Data Science

for the automotive industry





What about you?

Name, Google e-mail and brief description of background.

Groups creation

Course roadmap

1) Data Science (1d)

What

Who

Why

When

How

2) Practical sessions with Python (3d)

Machine Learning

Deep Learning

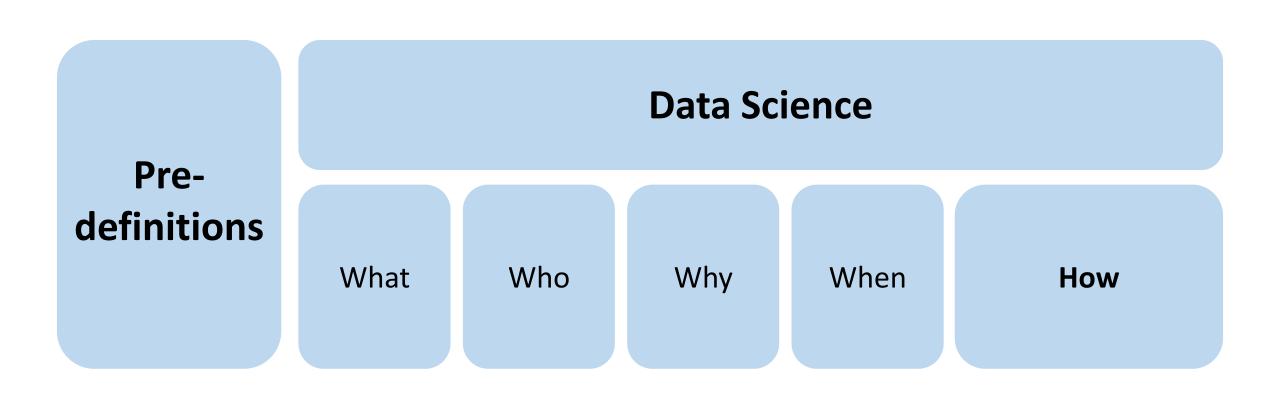
Reinforcement Learning

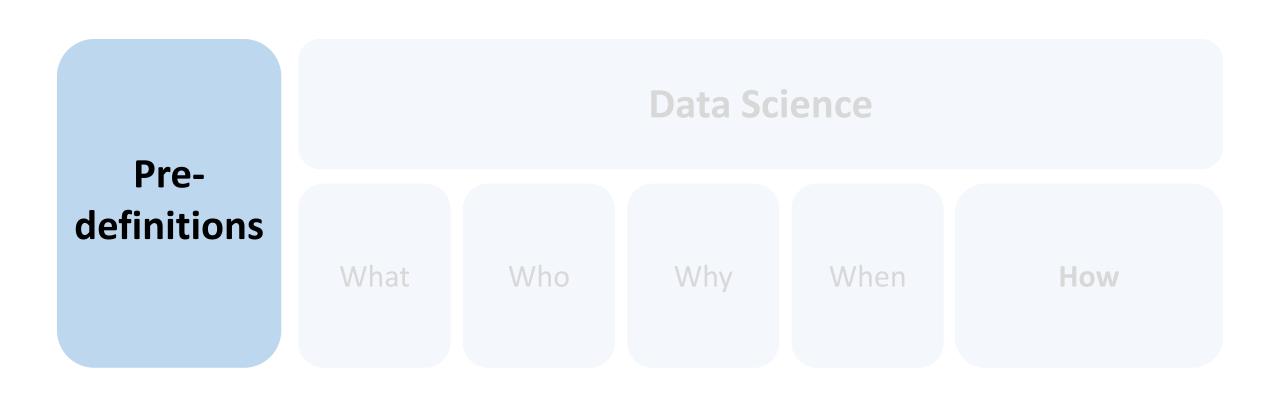
3) Hackhaton Python (1d)

1st day -> Creation of groups

3rd day -> Unveiling the topic

4th-5th -> Hackhaton





Low vs High level

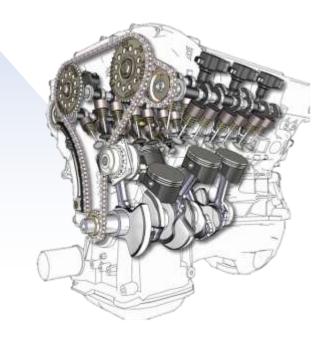
High Level

Petrol Engine

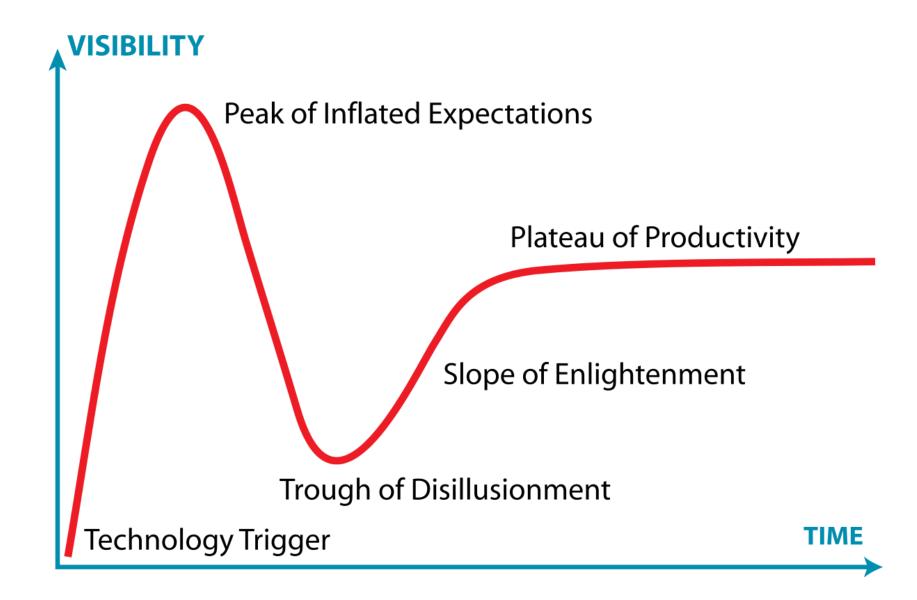


- 1. Intake 2. Compression 3. Power 4. Exhaust

Low Level

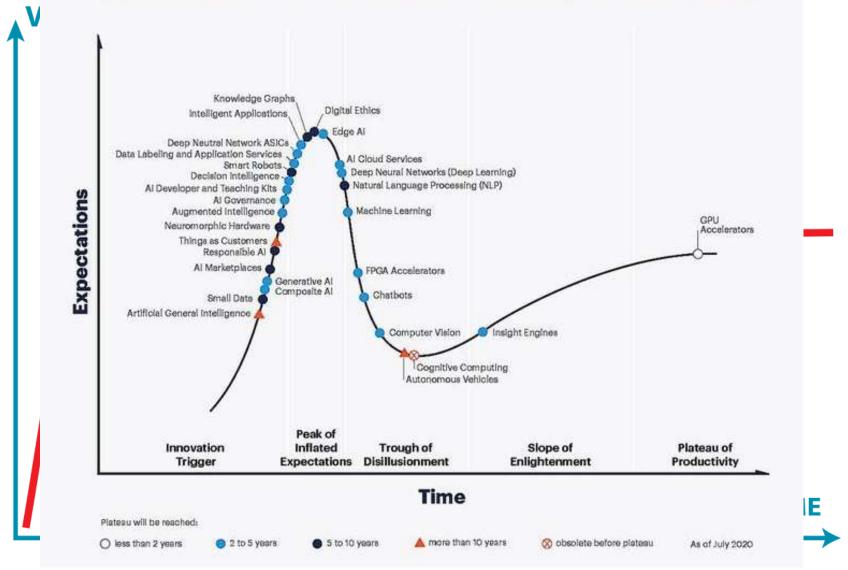


Gartner Hype Cycle



Gartner Hype Cycle

Hype Cycle for Artificial Intelligence, 2020



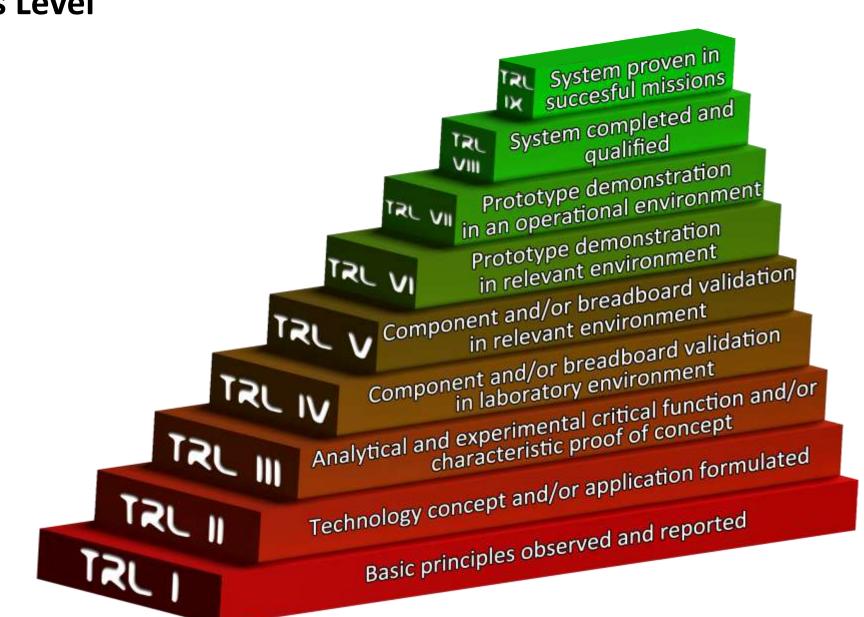
^{*} https://www.forbes.com/sites/louiscolumbus/2020/10/04/whats-new-in-gartners-hype-cycle-for-ai-2020/

Technology Readiness Level

Deployment - Innovation (Private companies)

Development (Technology centers)

Basic Science - Research (Universities)

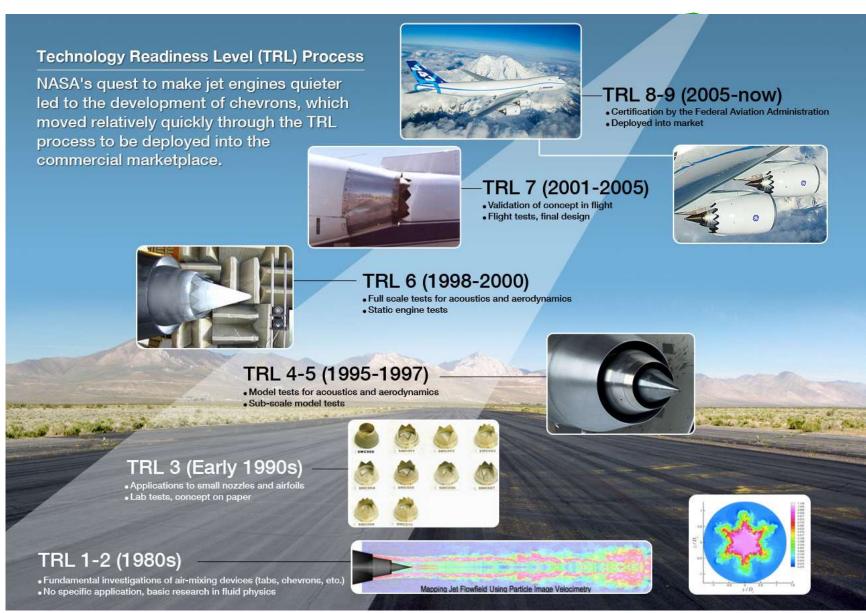


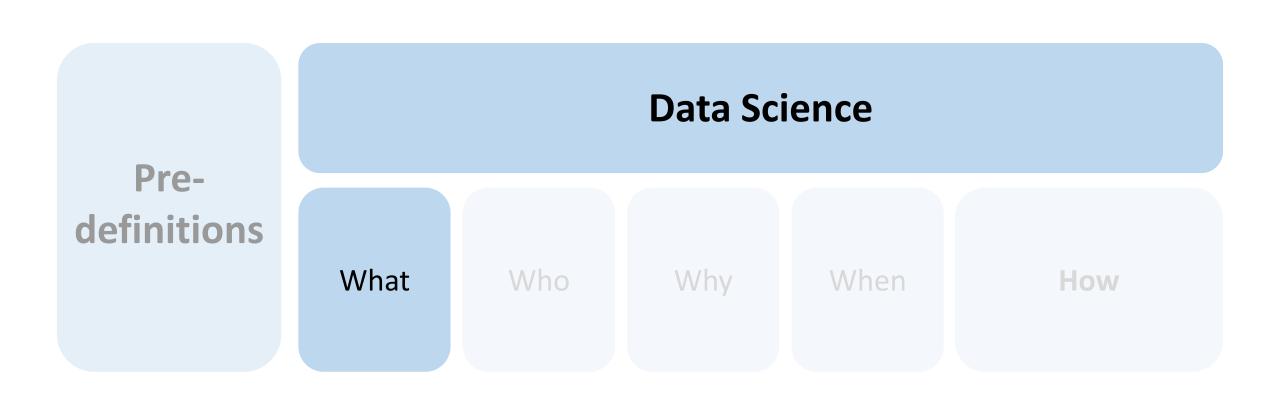
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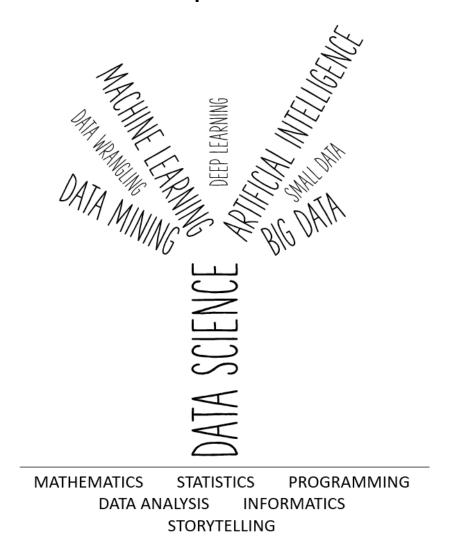
Basic Science - Research (Universities)



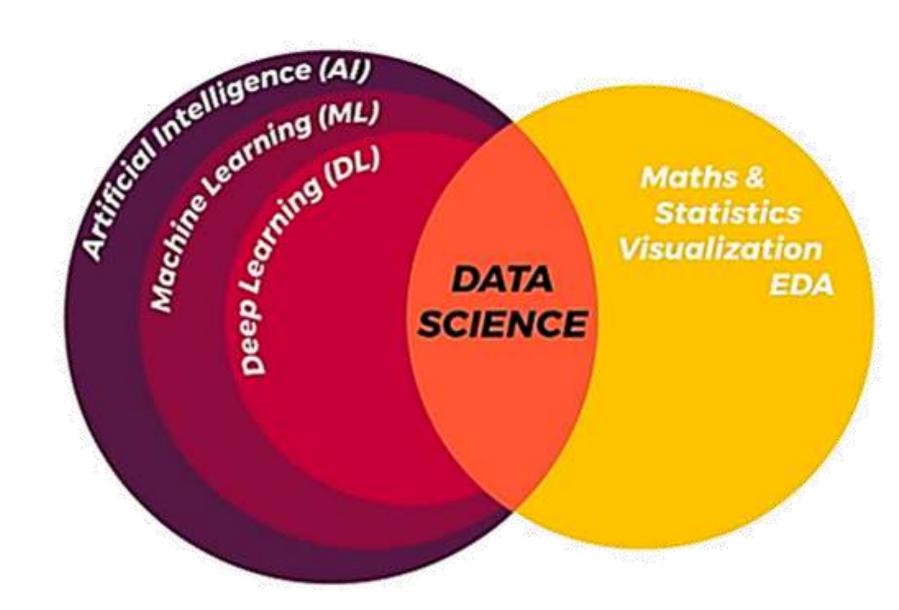


What is Data Science?

Interdisciplinary field focused on extracting knowledge and insights buried in data and develop advanced tasks.



What is Data Science?



Examples

Deep fake

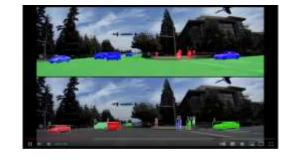






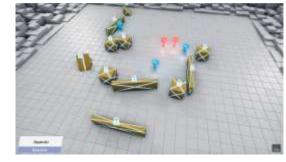
Autonomous driving

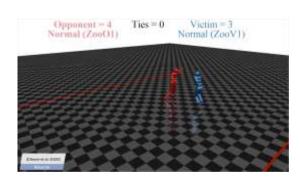




Reinforcement Learning

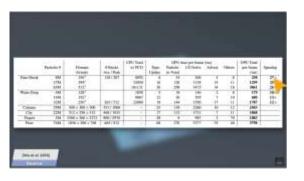




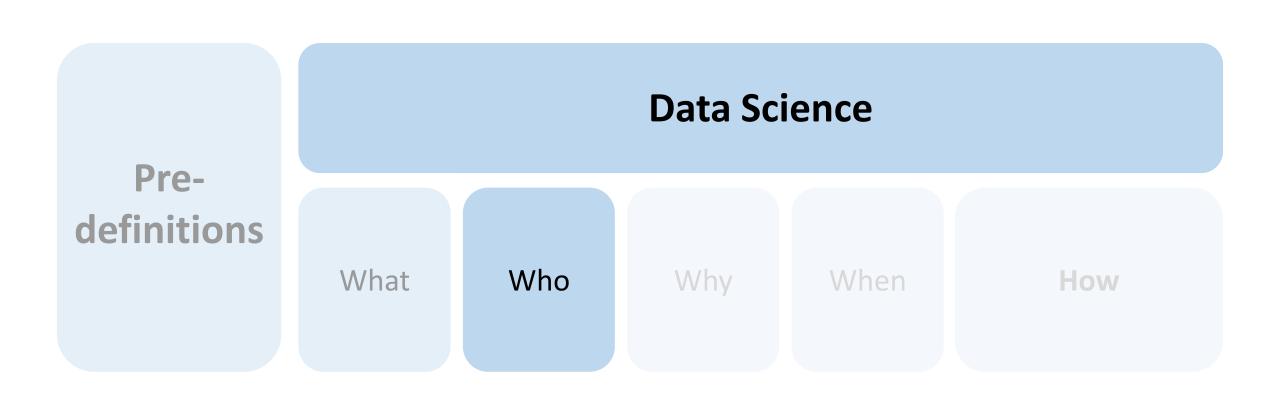


Physics Simulation

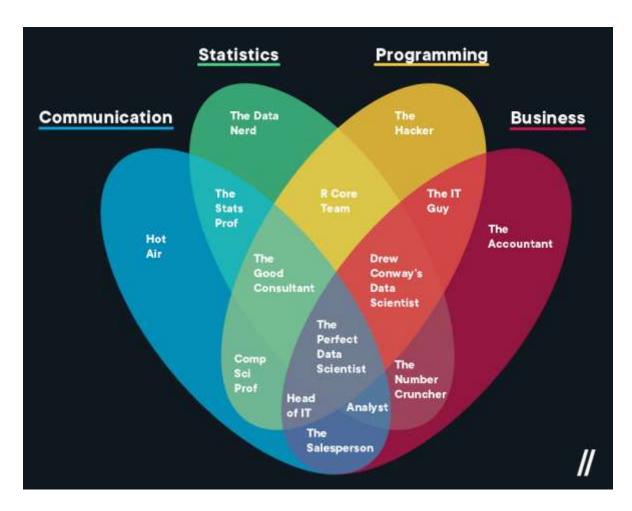




SOPHY in GT



Data scientists **analyse**, **process**, **and model data** to find trends and uncover solutions. Then they communicate the results.



Hard Skills	Soft Skills
Maths Statistics Programming	Curiosity Story telling Teamwork Humbleness

Field knowledge New technologies Avid learner

Data Science is not owned by Data Scientists!

Data Science is a very big and diverse field.

Humbleness is a must in Data Science as many people may know more than you in specific methods.

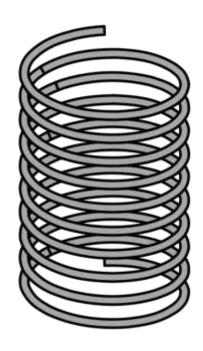
Data Scientists create data models

Data Scientists create data models

A model is a virtual representation of the behaviour of a system in a subdomain of the variables space. It maps inputs and outputs.

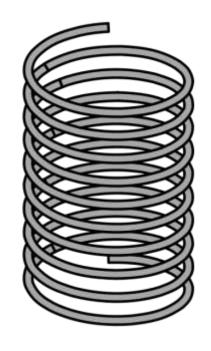
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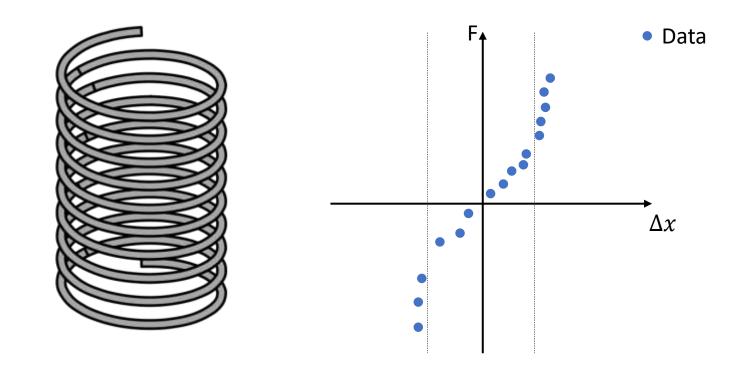


Hooke Law

$$F = k\Delta x$$
 (in the linear range)

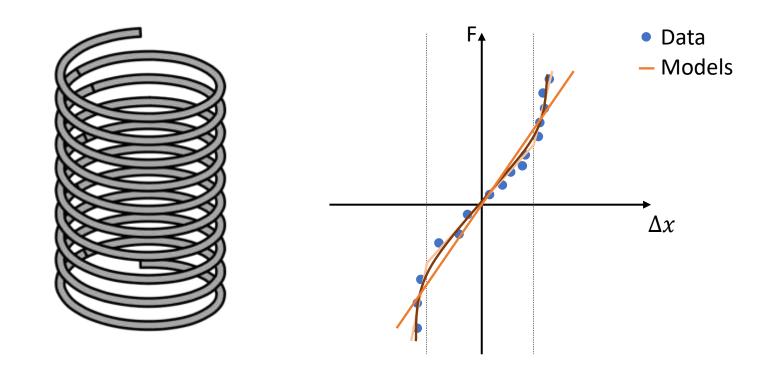
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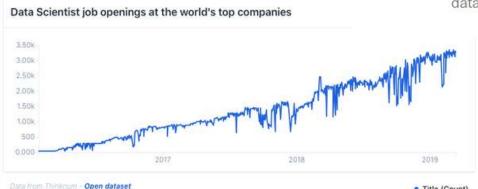
Data Scientists create *data models*

A model is a virtual representation of the behaviour of a system in a subdomain of the variables space. It maps inputs and outputs.



Data Scientist: The Sexiest Job of the 21st Century

Meet the people who can coax treasure out of messy, unstructured data. by Thomas H. Davenport and D.J. Patil



. Title (Count)

Job Trends from Indeed.com

- "Data Scientist" Job Trends from Indeed.com Percentage of Matching Job Postings -- "Data Sciemist" -- "Data Science" Jan'09 Jan'10 Jan'11 Jan'12 Jan'13

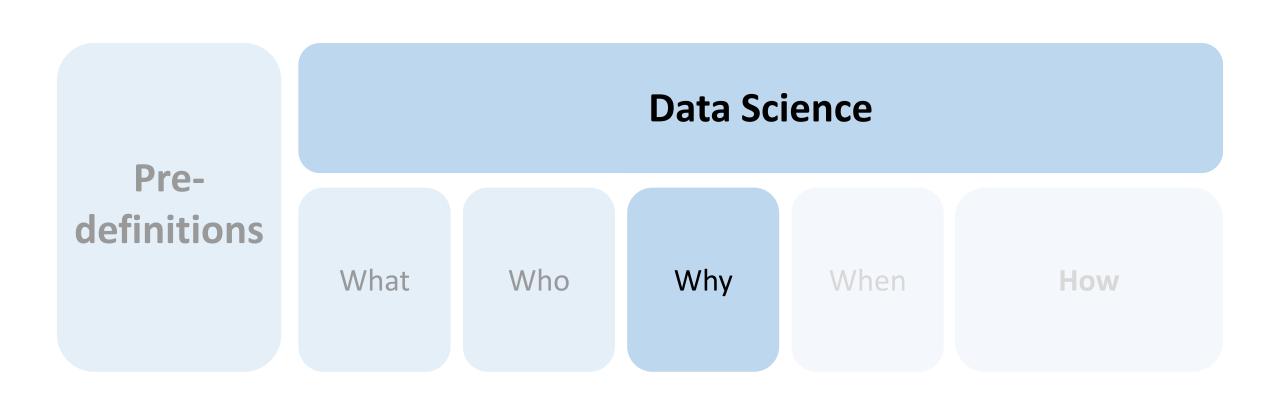


You know, I'm something of a data scientist myself

WHEN IT COMES TO DATA ANALYSIS

@datamemes

DATA SCIENTIST THESE DAYS



Why data, Why now?

Sensors are everywhere

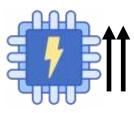
(Volume of data doubles every three years)



Data storage and computing power has increased, cost has plummeted

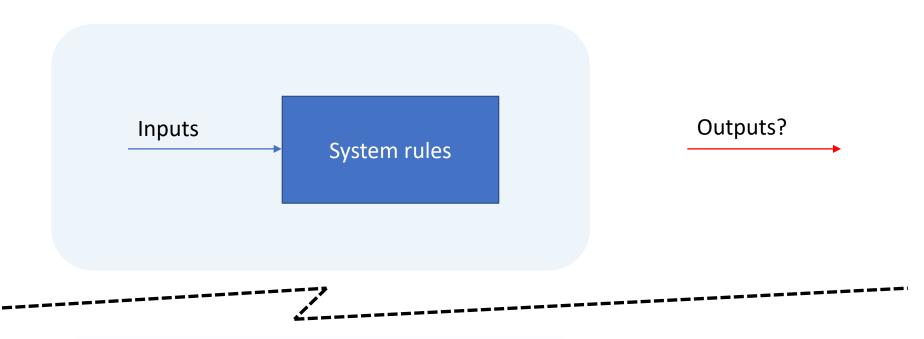


Algorithms are advancing

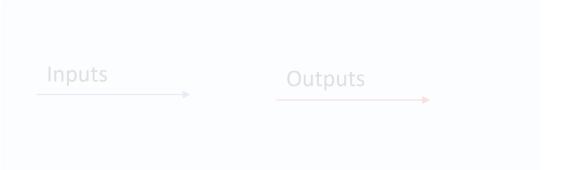


Data Paradigm

Classic models



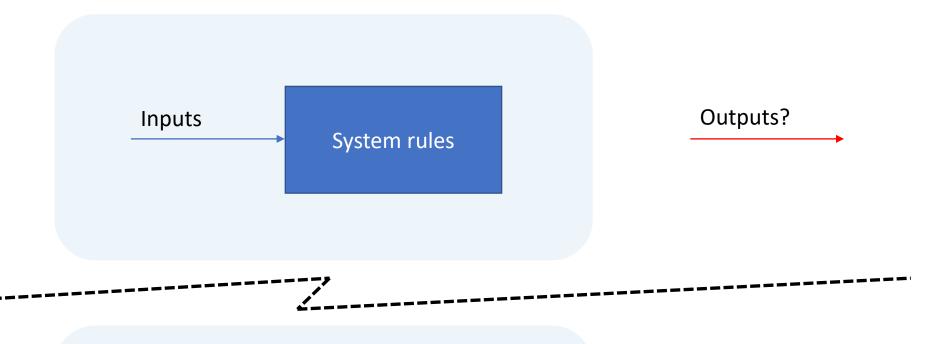
Data models



System rules

Data Paradigm

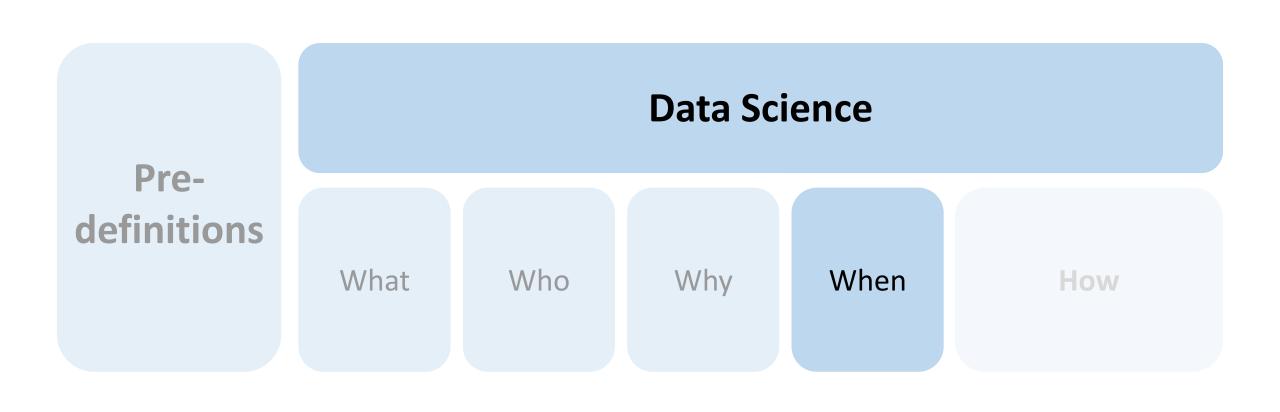
Classic models



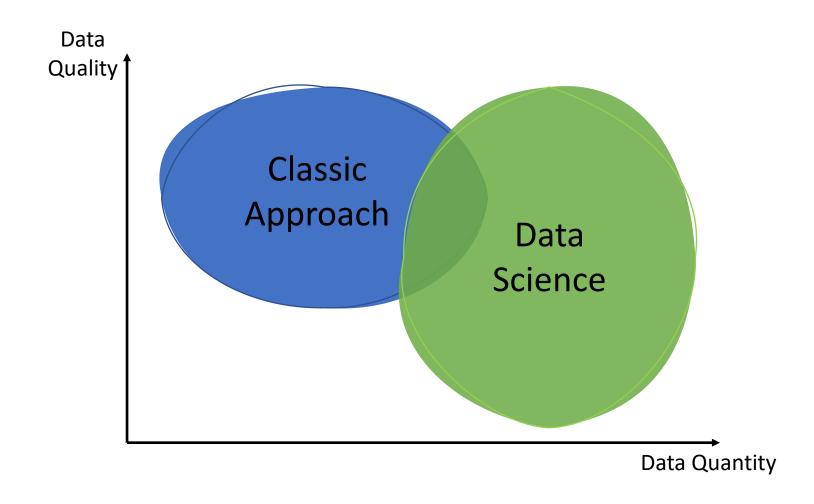
Data models



System rules

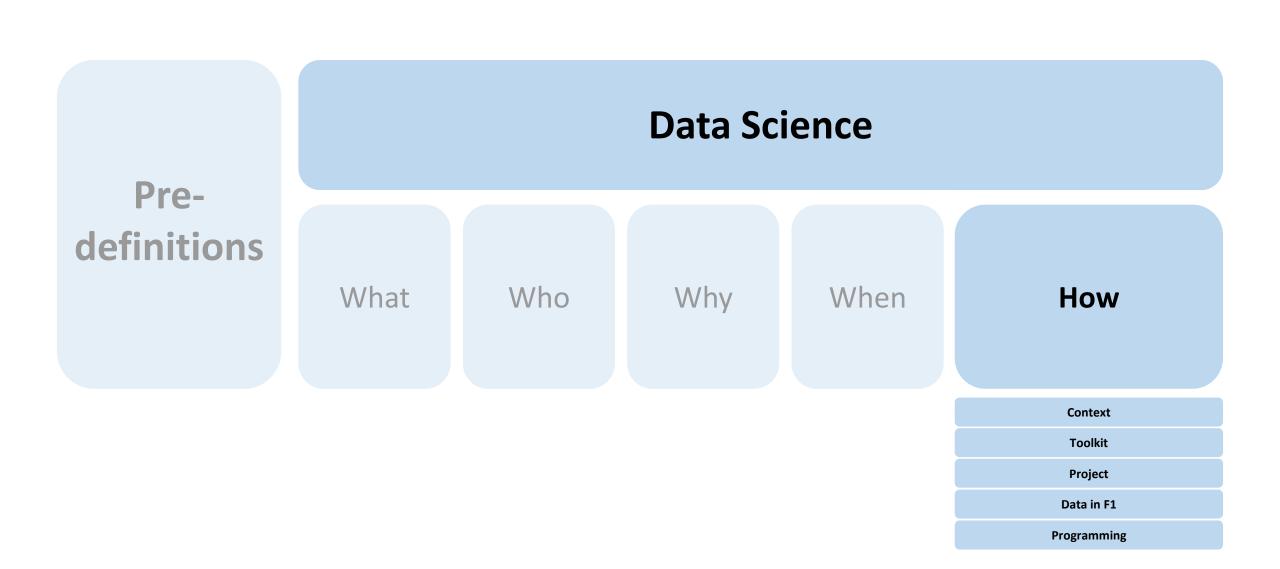


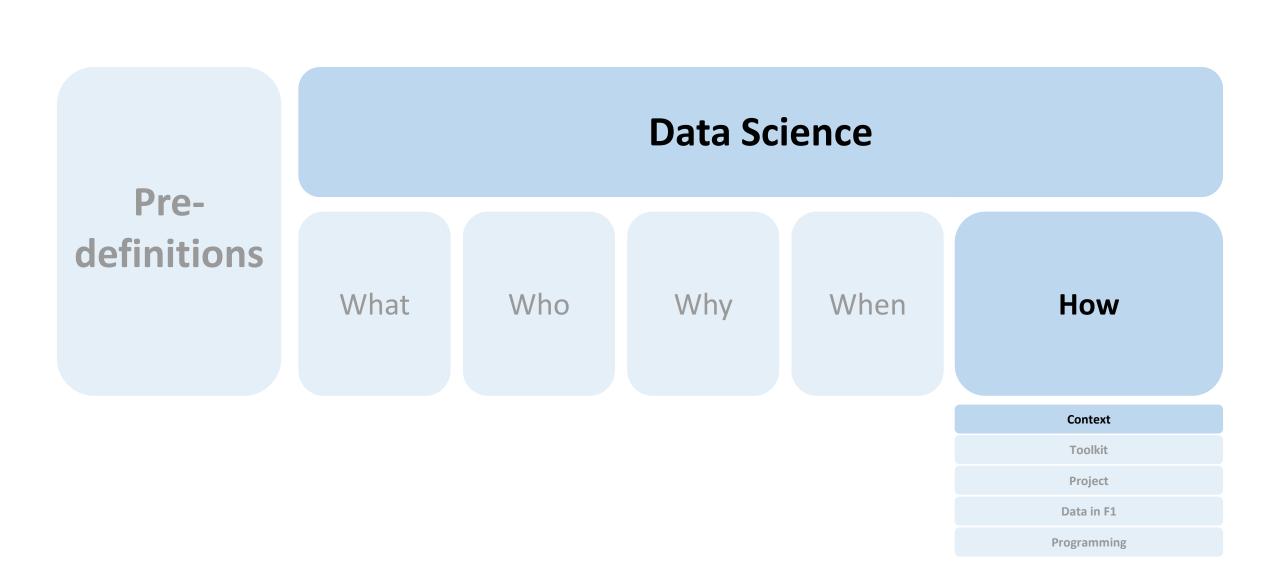
When Data Science?



Rules of ML (by Google)

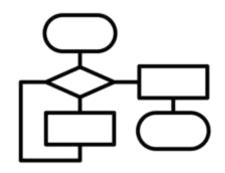
Before ML	Rule 01: Go for simple heuristics first. Rule 02: Design and implement metrics. Rule 03: Choose ML over complex heuristics.
First Pipeline	Rule 04: Keep the first model simple and get the infrastructure right.
	Rule 07: Turn heuristics into features.
	Rule 13: Choose a simple metric for your first objective
	Rule 16: Plan to launch and iterate.
Feature Engineering	Rule 19: Use very specific features when you can.
	Rule 23: You are not a typical end user.
	Rule 24: Measure the delta between models.
Growth	Rule 43:

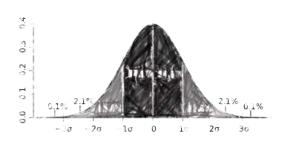




Data Analyst

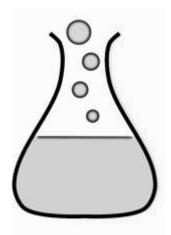
Overview/pre-analysis

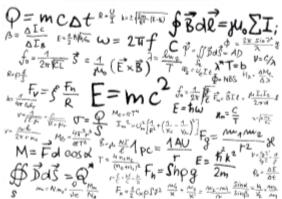




Data Scientist

Algorithms/models





ML Engineer

Implementation

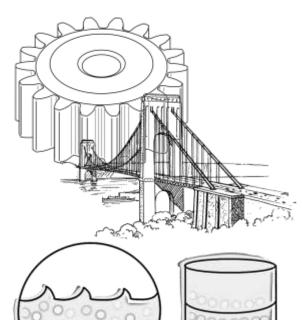






Data Engineer

Infrastructure



Technology stack

Data Analyst

Overview/pre-analysis

Data Scientist

Algorithms/models

ML Engineer

Implementation

Data Engineer

Infrastructure





Storage

DATA LAKE
WAREHOUSE

Size

BIG DATA

SMALL DATA

DATA

DATA

Structured

Databases (SQL, non SQL ...)

CSV, JSON files

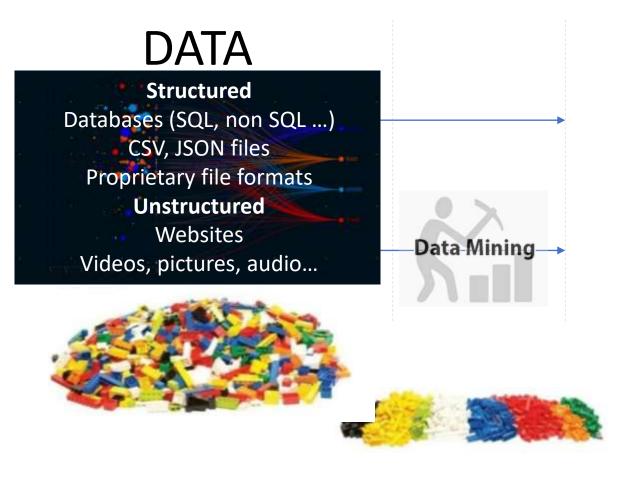
Proprietary file formats

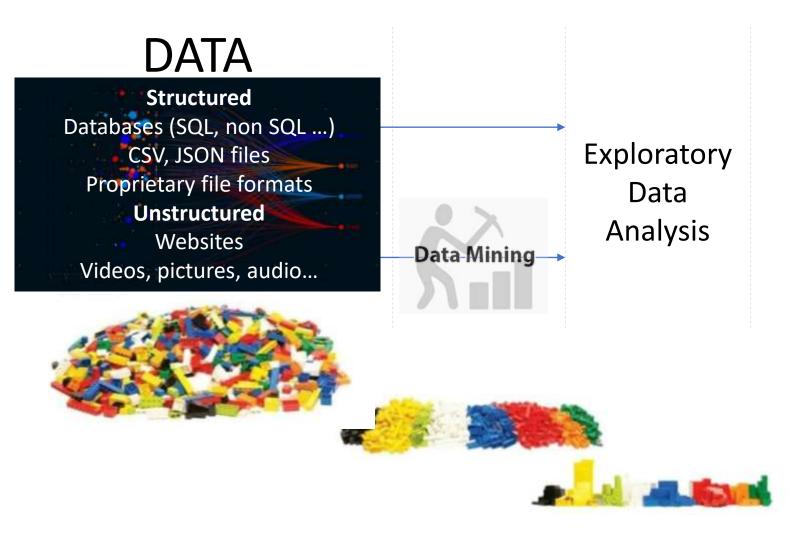
Unstructured

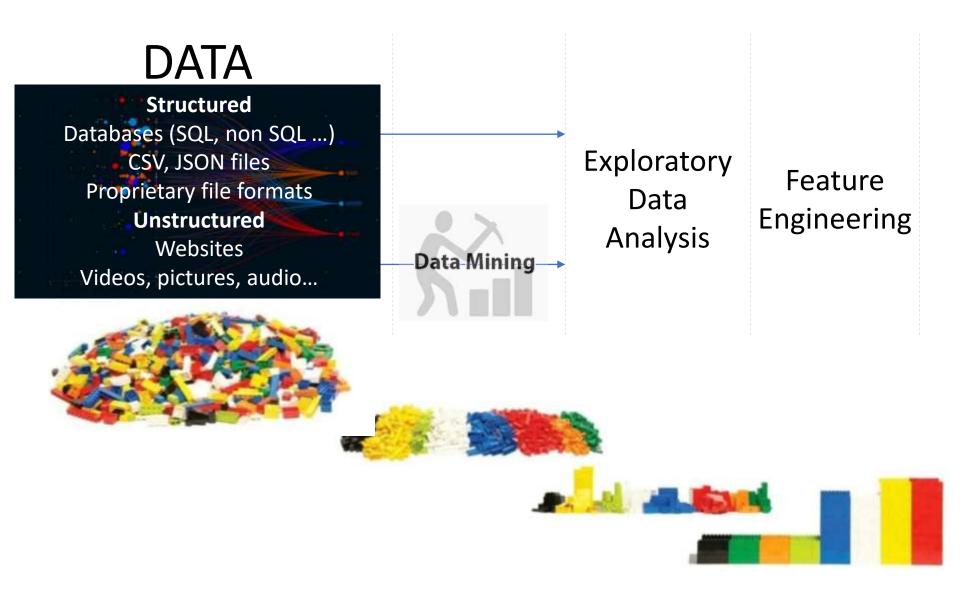
Websites

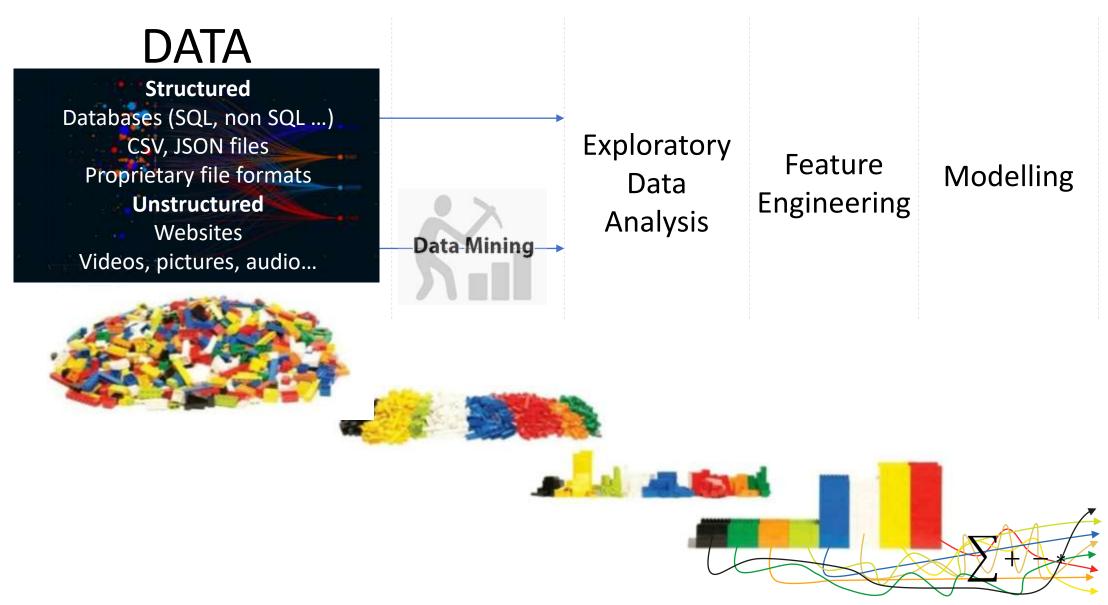
Videos, pictures, audio...





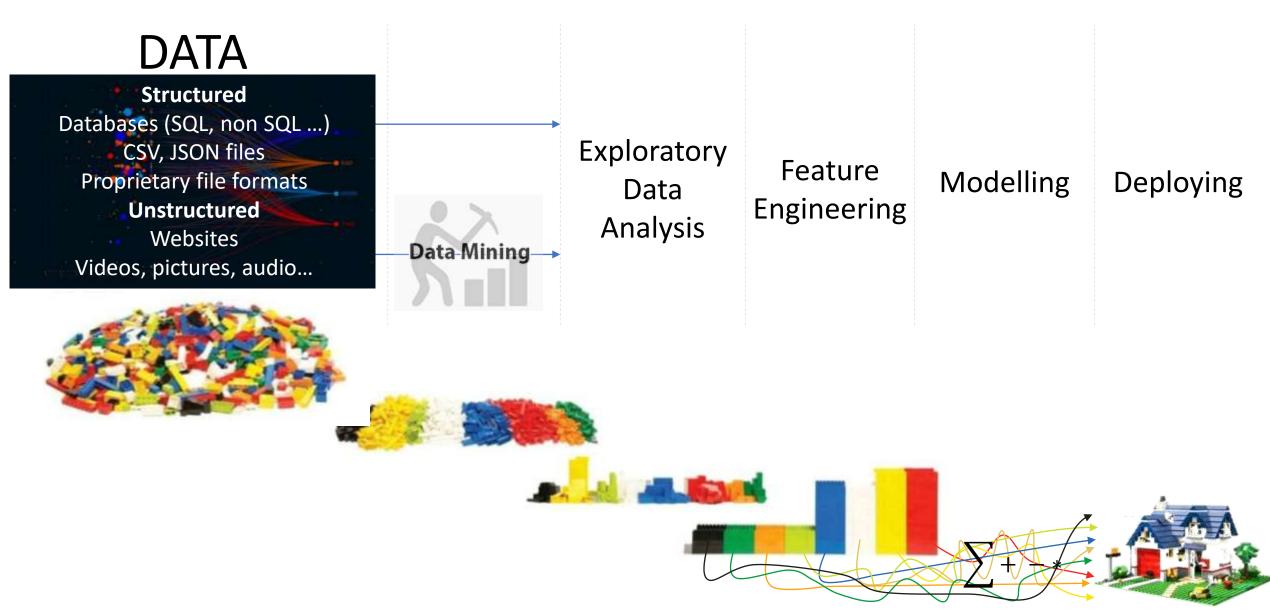


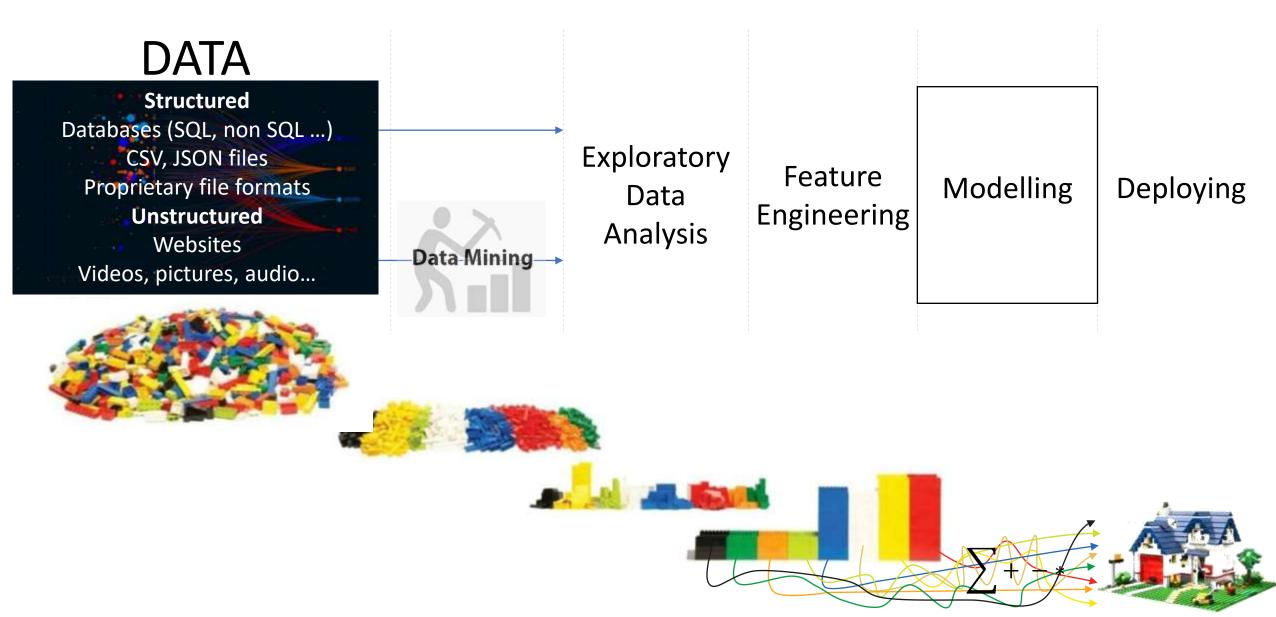




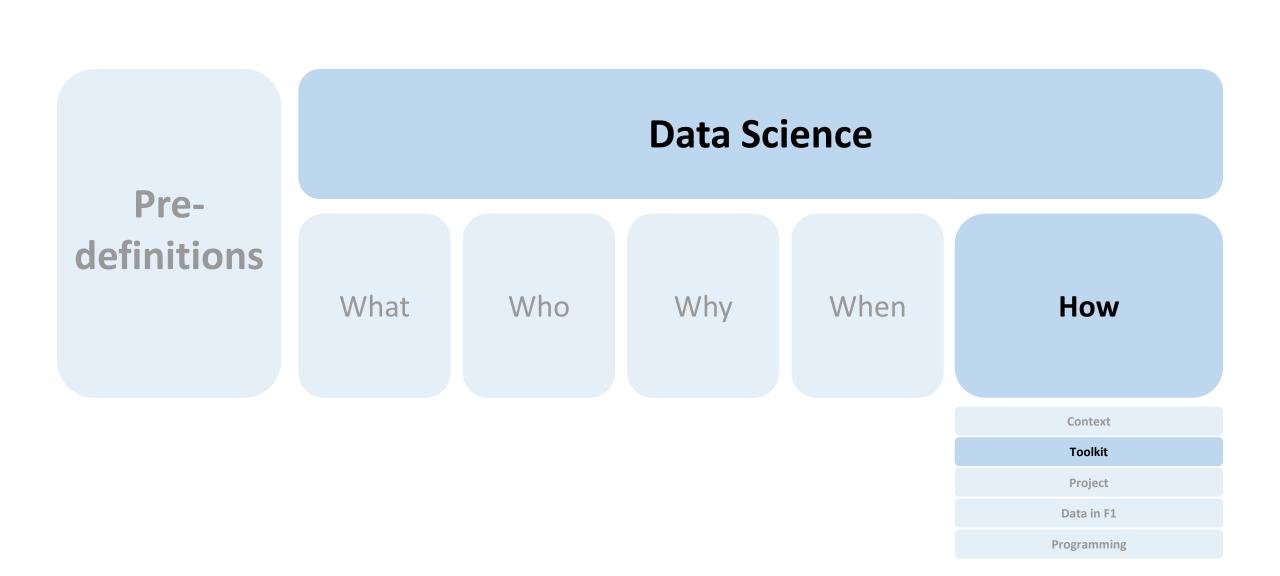
^{*} https://www.emlv.fr/big-data-outils-analyser-donnees/

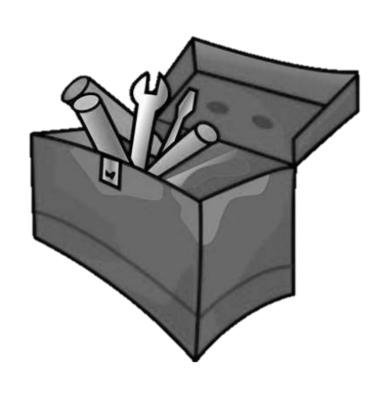
Data Science Flow





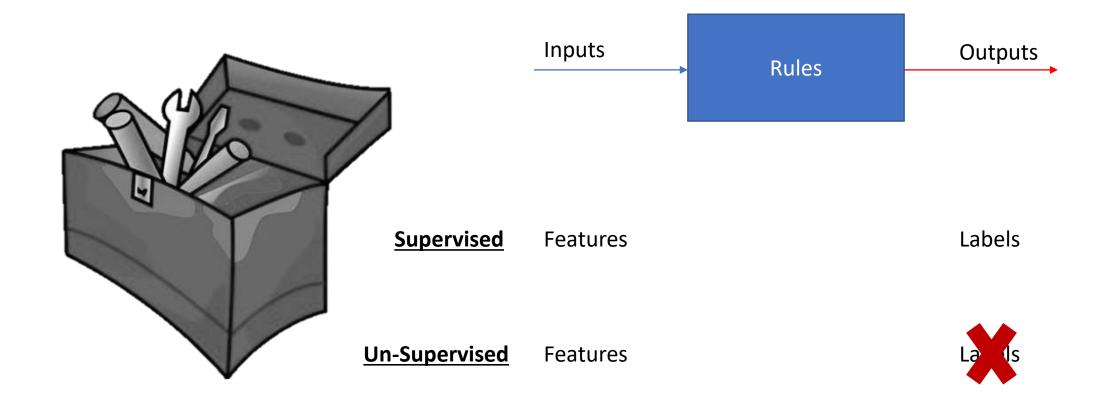
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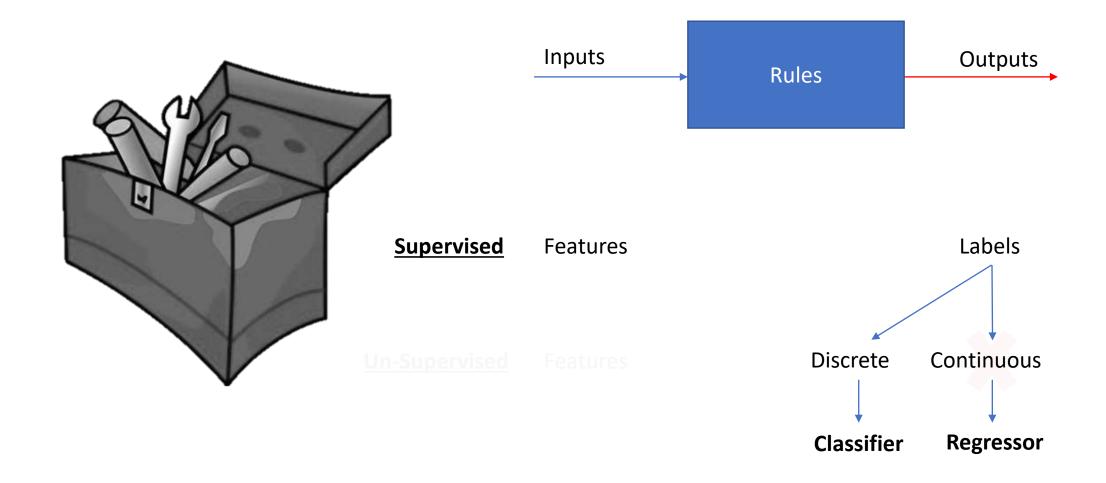


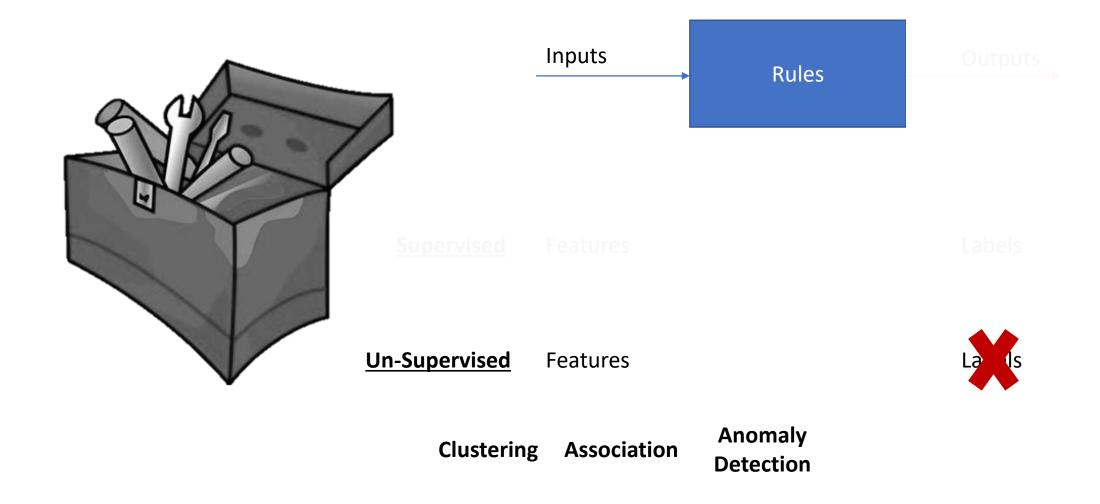




Features Labels

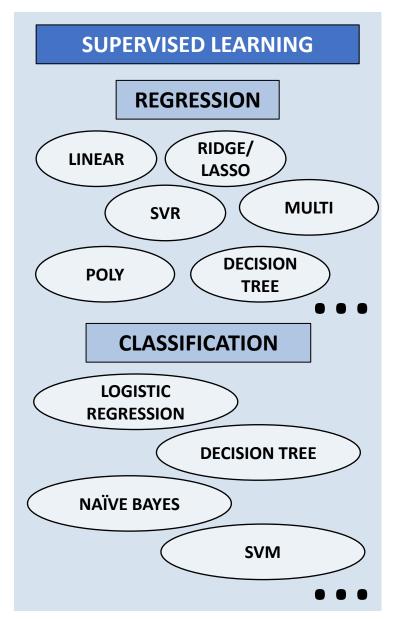


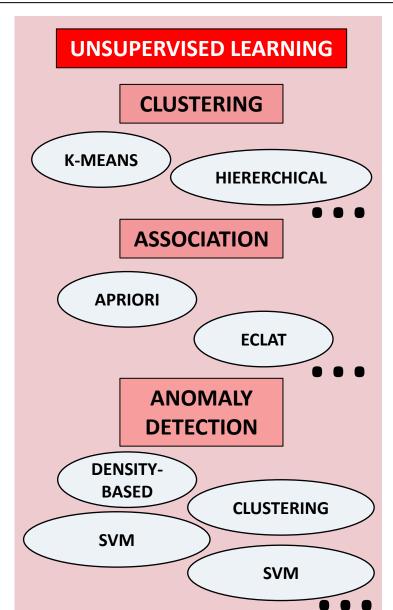


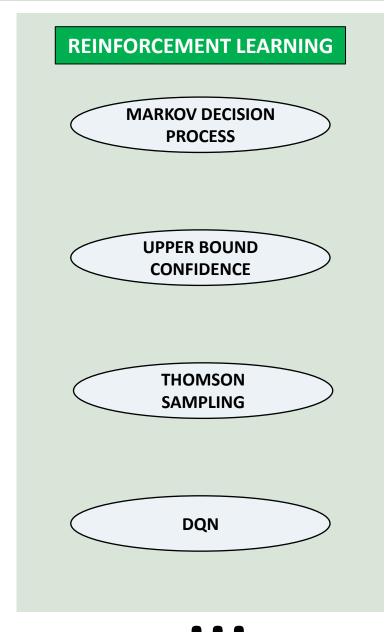


DEEP LEARNING

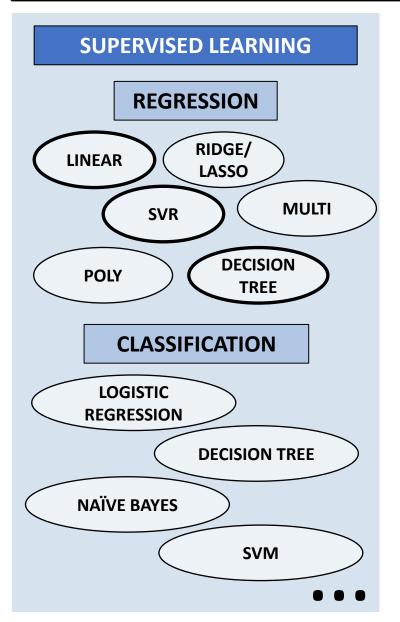
MACHINE LEARNING

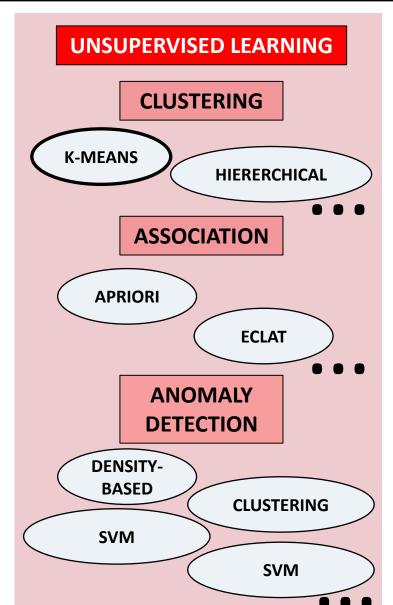


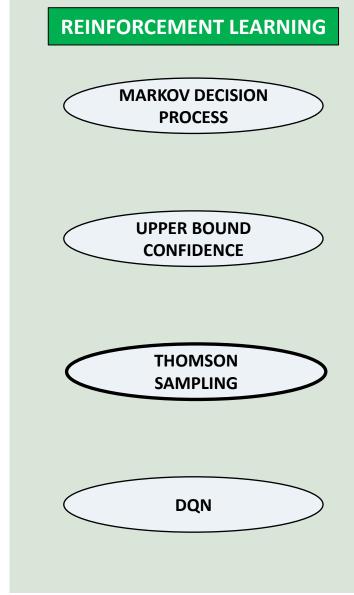




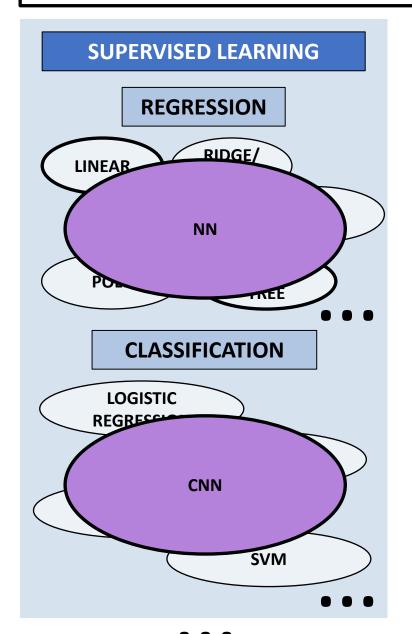
MACHINE LEARNING

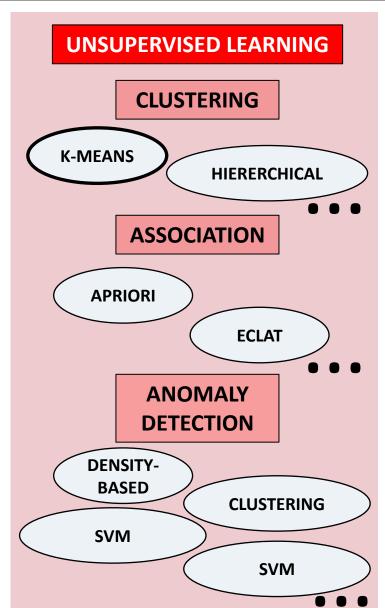


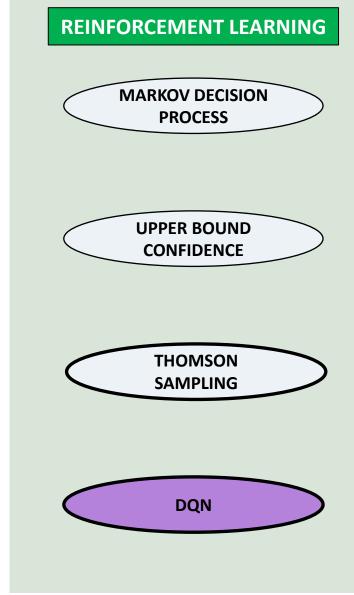




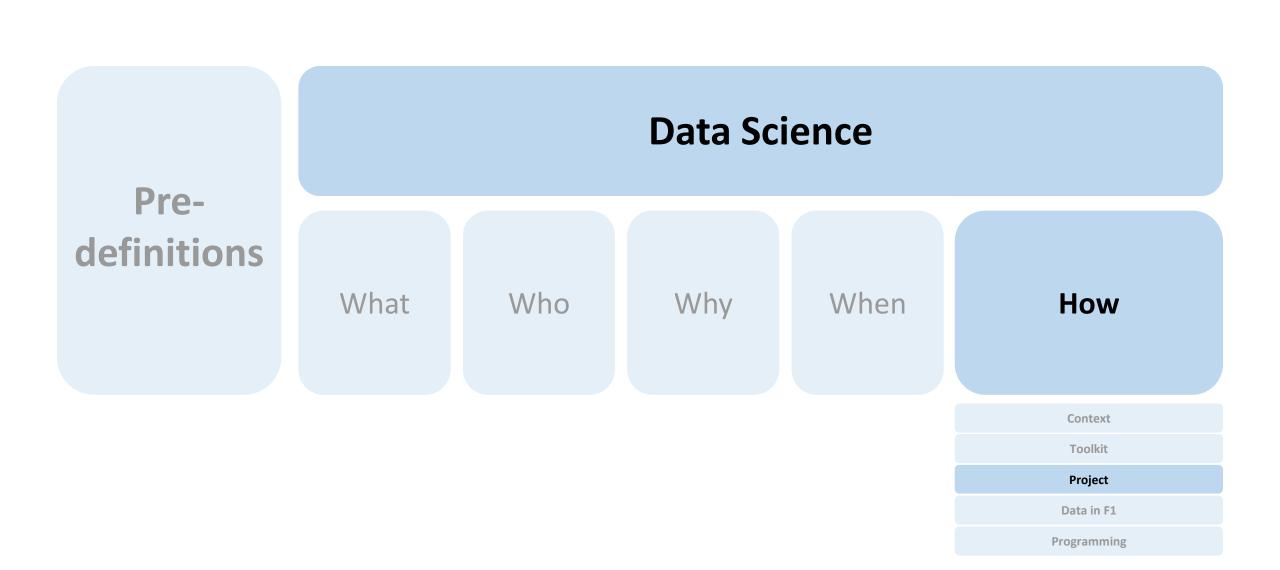












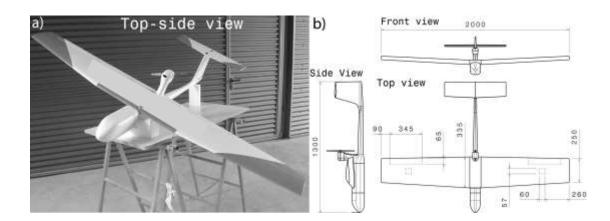
Sensors study

Installation of sensors

Interface

Storing the data

Sensors study



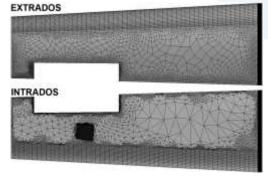
Installation of sensors

Interface

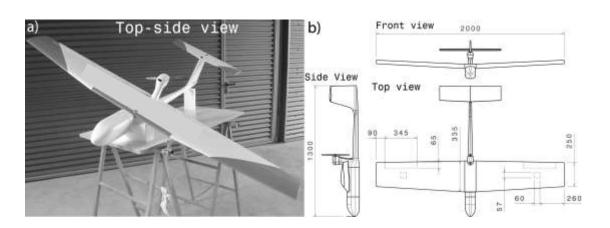
Storing the data

^{*} Gutiérrez, Nicolás, et al. "Fiber Bragg grating application to study an unmanned aerial system composite wing." *Journal of Intelligent Material Systems and Structures* 30.8 (2019): 1252-1262.

Sensors study



Installation of sensors

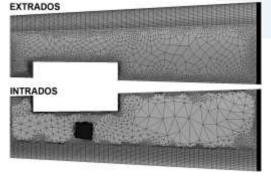


Interface

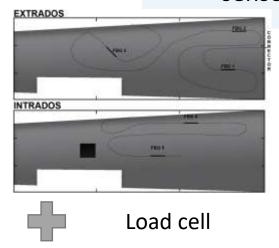
Storing the data

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Installation of sensors





Top-side view

Storing the data

b)

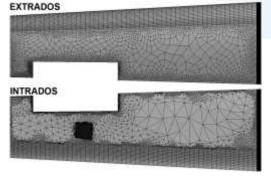
Side View

Front view

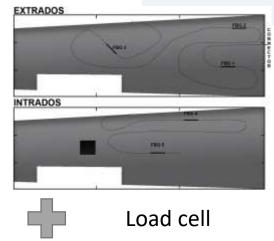
Top view

^{*} Gutiérrez, Nicolás, et al. "Fiber Bragg grating application to study an unmanned aerial system composite wing." *Journal of Intelligent Material Systems and Structures* 30.8 (2019): 1252-1262.





Installation of sensors



Interface

Top-side vi**e**w



b)

Side View



Front view

Top view

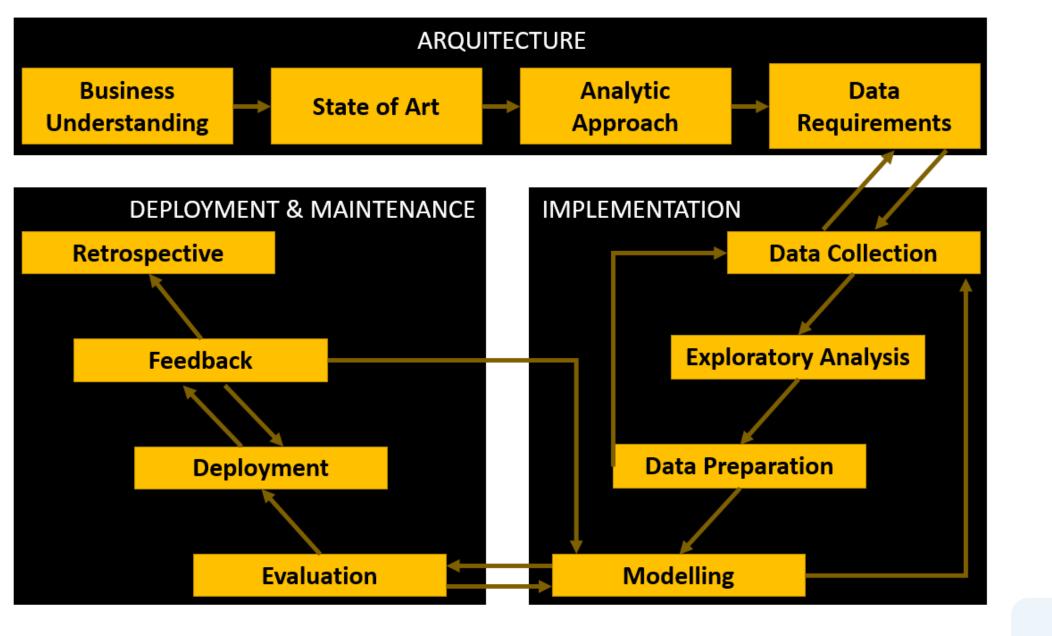
Storing the data

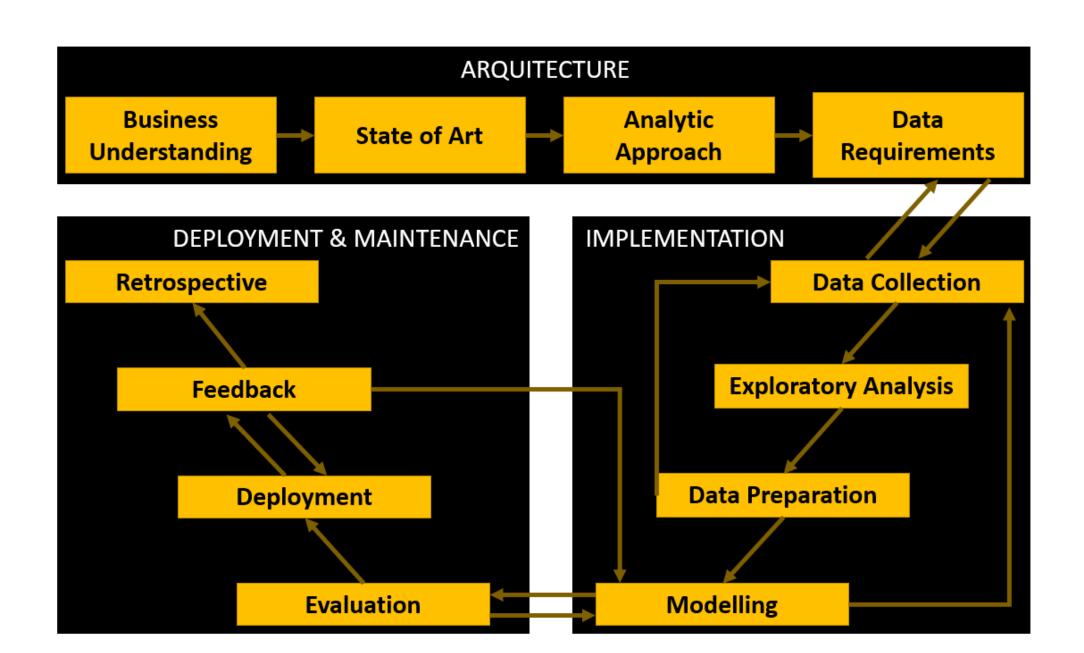
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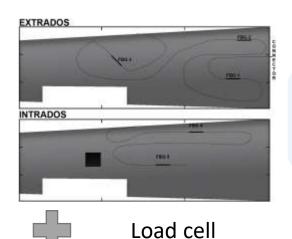




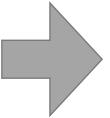
Storing the data



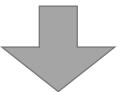




Storing the data



- Alarms (thresholds) for load and strains
- Fatigue analysis
- Impact detection
- Dynamic analysis (aeroelasticity?)
- Distribution of the loads
- Regression models load-strain.
- Clustering of maneuvers.
- Patterns repeated in time.
- Anomaly detection (Sensor error or dangerous maneuvers)
- Classification of structural state.
- ...



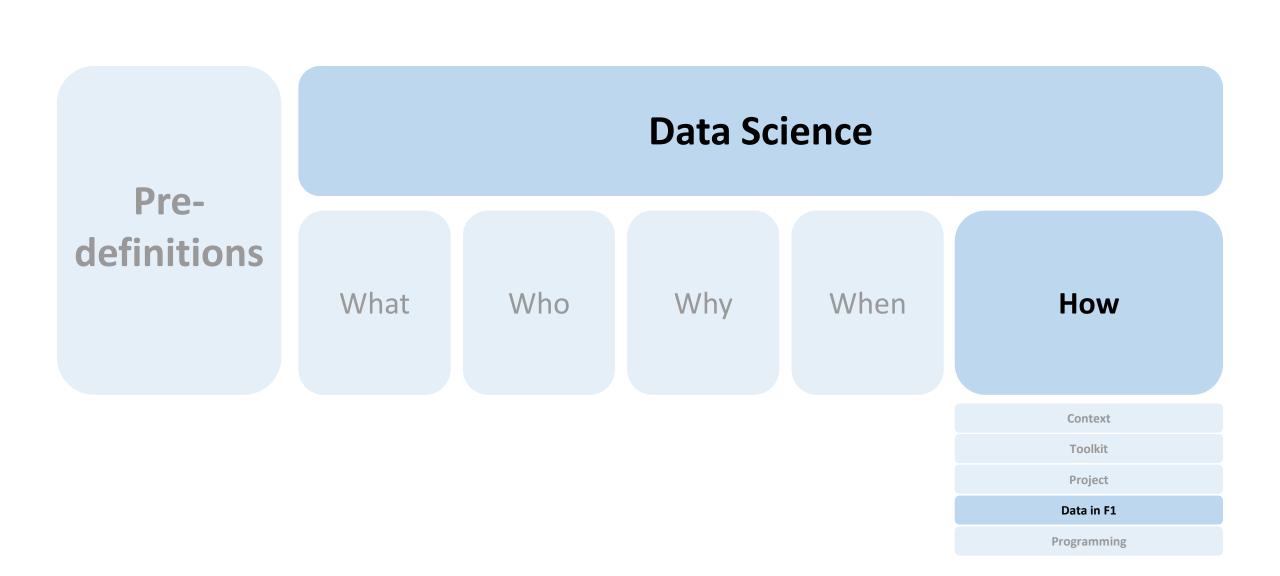
Refinement of design and calculation, reduce of costs and improvement of performances

Improvement of the product





^{*} https://towardsdatascience.com/why-we-need-more-ai-product-owners-not-data-scientists-e481cef39b90





≈ (O) 100 sensors≈ (O) 10Gb per weekend



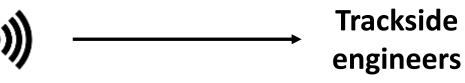






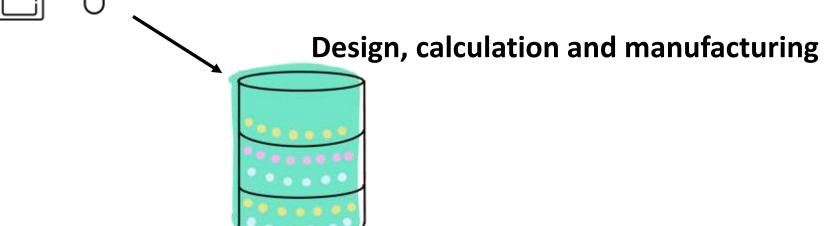
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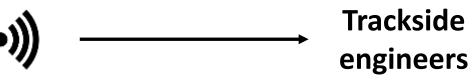




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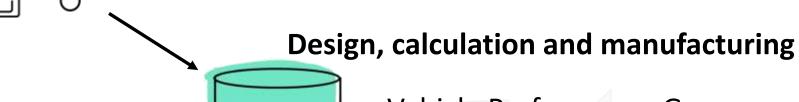








≈ (O) 100 sensors≈ (O) 10Gb per weekend



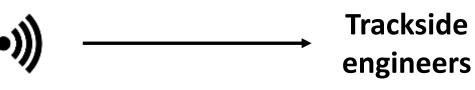
Vehicle Performance Group
Control Systems Modelling Group
Design Office

Aero

IT

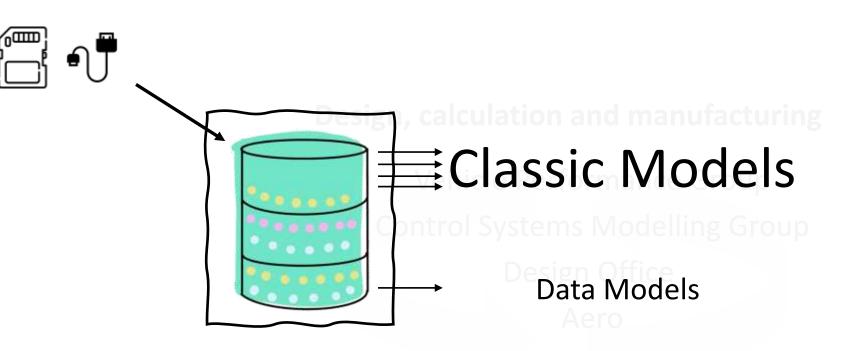
...







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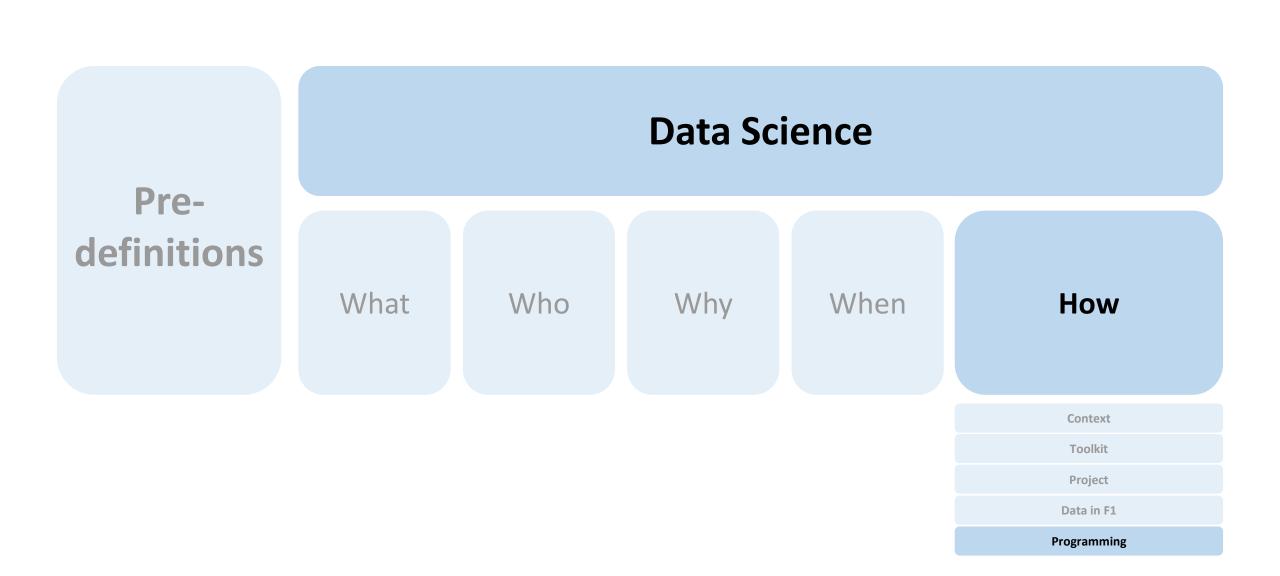


≈ (O) 100 sensors≈ (O) 10Gb per weekend

Data Science is exploding in F1, stay tuned if you are interested!!



Data Models



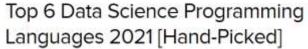
Coding for Data Science

Data Science requires a support, a tool that allows quick and easy interaction with data.

Additionally the "bigger" the data, the "higher" the computational demands.

Coding for Data Science







9 Top Programming Languages for Data Science



The 10 Best Data Science Programming Languages to Learn in 2021



Top 8 programming languages every data scientist should master in 2019

- 1. Python
- 2. JavaScript
- 3. Scala
- 4. R
- 5. SQL
- 6. Julia

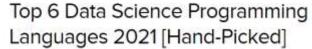
- 1. Python
- 2. R
- 3. SQL
- 4. Scala
- 5. Julia
- 6. JavaScript
- 7. Java
- 8. C/C++
- 9. Matlab

- 1. Python
- 2. JavaScript
- 3. Java
- 4. R
- 5. C/C++
- 6. SQL
- 7. Matlab
- 8. Scala
- 9. Julia
- 10. SAS

- 1. Python
- 2. R
- 3. Java
- 4. SQL
- 5. Julia
- 6. Scala
- 7. Matlab
- 8. (Tensorflow)

Coding for Data Science







9 Top Programming Languages for Data Science



The 10 Best Data Science Programming Languages to Learn in 2021



Top 8 programming languages every data scientist should master in 2019

1. Python	1. Python	1. Python	1. Python
2. JavaScript	2. R	2. JavaScript	2. R
3. Scala	3. SQL	3. Java	3. Java
4. R	4. Scala	4. R	4. SQL
5. SQL	5. Julia	5. C/C++	5. Julia
6. Julia	6. JavaScript	6. SQL	6. Scala
	7. Java	7. Matlab	7. Matlab
	8. C/C++	8. Scala	8. (Tensorflow)
	9. Matlab	9. Julia	
		10. SAS	

High level language

Easy to read, learn and write

Great community support

Famous and gaining more popularity

Interpreted

Free and open source

High level language

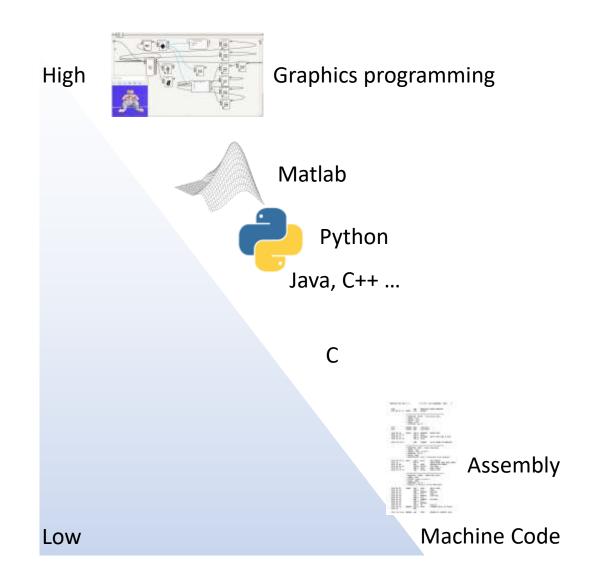
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Great for Data Science

Clean syntax and indentation structure

```
# Python 3: Simple output (with Unicode)
>>> print("Hello, I'm Python!")
Hello, I'm Python!

# Input, assignment
>>> name = input('What is your name?\n')
>>> print('Hi, %s.' % name)
What is your name?
Python
Hi, Python.
```

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*Study by SlashData

The size of programming language communities in Q3 2020 is as follows:

1. JavaScript

Active developers: 12.4 million Most popular in: Web, Cloud

Least popular in: Data Science, Machine Learning, AR/VR

2. Python

Active developers: 9 million

Most popular in: Data Science, Machine Learning, IoT

Least popular in: Mobile, Web

3. Java

Active developers: 8.2 million Most popular in: Mobile, Cloud

Least popular in: Data Science, Machine Learning, Web

4. C/C++

Active developers: 6.3 million Most popular in: IoT, AR/VR

Least popular in: Web, Cloud, Mobile

5. PHP

Active developers: 6.1 million Most popular in: Web, Cloud

Least popular in: Data Science, Machine Learning, Mobile

6. C#

Active developers: 6.0 million

Most popular in: Games, AR/VR, Desktop

Least popular in: Data Science, Machine Learning, Mobile

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TIOBE Index				PYPL Index (Worldwide)							
Aug _ 2021	Aug 2020 \$	Change \$	Programming	Ratings \$	Change ♦	Aug _ 2021	Change ♦	Programming language	‡	Share \$	Trends ♦
1	1		С	12.57%	-4.41%	1		Python		29.93 %	-2.2 %
2	3	1	Python	11.86%	+2.17%	2		Java		17.78 %	+1.2 %
3	2	↓	Java	10.43%	-4.00%	3		JavaScript		8.79 %	+0.6 %
4	4		C++	7.36%	+0.52%	4		C#		6.73 %	+0.2 %
5	5		C#	5.14%	+0.46%	5	1	C/C++		6.45 %	+0.7 %
6	6		Visual Basic	4.67%	+0.01%	6	Ţ	PHP		5.76 %	-0.0 %
7	7		JavaScript	2.95%	+0.07%	7		R		3.92 %	-0.1 %
8	9	1	PHP	2.19%	-0.05%	8		Objective-C		2.26 %	-0.3 %
9	14	11	Assembly language	2.03%	+0.99%	9	1	TypeScript		2.11 %	+0.2 %
10	10		SQL	1.47%	+0.02%	10	Ţ	Swift		1.96 %	-0.3 %
11	18	1 1	Groovy	1.36%	+0.59%	11	1	Kotlin		1.81 %	+0.3 %
12	17	11	Classic Visual Basic	1.23%	+0.41%	12	↓	Matlab		1.48 %	-0.4 %
13	42	1 1	Fortran	1.14%	+0.83%	13		Go		1.29 %	-0.2 %
14	8	↓↓	R	1.05%	-1.75%	14	† †	Rust		1.21 %	+0.2 %
15	15		Ruby	1.01%	-0.03%	15	Ţ	VBA		1.16 %	-0.1 %
16	12	↓ ↓	Swift	0.98%	-0.44%	16	Ţ	Ruby		1.02 %	-0.1 %
17	16	Ţ	MATLAB	0.98%	+0.11%	17		Scala		0.79 %	-0.1 %
18	11	↓ ↓	Go	0.90%	-0.52%	18	1	Ada		0.77 %	+0.2 %
19	36	11	Prolog	0.80%	+0.41%	19	Ţ	Visual Basic		0.75 %	+0.0 %
20	13	↓ ↓	Perl	0.78%	-0.33%	20		Dart		0.68 %	+0.2 %
						21		Lua		0.58 %	+0.1 %
						22	11	Cobo1		0.51 %	+0.1 %
						23		Groovy		0.51 %	+0.1 %
						24	↓ ↓	Abap		0.46 %	-0.0 %
						25	1	Per1		0.45 %	+0.1 %
						26	ļ	Julia		0.39 %	-0.0 %
						27	1	Haskell		0.24 %	-0.0 %
						28	Į.	Delphi/Pascal		0.2 %	-0.1 %

^{*}https://statisticstimes.com/tech/top-computer-languages.php

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>>> print('Hi, %s.' % name)
What is your name?
Python
Hi, Python.
```

VS

Compiled

```
public void InitAnimations()
{
    viewportSizeY = GetViewportRect().Size.y;
    spewnY = viewportSizeY / 2.0f + 10f;

// Player Anim
Animation anim = GetNode*AnimationPlayer>("FlyInAnim").GetAnimation("FlyIn");
    anim.TrackSctKeyValue(0, 0, now Vector2(0, -viewportSizeY / 2.0f + -00f));
    anim.TrackSctKeyValue(0, 1, now Vector2(0, -viewportSizeY / 2.0f + viewportSizeY / 3.0f));
    player.Position = new Vector2(0, -viewportSizeY / 2.0f + -00f);

anim = GetNode*AnimationPlayer>("BgChangeAnim").GetAnimation("BgChangeAnim");
    anim.TrackSctKeyValue(1, 1, now Vector2(0, 0));
    anim.TrackSctKeyValue(1, 1, now Vector2(0, -viewportSizeY / 2.0f - 200.0f));

GetNode*AnimationPlayer>("BackgroundAnim").GetAnimation("BackgroundAnim");
    GetNode*AnimatedSprite>("BackgroundSprite").Frame = random.RandiAnane(0, 1);
    anim.TrackSctKeyValue(0, 1, now Vector2(0, -viewportSizeY / 2.0f - 220.0f));
    anim.TrackSctKeyValue(0, 1, now Vector2(0, +viewportSizeY / 2.0f - 225.0f));
    anim.TrackSctKeyValue(0, 1, now Vector2(0, +viewportSizeY / 2.0f - 225.0f));
    GetNode*AnimatedSprite>("BackgroundSprite").Position = now Vector2(0, -viewportSizeY / 2.0f + 225.0f));
    GetNode*Sprite>("Prototyplago").Fosition = now Vector2(0, -viewportSizeY / 2.0f - 225.0f));
    GetNode*Sprite>("Prototyplago").Fosition = now Vector2(0, -viewportSizeY / 2.0f - 225.0f));
}
```

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Interpreted

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Great for Data Science

No royalties or licenses

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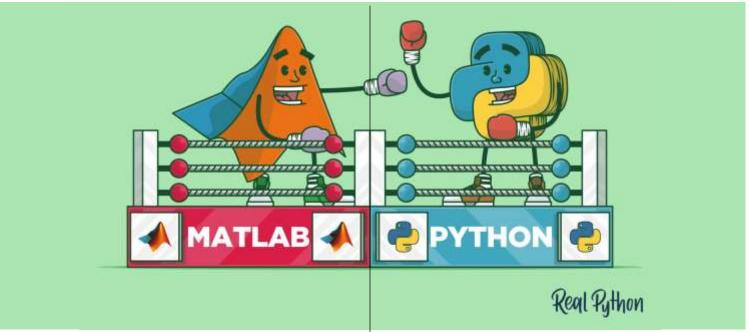






Python vs Matlab

Interpreted
High level and easy to use



Slightly higher performing (out of the box)
Proprietary (Pricey!)
Closed source
Poor deployment options
Integration with Simulink
King of simulation
Single IDE, Toolboxes agreed with MathWorks
Amazing help developed by MathWorks

Free
Open Source
Good deployment options
Integration with a huge amount of packages
King of Data Science
Multiple IDEs and packages
Huge community support (and growing!)

Starting with Python for Data Science

Bare Python



Python from python.org Select an IDE Link the IDE to the Python interpreter



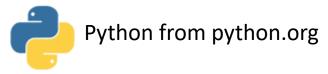
Great for Data Science
GUI for environments
Easy import-export of env
Easy integration with IDEs
It can be used for Jupyter as well

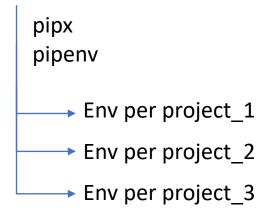


Nice interface to program and share.

Need Python first (Or docker)

Virtual environments







QUESTIONS?

