

1. Minimax algorithm

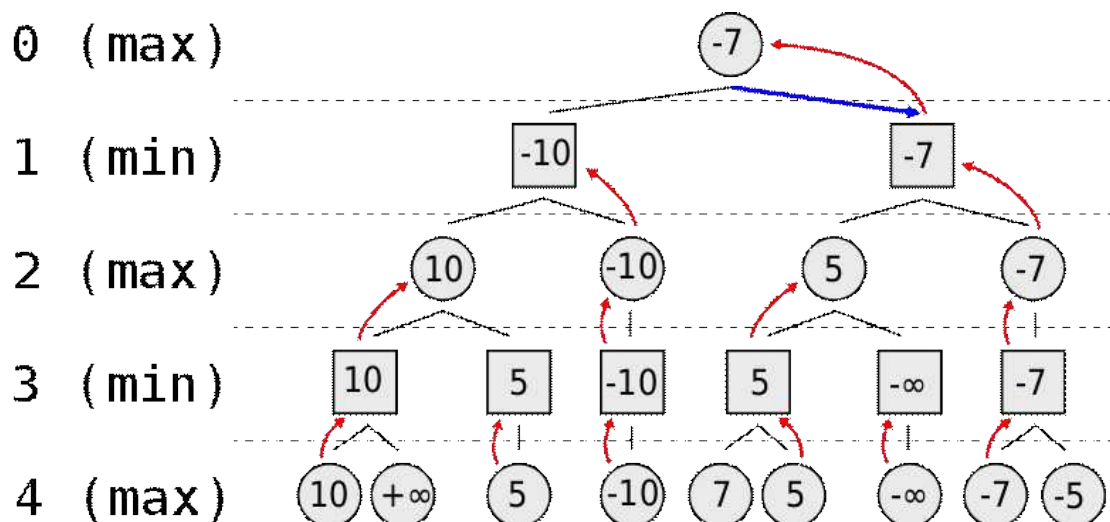
Search most advantageous choice when the other always does disadvantageous behaviors for me.

Supposition of minimax:

- Game of 2 player(named 'max' and 'min') taking turns in order.
- Max is computer, min is human
- Each player does best choice.
- One's win means the other one's lose(zero sum game).
- Max's turn is first.

Process

- Make game trees from current status.
- Calculate heuristic of terminal node. Terminal nodes are the ends of the game tree. Value of heuristic means 'how much it's good for computer'. High value is better for computer.
- Starting from terminal, do decision making.
- Because each player does best choice, computer will choose node with max value among possible things. And human will choose min value(=bad for com = good for human).
- By repeating this choice in each depths, find the choice that have max heuristic value.

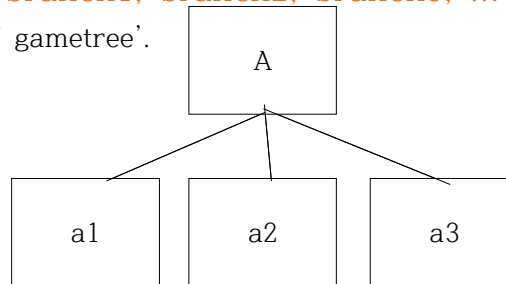


2.Developing minimax for TTT

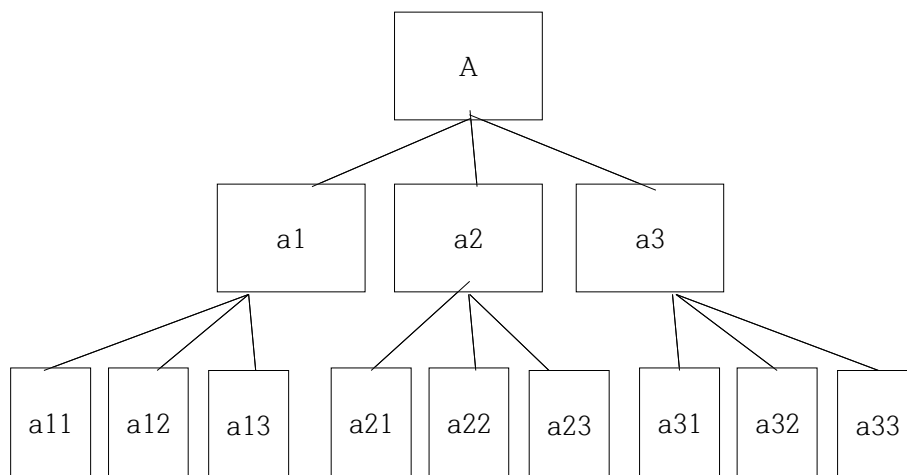
First step is to determine how to define gametree. I'm gonna save it by list.

Format is [original, [branch1, branch2, branch3, ...]]

I'll call it as 'one unit of gametree'.



In this case, gametree is [A, [a1, a2, a3]]. And this continues inside the list.



In this case, game tree is

[A, [[a1, [a11, a12, a13]], [a2, [a21, a22, a23]], [a3, [a31, a32, a33]]]]

In short, there's some gametrees inside the gametree. By doing so, I can store branches and their stem.

```

135 ✓ def getgametree(currentboard, letter):
136 ✓     if letter == 'O':
137         counterletter = 'X'
138 ✓     else:
139         counterletter = 'O'
140     trees = [currentboard,[]]
141 ✓     for i in range(1,10):
142         branch = currentboard.copy()
143 ✓         if not (isWinner(branch, letter) or isWinner(branch, counterletter)):
144 ✓             if branch[i] == ' ': #make move in only empty spaces
145                 makeMove(branch, letter,i)
146                 trees[1].append(branch)
147 ✓         for b in range(len(trees[1])):
148             b_branch=trees[1][b]
149             trees[1][b]=getgametree(b_branch, counterletter)
150     return trees

```

This is code of making gametree. Defined as function named 'getgametree'. Parameter is currentboard and computer's letter. Since this program is based on Homework3(Graphical TTT), board is defined as list form such as [' ', 'O', ' ', ' ', 'X', ' ', ' ', ' ', 'O', ' ']. This function returns one unit of gametree.

*136 ~ 139 : Get counterpart's letter.

*140 : Basic form of game tree. Stem is current board and branches will be added soon.

*141 ~ 146 : Making one unit of gametree. Only one stem and its branches(without no more branches).

*142 : Get copy of current board. Because game tree is imaginary process, real board must not be changed. makeMove function(145) really changes the board so copying is needed.

*143 : Check if the game is already over. If it's over, don't make branches. This will reduce processing time.

*144 ~ 146 : makeMove if that space is empty. And after each moves, store the result at trees.

*147 ~ 149 : Making branches' branches over and over.

*147 ~ 148 : Repeat for each branches.

*149 : Change the branch into that branches one unit of game tree. By calling gametree function recursively, making the whole gametree is possible. By giving parameter 'counterletter', OX is added on the imaginary board by turns.

Next step is approaching terminal nodes and calculate heuristic values. At first, I tried to find all terminal nodes in the generated gametree. But this could be quite inefficient. So, I determined to evaluate terminal nodes when making game tree. So, I modified gametree function.

```

154     def evaluate(currentboard):
155         if isWinner(currentboard, computerLetter):
156             heuristic = 5
157         elif isWinner(currentboard, playerLetter):
158             heuristic = 0
159         elif isBoardFull(currentboard):
160             heuristic = 2
161         else:
162             heuristic = ' '
163         return heuristic

```

I defined function that calculate heuristic named 'evaluate'. Parameter is current board and check wins. If computer won, value is 5 and if lose, 0. Draw is 2. And if the game is not ended, value is ' '. This value will be stored in each branches. Board's data type was a List of 10 strings. That's because original developer wanted to define functions with no confuse. But TTT has only 9 spaces. So, one space of list is always empty (index 0). So I'll store heuristic there.

```

143         if not (isWinner(branch, letter) or isWinner(branch, counterletter)):
144             if branch[i] == ' ': #make move in only empty spaces
145                 makeMove(branch, letter,i)
146                 branch[0]=str(evaluate(branch)) + letter
147                 trees[1].append(branch)
148

```

And I added code in the line 146. Branches now have their heuristic and what shape was moved. For example, ['2X', 'X', 'X', 'X', 'O', 'O', ' ', 'O', 'X', 'O']. And branch that have number in first index means it is terminal node that doesn't have their branches.

In sun, gametree carries datas like below.

↓ Last moved shape
 ↓ So, Board now ↓ ← Same rule ↓

[['5O', ' ', 'O', 'X', 'O', ...], [['2X', 'X', 'O', 'X', ...], ['5X', ' ', 'O', ...]]]

↑
 heuristic
 5=win
 2=draw
 0=lose
 ' '=not yet selected

possible next boards

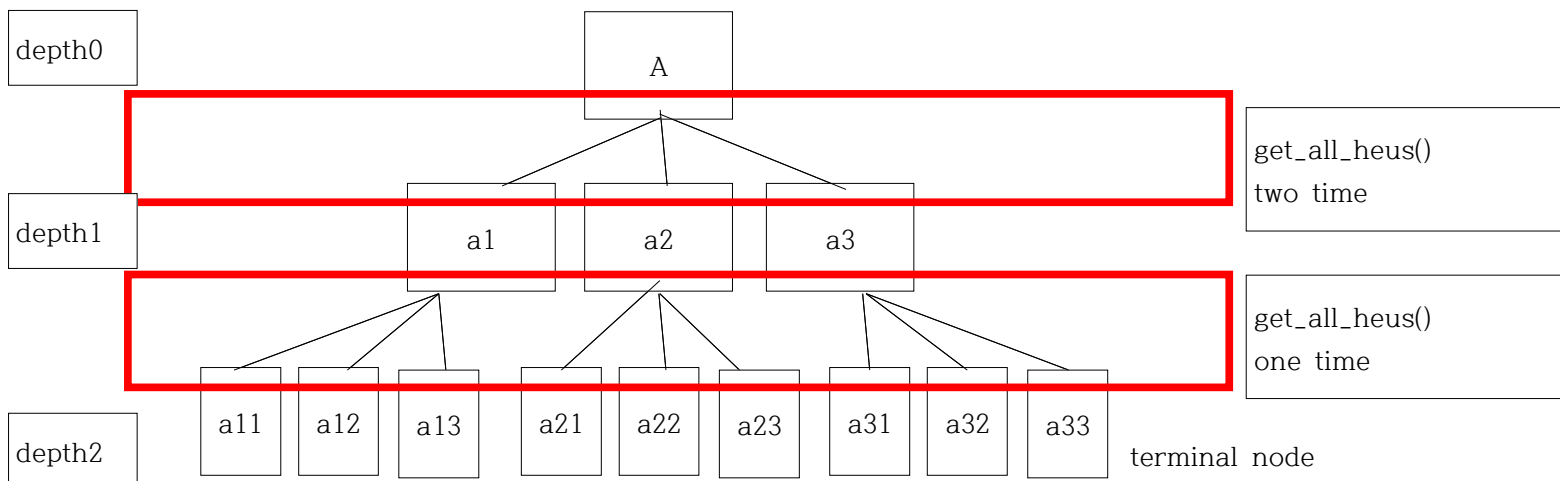
```

165 def choose(tree):
166     heus=[]
167     for branches in tree[1]:
168         heus.append(branches[0][0][0])
169     if heus != [] and ' ' not in heus:
170         if tree[0][0][1]==computerLetter:#previous turn was player
171             tree[0][0]=str(min(heus)) + computerLetter
172         elif tree[0][0][1]==playerLetter:#previous turn was com
173             tree[0][0]=str(max(heus)) + playerLetter
174     return heus
175
176 def get_all_heus(tree):|
177     tree2=tree.copy()
178     if ' ' not in choose(tree2) and len(choose(tree2))>0:
179         choose(tree)
180     else:
181         for subtree in tree[1]:
182             get_all_heus(subtree)
183
184

```

'choose' function does min max decision. Collect hues from each branches and determine max or min value. And don't choose one if there's any branche that has ' ' heu value. Chosen value will be stored in stem. This function directly changes the gametree and returns heus list.

'get_all_heus' repeats 'choose' over and over inside the gametree. If stem's all branches have heu, stem gets min/max value of heu. If not, approach to its branches and repeat get_all_heus recursively. Somewhen can reach a stem that has terminal nodes only. Because all terminal nodes have heu, that stem can choose heu. One use of this function means getting min / max value from the bottom and store it to upper nodes. By using this function several times, can get value for depth 0. That time equals number of depths and it is same as number of ' 's of current board.



```

184  def get_com_move(gametree):
185      possibles=[]
186      for i in range(len(gametree[1])):#tree(branch[])
187          if gametree[0][0][0] == gametree[1][i][0][0][0]:
188              possibles.append(gametree[1][i][0])#branches
189      print(possibles)
190      commove=possibles[np.random.randint(0,len(possibles))]
191      return commove
192

```

And if computer got heu for depth 0, it's time to select what to do in computer's turn. Several branches have same max heu values. It means whatever computer selects, it doesn't change game result. So computer will collect branches that have max heu and select one of them randomly. And this returned thing will be assigned as current board.

I added line 189 to figure out what's computer's possible moves and if computer can win.

```

395  else:
396      if lastclick + 800 < pygame.time.get_ticks():
397          # Computer's turn.
398          theBoard[0]=' '+playerLetter
399          treeofgame=getgametree(theBoard,computerLetter)
400          for i in range(len(treeofgame[1])):
401              get_all_heus(treeofgame)
402          move = get_com_move(treeofgame)
403          theBoard=move
404          if computerLetter=='O':
405              o_sound.play()
406          else:
407              x_sound.play()
408          if isWinner(theBoard, computerLetter):
409              winner=turn
410              one_game_end = True
411          else:
412              if isBoardFull(theBoard):
413                  winner='draw'
414                  one_game_end = True
415              else:
416                  turn = 'player'

```

In the actual game running code, I only changed line 398 ~ 403.

*398 : Mark the last moved shape in theBoard. That's because min/max is selected by last moved shape.

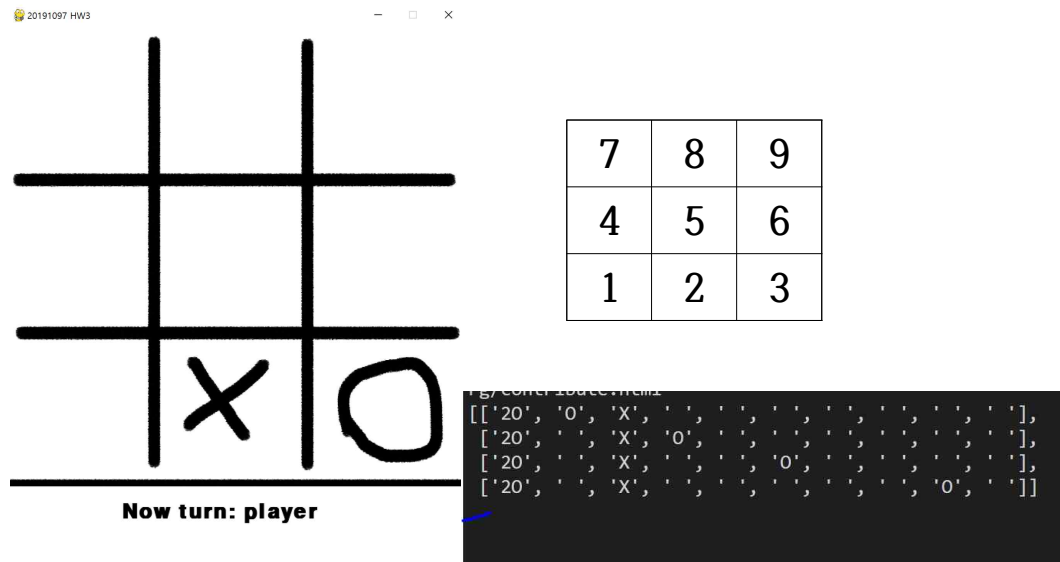
*399 : Generate gametree.

*400 ~ 401 : derive heu from terminal to depth 0.

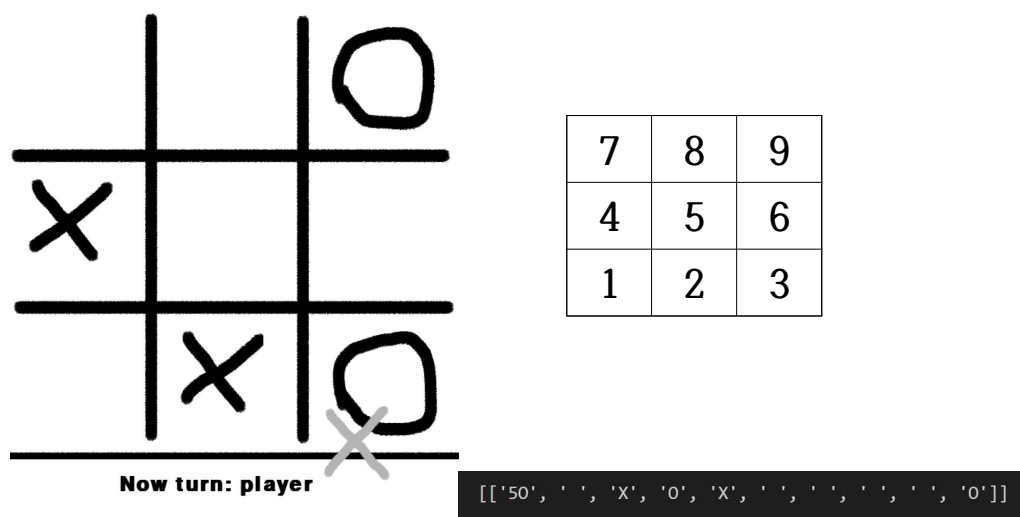
```
*402 : Select random move and update theBoard.
```

3.Run TTT and check it works well.

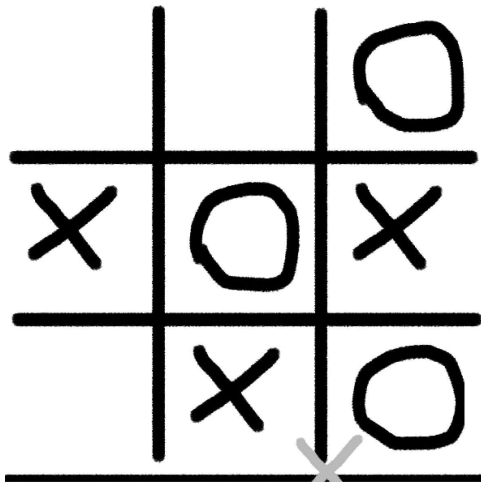
Now let's run and check if it works.



The first turn was me and I'm X. I moved to 2. Then, computer get 4 possible roots of draw (heu value 2), and selected 3. That means my best result is draw. I cannot win computer forever.



Next, I moved to 4, and computer found only one way to win(heu 5).

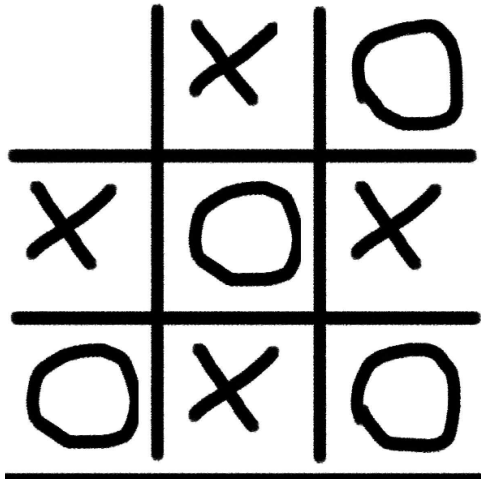


Now turn: player

7	8	9
4	5	6
1	2	3

```
[[ '50', ' ', 'X', 'O', 'X', 'O', 'X', ' ', ' ', 'O' ]]
```

I defended by move to 6. Computer found 1 way to win, and selected to move to 5. If computer didn't move to 5, then I'll move to 5 and computer cannot win.



You Lose...

Replay Back to menu

7	8	9
4	5	6
1	2	3

```
[[ '50', 'O', 'X', 'O', 'X', 'O', 'X', ' ', 'X', 'O' ],
 [ '50', ' ', 'X', 'O', 'X', 'O', 'X', 'O', 'X', 'O' ]]
```

I moved to 8, and computer found 2 ways to win. Computer selected to move to 1 and computer won.