

#### **Machine Learning**

Introduction

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- "I had a talk with my daughter, It turns out there's been some activities in my house I haven't been completely aware of.
   She's due in August. I owe you an apology"

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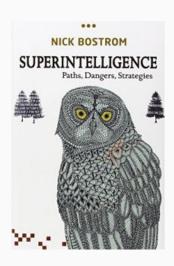
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- Bill Gates, January 2015

"Artificial intelligence could wipe out humanity when it gets too clever as humans will be like ants."

- Prof. Steven Hawking, The Independent, October 2015

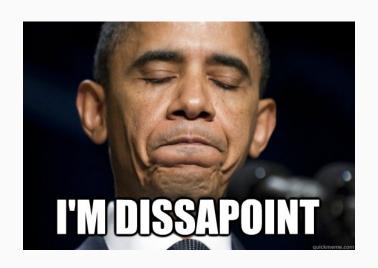
#### **Nick Bostrom**

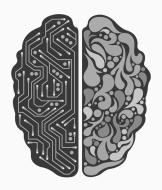


#### Nick Bostrom









## Artificial Intelligence

#### Work



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#### Work



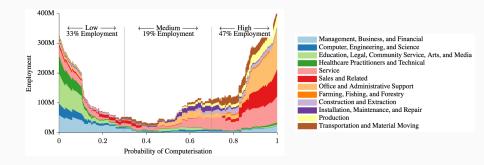
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11% of the Detroit workforce is generating 30 times as much wealth in SF

#### Work [1]

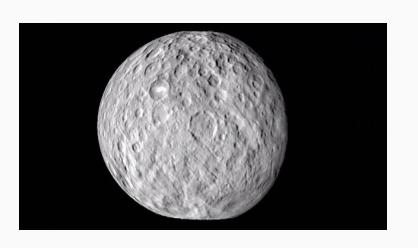


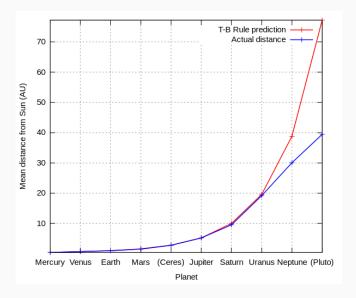


## Machine Learning

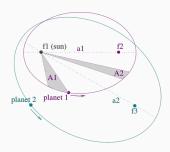
### Introduction





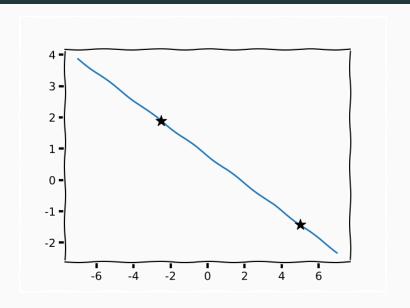


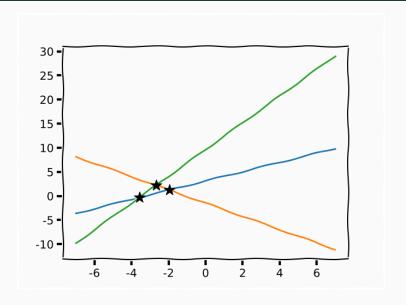
#### Keplers Law's

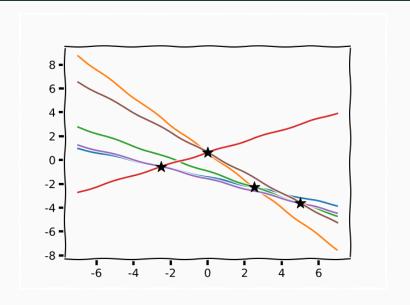


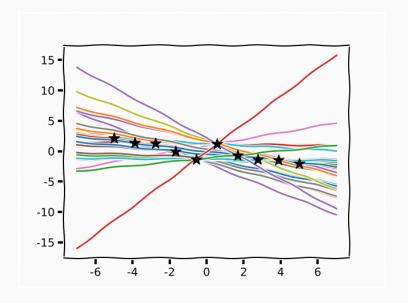
#### Gauss

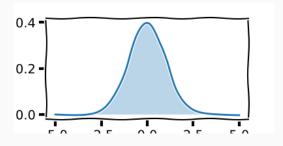












$$y = f(x) + \epsilon$$
$$\epsilon \sim \mathcal{N}(0, I)$$

#### Laplace Demon [2]



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#### Laplace's Demon [2]

An intelligence which at a given instant knew all the forces acting in nature and the position of every object in the universe - if endowed with a brain sufficiently vast to make all necessary calculations - could describe with a single formula the motions of the largest astronomical bodies and those of the smallest atoms. To such an intelligence, nothing would be uncertain; the future, like the past, would be an open book.

#### Laplace Demon [2]

All these efforts in the search for truth tend to lead the mind continously towards the intelligence we have just mentioned, although it will always remain infinetly distant from this intelligence.

# 



#### Halley's Comet



- 1531, 1607 and 1682
- In 1705 predicted 1758
- Died 1742

"Came in with Halley's Comet in 1835. It is coming again next year and I expect to go out with it."

Mark Timin 1000

- Mark Twain, 1909

• 90% of all stored information was created the last two years

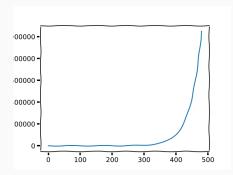
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- We create 10<sup>19</sup> bytes of "data" every day
- more facts that are beyond grasp

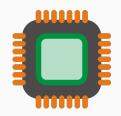
# Compute





$$p(H|\mathcal{D}) = \frac{p(\mathcal{D}|H)p(H)}{p(\mathcal{D})}$$









**Machine Learning** 

# SPS

### Model

$$p(y|\theta)p(\theta)$$

- A statistical description of the world that you can "hallucinate"/generate data from
- An abstraction or simplification of the world

# The World



# **Bristol City**

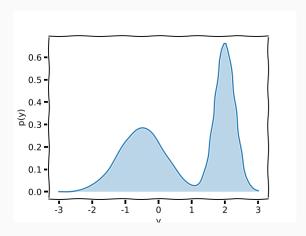


# **Bristol City**



y = Bristol Goals - Opponent Goals

### Structure

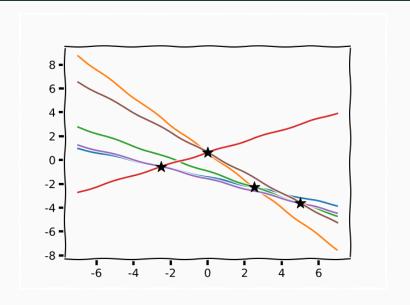


• A structure to the future under uncertainty is an assumption

# **Assumptions**



# Least Square



# Machine Learning<sup>1</sup>

$$\mathsf{Data} + \mathsf{Model} \to \mathsf{Prediction}$$

### Inference

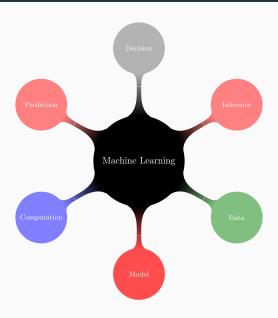
$$p(\theta|y) = \frac{p(y|\theta)p(\theta)}{p(y)}$$

 how can we update our belief/assumption in the presence of data/examples/observations

### Inference



# Machine Learning



# COMS30007

### Lectures

### Part I (3 lectures)

- What is learning (SPS)
- Basic probability (SPS)

### Part II (8 lectures)

- modelling
- mathematical formulation of assumptions

### Lectures

### Part III (3 lectures)

- Inference
- How do we fit models to data?
- Three different approaches

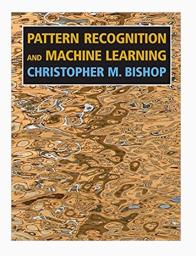
### Part IV (5 lectures)

- Summary of unit
- Material outside the assessed material
- Practical machine learning



http://www.reddit.com/r/coms30007/

# The Book [3]



Bishop, C. M., Pattern recognition and machine learning (information science and statistics) (2006)

### **Assignments**

- Modelling 35%
  - Linear regression
  - Non-linear & non-parametric regression
  - Unsupervised learning
  - Evidence
- Inference 15%
  - sampling/stochastic inference
  - variational inference
  - amortised inference

# Labs



### **Feedback**



### Exam

- Multiple choice
- understanding
- conceptual aspects
- 50% of grade

# Webpage



https://carlhenrikek.github.io/COMS30007/

# Summary

### Summary

- Learning can only be done by assumptions
- Machine learning is the science for making "handles" to incorporate assumptions
- We will learn mathematical formulations of assumptions
- We will learn mathematical tools for updating assumptions from data

eof

# References



The future of employment: How susceptible are jobs to computerisation?

Technological Forecasting and Social Change, 114:254–280, January 2017.

Pierre Simon Laplace.

A philosophical essay on probabilities, 1814.

Christopher M. Bishop.

Pattern Recognition and Machine Learning (Information Science and Statistics).

Springer-Verlag New York, Inc., Secaucus, NJ, USA, 2006.