

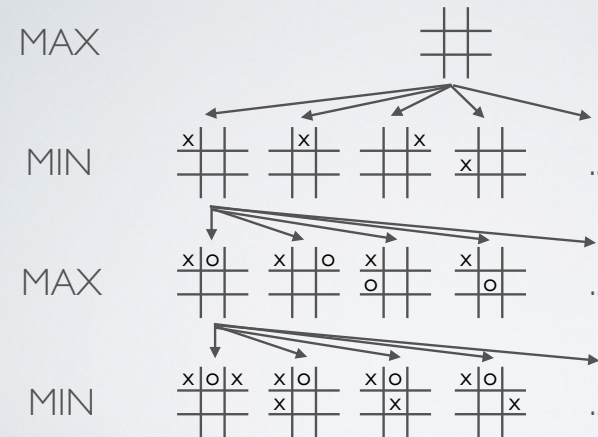
# MINIMAX SEARCH

CSE 511A: Introduction to Artificial Intelligence

Some content and images are from slides created by Dan Klein and Pieter Abbeel for CS188 Intro to AI at UC Berkeley.  
All CS188 materials are available at <http://ai.berkeley.edu>.

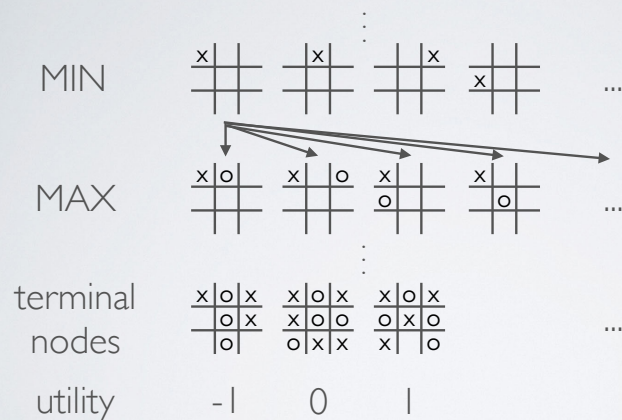
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# MINIMAX GAME TREE



2

# MINIMAX GAME TREE



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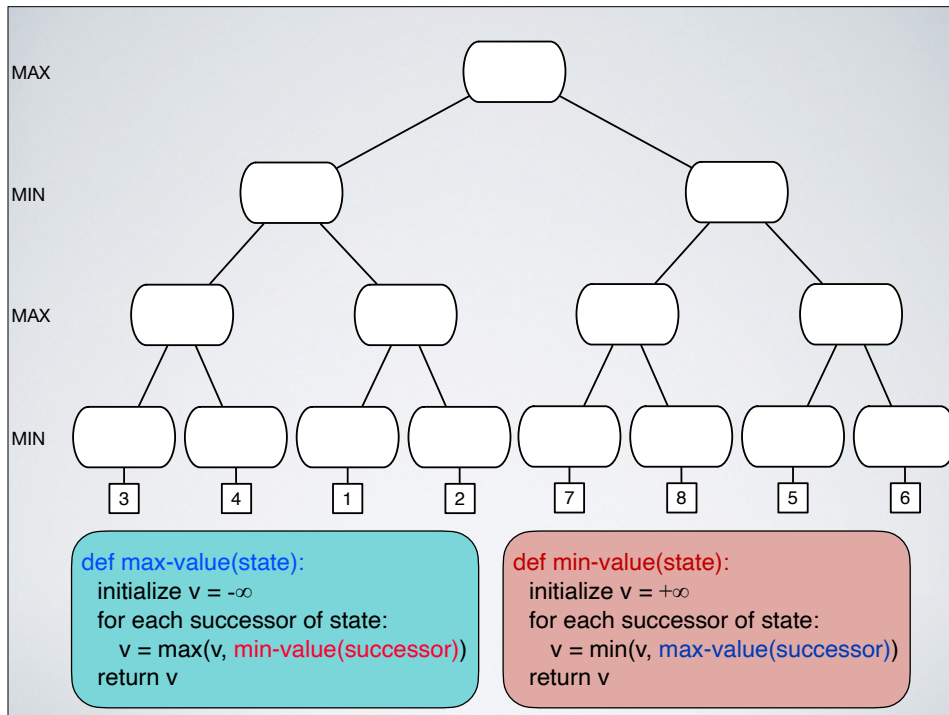
# MINIMAX SEARCH

```
def value(state):
    if the state is a terminal state: return the state's utility
    if the agent is MAX: return max-value(state)
    if the agent is MIN: return min-value(state)
```

```
def max-value(state):
    initialize v = -∞
    for each successor of state:
        v = max(v, min-value(successor))
    return v
```

```
def min-value(state):
    initialize v = +∞
    for each successor of state:
        v = min(v, max-value(successor))
    return v
```

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## MINIMAX SEARCH

	Minimax
Correct the solution it finds is optimal	Yes
Complete it terminates	Yes
Space Complexity max nodes in memory	$O(bm)$
Time Complexity max nodes generated	$O(b^m)$

branching factor  $b$   
depth of the goal  $d$   
depth of tree  $m$

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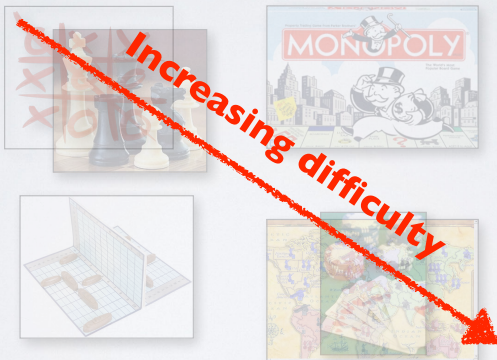
## MINIMAX SEARCH

deterministic

stochastic

perfect  
information

imperfect  
information

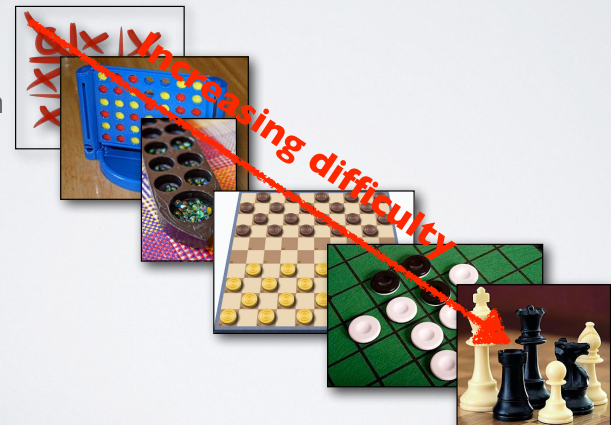


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## MINIMAX SEARCH

deterministic

perfect  
information



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# MINIMAX SEARCH

deterministic

perfect  
information

Tic-tac-toe:  $\sim 10^5$   
Connect Four:  $\sim 10^{21}$   
Congkak-6:  $\sim 10^{33}$

Draughts:  $\sim 10^{54}$   
Othello:  $\sim 10^{58}$   
Chess:  $\sim 10^{123}$



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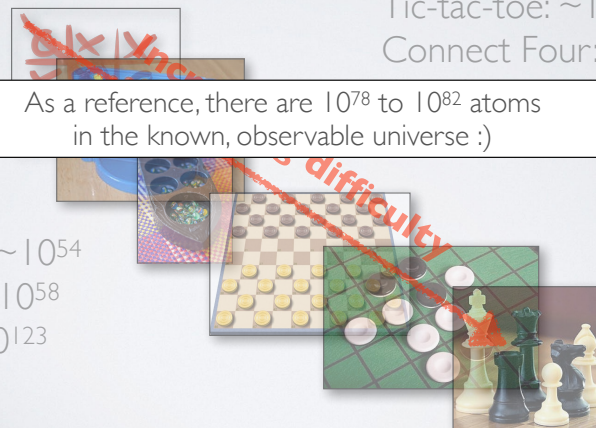
# MINIMAX SEARCH

deterministic

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information

Tic-tac-toe:  $\sim 10^5$   
Connect Four:  $\sim 10^{21}$

Draughts:  $\sim 10^{54}$   
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Chess:  $\sim 10^{123}$



As a reference, there are  $10^{78}$  to  $10^{82}$  atoms in the known, observable universe :)

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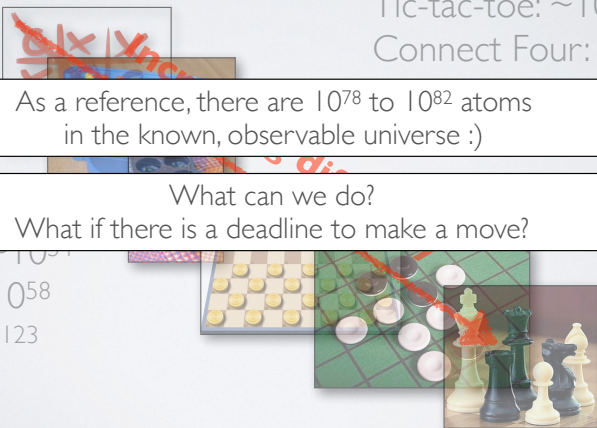
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deterministic

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What can we do?  
What if there is a deadline to make a move?

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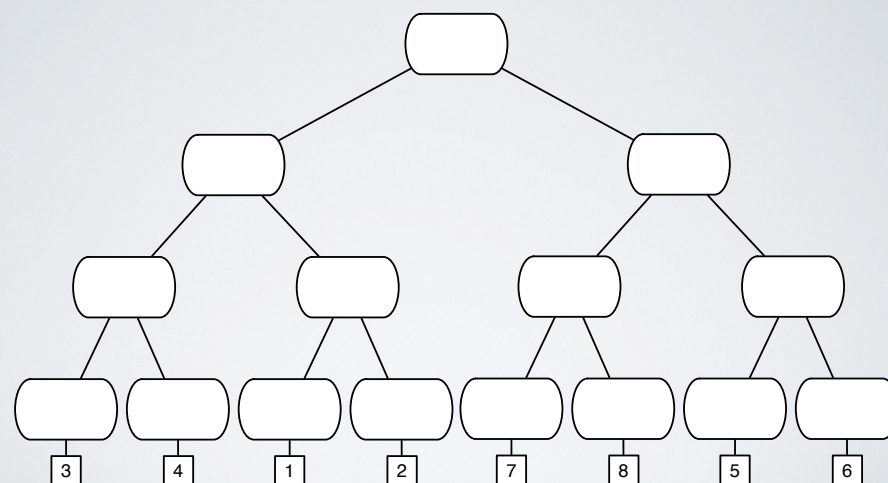
# MINIMAX SEARCH

MAX

MIN

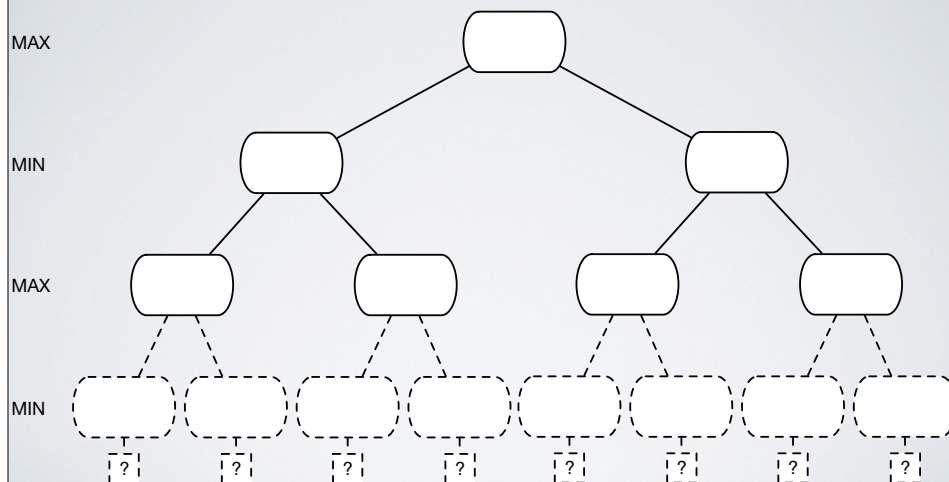
MAX

MIN



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# MINIMAX SEARCH

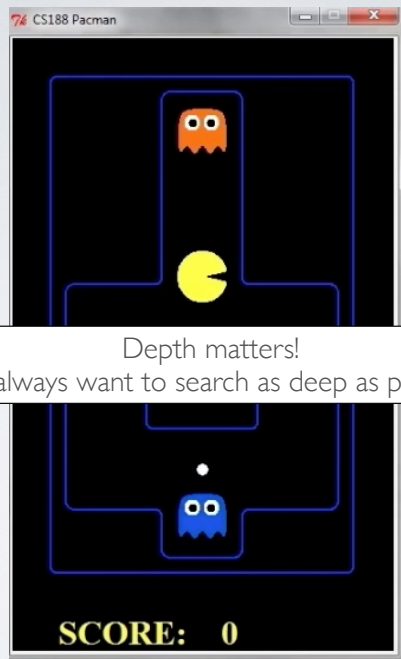


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Depth matters!  
You always want to search as deep as possible

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# MINIMAX SEARCH

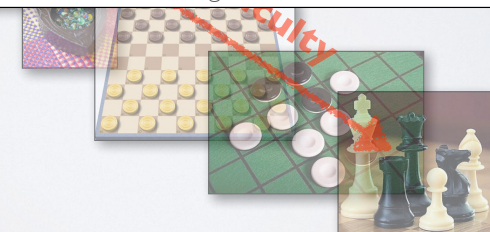
deterministic

perfect  
in

Tic-tac-toe:  $\sim 10^5$   
Connect Four:  $\sim 10^{21}$

What can we do?  
What if there is a deadline to make a move?  
Use heuristics! Estimates on how "good" or "bad" the state is

Draughts:  $\sim 10^{54}$   
Othello:  $\sim 10^{58}$   
Chess:  $\sim 10^{123}$



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