

# Limits of Computation

Dr. Abdallah Mohamed

Acknowledgement: Original slides provided courtesy of Dr. Lawrence.

## Key Points

- 1) Computers can demonstrate “artificial intelligence” but cannot yet mimic human creativity.
- 2) Game trees and search strategies are used to create the intelligence in games.
- 3) Scientists use big-Oh notation to analyze and compare the performance of algorithms.
- 4) There exists some problems where there is no efficient solution or no solution at all.

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## Do Computers have Limits?

We have seen that the computer gets its **power** by being able to perform **simple operations very fast**.

By combining these simple operations into larger software programs, a computer can perform complex tasks.

Two interesting questions:

- ◆1) Can computers do anything (everything)?
- ◆2) Can computers behave like humans?

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## Can Computers Think?

The **Turing Test**



Source: [www.elfanturing.net](http://www.elfanturing.net)

If the judge cannot identify the computer, the computer can be said to be intelligent.

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## Can Computers Think?

Alan Turing posed the **Turing Test** to evaluate if a computer can mimic a human. The Turing Test:

- ◆Two identical rooms connected electronically to a judge who can type questions directed to the occupant of either room. A human being occupies one room, and the other contains a computer. The judge's goal is to decide, based on the questions asked and the answers received, which room contains the computer. If after a reasonable period of time the judge cannot decide for certain, the computer can be said to be intelligent.
- ◆The computer is intelligent if it acts enough like a human to deceive the judge.

The test does not define thinking, intelligence, awareness or focus on any specific ability.

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## Can Computers Think? (2)

Computers have come closer to passing the test but not quite.

Computer advances:

- ◆Better understanding and parsing of **natural language (ELIZA)**
- ◆Recognize **semantics** in language and communication
- ◆**Translate** to and from natural language realistically
- ◆Improved computational power

Work to do:

- ◆Computational power will go beyond that of the human brain in 50 years.
- ◆Outstanding challenge is modeling **complexity and intelligence** in software.

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## Acting Intelligently?

Eliza is a system developed by MIT researcher Joseph Weizenbaum to carry on a conversation as though she were a psychotherapist.

- ◆ The software used word clues for answers but did not understand the meaning so it was not intelligent.

Example:

```
User: I'm depressed.
Doctor: Why are you depressed?
User: My mother is not speaking to me.
Doctor: Tell me about your mother.
User: She doesn't want me to major in engineering.
Doctor: No?
User: No, she wants me to go into medicine.
```

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## Survey Computer Intelligence

**Question:** I believe a computer will behave like a human ...

- A) never
- B) in my lifetime
- C) within 50 years
- D) within 20 years
- E) within 10 years

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## Survey Computers and Humanity

**Question:** It is a good thing if computers/robots become as intelligent as humans and develop/display emotions.

- A) Strongly Agree
- B) Agree
- C) Neutral
- D) Disagree
- E) Strongly Disagree

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## Artificial Intelligence

**Artificial intelligence (AI)** refers to the ability of a computer to **mimic human intelligence** in certain situations.

To exhibit intelligence, the computer has to "**understand**" a complex situation and **reason** well enough to act on its understanding.

One example of AI is computer intelligence in playing games such as **chess** and **checkers**.

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## Game Intelligence

For a computer to play a game against a human opponent, it must make **intelligent decisions on** its moves.

Strategy games such as checkers and chess have been targeted games for computing "artificial intelligence".

Even video games require the computer to determine **strategies**, even though the decision making is less complex.

- ◆ This includes games such as role-playing games and strategy/conquest games.

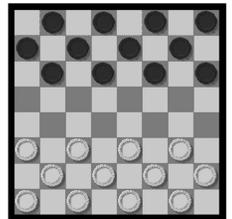
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## Checkers

The world champion is a program called **Chinook** created by researchers at the University of Alberta, Canada.

- ◆ <http://www.cs.ualberta.ca/~chinook>  
⇒ Get crushed by Chinook if you choose

- ◆ They also have a research group called GAMES (Game- playing, Analytical methods, Minimax search, and Empirical Studies)  
⇒ <http://www.cs.ualberta.ca/~games>



- ◆ Checkers was solved in 2005. Perfect play by both sides leads to a draw. There are 500 billion billion ( $5 \times 10^{20}$ ) positions.

- ◆ Group is working on poker players as well.

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## Chess

A computer program does not have world champion status, but defeated world champion Gary Kasparov in a regulation match in 1997.



### Deep Blue

- ◆ Developed by IBM at a cost of millions of dollars.
  - ⇒ Powered by a RS/6000 massively parallel mainframe.
  - ⇒ Can evaluate 200 million board positions a second.
  - ⇒ <http://www.research.ibm.com/deepblue/home/html/b.html>

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## Jeopardy

IBM's Watson AI program competed on Jeopardy! in February 2011 against champions Ken Jennings and Brad Rutter.

◆ Watson: \$77,147 Jennings: \$24,000 Rutter: \$21,000

Watson is a specialized program with a huge, self-contained database that **parses English, formulates queries to database, and filters and selects correct answer.**

- ◆ Database has 200 million unstructured pages.
- ◆ Watson consisted of 2,800 computers and terabytes of memory.
- ◆ Applied to medicine, banking, and research.

"Final Jeopardy!" question it got wrong in category U.S. Cities: *Its largest airport is named for a World War II hero, its second largest for a World War II battle.*

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## A Simple Game Tic-Tac-Toe

A good way to look at structures and algorithms that are capable of playing games of pure skill is by examining a simple game like Tic-Tac-Toe (also called x's and o's).

### Tic-Tac-Toe

- ◆ A game of pure skill
  - ⇒ No element of chance
- ◆ Can program Tic-Tac-Toe by "looking" for forced moves, traps, and patterns.
  - ⇒ Careful case by case analysis
    - Can be done because of the relatively **few cases possible**

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## Game Playing Mini-max Strategy

The majority of game playing systems employ something called a **mini-max strategy**.

- ◆ The basic idea in a mini-max strategy is that you determine a move which **maximizes** your potential to win the game and **minimizes** your opponent's potential to win the game.

The mini-max strategy consists of three components:

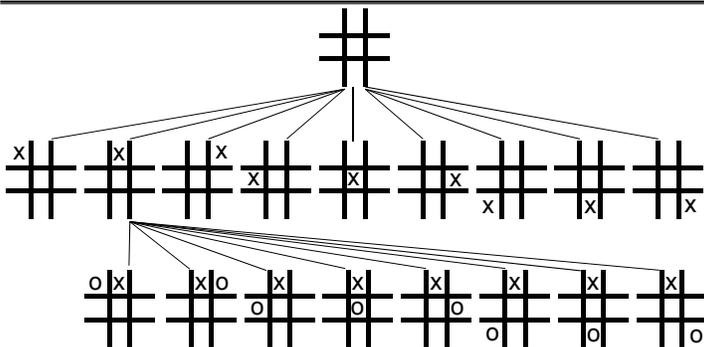
- ◆ **Move generator** - determine **your possible moves**
- ◆ **Board evaluator** - evaluate the **desirability of each move**
- ◆ **Mini-max procedure** - determine an efficient way to search through all the possible moves that you can perform

All of these components use or work upon a **game tree**.

- ◆ A game tree stores, and allows the mini-max procedure to manipulate the possible moves that can be made.

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## Move Generator Example



**Note:** Many branches are omitted.

The second level would actually contain  $9 \times 8 = 72$  nodes.

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## Move Generator Tic-Tac-Toe

Creating a complete game tree starting from the empty state board for Tic-Tac-Toe turns out to be more complex than you might first expect:

- ◆ The game tree contains approximately **550,000** nodes.
  - ⇒ Easy for a computer to handle, but not insignificant.

For more complex games, the complete game tree is effectively unmanageable because the number of possible nodes in the game tree is unbelievably large.

- ◆ Therefore, we will not want to construct the entire game tree when making a decision, but rather only construct and **search the most "promising" parts of the game tree.**

**Heuristics** and **pruning** are used to only evaluate the most likely beneficial moves.

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## Board Evaluator

The second component of a game system is the **board evaluator** which is responsible for determining if a given board position or state is advantageous for the player.

- ◆ The board evaluator **determines the good and bad moves**.

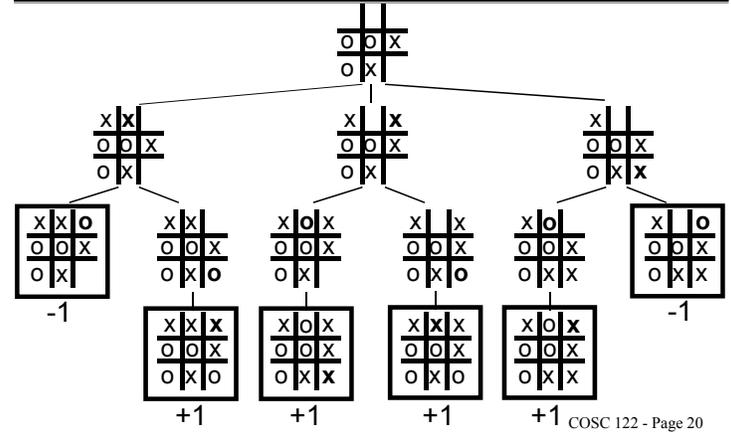
The move generator builds a game tree to get some insight as to **what might happen in future moves**:

- ◆ Future board scenarios are thus known by playing out moves, counter-moves, counter-counter-moves, etc.
- ◆ Future board scenarios are of no use if you have no mechanism to evaluate them.

The board evaluator determines when a sequence of moves (a path in the game tree) is advantageous for the player.

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## Board Evaluator Tic-Tac-Toe Example



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## Why did Deep Blue Win?

Deep Blue ended up winning due to increasing computation power.

- ◆ This **extra power** allowed the computer to **examine more possible moves** in the game tree.

The use of **parallel computers** that have multiple processors and memory allow for complex problems to be solved.

- ◆ The top 500 most powerful computers in the world have **thousands of processors** and are used for simulations of weather, military tests, and earthquakes.

**Is Deep Blue intelligent?**

- ◆ The search algorithm was "intelligent", but does it qualify as what we consider intelligence?

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## Survey Computer Games

**Question:** I have noticed an improvement in the intelligence/interactivity of the computer or computer characters in the games I play.

- A) Yes
- B) No

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## Survey Computer Games and Your Time

**Question:** I have spent more time this semester playing games than working on this course.

- A) Yes
- B) No

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## Survey Social Computer Games

**Question:** I confess to playing social games Zynga (Farmville, MafiaWars, etc.) or other Facebook or online games:

- A) Never – What a waste of time!
- B) Never – I love games but those are **NOT** games!
- C) Once a month or less
- D) Once a week
- E) Daily or many times per day.
- ◆ Help me! I am addicted. I play all the time (**even during class!**)

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## Computer Creativity

Computers can run programs that **automatically generate music, art, and pictures**.

- ◆ The intelligence is still with the software - not the computer.
- ◆ The software is **encoding human intelligence**.

The underlying question is: **Is creativity algorithmic?**

- ◆ If it is, computers may one day be creative.
- ◆ Many things that are creative are algorithmic.
  - ⇒ Mathematics was once considered creative or inspired.

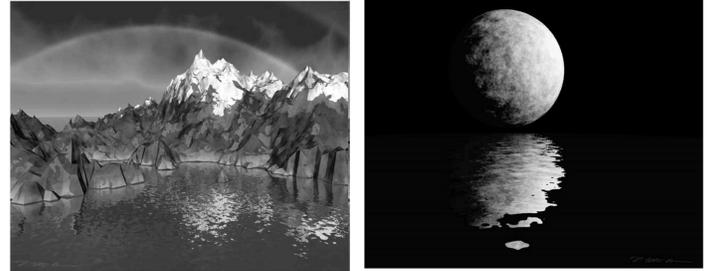
Creativity is sometimes inspiration but is also a lot of revision.

- ◆ Inspiration to create something totally new.
- ◆ Revision is modifying existing to produce something new.  
Algorithmic?
  - ⇒ Many "new" advertising, research, etc. are based on revisions.

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## Computer Generated Art

These pictures are generated from algorithms.



Source: Ken Musgrave - <http://www.kenmusgrave.com>

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## The Universality Principle

In theory, all computers have **the same ability to compute** as they use the same basic functions.

- ◆ This is called the **Universality Principle**.

In practice, differences in computer hardware, software, and operating systems make it **impossible to run all software on all computers and to run it efficiently**.

Examples:

- ◆ programs require processing speed that hardware cannot achieve
- ◆ operating systems support different features
- ◆ processors encode instructions differently in hardware

Six basic instructions: Add, Subtract, Set\_to\_One, Load, Store, and Branch\_On\_Zero.

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## Why are some programs faster than others?

Recall that an **algorithm** is a sequence of steps to solve a problem.

The performance of an algorithm when implemented on a computer depends on the **approach used to solve the problem and the actual steps taken**.

- ◆ Example: algorithms for data sorting have different efficiencies.
  - ⇒ <http://www.sorting-algorithms.com/>
  - ⇒ <http://bl.ocks.org/andrewringler/raw/3809399/>

Although faster hardware makes all algorithms faster, algorithms that solve the same problem can be compared in a **hardware-independent way** using **big-Oh** notation.

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## Algorithms Best and Worst Case

Very few algorithms have the exact same performance every time because **the performance of an algorithm typically depends on the size of the inputs it processes**.

The **best case** performance of the algorithm is the most efficient execution of the algorithm on the **"best" data inputs**.

The **worst case** performance of the algorithm is the least efficient execution of the algorithm on the **"worst" data inputs**.

The **average case** performance of the algorithm is the average efficiency of the algorithm on **the set of all data inputs**.

Best, worst, and average-case analysis typically express **efficiency in terms of the input size of the data**.

- ◆ The input size is often a function of  $n$ .

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## Algorithms Big-Oh Notation

**Big-Oh notation** is a mechanism for quickly **communicating the efficiency of an algorithm**.

- ◆ Big-Oh notation **measures the worst case performance** of the algorithm by **bounding** the formula expressing the efficiency.

In big-Oh notation:

- ◆ The performance is specified as a **function of  $n$  which is the size of the problem**.
  - ⇒ e.g.  $n$  may be the size of an array, or the number of values to compute
- ◆ Only the most significant expression of  $n$  is chosen:
  - ⇒ e.g. If the method performs  $n^3 + n^2 + n$  steps, it is  $O(n^3)$ .
  - ⇒ **Significance ordering:**  $2^n$ ,  $n^5$ ,  $n^4$ ,  $n^3$ ,  $n^2$ ,  $n \cdot \log(n)$ ,  $n$ ,  $\log(n)$
- ◆ Constants are ignored for big-Oh:
  - ⇒ e.g. If the method performs  $5 \cdot n^3 + 4 \cdot n^2$  steps, it is  $O(n^3)$ .

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## Algorithms

### Common Big-Oh Notation Values

There are certain classes of functions with common names:

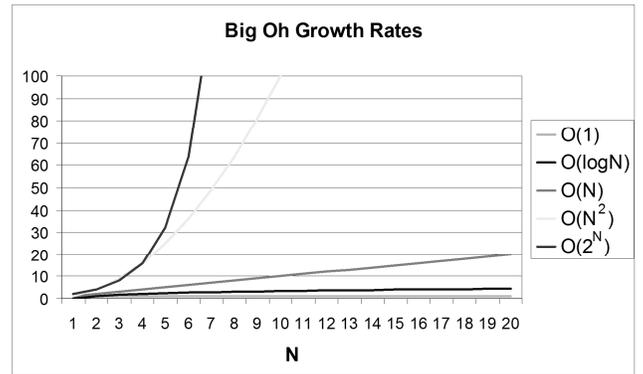
- ◆ constant =  $O(1)$
- ◆ logarithmic =  $O(\log n)$
- ◆ linear =  $O(n)$
- ◆ quadratic =  $O(n^2)$
- ◆ exponential =  $O(2^n)$

These functions are listed in order of fastest to slowest.

- ◆ For example, for large values of  $n$ , an algorithm that is considered  $O(n)$  is faster than an algorithm that is  $O(2^n)$ .
- ◆ Big-Oh notation is useful for specifying the growth rate of the algorithm execution time.
  - ⇒ How much longer does it take the algorithm to run if the input size is doubled?

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## Big Oh Growth Rates



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## Big-Oh Exercise

1) What is the Big-Oh for the following formulas?

- ◆ a)  $4*n^3 + 3*n^2 + 6*n$
- ◆ b)  $n + n*\log(n)$

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## Big Oh Notation

**Question:** What is the big Oh for the following formula:

$$4*n^2 + 3*n^4 + 6*n$$

- A)  $O(n^2)$
- B)  $O(3n^4)$
- C)  $O(n^4)$
- D)  $O(n)$

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## Big-Oh Notation

**Question:** What is the big Oh notation for the formula:

$$4*n^2 + 3*n^4 + 6*n + 5*n*\log(n)$$

- A)  $O(4*n^2)$
- B)  $O(n^4)$
- C)  $O(6*n^4)$
- D)  $O(5*n*\log(n))$
- E)  $O(n*\log(n))$

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## Best/Worst/Average Case

**Question:** Assuming your mark is given between 0 and 100. How many of the three values (best case, worst case, average case) do you know for sure regardless who is in the class?

- A) 0
- B) 1
- C) 2
- D) 3

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## Best/Worst Case Finding a Song

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**Question:** You have 1000 songs on your music player and want a particular song. You "search" for your song by pressing the random button (pick a random song) until your song comes up. How many times do you have to press the random button until you find your song? **Assume that the randomize feature can return the same song more than once.**

- A) best case = 1, worst case = 1000
- B) best case = 1, worst case = 500
- C) best case = 1, worst case = forever

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## How Hard Can a Problem Be?

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There exists problems that no computer can solve efficiently. These problems are called **NP-complete problems** and are considered **intractable**.

- ◆ The only way to solve the problem is to try all possible solutions to find the best.
- ◆ Even the most powerful computers cannot solve large examples of these problems.
- ◆ Example problem: Travelling salesman problem - find best route between  $n$  cities.

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## How Hard Can a Problem Be? (2)

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Even worse, there exist problems that have been proven to be unsolvable regardless of the computer speed.

There exist no algorithms at all for such **unsolvable problems**.

An example is the Halting Problem that has the simple task of asking if a given program will always stop (halt) or will it run forever.

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## Computers in the Future

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The future of IT is bright. There are many technologies being developed that are migrating from the research labs into use.

- ◆ **Software agents** – Can software be your personal butler?
- ◆ **Robots** – When we build robots, what would you want it to do?
- ◆ **Self-healing and adapting** – Can our systems fix themselves?
- ◆ **Wearable computers** – Can we embed computers in clothing and glasses? In our eyes and brains?
- ◆ **Language translation** – Can we have the universal translator?
- ◆ **Personal Life Databases** – Can we record all of our life information and moments (text, images, sound, video)?
  - ⇒ What would that look like? Would you want that?
- ◆ **Automatic driving cars** – Our cars will do the driving (probably better than us). They already know where they are going...

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## Computers in the Future (2)

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Some challenges:

- ◆ **Information overload**
  - ⇒ If we can get data from everywhere at any time, do we get too much?
  - ⇒ Can we trust the data we get?
  - ⇒ How about our privacy and security?
- ◆ **Always-on society**
  - ⇒ Our technology has trained us to be always available for communication.
  - ⇒ Is that good? Are we actually more productive that way? More human?
- ◆ **Pace of innovation**
  - ⇒ Technology has sped up society and business. Everything changes rapidly. Innovation may not always be good.
- ◆ **Essence of Humanity**
  - ⇒ If everything is automated and computerized around us, do we lose the essence of being human?
  - ⇒ Are we ready for the ability to alter human DNA and lifestyles?

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## Conclusion

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Computers do not yet mimic human creativity although they demonstrate "**artificial intelligence**" in many domains.

- ◆ One of these domains is game playing where intelligence is provided by game trees and search strategies.

Computer scientists compare algorithms independently of hardware using **big-Oh notation**.

**NP-complete problems** are problems where no efficient solution exists. **Unsolvable problems** are problems where it is proven no solution at all exists.

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## Objectives

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- ◆ Explain the Turing Test in your own words.
- ◆ Define: artificial intelligence
- ◆ List and briefly explain the three components of game playing using game trees and the mini-max strategy.
- ◆ Define: Universality Principle
- ◆ Be able to convert a formula in  $n$  into big-Oh notation.
- ◆ Compare and contrast: best case, worst case, average case
- ◆ Compare and contrast: NP-complete problem, unsolvable problem