# DS4LAW

Workshop 1: Algorithms (foundations)

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#### A little about me

- Born and bred in South Africa
- Trained as a Computer Scientist
- BSc & MSc in Pretoria
- PhD in Manchester
- Industry creating algorithms (mobile applications)
- 1st Postdoc in Maastricht



"In theory, there is no difference between theory and practice, in practice, there is." - Jan L. A. Van De Snepscheut (Caltech)

#### A little about you?

- Brief introduction (name & affiliation)
- What is your interest: DS4LAW or LAW4DS?
- Experience with algorithms
- What you hope to gain from the session

#### **Aims**

- Basic literacy of algorithms in the context of Computer Science
- LAW4DS:
  - Understanding mechanisms of algorithms can aid formulation of good questions about their regulation
  - Intuition for distinguishing between true & apparent algorithmic intelligence
- DS4LAW:
  - Theoretical foundations of algorithms & role in computer science
  - Basic practical experience with creating & implementing algorithms

#### Roadmap

#### Mostly talking

- Part 1A: Algorithms are all around us...but what exactly are they?
- Part 1B: Algorithms in Computer Science
- Part 2: Real examples of algorithms
- Part 3: Ethical significance of algorithms

#### Mostly doing

- Python programming in Jupyter notebooks
- Write and test some algorithms!

#### Part 1A

Algorithms are all around us...but what are they?

#### Definition for Algorithm

"a set of rules that must be followed when solving a particular problem."

- Oxford Learner's Dictionary

"A set of specific, step-by-step instructions for taking an <u>input</u> and converting [it] into an <u>output</u>."

- John Danaher, The Philosophical Importance of Algorithms, 2015.

In short: "a set of <u>step-by-step instructions</u> for <u>executing</u> a task."

#### Examples

#### Making a peanut butter & jelly sandwich

- 1. Get a piece of bread
- 2. Spread peanut butter on it
- 3. Get another piece of bread
- 4. Spread jelly on it
- 5. Put the two pieces of bread together

Who is issuing the instructions? Who is executing the instructions?

What are the inputs & outputs of the algorithm?



#### Examples

Shampooing hair

**Anything strange about this algorithm?** 

Who is issuing the instructions? Who is executing the instructions?

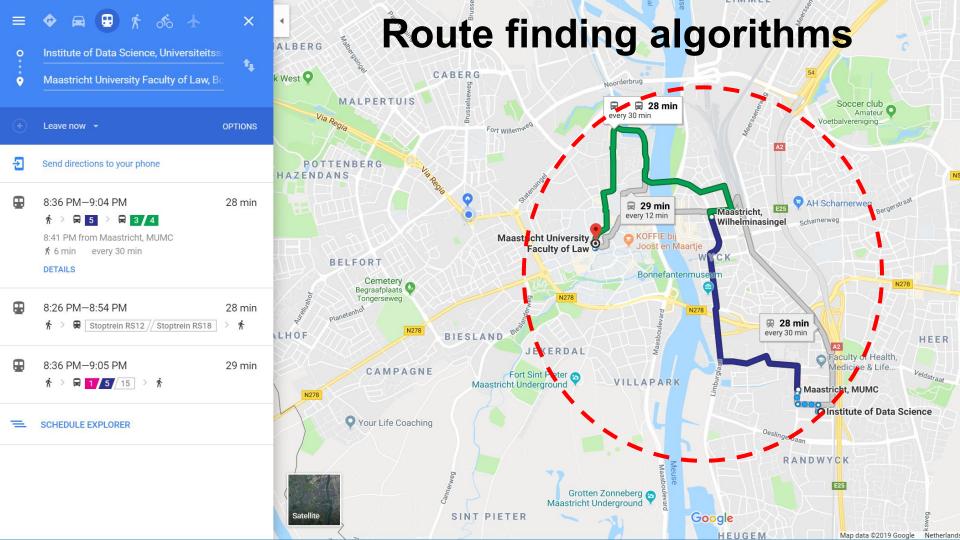
What are the inputs & outputs of the algorithm?



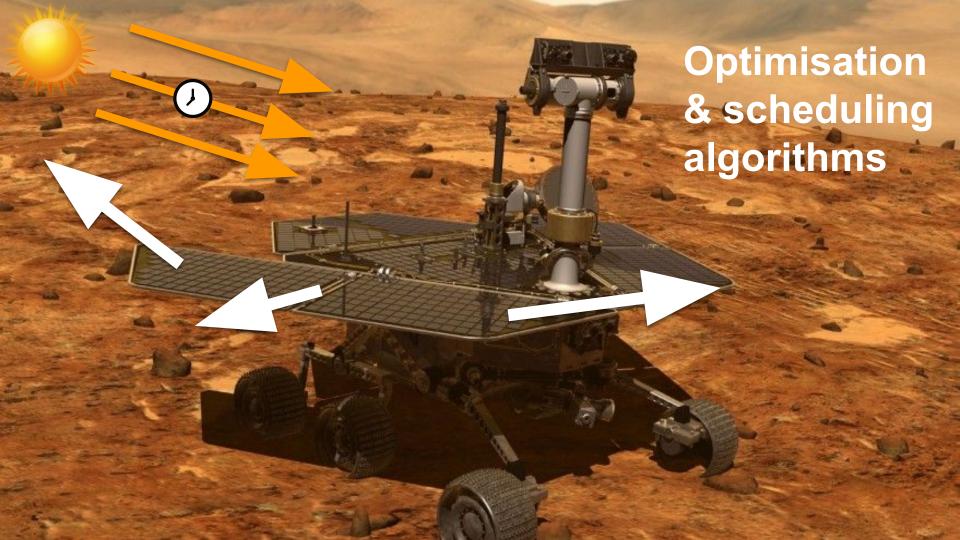
# Part 1B

Algorithms in Computer Science









# Contract review using Machine Learning algorithms



Upload Document

Noorybe



No-Competition. The Participant hereby agrees that he not compete with the business of the Company, or its successors of during the term of this Agreement and for 24 months follotermination or expiration. The term "not compete" as used in this A means that Participant shall not directly or indirectly, as an owner director, employee, consultant, or stockholder, engage in a substantially similar or competitive to the business of the Company

- 6. Neither party shall disclose the existence or terms of this Agreem the name, trademark, service mark or logo of the other part publicity, advertising or information, which is disseminated to person or to the general public without the other party's prio approval which shall not be unreasonably withheld.
  - 7. Each party agrees that the Confidential Information is remain the sole property of the disclosing party. Nothing in this A shall be construed to require the parties to enter into an Arrangen grant either party any right, interest, or license in or under an trademark, copyright, trade secret or other proprietary right or owned by or licensed to the other party, whether or not it is particularly information.
  - Neither party shall reverse engineer, decompile, dis chemically analyze, modify or create derivative works based Confidential Information provided hereunder in tangible form, without limitation, any product, sample, prototype, electroni composition or equipment.
- Each party represents that it believes that it owns the Co Information it is disclosing and has the right to make such dis-



Non-Solicitation/Compete

#### For your attention

This is a non-common clause and appears only in less than 25% of NDAs.

This clause may include a limitation on a party's ability to solicit employees from the other party or to compete with the business of the other party.

#### What does this clause mean? This clause may include a

limitation on a party's ability to solicit employees from the other party or to compete with the business of the other party. Because NDAs are typically signed at an early stage in the relationship and are often followed by a more comprehensive commercial

type of limitation.

agreement, the parties to the

NDA typically do not include this

#### Unfair clause detection using Machine Learning

#### CLAUDETTE

#### An Automated Detector of Potentially Unfair Clauses

Claudette found 2 potentially unfair clauses (displayed in **bold**) out of 16 sentences. By hovering your cursor over each unfair sentence, you can see the most likely unfairness category.

[...]

Spotify may change the price for the Paid Subscriptions, including recurring subscription fees, the Pre-Paid Period (for periods not yet paid), or Codes, from time to time and will communicate any price changes to you in advance and, if

Contract by Using unfair clause

Subject to applicable law, you accept the new price by continuing to use the Spotify Service after the price change takes effect.

[...]

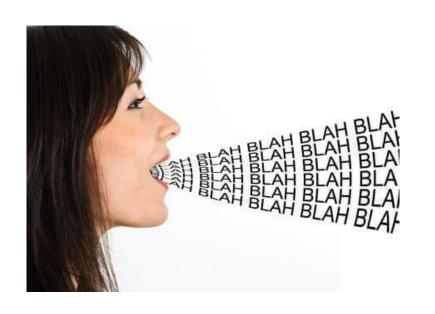
Share link

Save results

Try Again Contact

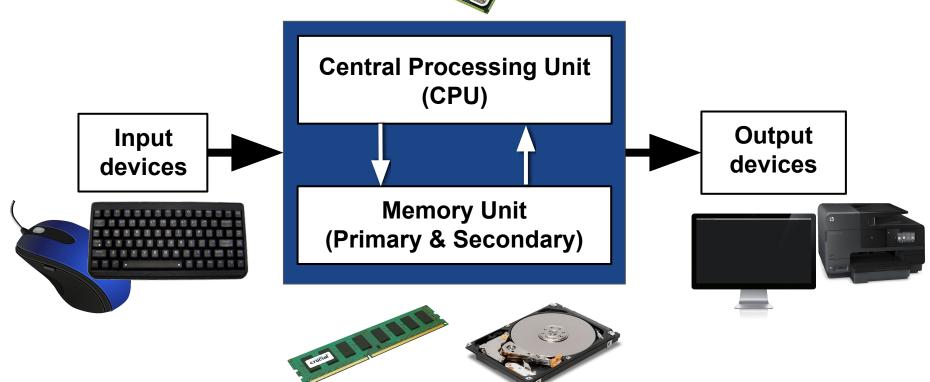
### Algorithms in Computer Science

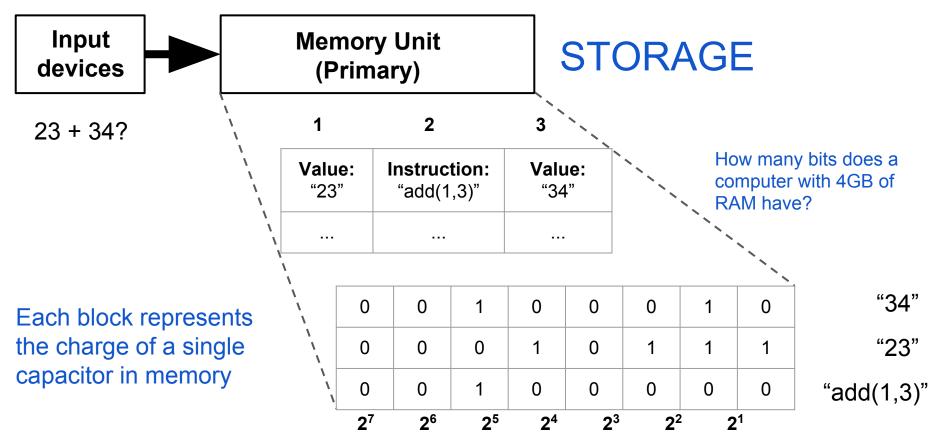
Who is issuing the instructions? **Humans**Who is executing the instructions? **Computers** 

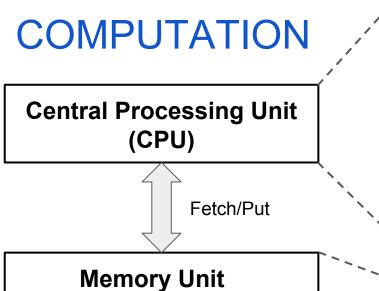












- 1. Fetch instruction from memory location 2
- Execute instruction:
  - a. Load the first number into the CPU
  - b. Add the second number to this number
- 3. Store the sum in memory location 4

 $0\ 0\ 1\ 0\ 0^1\ 0^1\ 0$ 

+ 00010111

00111001

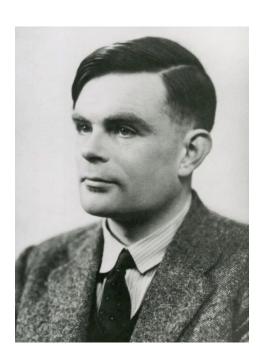
Memory Unit (Primary)

1 2 3

<b>Value:</b> "23"	Instruction:	<b>Value:</b>	Value:
	"add(1,3)"	"34"	"57"
•••	•••		

# Modern computers using Turing's model of computation

- Described by a <u>Turing machine</u>
- Any algorithm that you can conceive of and execute as a human being, can be represented as a set of operations in a Turing machine.



### Example (square root)

What is the square root of a given number?

Put input number here		

**(3)** 

**(4)** 

(5)

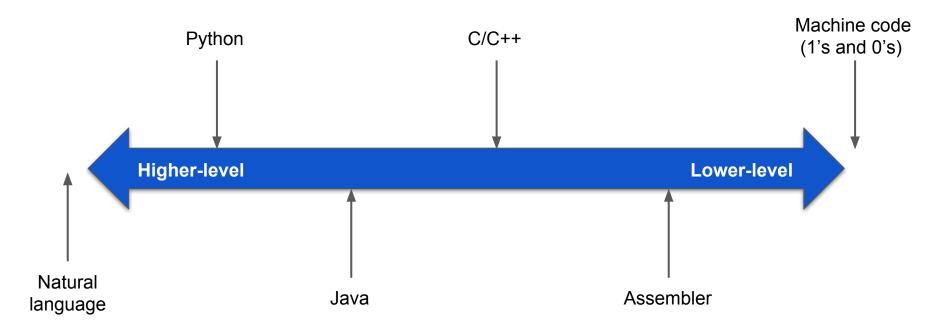
**(2)** 

**(1)** 

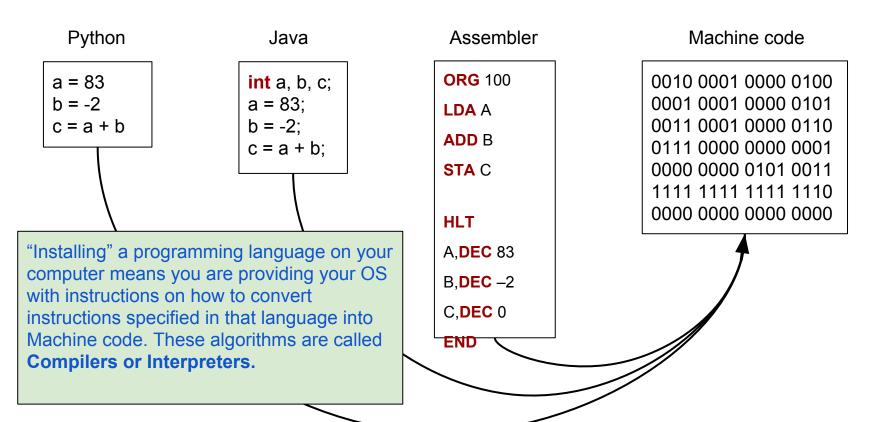
#### Try it out with "9"!

- 1. Write 0 in box (2)
- 2. Increment (2)
- 3. Write 0 in box (3)
- 4. Copy number in (2) to box (4)
- 5. If box (4) contains 0, go to step 12.
- 6. Decrement (4)
- 7. Copy number in (2) to box (5)
- 8. If box (5) contains 0, go to step 5.
- 9. Decrement (5)
- 10. Increment (3)
- 11. Go to step 8.
- 12. If number in (3) not greater than number in (1), go to step 2.
- 13. Decrement (2)

# Programming languages



#### Programming languages



# Part 2

Real examples of algorithms

# Find the largest number in a list

Judge name	Number of cases	
llešič	266	
Jann	280	
Schockweiler	251	
Moitinho de Almeida	272	
Toader	263	
Rosas	284	
Silva de Lapuerta	252	
Gulmann	255	

### Find the largest number in a list

Number of cases	
266	
280	
251	
272	
263	
284	
252	
255	

- Input: ?
- Output: ?
- Instructions: ?

#### Find the largest number in a list

Number of cases	
266	
280	
251	
272	
263	
284	
252	
255	

- Input: list of numbers e.g.
  266,280,251,272,263,284,252,255
- Output: largest number in the list e.g. 284
- Outline of algorithm:
  - Assume the first number in the list is the largest
  - Consider each number in the list one-by-one from top to bottom
  - While we do this, if the current number being looked at is larger than the current largest number, consider this number to be the new largest
  - Stop when we get to the end of the list

#### Sort a list of numbers from smallest to largest

Number of cases	
266	
280	
251	
272	
263	
284	
252	
255	

- Input: ?
- Output: ?
- Instructions: ?

#### Sort a list of numbers from smallest to largest

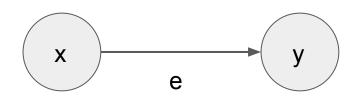
Number of cases	
266	
280	
251	
272	
263	
284	
252	
255	

- Input: list of numbers e.g.
  266,280,251,272,263,284,252,255
- Output: list of numbers sorted ascending order e.g. 251,252,255,263,266,272,280,284
- Outline of algorithm:
  - Create a new empty list
  - Find smallest number in input list and add it to end of the new list
  - Remove number in previous step from input list
  - Repeat Steps 2 and 3 until input list is empty

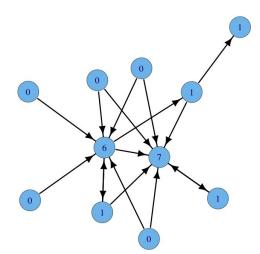


#### **Network Analysis**

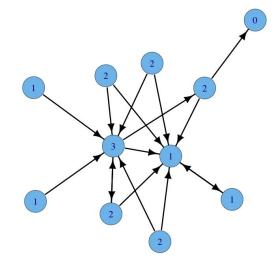
```
int calculate_indegree(graph g, vertex v):
 count = 0
 for each e in g.getAllEdges():
     if e.y == v:
         count++
 return count
```



```
int calculate_outdegree(graph g, vertex v):
 count = 0
 for each e in g.getAllEdges():
     if e.x == v:
         count++
 return count
```



Nodes = court decisions Edges = citations



# Part 3

Ethical significance of algorithms

#### Algorithm transparency

"Algorithms are not arbiters of objective truth and fairness simply because they're math." - **Zoe Quinn** 



- Transparency is a challenge with more complex algorithms (especially with ML)
- Decision-making algorithms (implications for liability)
- Vs. Algorithms used in decision-making
- Dichotomy: what an algorithm actually does and what it is claimed or advertised to do (BEWARE OF HYPE the truth is often far less impressive)

- Bob likes hockey
- Bob has a systolic pressure reading of 150
- His favourite colour is green
- He works for the US Navy
- Bob's father, Daniel, was admitted to hospital in 1999 with a systolic pressure reading of 180
- Daniel also worked for the US Navy
- Anna was chief of cardiology in the general hospital
- Daniels father took medication for hypertension
- Bob's mother, Anna, had a normal systolic pressure reading of 110
- Systolic pressure readings between 100 120 are normal, anything above 120 is considered high
- Having hypertension, and a family history of it, means you are at risk of a heart attack
- If you have high systolic pressure, it means that you have hypertension

Is Bob at risk of a heart attack?

- Bob likes hockey
- Bob has a systolic pressure reading of 150
- His favourite colour is green
- He works for the US Navy
- Bob's father, Daniel, was admitted to hospital in 1999 with a systolic pressure reading of 180
- Daniel also worked for the US Navy
- Anna was chief of cardiology in the general hospital
- Daniels father took medication for hypertension
- Bob's mother, Anna, had a normal systolic pressure reading of 110
- Systolic pressure readings between 100 120 are normal, anything above 120 is considered high
- Having hypertension, and a family history of it, means you are at risk of a heart attack
- If you have high systolic pressure, it means that you have hypertension

Is Bob at risk of a heart attack? YES!

#### **Deduction**

- I saw three swans at the park
- All three were black
- I will go to the zoo tomorrow to see more swans
- What colour will they be?

- I saw three swans at the park
- All three were black
- I will go to the zoo tomorrow to see more swans
- What colour will they be?

Black (probably)

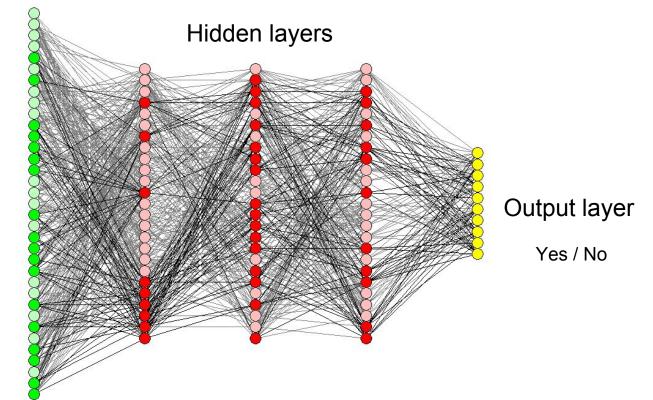
UNCERTAINTY, Lack of complete information

Induction (a form of generalisation)

Will I get cancer?

Input layer

Height, weight, blood sugar levels, blood type, genetic data etc.

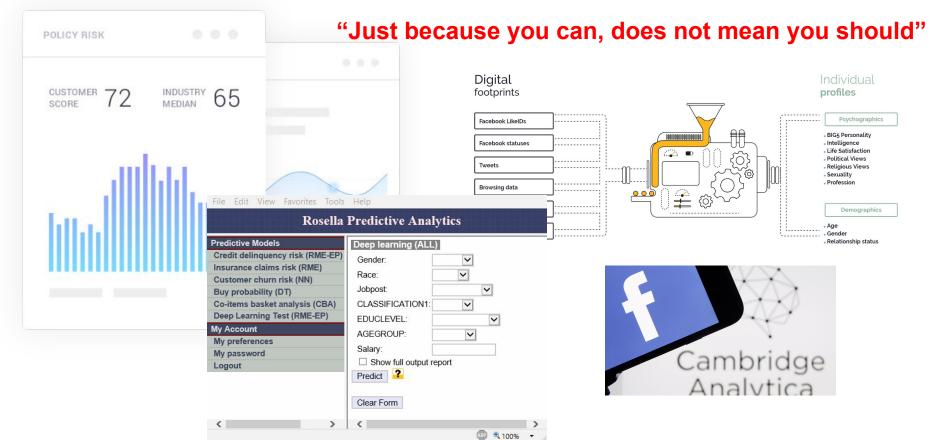




"OK, I WILL DESTROY HUMANS"



#### Ethical application of algorithms



#### Summary

- Algorithms are step-by-step instructions for executing a task
- Issuing algorithmic instructions to computers requires a special language:
  - Computers, on their lowest-level, are only able to manipulate data represented in a binary language (0's and 1's)
  - Humans have created 'high-level' programming languages to help us communicate with computers more concisely
  - Compilers (algorithms for translating instructions from 'high-level' programming languages into computer language) make 'high-level' communication with computers possible
- Algorithms are usually developed in a modular way so they can be reused in other algorithms

#### Summary (cont.)

- Algorithms can be classified according to the problems they try to solve as well as the kinds of procedures used to solve them
- Ethical issues with algorithms are affecting society:
  - Lack of transparency in the algorithm's steps (e.g. Machine Learning)
  - Uncertainty in information doesn't stop attempts to predict (with algorithms)
  - Fundamental questions of whether algorithms (and automation in general) should be applied to solve certain problems (social implications etc.)