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# Games and strategies

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# What kind of games we are dealing with?

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- Two players ( $A$  and  $B$ )
  - Players are moving alternately
  - Free Moves
  - Full information
  - Result: Win or Loose.
  - Strategy = set of rules defining moves.
  - We are searching for a *Perfect Winning Strategy* for  $A$ ! ( $A$  wins no matter  $B$ .)
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# What kind of strategies we use?

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- Symmetry
  - Pairs
  - Parity
  - Dynamic Programming
  - And/Or Trees
  - MiniMax (with Alpha-Beta cutoffs)
  - Others...
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# Symmetry

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- Array of  $n$  cells ( $n$  odd)
  - Each player fills 1 cell at a move
  - Wins the player which makes to appear at least 3 consecutive filled cells.
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# Dynamic Programming (DP)

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- ❑ Decompose the problem in subproblems.
  - ❑ Solve the small subproblems.
  - ❑ Combine the subproblems in order to obtain the solution for bigger and bigger subproblems.
  - ❑ Ex: subset sum.
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# Dynamic Programming for game strategies

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- Decompose the game in smaller subgames.
  - Find a perfect winning strategy for the smallest games.
  - Combine the strategies of the smaller subgames in order to obtain a strategy for larger subgames.
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# Practical implementation of DP

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- Label each subgame with either **T** (true) or **F** (false) depending on whether the player to move has a perfect winning strategy from that position.
  - A bigger subgame is labeled with:
    - **T** if  $\exists$  at least 1 subgame labeled with **F** to move into.
    - **F** if all subgame which can be reach with 1 move are labeled with **T**.
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# Example 1 – Extract coins

## 1 dimensional DP

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- A stack with  $N$  coins. Each coin has 1\$ or 2\$ value.
  - Two players A and B.
  - A move - extract any number of consecutive coins having the same value.
  - The player performing the last move is the winner of the game.
  - A moves first.
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# Practical example

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1
1
2
1
1
2
2

T
T
F
T
F
T
T
F

---

**The player A has a perfect winning strategy.**

# Example 2 - Tzeanşîdzî game

## 2 dimensional DP

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- 2 stacks of objects
  - 2 players A and B
  - A move consists of extracting:
    - either any number of objects from a single stack
    - or the same number of objects from both stacks.
  - A moves first
  - The player performing the last move is the winner
-

# Practical example

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	0	1	2	3	4	5
0	F	T	T	T	T	T
1	T	T	F	T	T	T
2	T	F	T	T	T	T
3	T	T	T	T	T	F
4	T	T	T	T	T	T
5	T	T	T	F	T	T

# Difficulties with DP

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- Not enough memory!

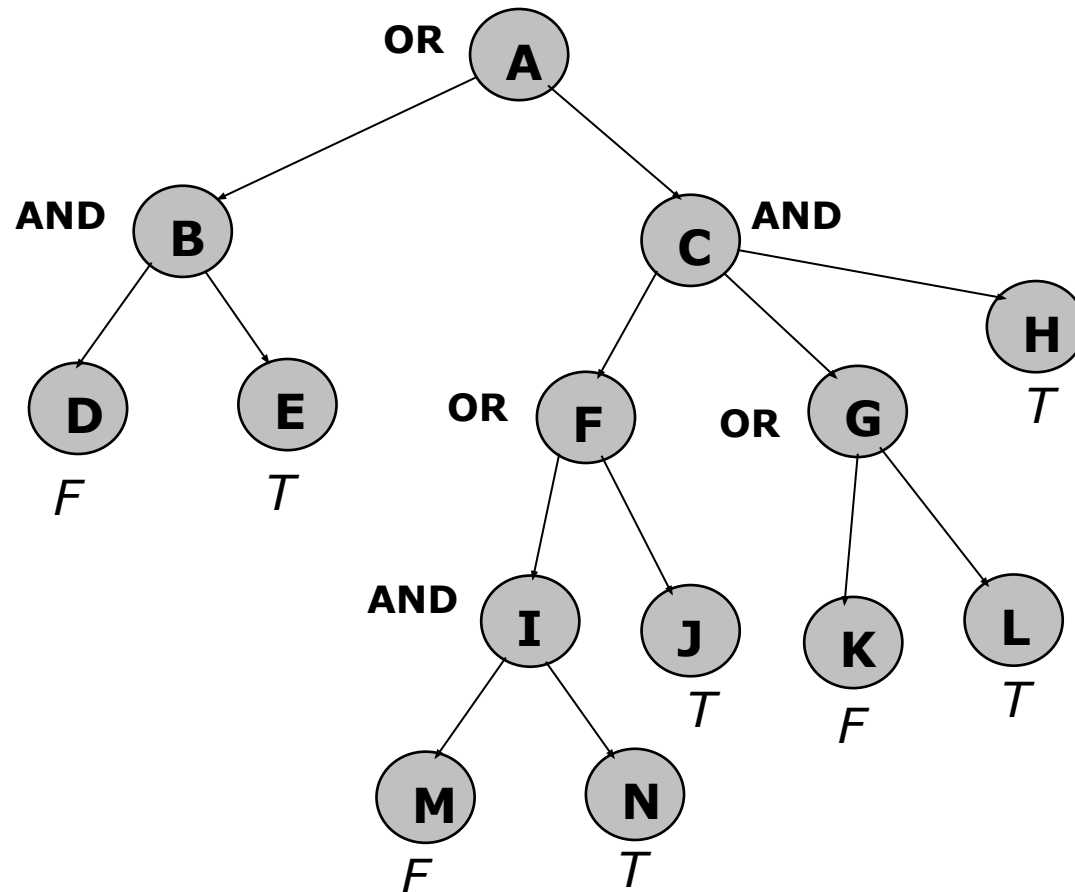
# And/Or trees

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- Label each node of the game tree with either **T** or **F** depending on whether the first player (*A*) has (or not) a perfect winning strategy for that subgame.
  - Leaves of the tree are automatically labeled (with **F** and **T**).
  - Rules for labeling internal nodes:
    - (for *A*) Label with **T** if at least one child is labeled with **T**. – OR rule.
    - (for *B*) Label with **T** if all children are labeled with **T**. – AND rule.
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# Example

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# And/Or Algorithm

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```
bool AndOr(Node N, int level){
    //level = 0 for the node in the top of the tree.
    if N is terminal {
        if the first player won
            return true;
        else return false;}
    else{
        if (level % 2){ //B is about to move; AND
            bool result = true;
            for each child  $N_i$  of N
                result = result && AndOr( $N_i$ , level+1);
        }
        else{ // A is about to move; OR
            bool result = false;
            for each child  $N_i$  of N
                result = result || AndOr( $N_i$ , level+1);
        }
        return result;
    }
}
```

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# Strength of And/Or trees

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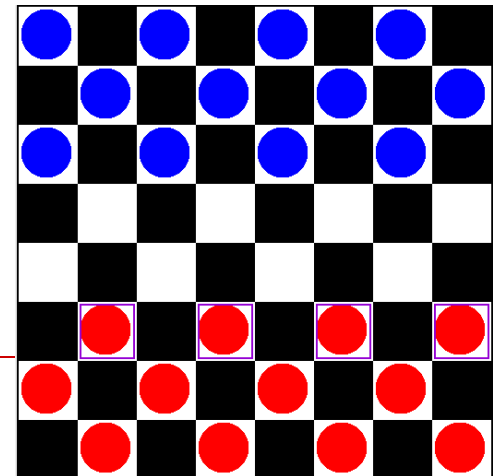
- Can be applied to any kind of game!



# Weaknesses of And/Or Trees

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- Out of memory!
- Out of time!
  - Chess:  $10^{100}$  nodes.
    - Deep Blue can explore  $2 \times 10^8$  positions/second  $\rightarrow 10^{83}$  years!
  - GO:  $10^{320}$  nodes.
  - Checkers:  $5 \times 10^{20}$  nodes



# MiniMax search

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- Not the entire tree is explored.
  - A maximum search depth is fixed at the beginning of the game.
    - How far we go?
      - too deep and the search will take far too long,
      - too shallow and we may miss paths that make early sacrifices for later gain.
  - Depth-first search is employed.
  - We have to establish the quality of each state!
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# How do we assign a quality to each state?

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- Difficult task!!!
  - We use an heuristic which will actually depend on our experience with that game.
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# Example – Chess game

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- Count the number of pieces left on the table. Compute the difference.
  - Count the strength of the pieces that you have.
  - Count the number of pieces that are attacking your pieces.
  - .....
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# Deep Blue's heuristics

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- More than 50 highly-tuned heuristics provided by chess grandmasters.
  - Different heuristics for different stages of the game.
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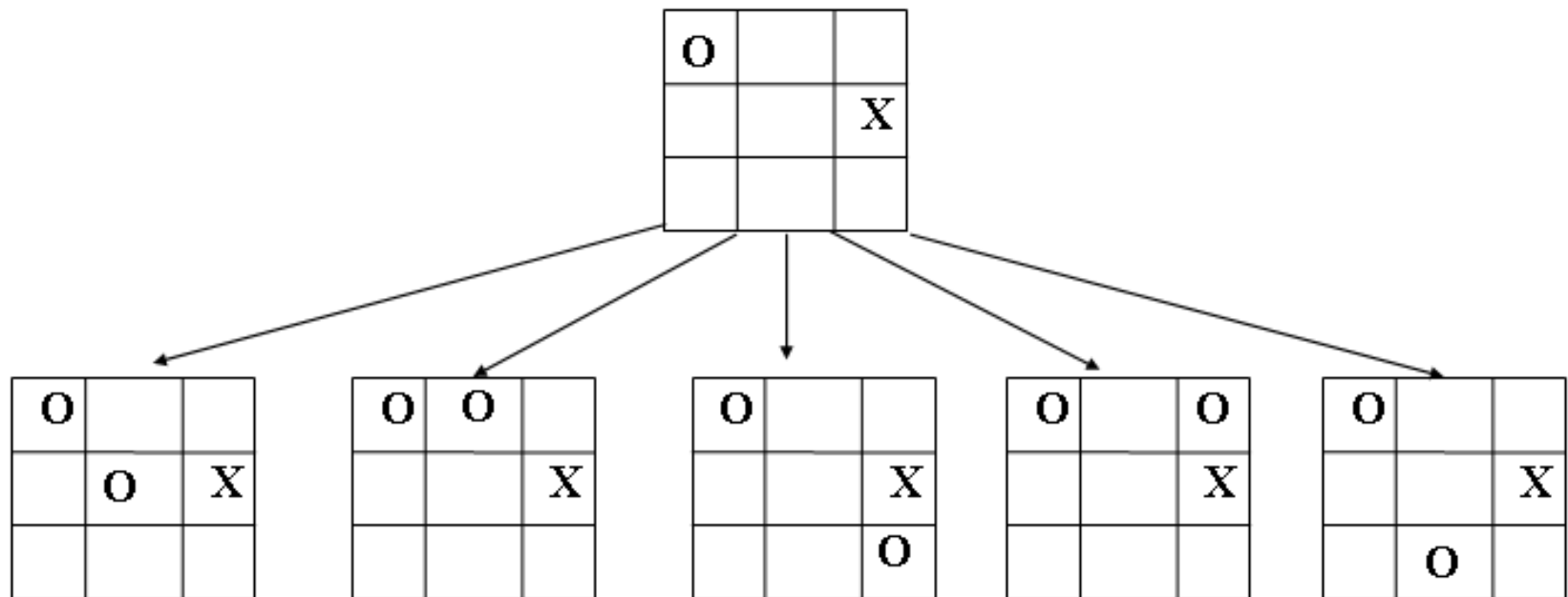
# Example – X and O's quality function

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- If a player has two collinear board places and the 3<sup>rd</sup> space in the line is empty, then award that player 200 points. (In other words, if you almost have one complete line that is not blocked have 200 points).
  - If a player has two nearly complete lines then score 300.
  - If a player has a complete line score 600.
  - Add onto these values:
    - The number of possible lines that can be completed by this player from this state.
-

# Example

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# Values of each new state

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New State	1	2	3	4	5
O Sum	200+5	200+4	200+4	200+4	5
O Total	205	204	204	204	5
X Total	1	2	1	1	2
	-----	-----	-----	-----	-----
Total	204	202	203	203	3



# MiniMax Algorithm – basic ideas

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- First player will try to maximize its gain (also called MAX player).
  - Second player will try to minimize the gain of the first player (called MIN player).
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# MiniMax Algorithm

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```
int MiniMax(Node N, int level){  
    //level = 0 for the node in the top of the tree.  
    if (level == MaxLevel)  
        return the quality of N computed with the heuristic;  
    if (level % 2){ //B is about to move; minimize  
        int result = MaxInt;  
        for each child  $N_i$  of N  
            result = Min(result, MiniMax( $N_i$ , level+1));  
        }  
    else{ // A is about to move; Maximize  
        int result = -MaxInt;  
        for each child  $N_i$  of N  
            result = Max(result, MiniMax( $N_i$ , level+1));  
        }  
    return result;  
}
```

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O		
	O	X
		X

*I am O and it's my turn  
to play!*

Score: 1

*Maximizing Level: The largest of the children's values is propagated upwards*

O	O	
	O	X
		X

Score: -399

O		O
	O	X
		X

Score: 1

O		
O	O	X
		X

Score: -399

O		
	O	X
O		X

Score: -399

O		
	O	X
	O	X

Score: -399

*Minimizing Level: The smallest of the children's values is propagated upwards*

O	O	X
	O	X
		X

Score: -399

O	O	
X	O	X
		X

Score: 101

O	X	O
	O	X
		X

Score: 201

O		O
X	O	X
		X

Score: 302

O	X	
O	O	X
		X

Score: 0

O		X
O	O	X
		X

Score: -399

O	X	
	O	X
O		X

Score: 101

O		X
	O	X
O		X

Score: -399

O	X	
	O	X
	O	X

Score: -199

O		X
	O	X
	O	X

Score: -399

O	O	
	O	X
X		X

Score: 0

O	O	
	O	X
	X	X

Score: -99

O		O
	O	X
X		X

Score: 1

O		O
	O	X
	X	X

Score: 102

O		
O	O	X
X		X

Score: -300

O		
O	O	X
	X	X

Score: -99

O		
X	O	X
O		X

Score: 2

O		
	O	X
O	X	X

Score: 102

O		
X	O	X
	O	X

Score: 2

O		
	O	X
X	O	X

Score: 1

# Alpha-Beta Cutoffs

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- We want to reduce the number of states that should be explored!
  - Some of the branches may be avoided!
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O		
	O	X
		X

I am O and it's my turn to play!

Score: 1

Maximize:

O	O	
	O	X
		X

Score: -399

O		O
	O	X
		X

Score: 1

O		
O	O	X
		X

Score: -399

O		
	O	X
O		X

Score: -399

O		
	O	X
	O	X

Score: -399

Minimize:

O	O	X
	O	X
		X

Score: -399

O	O	
X	O	X
		X

Score: 101

O	X	O
	O	X
		X

Score: 201

O		O
X	O	X
		X

Score: 302

O	X	
O	O	X
		X

Score: 0

O		X
O	O	X
		X

Score: ?

O	X	
	O	X
O		X

Score: 101

O		X
	O	X
O		X

Score: -399

O	X	
	O	X
	O	X

Score: -199

O		X
	O	X
	O	X

Score: ?

O	O	
	O	X
X		X

Score: 0

O	O	
	O	X
	X	X

Score: -99

O		O
	O	X
X		X

Score: 1

O		O
	O	X
	X	X

Score: 102

O		
O	O	X
X		X

Score: ?

O		
O	O	X
	X	X

Score: ?

O		
X	O	X
O		X

Score: 2

O		
	O	X
O	X	X

Score: ?

O		
X	O	X
	O	X

Score: ?

O		
	O	X
X	O	X

Score: ?

# Alpha-Beta Cutoffs

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- ALPHA

The best score that player MAX is guaranteed to obtain.

- BETA

The minimal score that player MIN is guaranteed to obtain.

- We start with  $\text{ALPHA} = -\infty$   
and  $\text{BETA} = \infty$ .
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# More on AB with cutoffs

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- ALPHA value of a node
    - Initially it is the score of that node, if the node is a leaf, otherwise it is  $-\infty$ . Then at a MAX node it is set to the largest of the scores of its successors explored up to now, and at a MIN node to the alpha value of its predecessor.
  - BETA value of a node
    - Initially it is the score of that node, if the node is a leaf, otherwise it is  $+\infty$ . Then at a MIN node it is set to the smallest of the scores of its successors explored up to now, and at a MAX node to the beta value of its predecessor.
  - Score of a node: At MAX node, it is final ALPHA, at MIN is final BETA
-

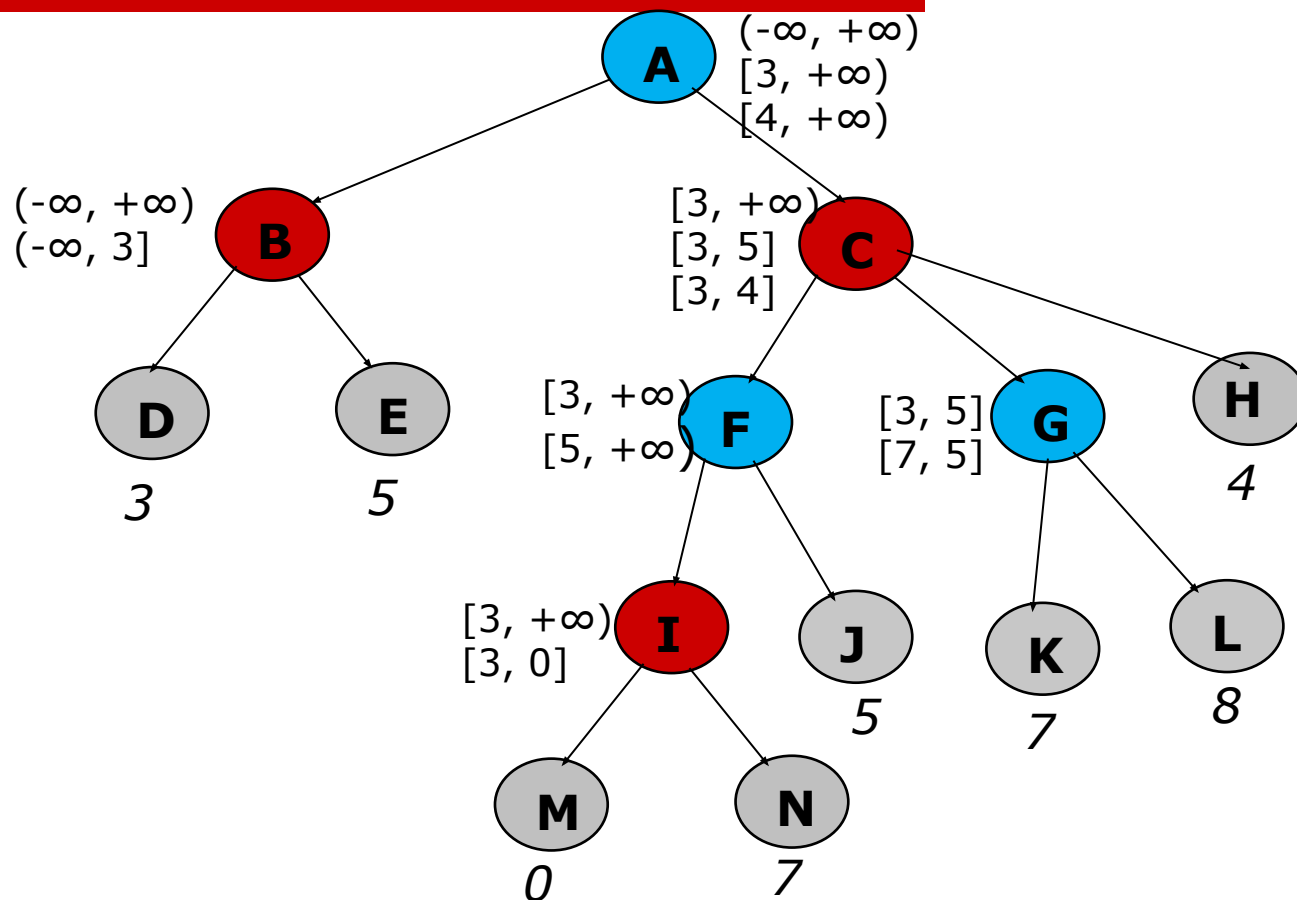
# MiniMax with Alpha-Beta

```
01 function alphabeta(node, depth,  $\alpha$ ,  $\beta$ , maximizingPlayer)
02   if depth = 0 or node is a terminal node
03     return the heuristic value of node
04   if maximizingPlayer
05      $v := -\infty$ 
06     for each child of node
07        $v := \max(v, \text{alphabeta}(\text{child}, \text{depth} - 1, \alpha, \beta, \text{FALSE}))$ 
08        $\alpha := \max(\alpha, v)$ 
09       if  $\beta \leq \alpha$ 
10         break (*  $\beta$  cut-off *)
11     return  $v$ 
12   else
13      $v := \infty$ 
14     for each child of node
15        $v := \min(v, \text{alphabeta}(\text{child}, \text{depth} - 1, \alpha, \beta, \text{TRUE}))$ 
16        $\beta := \min(\beta, v)$ 
17       if  $\beta \leq \alpha$ 
18         break (*  $\alpha$  cut-off *)
19   return  $v$ 
```

$\text{alphabeta}(\text{origin}, \text{depth}, -\infty, +\infty, \text{TRUE})$  (\* **Initial call** \*)



# Labeled tree



Unvisited nodes: N, L

# Strength of MiniMax with AlphaBeta cutoffs

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- Can explore larger trees than MiniMax only.
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