

# CMPSCI 250: Introduction to Computation

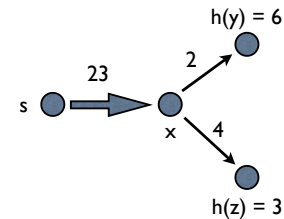
Lecture #27: Games and Adversary Search  
David Mix Barrington  
4 November 2013

# Games and Adversary Search

- Review: A\* Search
- Modeling Two-Player Games
- When There is a Game Tree
- The Determinacy Theorem
- Searching a Game Tree
- Examples of Games

## Review: A\* Search

- The A\* Search depends on a **heuristic function**, which is a **lower bound** on the distance to the goal.
- If  $x$  is a node, and  $g$  is the nearest goal node to  $x$ , the **admissibility condition** on  $h$  is that  $0 \leq h(x) \leq d(x, g)$ .

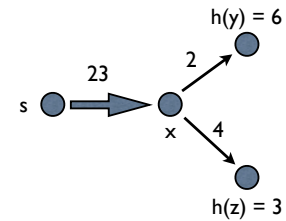


$$p(y) = 23 + 2 + 6 = 31$$

$$p(z) = 23 + 4 + 3 = 30$$

## Review: A\* Search

- Suppose we have taken  $y$  off of the open list. The best-path distance from the start  $s$  to the goal  $g$  through  $y$  is  $d(s, y) + d(y, g)$ , and this cannot be less than  $d(s, y) + h(y)$ .
- Thus when we find a path of length  $k$  from  $s$  to  $y$ , we put  $y$  onto the open list with priority  $k + h(y)$ . We still record the distance  $d(s, y)$  when we take  $y$  off of the open list.

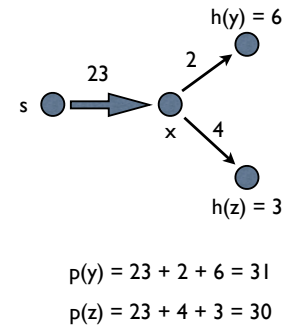


$$p(y) = 23 + 2 + 6 = 31$$

$$p(z) = 23 + 4 + 3 = 30$$

## Review: A\* Search

- The advantage of A\* over uniform-cost search is that we do not consider entries  $x$  in the closed list for which  $d(s, x) + h(x)$  is greater than the actual best-path distance from  $s$  to  $g$ .
- This is because when we find the best path to  $g$  with length  $d(s, g)$ , we will put  $g$  on the open list with priority  $d(s, g) + h(g) = d(s, g)$  and it will come off before any node with higher priority value.



# The 15 Puzzle

- The 15-puzzle is a  $4 \times 4$  grid of pieces with one missing, and the goal is to put them in a certain arrangement by repeatedly sliding a piece into the hole.
- We can imagine a graph where nodes are positions and edges represent legal moves.

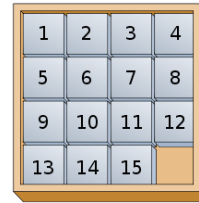


Figure from  
en.wikipedia.org  
"Fifteen puzzle"

# The 15 Puzzle

- In order to move from a given position to the goal, each piece must move at least the Manhattan distance from its current position to its goal position.
- The sum of all these Manhattan distances gives us an admissible, consistent heuristic for the actual minimum number of moves to reach the goal. So an A\* search will be faster than a uniform-cost search.

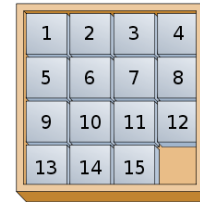


Figure from  
en.wikipedia.org  
"Fifteen puzzle"

## Clicker Question #1

- We define the distance to the goal state in the 15 puzzle as the number of moves needed to reach it. Which of these functions of a position would *not* be an admissible heuristic for this problem?
- (a) the number of moves taken by a DFS
- (b) the number of pieces not in the right place
- (c) the sum, over all pieces, of the Manhattan distances of that piece from its right place
- (d) 0 for the goal state, 1 for anything else



## Answer #1

- We define the distance to the goal state in the 15 puzzle as the number of moves needed to reach it. Which of these functions of a position would *not* be an admissible heuristic for this problem?
- (a) *the number of moves taken by a DFS*
- (b) the number of pieces not in the right place
- (c) the sum, over all pieces, of the Manhattan distance of that piece from its right place
- (d) 0 for the goal state, 1 for anything else

## Modeling Two-Player Games

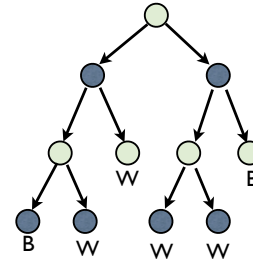
- There are many kinds of games, and we are now going to look at a theory which will let us model and analyze some of them.
- You probably know that the game of **tic-tac-toe** is not very interesting to play, because if both players are familiar with the game the result is always a draw.
- There is a strategy for the first player, X, that allows her to always win or draw. There is also a strategy for O, the second player, letting him win or draw. If both players play these strategies, there is a draw.

## Modeling Two-Player Games

- Any game that shares certain particular features of tic-tac-toe is **determined** in the same way.
- We must have **sequential moves, two players**, a **deterministic** game with no randomness, a **zero-sum** game, and **perfect information**.
- In these cases we can model the game by a **game tree**.

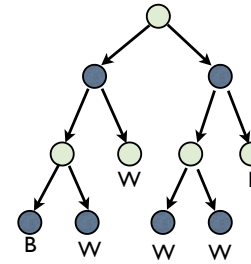
# Game Trees

- A game tree has a node for every possible **state** or **position** of the game. The root node represents the **start position**.
- A node  $y$  is a child of a node  $x$  if it is possible, according to the rules of the game, to get to  $y$  from  $x$  in one move.



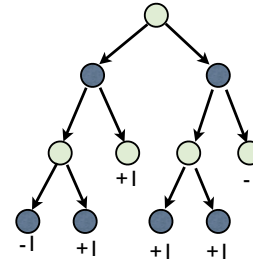
# Game Trees

- Every node is labelled by **whose turn** it is.
- Usually the two players alternate moves, so we can call them the **first** and **second** player (White and Black), but our analysis will not change if one player can make several moves in a row.



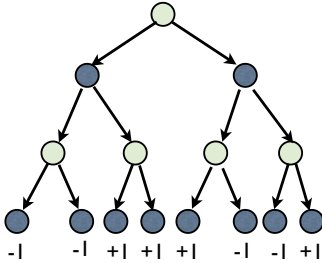
# Game Trees

- The **leaves** of the tree represent positions where the **result** of the game is known.
- We label leaves with a real number indicating how much White is paid by Black, typically 1 for a White win, 0 for a draw, and -1 for a Black win, but any real number values are possible.



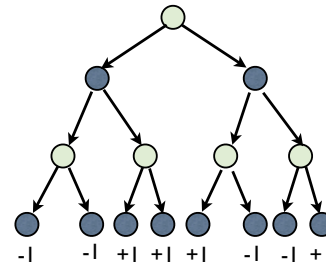
# Clicker Question #2

- Who wins the game represented to the right, if both players play optimally?
- (a) White wins with either first move
- (b) White wins if and only if she takes the left move
- (c) White wins if and only if she takes the right move
- (d) Black wins



## Answer #2

- Who wins the game represented to the right, if both players play optimally?
- (a) White wins with either first move
- (b) White wins if and only if she takes the left move
- (c) *White wins if and only if she takes the right move*
- (d) Black wins





## When We Have a Game Tree

- To be represented by such a tree the game must be **discrete, deterministic, zero-sum**, and have **perfect information**.
- The tree is **finite** if there are only finitely many sequences of moves that can ever occur. We could have a finite **game graph** where nodes can be reached in more than one way or even revisited, but we won't analyze these here.

## The Determinacy Theorem

- Each leaf has a **game value**, the real number we defined above. We can inductively assign a game value to every *node* of the tree, by the following rules.
- The value  $\text{val}(s)$  of a final position is its label.
- If White is to move in position  $s$ ,  $\text{val}(s)$  is the *maximum* value of any child of  $s$ .
- If Black is to move in position  $s$ ,  $\text{val}(s)$  is the *minimum* value of any child of  $s$ .

# The Determinacy Theorem

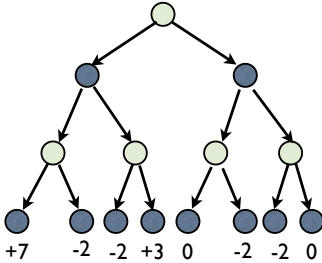
- The **Determinacy Theorem** says that:
- (1) any game given by a finite tree has a game value  $v$  (the value of the root given by the definition above),
- (2) White has a strategy that guarantees her a result of *at least*  $v$ , and
- (3) Black has a strategy that guarantees him that the result will be *at most*  $v$ . Thus  $v$  is the result if both players play *optimally*.

## Proving Determinacy

- We prove that for each node  $x$  in the tree, each player has a strategy that gets them either a result of  $\text{val}(x)$  or a result that is even better for them.
- If  $x$  is a leaf of the tree this is obvious.
- If it is White's move she can move to the child with value  $\text{val}(x)$ , and by the IH get at least this result.
- It's just the same if Black is to move.

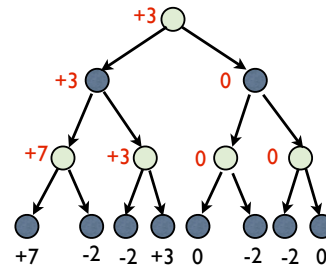
# Clicker Question #3

- What is the value of the game represented to the right?
- (a) -2
- (b) 0
- (c) 3
- (d) 7



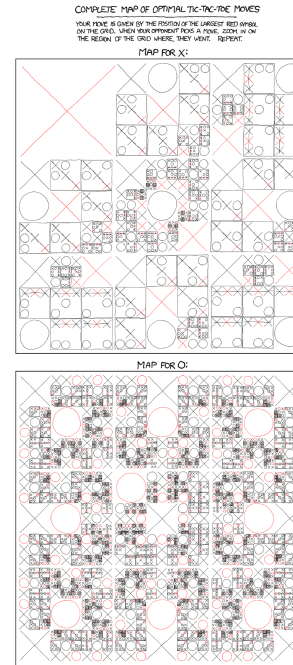
# Answer #3

- What is the value of the game represented to the right?
- (a) -2
- (b) 0
- (c) 3
- (d) 7



# Winning Tic-Tac-Toe

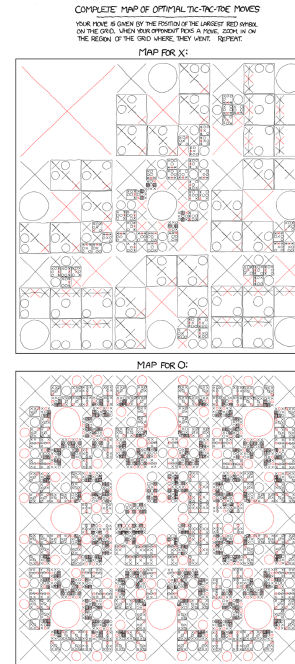
- The chart to the right, if it were big enough to read, would tell you **complete strategies** for each player guaranteeing a result of 0 (a draw) or better.



xkcd.com/832

# Winning Tic-Tac-Toe

- The X strategy starts with moving to the top left, then has a reply to each of the eight O moves that could follow, then a reply to each of the six possible O responses to that move, and so on.
- The desired moves are in red.

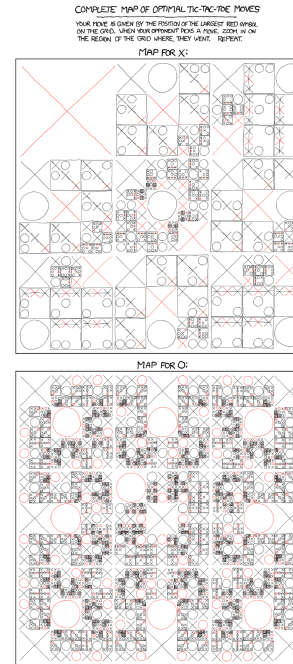


xkcd.com/832



# Winning Tic-Tac-Toe

- The O strategy must have responses to all nine initial X moves, then to all seven X responses to each of those moves, and so on.
- The messiest parts of the chart is where the game goes for all nine moves, since each board is 1/9 the area of the last.



xkcd.com/832

## Searching a Game Tree

- The Determinacy Theorem only tells us that these optimal strategies exist, not that they are possible to implement.
- If it is possible to **calculate the game value** of any node, then choosing the right move is easy. And we have a recursive algorithm to compute the game value, so what is the problem?
- The tree could be *really really big*.

# Adversary Search

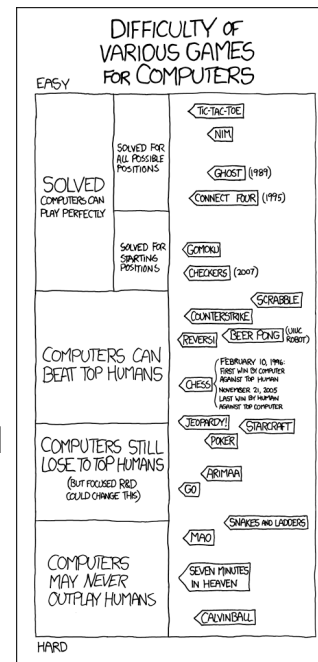
- An exhaustive adversary search computes the exact value.
- If we can't do that, we need an **estimate** of the game value.
- In Chess, for example, we can evaluate material and some positional facts to get a good idea whether one position is better than another.

## Adversary Search

- We can then use **finite lookahead**, playing a game that ends in  $k$  moves, where the payoff is the estimated value of the position at the end of those  $k$  moves.
- **Alpha-beta pruning**, which we won't do in this course, is a way to improve the search. But the required time is still usually exponential in the number of moves to go.

# Examples of Games

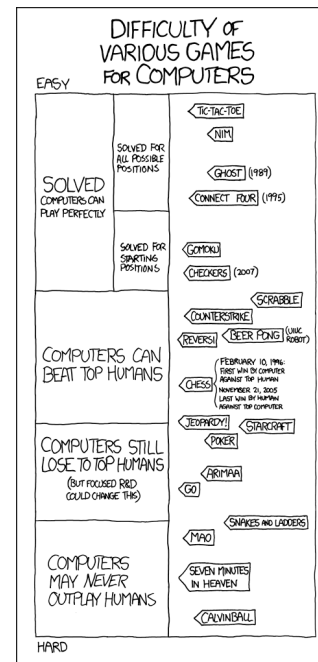
- In 1965, my father's M.S. thesis was to build a tic-tac-toe program that learned from its mistakes.
- By 1992, and probably earlier, students in CMPSCI 187 could build a winning program that exhaustively searched the game tree *on every move*.



xkcd.com/1002

# Examples of Games

- There is either a winning strategy for White in Chess, or a drawing strategy for Black. But no one knows which is true.
- Current Chess programs succeed by doing a better job of searching and evaluating positions.



# Examples of Games

- Computers don't approach chess the way good human players do. We can use games as benchmarks for AI achievement.
- Checkers is easier than Chess, and Go is harder.
- Calvinball (from *Calvin and Hobbes*) allows rules to be changed at will.

