

DIT PhD Introduction to Computational Thinking and Programming

Lesson 1. Computational Thinking

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L'idonietà

This activity includes two modules: Programming and Statistics

You will submit your solution to a couple of problems/exercises from each module

Details at due time

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You and your instructor

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Quick Introduction

Who are you?

A. Barrón-Cedeño



- BEng in Computing at UNAM, Mexico MSc in Computing at UNAM, Mexico
 - Internship at UdeM, Canada

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- 3. Post-doc at UPC, Spain
 - Internship at BUW, Germany
- 4. Scientist at QCRI, Qatar
- 5. Professor at UniBO, Italy

4th year (about to graduate)

Arianna Muti

Hidden in Plain Sight: Detecting Misogyny beneath Ambiguities and Implicit Bias in Language

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4th year (about to graduate)

Arianna Muti

Hidden in Plain Sight: Detecting Misogyny beneath Ambiguities and Implicit Bias in Language

- Internship at Expert.ai (Modena, Italy)
- Internship at U. of Groningen (Groningen, The Netherlands)
- 10+ peer-reviewed full papers published (one upcoming at EMNLP)
- Transitioning towards a PostDoc at Bocconi University

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Katerina Korre

A Universal and Cross-language Approach to Internet Hate Speech Detection and Analysis

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A Universal and Cross-language Approach to Internet Hate Speech Detection and Analysis

- Internship at Symanto.ai (Valencia, Spain)
- 8+ peer-reviewed full papers published (two under review in journals)
- Transitioning towards a PostDoc at Athens University

2nd year

Paolo Gajo

NLP Technologies for Gastronomy

2nd year

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- Internship at Dalhousie University (Halifax, Canada)
- 4+ peer-reviewed full papers published (two during his masters)

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Unfinished

Francesco Fernicola

Return to the Source: Assessing Machine Translation Suitability

2nd year

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- Internship at Dalhousie University (Halifax, Canada)
- 4+ peer-reviewed full papers published (two during his masters)

Unfinished

Francesco Fernicola

Return to the Source: Assessing Machine Translation Suitability

- In co-supervision with EURAC Research (Bolzano, Italy)
- 5+ peer-reviewed full papers published (two during his masters)
- Currently Computational Linguist at the European Parliament

Recent and ongoing research projects¹

 UpSkills on upgrading the (technological) skills of language students https://upskillsproject.eu

Recent and ongoing research projects¹

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- !Translate on augmenting machine translation with explanations https://site.unibo.it/no-translate

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- UNITE on exploiting LLMs for language learning http://site.unibo.it/unite
- !Translate on augmenting machine translation with explanations https://site.unibo.it/no-translate
- Gastrowiki on producing and fixing definitions https://site.unibo.it/gastrowiki

Computing Power²

4 NVIDIA RTX 6000 Ada

https://www.nvidia.com/en-us/design-visualization/rtx-6000

• 2 NVIDIA Quadro P4000

https://www.techpowerup.com/gpu-specs/quadro-p4000.c2930



Lesson coordinates

Slides and code available at:

https://albarron.github.io/teaching/phd-comp-thinking/

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Tools

Python 3 programming language

We will use Google's Colab: https://colab.research.google.com

For (more) serious affairs, you could consider

- 1. Command line or
- 2. Integrated development environment; e.g., Pycharm³, Eclipse⁴ or local Jupyter⁵

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A. Barrón-Cedeño

³https://www.jetbrains.com/pycharm/

⁴https://www.eclipse.org/

 $^{^5}$ https://jupyter.org/

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Lesson contents

Introduction to computational thinking

- 1. Problem definition and solving
- 2. Decomposition
- 3. Pattern recognition
- 4. Abstraction
- 5. Algorithmic thinking

Lesson contents

Introduction to computational thinking

- 1. Problem definition and solving
- 2. Decomposition
- 3. Pattern recognition
- 4. Abstraction
- 5. Algorithmic thinking

Programming

- 6. Introduction to programming
- 7. Jupyter notebooks
- 8. Basic operations
- 9. Dealing with text

Computational Thinking

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The tools we use have a profound and devious influence on our thinking habits, and therefore on our thinking abilities.

Edsger W. Dijkstra⁶

Computational Thinking

"[Computational Thinking] represents a universally applicable attitude and skill set everyone, not just computer scientists, would be eager to learn and use"

Jeannette M. Wing, CMU (2006)

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Computational methods and models give us the *courage* to solve problems and design systems

Computational methods and models give us the *courage* to solve problems and design systems

Computational thinking confronts the riddle of machine intelligence:

- What can humans do better than computers?
- What can computers do better than humans?

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Some examples of each?

Computational methods and models give us the *courage* to solve problems and design systems

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Some examples of each?

What is computable?

A few definitions



https://en.wiktionary.org/wiki/problem https://en.wikipedia.org/wiki/System

https://en.wikipedia.org/wiki/Computability

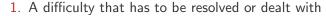
Problem

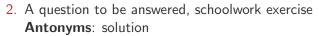
- 1. A difficulty that has to be resolved or dealt with
- 2. A question to be answered, schoolwork exercise



https://en.wiktionary.org/wiki/problem https://en.wikipedia.org/wiki/System

Problem







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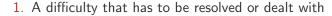
2. A question to be answered, schoolwork exercise **Antonyms**: solution

System

1. A group of interacting or interrelated elements that act according to a set of rules to form a unified whole

https://en.wiktionary.org/wiki/problem https://en.wikipedia.org/wiki/System





2. A question to be answered, schoolwork exercise **Antonyms**: solution

System

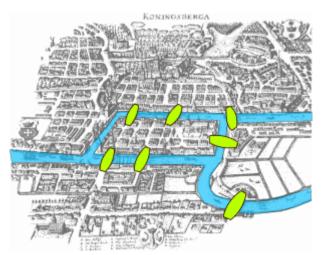
1. A group of interacting or interrelated elements that act according to a set of rules to form a unified whole

Computability

1. The ability to solve a problem in an effective manner

https://en.wiktionary.org/wiki/problem https://en.wikipedia.org/wiki/System

Task: Devise a path through the city of Königsberg that would cross each of the bridges once and only once



Looking for a solution

Looking for a solution



Looking for a solution



Can you devise a solution using this abstraction?

Looking for a solution



Can you devise a solution using this abstraction?

Solution: There is no solution

Looking for a solution



Can you devise a solution using this abstraction?

Solution: There is no solution

The foundations of graph theory Leonhard Euler (1736)



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• Defining problems

- Defining problems
- Solving problems

- Defining problems
- Solving problems
- Designing systems

- Defining problems
- Solving problems
- Designing systems
- Understanding human behavior

All by drawing on the concepts fundamental to computer science

- Defining problems
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All by drawing on the concepts fundamental to computer science

• How difficult is it to solve?

- Defining problems
- Solving problems
- Designing systems
- Understanding human behavior

All by drawing on the concepts fundamental to computer science

- How difficult is it to solve?
- What's the best [doable|acceptable|affordable] way to solve it?

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- Solving problems
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All by drawing on the concepts fundamental to computer science

- How difficult is it to solve?
- What's the best [doable|acceptable|affordable] way to solve it?
- An approximate solution is good enough?

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- False positives or false negatives are allowed?

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All by drawing on the concepts fundamental to computer science

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predicted label positive negative

true positive label negative

true positive false positive false negative true negative

[By] reformulating a seemingly difficult problem into one we know how to solve, perhaps by reduction, embedding, transformation, or simulation

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[...] using abstraction and decomposition when attacking a large complex task or designing a large complex system

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Have you solved a problem using any of these techniques?

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Copying a drawing?

https://www.wikihow.com/Copy-a-Drawing-or-Picture-by-Hand

Thinking in terms of \dots

Prevention

Thinking in terms of ...

 Prevention Do you backup your mobile phone?

Thinking in terms of . . .

- Prevention
 Do you backup your mobile phone?
 There are two kinds of people
 - 1. those who backup
 - 2. those who have never lost all their data [mobile phone]

Thinking in terms of . . .

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Getting ready to recover from worst-case scenarios through

redundancy

ightarrow If I keep money in my backpack, I can go home even if I loose my wallet

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Getting ready to recover from worst-case scenarios through

redundancy \rightarrow If I keep money in my backpack, I can go home even if I loose my wallet damage containment \rightarrow If I have an exam, I will take an earlier train than usual

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 Do you backup your mobile phone?
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Getting ready to recover from worst-case scenarios through

redundancy \rightarrow If I keep money in my backpack, I can go home even if I loose my wallet damage containment \rightarrow If I have an exam, I will take an earlier train than usual error correction \rightarrow Before handling my report, I will pass

How do you

- Buy the best possible item on Amazon?
- Find the best match on Tinder?
- Spot the most entertaining tiktok?

2024

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- Buy the best possible item on Amazon?
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How do you win at UNO?

How do you

- Buy the best possible item on Amazon?
- Find the best match on Tinder?
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How do you win at UNO?

How do you win at dominoes?

Computational thinking is search, search, and more search

How do you

- Buy the best possible item on Amazon?
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How do you win at UNO?

How do you win at dominoes?

How do you win at chess?



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How do you

- Buy the best possible item on Amazon?
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How do you win at UNO?

How do *standard computers* win at chess?

How do you win at dominoes?

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Computational thinking is search, search, and more search

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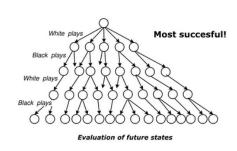
How do you win at UNO?

How do you win at dominoes?

How do you win at chess?



How do *standard computers* win at chess?



Characteristics

Conceptualising, not programming

- Computer science is not computer programming
- Beyond (\sim beside) being able to program a computer
- Thinking at multiple levels of abstraction

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Fundamental skill

A skill every human being must know to function in modern society

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- A way humans solve problems
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 Computers are dull and boring

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Computational Thinking: The three As

An iterative process based on three stages:

Abstraction (Problem Formulation). One attempts to conceptualize a problem verbally, e.g., by trying to formulate a question such as "How does gravity work?," or through visual thinking, e.g., by drawing a diagram identifying objects and relationships

(Repenning et al., 2016)

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Automation (Solution Expression). It is expressed in a non-ambiguous way so that the computer can carry it out; e.g., through computer programming (or through prompting?)

Analysis (Execution & Evaluation). The solution gets executed (by the computer) in ways that show the direct consequences of one's own thinking. Visualisations could support the evaluation of solutions

(Repenning et al., 2016)

Algorithm

An algorithm is...

Definition 1 A finite sequence of well-defined (computer-implementable) instructions, typically to solve a class of problems or to perform a computation

https://en.wikipedia.org/wiki/Algorithm

Algorithm

An algorithm is...

Definition 1 A finite sequence of well-defined (computer-implementable) instructions, typically to solve a class of problems or to perform a computation

https://en.wikipedia.org/wiki/Algorithm

Definition 2 An explicit, precise, unambiguous, mechanically-executable sequence of elementary instructions, usually intended to accomplish a specific purpose.

Erickson (2019, p. 1)

Activity 2: The panino⁷

Problem: Write the algorithm to prepare a panino

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⁷Since recipes are *just* algorithms

My algorithm to prepare a panino⁸

My algorithm to prepare a *panino*⁸ **Ingredients**:

bread • prosciutto crudo • pecorino di Pienza • carciofini sott'olio

My algorithm to prepare a *panino*⁸ **Ingredients**:

bread • prosciutto crudo • pecorino di Pienza • carciofini sott'olio

1. Cut the bread into two halves horizontally

My algorithm to prepare a panino⁸

Ingredients:

bread • prosciutto crudo • pecorino di Pienza • carciofini sott'olio

- 1. Cut the bread into two halves horizontally
- 2. Add three slices of prosciutto on top of the bottom half
 - * get sure not to go beyond the border of the bread

My algorithm to prepare a panino⁸ Ingredients:

bread • prosciutto crudo • pecorino di Pienza • carciofini sott'olio

- 1. Cut the bread into two halves horizontally
- Add three slices of *prosciutto* on top of the bottom half
 * get sure not to go beyond the border of the bread
- 3. Evenly distribute some slices of pecorino

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Ingredients:

bread • prosciutto crudo • pecorino di Pienza • carciofini sott'olio

- 1. Cut the bread into two halves horizontally
- 2. Add three slices of prosciutto on top of the bottom half
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- 2. Add three slices of *prosciutto* on top of the bottom half
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 - * get sure not to get too much oil
- 5. Put the top half of bread on top

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- 4. Add 3 pieces of carciofini
 - * get sure not to get too much oil
- 5. Put the top half of bread on top
- 6. Enjoy

Possible issues in your/my recipes⁹

Under-specification?

Possible issues in your/my recipes⁹

- Under-specification?
- Lack of identification of the input?

Possible issues in your/my recipes⁹

- Under-specification?
- Lack of identification of the input?
- Imprecise identification of the problem?

The 4 components of an algorithm

What: A precise specification of the problem that the algorithm solves

From (Erickson, 2019, p. 11)

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¹⁰Not covered in this lesson

¹¹idem

¹²For instance, yourself 6 months ago

The 4 components of an algorithm

What: A precise specification of the problem that the algorithm solves

How: A precise description of the algorithm itself

From (Erickson, 2019, p. 11)

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¹⁰Not covered in this lesson

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The 4 components of an algorithm

What: A precise specification of the problem that the algorithm solves

How: A precise description of the algorithm itself

Why: A proof that the algorithm solves the problem it is supposed to solve¹⁰

From (Erickson, 2019, p. 11)

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The 4 components of an algorithm

What: A precise specification of the problem that the algorithm solves

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How fast: An analysis of the running time of the algorithm¹¹

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No particular development order

From (Erickson, 2019, p. 11)

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The 4 components of an algorithm

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- No particular development order
- Write for an audience; this is not intended for yourself

From (Erickson, 2019, p. 11)

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The 4 components of an algorithm

What: A precise specification of the problem that the algorithm solves

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Why: A proof that the algorithm solves the problem it is supposed to solve¹⁰

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- No particular development order
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- Write for people who is not as clever as you are 12

From (Erickson, 2019, p. 11)

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Natural vs Programming languages

Natural languages

- An ordinary language (e.g., Italian)
- Written or oral
- It has evolved naturally in humans, usually without specific and deliberate planning¹³
- Problem: ambiguity
 (e.g., "visiting relatives can be annoying")

Natural vs Programming languages

Natural languages

- An ordinary language (e.g., Italian)
- Written or oral
- It has evolved naturally in humans, usually without specific and deliberate planning¹³
- Problem: ambiguity
 (e.g., "visiting relatives can be annoying")

Programming languages

- Formal-born languages
- Specific syntactic rules that avoid ambiguous statements
- Sentences convey one single meaning
- They can have a significant degree of abstraction

Programming language

A formal language comprising a set of instructions that produce various kinds of output [given an input]¹⁴

¹⁴ https://en.wikipedia.org/wiki/Programming_language

Programming language

A formal language comprising a set of instructions that produce various kinds of output [given an input]¹⁴



Diagram from L. Moroney's Introduction to TensorFlow for Artificial Intelligence, Machine Learning, and Deep Learning

References I

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