

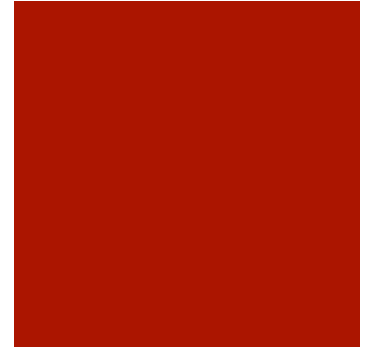


Game Trees

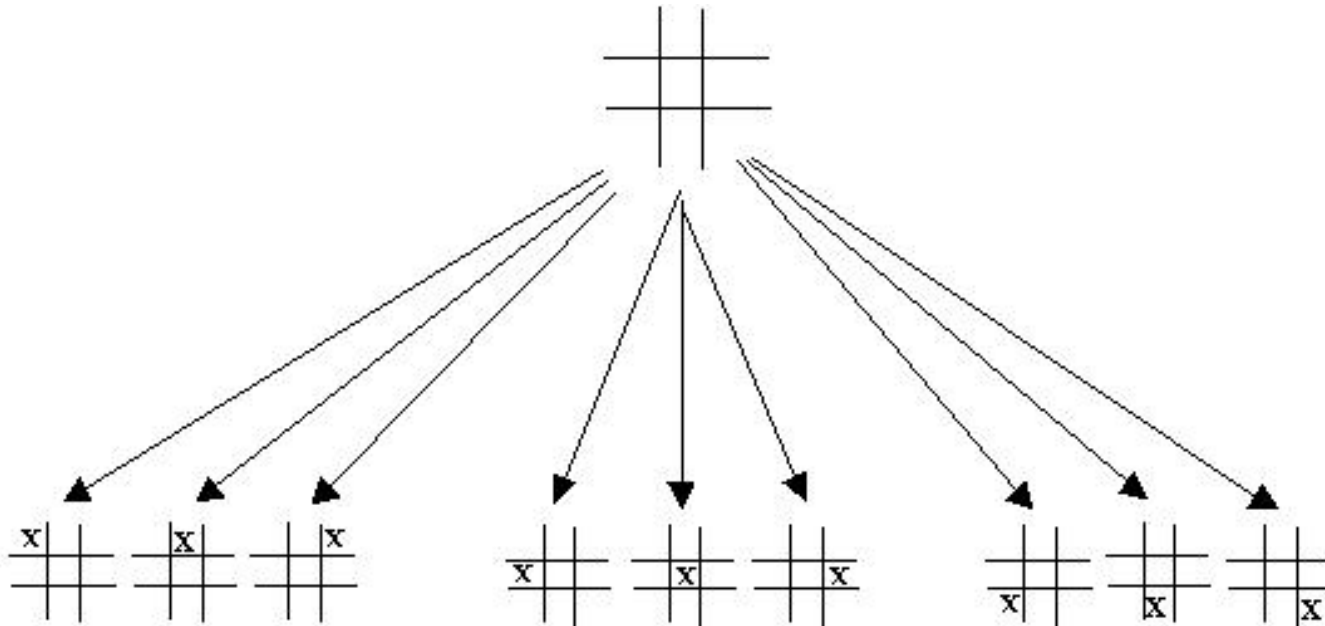
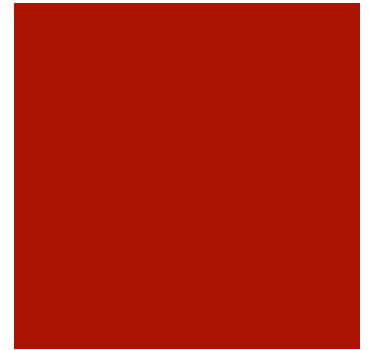
COP4530 – Week 5 Recitation

Game Tree

- A directed graph
 - Nodes are board-states
 - Edges are moves

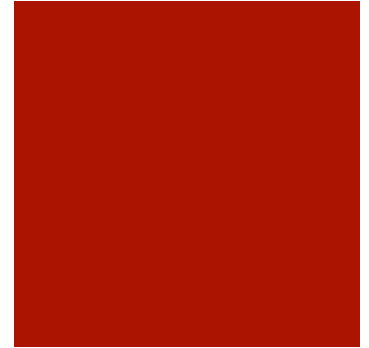


Tic-tac-toe (3x3)

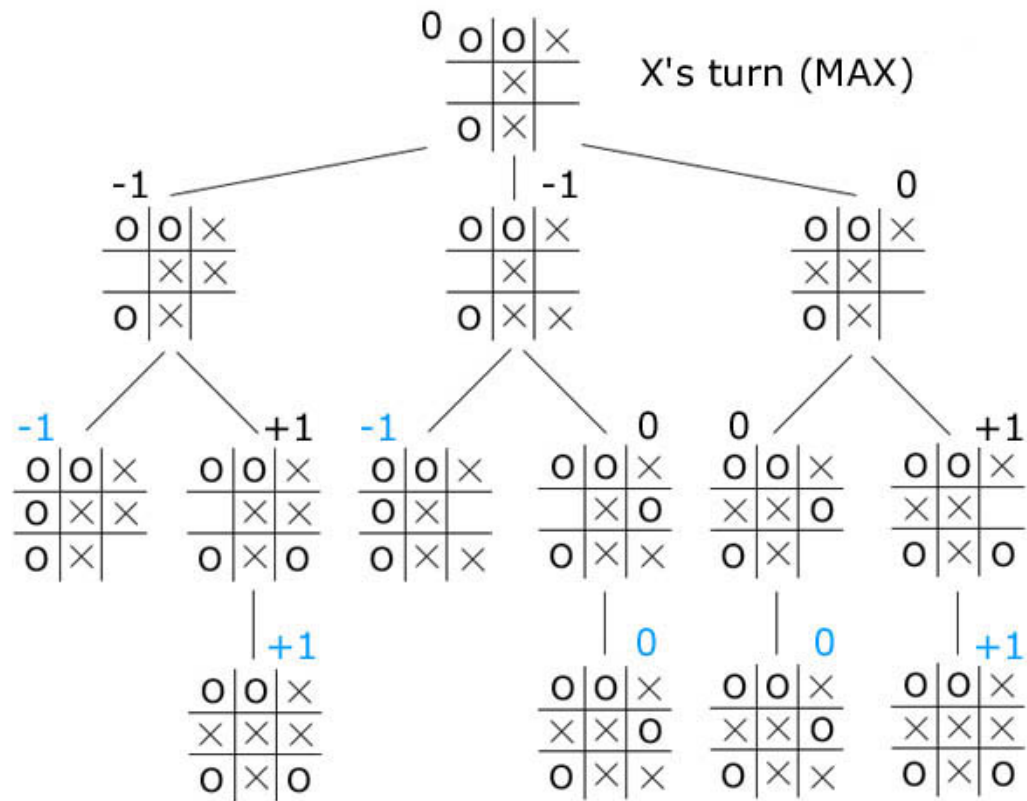
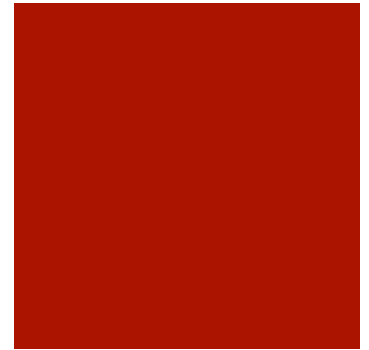


Minimax

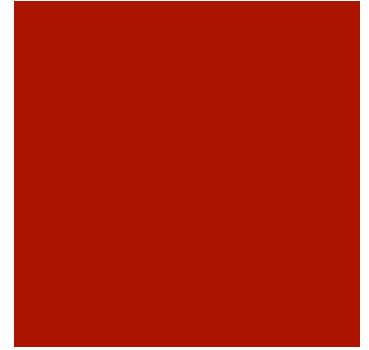
- Assumptions
 - The opponent and our program will always make rational moves
 - Zero-sum game, without cooperation
- Assign weighted values to board positions
 - Positive, favorable to the program
 - Negative, favorable to the adversary



Minimax - traversal



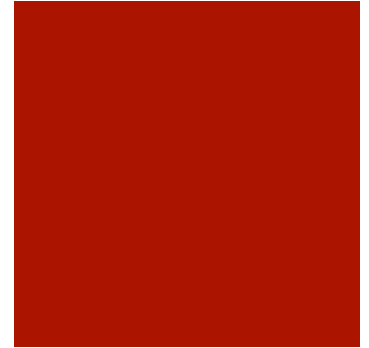
Minimax - pseudocode



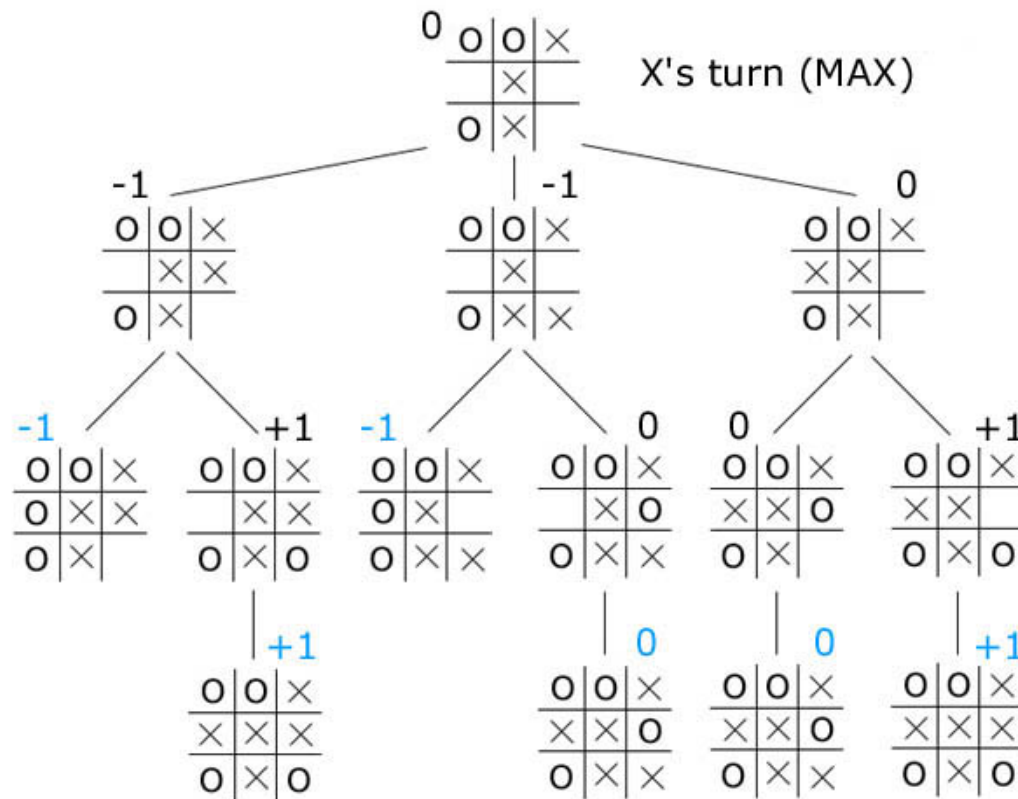
```
minimax(player, board)
  if(game over in current board position)
    return winner
  children = all legal moves for player from this board
  if(max's turn)
    return maximal score of calling minimax on all the children
  else (min's turn)
    return minimal score of calling minimax on all the children
```

Negamax

- Variation on Minimax
- $\text{Max}(a,b) = -\text{Min}(-a, -b)$

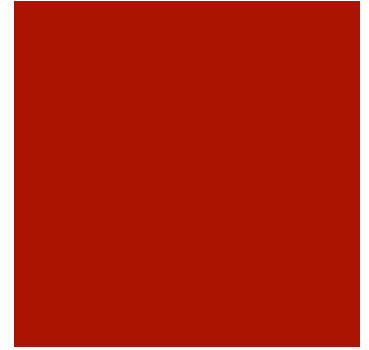


Negamax - traversal



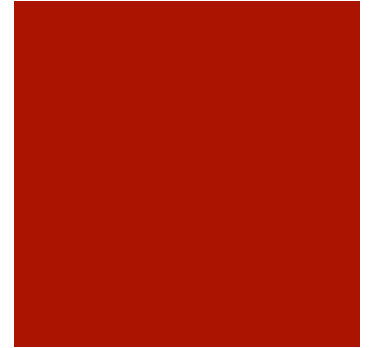
Solution Space

- It can take a long time to evaluate an entire game tree
 - Too difficult for games such as Go or Chess
- The solution space for a 3x3 tic-tac-toe board is 9!
 - Larger for board variations

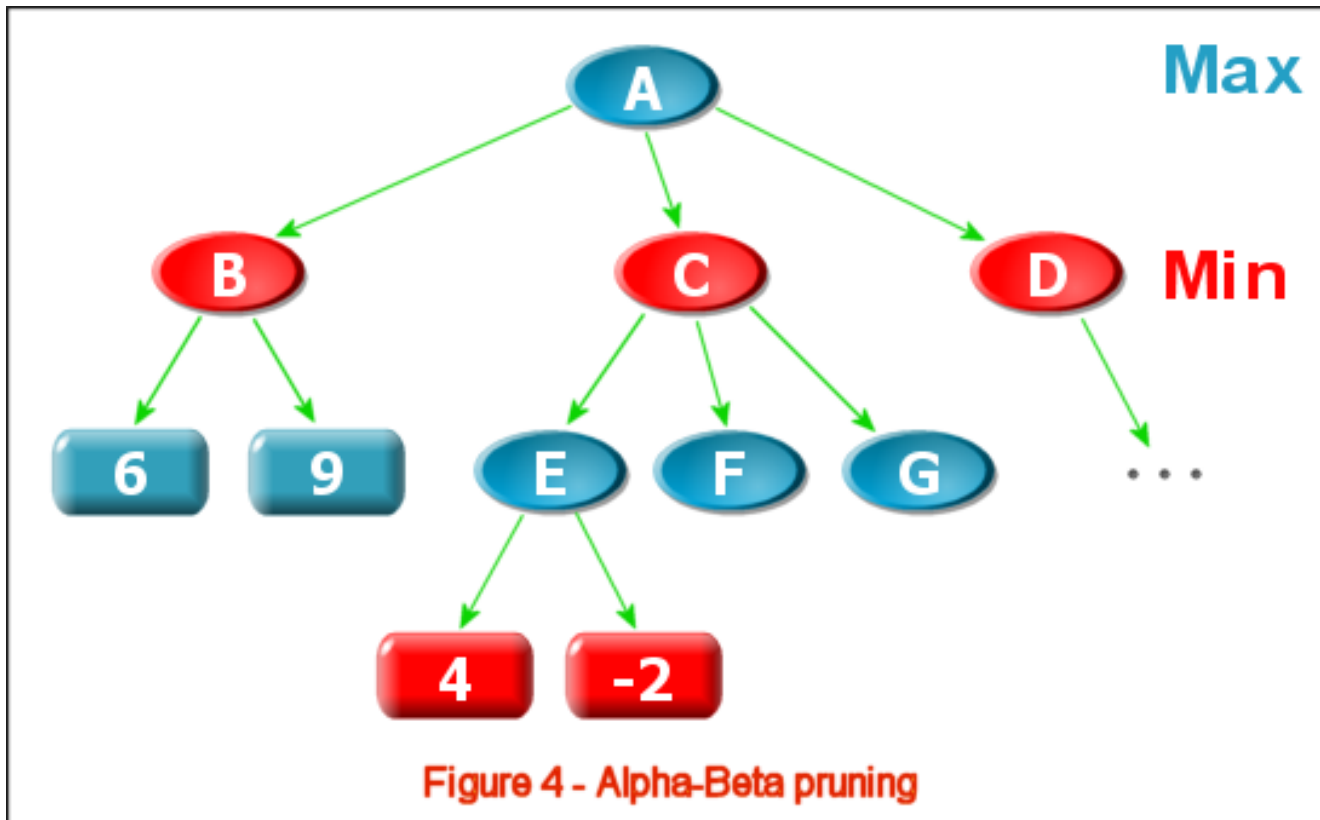
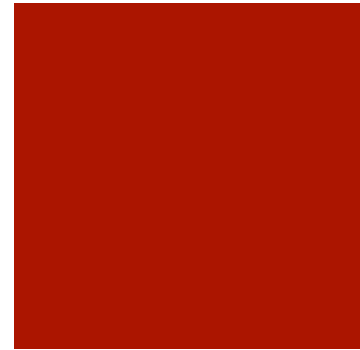


Alpha-Beta Pruning

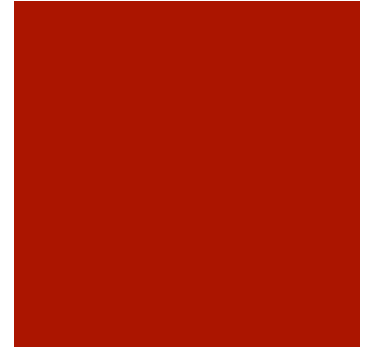
- Alpha, the program's best move
- Beta, the adversary's best move
- If $\text{Alpha} \geq \text{Beta}$, stop evaluation of current branch and move on
- $\text{Alpha} = -\infty$, $\text{Beta} = \infty$



Alpha-Beta Pruning - example



Alpha-Beta Pruning - pseudocode

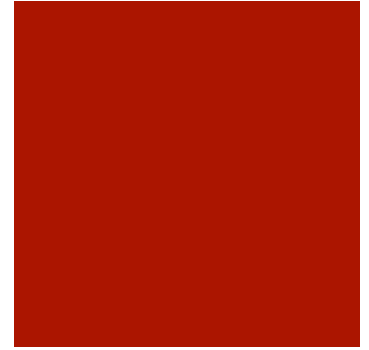


```
alpha-beta(player,board,alpha,beta)
  if(game over in current board position)
    return winner

  children = all legal moves for player from this board
  if(max's turn)
    for each child
      score = alpha-beta(other player,child,alpha,beta)
      if score > alpha then alpha = score (we have found a better best move)
      if alpha >= beta then return alpha (cut off)
    return alpha (this is our best move)
  else (min's turn)
    for each child
      score = alpha-beta(other player,child,alpha,beta)
      if score < beta then beta = score (opponent has found a better worse move)
      if alpha >= beta then return beta (cut off)
    return beta (this is the opponent's best move)
```

More optimizations

- Look at only a few levels of depth
- Eliminate symmetric game boards
- Heuristic search



References

- <http://www.cs.nott.ac.uk/~ajp/courses/g51iai/003blindsearches/implement.htm>
- <http://www.hamedahmadi.com/gametree/>
- <http://www.cs.cmu.edu/~adamchik/15-121/lectures/Game%20Trees/Game%20Trees.html>
- <http://www.ocf.berkeley.edu/~yosenl/extras/alphabeta/alphabeta.html>
- <http://web.mit.edu/sp.268/www/gamesearch.pdf>

