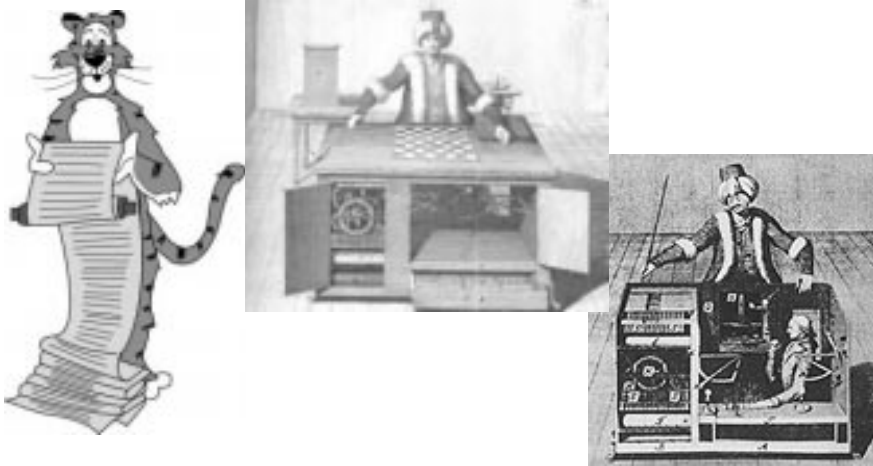


# Lecture S2: Artificial Intelligence



## Overview

A whirlwind tour of Artificial Intelligence.

We spend just one lecture, but there are:

- Many courses on AI, but only one at Princeton :- (
- Professorships of AI.
- Entire university departments of AI.

Today's level of aspiration.

- A quick survey of several important topics.

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## Origins

Idea of programming computers for "intelligent" behavior.

- First suggested by--who else?--Alan Turing, 1950.

Term "artificial intelligence" coined by John McCarthy in 1955.

Dartmouth summer conference, 1956.

- Gathering of field's luminaries
- Very optimistic!

*"Every aspect of learning or any other feature of intelligence can in principle be so precisely described that a machine can be made to simulate it."*



J. McCarthy, \*51

Optimistic predictions very common in 50's and 60's.

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## 8-puzzle

Slide tiles until they're in numerical order.

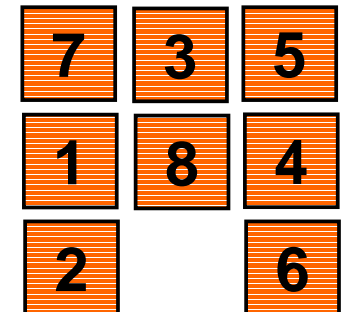
Of course there is: [8-puzzle on the Web.](#)

What strategy to use to solve puzzle ?

- No obvious algorithm.

From this position, 

- Three successor positions.
- From each of these,
  - Two, three, or four successors.
  - And so on.



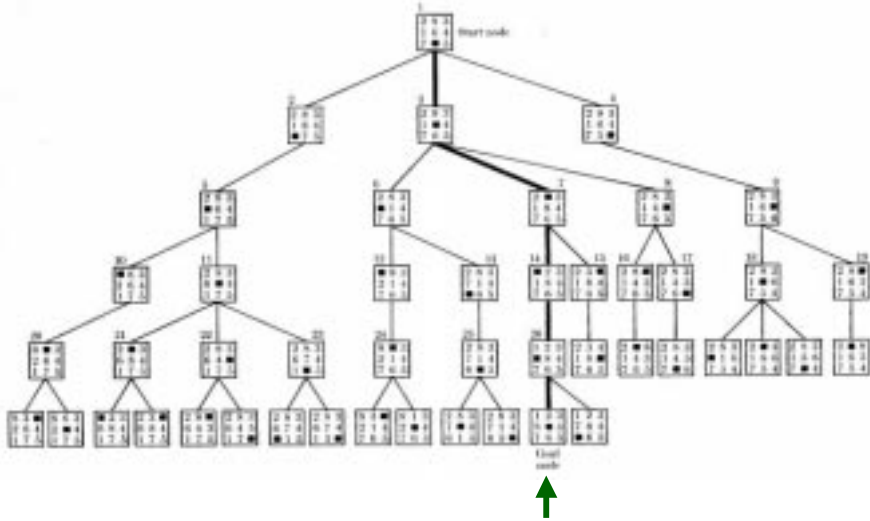
Sounds like a tree?

- Yup.

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## 8-puzzle: Breadth-First Search

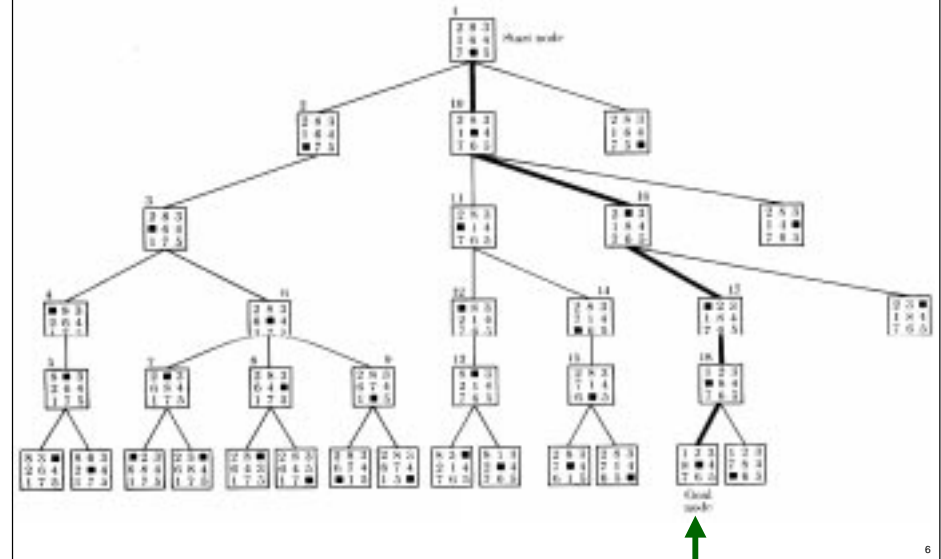
Search tree for Goal node, one level at a time.



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## 8-puzzle: Depth-First Search

Search for Goal down to some depth.



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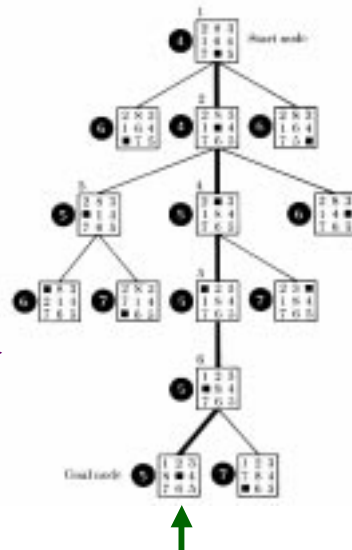
## 8-puzzle: Heuristic Search

Breadth-First and Depth-First are "blind" searches.

- Exhaustive methods for finding path to goal.
- Often infeasible because too many nodes expanded.
- Success (eventually) guaranteed.

"Heuristic" search.

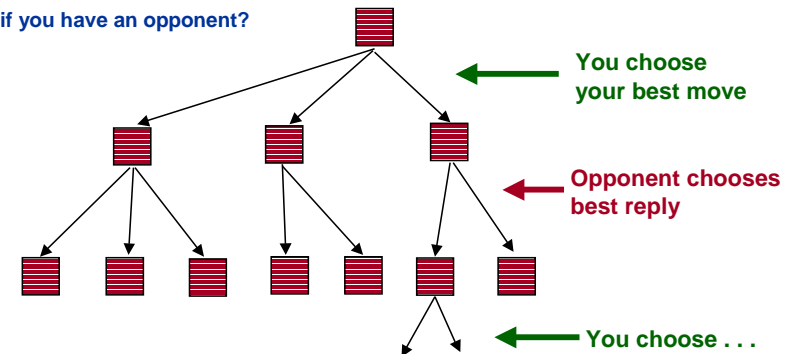
- Uses "evaluation function" to rank successor nodes; pick best.
- No guarantee of success.
- Example uses distance from start plus number of tiles out of place
- Many other functions possible.
- Note: only 6 nodes expanded



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## Game Trees

What if you have an opponent?



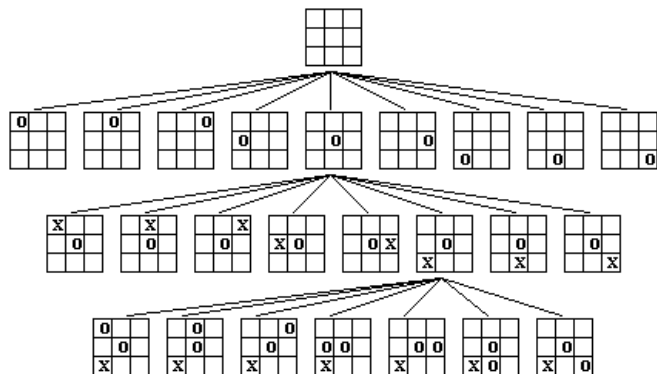
You should choose the move that minimizes your opponent's best chance.

- And your opponent should do likewise.
- "Minimax" methods use heuristics that assume you make choice that's best for you (max) and opponent makes choice that's worst for you (min).

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## Tic-tac-toe

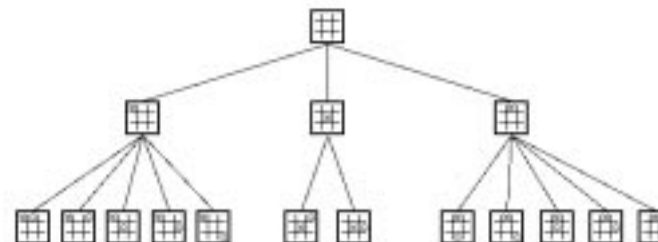
Partial game tree.



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## Tic-tac-toe

Reduce tree by recognizing symmetries.



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## Sizes of game trees

8-puzzle.

- First tile can be in any one of 9 squares.
- Second tile in one of 8.
- Total number of nodes =  $9! / 2 = 181,440$

Tic-tac-toe (ignoring symmetries).

- First move: one of 9 spots.
- Second move: one of 8.
- Some games terminate before 9 moves made.
- Total number of nodes  $< 9! = 362,880$

Both numbers small, so exhaustive search feasible.

But what about some bigger game, for instance . . .

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## Chess

A favorite target of AI researchers since 1950's.

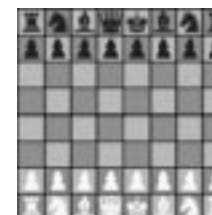
How big is game tree?

- 20 possible first moves.
- 35 possible next moves on average.
  - called "branching factor"
- Suppose games average 50 moves (each side).
- Complete game tree therefore has

$$35^{50} = 10^{120} \text{ nodes !}$$

So if each electron in the universe were a supercomputer, etc., etc.

Any computer (and any person) can search only the tiniest fraction of the complete game tree.



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# Chess

Lots of effort, and steady improvements, since 1950's.

Deep Blue chess machine developed at IBM

- Hsu, Campbell, Tan, Hoane, Brody, Benjamin, 1990's.
- 32-processor parallel computer.
- 512 special chess chips.
- Evaluates 200 million positions/sec.
- Huge amount of chess knowledge programmed in.
- Uses heuristic functions and minimax tree search.



In a 6-game match in 1997,  
Deep Blue defeated Garry Kasparov,  
the World Chess Champion.



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# Backgammon

Moves use roll of 2 dice.

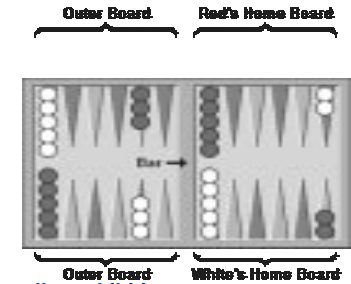
- 21 different outcomes.

About 20 possible moves,  
on average, per dice roll.

Game tree has branching factor  
of about 400. (That's big.)

Searches of even moderate depth computationally prohibitive.

- Really good heuristic function VERY important.



Something better must be done. . .

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# TD-Gammon

G. Tesauro, 1995.

Uses *neural network* and *reinforcement learning*.

- Each connection has a weight.
- Each node outputs weighted sum of inputs.
- Weights adjusted at each step.

Input patterns.

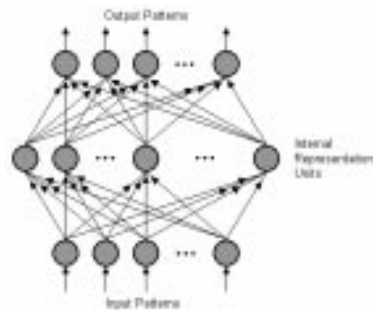
- Describe board position.

Output patterns (just 4).

- Probability of each outcome.

Weight adjustment function.

- Tries to make successive predictions
- Hence: Temporal Difference.



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# TD-Gammon

Initial state of neural net: random weights!

- Program begins "training" with practically no knowledge of game!
- (Well, OK, it knows what a legal move is, but that's almost all.)

Training ("learning" ?) process.

- Program evaluates predicted game outcomes for all legal next moves.
- Program picks move with best outcome for current player.
- Then:
  - Adjusts weights according to function.
  - Switches sides and repeats until game over (plays against itself).

Results

- Early random games took thousands of moves to finish!
- After 1.5 million games, program became *best player in the world!*

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## Eliza

### Weizenbaum, 1966.

- First "chatterbot": program that mimics human conversation.
- Just 200 lines of code!
- Works by generating scripted responses to keywords.

### Program imitates Rogerian psychiatrist.

- "Active listening"
- Therapist doesn't disagree; does not delve into the unconscious.

### Is Eliza "intelligent"?

- You be the judge: here's [Eliza on the Web](#).

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## Turing Test

### Judge types questions to both.

- Computer claims to be human.
- (So does human, btw!)



If judge cannot tell which entity is human, we say computer has passed the test and is "intelligent."



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## Turing Test

### Loebner Prize

- \$100,000 to first program to pass modified Turing Test.
- Annual competition held since 1995.
- Small awards given to best programs.



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## Loebner Contest Dialogs

"Hello, Judge. My name is Ella. Please tell me your first name, or whatever I should call you."

"Call me Lisa. Am I male or female?"

"Okay, I will call you 'Lisa. Am I Male Or Female?' I am here recently from Tainjin, China, so please be patient with me."

"I'm not a patient because I am not ill. Are you feeling well today?"

"What do you think it means that you are not ill?"

"Have you ever been ill?"

" 'Have you ever been ill?' you say? That's it, Lisa Am I Male Or Female! I will schedule a whipping for you."

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## Loebner Contest Dialogs

"What do you think of Reading?"

"I'm somewhat crazy about reading. I like to read mystery novels."

"I meant the town."

"Jones lives in the city and is a writer of children's books."

"Does Jones live in Reading, then?"

"Tomorrow is another day. We can only live today well."

"Do you live, then?"

"I live then a lot. Someday we will live on another planet."

"I think you are already there."

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## Loebner Contest Dialogs

"What is it?"

"What is what?"

"A high-yield, perennial, four-lobed hybrid of wheat and rye whose root grain, triticale, can trace its ancestry to twentieth-century Canada."

"At last. Another classic grain freak."

"Lewis. Jim Lewis. Would you like for me to show you some poetry?"

"No, thanks."

"I didn't want to show you the stupid poetry anyway."

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## Chinese Room Experiment

Searle, 1980.

Imagine that:

- You don't understand Chinese.
- You are alone in a room that has paper slots labeled "input" and "output".
- You have a big book of Chinese writing.
- You have English instructions (*no translations*) that tell you what to write on your output paper in response to various inputs.

And then:

- Chinese speakers outside the room pass in pieces of paper with Chinese writing. They know these are questions (but you don't).
- You consult your manual of instructions, figure out the proper Chinese response, copy it down, and pass it out.

The Big Question.

- The folks outside think you understand Chinese. Do you?
- If a computer did the same, would it understand Chinese?

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## Chinese Room Experiment

"Weak" AI hypothesis.

- Machines can be programmed to **exhibit** intelligent behavior.
- Surely true: witness Deep Blue, TD-Gammon, others.
- Programs use methods very different from humans.
  - Performance (of task) vs. Simulation (of human methods).

"Strong" AI hypothesis.

- Machines can be programmed to **possess** intelligence.
- Must they use brain-like methods (e.g., neural nets) ?
  - "Connectionism"

Searle used Chinese Room as absolute refutation of the possibility of strong AI.

But many disagree!

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## "Reverse" Turing Test

Standard Turing Test: judge is human.

Reverse Turing Test: judge is computer!

Why?

- Yahoo allows each user 15 Mbytes of Web storage.
  - You write a "bot" to sign up 1 million users.
  - Congratulations. You now have 15 Terabytes of storage !
- PayPal offers \$5 for each user who opens a new account.
  - You write a bot to sign up 1 billion users.
  - Congratulations. You now have \$5,000,000,000 !
- Both need to tell real humans from bots (programs).
  - [Here's how PayPal does it.](#)

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## Is (Strong) AI Ultimately Possible?

"Just as the Wright brothers at Kitty Hawk in 1903 were on the right track to the 747, so too is AI, with its attempts to formalize commonsense understanding, on its way to fully intelligent machines." (Patrick Winston)

"Believing that writing these types of programs will bring us closer to real artificial intelligence is like believing that someone climbing a tree is making progress toward reaching the moon." (Hubert Dreyfus)

"The brain happens to be a meat machine." (Marvin Minsky)

"Either artificial intelligence *is* possible...or *we're* not." (Herb Simon)

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## AI in Everyday Life

Many examples of AI methods at work in the real world.

Microsoft Office's helpful talking paperclip.

- R.I.P.



Google (and other "intelligent" search engines).



Speech recognition.

- Speak slowly and clearly to the telephone robot.

Optical character recognition (OCR).

- Makes U.S. Postal Service happy.

Control of spacecraft !

- AI system given control of Deep Space 1 for 2 days in May 1999.

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## Omitted Topics

Knowledge representation.

Reasoning.

Expert systems.

Natural language understanding.

Speech recognition.

Computer vision.

And dozens more. . .

(But hey, we only had the one lecture.)

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## Summary

### Games computers play.

- Some easy: 8-puzzle, tic-tac-toe.
- Some formerly hard, now easy: checkers, chess, backgammon.
- Some still hard: Go.

### Methods.

- Exhaustive search (small problems only).
- Heuristic search.
- Neural networks.
- Special-purpose machines with built-in knowledge.

### Turing Test

- Convincing conversation still a challenge!
- Chinese Room experiment refutes (?) possibility of strong AI.

### Interested? Try COS 302, Introduction to Artificial Intelligence.

- But probably not until Fall '03.