

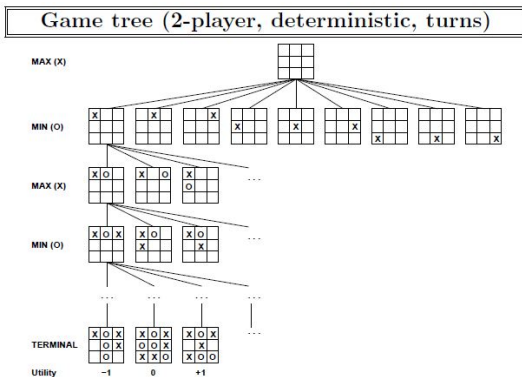
# Introduction to Artificial Intelligence and Problem Formulations

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# Game Tree - Tic-Tac-Toe



- From the initial state, MAX has **nine** possible moves.
- $9! = 362880$  terminal nodes
- Play alternates between MAX'S placing an X and MIN'S placing an O until we reach leaf nodes corresponding to terminal states such that one player has **three in a row** or all the **squares are filled**.



## Different functions

- $S_0$ : The **initial state**, which specifies how the game is set up at the start.
- $\text{PLAYER}(s)$ : Defines which player has the move in a state.
- $\text{ACTIONS}(s)$ : Returns the set of legal moves in a state.
- $\text{RESULT}(s, a)$ : The **transition model**, which defines the result of a move.
- $\text{TERMINAL-TEST}(s)$ : A **terminal test**, which is true when the game is over and false otherwise. States where the game has ended are called **terminal states**.
- $\text{UTILITY}(s, p)$ : A **utility function** (also called an objective function or payoff function), defines the final numeric value for a game that ends in terminal state  $s$  for a player  $p$ . In chess, the outcome is a win, loss, or draw, with values  $+1$ ,  $0$ , or  $\frac{1}{2}$ . Some games have a wider variety of possible outcomes; the payoffs in backgammon range from  $0$  to  $+192$ . A **zero-sum game** is (confusingly) defined as one where the total payoff to all players is the same for every instance of the game. Chess is zero-sum because every game has payoff of either  $0 + 1$ ,  $1 + 0$  or  $\frac{1}{2} + \frac{1}{2}$ . “Constant-sum” would have been a better term, but zero-sum is traditional and makes sense if you imagine each player is charged an entry fee of  $\frac{1}{2}$ .



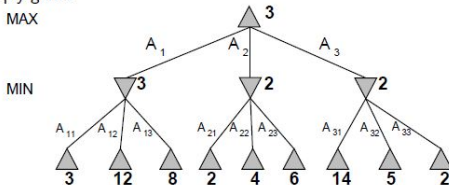
# Optimal Decisions in Games - The minimax Algorithm

## Minimax

Perfect play for deterministic, perfect-information games

Idea: choose move to position with highest **minimax value**  
= best achievable payoff against best play

E.g., 2-ply game:



- MAX: Upper triangle and MIN: Lower triangle
- MAX'S best move at the root is  $A_1$ , it leads to the highest minimax value and MIN'S best reply is  $A_{11}$ , because it leads to the successor with the lowest minimax value.



# Optimal Decisions in Games - The minimax Algorithm

- Given a game tree, the optimal strategy can be determined by examining the **minimax value** of each node, which we write as  $\text{MINIMAX}(n)$ .

$$\text{MINIMAX-VALUE}(n) = \begin{cases} \text{UTILITY}(n) & \text{if } n \text{ is a terminal state} \\ \max_{s \in \text{Successors}(n)} \text{MINIMAX-VALUE}(s) & \text{if } n \text{ is a MAX node} \\ \min_{s \in \text{Successors}(n)} \text{MINIMAX-VALUE}(s) & \text{if } n \text{ is a MIN node.} \end{cases}$$

## Properties of minimax

Complete?? Yes, if tree is finite (chess has specific rules for this)

Optimal?? Yes, against an optimal opponent. Otherwise??

Time complexity??  $O(b^m)$

Space complexity??  $O(bm)$  (depth-first exploration)

For chess,  $b \approx 35$ ,  $m \approx 100$  for “reasonable” games  
 $\Rightarrow$  exact solution completely infeasible

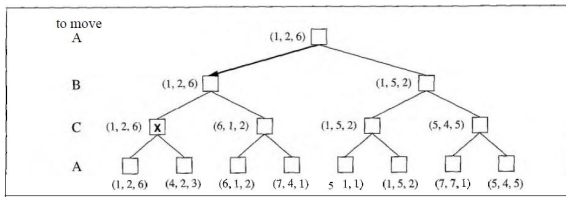
But do we need to explore every path?

- The first MIN node, has three successors with values 3, 12, and 8, so its minimax value is 3.
- The root node is a MAX node; its successors have minimax values 3, 2, and 2; so it has a minimax value of 3.



# Optimal Decisions in Multiplayer Games

- Three Players:  $A, B, C$ , Vector:  $\langle v_A, v_B, v_C \rangle$
- $(1, 2, 6)$  and  $(4, 2, 3) = (1, 2, 6)$  (Player C)



# Optimal Decisions in Multiplayer Games

- Suppose  $A$  and  $B$  are in **weak positions** and  $C$  is in a **stronger position**.
- Then it is often **optimal** for **both A and B** to **attack C** rather than each other.
- Let  $C$  destroy each of them **individually**.
- In this way, collaboration emerges from purely **selfish behavior**. Of course, as soon as  $C$  **weakens** under the **joint onslaught**, the **alliance loses** its value, and **either A or B** could **violate the agreement**.



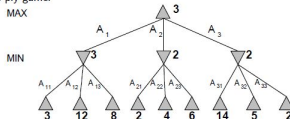
# Alpha-Beta Pruning

## Minimax

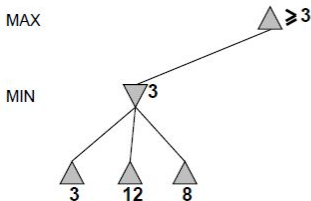
Perfect play for deterministic, perfect-information games

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E.g., 2-ply game:



## $\alpha$ - $\beta$ pruning example





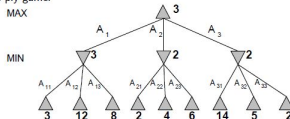
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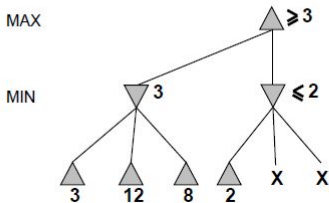
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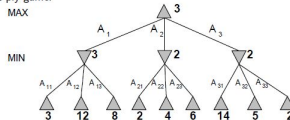
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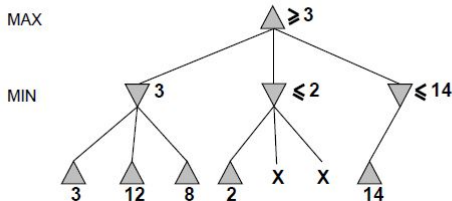
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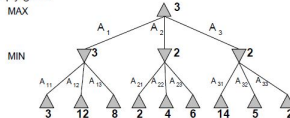
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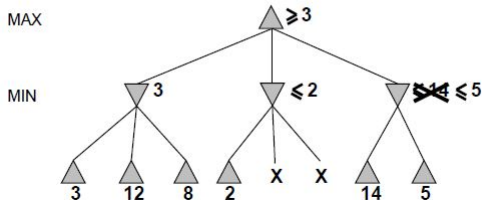
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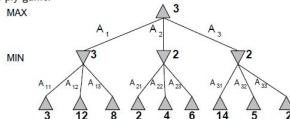
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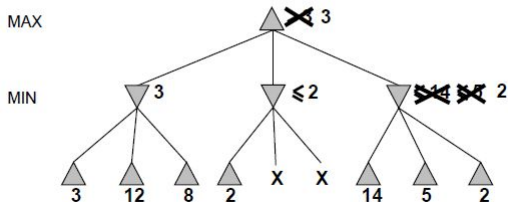
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## $\alpha$ - $\beta$ pruning example



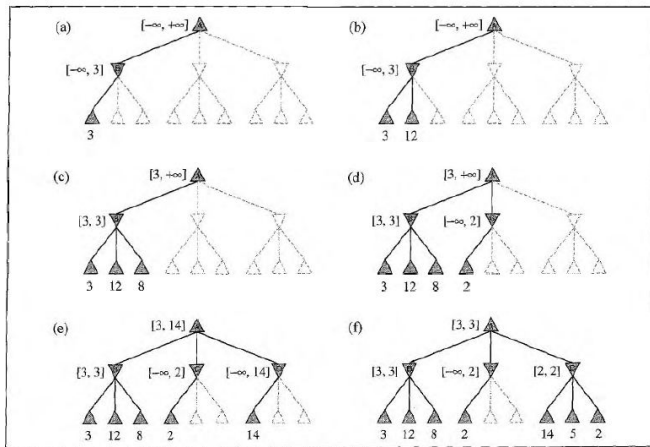
- When we apply **alpha-beta pruning** to a **standard minimax tree**, it returns the **same move** as **minimax** would, but **prunes away branches** that **cannot** possibly **influence the final decision**.

## Example

$$\begin{aligned}\text{MINIMAX}(\text{root}) &= \max(\min(3, 12, 8), \min(2, x, y), \min(14, 5, 2)) \\ &= \max(3, \min(2, x, y), 2) \\ &= \max(3, z, 2) \text{ where } z = \min(2, x, y) \leq 2 \\ &= 3\end{aligned}$$



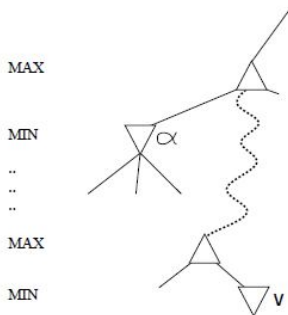
# Alpha-Beta Pruning



- [at least, at most]



## Why is it called $\alpha$ - $\beta$ ?



$\alpha$  is the best value (to MAX) found so far off the current path

If  $V$  is worse than  $\alpha$ , MAX will avoid it  $\Rightarrow$  prune that branch

Define  $\beta$  similarly for MIN



# Alpha-Beta Pruning

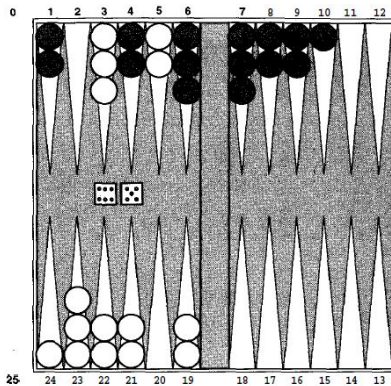
- Alpha-beta needs to examine only  $O(b^{m/2})$  nodes to pick the best move, instead of  $O(b^m)$  for minimax.
- This means that the effective branching factor becomes  $\sqrt{b}$  instead of  $b$ -for chess, about 6 instead of 35.





# Games that Include an Element of Chance

- **Backgammon** is a typical game that combines **luck** and **skill**.
- Two players, 24 narrow triangles, 15 checkers (white/black) per player
- 0 ~ 6: Black's home board, 7 ~ 12: outer board
- 19 ~ 25: White's home board, 13 ~ 18: outer board

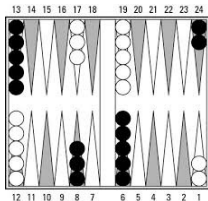


# Games that Include an Element of Chance

- The aim of the game is to move all one's pieces off the board.
- **White moves** clockwise toward **25**, and **black moves** counterclockwise toward **0**.
- A piece can **move to any position except one where there are two or more of the opponent's pieces**.
- If it **moves to a position with one opponent piece**, that piece is captured and has to **start its journey again from the beginning**.
- In this position, **white has just rolled 6-5** and has four legal moves: (5-10,5-11), (5-11,19-24), (5-10,10-16), and (5-11,11-16).



# Games that Include an Element of Chance

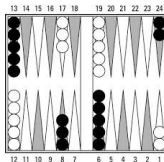


## Initial arrangement of checkers

- **1st player:** 2 on first, 5 on twelve and nineteen, and 3 on seventeen point.
- **2nd player:** 2 on twenty-fourth point, 5 on thirteen and sixth point, and 3 on eighth point.
- Both players have their own pair of dice and a dice cup used for shaking.
- To start the game, each player throws a single die. If equal numbers come up then both players roll again until they roll different numbers.
- The player throwing the higher number now moves his checkers according to the numbers showing on both dice.
- After the first roll, the players throw two dice and alternate turns.



# Games that Include an Element of Chance



Players begin with two checkers on their 24-point, three checkers on their 8-point, and five checkers each on their 13-point and their 6-point.

## Rules

- A checker may be moved only to an open point one, i.e., not occupied by 2 or more opposing checkers.
- The numbers on the 2 dice constitute separate moves. For example, if a player rolls 5 and 3, he may move one checker 5 spaces to an open point and another checker 3 spaces to an open point or he may move the one checker a total of 8 spaces to an open point, but only if the intermediate point (either 3 or 5 spaces from the starting point) is also open.



# Means-end Analysis

## Means-end Analysis

- 1 Comparing the current state  $S_i$  to a goal state  $S_g$  and computing the difference  $D_{ig}$
- 2 An operator  $O_k$  is then selected to reduce the difference  $D_{ig}$ .
- 3 The operator  $O_k$  is applied if possible. If not, the current state is saved, a subgoal is created and means-end analysis is applied recursively to reduce the subgoal.
- 4 If the subgoal is solved, the saved state is restored and work is resumed on the original problem.

## Example

Let the initial PL object  $L_i = R \ \& \ (\sim P \rightarrow Q)$  and goal object  $L_g = (Q \vee P) \ \& \ R$

$$L'_i = (\sim P \rightarrow Q) \ \& \ R = (\sim \sim P \vee Q) \ \& \ R = (P \vee Q) \ \& \ R$$

$$L_g = (Q \vee P) \ \& \ R$$

**NOTE:** A comparison of the difference that  $R$  is on the left in  $L_i$  but on the right in  $L_g$ . This causes a subgoal to be set up to reduce this difference.



Thank You!

