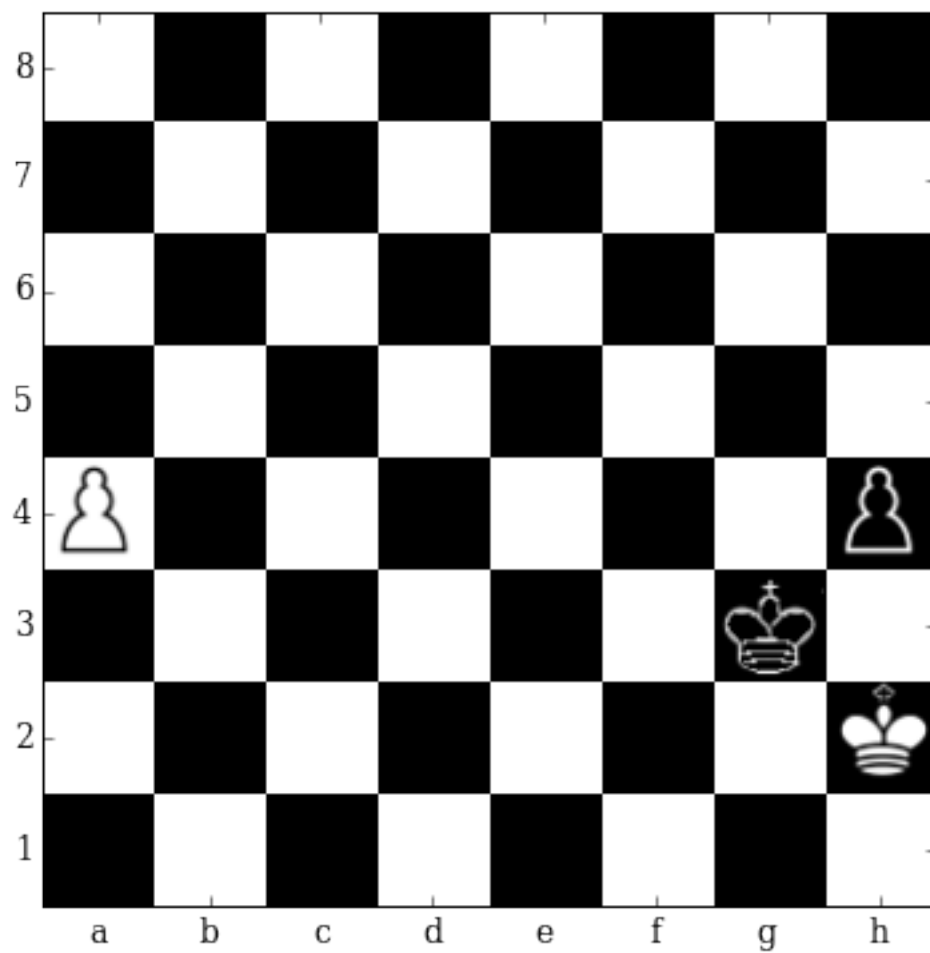
a4a5 -0.0482270270586



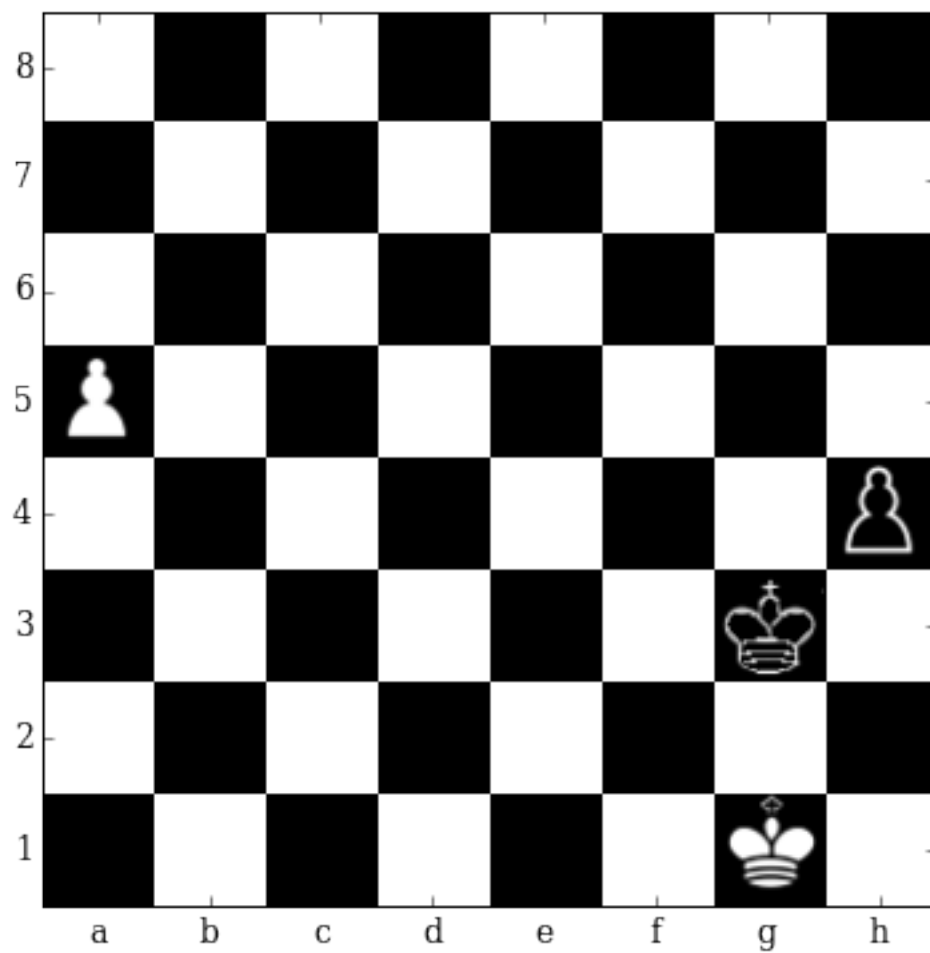
g1f1 -0.0665239691734
WORST 5 Moves



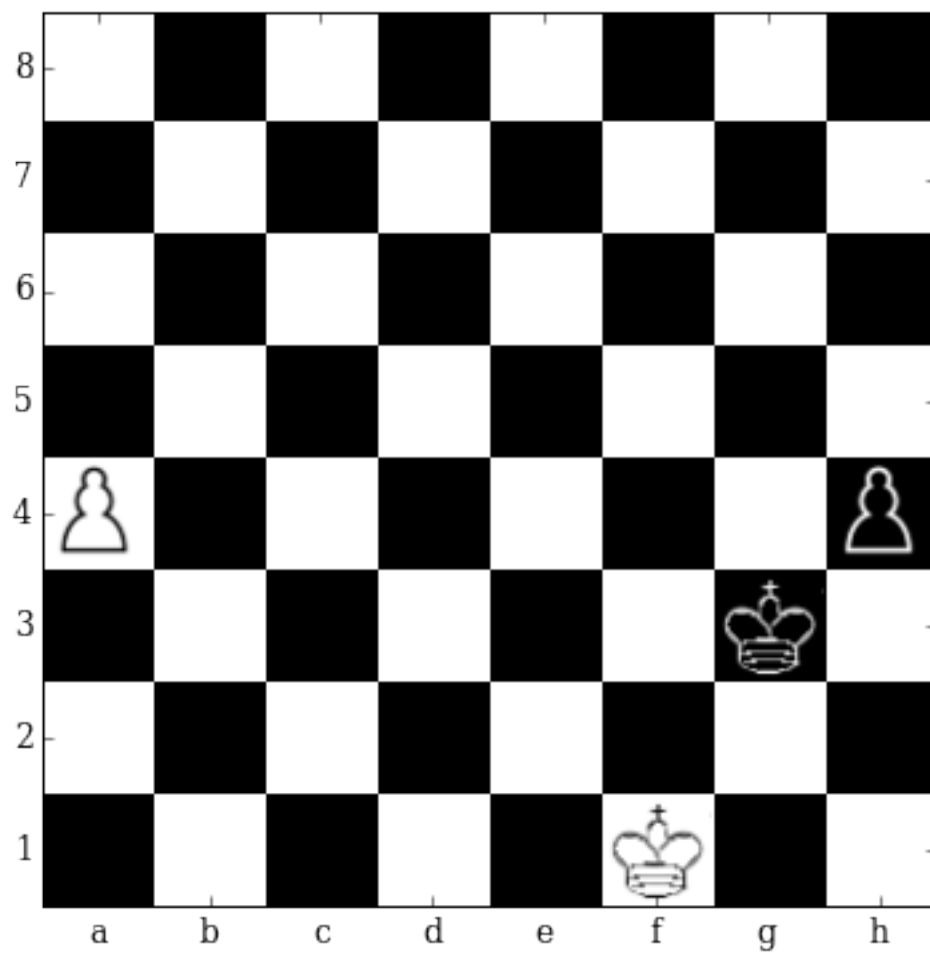
g1f2 -0.0209280643612



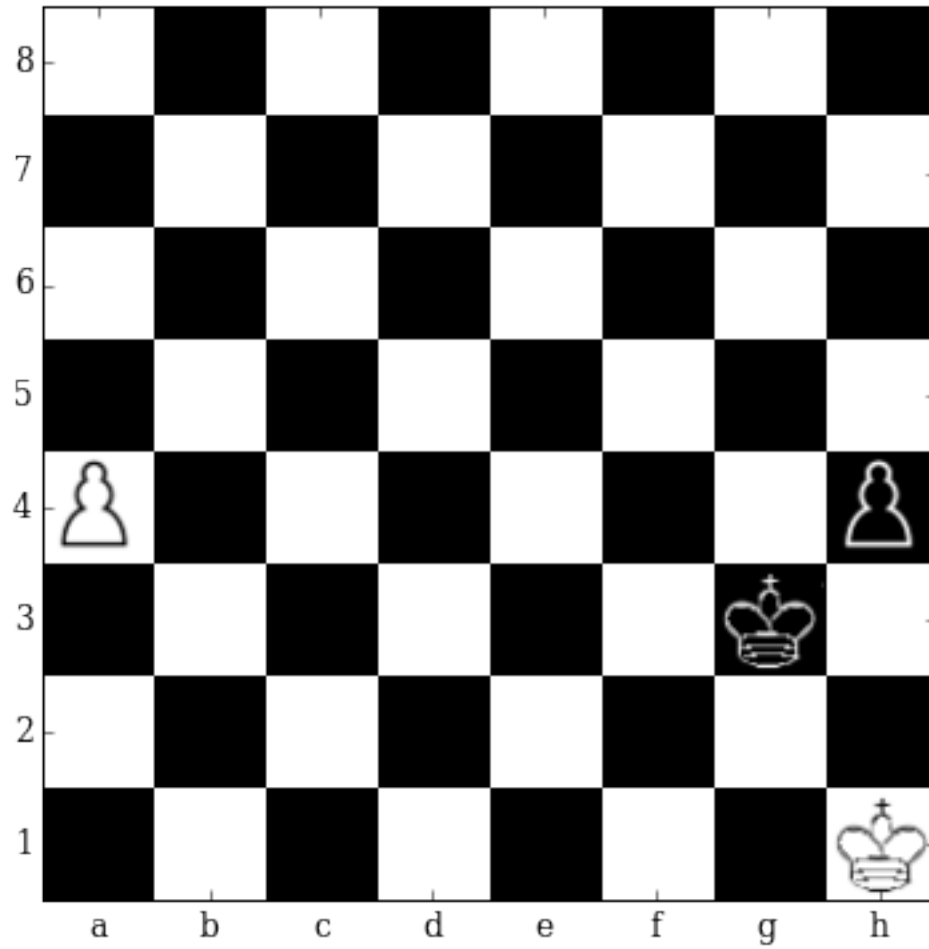
g1h2 -0.0317683890462



a4a5 -0.0482270270586

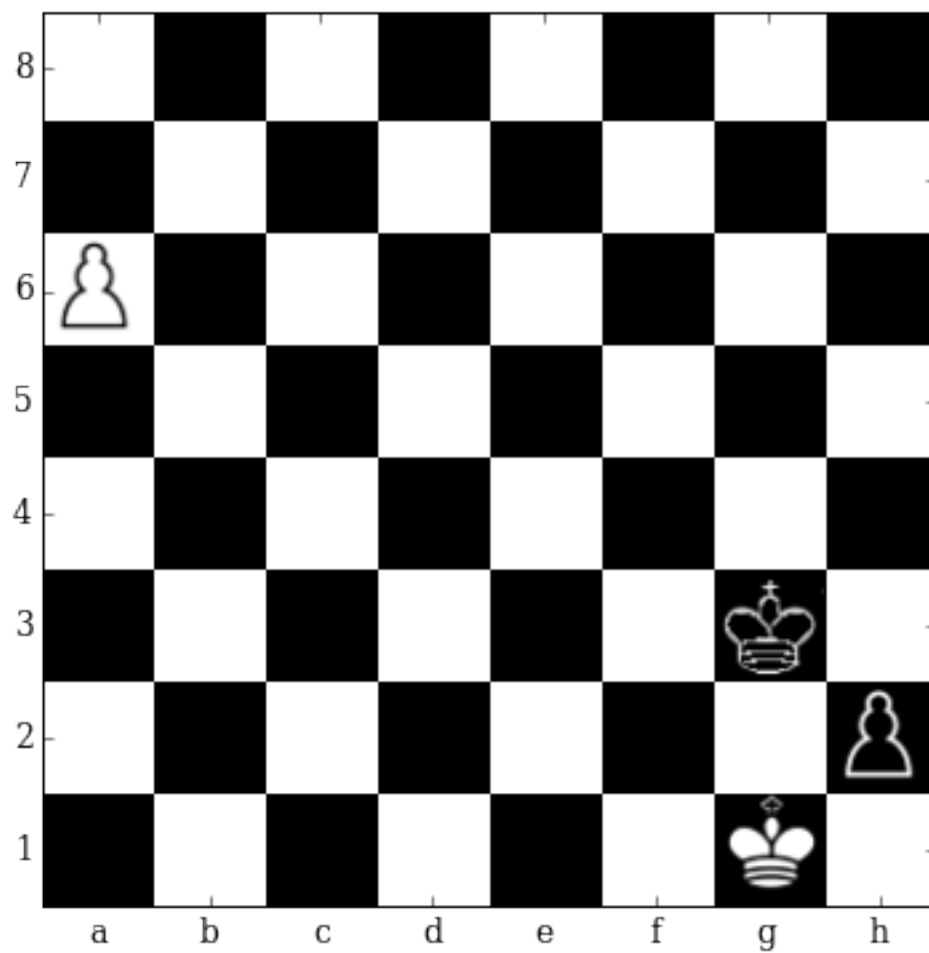


g1f1 -0.0665239691734



g1h1 -0.0737288221717

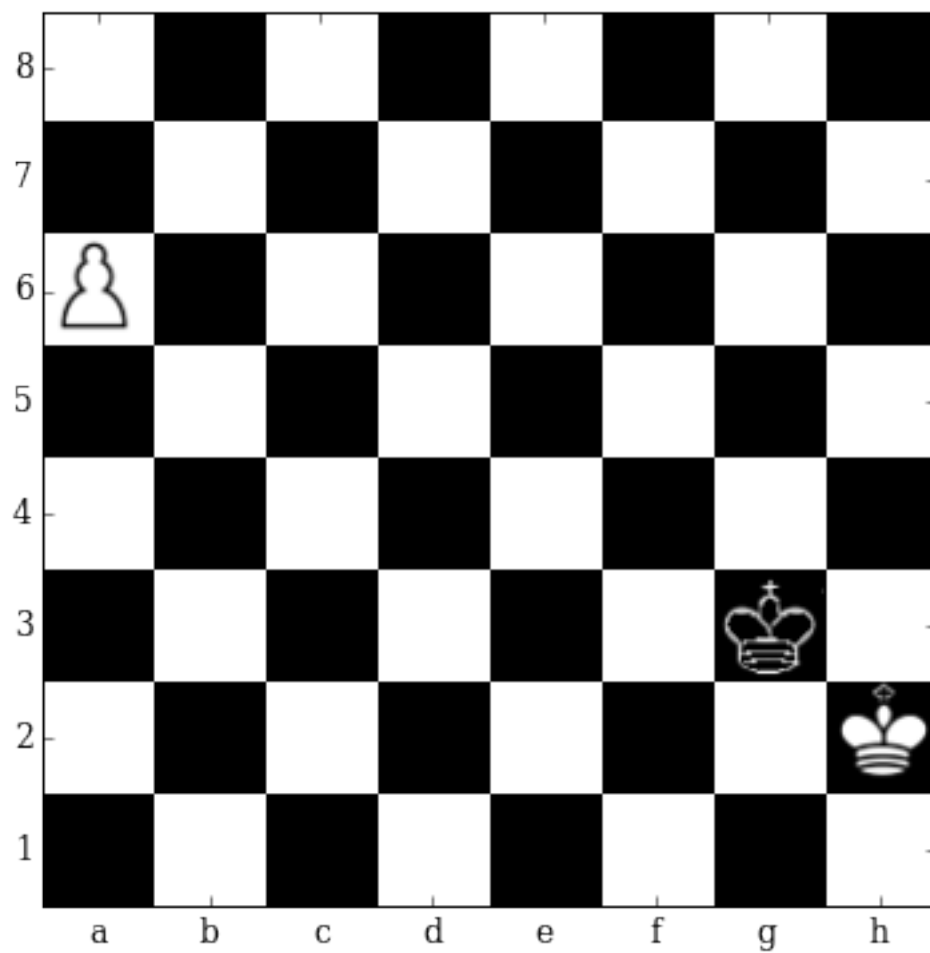
```
In [17]: '''
          Check and Blocking a promotion
          '''
          fen = '8/8/P7/8/8/6k1/7p/6K1 w - - 0 0'
          top_bottom_moves(fen)
```



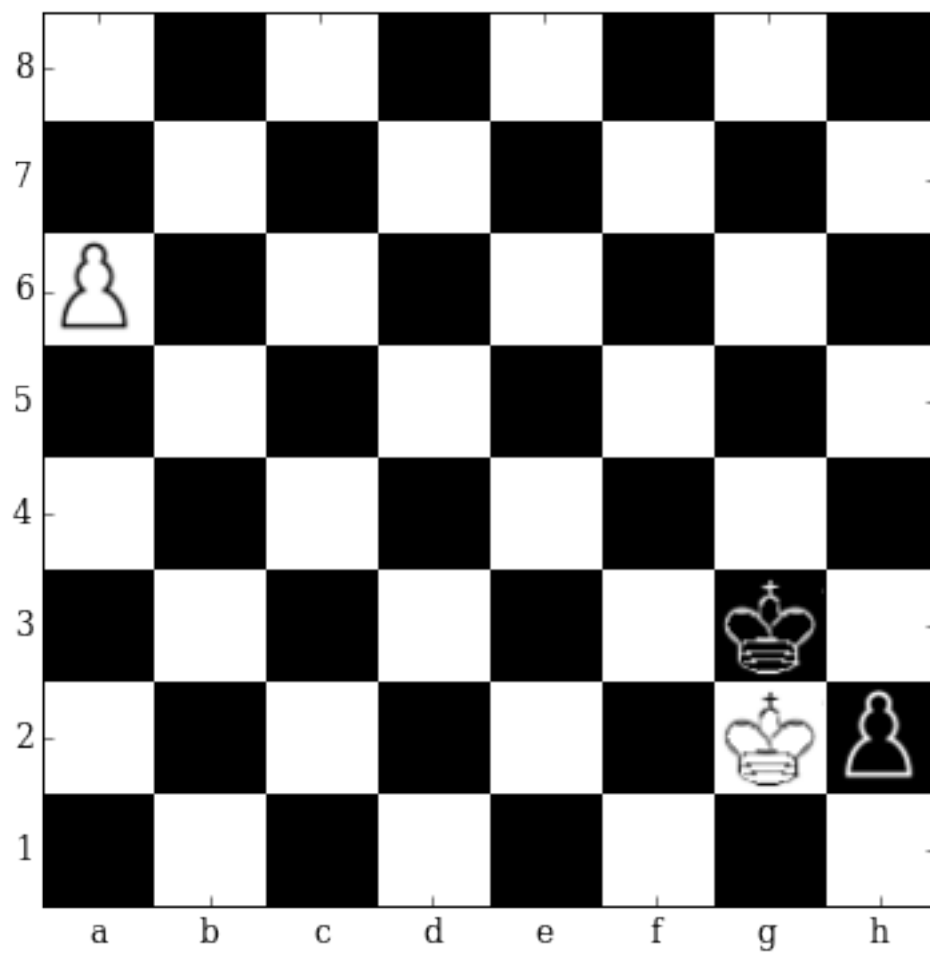
Current evaluation: -0.049778

Total 6 moves possible

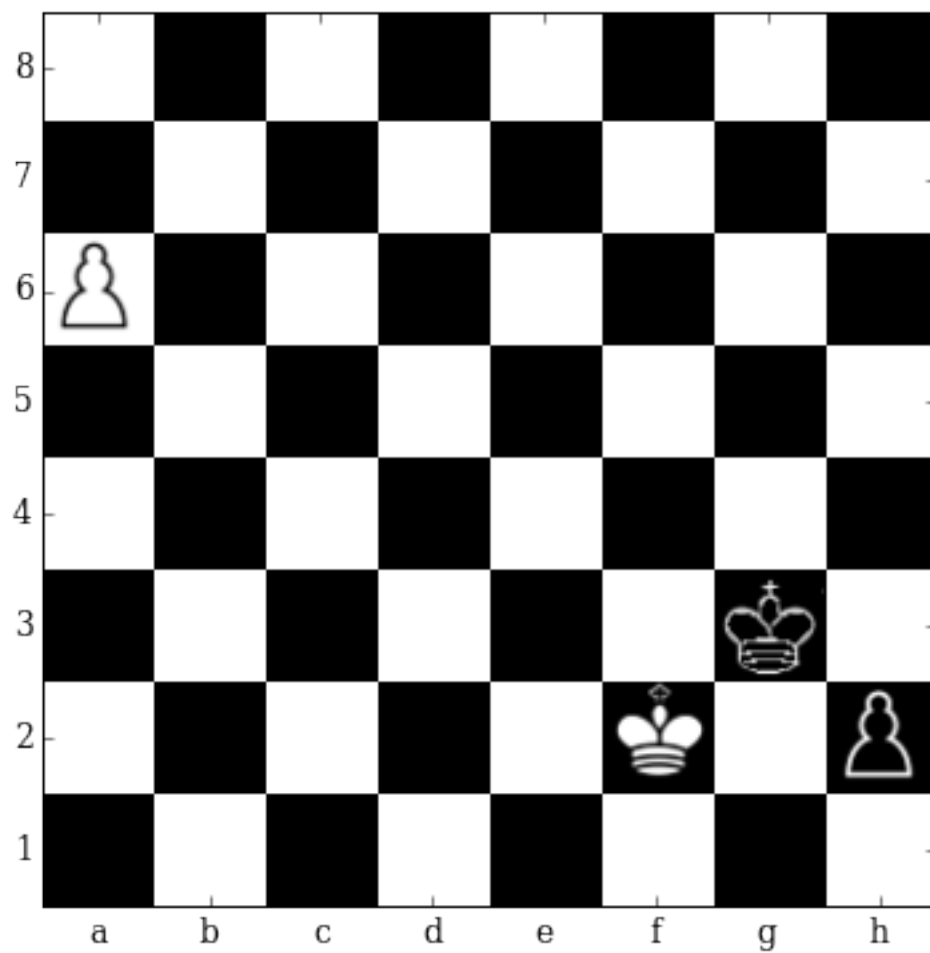
TOP 5 Moves



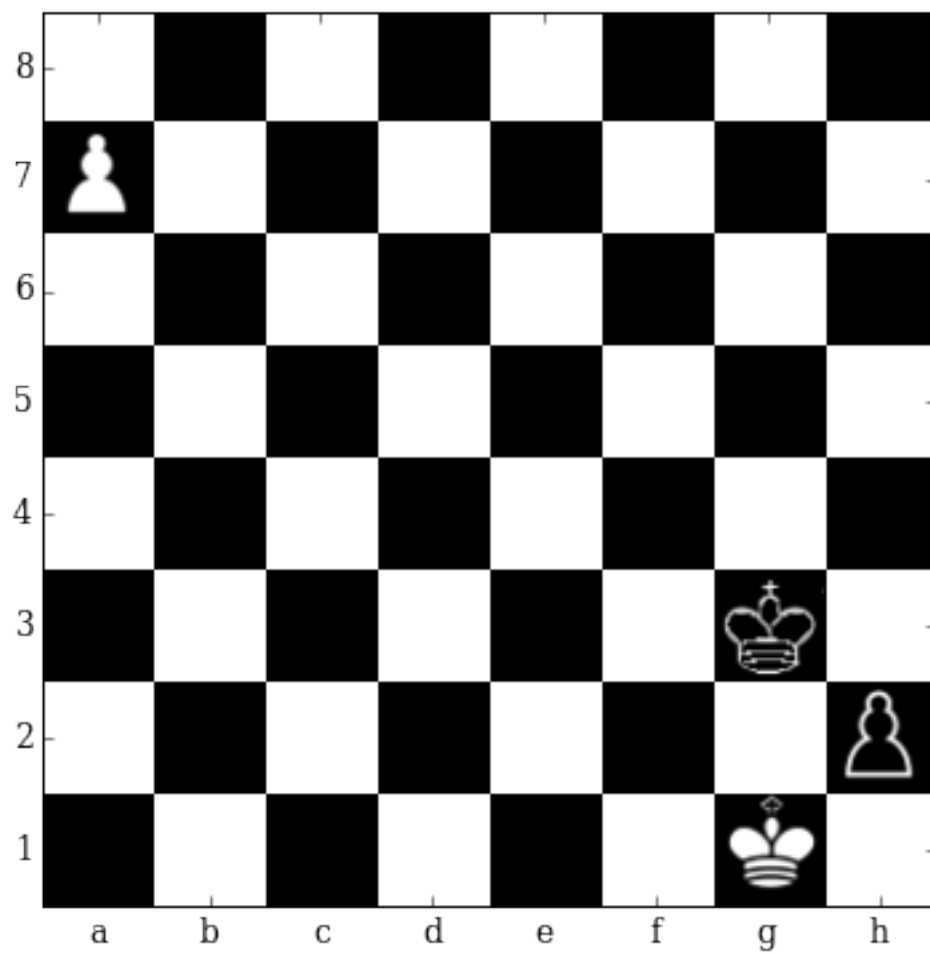
g1h2 0.0215898770839



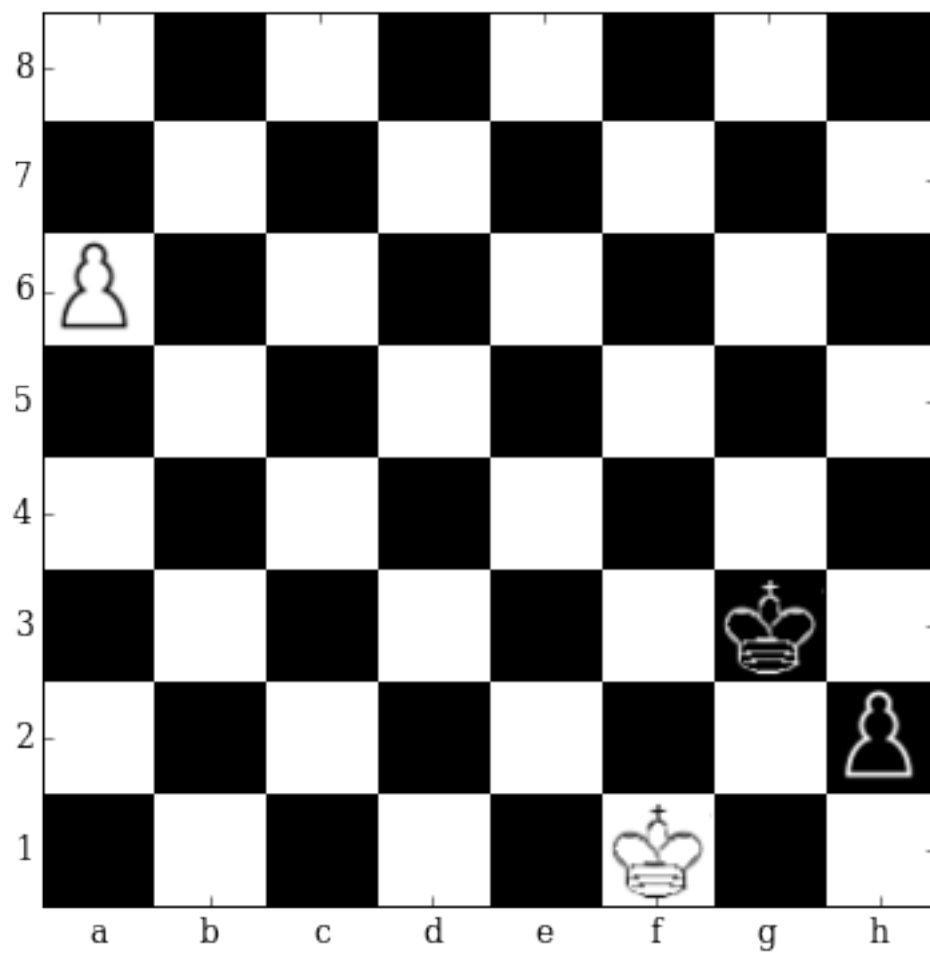
g1g2 0.00836602784693



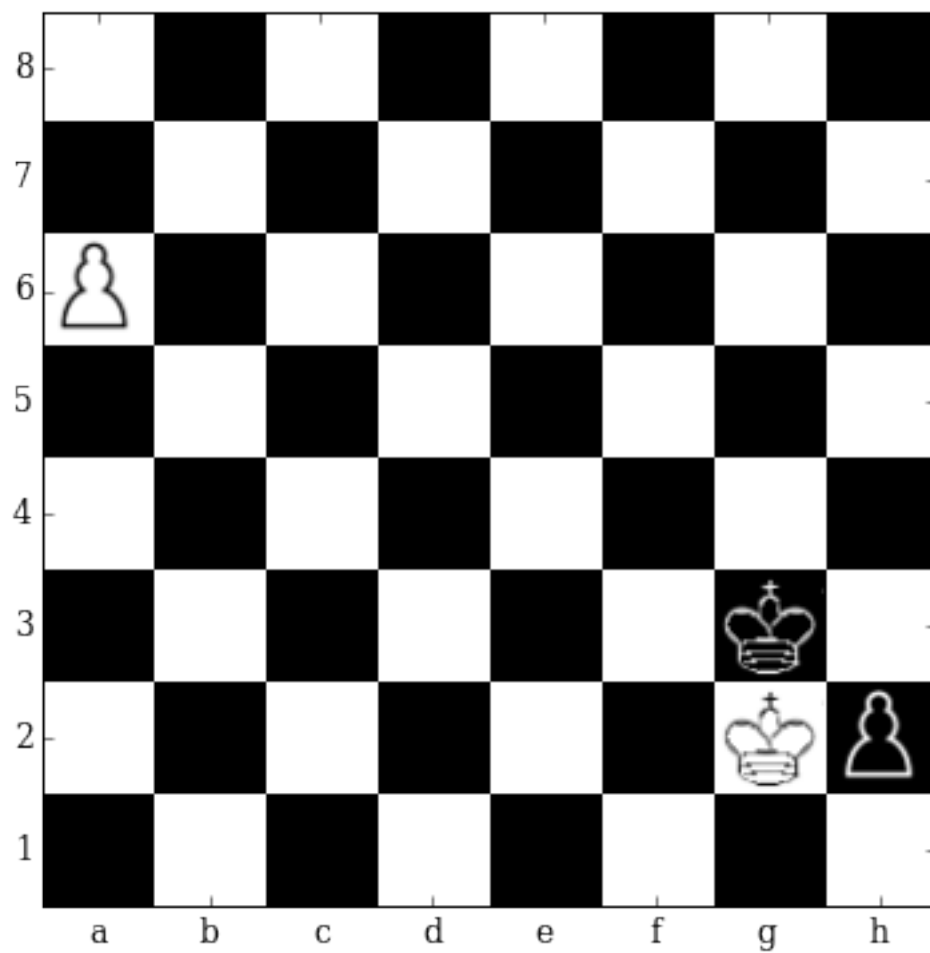
g1f2 -0.0188560783863



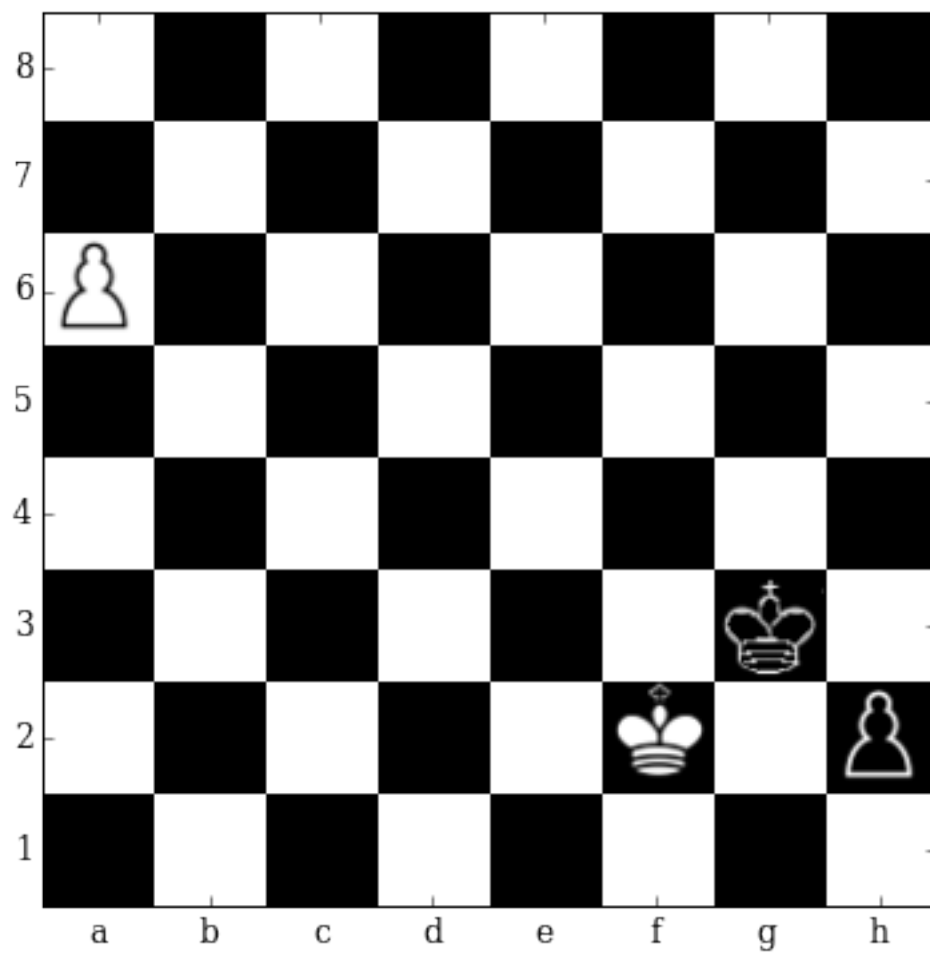
a6a7 -0.054150197655



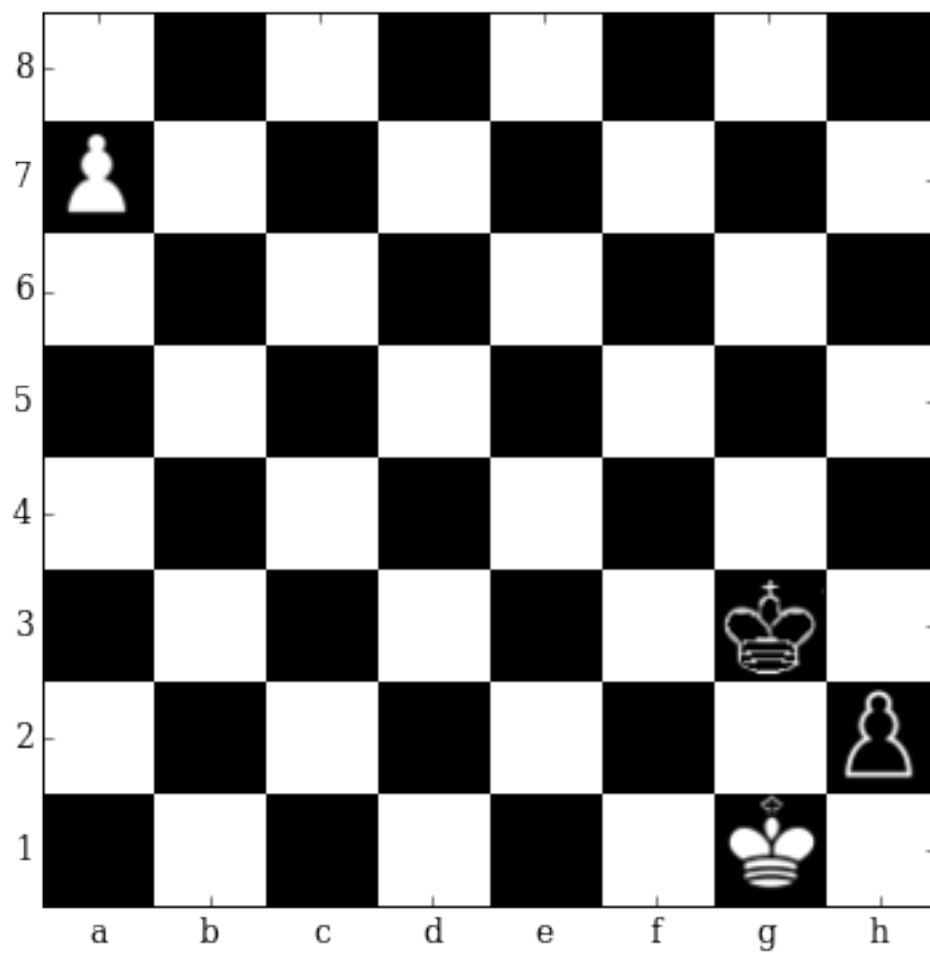
g1f1 -0.065742097795
WORST 5 Moves



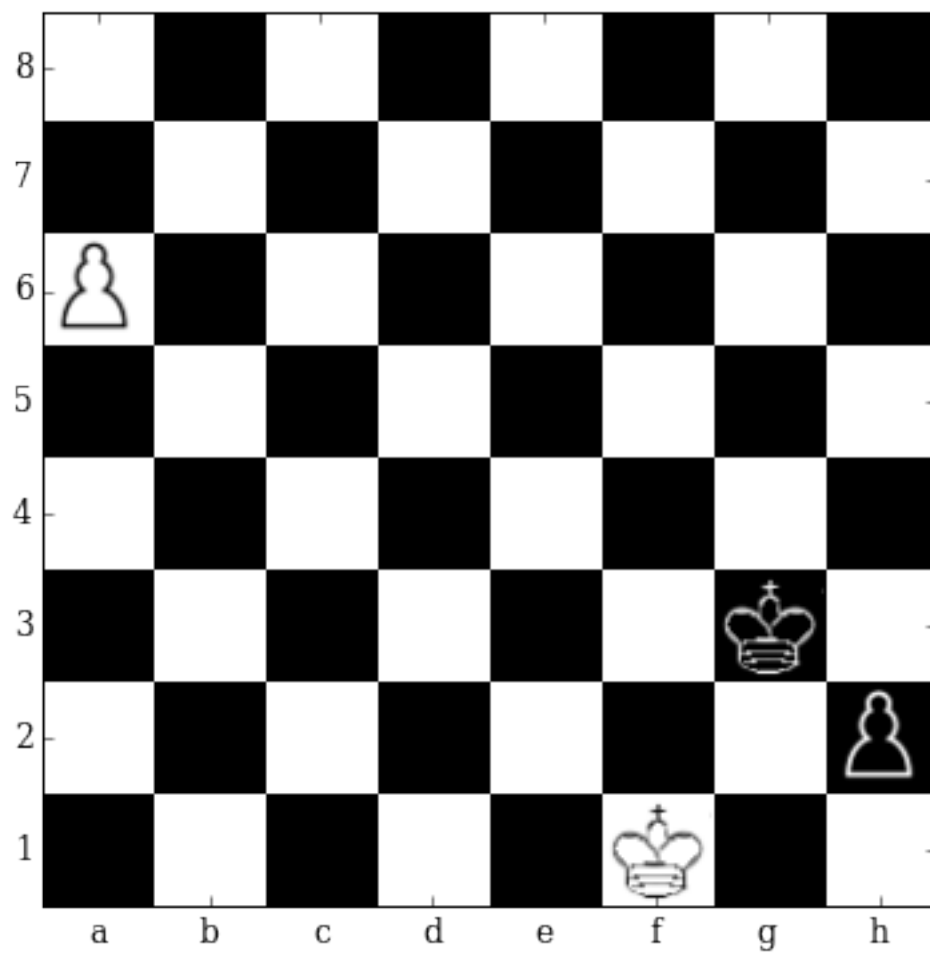
g1g2 0.00836602784693



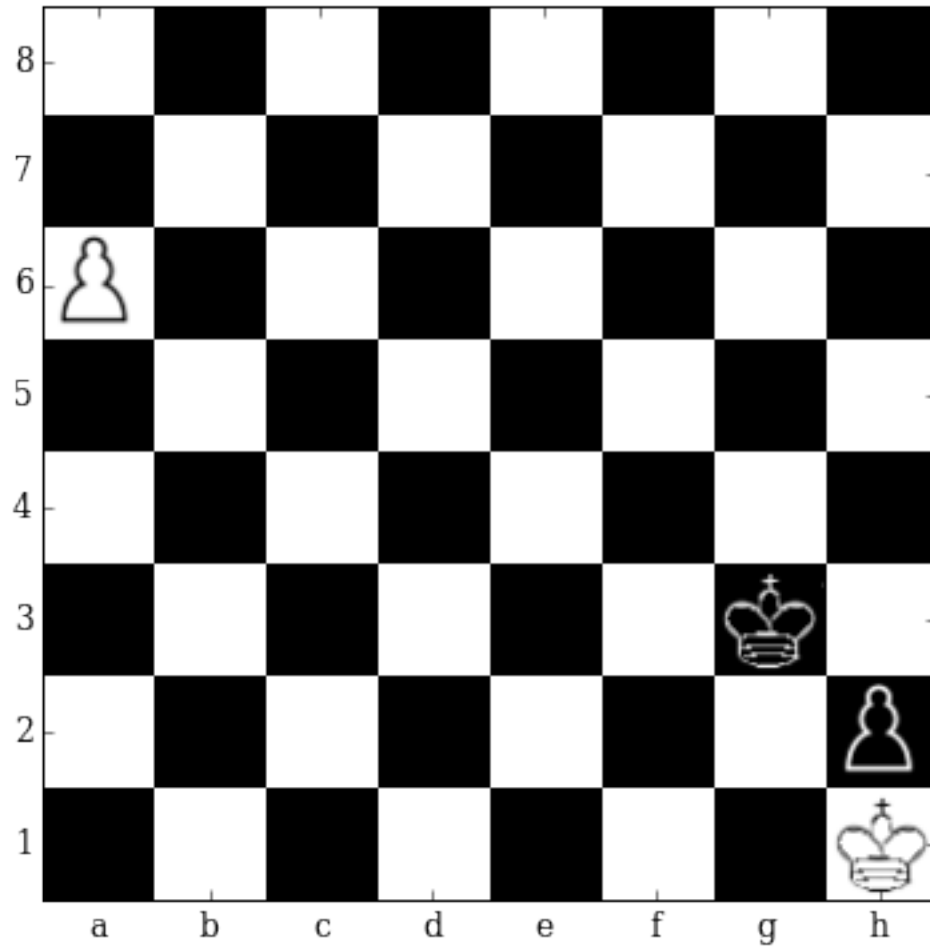
g1f2 -0.0188560783863



a6a7 -0.054150197655

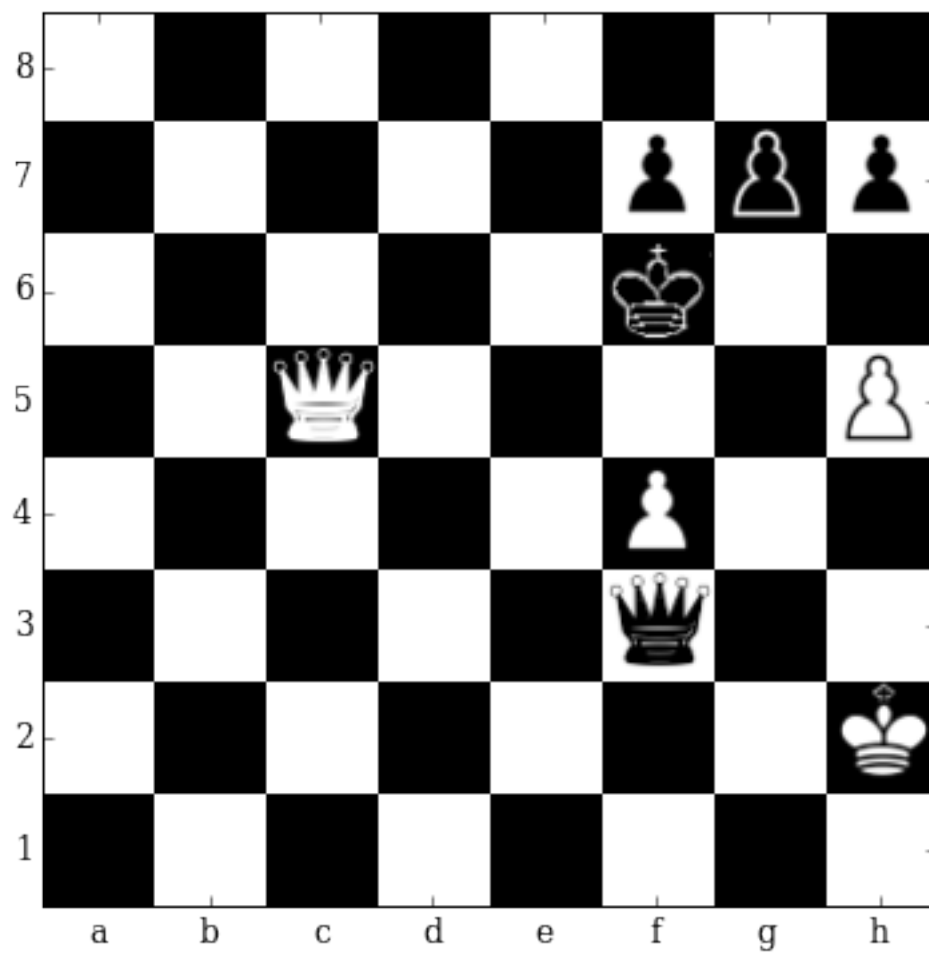


g1f1 -0.065742097795



g1h1 -0.0684899687767

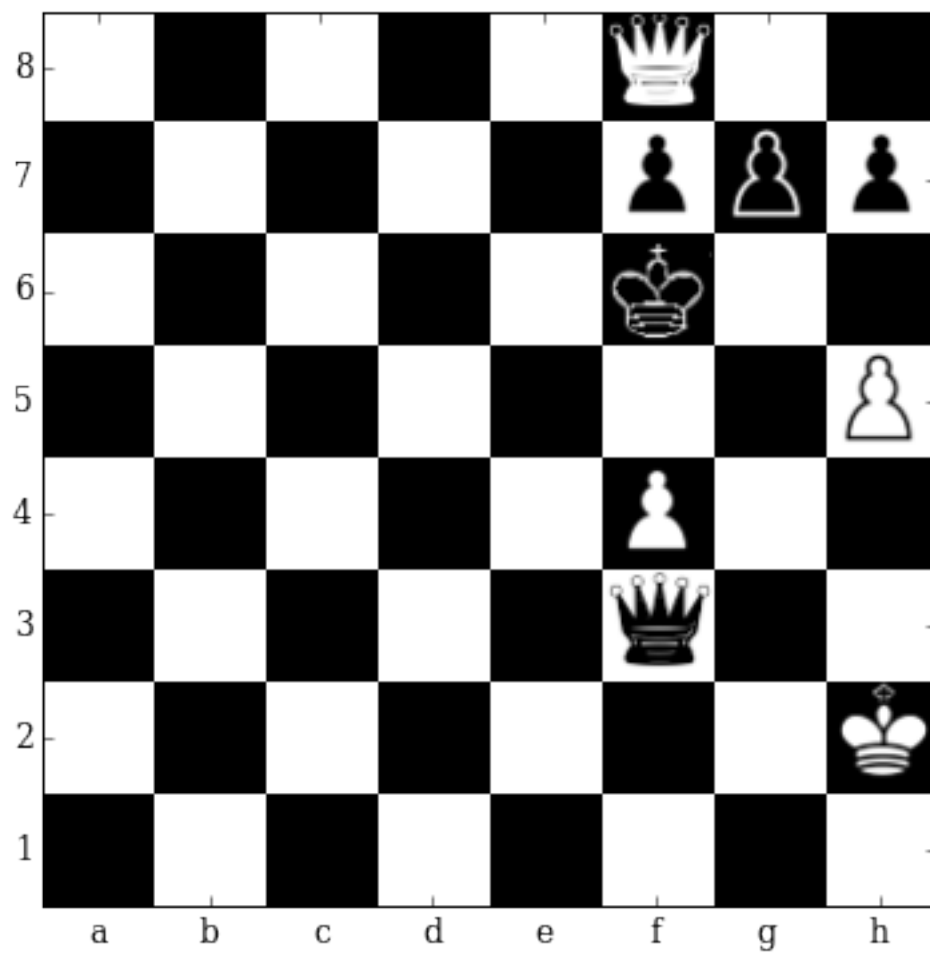
```
In [18]: '''
         Mate in 1
         '''
         fen='8/5ppp/5k2/2Q4P/5P2/5q2/7K/8 w - - 0 0'
         top_bottom_moves(fen)
```



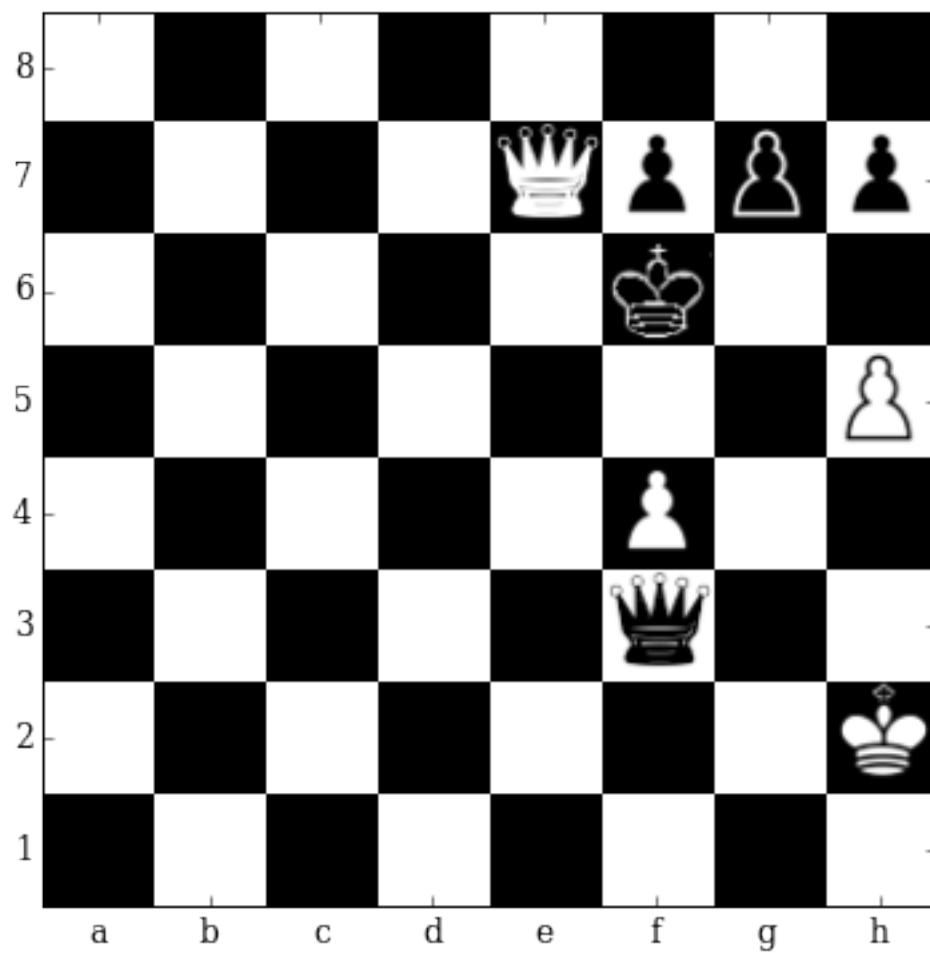
Current evaluation: -0.067688

Total 31 moves possible

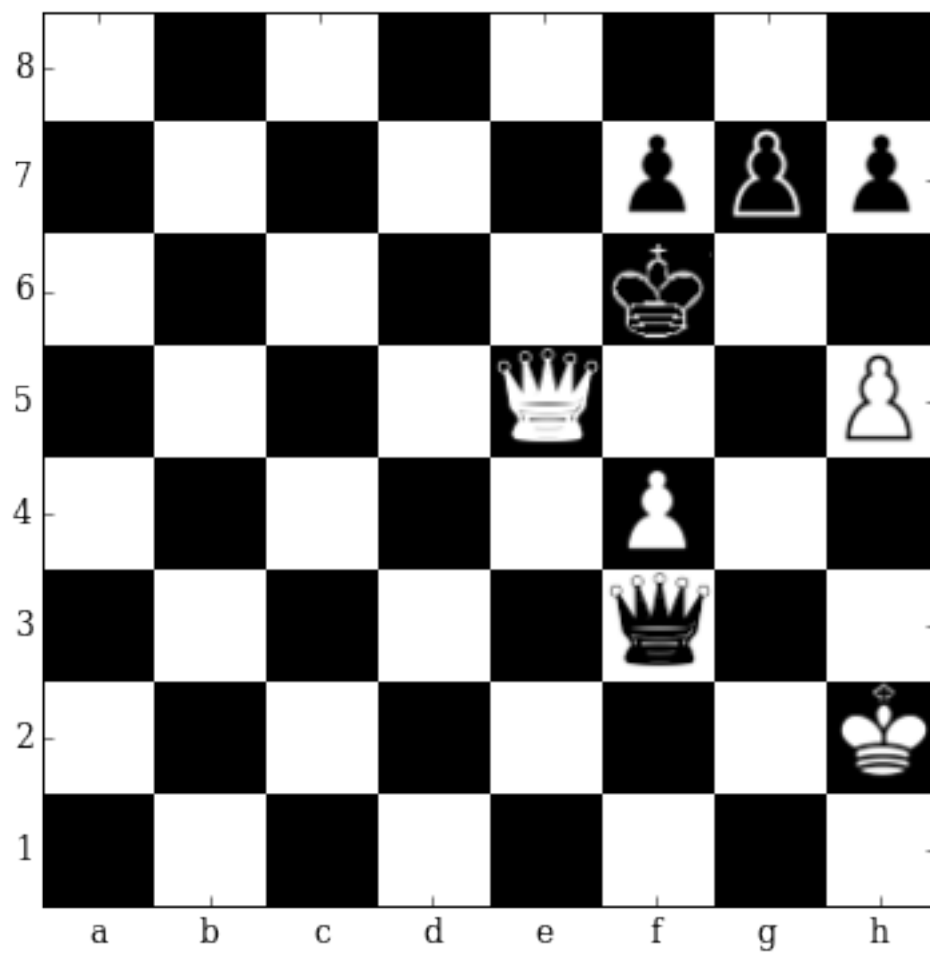
TOP 5 Moves



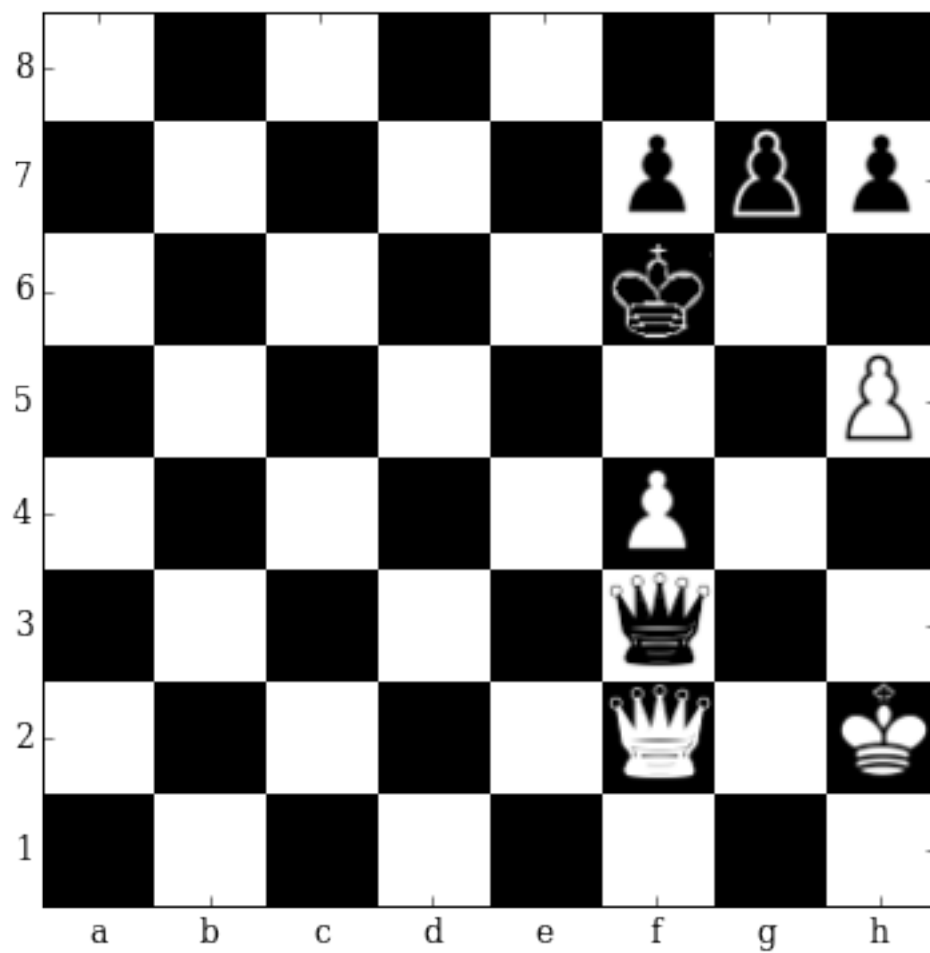
c5f8 0.0379827916622



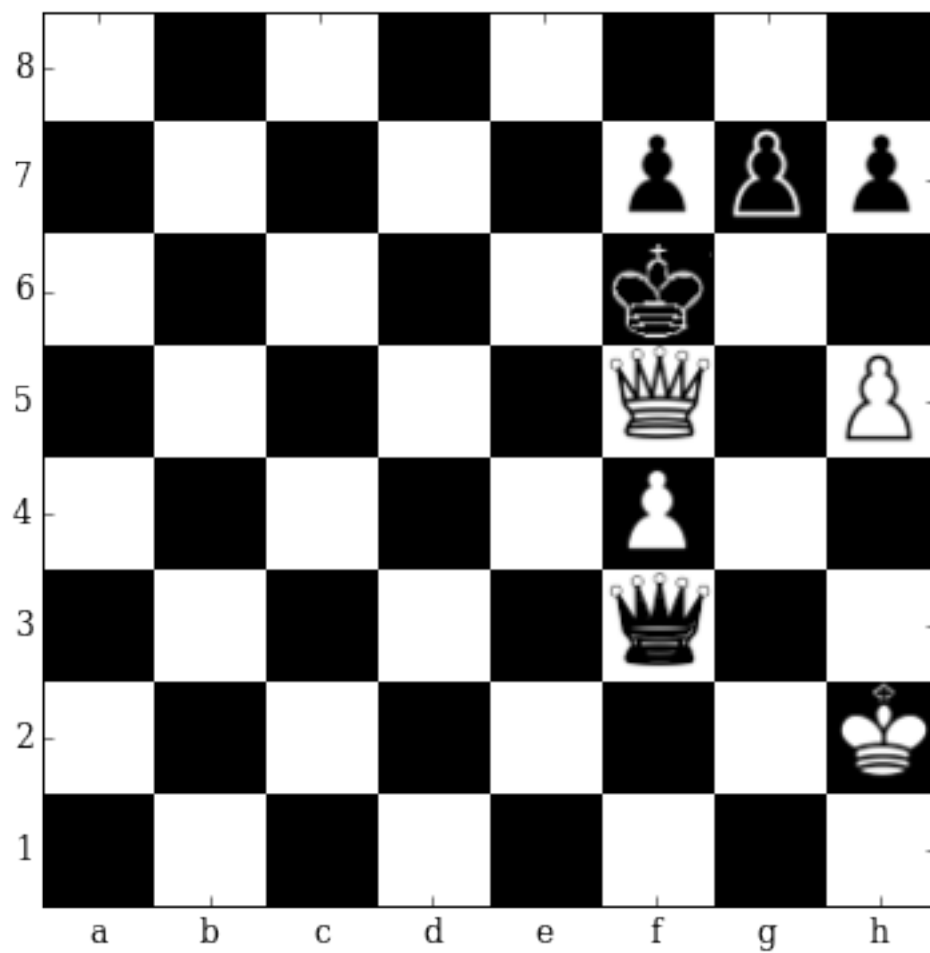
c5e7 0.028200475499



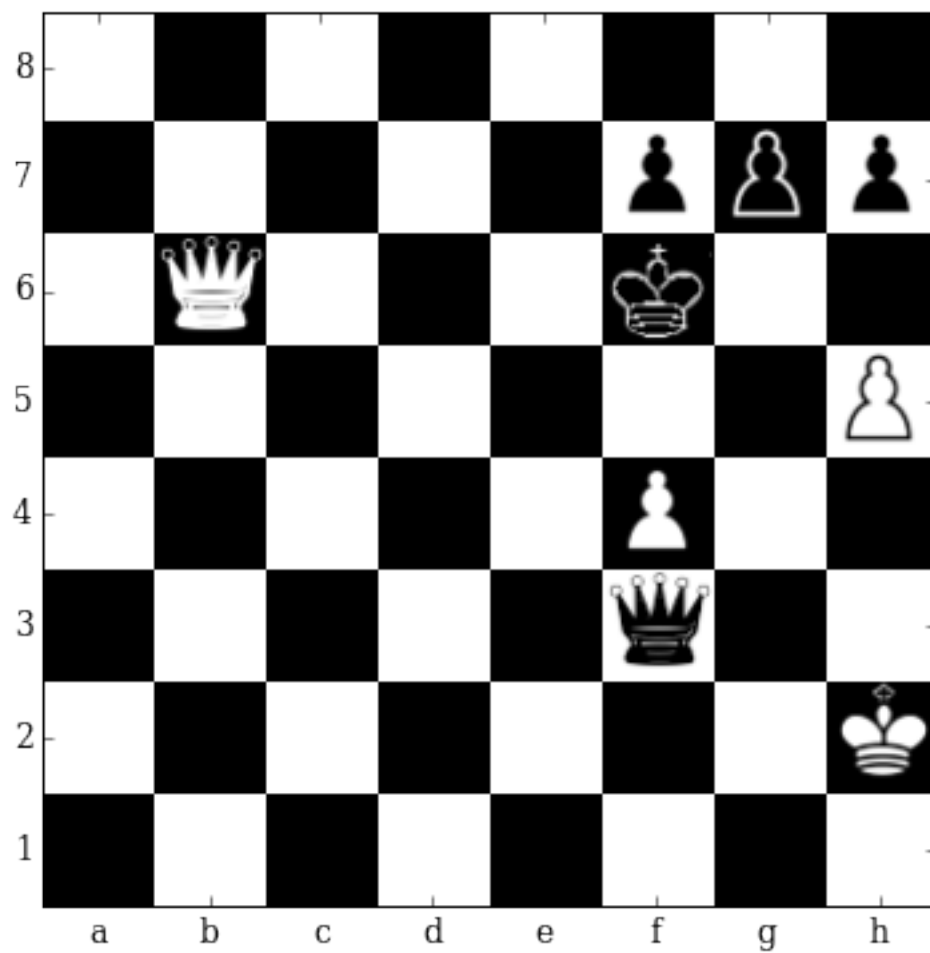
c5e5 -0.0355458073318



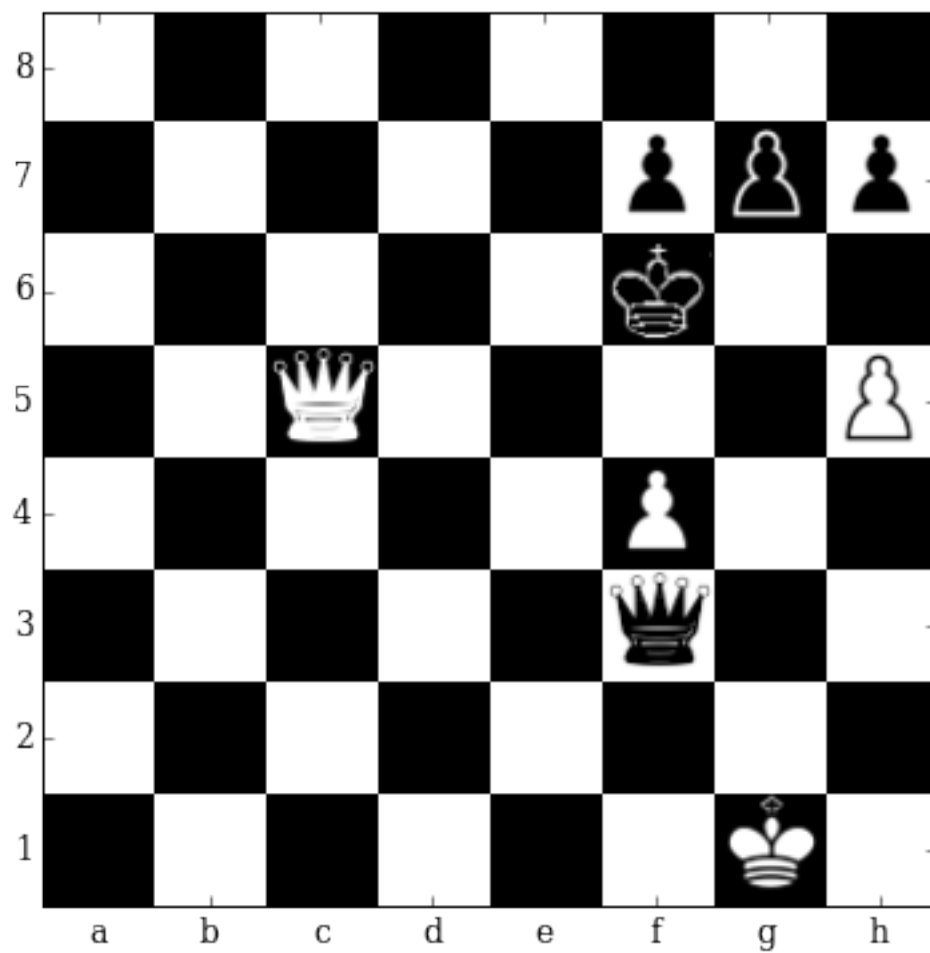
c5f2 -0.0388837084174



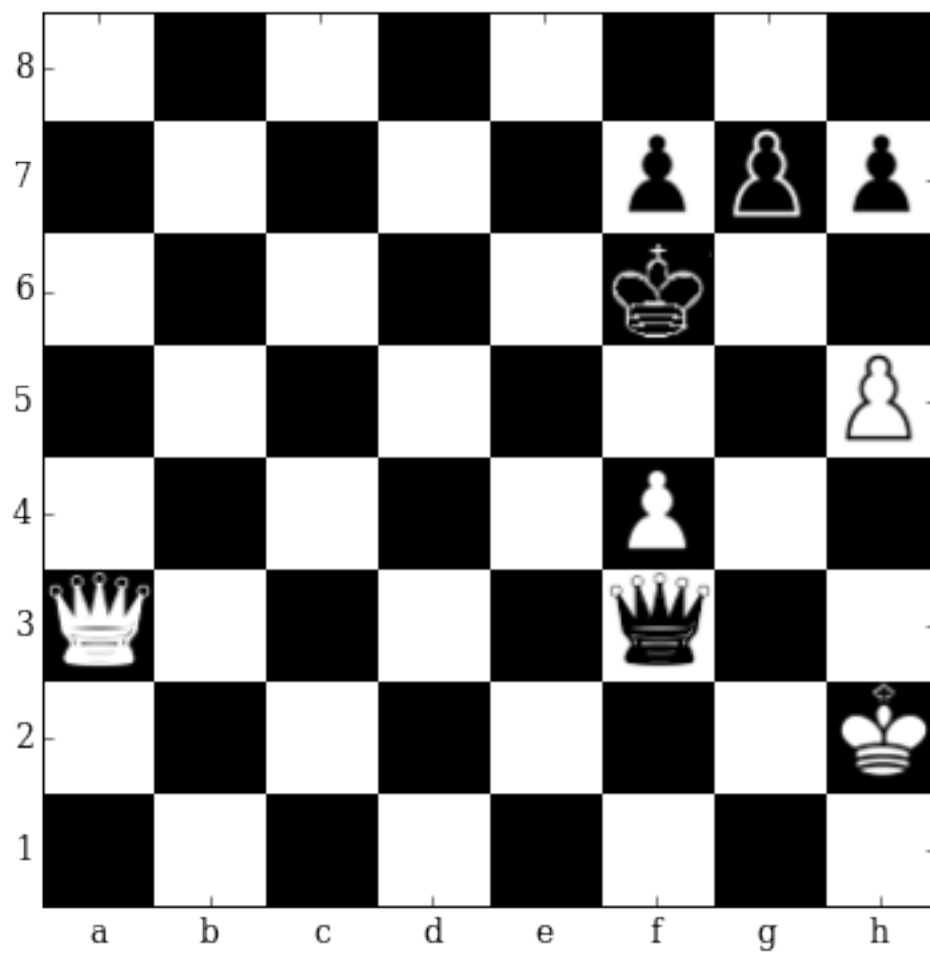
c5f5 -0.0413541197777
 WORST 5 Moves



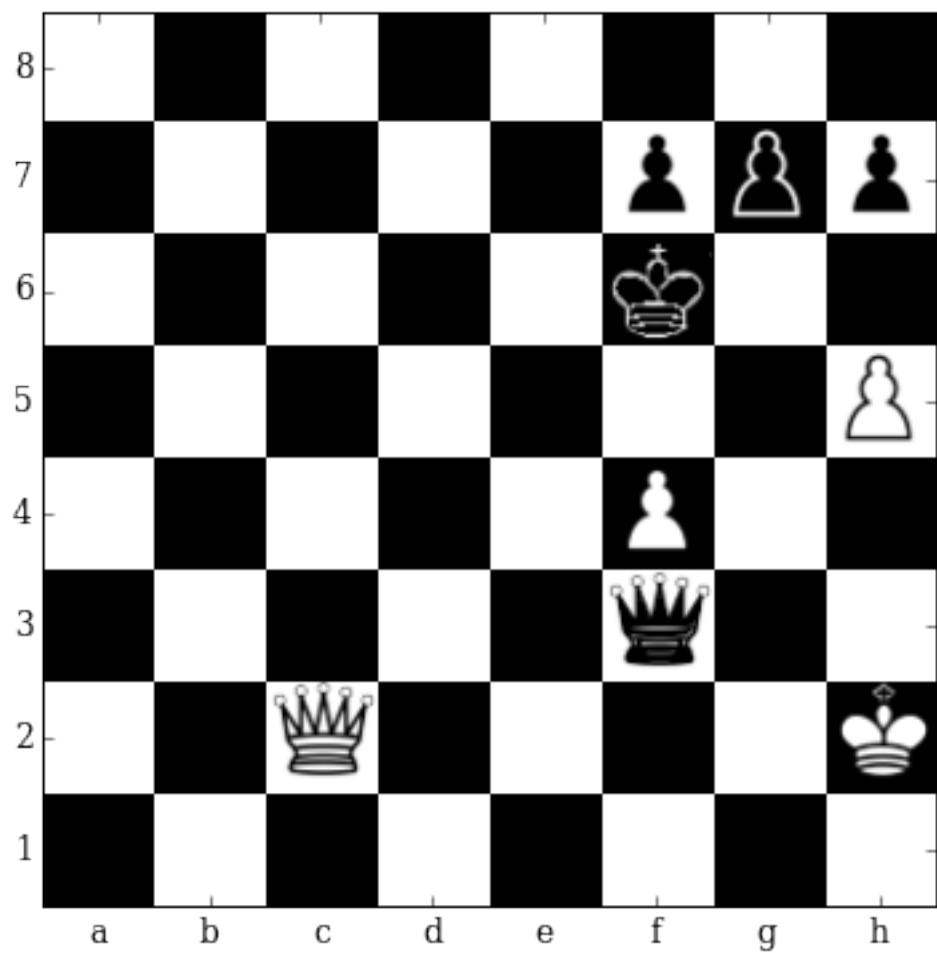
c5b6 -0.0826028212905



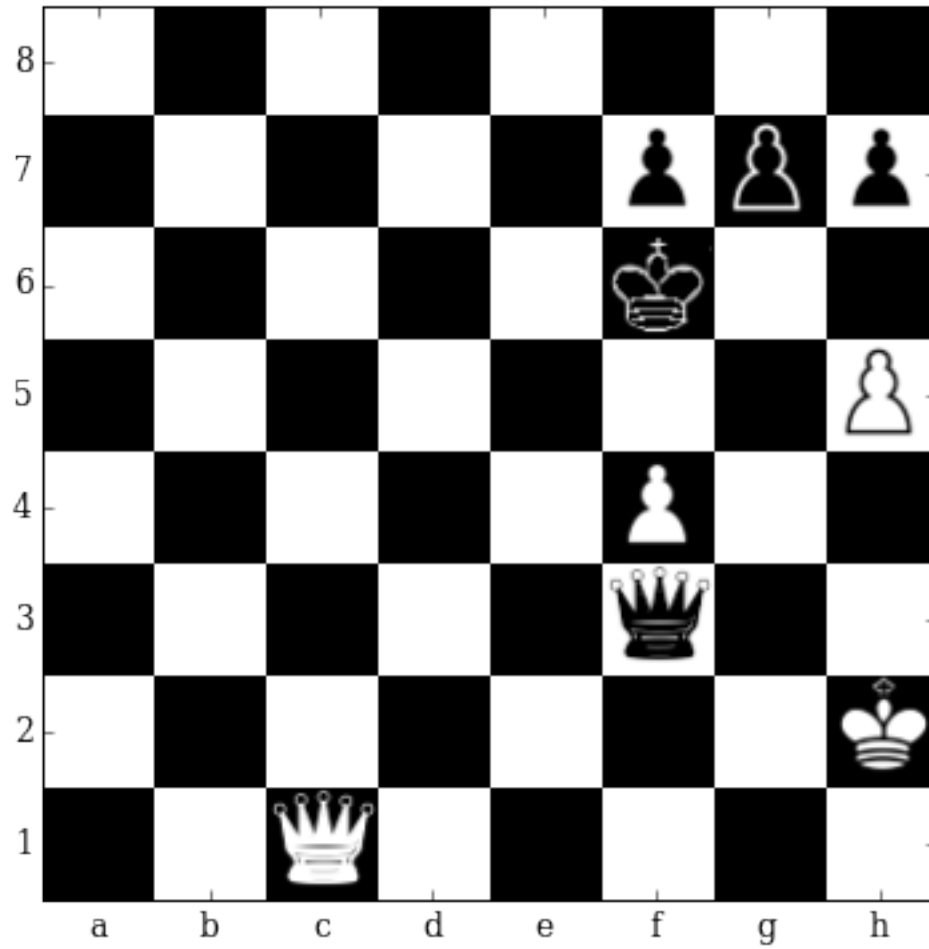
h2g1 -0.0835127830505



c5a3 -0.0964041724801



c5c2 -0.111014157534



c5c1 -0.129943683743

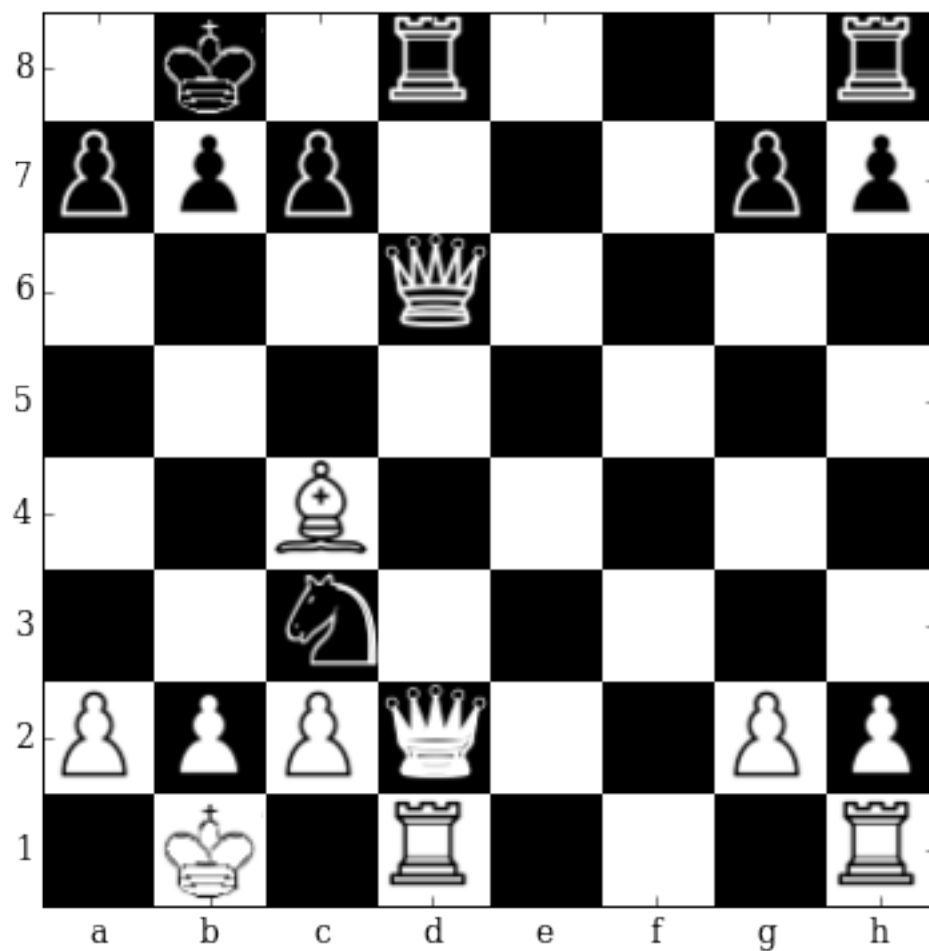
In [19]: '''

Check and fork by the knight

'''

fen='1k1r3r/ppp3pp/3q4/8/2B5/2n5/PPPQ2PP/1K1R3R w - - 0 0'

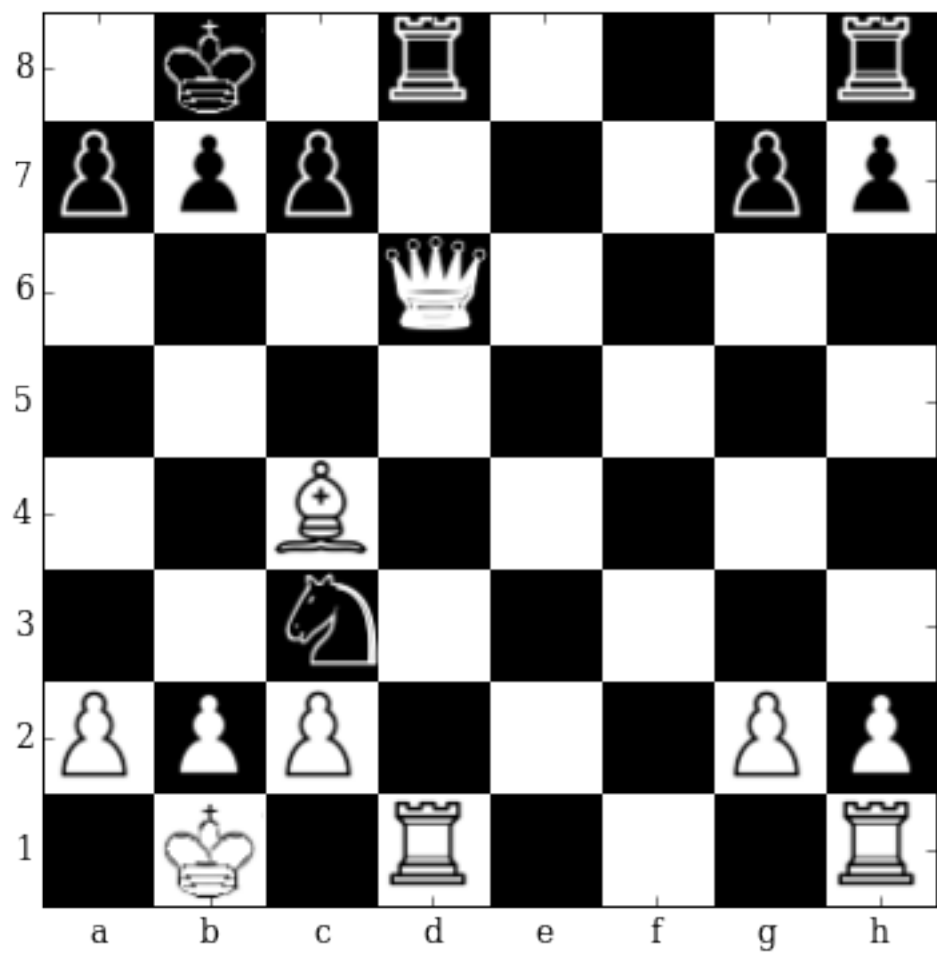
top_bottom_moves(fen)



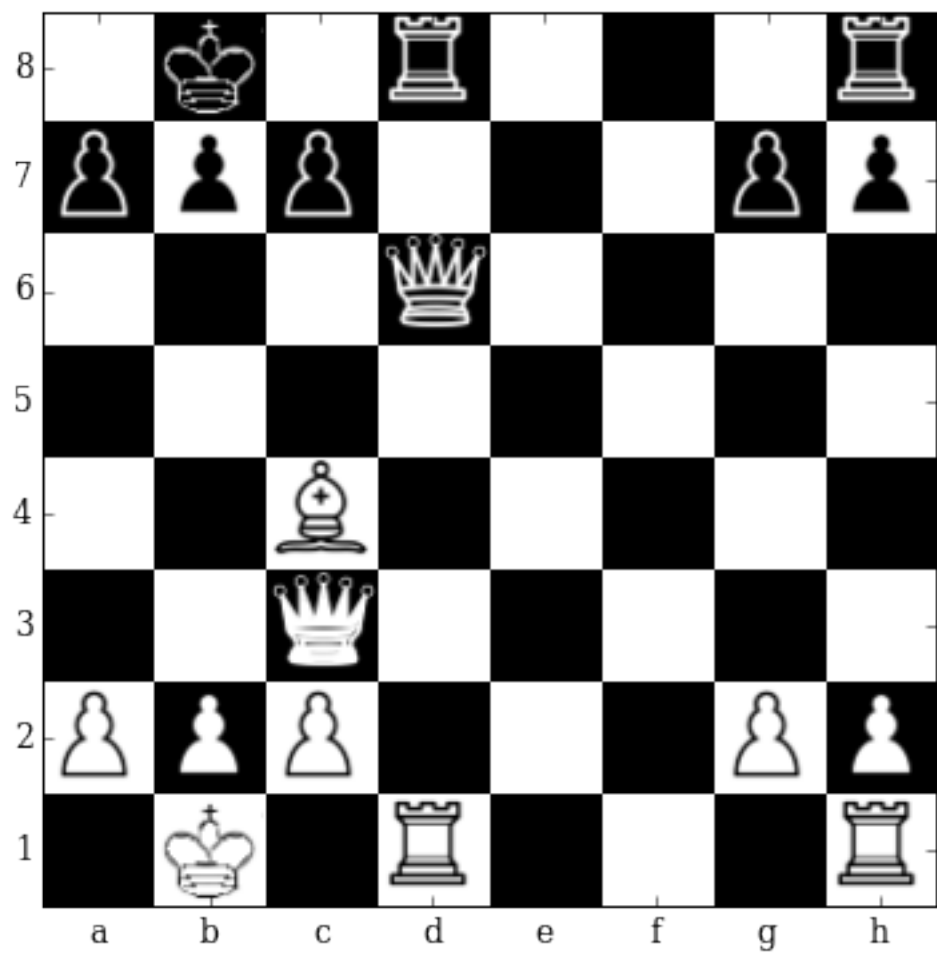
Current evaluation: -0.007698

Total 41 moves possible

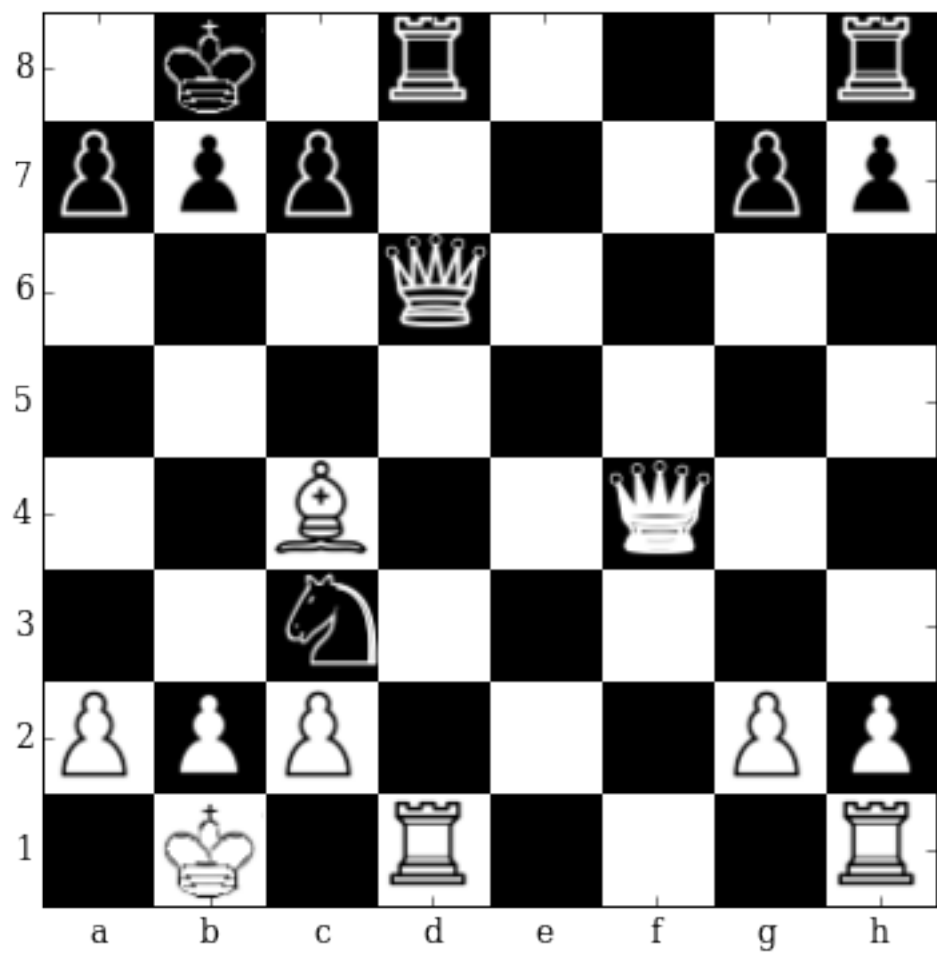
TOP 5 Moves



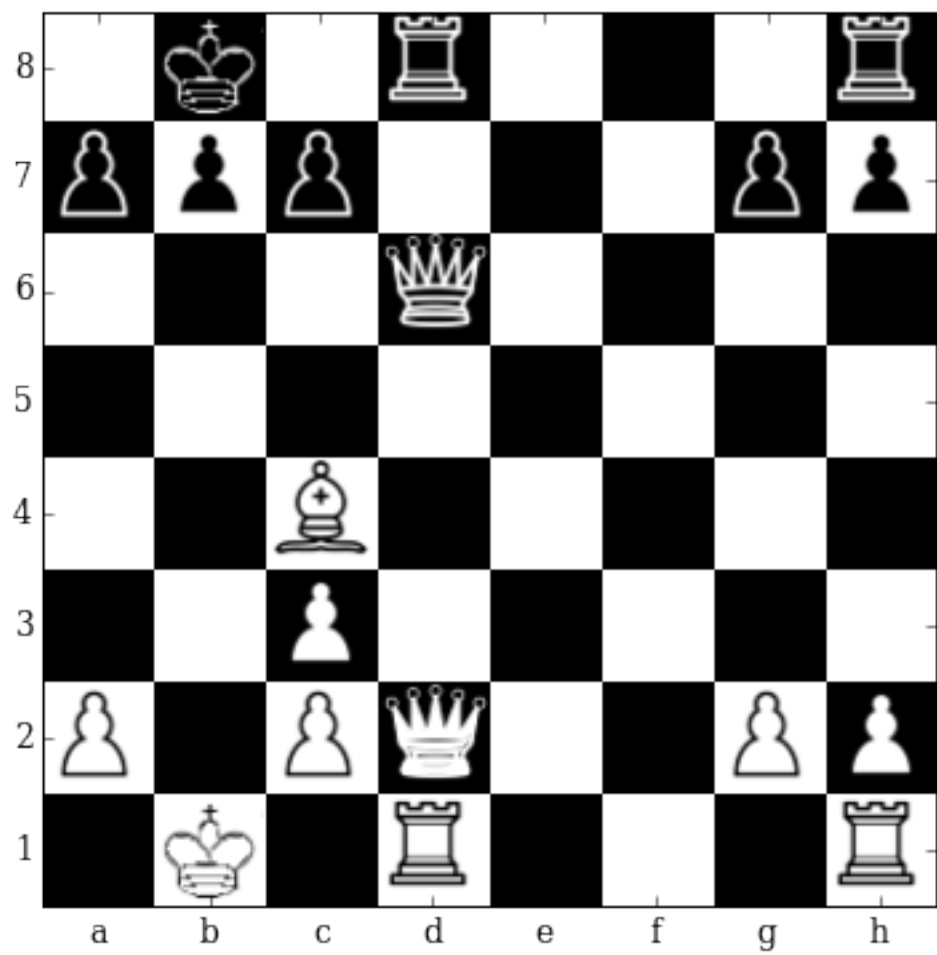
d2d6 0.139244303107



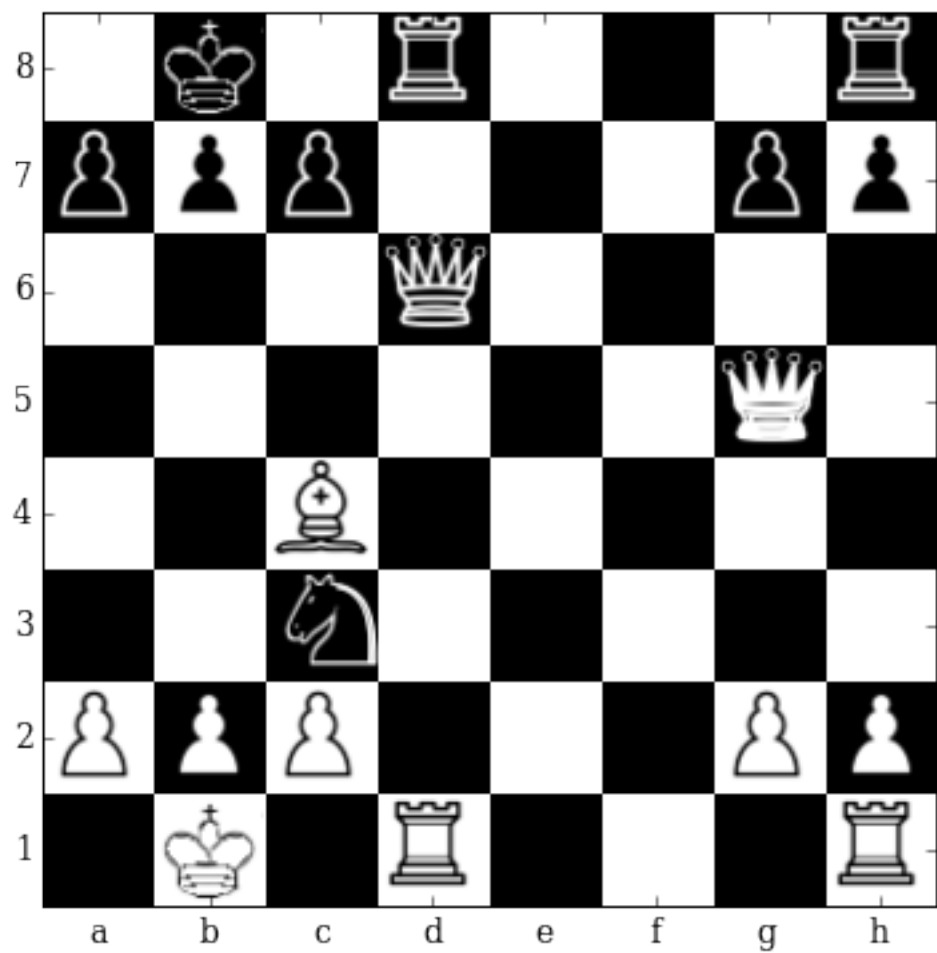
d2c3 0.0400848388672



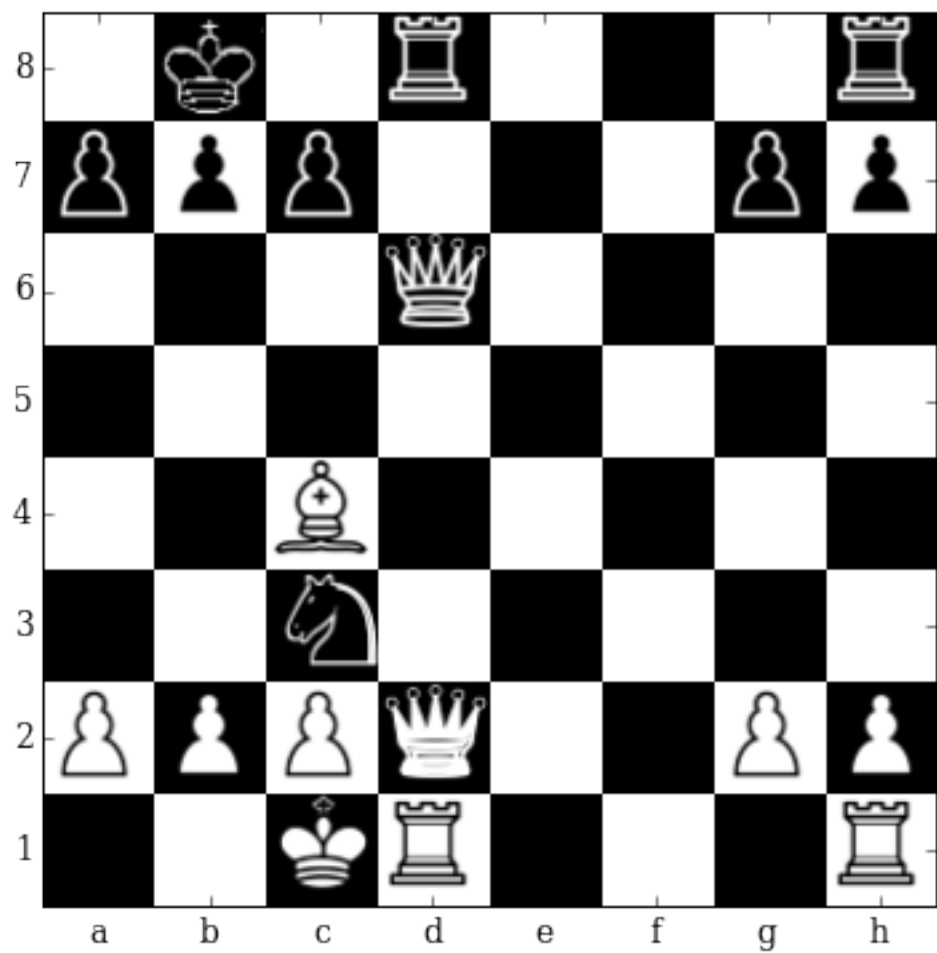
d2f4 0.0280776247382



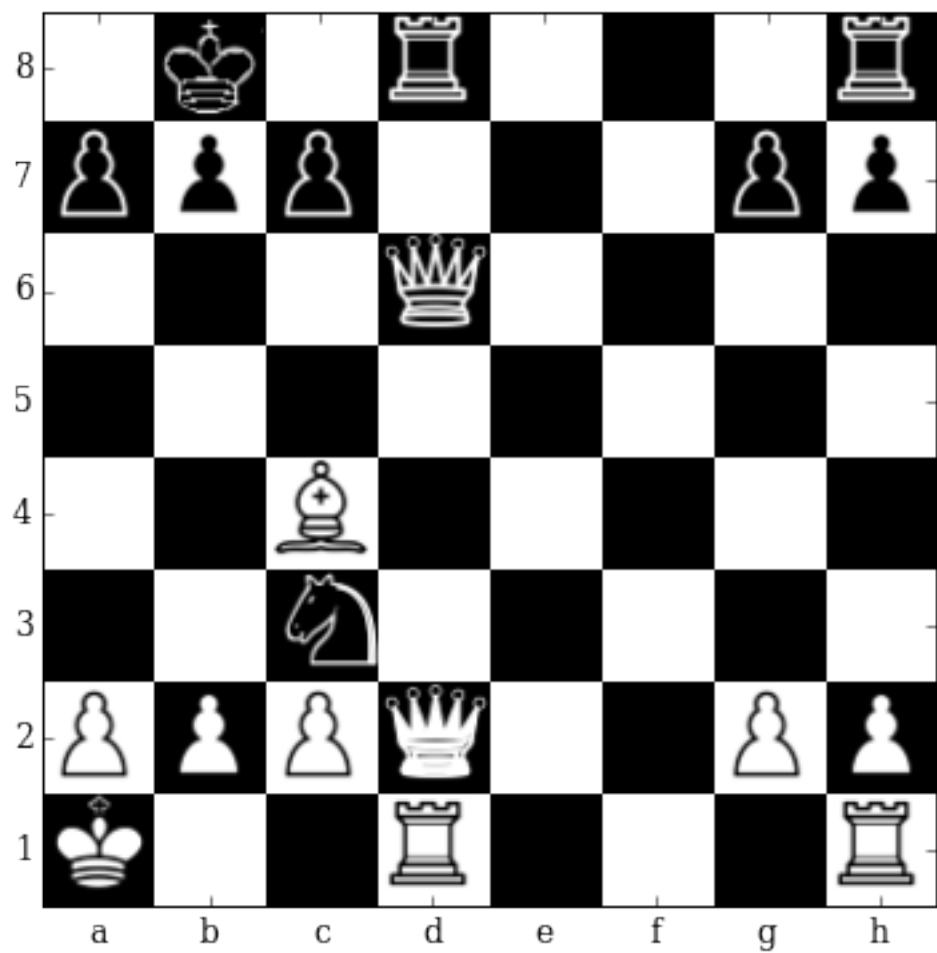
b2c3 0.0228184554726



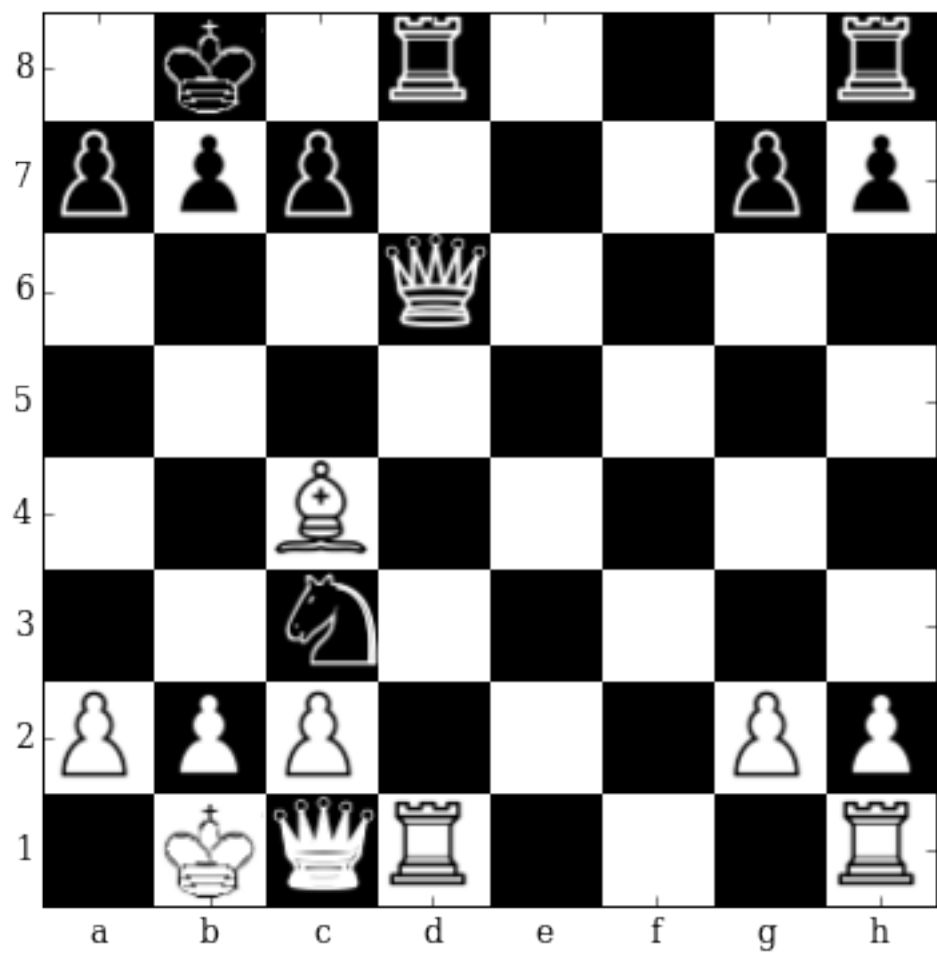
d2g5 0.0207833554596
 WORST 5 Moves



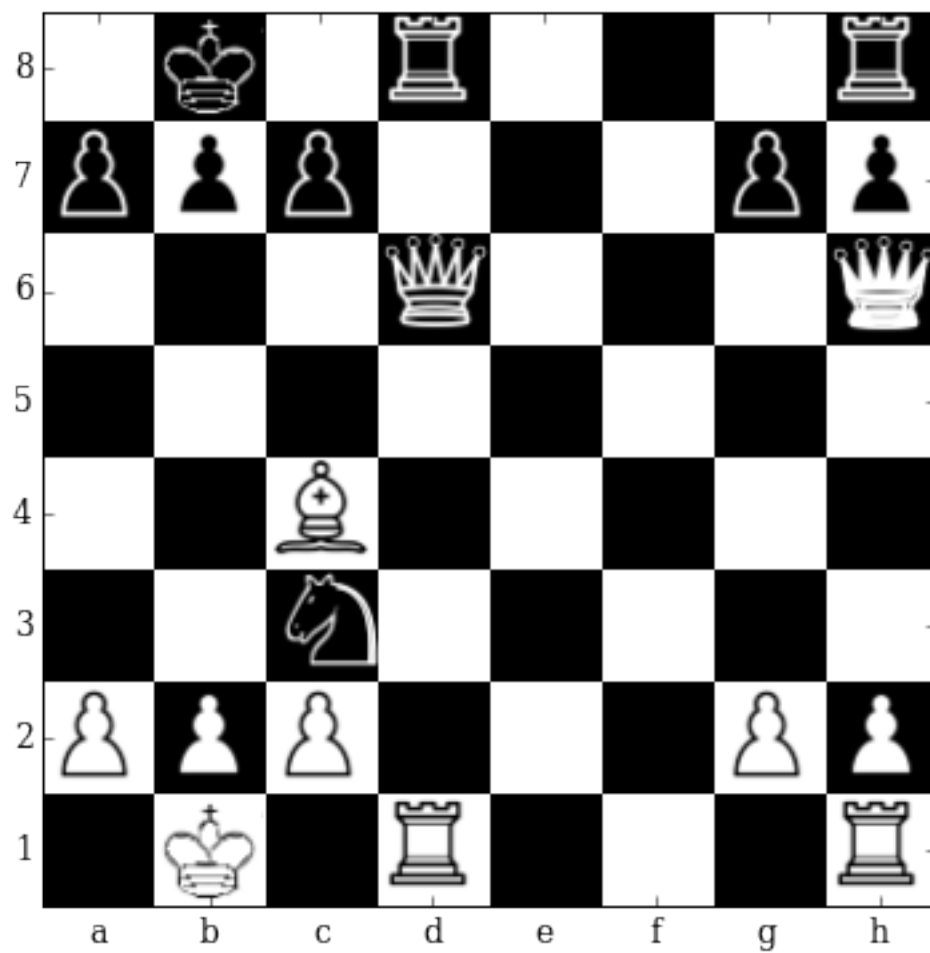
b1c1 -0.0201652310789



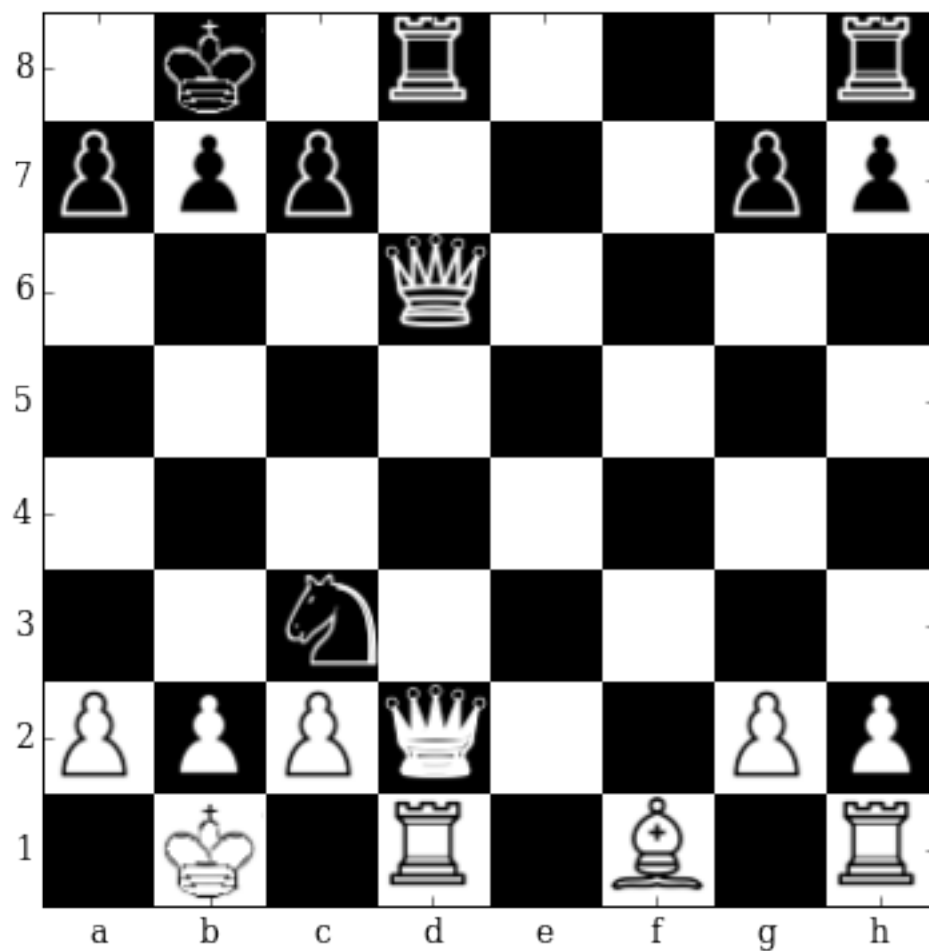
b1a1 -0.0206535439938



d2c1 -0.0241448543966



d2h6 -0.0248840861022



c4f1 -0.0262713693082

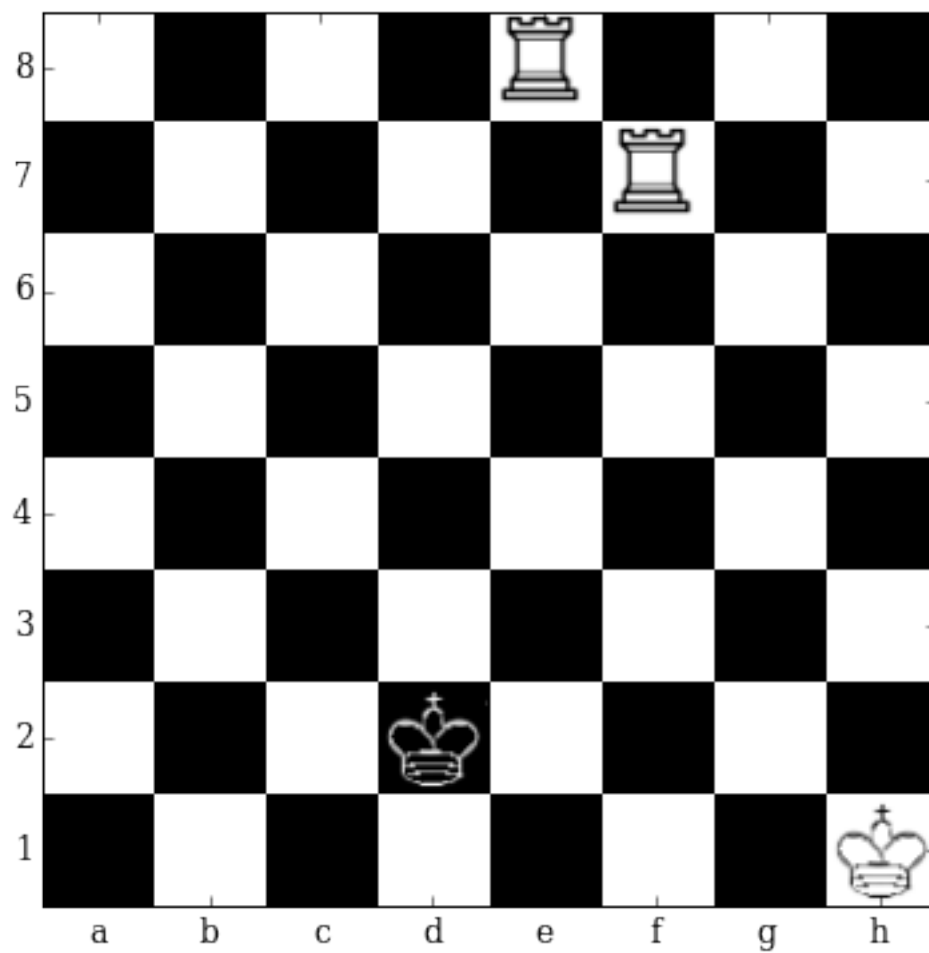
In [20]: '''

Pushing the broom

'''

fen='4R3/5R2/8/8/8/8/3k4/7K w - - 0 0'

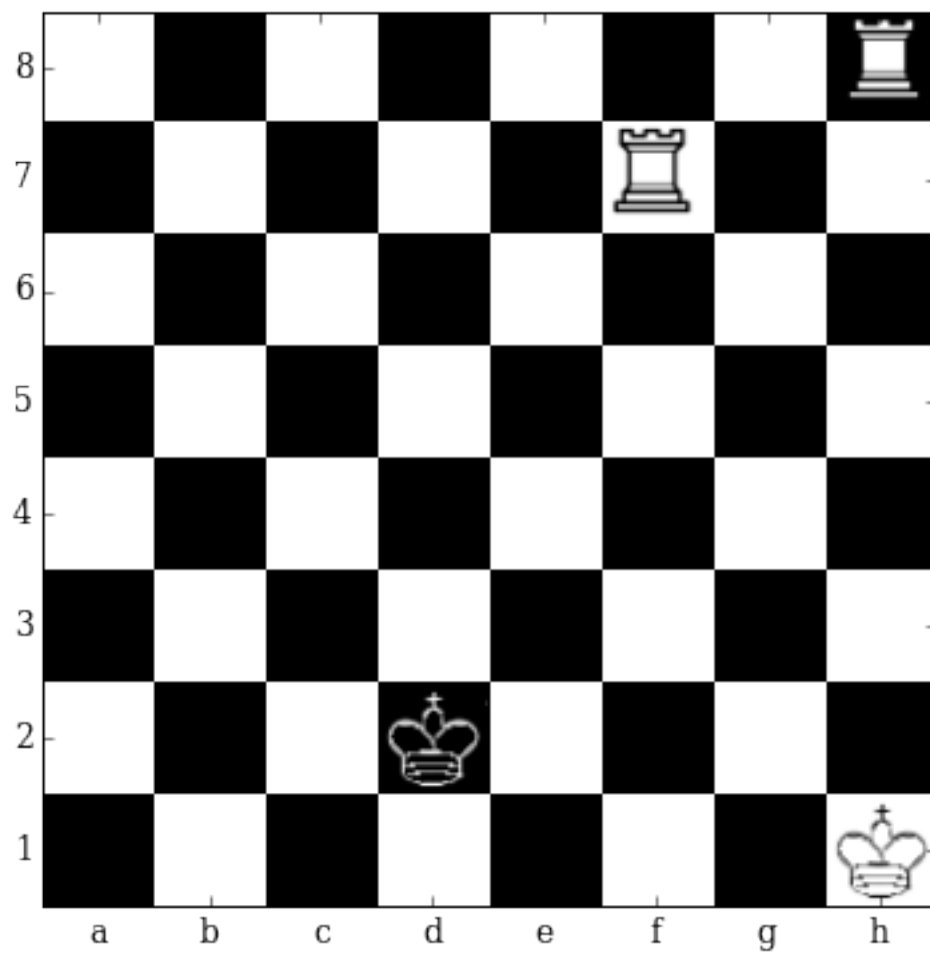
top_bottom_moves(fen)



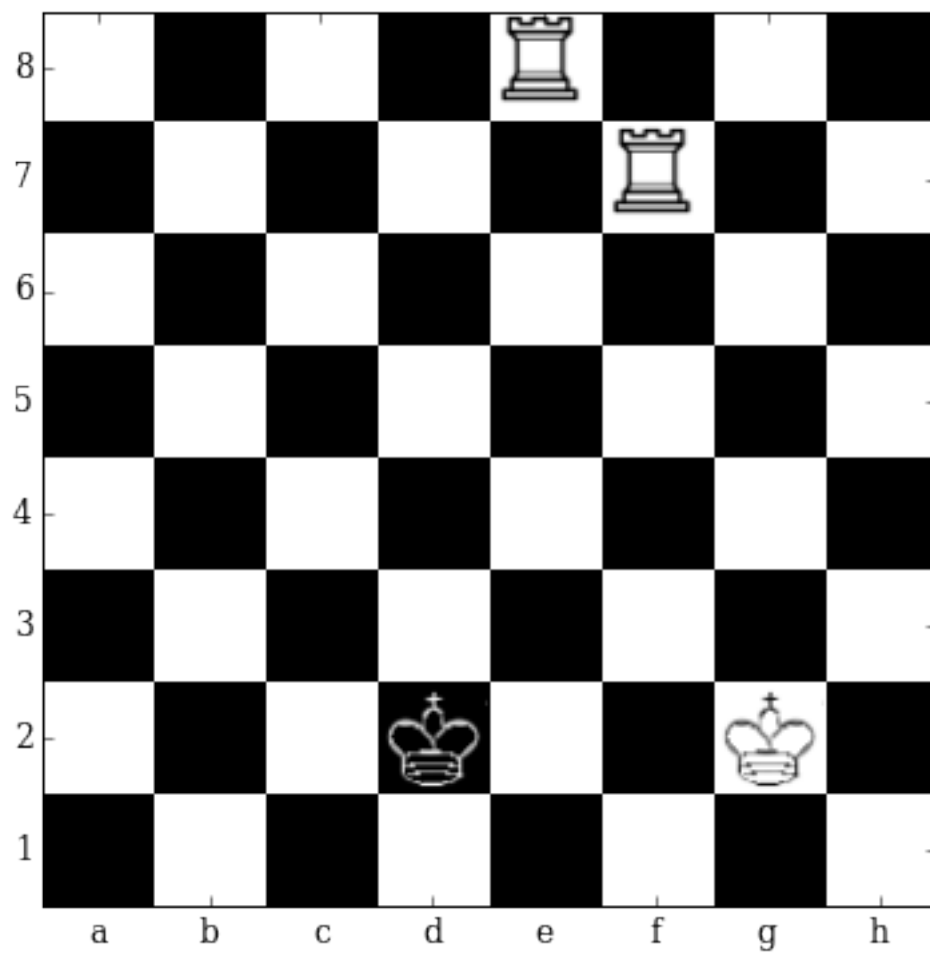
Current evaluation: 0.227653

Total 31 moves possible

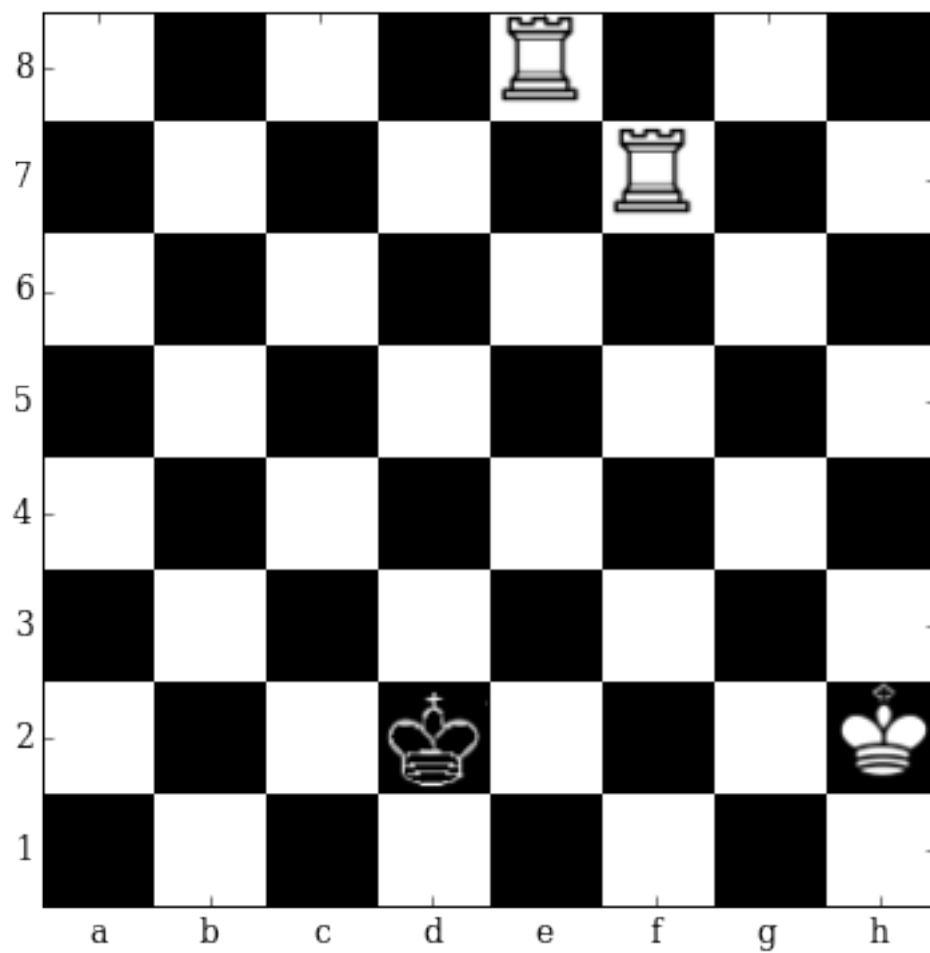
TOP 5 Moves



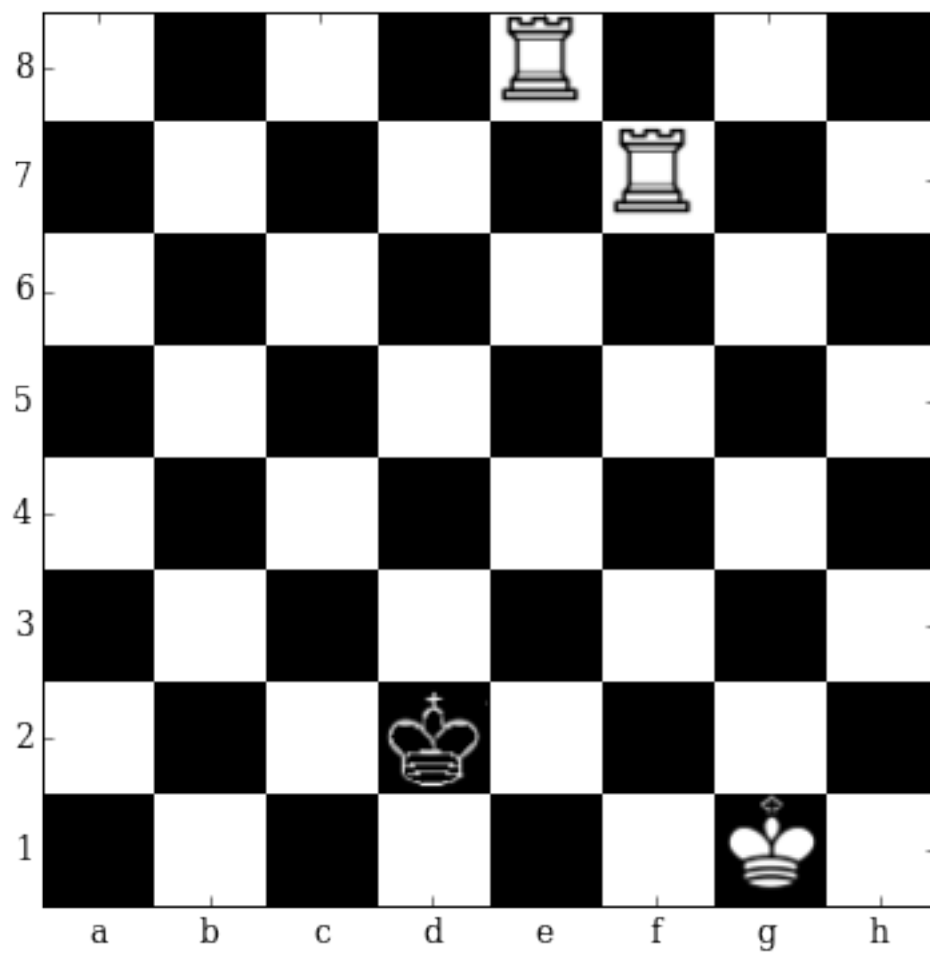
e8h8 0.307574003935



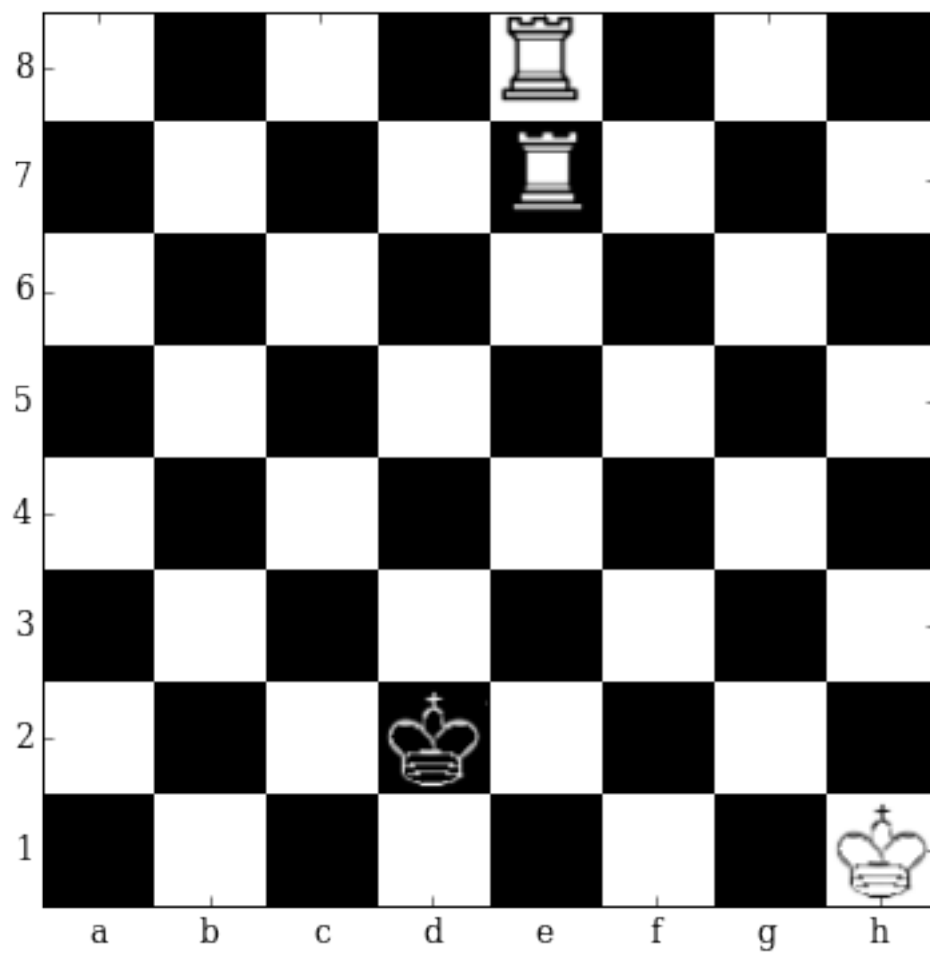
h1g2 0.279015421867



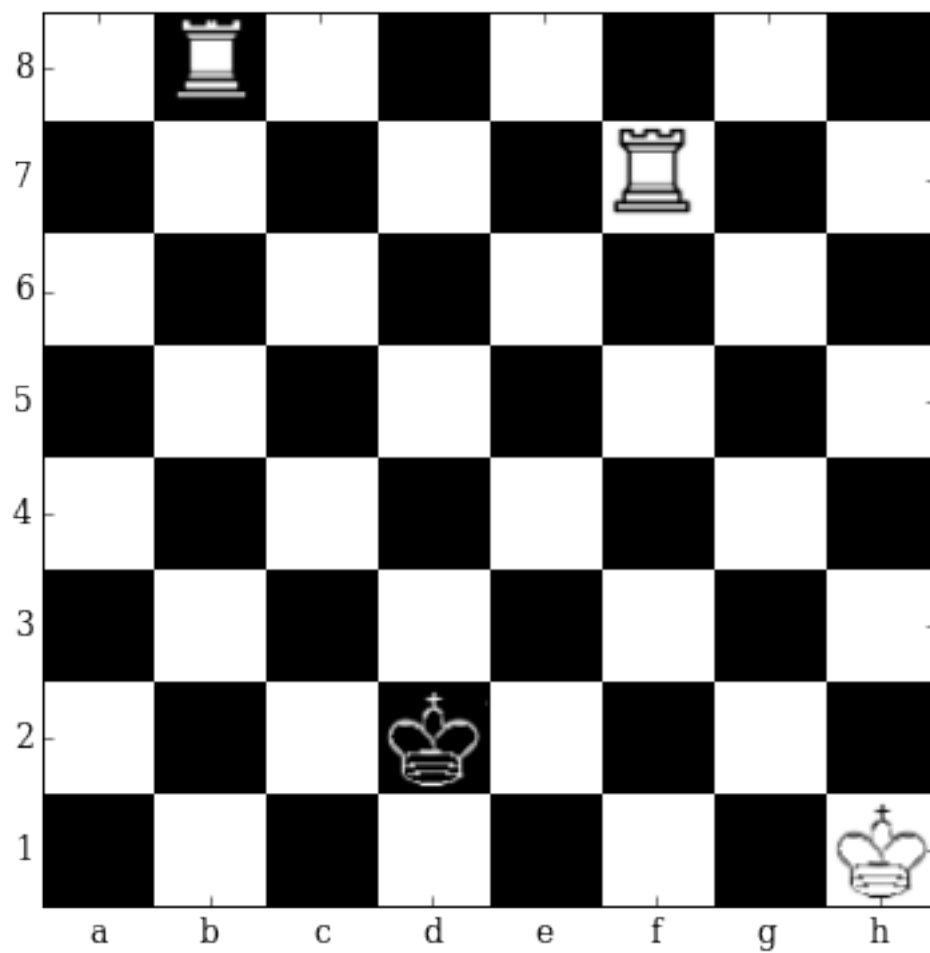
h1h2 0.25475075841



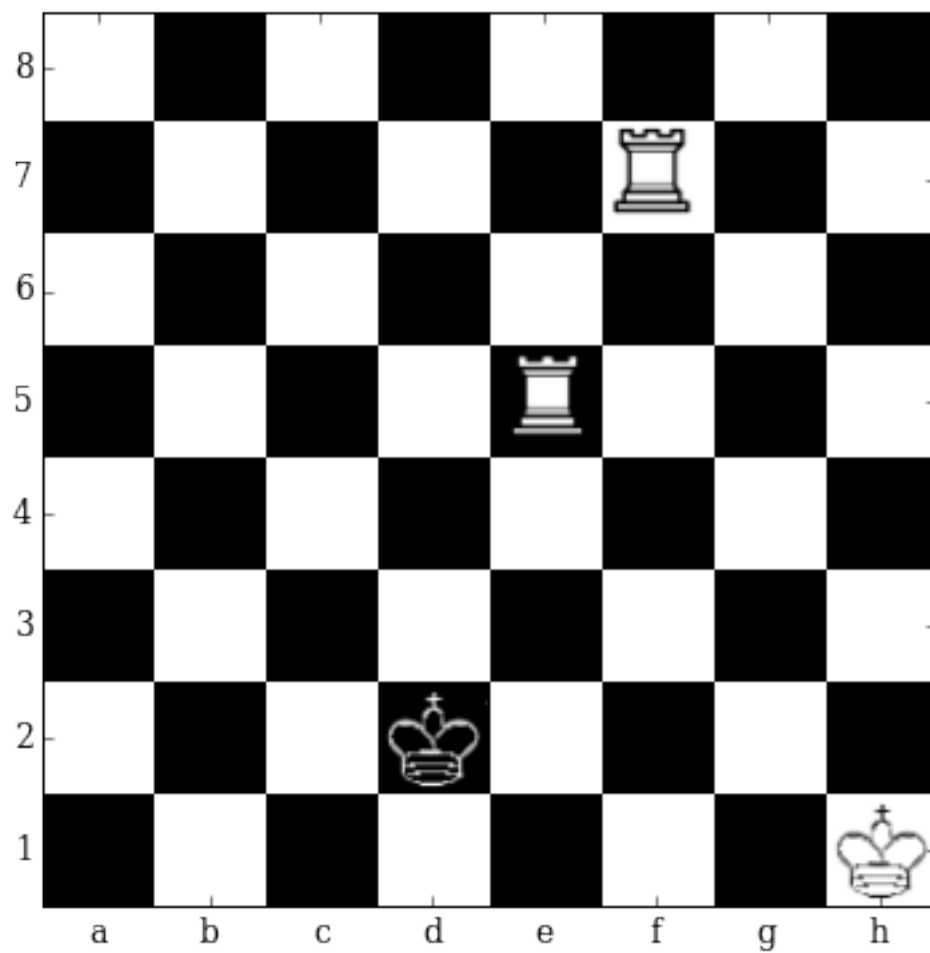
h1g1 0.244157657027



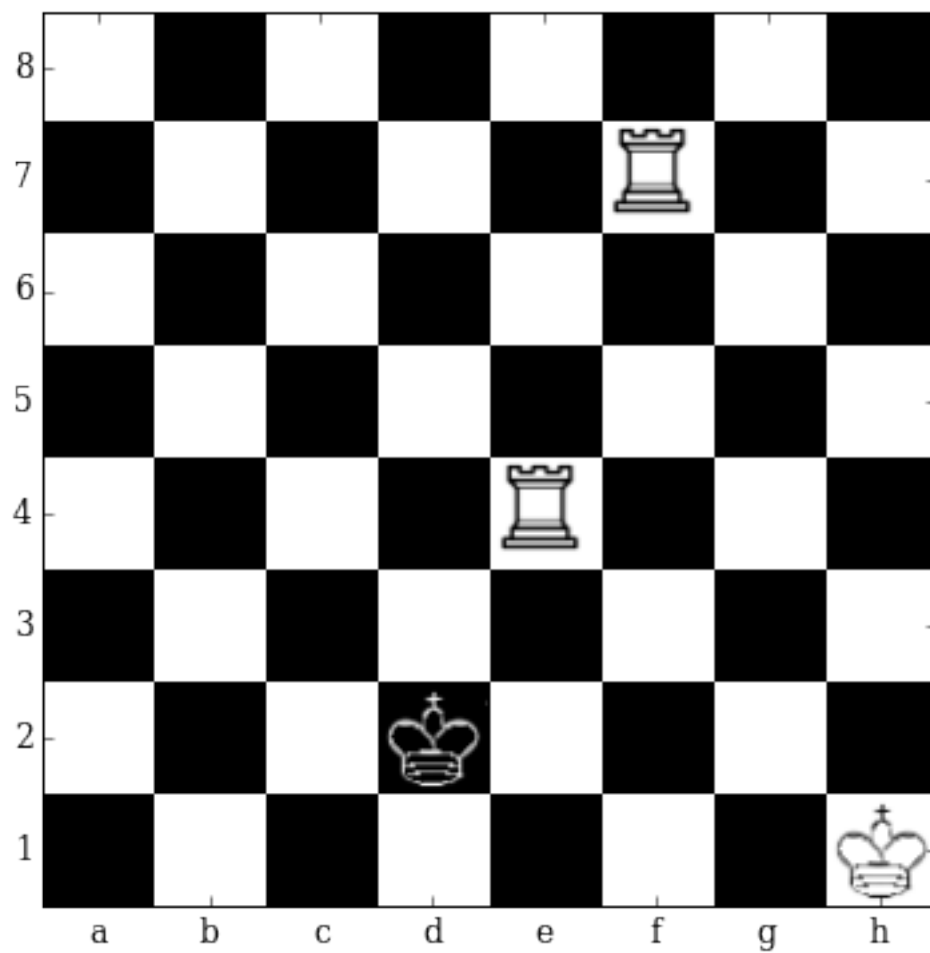
f7e7 0.242229655385
WORST 5 Moves



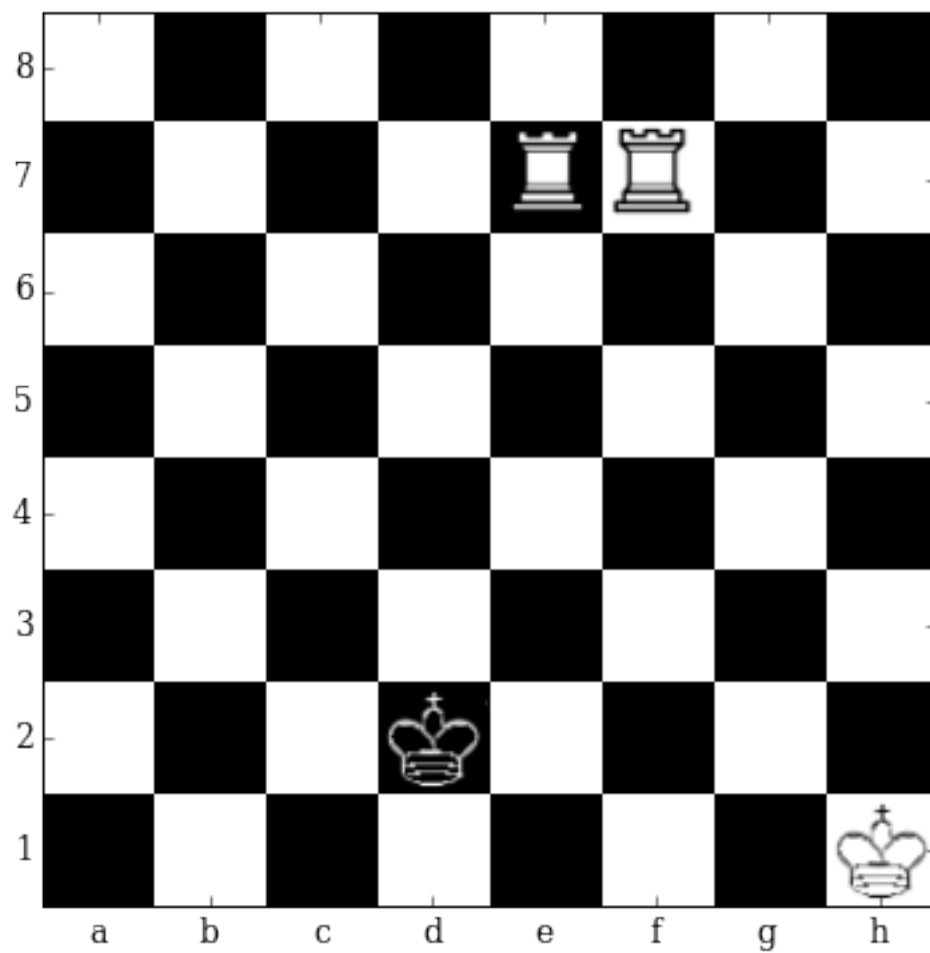
e8b8 0.180342525244



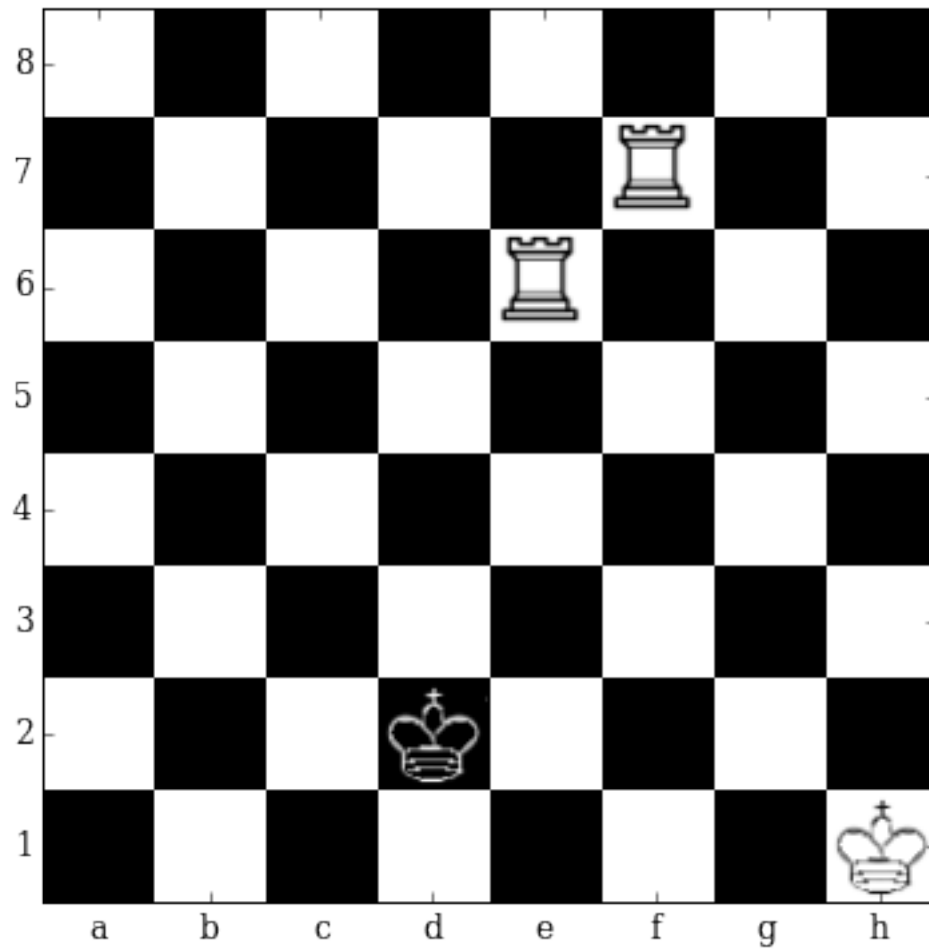
e8e5 0.179203212261



e8e4 0.179086685181



e8e7 0.178259670734



e8e6 0.162149891257

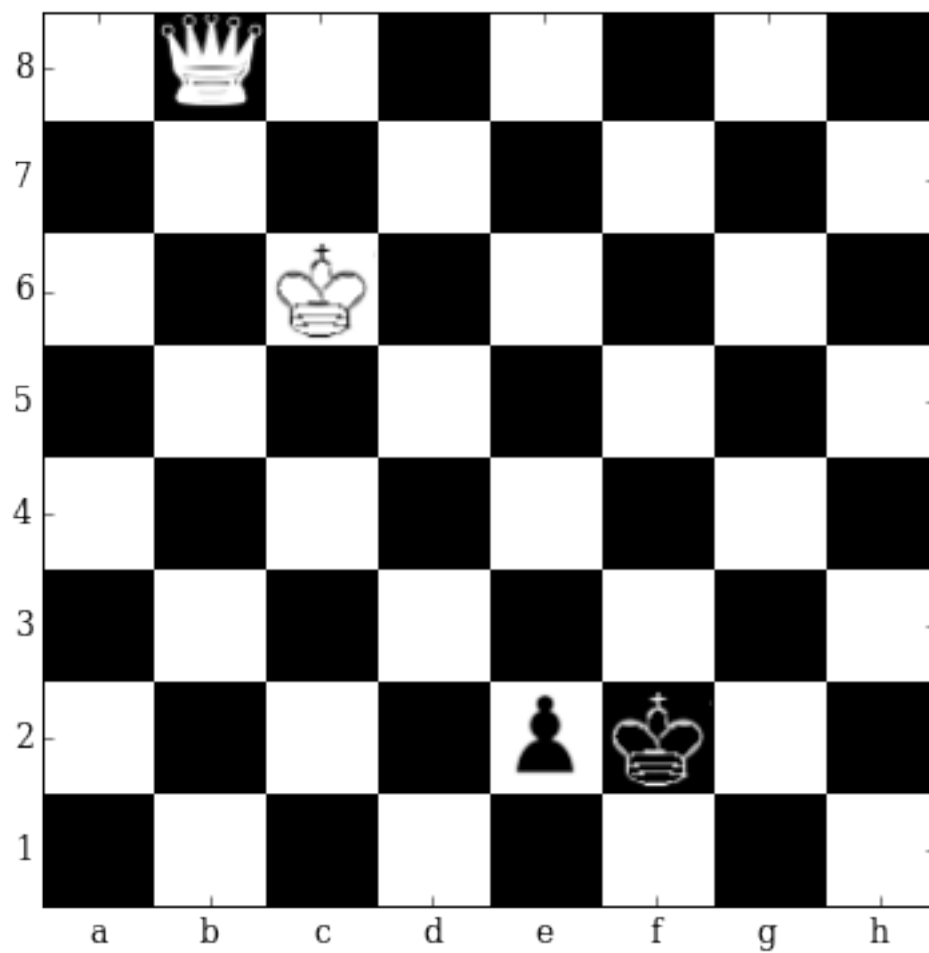
In [21]: '''

Queen King vs King Pawn

'''

fen = '1Q6/8/2K5/8/8/8/4pk2/8 w - - 0 0'

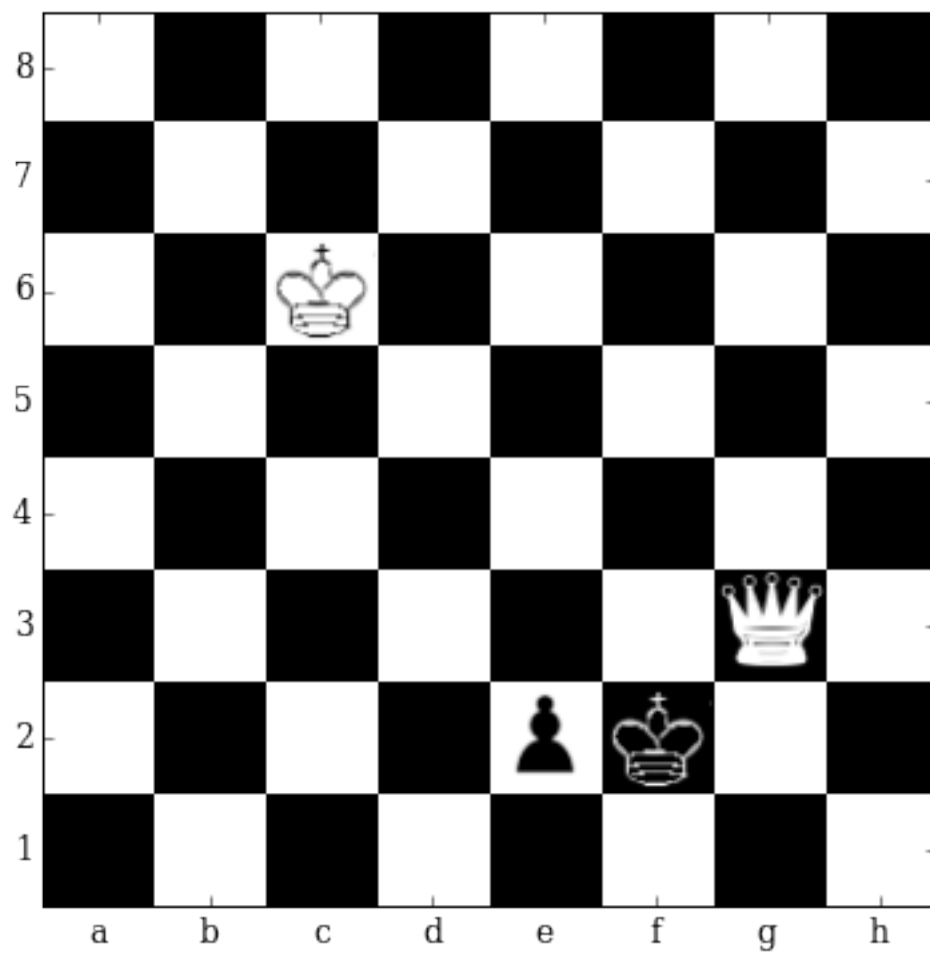
top_bottom_moves(fen)



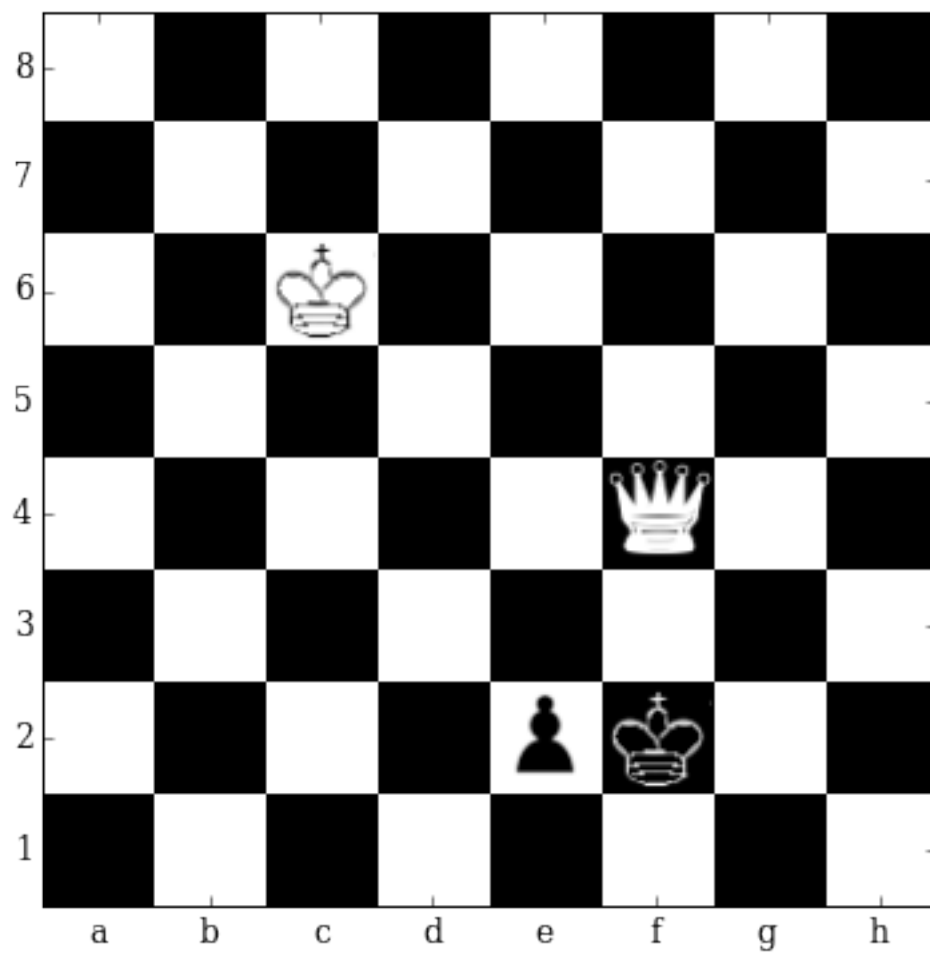
Current evaluation: 0.132124

Total 29 moves possible

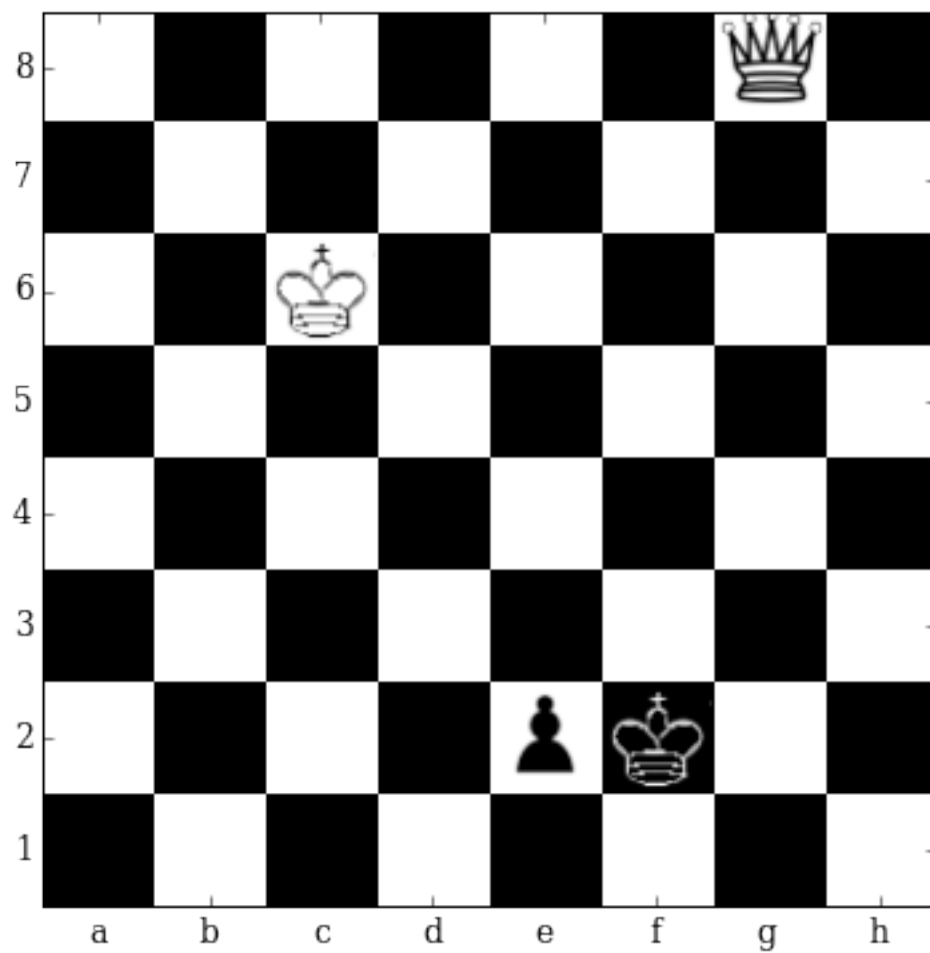
TOP 5 Moves



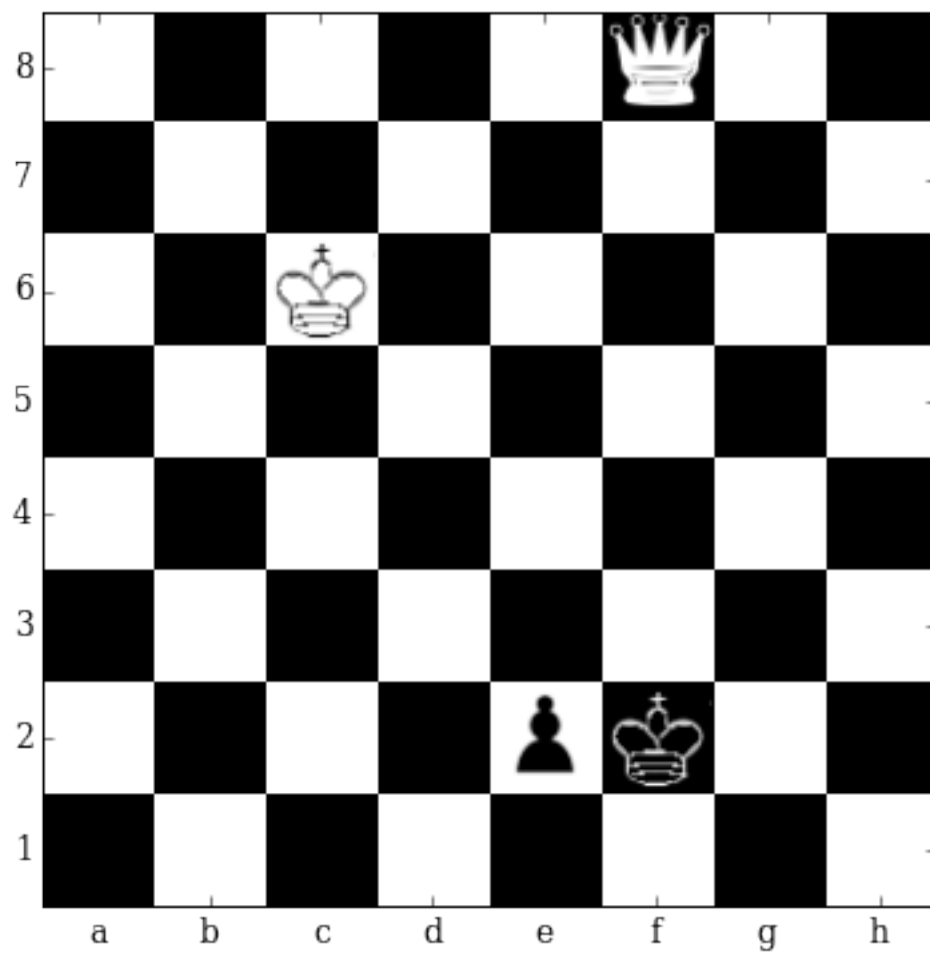
b8g3 0.232341885567



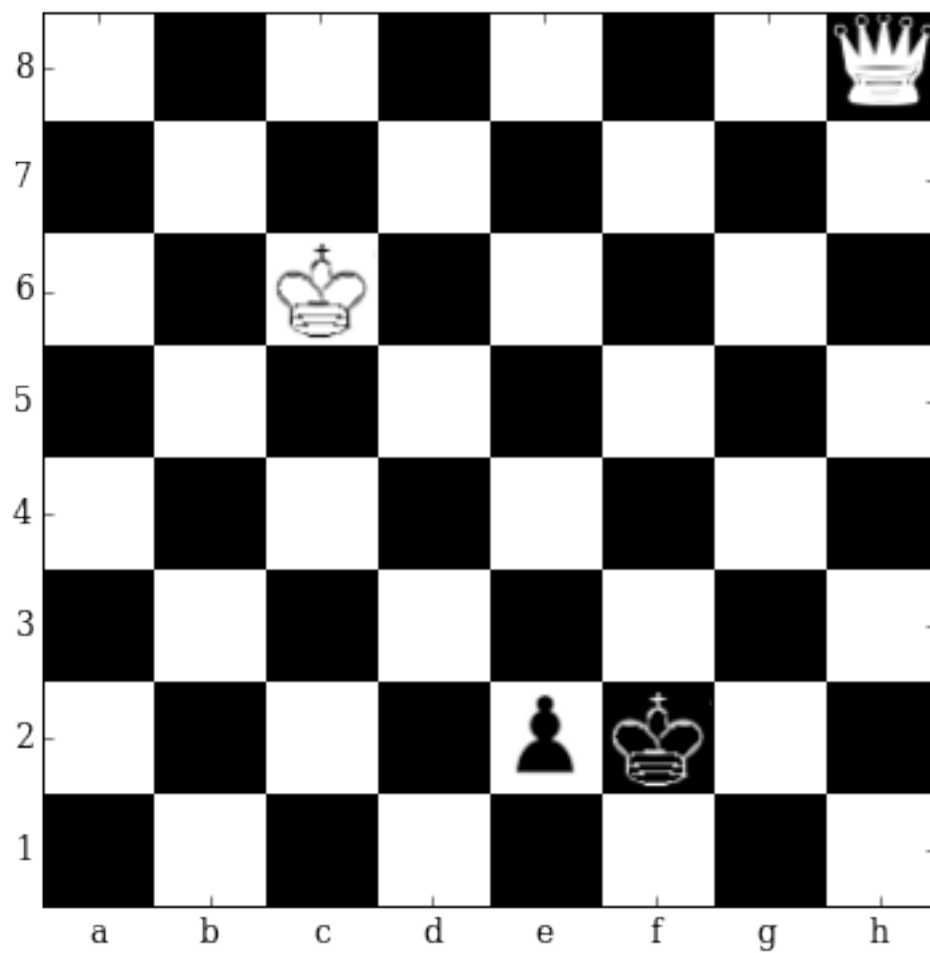
b8f4 0.220576122403



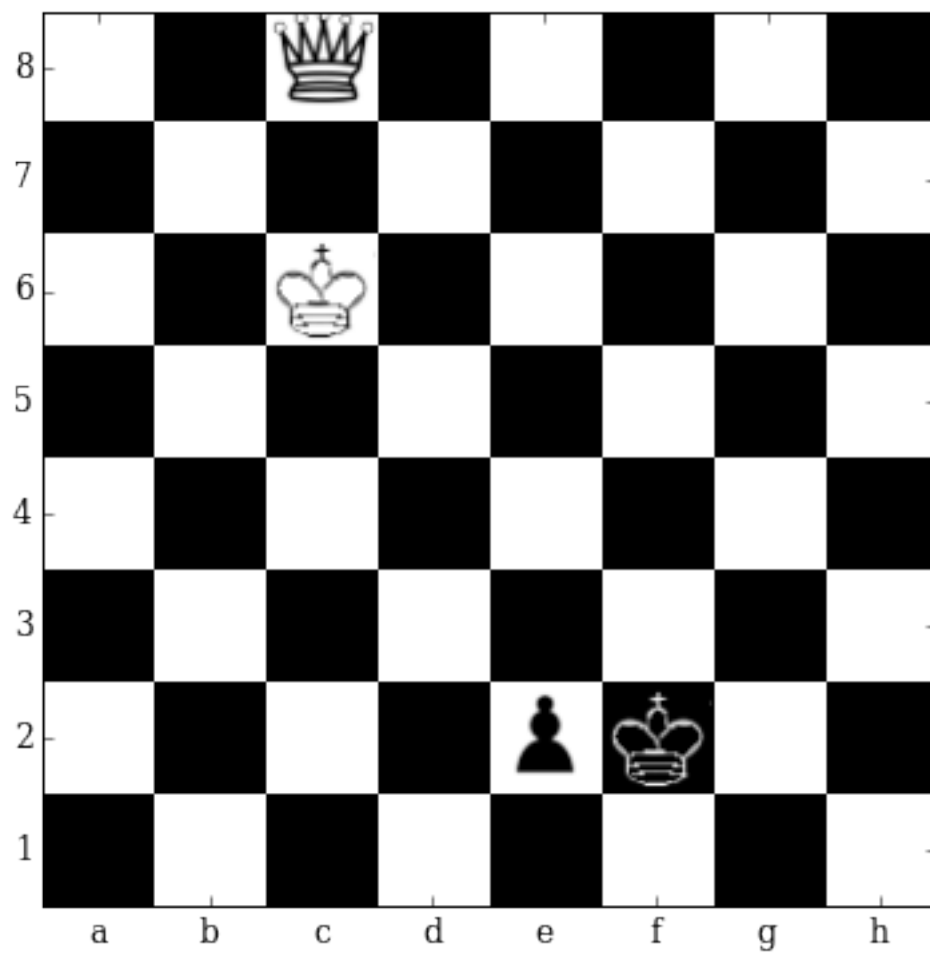
b8g8 0.212574183941



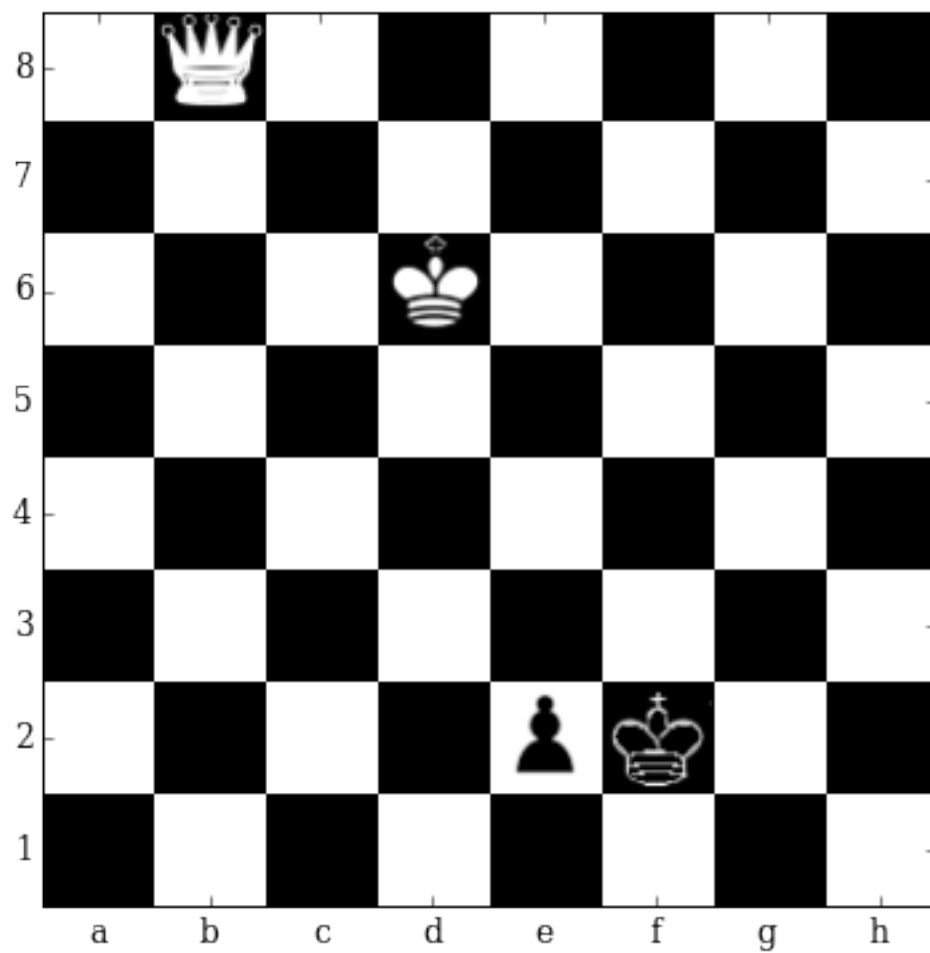
b8f8 0.208147808909



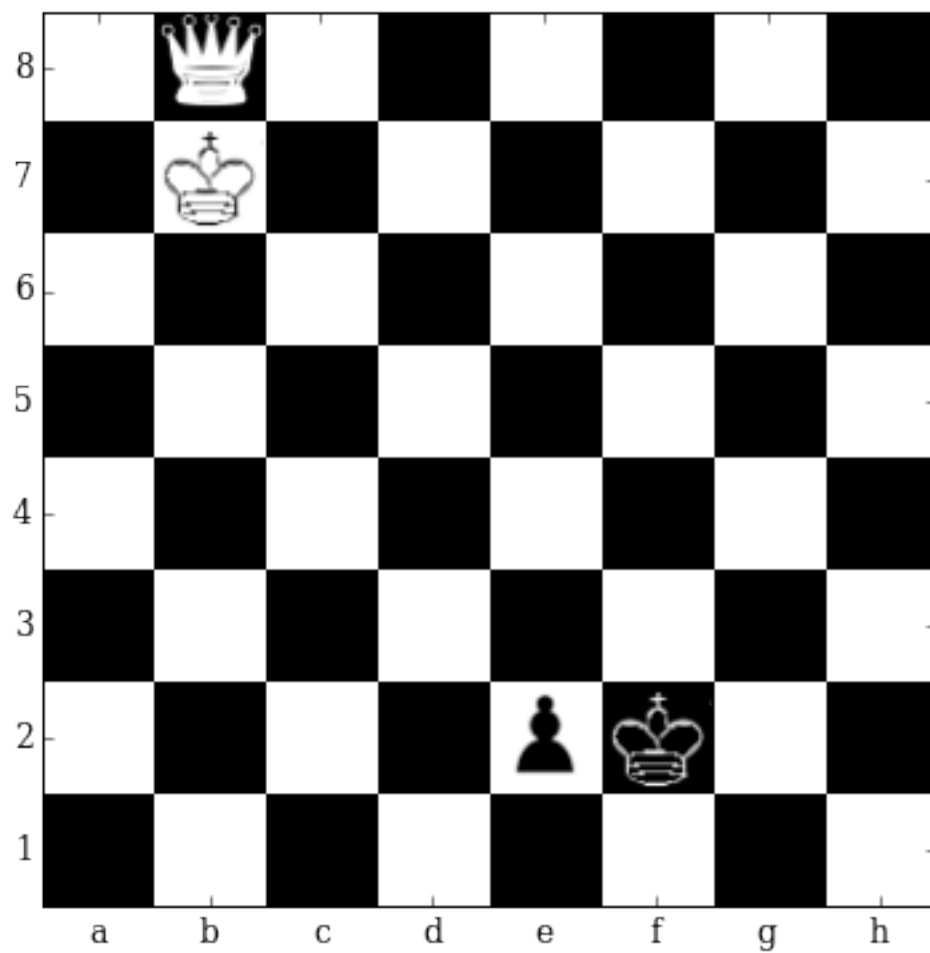
b8h8 0.205039218068
WORST 5 Moves



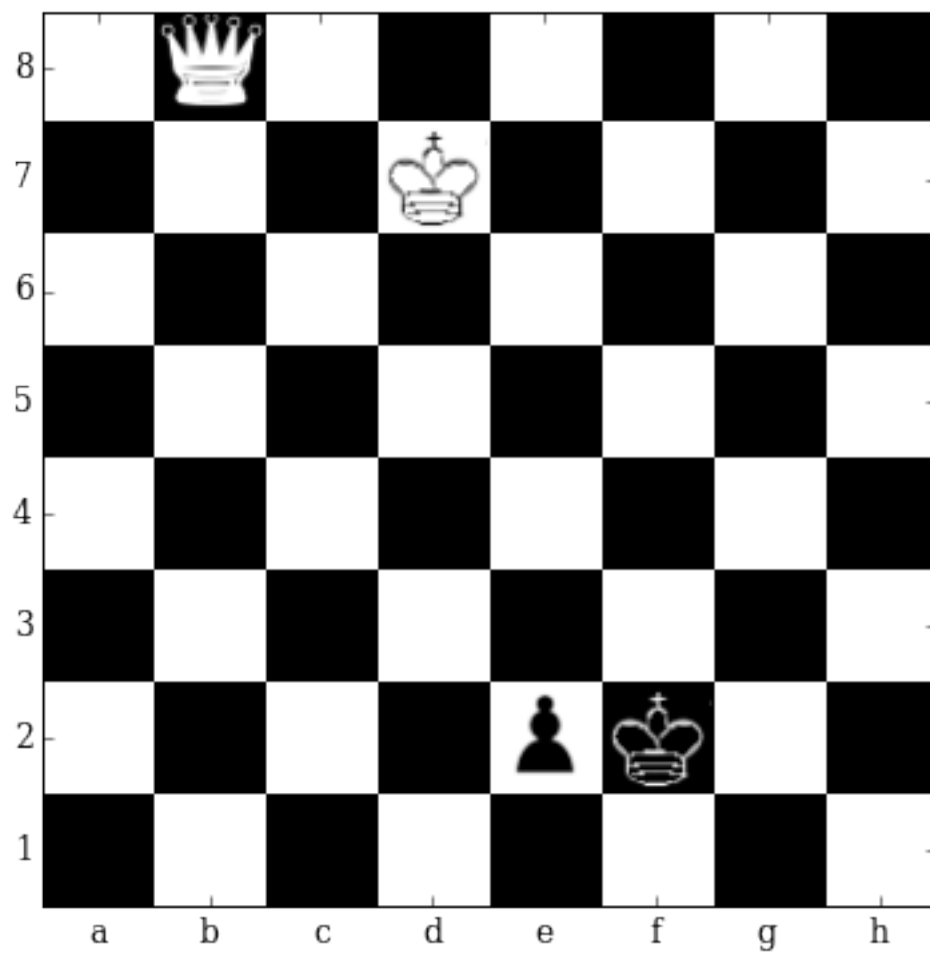
b8c8 0.131534919143



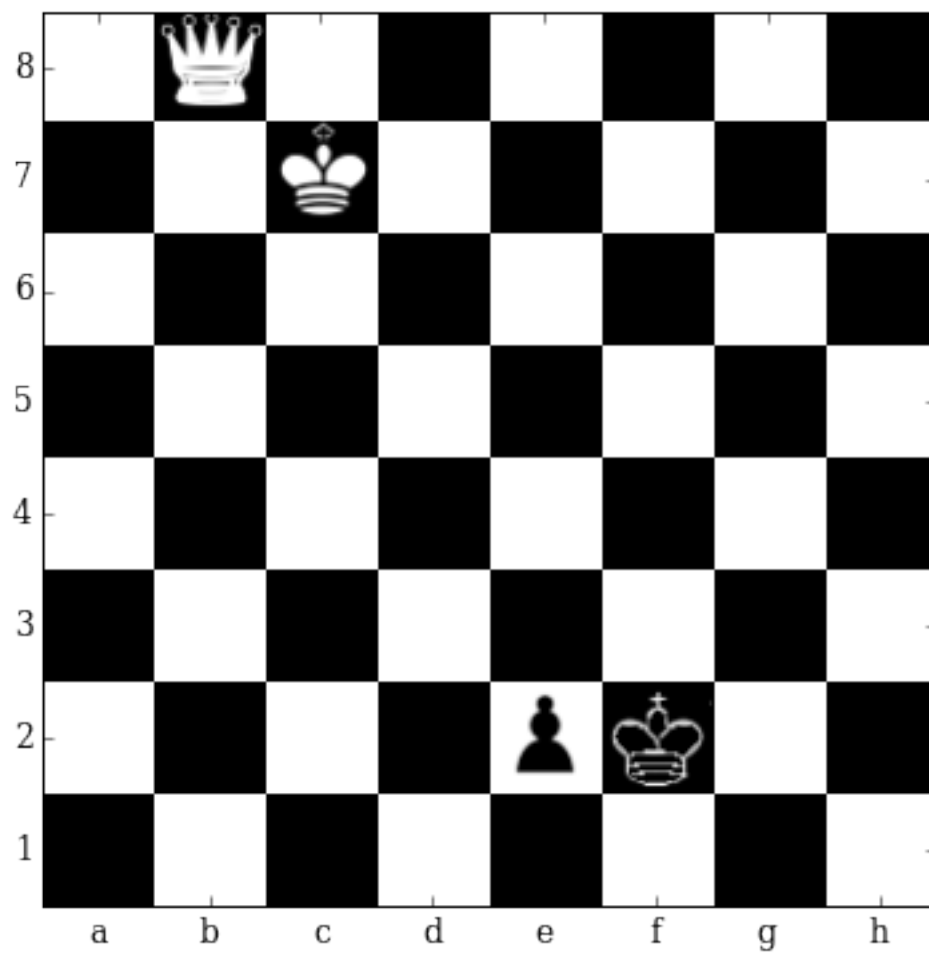
c6d6 0.129832103848



c6b7 0.121259056032

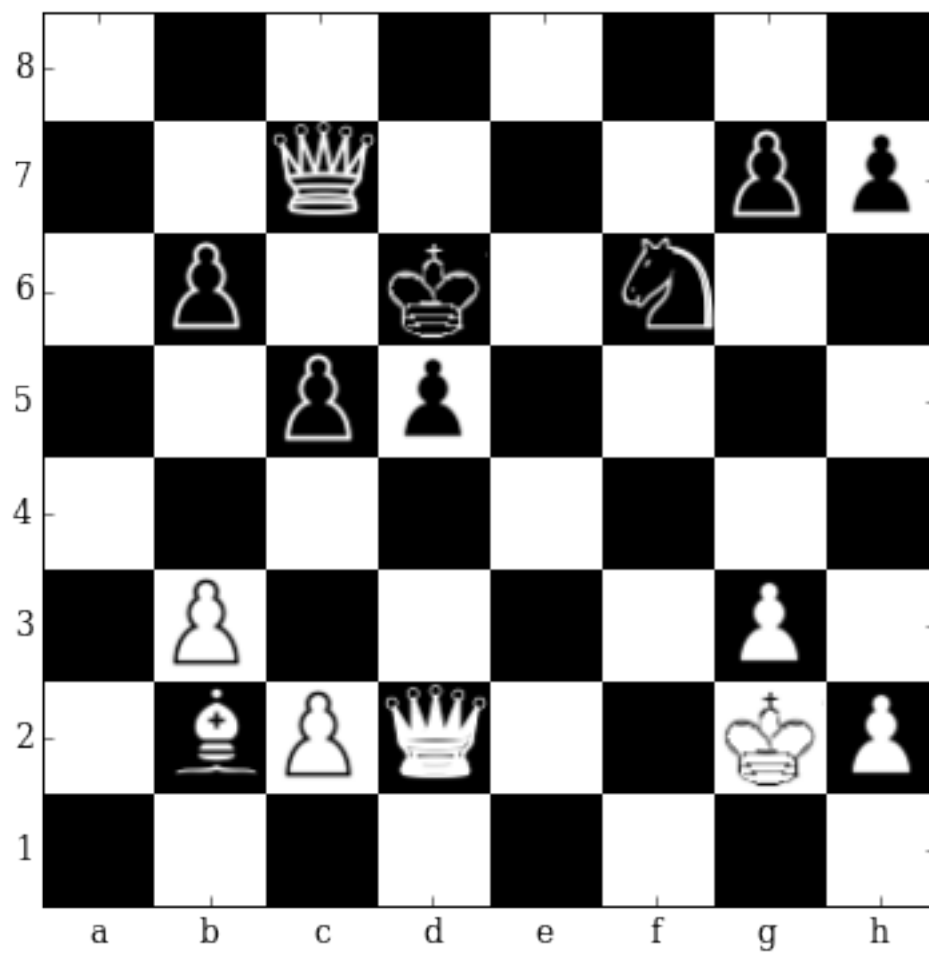


c6d7 0.109470196068



c6c7 0.105199843645

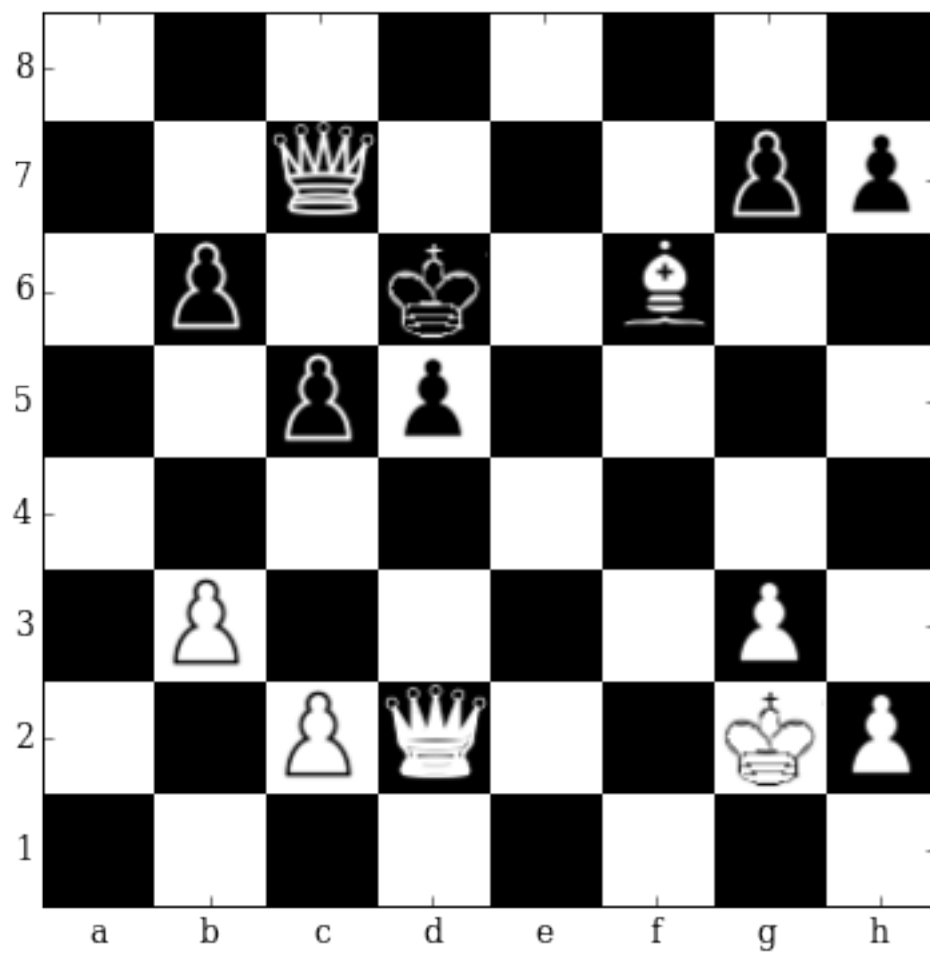
In [22]: fen='8/2q3pp/1p1k1n2/2pp4/8/1P4P1/1BPQ2KP/8 w - - 0 0'
top_bottom_moves(fen)



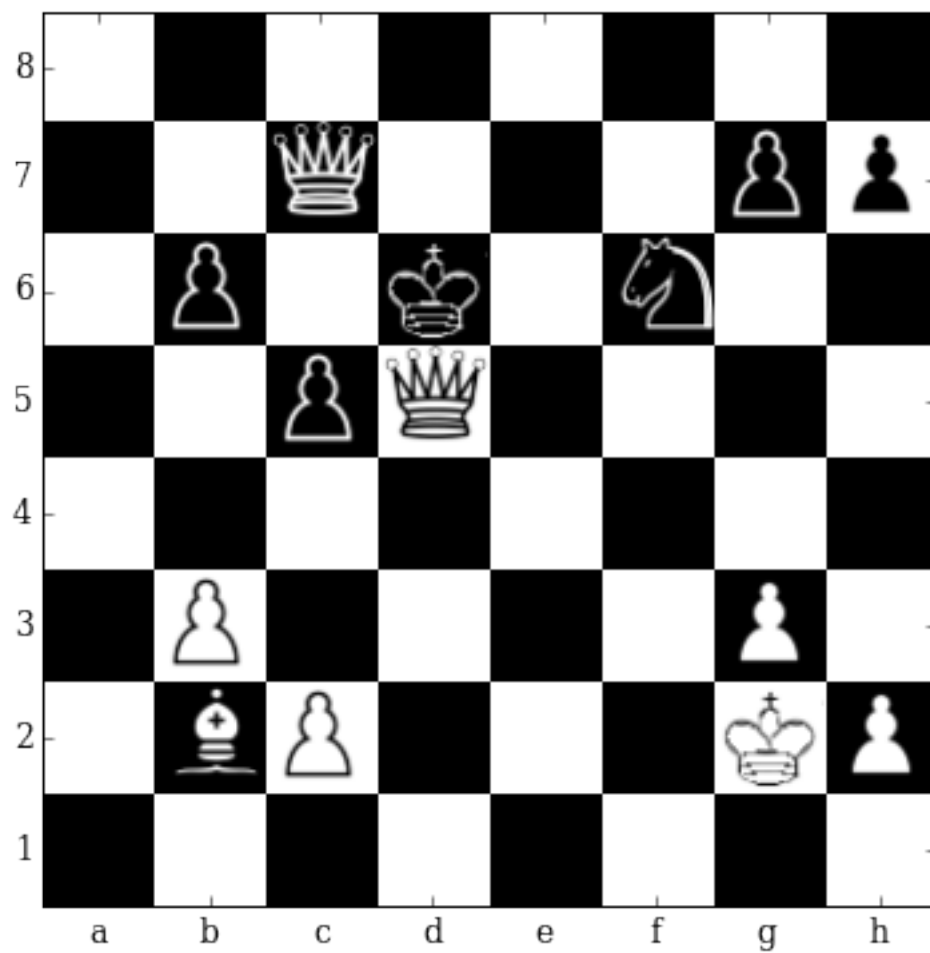
Current evaluation: -0.022609

Total 34 moves possible

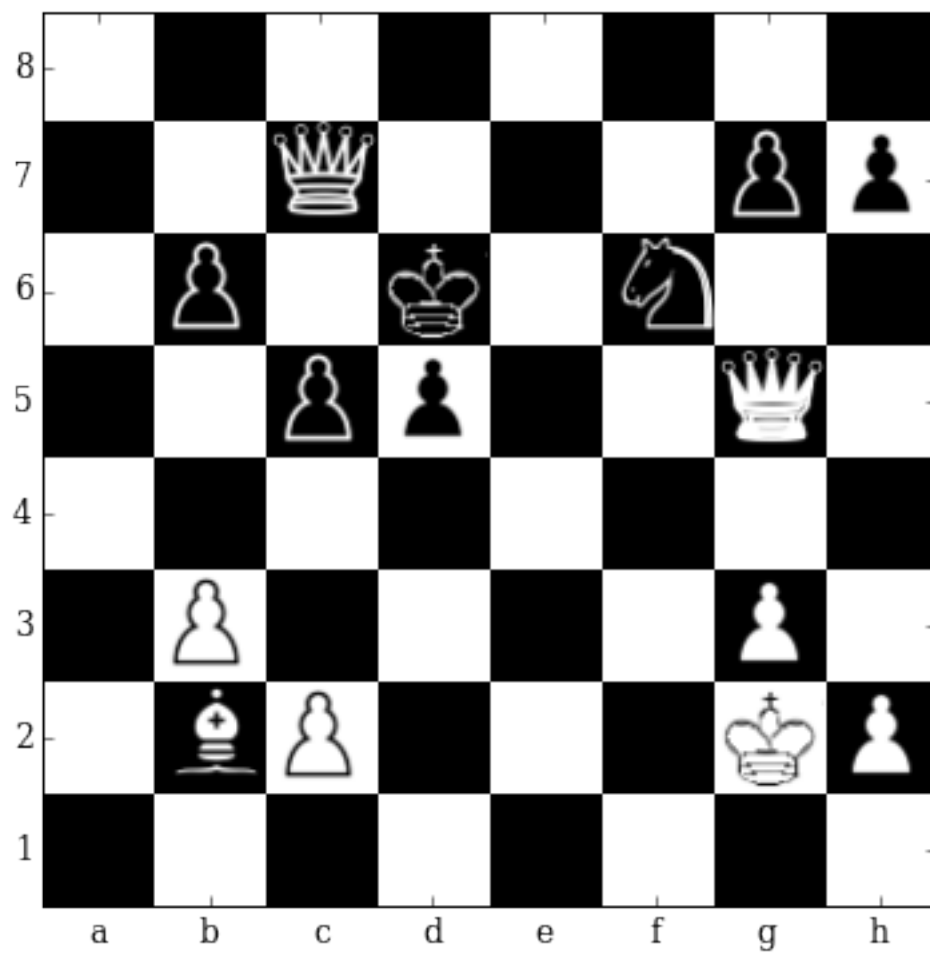
TOP 5 Moves



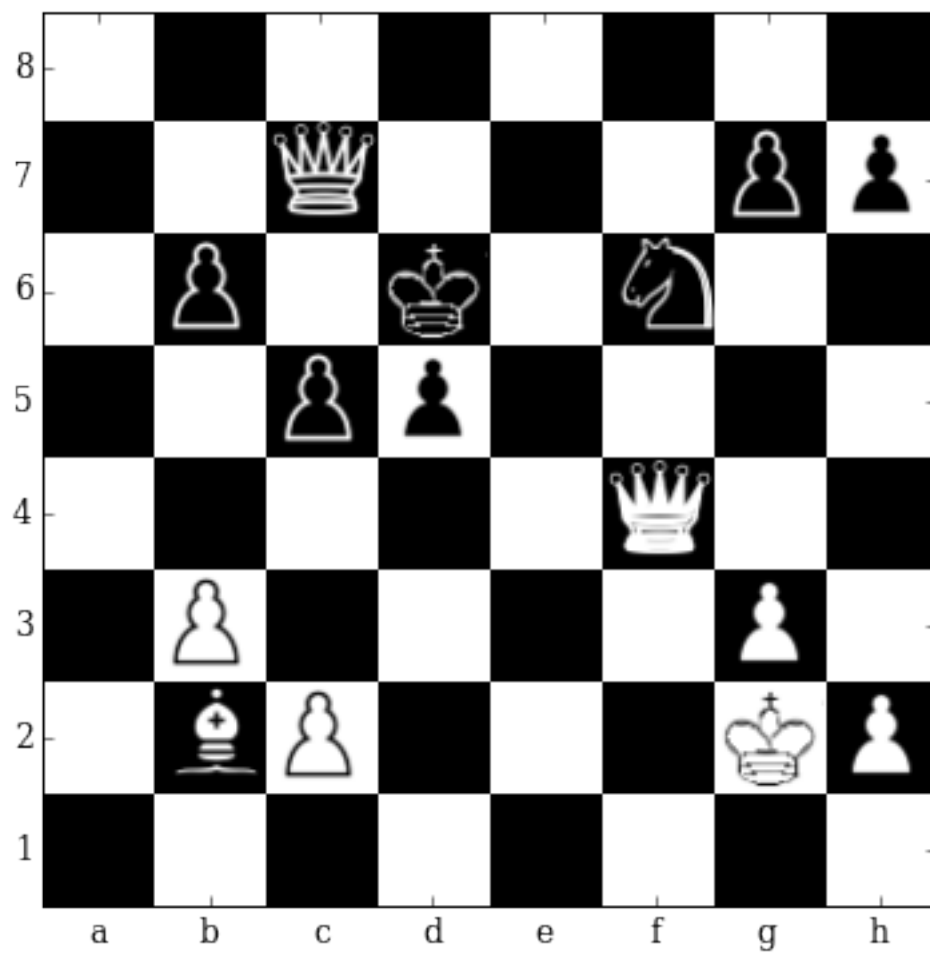
b2f6 0.0331075526774



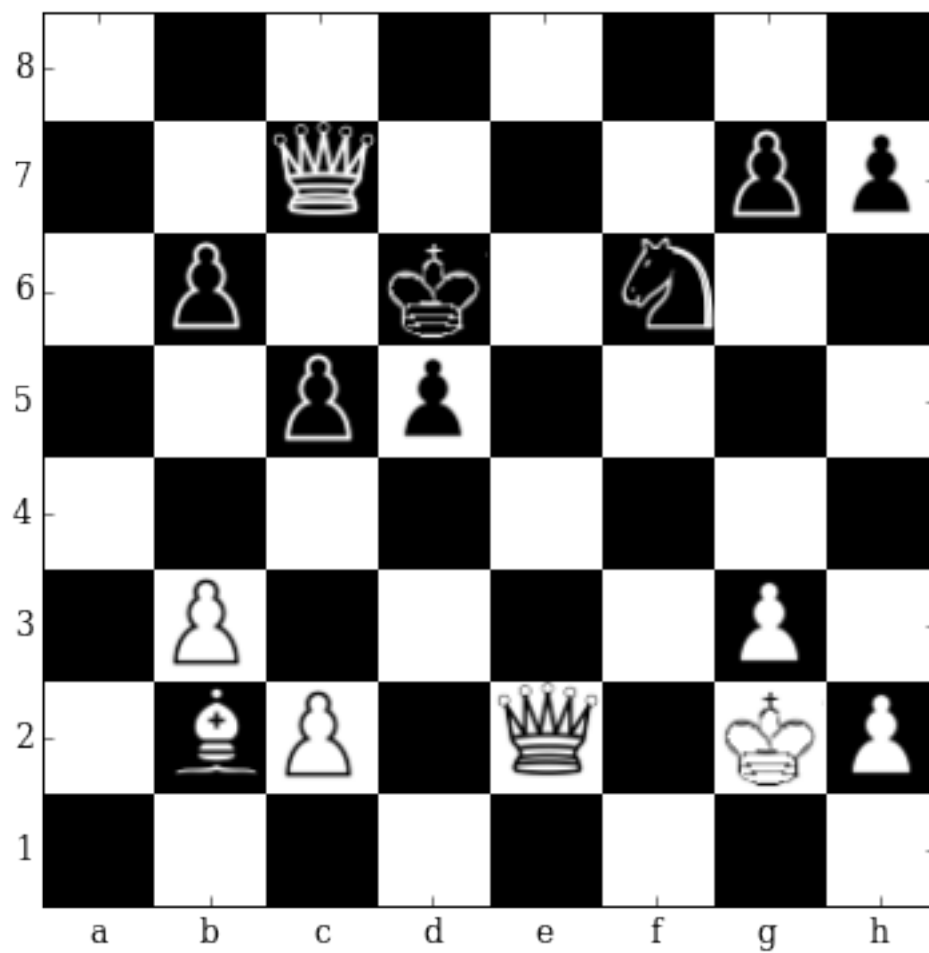
d2d5 0.0303655825555



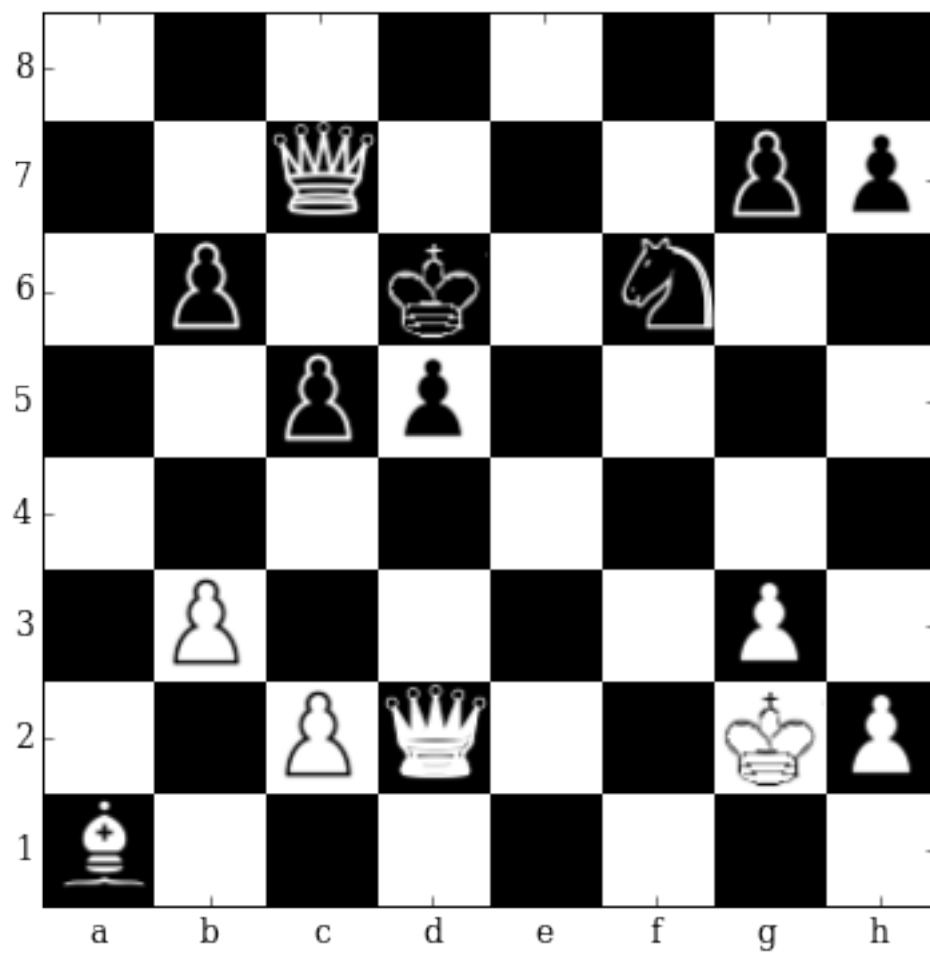
d2g5 0.0135372653604



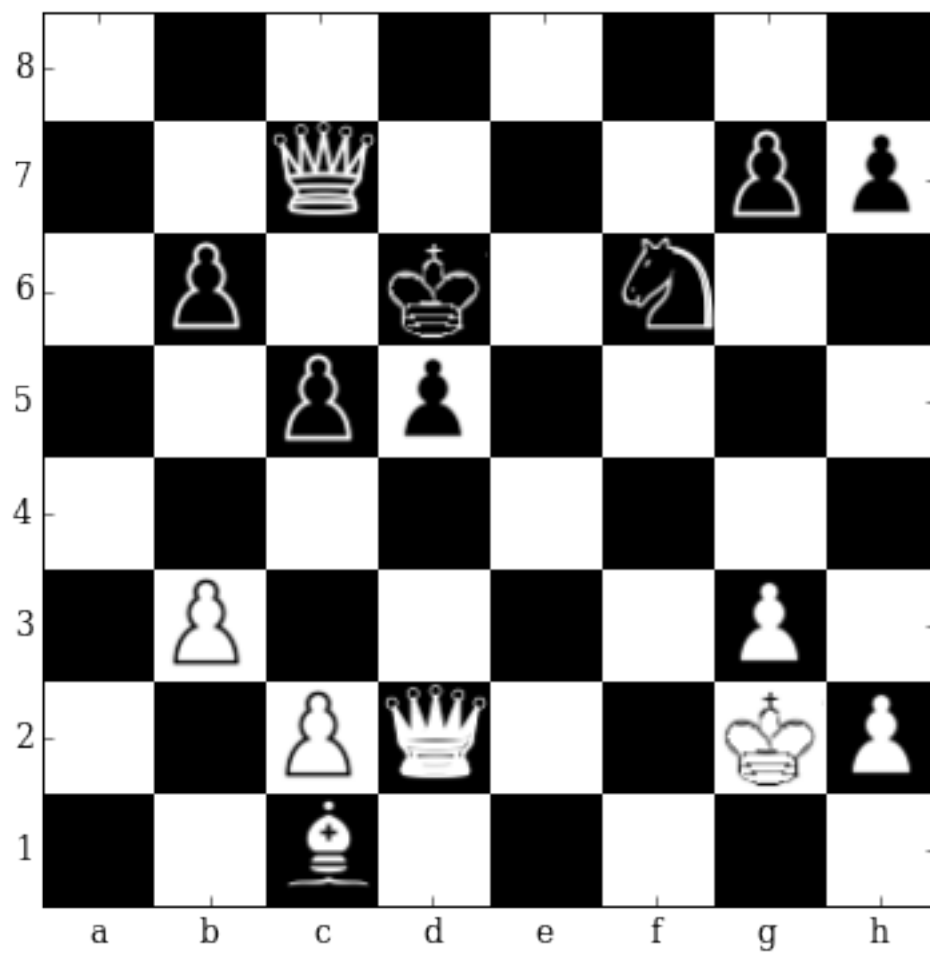
d2f4 0.0116871418431



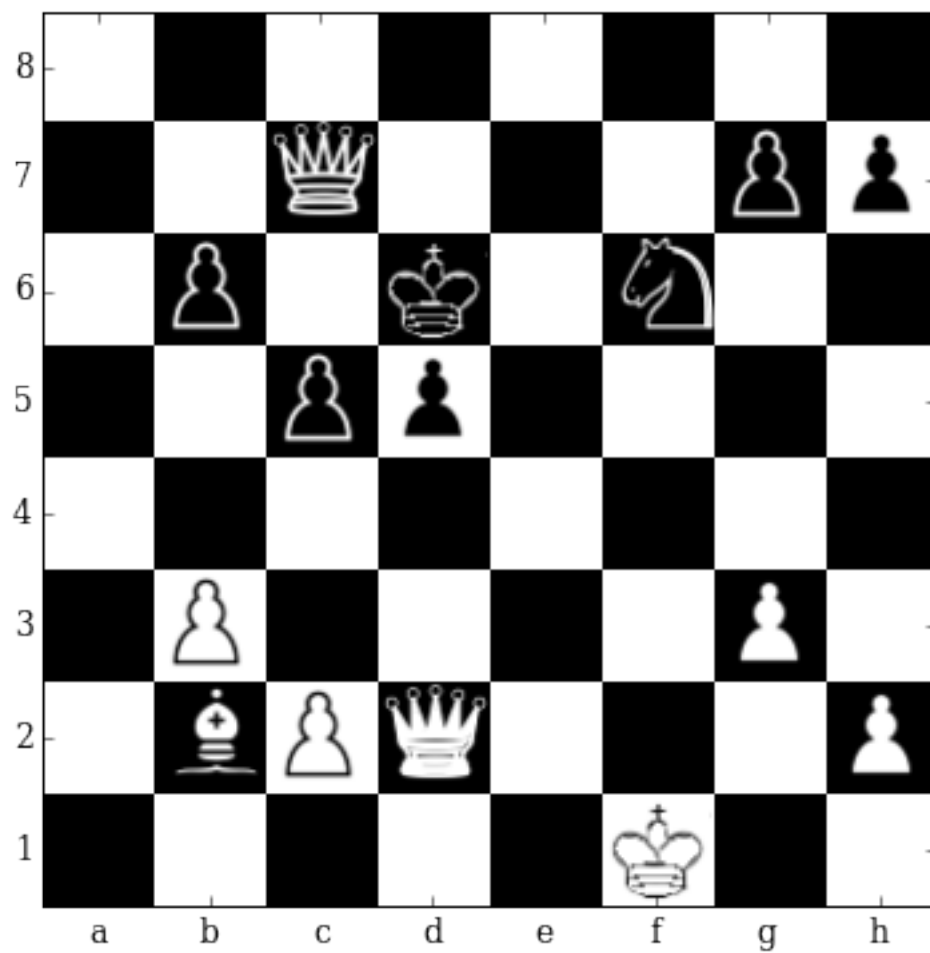
d2e2 0.00281526707113
 WORST 5 Moves



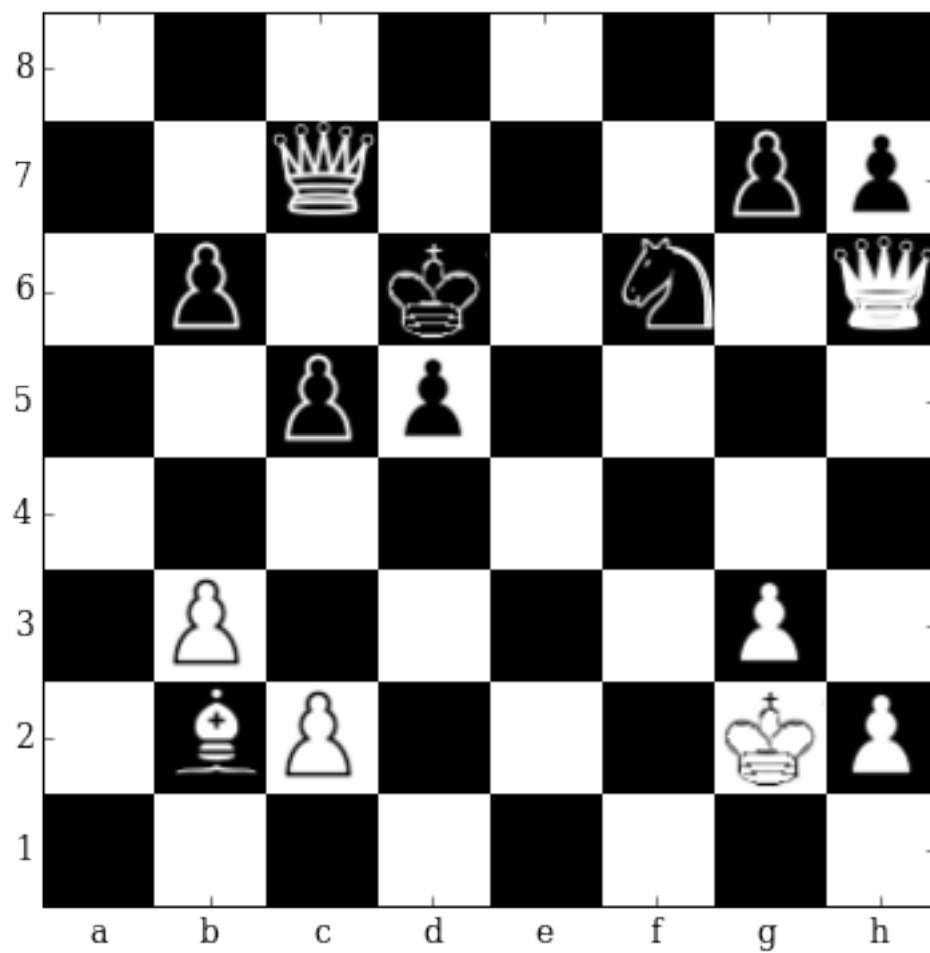
b2a1 -0.0309130325913



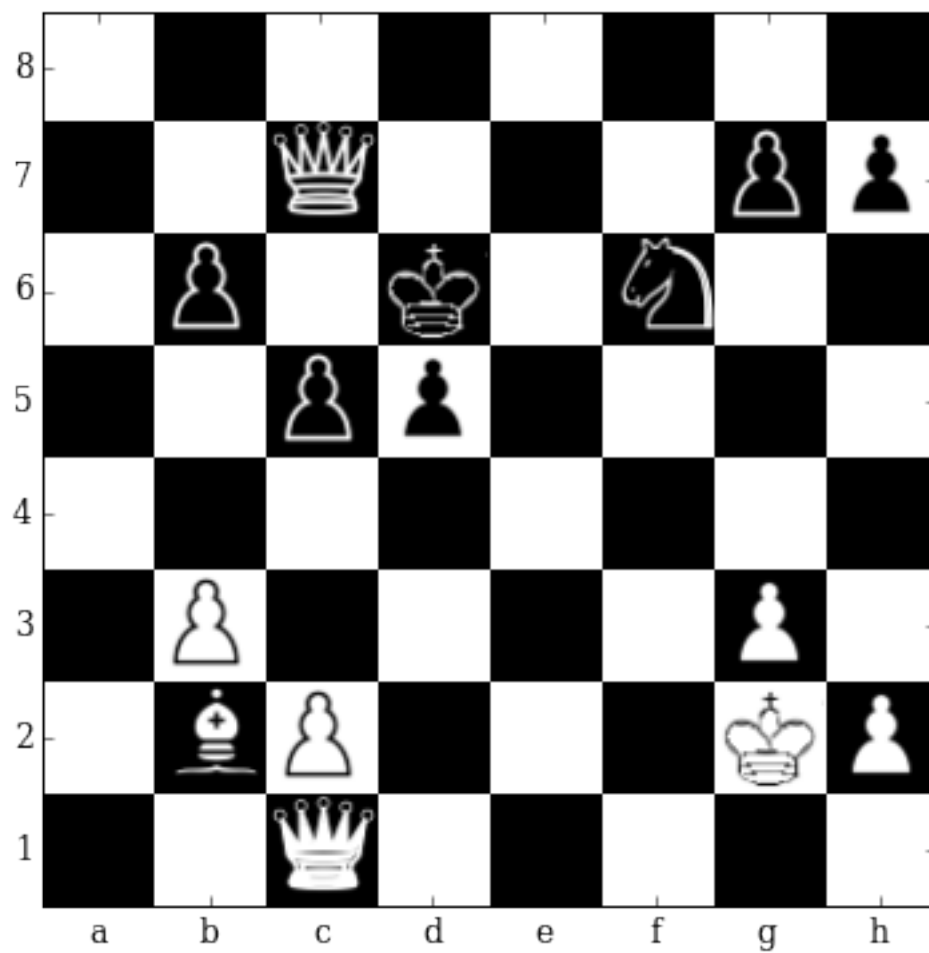
b2c1 -0.0322335064411



g2f1 -0.033534001559

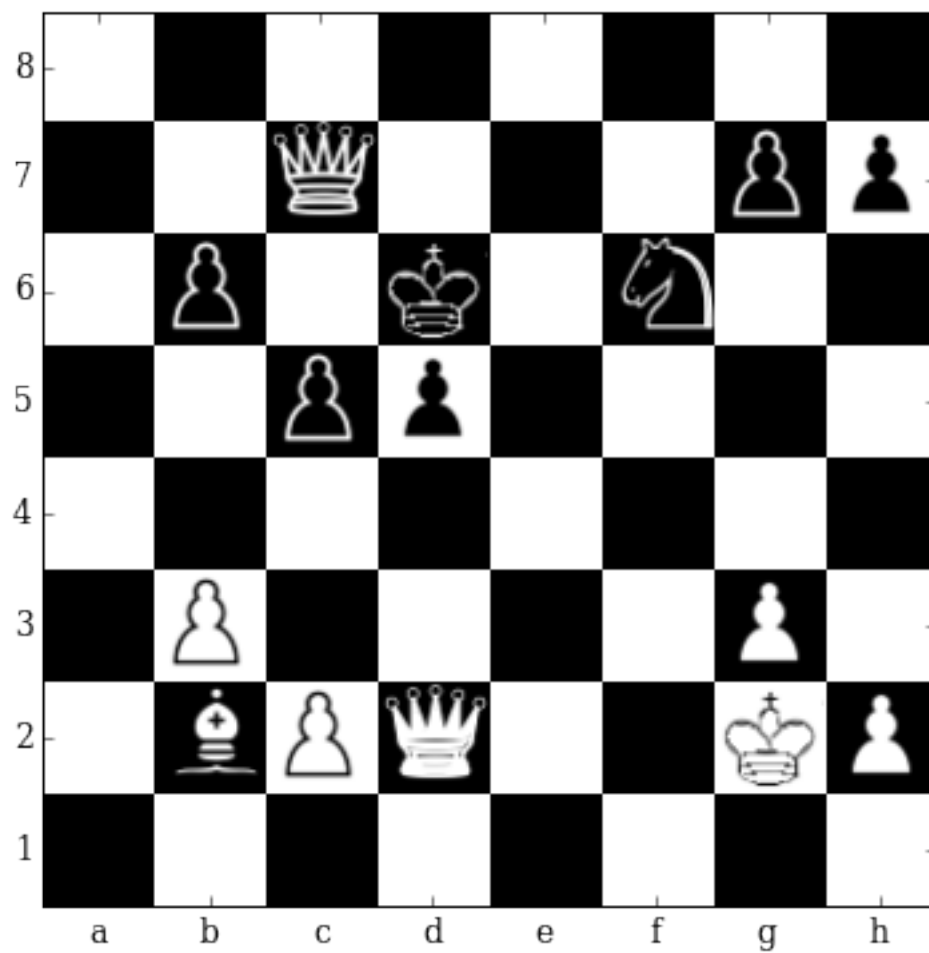


d2h6 -0.0337856337428



d2c1 -0.0525860488415

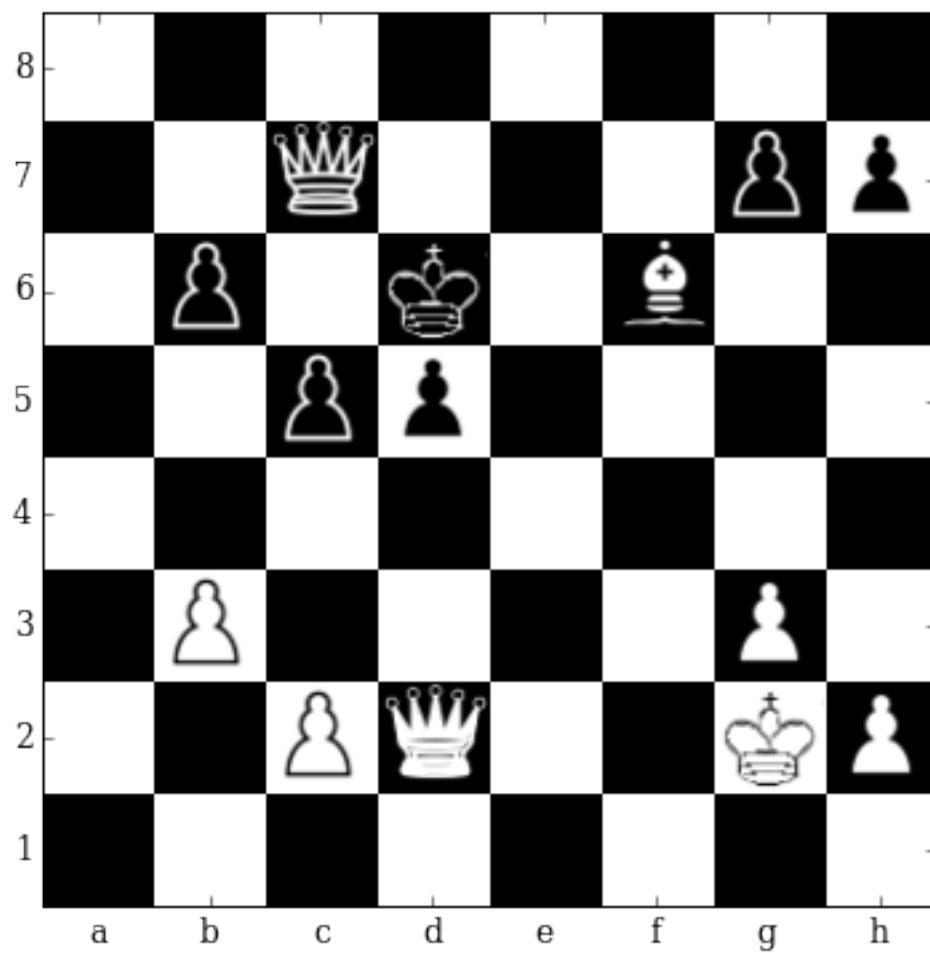
In [23]: top_bottom_moves(fen)



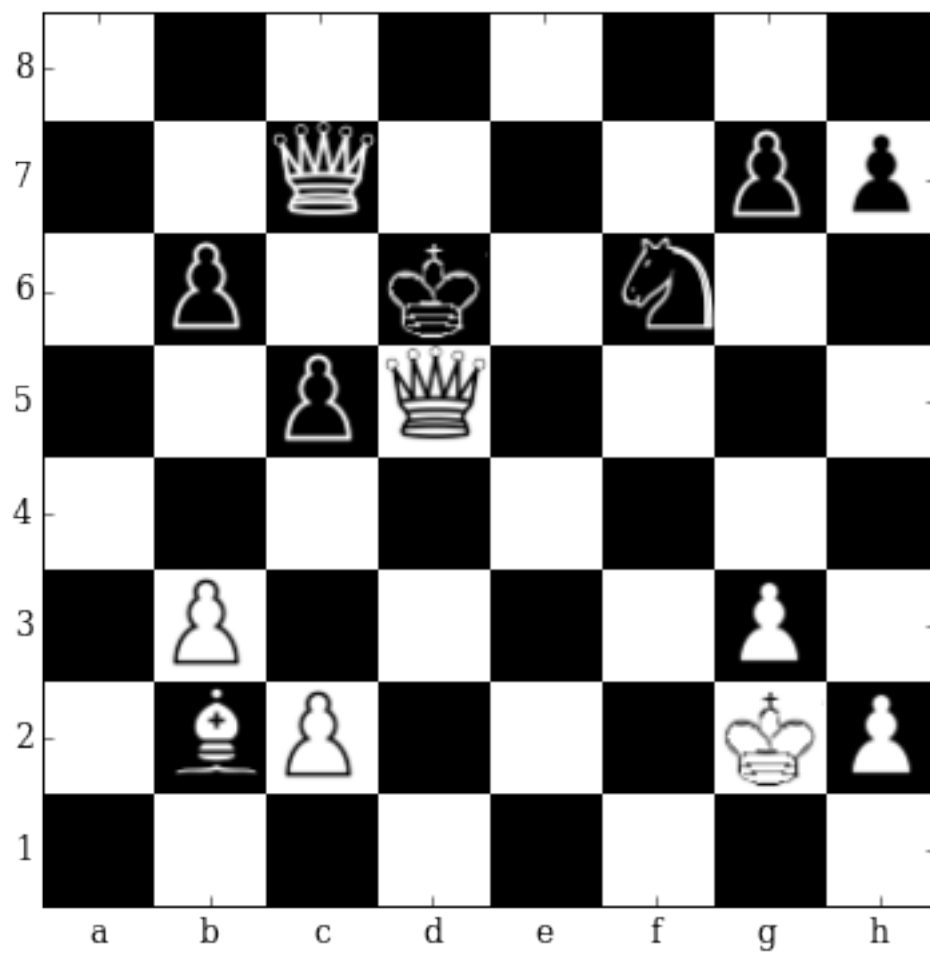
Current evaluation: -0.022609

Total 34 moves possible

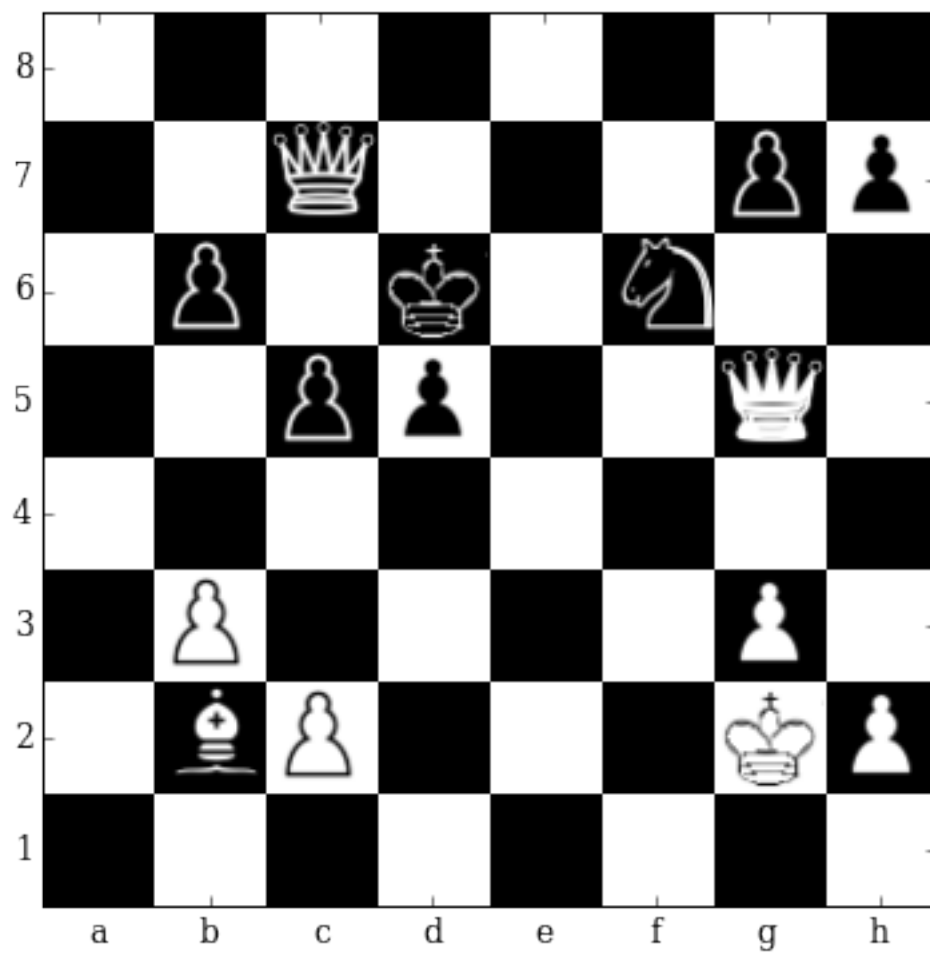
TOP 5 Moves



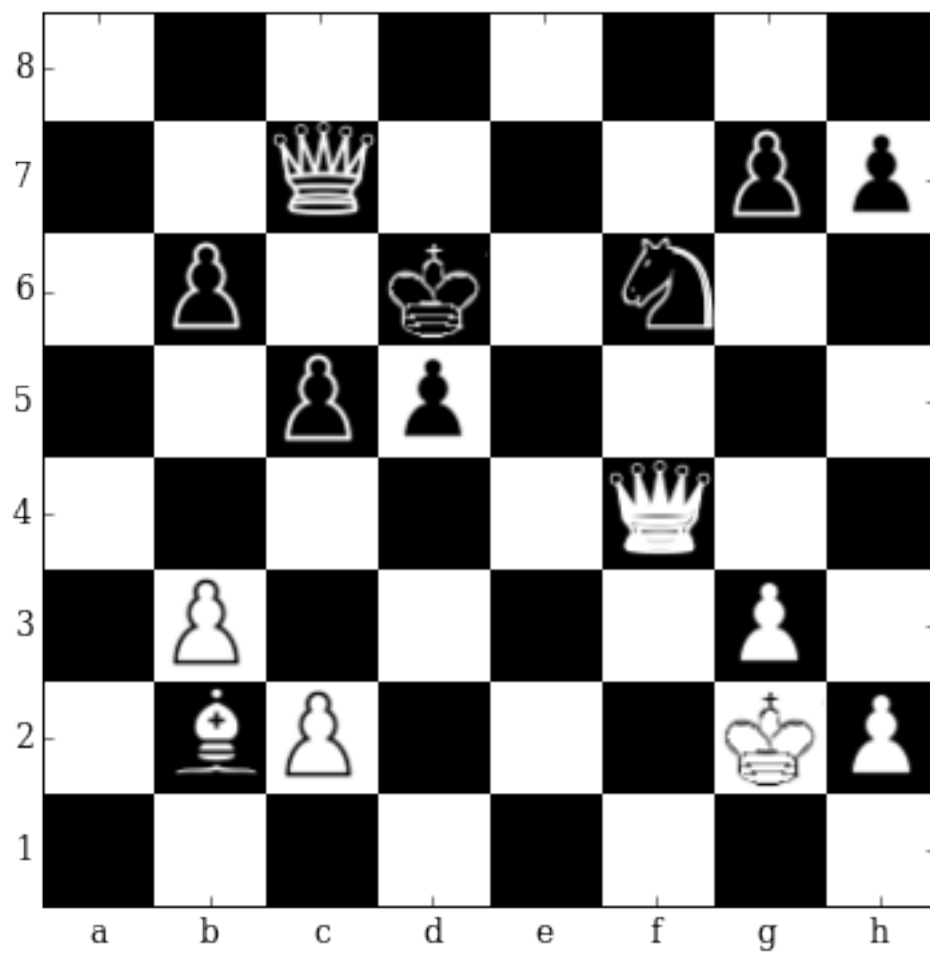
b2f6 0.0331075526774



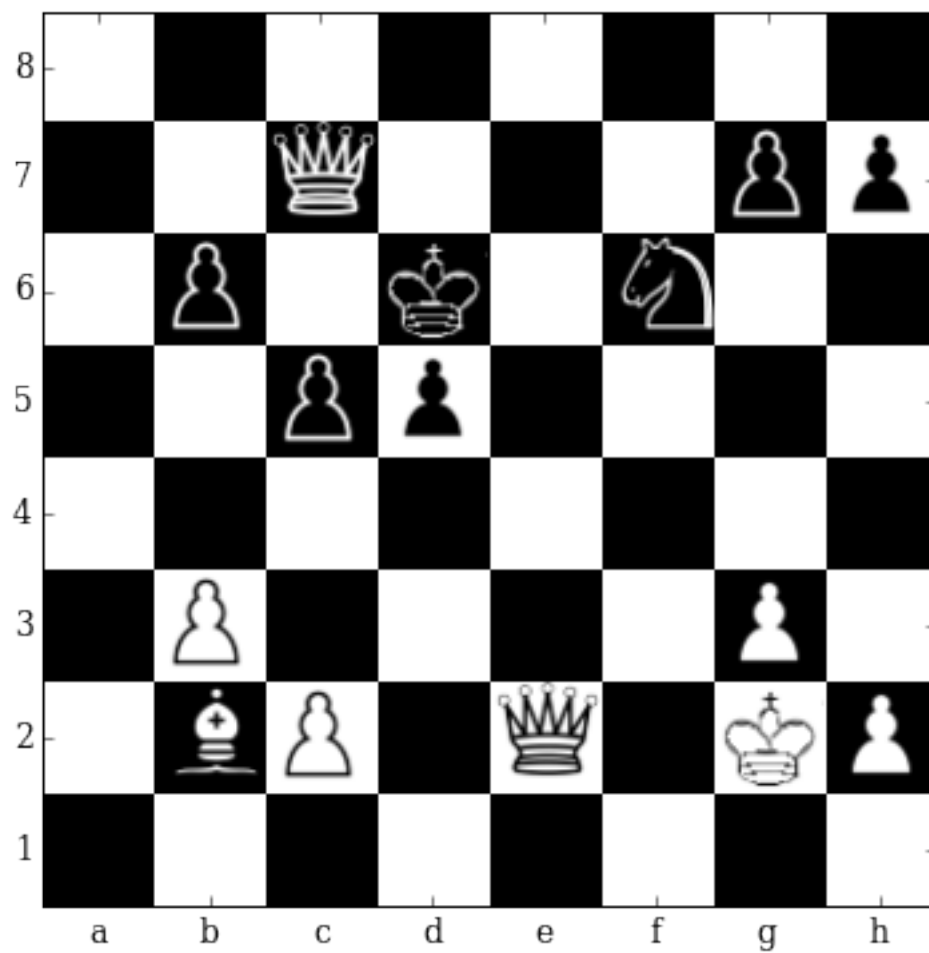
d2d5 0.030365575105



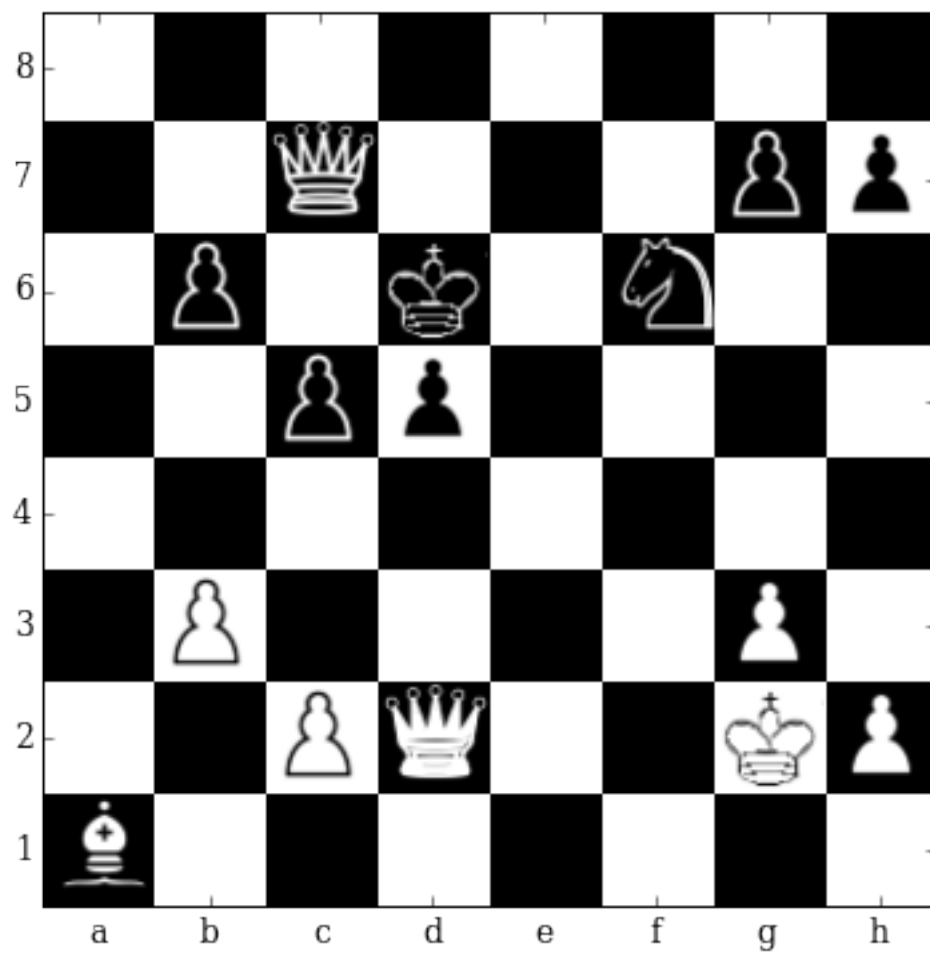
d2g5 0.0135372653604



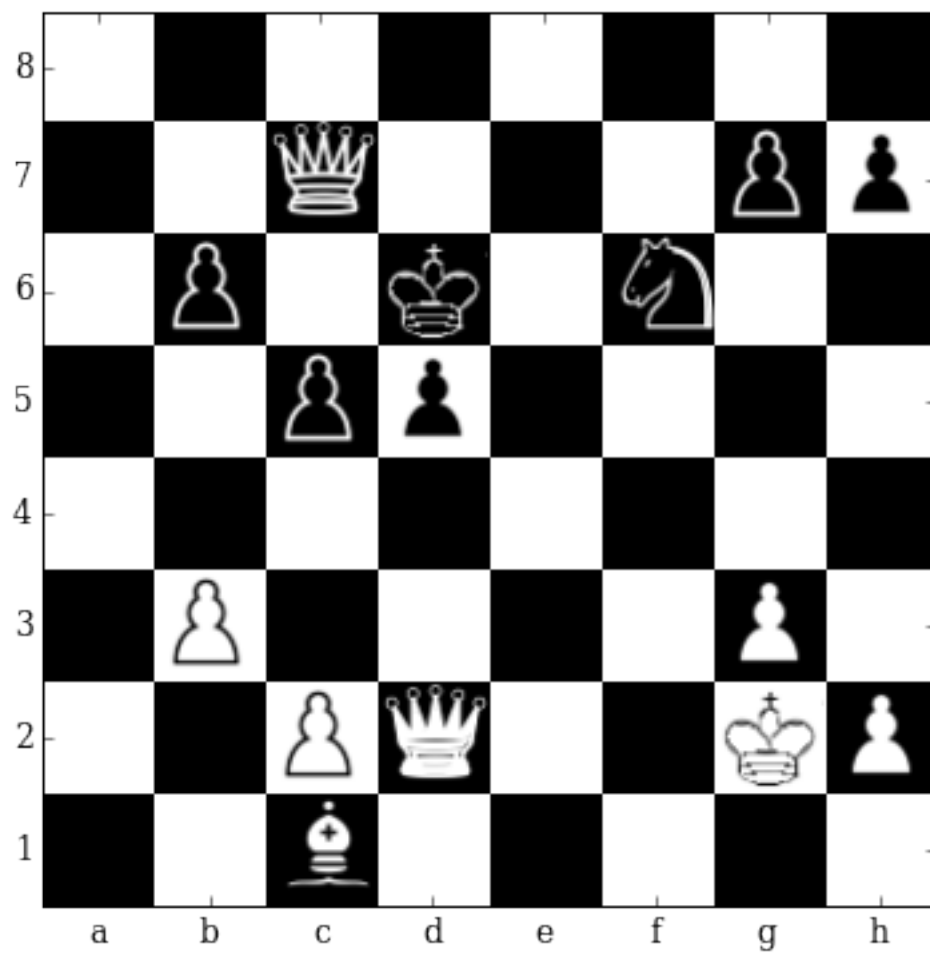
d2f4 0.0116871567443



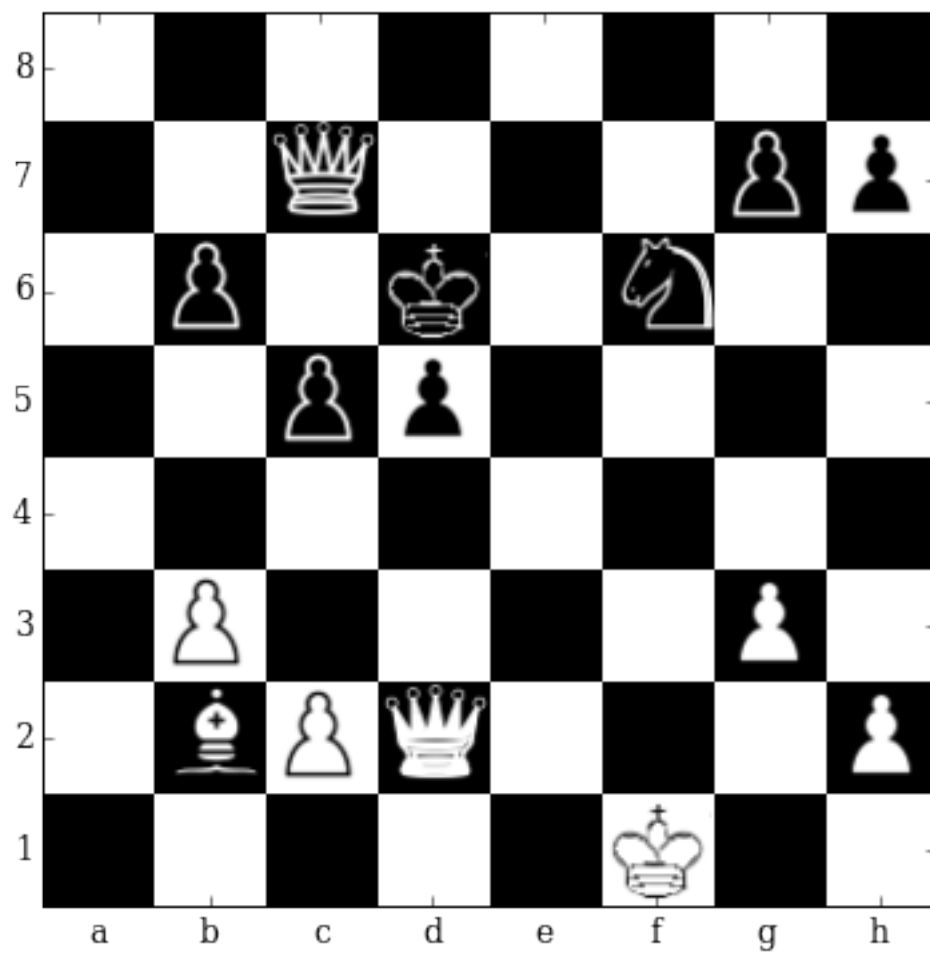
d2e2 0.00281526707113
 WORST 5 Moves



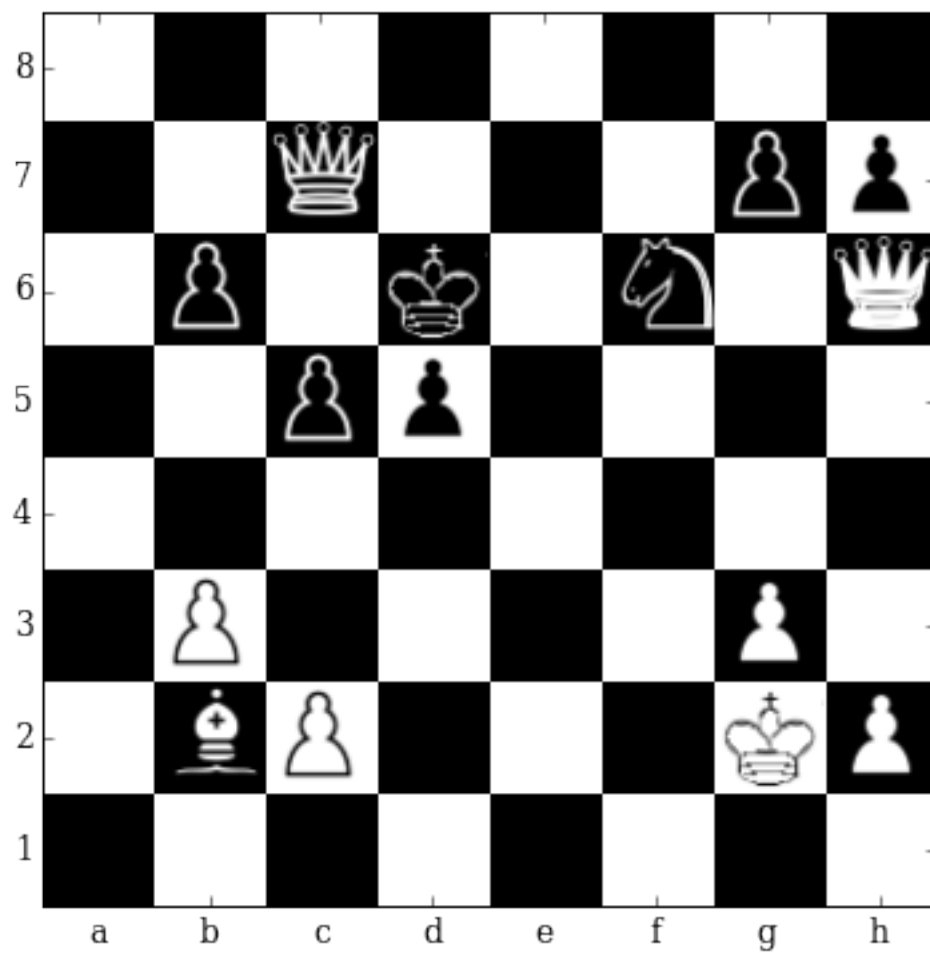
b2a1 -0.030913002789



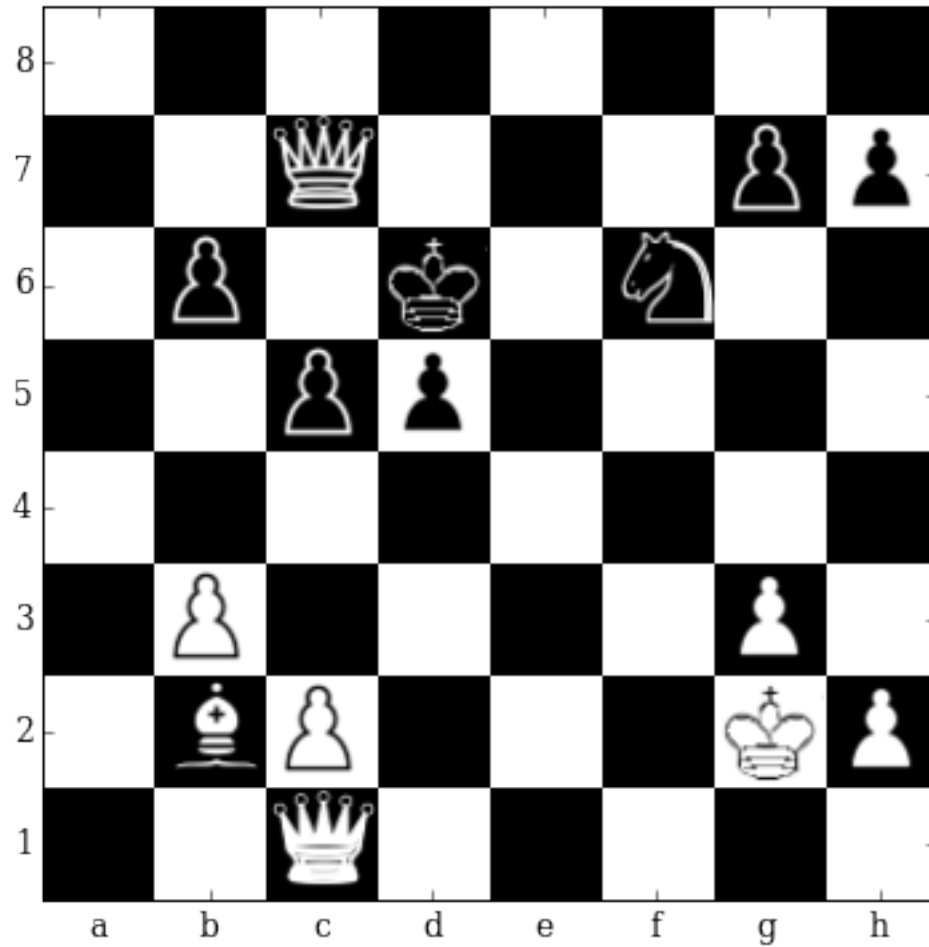
b2c1 -0.0322335138917



g2f1 -0.0335339568555



d2h6 -0.0337856262922



d2c1 -0.0525860711932

In [24]: fen='8/2q3pp/1p1k1n2/2pp4/8/1P4P1/1BPQ2KP/8 w - - 0 0'

move = top_bottom_moves(fen, 1)

pos = parseFEN(fen)

print pos.board

print evaluator.evaluate(np.rollaxis(convert_bitboard_to_image(pos.board), 2, 0))

move= "c5e5"

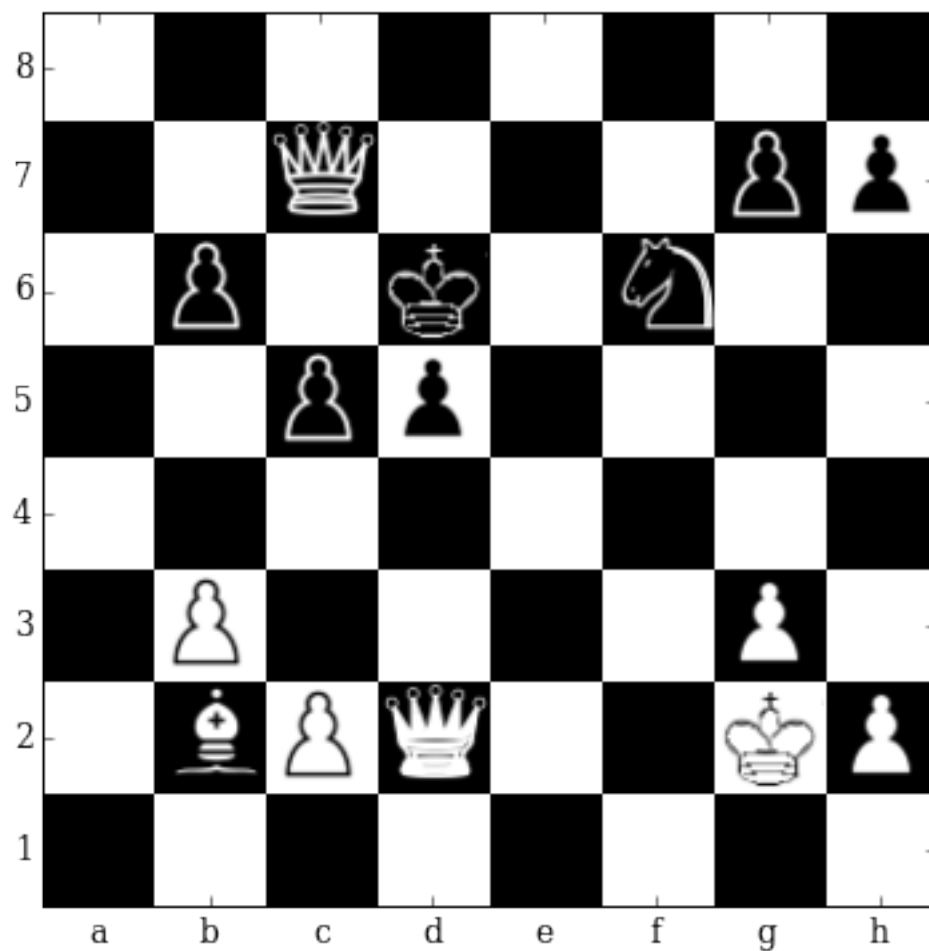
crdn = (sunfish.parse(move[0:2]), sunfish.parse(move[2:4]))

print pos.move(crdn).rotate().board

print evaluator.evaluate(np.rollaxis(convert_bitboard_to_image(pos.move(crdn).rotate().board),

print pos.move(crdn).board

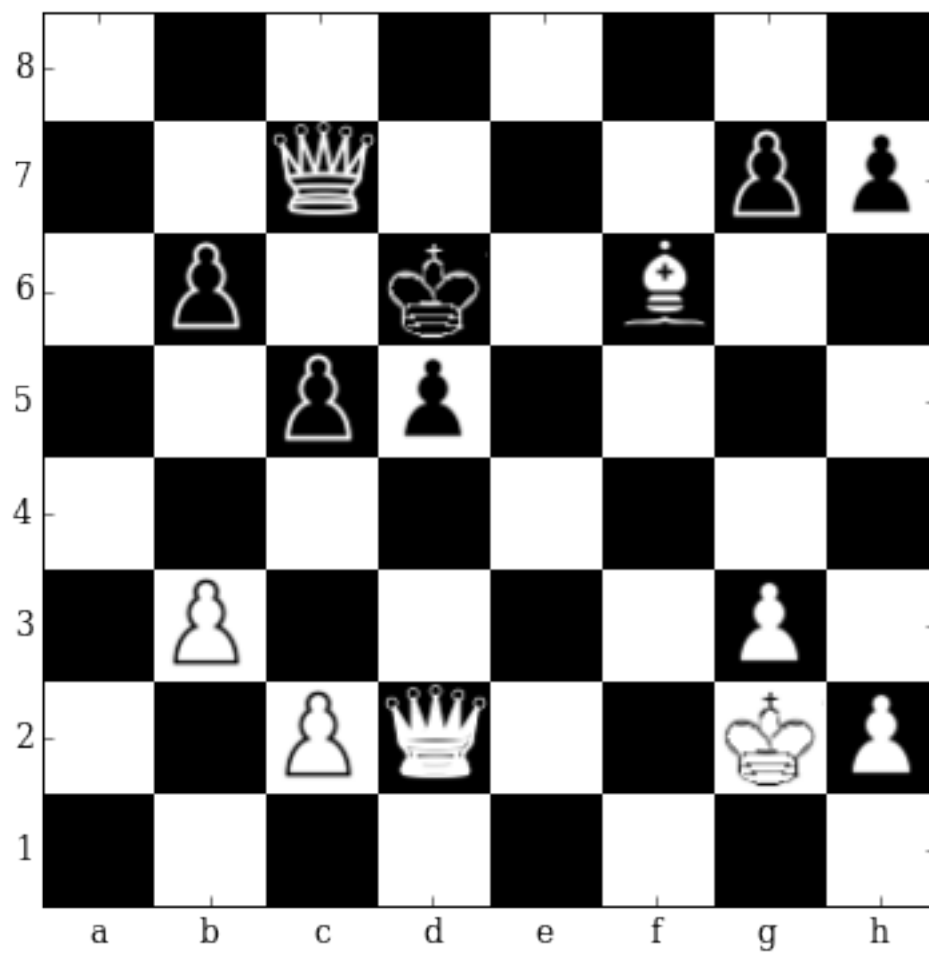
print evaluator.evaluate(np.rollaxis(convert_bitboard_to_image(pos.move(crdn).board), 2, 0))



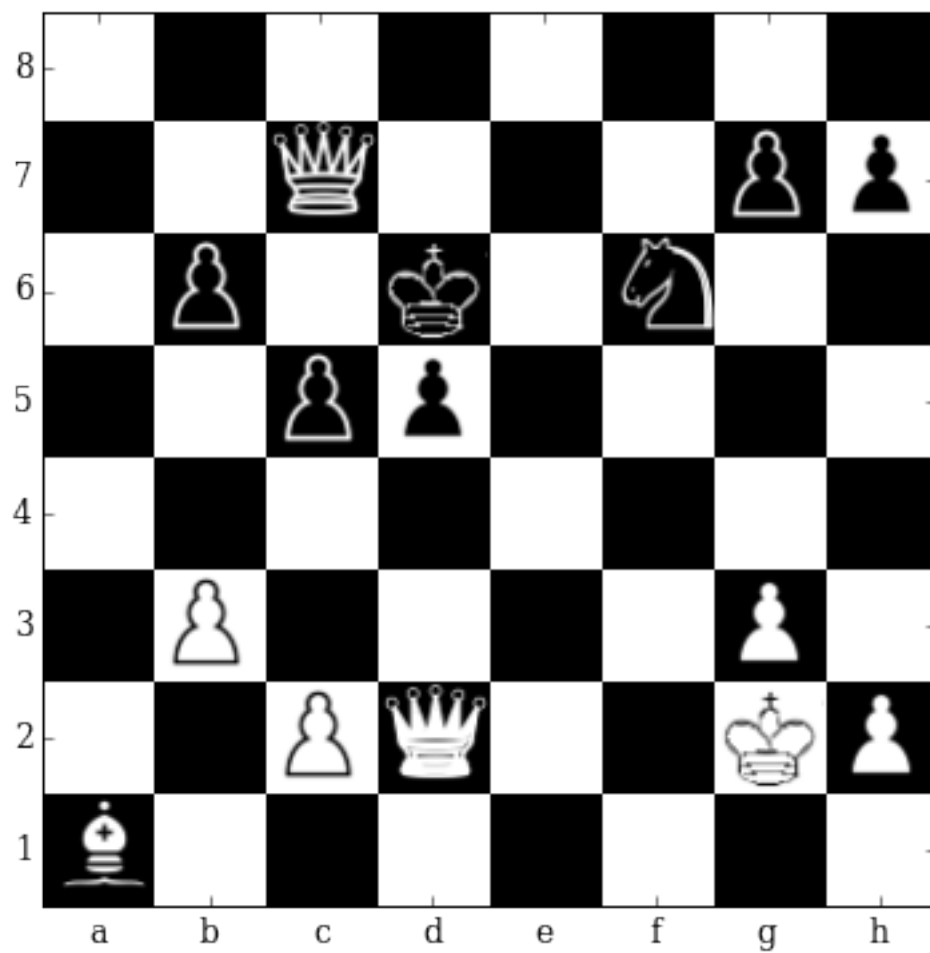
Current evaluation: -0.022609

Total 34 moves possible

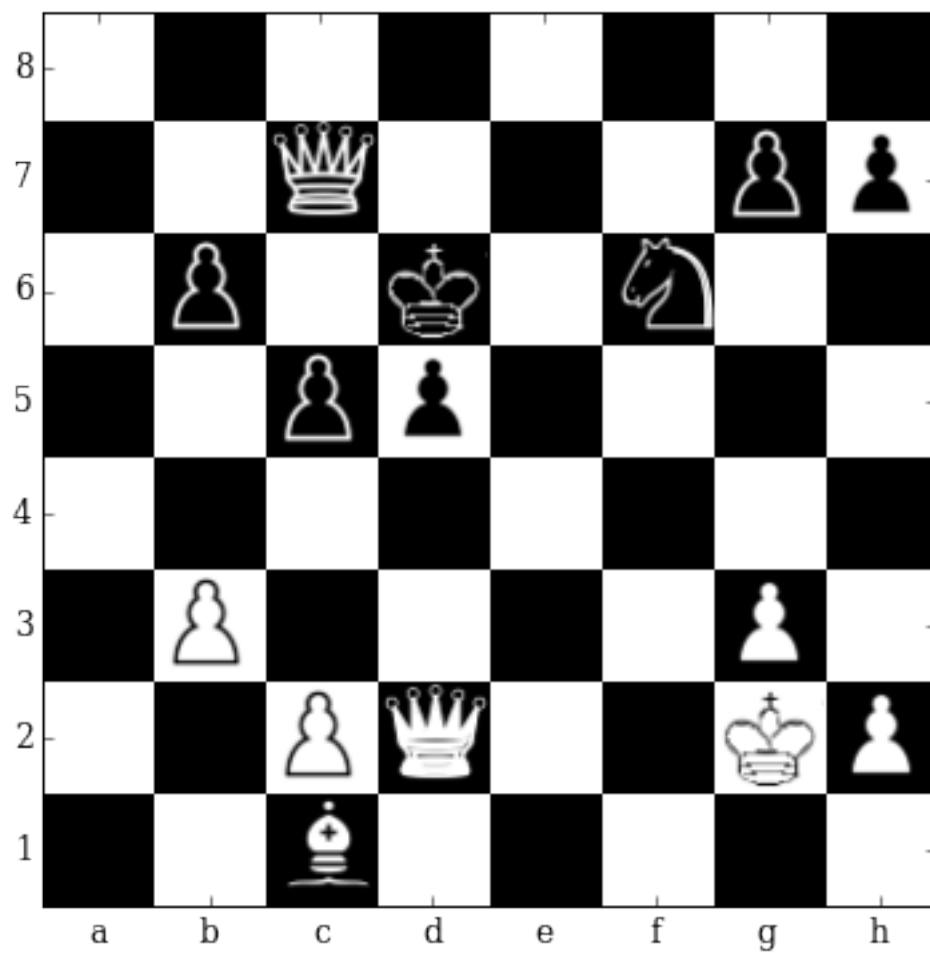
TOP 5 Moves



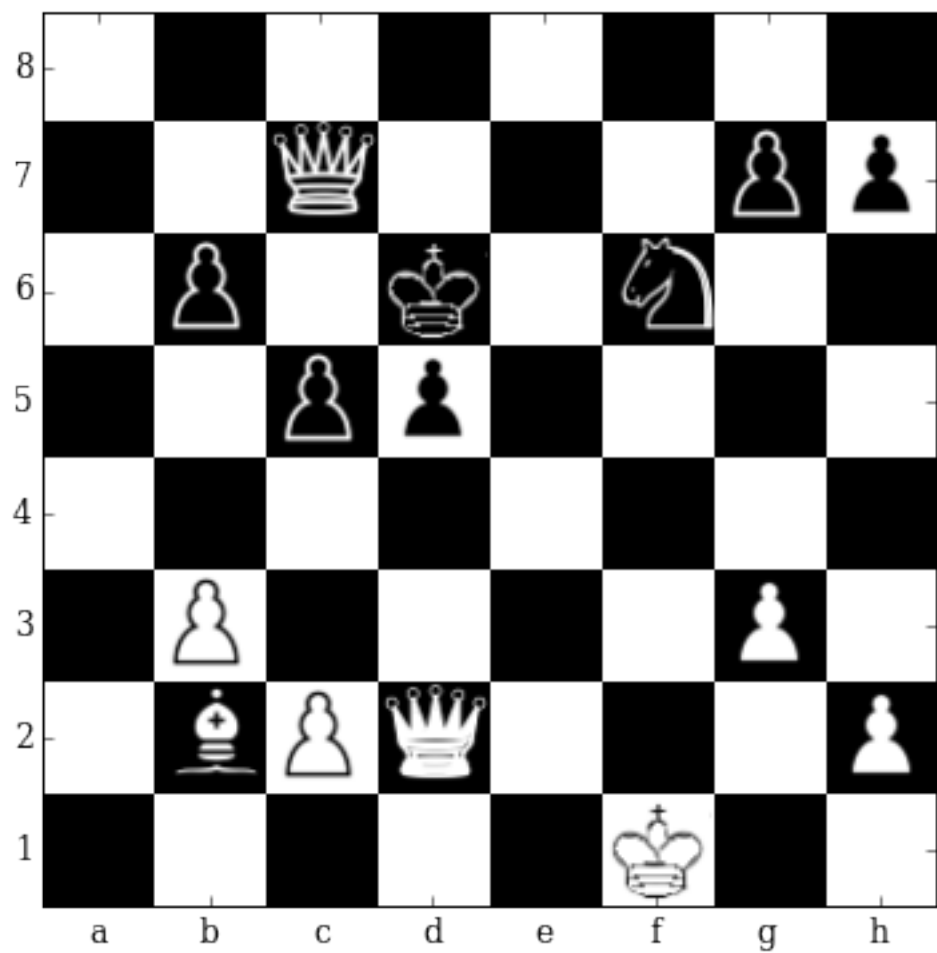
b2f6 0.0331075526774
 WORST 5 Moves



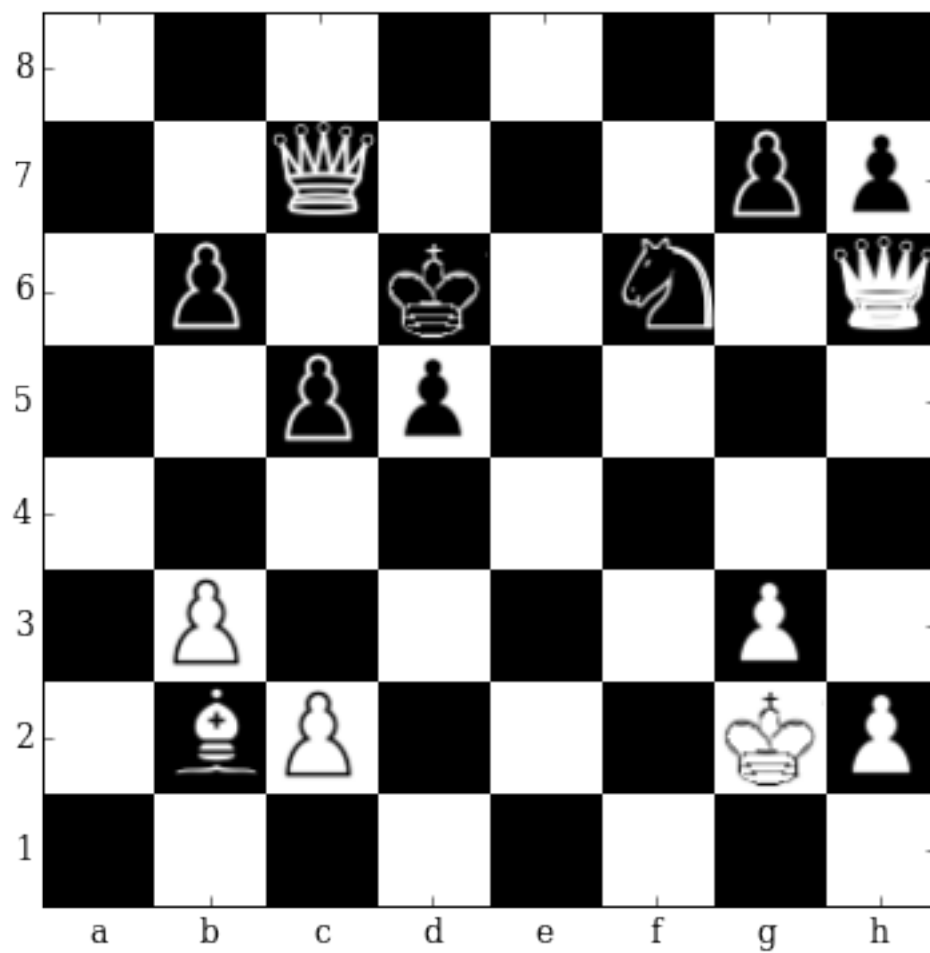
b2a1 -0.0309130176902



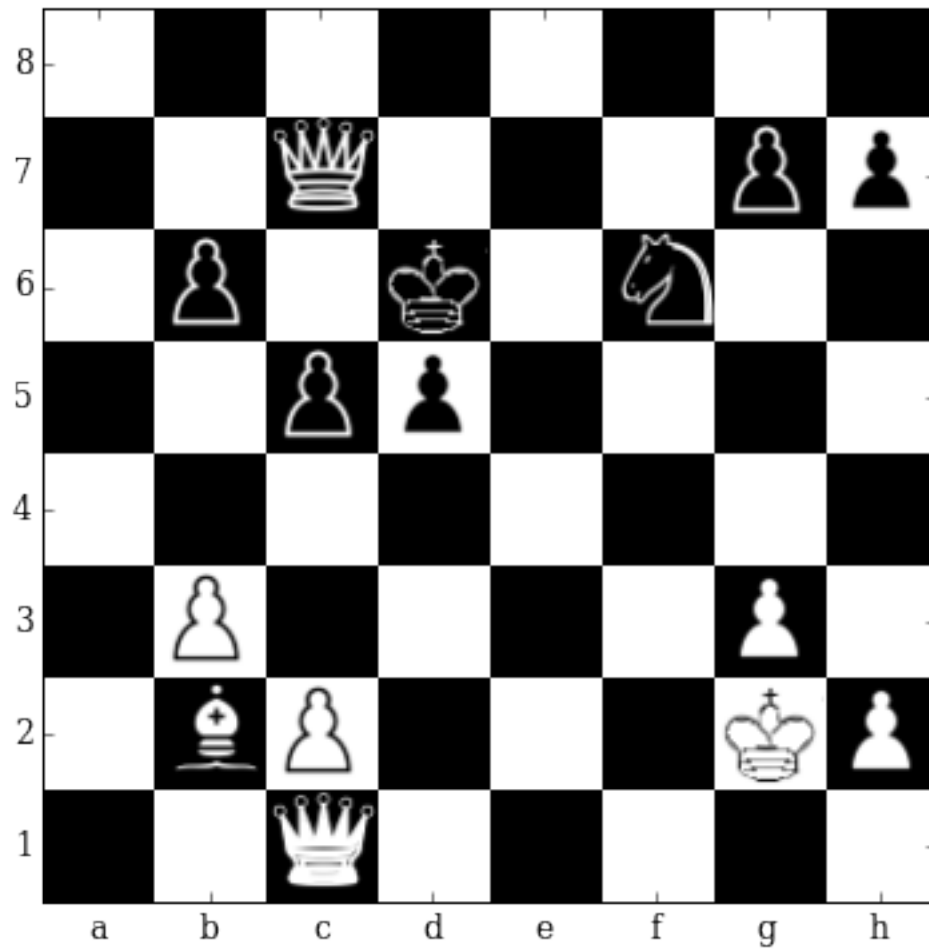
b2c1 -0.0322334840894



g2f1 -0.0335339941084



d2h6 -0.0337856411934



d2c1 -0.0525860711932

```
...
..q...pp
.p.k.n..
..pp...
...
.P...P.
.BPQ..KP
...
```

-0.0226090531796

KeyError

Traceback (most recent call last)

```
<ipython-input-24-457a27f4848b> in <module>()
    6 move= "c5e5"
```

```

    7 crdn = (sunfish.parse(move[0:2]), sunfish.parse(move[2:4]))
----> 8 print pos.move(crdn).rotate().board
    9 print evaluator.evaluate(np.rollaxis(convert_bitboard_to_image(pos.move(crdn).rotate()).board
   10 print pos.move(crdn).board

```

```

/data/sunfish/sunfish.pyc in move(self, move)
   180         board = self.board
   181         wc, bc, ep, kp = self.wc, self.bc, 0, 0
--> 182         score = self.score + self.value(move)
   183         # Actual move
   184         board = put(board, j, board[i])

```

```

/data/sunfish/sunfish.pyc in value(self, move)
   211         p, q = self.board[i], self.board[j]
   212         # Actual move
--> 213         score = pst[p][j] - pst[p][i]
   214         # Capture
   215         if q.islower():

```

KeyError: 'p'

```

In [25]: import h5py as h5
        y = h5.File("/data/ConvChess/data/all_data_g09_pb_h5/piece.h5")
        y = y['label']

```

```

In [26]: y = y[0:1000000]
        print np.std(y)
        print np.var(y)

```

```

0.361267
0.130514

```

```

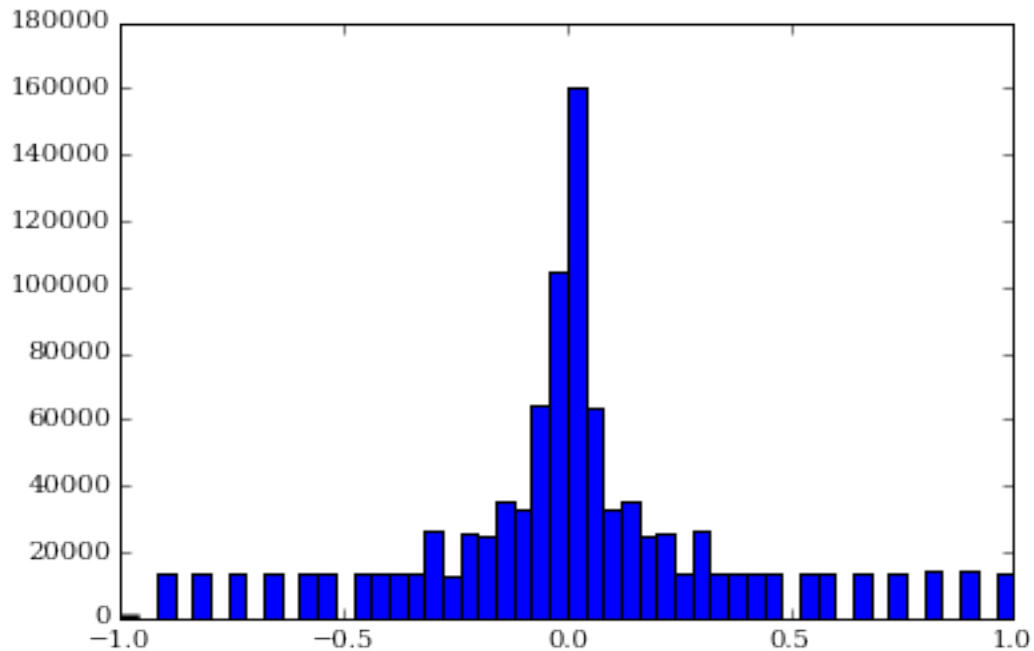
In [27]: #evaluator = CNN_evaluator('regression_models/model_CvC_g09.pkl')

```

```

In [30]: %matplotlib inline
        import matplotlib.cm as cm
        plt.hist(y, bins=50)
        plt.show()

```



```
In [29]: tables = np.load("/data/ConvChess/data/fics_regression_g07/X_80000_88000.npz")
         tables = tables['arr_0']
         print "Number of tables: %d"%len(tables)
         evaluations = evaluator.evaluate_batch(tables)
         tablevals = np.zeros(tables.shape[0])
         for i, table in enumerate(tables):
             tablevals[i] = im_to_tableval(table)
         print np.corrcoef(evaluations, tablevals)
```

```
Number of tables: 665727
[[ 1.          0.81938201]
 [ 0.81938201  1.          ]]
```

```
In [ ]:
```