## Introduction

- Introduction
  - Course Materials
  - Time-table
  - Software
  - References
  - Getting Help
- 2 Data Science
  - What is Data Science?
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  - Course Materials
  - Time-table
  - Software
  - References
  - Getting Help
- Data Science
  - What is Data Science?
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### Canvas

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- Introduction
  - Course Materials
  - Time-table
  - Software
  - References
  - Getting Help
- Data Science
  - What is Data Science?
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  - How?

## Lectures & Tutorials

Class	Days	Time	Venue
Lecture	Tue & Fri	8 – 10 AM	LT 28
Tutorial	Fri	9 - 9:45 AM	LT 28 <sup>1</sup>

• Tutorial attendance is graded.

- Introduction
  - Course Materials
  - Time-table
  - Software
  - References
  - Getting Help
- Data Science
  - What is Data Science?
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• We are using R in this course. Either RGui or RStudio is accepted.



R

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The test/exam will require the use of R and will contain R output. Hence
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 You will be tested on how to use R to produce the output (numerical/graphical).

- Introduction
  - Course Materials
  - Time-table
  - Software
  - References
  - Getting Help
- Data Science
  - What is Data Science?
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  - How?

### Recommended Book

An Introduction to Statistical Learning with Applications in R
 2nd edition

Authors: Gareth James, Daniela Witten, Trevor Hastie, Robert Tibshirani.

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 Data Science and Big Data Analytics: Discovering, Analyzing, Visualizing and Presenting Data
 2015
 EMC Education Services

- Introduction
  - Course Materials
  - Time-table
  - Software
  - References
  - Getting Help
- Data Science
  - What is Data Science?
  - Why Data Science?
  - How?

## **Asking Questions**

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• Book a time slot for consultation.

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  - Association rules



- Introduction
  - Course Materials
  - Time-table
  - Software
  - References
  - Getting Help
- Data Science
  - What is Data Science?
  - Why Data Science?
  - How?

- Introduction
  - Course Materials
  - Time-table
  - Software
  - References
  - Getting Help
- 2 Data Science
  - What is Data Science?
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## We are generating more data than ever





Fragmented healthcare data impedes collaboration and patient-centered care





# The Data Deluge

https://explodingtopics.com/blog/big-data-stats

High volume of data

Complexity of data types and structures

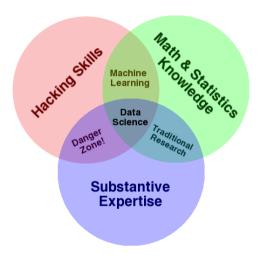
Speed of new data creation and growth

### What is Data Science?

"The ability to take data - to be able to understand it, to process it, to extract value from it, to visualize it, to communicate it - that's going to be a hugely important skill in the next decades, not only at the professional level but even at the educational level for elementary school kids, for high school kids, for college kids. Because now we really do have essentially free and ubiquitous data."

Hal Varian on data in McKinsey commentary

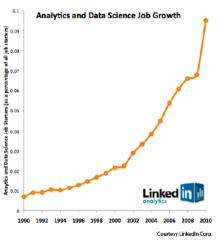
## What makes a data scientist



Drew Conway's Data Science Venn Diagram

- Introduction
  - Course Materials
  - Time-table
  - Software
  - References
  - Getting Help
- 2 Data Science
  - What is Data Science?
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## A Decade ago...





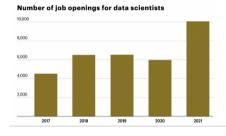
Data Scientist: The Sexiest Job of the 21st Century

by Thomas H. Davenport and D.J. Patil FROM THE OCTOBER 2012 ISSUE

The rise in demand for data science talent via Linkedin analytics (left) and Harvard Business Review (right)

## In 2022

# How demand for data scientist roles has grown



Data science is a relatively new field, though the demand for degree programs suggests it's likely here to stay. In the past decade alone, New York University established a Center for Data Science, MTI launched the Institute for Data, Systems, and Society, the University of California–Berkeley inaugurated a Division of Data Science and Information, and Yale University transformed its Department of Statistics into a Department of Statistics into a Department of Statistics into A.

https://fortune.com/education/articles/glassdoors-no-3-best-job-in-the-u-s-has-seen-job-growth-surge-480/

### What hottest tech jobs are paying

	Percentile			
	25th	50th	75th	95th
Cyber-security analyst	\$90,000	\$110,000	\$130,000	\$150,000
Technology risk manager	\$84,000	\$120,000	\$180,000	\$240,000
Data Scientist	\$90,000	\$120,000	\$160,000	\$200,000
Project manager	\$120,000	\$150,000	\$180,000	\$250,000
Software developer	\$90,000	\$120,000	\$144,000	\$180,000

NOTE: Figures are for gross yearly starting salaries.

Source: 2019 ROBERT HALF SALARY GUIDE STRAITS TIMES GRAPHICS

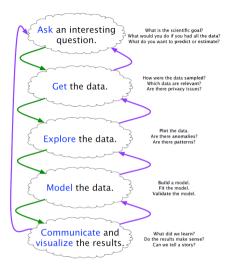




- Urban data
- Health data
- Transport data
- Financial data
- Open data from public agencies

"A Smart Nation is one where people are empowered by technology to lead meaningful and fulfilled lives. Through harnessing the power of networks, data and info-comm technologies, we seek to improve living, create economic opportunity and build a closer community."

- Introduction
  - Course Materials
  - Time-table
  - Software
  - References
  - Getting Help
- Data Science
  - What is Data Science?
  - Why Data Science?
  - How?



The data science process by Hanspeter Pfister, Joe Blitzstein and Verena Kaynig (http://cs109.org)

## Our Interest is in Population

#### Definition 1

The **population** is the total set of subjects in which we are interested. A **sample** is the subset of the population for whom we have, or plan to have, data for. This subset is often randomly selected.

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The **population** is the total set of subjects in which we are interested. A **sample** is the subset of the population for whom we have, or plan to have, data for. This subset is often randomly selected.

How we select our sample affects what population we can generalize the results to.