# **ML LAB ASSIGNMENT 1**

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Design and implement machine learning algorithm using least means square learning rule to play checkers game. The training experience should be generated by the program playing game with itself.

```
# for mathematical operations
import numpy as np
import time
import random
from tqdm import tqdm
# for the GUI
import pygame
# for the plot of error
import matplotlib.pyplot as plt
✓ 0.6s
```

basic libraries required for this implementation

```
class Board:
   def __init__(self):
       self.board = np.zeros((10, 10), dtype=int)
       player1_positions = [ (6, 0), (6, 2), (6, 4), (6, 6), (6,8), (7, 1), (7, 3),
                            (7, 5), (7, 7), (7,9), (8, 0), (8, 2), (8, 4), (8, 6),
                            (8,8),(9,1),(9,3),(9,5),(9,7),(9,9)
       player2_positions = [(0, 0), (0, 2), (0, 4), (0, 6), (0,8), (1, 1),
                            (1, 3), (1, 5), (1, 7), (1,9), (2, 0), (2, 2),
                            (2,4), (2,6), (2,8), (3,1), (3,3), (3,5), (3,7), (3,9)
       for pos in player1 positions:
           self.board[pos] = 1
        for pos in player2 positions:
           self.board[pos] = 2
   def print board(self):
       RED = '\033[91m']
       BLUE = '\033[94m'
       RESET = '\033[0m'
       for row in self.board:
           for item in row:
               if item == 1 :
                   print(RED + str(item) + RESET, end=' ')
               elif item == 2:
                   print(BLUE + str(item) + RESET, end=' ')
               elif item == 11:
                   print(RED + str(item) + RESET, end=' ')
               elif item == 22:
                   print(BLUE + str(item) + RESET, end=' ')
               else:
                   print(item, end=' ')
           print()
```

Board class with board initialization And printing board function

```
board_stats(self):
# Returns the number of pieces for each player and the number of pieces that can jump for each player
# [player, player 1 pieces, player 2 pieces, player 1 pieces that can jump, player 2 pieces that can jump, player 1 kings, player 2 kings]
stats = [1, np.sum(self.board == 1)+np.sum(self.board == 11), np.sum(self.board == 2)+np.sum(self.board == 22), 0, 0, 0, 0, 0]
     self.board[1, ]] == 1:
if i · 1 >= 0 and j · 1 >= 0:
if (self.board[i · 1, j · 1] == 2 or self.board[i · 1, j · 1] == 22) and i · 2 >= 0 and j · 2 >= 0 and self.board[i · 2, j · 2] == 0:
               if i - 1 >= 0 and j + 1 <= 9:

if (self.board[i - 1, j + 1] == 2 or self.board[i - 1, j + 1] == 22) and i - 2 >= 0 and j + 2 <= 9 and self.board[i - 2, j + 2] == 0:
          stats[3] += 1
# how many player 1 is player 2 threathening
          elif self.board[i, j] == 2:
               if i + 1 <= 9 and j - 1 >= 0:

if (self.board[i + 1, j - 1] == 1 or self.board[i + 1, j - 1] == 11) and i + 2 <= 9 and j - 2 >= 0 and self.board[i + 2, j - 2] == 0:
               | stats[4] += 1
if i + 1 <= 9 and j + 1 <= 9:
    if (self.board[i + 1, j + 1] == 1 or self.board[i + 1, j + 1] == 11) and i + 2 <= 9 and j + 2 <= 9 and self.board[i + 2, j + 2] == 0:
          | stats[4] += 1
# player 1 king
               stats[5]+=1
               # top left

if i - 1 >= 0 and j - 1 >= 0:

if (self.board[i - 1, j - 1] == 2 or self.board[i - 1, j - 1] == 22) and i - 2 >= 0 and j - 2 >= 0 and self.board[i - 2, j - 2] == 0:
               if i - 1 >= 0 and j + 1 <= 9:
| if (self.board[i - 1, j + 1] == 2 or self.board[i - 1, j + 1] == 22) and i - 2 >= 0 and j + 2 <= 9 and self.board[i - 2, j + 2] == 0:
                        stats[3] += 1
               if i + 1 <= 9 and j - 1 >= 0:

if (self.board[i + 1, j - 1] == 2 or self.board[i + 1, j - 1] == 22) and i + 2 <= 9 and j - 2 >= 0 and self.board[i + 2, j - 2] == 0:
               if i + 1 <= 9 and j + 1 <= 9:

if (self.board[i + 1, j + 1] == 2 or self.board[i + 1, j + 1] == 22) and i + 2 <= 9 and j + 2 <= 9 and self.board[i + 2, j + 2] == 0:
                         stats[3] += 1
            elif self.board[i,j]==22:
                 if i + 1 <= 9 and j · 1 >= 0:

if (self.board[i + 1, j · 1] == 1 or self.board[i + 1, j · 1] == 11) and i + 2 <= 9 and j · 2 >= 0 and self.board[i + 2, j · 2] == 0:
                 # Dot Comm - Sign:

| if i + 1 <= 9 and j + 1 <= 9:

| if (self.board[i + 1, j + 1] == 1 or self.board[i + 1, j + 1] == 11) and i + 2 <= 9 and j + 2 <= 9 and self.board[i + 2, j + 2] == 0:
                     if (self.board[i - 1, j - 1] == 1 or self.board[i - 1, j - 1] == 11) and i - 2 >= 0 and j - 2 >= 0 and self.board[i - 2, j - 2] == 0:
                 if i - 1 >= 0 and j + 1 <= 9:

if (self.board[i - 1, j + 1] == 1 or self.board[i - 1, j + 1] == 11) and i - 2 >= 0 and j + 2 <= 9 and self.board[i - 2, j + 2] == 0:
```

STATS-> returns the xi values for the board state

stats[4] += 1

```
def get moves(self, player):
       normal moves = []
       kill moves = []
           for j in range(10):
               if self.board[i, j] == player or self.board[i, j] == player
 11:
                   if player == 1:
                       if self.board[i, j] == 1:
                               if (self.board[i - 1, j - 1] == 2 or
self.board[i - 1, j - 1] == 22) and i - 2 >= 0 and j - 2 >= 0 and
self.board[i - 2, j - 2] == 0:
                                    kill moves.append([i, j, i-1, j-1])
                                if self.board[i - 1, j - 1] == 0:
                                    normal moves.append([i, j, i - 1, j -
1])
                               if (self.board[i - 1, j + 1] == 2 \text{ or}
self.board[i - 1, j + 1] == 22) and i - 2 >= 0 and j + 2 <= 9 and
self.board[i - 2, j + 2] == 0:
                                    kill moves.append([i, j, i - 1, j + 1])
                               if self.board[i - 1, j + 1] == 0:
                                    normal moves.append([i, j, i - 1, j +
1])
                       elif self.board[i,j]==11:
                               if (self.board[i - 1, j - 1] == 2 \text{ or}
self.board[i - 1, j - 1] == 22) and i - 2 >= 0 and j - 2 >= 0 and
self.board[i - 2, j - 2] == 0:
                                    kill_moves.append([i, j, i - 1, j - 1])
                                if self.board[i - 1, j - 1] == 0:
                                    normal_moves.append([i, j, i - 1, j -
1])
```

```
if (self.board[i - 1, j + 1] == 2 \text{ or}
self.board[i - 1, j + 1] == 22) and i - 2 >= 0 and j + 2 <= 9 and
self.board[i - 2, j + 2] == 0:
                                kill moves.append([i, j, i - 1, j + 1])
                                normal_moves.append([i, j, i - 1, j +
1])
                            if (self.board[i + 1, j - 1] == 2 \text{ or}
self.board[i + 1, j - 1] == 22) and i + 2 <= 9 and j - 2 >= 0 and
self.board[i + 2, j - 2] == 0:
                                kill moves.append([i, j, i + 1, j - 1])
                            if self.board[i + 1, j - 1] == 0:
                                normal moves.append([i, j, i + 1, j -
1])
self.board[i + 2, j + 2] == 0:
                                kill moves.append([i, j, i + 1, j + 1])
                                normal moves.append([i, j, i + 1, j +
1])
                     if self.board[i, j] == 2:
                            if (self.board[i + 1, j - 1] == 1 \text{ or}
self.board[i + 1, j - 1] == 11) and i + 2 \le 9 and j - 2 >= 0 and
self.board[i + 2, j - 2] == 0:
                                kill moves.append([i, j, i + 1, j - 1])
                            if self.board[i + 1, j - 1] == 0:
                                normal moves.append([i, j, i + 1, j -
1])
                            if (self.board[i + 1, j + 1] == 1 \text{ or}
self.board[i + 2, j + 2] == 0:
                                kill moves.append([i, j, i + 1, j + 1])
```

```
if self.board[i + 1, j + 1] == 0:
                                   normal moves.append([i, j, i + 1, j +
1])
                       elif self.board[i,j]==22:
self.board[i + 1, j - 1] == 11) and i + 2 <= 9 and j - 2 >= 0 and
self.board[i + 2, j - 2] == 0:
                                   kill moves.append([i, j, i + 1, j - 1])
                                   normal moves.append([i, j, i + 1, j -
11)
                           if i + 1 \le 9 and j + 1 \le 9:
                               if (self.board[i + 1, j + 1] == 1 \text{ or}
self.board[i + 1, j + 1] == 11) and i + 2 \le 9 and j + 2 \le 9 and
self.board[i + 2, j + 2] == 0:
                                   kill moves.append([i, j, i + 1, j + 1])
                               if self.board[i + 1, j + 1] == 0:
                                   normal moves.append([i, j, i + 1, j +
1])
self.board[i - 1, j - 1] == 11) and i - 2 >= 0 and j - 2 >= 0 and
self.board[i - 2, j - 2] == 0:
                                   kill moves.append([i, j, i-1, j-1])
                               if self.board[i - 1, j - 1] == 0:
                                   normal moves.append([i, j, i - 1, j -
1])
self.board[i - 1, j + 1] == 11) and i - 2 >= 0 and j + 2 <= 9 and
self.board[i - 2, j + 2] == 0:
                                   kill moves.append([i, j, i - 1, j + 1])
                               if self.board[i - 1, j + 1] == 0:
                                   normal moves.append([i, j, i - 1, j +
1])
```

```
if len(kill_moves)>0:
    return kill_moves
else:
    return normal_moves
```

GETMOVES: this function returns the next move that any color piece can take based on available moves, also if any kill moves available it chooses it first

```
def get available moves(self, player, row, col):
      normal moves = []
       kill moves = []
      if player == 1 : # Player 1's piece or king
           if self.board[row][col] in [1, 11]:
               if row - 1 >= 0:
                   if col - 1 \ge 0 and self.board[row - 1][col - 1] == 0:
                       normal moves.append((row - 1, col - 1))
                   elif col - 2 \ge 0 and (self.board[row - 1][col - 1] ==
2 or self.board[row - 1][col - 1] == 22) and self.board[row - 2][col - 2]
                       kill moves.append((row - 2, col - 2))
               if row - 1 >= 0:
                   if col + 1 < 10 and self.board[row - 1][col + 1] == 0:
                       normal moves.append((row - 1, col + 1))
                   elif col + 2 < 10 and (self.board[row - 1][col + 1] ==
2 or self.board[row - 1][col + 1] == 22) and self.board[row - 2][col + 2]
                       kill moves.append((row - 2, col + 2))
diagonals for kings
               if self.board[row][col] == 11:
                   print("here")
                   if row + 1 < 10:
                       if col - 1 \ge 0 and self.board[row + 1][col - 1] ==
0:
                           normal moves.append((row + 1, col - 1))
```

This is a small modified version of get moves function, used by the gui to show next moves for the player

This check function updates if any piece is a king or not after every move it is called for the updation

#### THE MAIN LMS CODE:

```
board = Board()
board.print board()
# Initialize weights
error = []
weights = [-0.5, 1, -1, 1, -1, 1, -1]
learning rate = 0.1
one wins = 0
two wins = 0
# Play 100 games
for i in tqdm(range(100)):
  board = Board()
  while True:
      moves = board.get moves(1)
      if len(moves) == 0:
          error.append(MSE)
      best value = -100000000
      curr value = weights[0] + weights[1] * stats[1] + weights[2] *
stats[2] + weights[3] * stats[3] + weights[4] * stats[4] + weights[5] *
stats[5] + weights[6] * stats[6]
best move
      for move in moves:
```

```
new board.board = np.copy(board.board)
           if new board.board[move[2], move[3]] == 2 or
new board.board[move[2],move[3]]==22:
new board.board[move[2]+(move[2]-move[0]),move[3]+(move[3]-move[1])]=board
.board[move[0], move[1]]
               new board.board[move[2], move[3]]=0
               new board.board[move[2], move[3]] = board.board[move[0],
move[1]]
           new board.board[move[0], move[1]] = 0
           new stats = new board.board stats()
           value = weights[0] + weights[1] * new stats[1] + weights[2] *
new stats[2] + weights[3] * new stats[3] + weights[4] * new stats[4] +
weights[5] * new stats[5] + weights[6] * new stats[6]
           if value > best value:
               best value = value
               best move = move
       if board.board[best move[2], best move[3]] == 2 or
board.board[best move[2],best move[3]]==22:
board.board[best move[2]+(best move[2]-best move[0]),best move[3]+(best mo
ve[3]-best move[1])]=board.board[best move[0],best move[1]]
               board.board[best move[2], best move[3]]=0
           board.board[best move[2], best move[3]] =
board.board[best move[0], best move[1]]
           weights[j] += learning_rate * stats[j] * (best_value -
      MSE+= (best value - curr value) **2
```

```
board.check(1)
      moves = board.get moves(2)
      if len(moves) == 0:
          error.append(MSE)
      stats = board.board stats()
      best move = []
      best value = 100000000
       curr value = weights[0] + weights[1] * stats[1] + weights[2] *
stats[2] + weights[3] * stats[3] + weights[4] * stats[4] + weights[5] *
stats[5] + weights[6] * stats[6]
           for move in moves:
               new board = Board()
               new board.board = np.copy(board.board)
               if new board.board[move[2], move[3]] == 1 or
new board.board[move[2],move[3]]==11:
new board.board[move[2]+(move[2]-move[0]),move[3]+(move[3]-move[1])]=board
.board[move[0], move[1]]
                   new board.board[move[2], move[3]]=0
                   new board.board[move[2], move[3]] =
board.board[move[0], move[1]]
               new board.board[move[0], move[1]] = 0
               value = weights[0] + weights[1] * new_stats[1] + weights[2]
 new_stats[2] + weights[3] * new_stats[3] + weights[4] * new_stats[4] +
weights[5] * new stats[5] + weights[6] * new stats[6]
```

```
if value < best value:</pre>
                   best value = value
                   best move = move
           best move = random.choice(moves)
           new board.board = np.copy(board.board)
           if new board.board[best move[2], best move[3]] == 1 or
new board.board[best move[2],best move[3]]==11:
new board.board[best move[2]+(best move[2]-best move[0]),best move[3]+(bes
t move[3]-best move[1])]=board.board[best move[0],best move[1]]
                   new board.board[best move[2],best move[3]]=0
               new board.board[best move[2], best move[3]] =
board.board[best move[0], best move[1]]
           new board.board[best move[0], best move[1]] = 0
           new stats = new board.board stats()
           best value = weights[0] + weights[1] * new stats[1] +
weights[2] * new_stats[2] + weights[3] * new_stats[3] + weights[4] *
new stats[4] + weights[5] * new stats[5] + weights[6] * new stats[6]
       if board.board[best move[2], best move[3]] == 1 or
board.board[best move[2],best move[3]]==11:
board.board[best move[2]+(best move[2]-best move[0]),best move[3]+(best mo
ve[3]-best move[1])]=board.board[best move[0],best move[1]]
               board.board[best move[2],best move[3]]=0
board.board[best move[0], best move[1]]
       board.board[best move[0], best move[1]] = 0
           weights[j] += learning_rate * stats[j] * (best_value -
```

```
board.check(2)
print("Player 1 wins : ", one_wins)
print("Player 2 wins : ", two_wins)
print(weights)
```

Here we allow it to play 100 or 1000 games with itself using the LMS rule and also updating the error, weights for the xi's so that we can train it to get the best optimal move

For player 2: this player is sub-optimal which means it has a 50% probability of choosing the optimal moves based on the weights and the rest of the time it selects any random move, this creates randomness using which player 1 can learn even better.

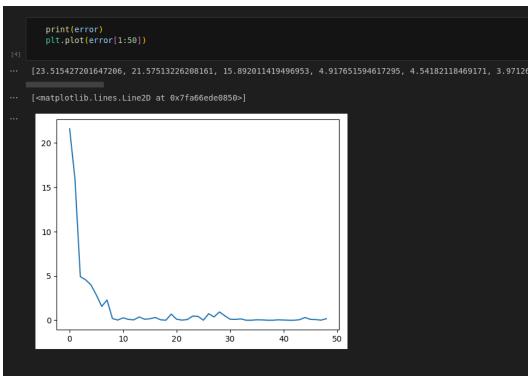
After training for 2 min and 15 sec it played 100 games against itself, and player 1 won 63 games whereas player 2 won 37.

Alse we can see the weights,

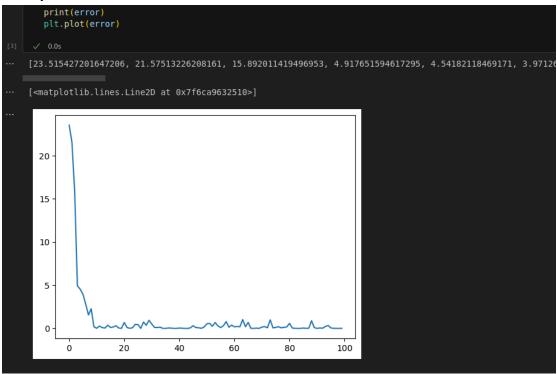
Npw we use these weights to play with the algorithm, ie us against the trained weights

after 1000 games(23 minutes): [0.054537615797118105, 2.3236704114554607e-13, 4.567999037113247e-13, 6.521783448117344e-14, -6.68272507123147e-14, 8.902002357840587e-13, -1.3058832144047386e-12]

#### **ERROR PLOT:**



#### Error plot for the first 50 entries



ERROR plot against first 100 entries (100 games)

### **GUI** using pygame:

```
class CheckersGui:
      pygame.init()
       self.WIDTH, self.HEIGHT = 1000, 1000
       self.ROWS, self.COLS = 10, 10
       self.SQUARE SIZE = self.HEIGHT // self.ROWS
       self.chance = 0
       self.WHITE = (245, 222, 179)
       self.RED = (0, 0, 0)
       self.GREEN = (255, 255, 255)
       self.screen = pygame.display.set mode((self.WIDTH, self.HEIGHT))
      pygame.display.set caption('Checkers')
       self.board = board
       for row in range(self.ROWS):
              pygame.draw.rect(self.screen, self.BROWN, (col *
self.SQUARE SIZE, row * self.SQUARE SIZE, self.SQUARE SIZE,
self.SQUARE SIZE))
  def draw checkers(self):
      for row in range(self.ROWS):
           for col in range (self.COLS):
               if self.board.board[row][col] == 1: # Player 1's checker
```

```
pygame.draw.circle(self.screen, self.RED, (col *
self.SQUARE SIZE + self.SQUARE SIZE // 2, row * self.SQUARE SIZE +
self.SQUARE SIZE // 2), self.SQUARE SIZE // 3)
             elif self.board.board[row][col] == 2: # Player 2's checker
                 pygame.draw.circle(self.screen, self.GREEN, (col *
self.SQUARE SIZE + self.SQUARE SIZE // 2, row * self.SQUARE SIZE +
self.SQUARE SIZE // 2), self.SQUARE SIZE // 3)
             elif self.board.board[row][col] == 11: # Player 1's king
                 pygame.draw.circle(self.screen, self.RED, (col *
self.SQUARE SIZE + self.SQUARE SIZE // 2, row * self.SQUARE SIZE +
self.SQUARE SIZE // 2), self.SQUARE SIZE // 3)
                 pygame.draw.circle(self.screen, self.WHITE, (col *
self.SQUARE SIZE // 2), self.SQUARE SIZE // 6)
             elif self.board.board[row][col] == 22: # Player 2's king
                 pygame.draw.circle(self.screen, self.GREEN, (col *
self.SQUARE SIZE + self.SQUARE SIZE // 2, row * self.SQUARE SIZE +
self.SQUARE SIZE // 2), self.SQUARE SIZE // 3)
                 pygame.draw.circle(self.screen, self.WHITE, (col *
self.SQUARE SIZE + self.SQUARE SIZE // 2, row * self.SQUARE SIZE +
self.SQUARE SIZE // 2), self.SQUARE SIZE // 6)
  def update display(self):
      self.screen.fill(self.WHITE)
      self.draw board()
      self.draw checkers()
      pygame.display.flip()
  def display possible moves(self, moves):
      self.update display()
      for move in moves:
          row, col = move
          pygame.draw.circle(self.screen, self.BLUE, (col *
self.SQUARE SIZE // 2), self.SQUARE SIZE // 8)
```

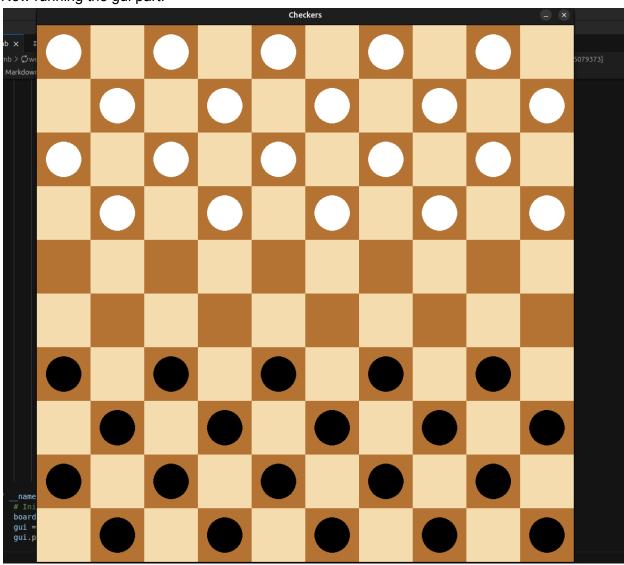
```
def computer move(self):
      moves = self.board.get moves(2)
      print(moves)
      if len(moves) == 0:
          stats = board.board stats()
          best move = []
          best value = 100000000
           curr value = weights[0] + weights[1] * stats[1] + weights[2] *
stats[2] + weights[3] * stats[3] + weights[4] * stats[4] + weights[5] *
stats[5] + weights[6] * stats[6]
           for move in moves:
               new board = Board()
               new board.board = np.copy(board.board)
               if new board.board[move[2], move[3]] == 1 or
new_board.board[move[2], move[3]]==11:
new board.board[move[2]+(move[2]-move[0]),move[3]+(move[3]-move[1])]=board
.board[move[0], move[1]]
                   new board.board[move[2], move[3]] =
board.board[move[0], move[1]]
               new board.board[move[0], move[1]] = 0
               new stats = new board.board stats()
               value = weights[0] + weights[1] * new stats[1] + weights[2]
 new stats[2] + weights[3] * new stats[3] + weights[4] * new stats[4] +
weights[5] * new stats[5] + weights[6] * new stats[6]
                  best value = value
```

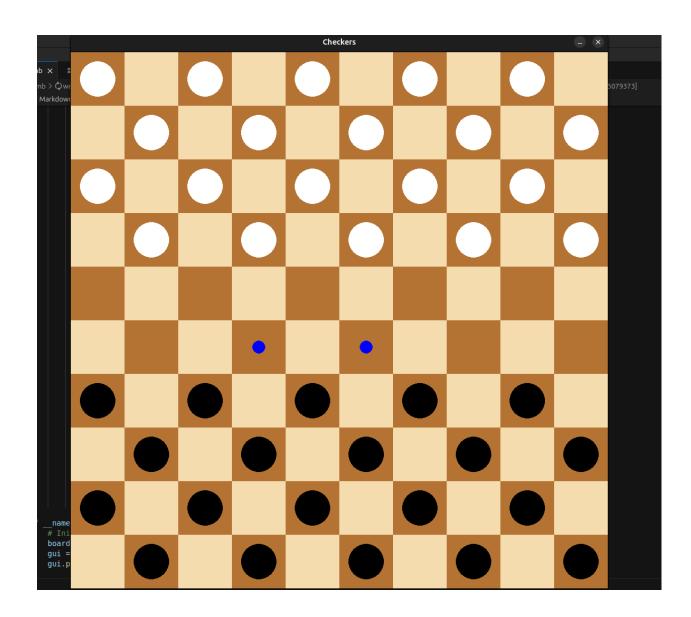
```
if board.board[best move[2], best move[3]] == 1 or
board.board[best move[2],best move[3]]==11:
board.board[best move[2]+(best move[2]-best move[0]),best move[3]+(best mo
ve[3]-best move[1])]=board.board[best move[0],best move[1]]
               board.board[best move[2], best move[3]] =
board.board[best move[0], best move[1]]
           board.board[best move[0], best move[1]] = 0
           self.board.check(2)
           self.update display()
  def play(self):
       self.update display()
       running = True
       curr moves = []
       flag = 0
           for event in pygame.event.get():
               if event.type == pygame.QUIT:
                   running = False
               elif event.type == pygame.MOUSEBUTTONDOWN:
                   x, y = pygame.mouse.get pos()
                   row = y // self.SQUARE SIZE
                   col = x // self.SQUARE_SIZE
                   for move in curr moves:
                       if row == move[0] and col == move[1]:
```

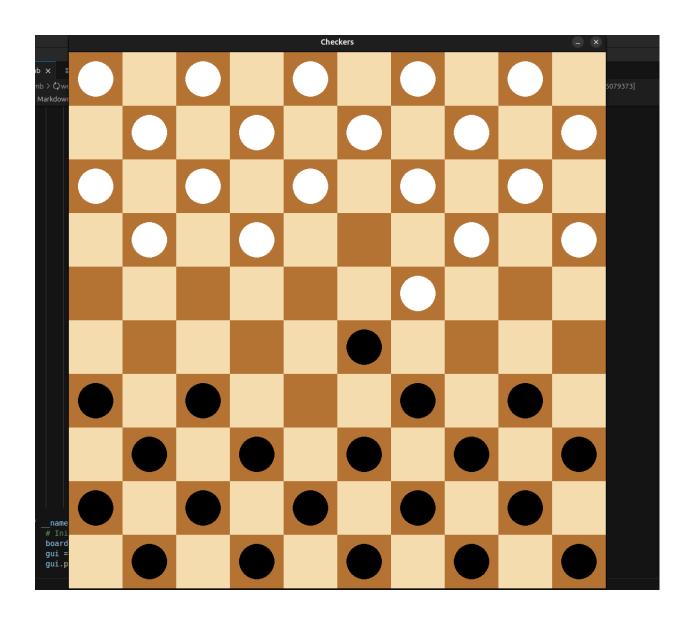
```
self.board.board[move[0], move[1]] =
self.board.board[curr checker[0], curr checker[1]]  # not directly 1,
as it could be a king # was an error here
curr checker[1]] = 0
enemy
self.board.board[(curr checker[0]+move[0])//2,
(curr checker[1]+move[1])//2] = 0
                           self.board.check(1)
                           self.update display()
                           flag = 1
                   if flag == 1:
                       flag = 0
                       time.sleep(1)
                       self.computer move()
```

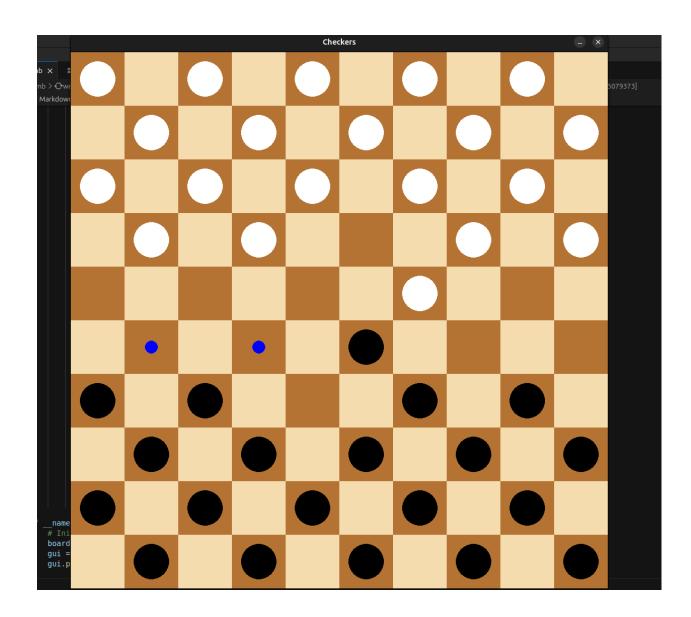
I mean this gui part is totally new for me, so used already available templates , the main thing was the lms part which was fully implemented

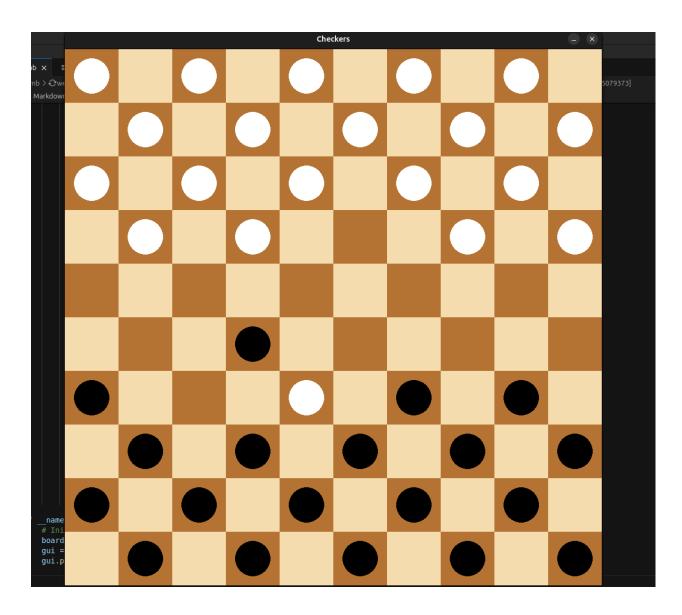
## Now running the gui part:





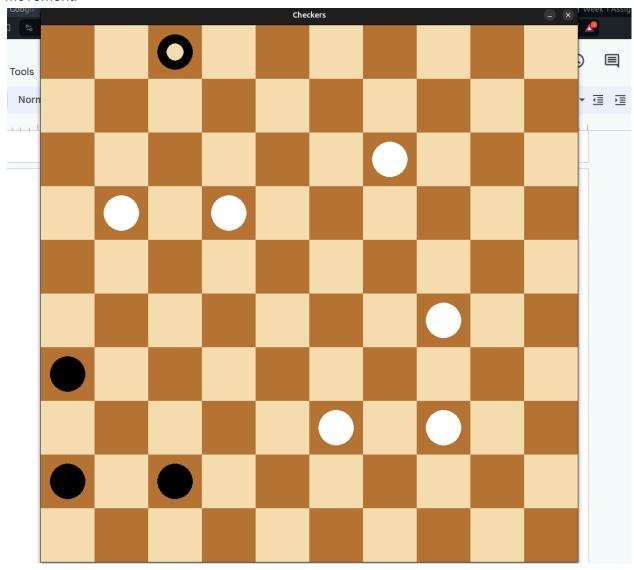






And it goes on, it selects the best moves based on the V(b) value calculated using the stats ie the xi's and the weights and takes the moves.

THE king has also been implemented: le when any piece reaches the other end it gets promoted to a king, so it shows all 4 sides of movement:



After the black piece reached the other end its shape changed, and also it can now move in all 4 direction :

