Questions & Answers

Introduction to Data Science (JBP010)

18th of December 2017

R.J. Klaasse Bos



Hi there !!

To help you get most out of this slide deck, please take note of the following structure:

- Part 1: [Question + Answer] on a single slide
- Part 2: Question slide (without answer) followed by [Question + Answer]

The latter may be helpful to test your memorisation super powers.. Happy memorising! ;-)



And of course...



"A merry Christmas and the best wishes for the new year!"

And now back to why you are really here..



Introduction to Data Science

Part 1

[Question + Answer] on a single slide

Question 1: What is Data Science?

A set of fundamental principles that guide the extraction of knowledge from data



Question 2: What is Data Engineering?

A set of **technologies** that facilitates the **access** to **data** and its **processing** in order to serve Data Science.



Question 3: What is Big Data?

Data processing tools that handle Volume, Velocity and Variety that traditional data processing systems cannot support.



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Tools and processes that guide the extraction of knowledge via Data Science principles.



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What is date-driven decision making?

The practice of basing decisions on the analysis of data rather than purely on intuition.



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They...

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and leverage (use data in decision-making and for product creation)

...data in order to navigate the competitive landscape.



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Democratize access to data to encourage experiments and hypotheses testing with the aim of improving an organization and its processes.



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How do Data Scientists spend most of their time?

80% of the work consists of cleaning the data



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A computer scientist, mathematician and storyteller combined with a curious attitude, domain knowledge and expertise.

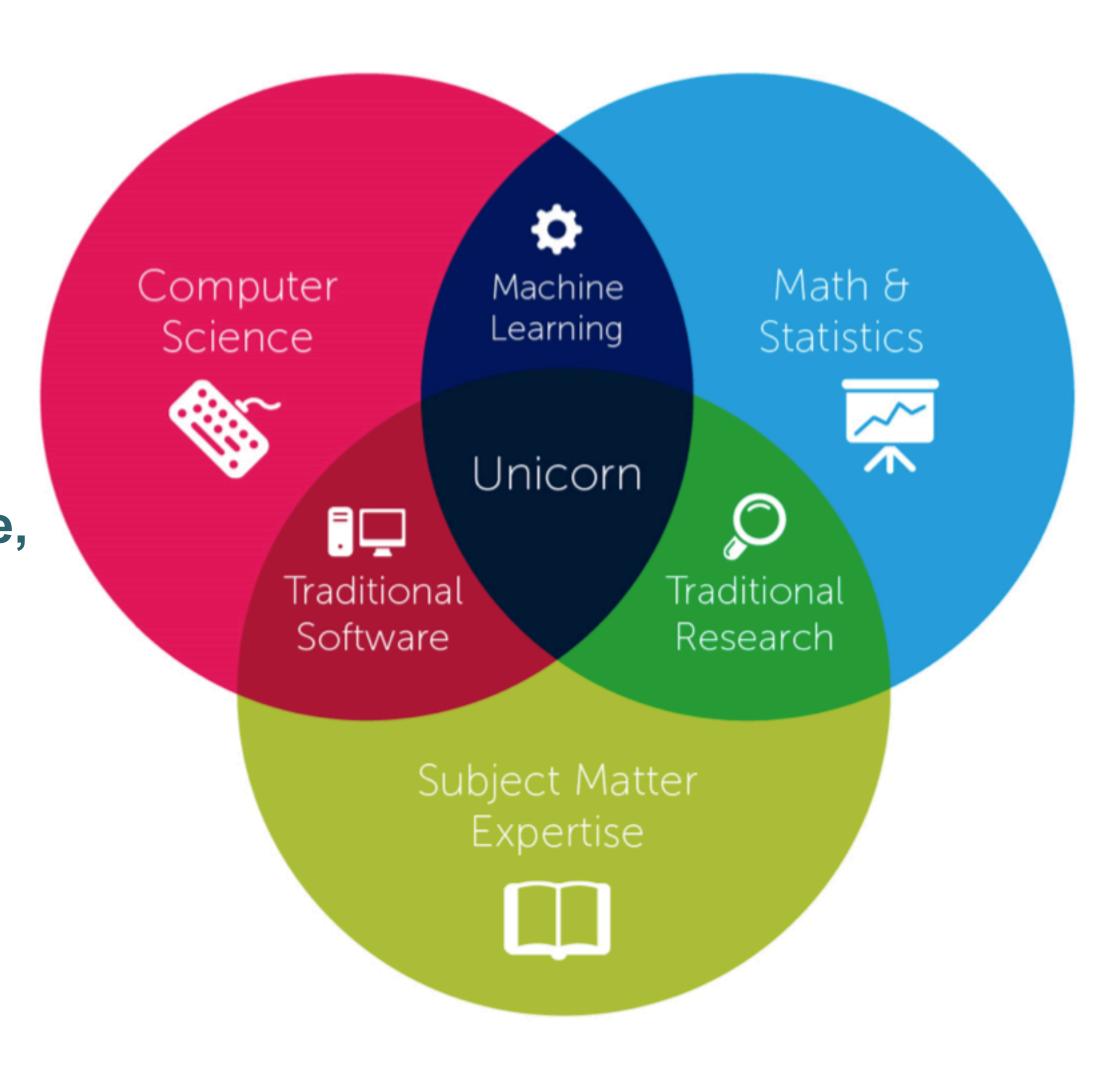


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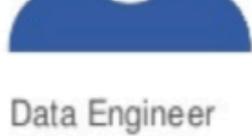


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What are the roles in a data science team?











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What does a data scientist do?

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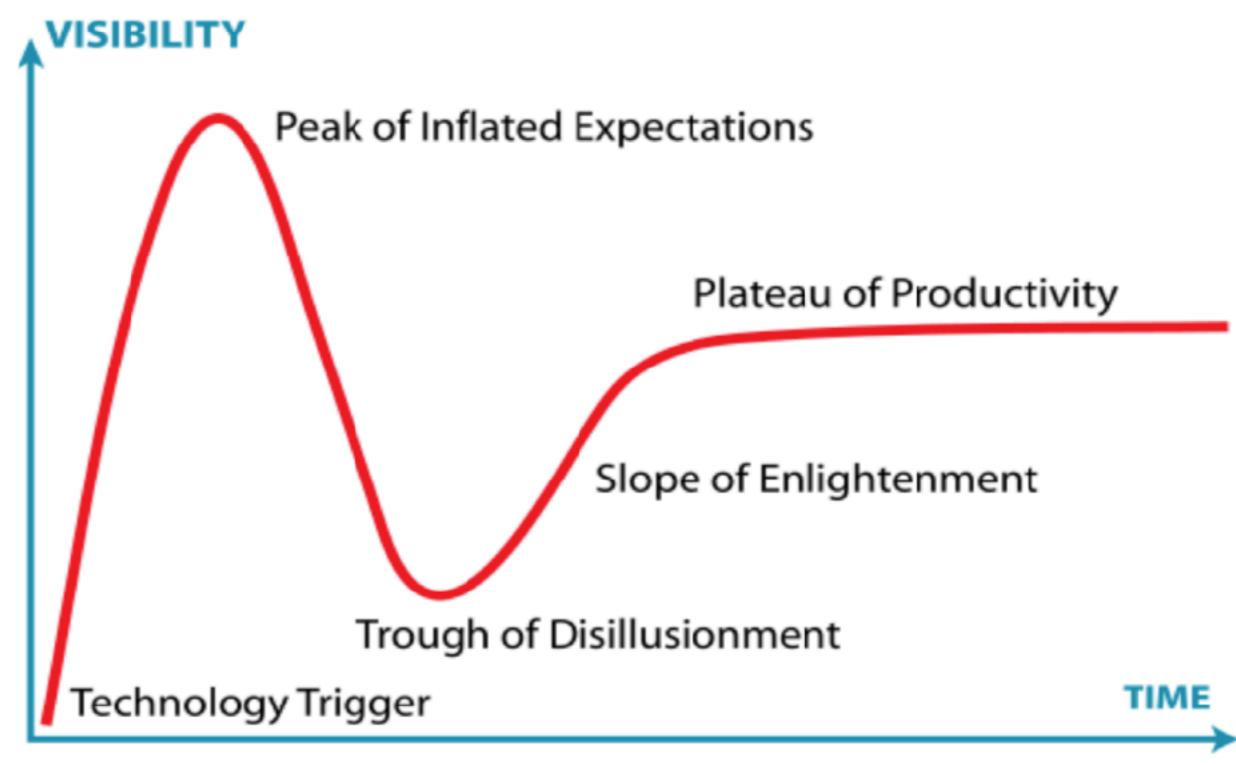
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Which types of Analyst Archetypes are there?

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- 2. Scripters
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(comfortable manipulating data, masters multiple (scripting) languages)

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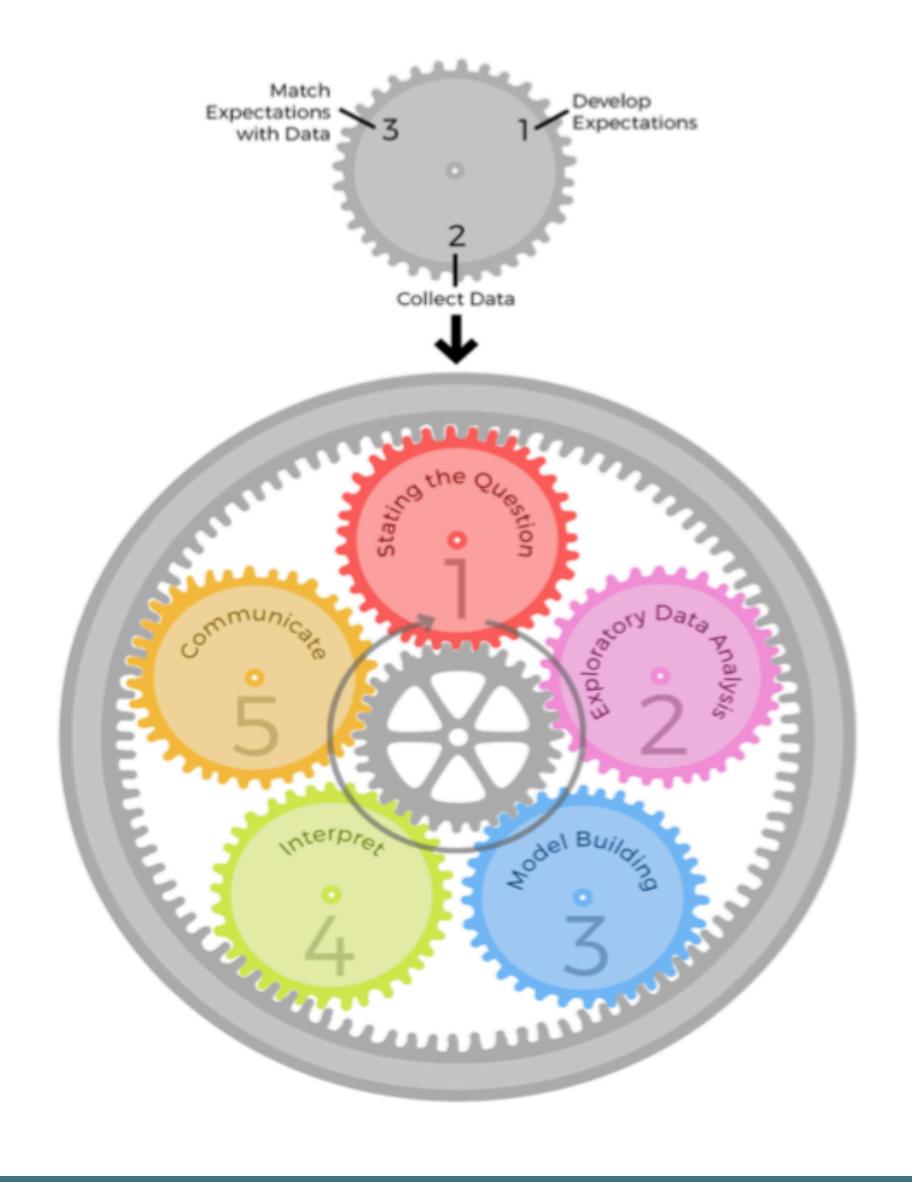
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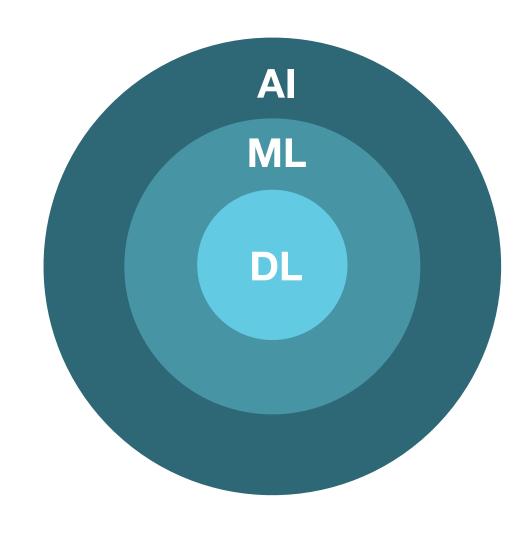
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Select features from historic data, **prepare** the **data** (dummies for categorical variables, imputation for NAs, scaling for better performance, add interactions), **build** a **ML-model** using the H2O package, **validate** hypotheses with a statistical **test** and eventually evaluate the **model performance**.



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Netflix's movie recommendation system, chatbots, Google searches, your Facebook feed, Amazon's product recommendations, Spotify's Discovery Weekly playlist, and many more...



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Which are common features to detect stress?

Common features to detect stress are: heart rate (variability), skin conductance level and respiration rate.



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Which are typical data sources used to rank hotels?

Trivago uses the following data sources to rank hotels:

- Hotel meta-data (location)
- Ratings (star rating, cleanliness, breakfast, etc.)
- Facilities (laundry, room service, pool, etc.)
- Images (hotel / surroundings)
- Personal click behaviour (how the user interacted on the site)



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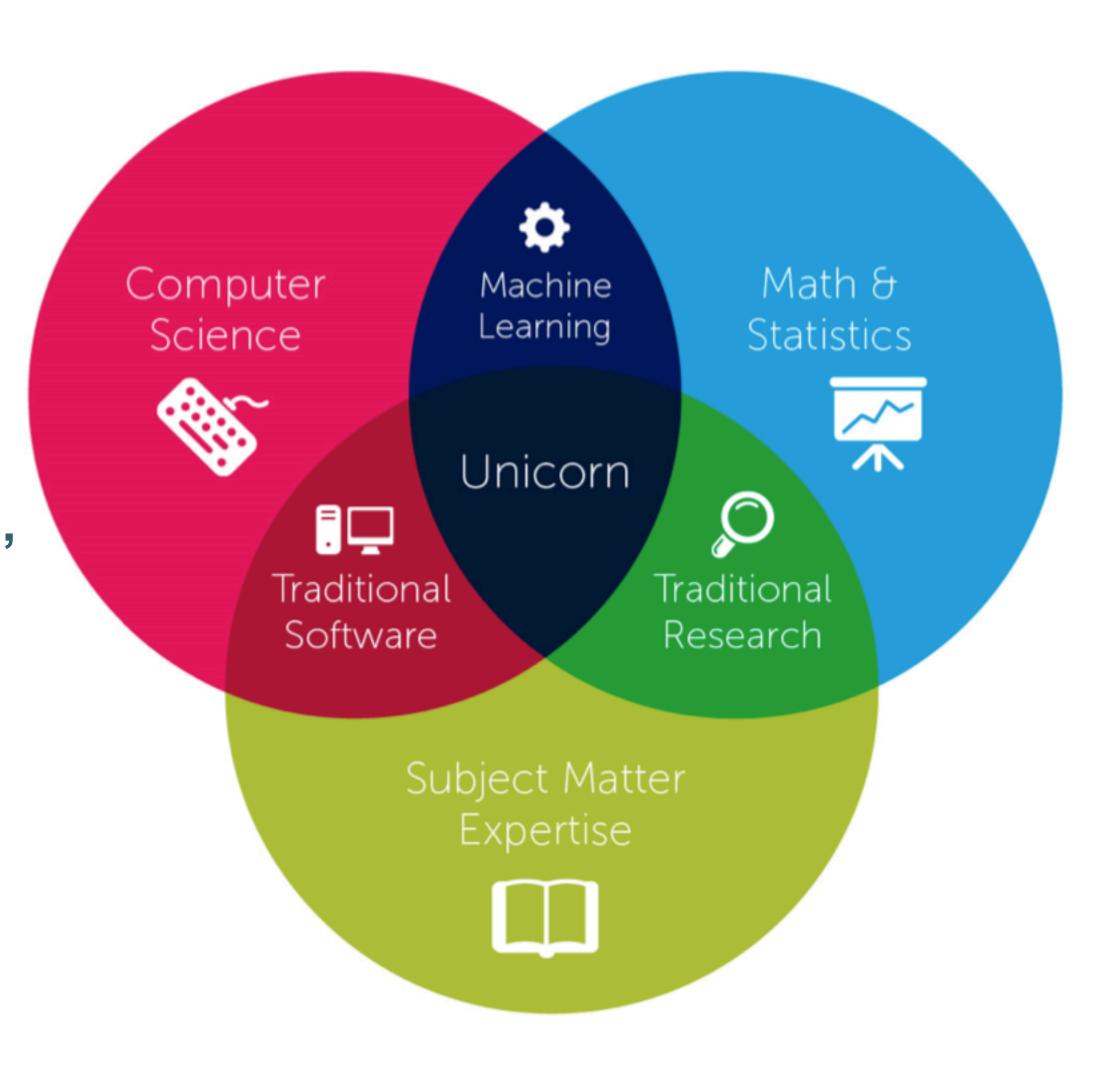


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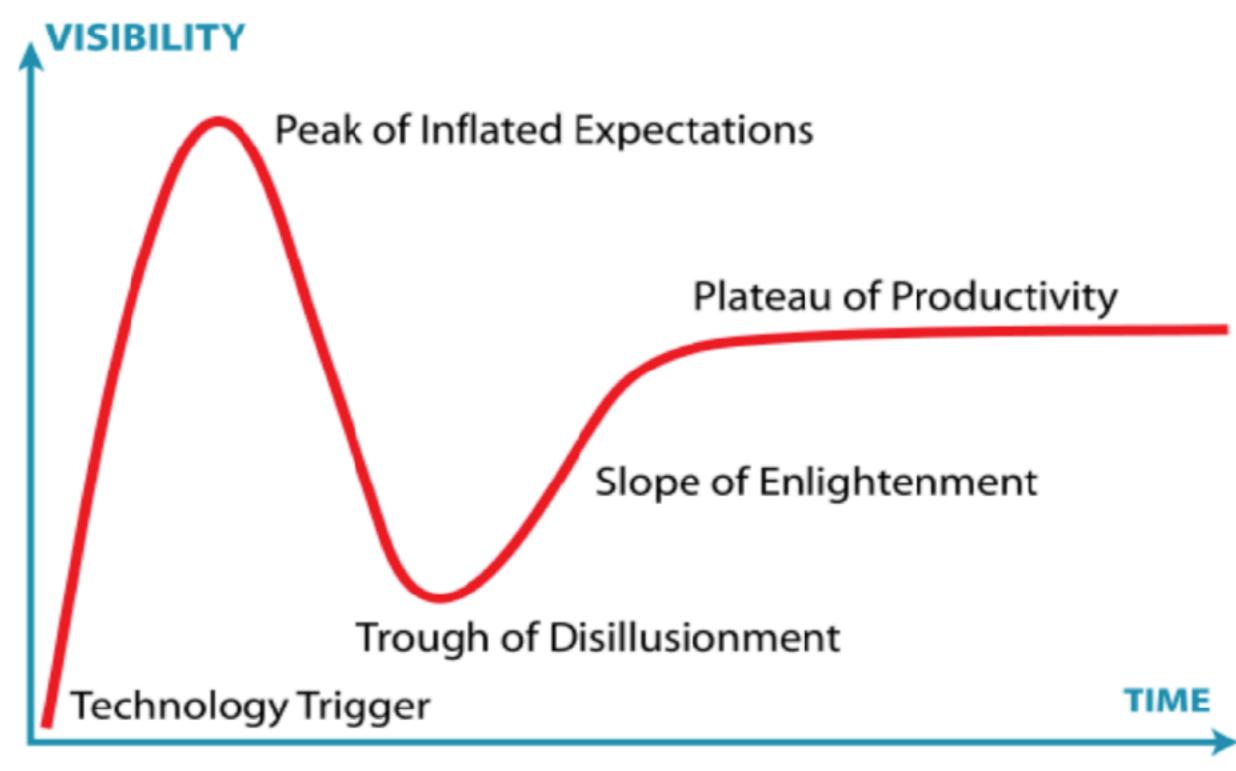
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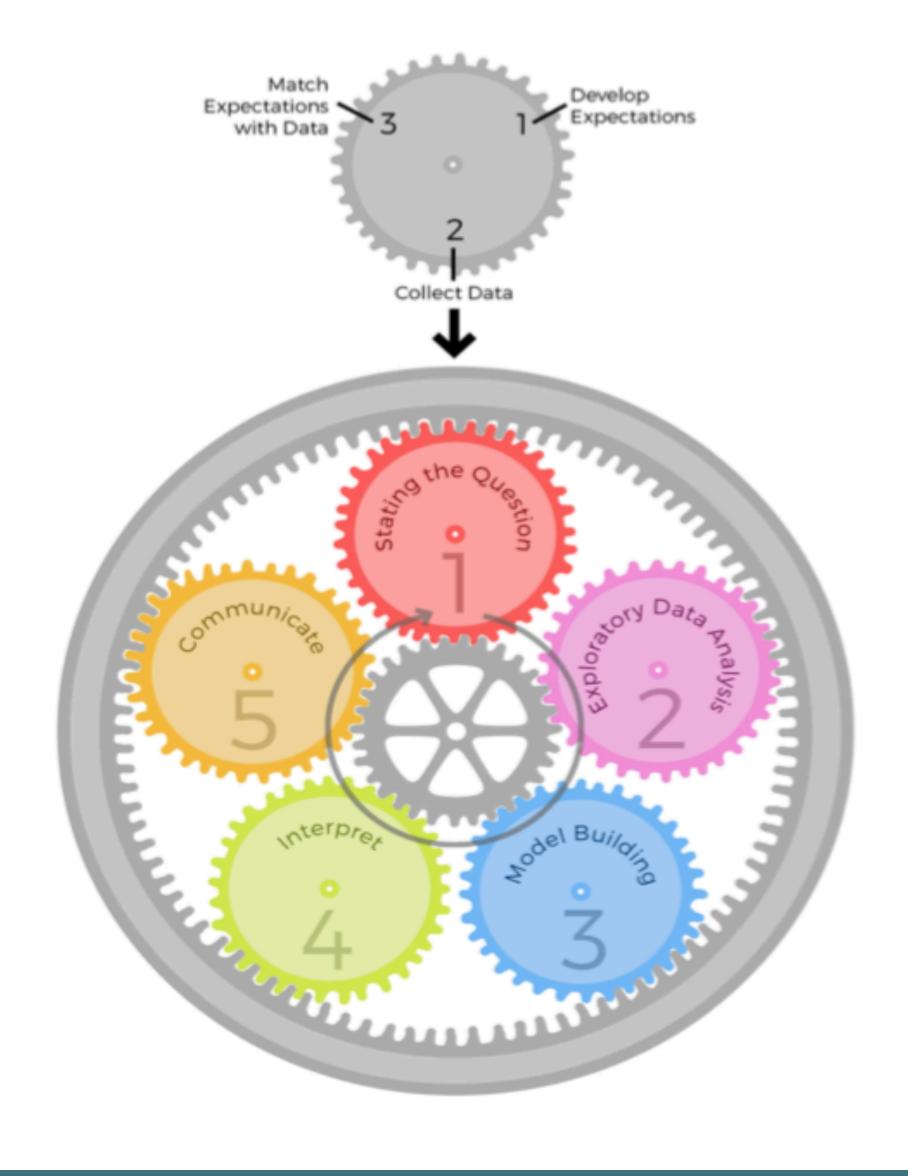
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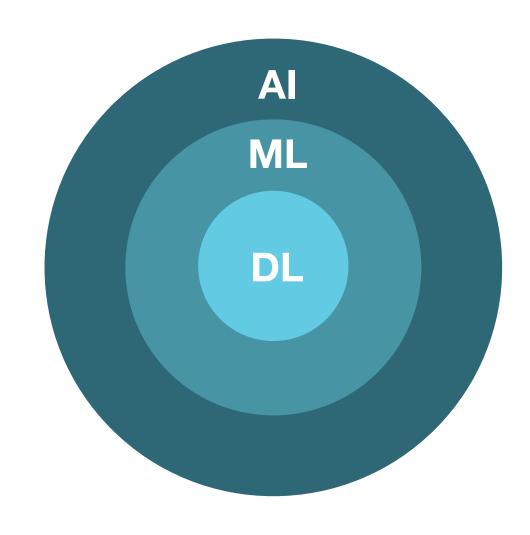
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Common features to detect stress are: heart rate (variability), skin conductance level and respiration rate.



Question 55:

Which are typical data sources used to rank hotels?



Question 55:

Which are typical data sources used to rank hotels?

Trivago uses the following data sources to rank hotels:

- Hotel meta-data (location)
- Ratings (star rating, cleanliness, breakfast, etc.)
- Facilities (laundry, room service, pool, etc.)
- Images (hotel / surroundings)
- Personal click behaviour (how the user interacted on the site)





That was it!

In other words, time to showcase your memorisation super powers (or just insert these (171!) slides as back-up slides..)

Anyhow, good luck!

