

# Adversarial Search



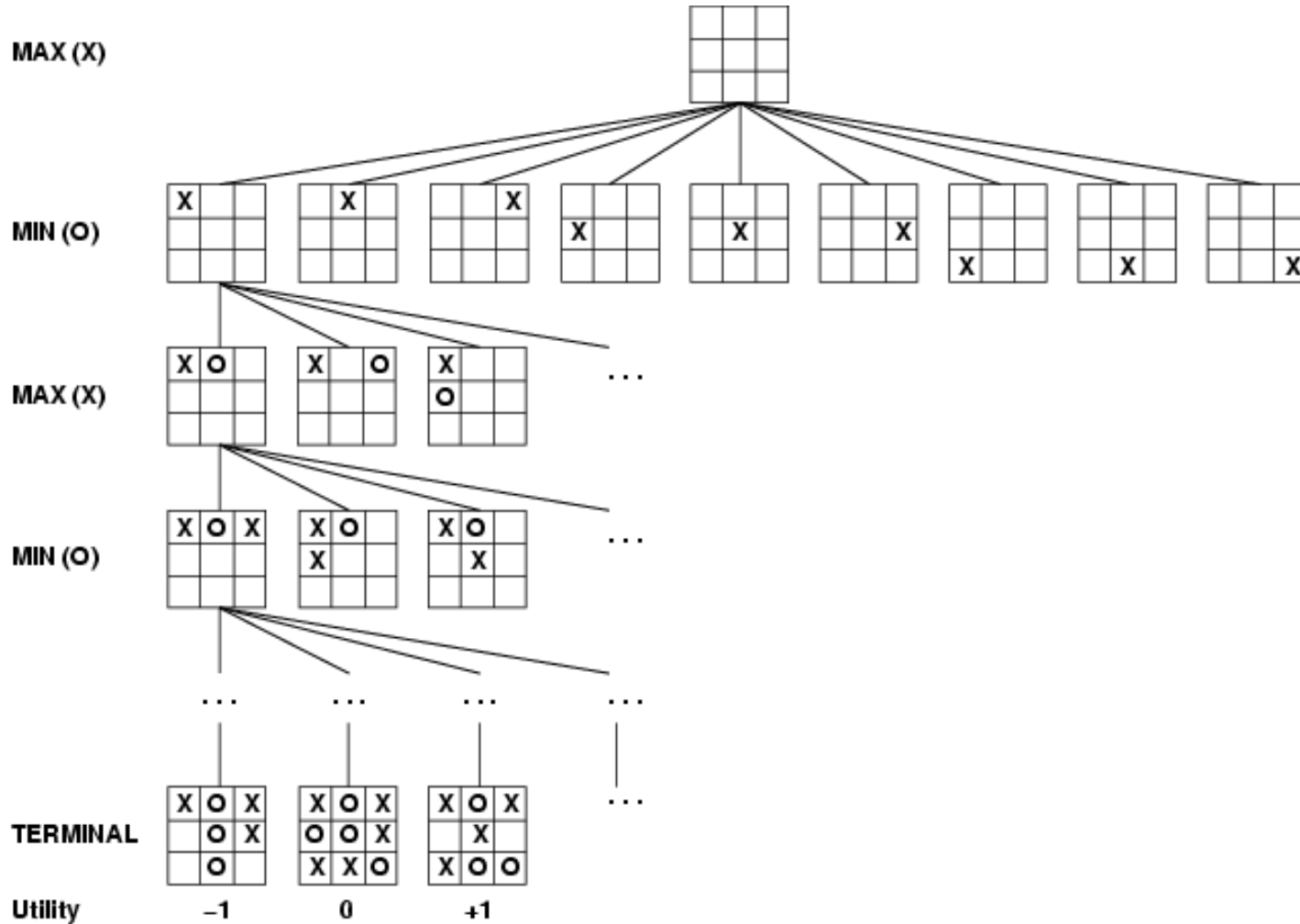
# Games vs. search problems

- "Unpredictable" opponent → specifying a move for every possible opponent reply
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- Time limits → unlikely to find goal, must approximate
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# Minimax

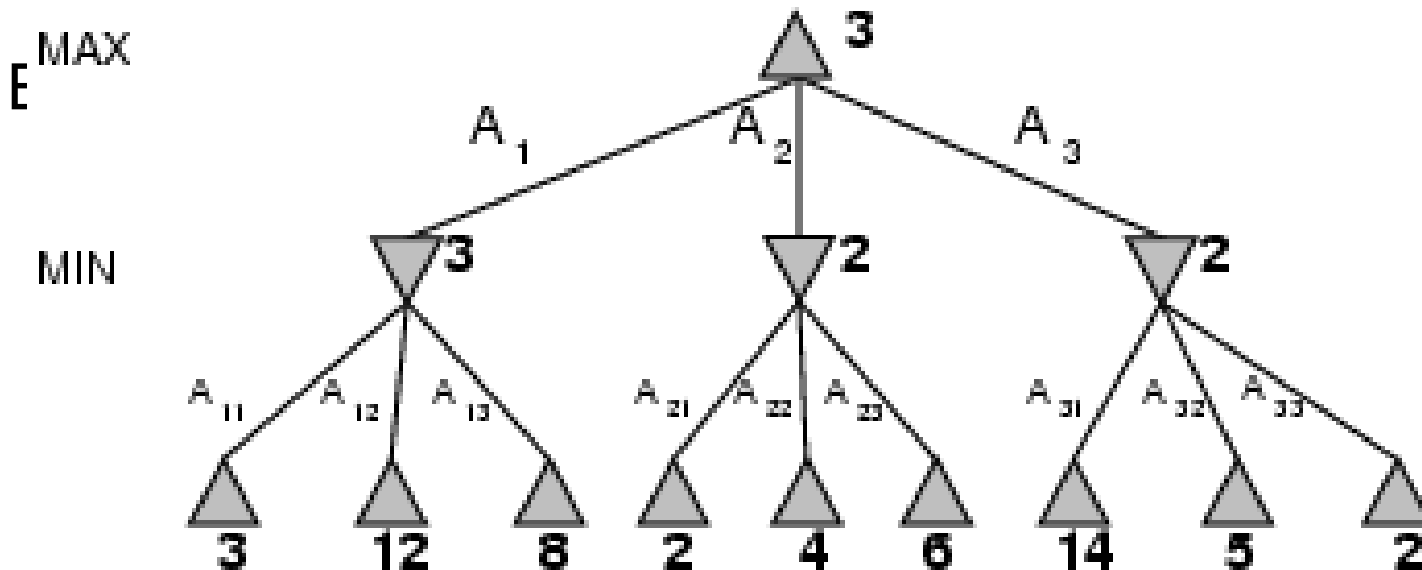


# Game tree (2-player, deterministic, turns)



# Minimax

- Perfect play for deterministic games
- 
- Idea: choose move to position with highest **minimax value** = best achievable payoff against best play
- 



# Minimax algorithm

**function** MINIMAX-DECISION(*state*) *returns an action*

$v \leftarrow \text{MAX-VALUE}(\textit{state})$

**return** the *action* in SUCCESSORS(*state*) with value *v*

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**function** MAX-VALUE(*state*) *returns a utility value*

**if** TERMINAL-TEST(*state*) **then return** UTILITY(*state*)

$v \leftarrow -\infty$

**for** *a, s* in SUCCESSORS(*state*) **do**

$v \leftarrow \text{MAX}(v, \text{MIN-VALUE}(s))$

**return** *v*

---

**function** MIN-VALUE(*state*) *returns a utility value*

**if** TERMINAL-TEST(*state*) **then return** UTILITY(*state*)

$v \leftarrow \infty$

**for** *a, s* in SUCCESSORS(*state*) **do**

$v \leftarrow \text{MIN}(v, \text{MAX-VALUE}(s))$

**return** *v*

# Properties of minimax

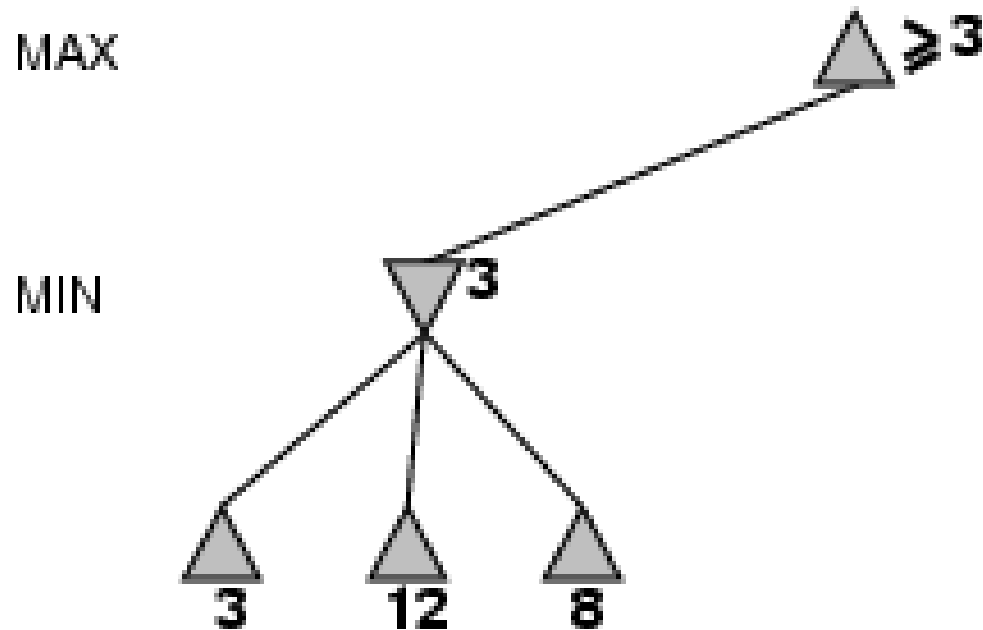
- Complete? Yes (if tree is finite)
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- Optimal? Yes (against an optimal opponent)
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- Time complexity?  $O(b^m)$
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- Space complexity?  $O(bm)$  (depth-first exploration)
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- For chess,  $b \approx 35$ ,  $m \approx 100$  for "reasonable" games  
→ exact solution completely infeasible
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# $\alpha$ - $\beta$ algorithm

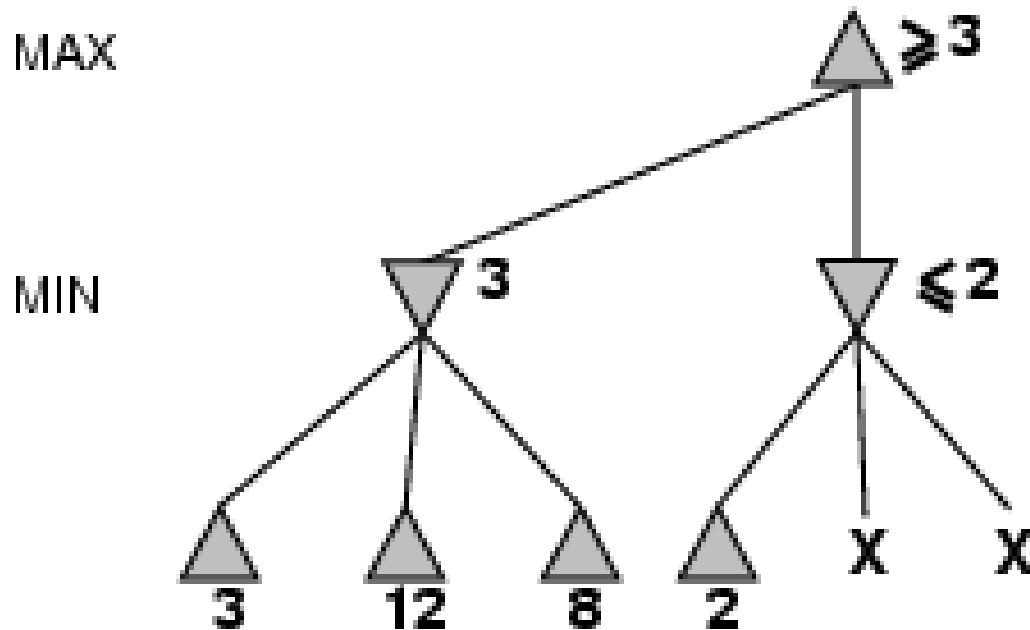




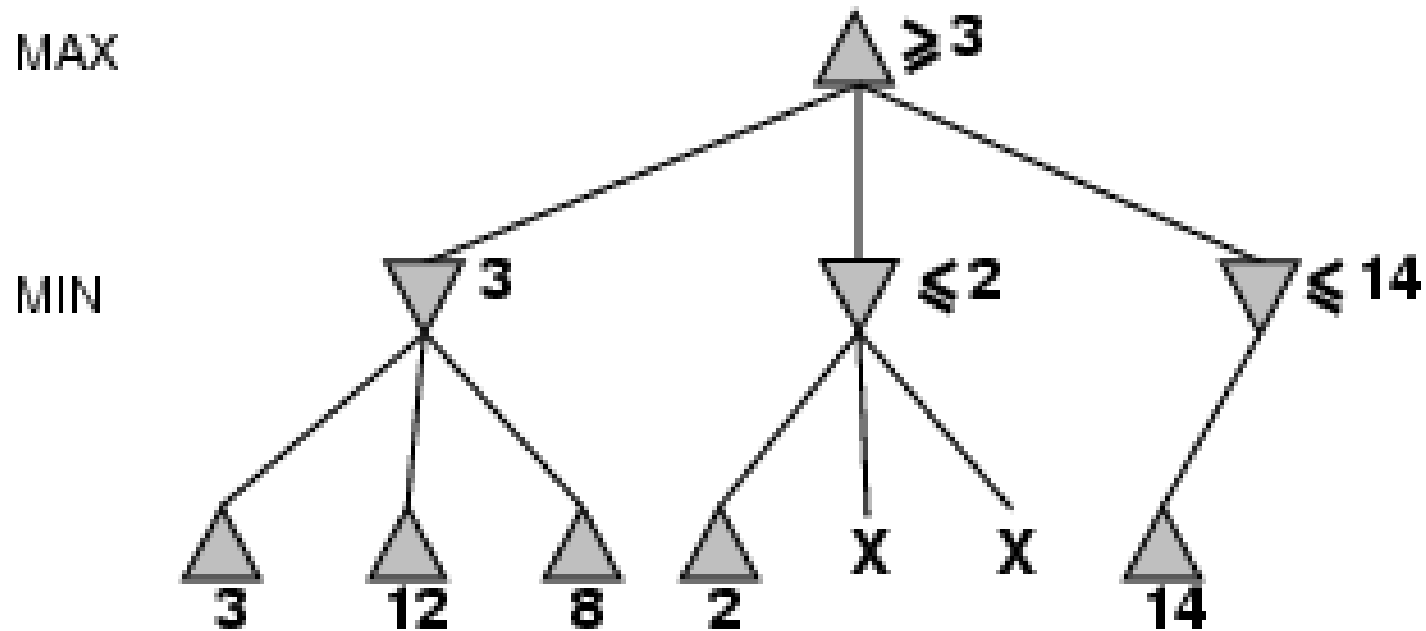
# $\alpha$ - $\beta$ pruning example



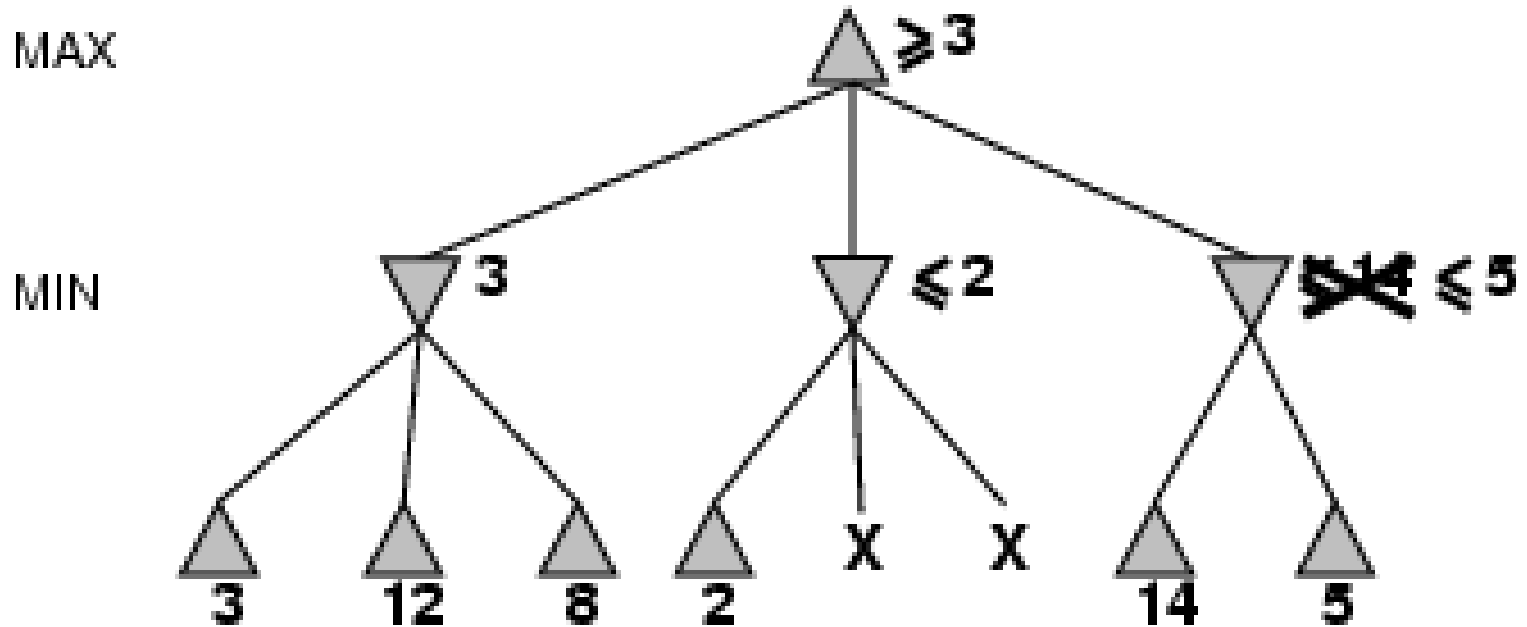
# $\alpha$ - $\beta$ pruning example



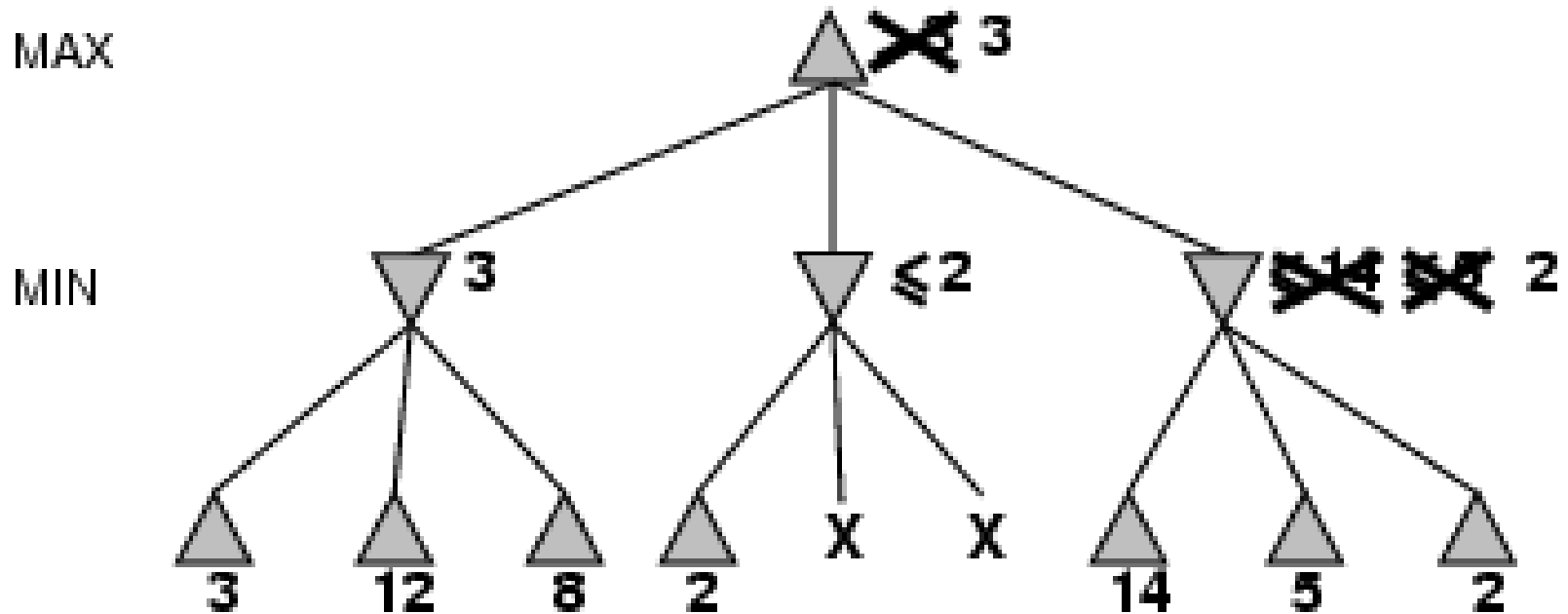
# $\alpha$ - $\beta$ pruning example



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



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



# Properties of $\alpha$ - $\beta$

- Pruning **does not** affect final result
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- Good move ordering improves effectiveness of pruning
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- With "perfect ordering," time complexity =  $O(b^{m/2})$   
→ **doubles** depth of search
- A simple example of the value of reasoning about which computations are relevant (a form of **metareasoning**)
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# Why is it called $\alpha$ - $\beta$ ?

- $\alpha$  is the value of the best (i.e., highest-value) choice found so far at any choice point along the path for *max*
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- If  $v$  is worse than  $\alpha$ , *max* will avoid it
- - prune that branch

MAX

MIN

..

..

..

MAX

MIN

