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CSC6023 - Advanced Algorithms

# Approximated Algorithms - Week 8

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# The final week - Week 8



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The last week has arrived. If you worked hard, this is a happy moment. Now, we will see approximated algorithms, and the Final Exam is upon us. The course is (almost) over.

# Agenda Week 8 Presentation



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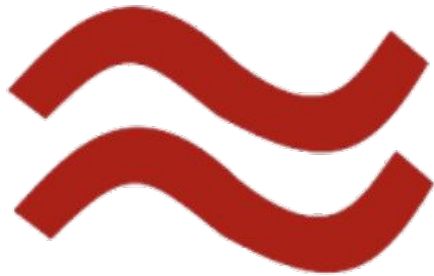
## Approximated Algorithms

- When to settle with an approximation
  - a. The alternative to brute force - to reduce cost
    - i. The travelling salesperson problem
  - b. The Real ( $\mathbb{R}$ ) world - coping with infinite
    - i. Linear equation systems
  - c. Artificial Intelligence
    - i. Machine learning
    - ii. Automatic players
- Heuristics and Prune

## Course Wrap-up

- The final exam
- The final grades
- The next steps in the Masters in CS

# When to settle with an approximation

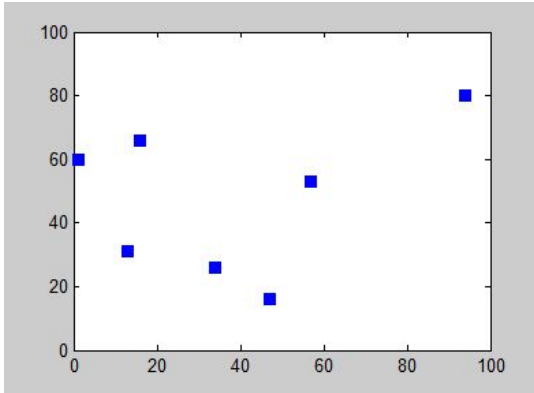


## Why not going for the optimal solution?

- The optimal solution may be:
  - too costly
    - Only an extremely costly brute force delivers the optimal solution
  - impossible to find
    - Theoretical infinite cannot be achieved in a finite machine
  - impossible to be recognized
    - The optimal solution is unknown
  - not really necessary
    - The problem does not require precision
- In any of such cases we may settle with an approximated algorithm

## Approximated Algorithms

### Too costly



[Wikipedia source](#)



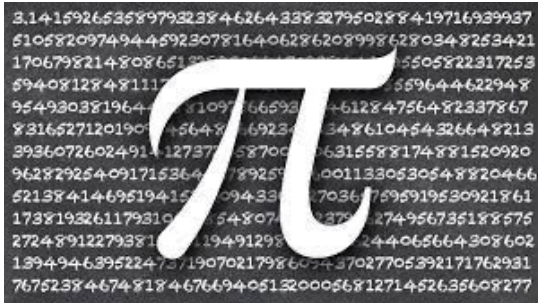
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### The traveling salesperson problem

- Imagine a salesperson going physically to a series of  $n$  cities. What is the sequence of cities to visit to have the smallest path to cover
  - The brute force solution has  $O(n!)$  complexity, any  $n$  above 20 is impractical
  - The cutting edge exact solution using Dynamic Programming has  $O(n^2 2^n)$
  - For  $n$  in the range of thousands it is impractical to solve by a single machine in less than one day
- Heuristic solutions provide near optimal solution with much smaller cost
  - For example a Greedy algorithm (Nearest Neighbor) delivers solutions on average 25% larger than optimal with  $O(n^2)$

## Approximated Algorithms

# Impossible to find



[Wikipedia source](#)



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## Only approximated value of $\pi$ can be found!

- Since the very ancient times the value of  $\pi$  has been an important bit of knowledge in engineering endeavors (mostly building, but other applications too)
  - In 1706 William Jones, a Welsh mathematician first used the Greek letter  $\pi$  to refer to the ratio of a circle's circumference to its diameter
  - In 1761 Johann Heinrich Lambert, a French-Swiss mathematician proved  $\pi$  irrational
- What is the exact value of  $\pi$ ?
  - Until 1946  $\pi$  digits were computed by hand (they knew only 620 digits)
  - Since 1949 programs have computed new digits
    - In March 2022 the first 100 trillion digits were computed (it took 158 days)

# "Impossible" to find

$$\begin{cases} x + 3y - 2z = 5 \\ 3x + 5y + 6z = 7 \\ 2x + 4y + 3z = 8 \end{cases}$$

$$\begin{bmatrix} 1 & 3 & -2 \\ 3 & 5 & 6 \\ 2 & 4 & 3 \end{bmatrix} \begin{bmatrix} x \\ y \\ z \end{bmatrix} = \begin{bmatrix} 5 \\ 7 \\ 8 \end{bmatrix}$$

[Wikipedia source](#)



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## Solution of linear equation systems

- Given a linear equation system with  $n$  variables and  $n$  equations
  - The problem can be expressed as:
    - **$Ax = b$**
  - There are exact algorithms, for example Gaussian Elimination, with  **$O(n^3)$**  complexity
    - In a system with  **$n = 100$**  it is OK, but some industrial applications and mathematical models can easily go beyond millions of variables
  - For such systems approximative algorithms can be possible and a lot faster

## Approximated Algorithms

# Impossible to recognize



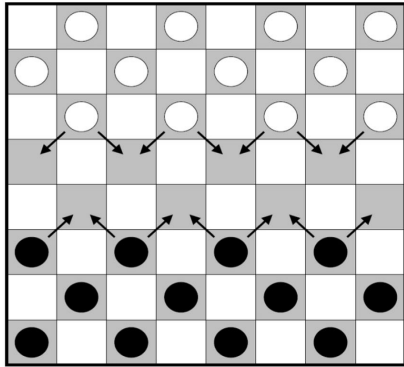
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## Artificial Intelligence - Machine Learning

- Machine learning techniques always deliver approximated solution, as the model to be learned can never be tested on all possible situations
  - The idea behind machine learning is to recognize patterns capable of identifying new inputs, which can, like any input, be of an unpredictable nature
    - The possible inputs are by definition infinite
- Either on classification, aggregation, or regression the result of machine learning is always a best effort solution



# Not really necessary



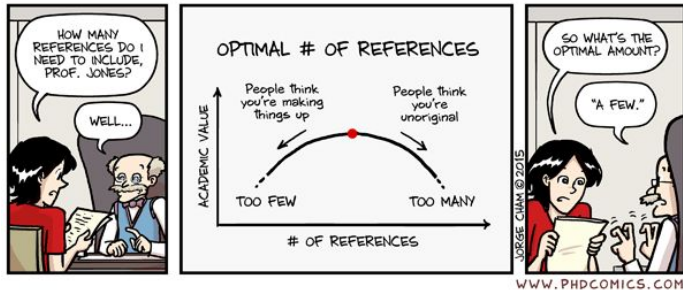
## Artificial Intelligence - Automatic Players

- Imagine a mobile device game designed to entertain the user with an adversarial game, for example, checkers (see [references](#))
  - A brute force solution should analyze all possible decisions and somehow weigh all possible responses of the adversary - this may represent a too high cost in time
  - An alternative is to prune the tree of possibilities, which leads to an approximation (and possibly a worse automatic player)
    - Checkers is actually a solved game (just like tic-tac-toe), but to play it perfectly it requires computation
- A mobile implementation doesn't need to be optimal and so can reduce battery consumption



## Approximated Algorithms

# Heuristics and Prune



## Heuristics

- An heuristic is a way to solve a problem with an approach that may or not work optimally
  - Out of CS it may also mean a non rational solution, not for CS...
  - Frequently, “heuristic algorithms” is used as a synonym for randomized algorithms
- Heuristics can introduce bias

## Prune

- Often the search for a solution follows a tree or graph’s recursive search structure; in such algorithms it is common to provide approximation by stopping the recursive search before going too deep
  - This is called pruning (cutting off the branches of a tree)



## Course Wrap-Up

# Final Exam



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### The rules and recommendations

- This Tuesday, at 9 PM EST the exam will be available on Canvas;
- The exam is to be taken online within 4 hours counting as you started;
- The exam has to be submitted no later than this Saturday 11:59 PM EST;
- The format for the submission is a single pdf file that may include typed textual file, print screens, photos of handwritten answers, etc.;
- The exam has 8 questions, one related to each topic, try not to spend more than 30 minutes to each question;
- The exam is open book, open notes, but you should not search information on the Internet.

## Course Wrap-Up

# Final Grades



### The final grades

- All grades, but the exam, should be available by Friday;
- The exam should be graded no later than next Monday;
- The final grades should be available no later than next Monday.

Activity	Percentage
Projects (7)	35%
Quizzes (7)	21%
Worksheets (7)	21%
Discussions (7)	7%
Final Exam	20%



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## Course Wrap-Up

# Next Steps

### MS in Computer Science



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## The Program

- After CSC 6023, you have concluded the backbone of the program
  - You are a programmer, now!
- If you haven't, you need to take DSA 5300 - Data Governance and Privacy or CSC 6033 Languages, Automata and Decidability
- Other than that, now you have the advanced courses to take:
  - CSC 6301 - Software Design & Documentation
  - CSC 6302 - Database Principles
  - CSC 6303 - Systems & Languages Survey
  - CSC 6304 - Advanced Programming Concepts

That's all for this course folks!

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## **This week's task**

- The Exam, good luck!

## **Next term**

- Next course

**It was a privilege to be  
your instructor in this  
course**



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**Have a Great Next  
Term!**