Introduction to Data Science

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What is Data Science?

Who is a Data Scientist?

What's it like to be a Data Scientist?

Mathematics and Statistics / Operational Research

Computing and Software Engineering

Visualisation and Communication Skills

Domain expertise

A problem-solving approach based on the scientific method

What does Data Science deal with?

Problems!

Can we improve...

- The quality of offers we send to our customers?
- Road safety?
- How we identify people at high risk of cancer?

What does Data Science deal with?

Predictions?

How likely...

- Is a customer to respond to some offer?
- Are traffic accidents to occur in a certain area?
- Is a person to develop cancer in the next 10 years?

What does Data Science deal with?

Mechanisms?

Why...

- Does a customer decide to respond to some offer?
- Do traffic accidents occur regularly in certain areas?
- Do people develop cancer?

Statistics

- Predates computers
- Understand why something happens in the face of uncertainty

Machine Learning

- 'Algorithmic modelling' (L. Breiman)
- Computers can learn rules without explicit programming

Deep Learning

- Less structured inputs
- Computers can learn structure without explicit programming

Analysis Descriptive Discriptive What's happening? Why is

Mechanisms

DiagnosticWhy is it happening?

Building

PredictiveWhat's likely to happen?

Predictions

PrescriptiveWhat do I need to do?

Recap

Data Science is...

- Evidence-based problem solving and decision-making
- Multidisciplinary but domain-driven
- Analysis-focused or building-focused

Who is a Data Scientist?

Who is a Data Scientist?

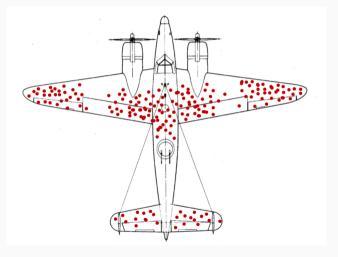
Someone who can...

- Get a 'feel' for the data
- Communicate effectively
- Work well in a team

What's this 'feel' for the data?

- Passion for the domain
- Curiosity about the data
- Intuition and creativity
- Common sense
- Rigour and accuracy
- Relevance

What's this 'feel' for the data?

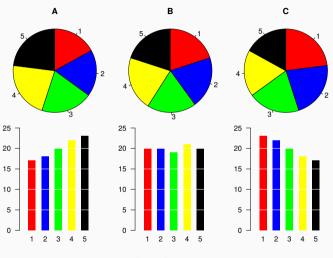


Via Wikimedia Commons

How do I communicate effectively?

- Condense findings into recommendations
- Use storytelling techniques and visual aids
- Understand limitations and don't overstate results

How do I communicate effectively?



Via Wikimedia Commons

The 'PR problem' of Data Science

Inevitably the data are...

- Not quite what you need to solve your problem
- Too limited, too large, too inaccurate, too expensive to obtain...

But (eventually) you...

- End up with a 'nice' dataset
- Apply some models

...and it looks incredibly easy from the outside!

What's it like to be a Data Scientist?

Data Science workflow

- 1. Define the problem
- 2. Obtain the data
- 3. Clean and explore the data
- 4. Model the data
- 5. Summarise the results

Time allocation

Which takes longer?

Time allocation

In decreasing order...

- 1. Defining the problem
- 2. Obtaining the data
- 3. Cleaning and exploring the data
- 4. Managing expectations
- 5. Summarising the results
- 6. Learning new things
- 7. Modelling

Modelling misconceptions

Most well-executed data science projects don't...

- Use complicated tools
- Fit complicated models

Instead, they do...

- Focus on solving the problem
- Use appropriate not necessarily big! data
- Use relatively standard models
- Interpret results sceptically

The 80—20 rule of modelling

- The first reasonable thing you can do goes 80% of the way
- Everything after that is to get the remaining 20%... often at additional cost!

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Is it worth it?

Caveat

The Data Science workflow is non-linear and iterative

Recap

A successful Data Scientist...

- Is insatiably curious and a bit stubborn!
- Never stops learning
- Is a practical, impact-driven, dependable person
- Can tell a story
- Knows the limitations of Data Science