



# Introduction

to the Data Analytics Course

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Faculty of Engineering
King Mongkut's Institute of Technology Ladkrabang

## Agenda

- About this Course
- Data Analytics

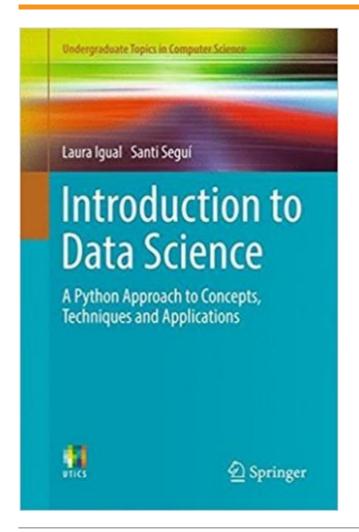
# About this Course

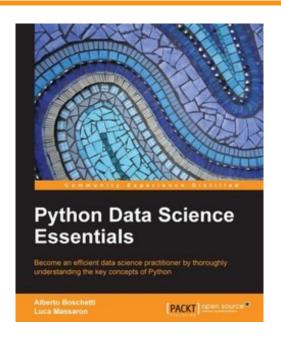


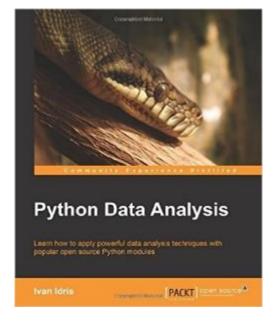
#### Course Outline

- Introduction
- Python for DA
- Data Exploration
- Data Processing
- Regression Analysis
- Classification Analysis
- Cluster Analysis
- Recommender System
- Visualization

#### Books



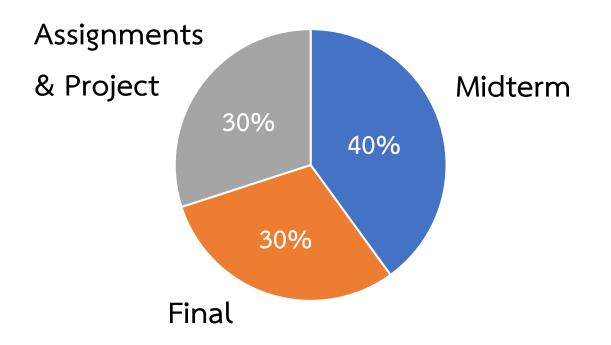






http://www.springer.com/gp/book/9783319500164

## Grading (Plan)



Score	Grade
≥ X	А
	B+
7	В
	C+
	С
	D+
	D
< Y	F

#### Tools

#### Anaconda

Language: Python

• Package: NumPy, SciPy, Pandas, Scikit-learn, ...., etc.

• IDE: Spyder, Jupyter

Download:

https://www.anaconda.com/download/

# Data Analytics



### Questions?

How much is the price of 1 acre of land in this area?

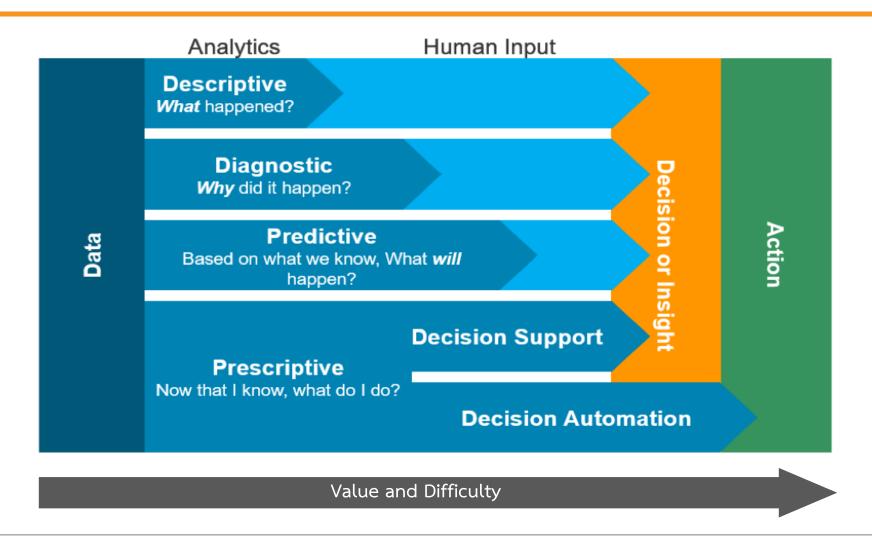
How to commute from here to Icon Siam at 8:00?

Will this be a flu or not?

If the customer has already bought this item, which products should be recommended next?

Where should the gas station be opened?

### Data Analytics



Ref:

- Four types of analytics capability (Gartner, 2014)
- (image) https://www.healthcatalyst.com/closed-loop-analytics-method-healthcare-data-insights

### Descriptive Analytics

Descriptive analytics is the interpretation of historical data to better understand changes that have occurred in a business. Descriptive analytics describes the use of a range of historic data to draw comparisons.



### Descriptive Analytics

#### **Questions:**

- Which are the best-seller products?
- Which are the most or least revenue-generating products?
- Which are the most successful promotional campaigns?
- Who are the most paying customers?
- What are revenue trends for each Strategic Business Unit (SBU) of last N years, last N months?

### Descriptive Analytics

### Techniques:

Ref:

- Exploratory Data Analysis
- Measure of the Shape of the Distribution
- Measure of Data Summary
- Measure of Variability or Dispersion
  - Standard Deviation, Interquartile Range, Range
- Measure of Central Tendency
  - Mean, Median, Mode, Min, Max

13

### **Predictive Analytics**

Predictive analytics is the practice of extracting information from existing data sets in order to determine patterns and predict future outcomes and trends.

Predictive analytics does not tell you what will happen in the future.



### **Predictive Analytics**

#### Questions:

- What is going to be likely revenue for each SBU in coming year?
- What is going to be likely attrition rate for the common year?
- Who all customers are likely to churn-out?
- Which promotional campaigns are likely to do well?
- Which products are likely to sell most in the next 6 months?

### **Predictive Analytics**

### Techniques:

- Decision Support System
  - Linear Regression
- Classification
  - Decision Tree
  - Logistic Regression
  - Support Vector Machine
  - Artificial Neural Network
  - etc.

### Prescriptive Analytics

Prescriptive analytics is a type of data analytics—the use of technology to help businesses make better decisions through the analysis of raw data. Specifically, prescriptive analytics factors information about possible situations or scenarios, available resources, past performance, and current performance, and suggests a course of action or strategy. It can be used to make decisions on any time horizon, from immediate to long term.



<sup>•</sup> https://www.investopedia.com/terms/d/descriptive-analytics.asp

### Prescriptive Analytics

#### **Questions:**

Ref:

- What world be the best channel to sell this product?
- Which of the supplier suggested promotions of adopt?
- What new or replacement items to introduce, and when?
- Ho to modify the overall product assortment for each category?
- What's the next promotion that I can offer to this customer segment?
- What is the best route from the point A to B?

### Prescriptive Analytics

### Techniques:

- Decision Support System
- Recommender System
- Search Engine
- Route and Direction Recommendation
- Chatbot

### ??? Analytics ???

- What was the popular product last month?
- What is the average revenue of this product?
- What will be the revenue of the next quarter?
- Which products should be promoted next month?
- Which products should be stopped selling?
- Which place should we promote this product?
- Which products will we recommended to our customers?
- Will the customers cancel their orders?

Ref:

# When you have a question!



### OK?

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Ref: • (image) URL

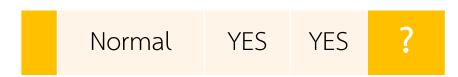
## Example: a small dataset

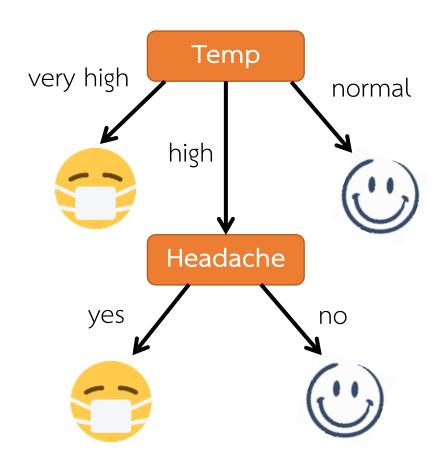
#	Body Temperature	Headache	Nausea	FLU?
1	high	yes	-	yes
2	very high	yes	yes	yes
3	normal	-	-	-
4	high	yes	yes	yes
5	high	-	yes	-
6	normal	yes	-	-
7	normal	-	yes	-

Normal	YES	YES	?
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## Example: a small dataset

#	Body Temp	Headache	Nausea	FLU?
1	high	yes	-	yes
2	very high	yes	yes	yes
3	normal	-	-	-
4	high	yes	yes	yes
5	high	-	yes	-
6	normal	yes	-	-
7	normal	-	yes	-





## In this age

# Much Data → High Accuracy

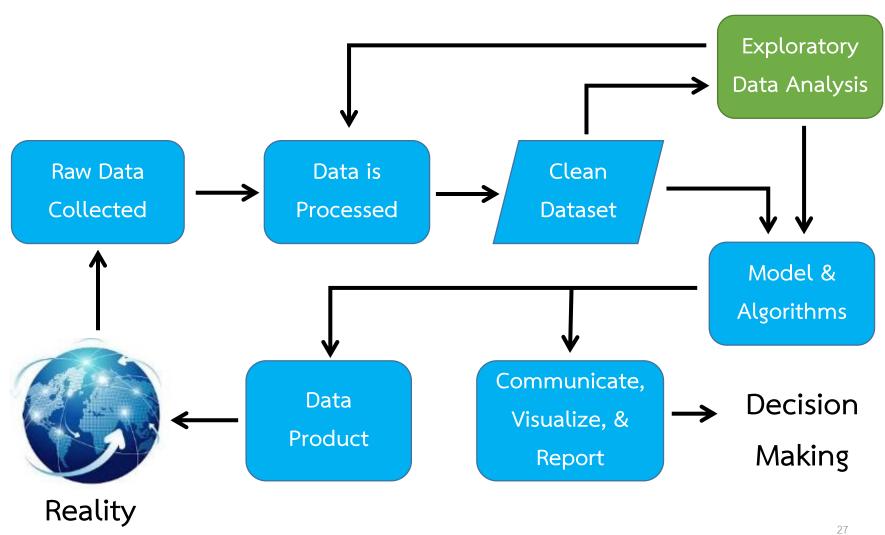
### Much Data → Headache

(Then, let's use Computers)

### Data Science

Data science, also known as data-driven science, is an interdisciplinary field about scientific methods, processes and systems to extract knowledge or insights from data in various forms, either structured or unstructured, similar to Knowledge Discovery in Databases.

### Data Science Process



### Weather Forecast



Ref: • (image) Google.com

#### amazon

#### Frequently Bought Together



Total price: To see our price, add these items to your cart. Why don't we show the price?

Add both to Cart

Add both to List

- [ These items are shipped from and sold by different sellers. Show details
- This item: Sony KDL40W650D 40-Inch 1080p Smart LED TV (2016 Model)
- ✓ Cheetah Mounts APTMM2B TV Wall Mount for 20-75-Inch TVs Bundle with 10-feet Braided HDMI Cable and a... \$24,95

#### **Customers Who Bought This Item Also Bought**



Uitra High Speed HDMI Cable 1080p Cable for HDTV, Blu-Ray, PS3 (6 feet)

★★★★☆ 340 \$12.20



VideoSecu ML531BE TV
Wall Mount for most
22\*-55" LED LCD Plasma
Flat Screen Monitor up to
88 lb VESA 400x400...





VideoSecu TV Wall Mount Tilt Low Profile Ultra Slim Television Mount Bracket for Most 20"- 47" LED... \$25 688 \$10.99 \$Prime





With 10-feet Braided.
14,193
15 Best Seer in
Bectronics Mounts
524.96 Prime



Page 1 of 7



**Ref:** • (image)

image) Amazon.com

### YouTube

#### Recommended



How the blockchain will radically transform the...

TED 🖾

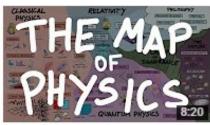
126,953 views • 2 months ago



How to gain control of your free time | Laura Vanderkam

TED 🖾

404,362 views • 3 weeks ago



The Map of Physics

DominicWalliman 604,613 views • 3 months ago



สามก๊ก 2010 ตอนที่ 22 (28 กุมภาพันธ์ 2560)

สามก็ก 2010 TH 165 views • 2 hours ago



The Future of Data Science -Data Science @ Stanford

Stanford 48,516 views • 1 year ago



จักรวรรดิมองโกลผู้พิชิตโลก จาก ยุคเริ่มต้นถึงล่มสลาย

SFG Unicorn 38,487 views • 7 months ago



10 อันดับสุดยอดขุนศึกในยุคสาม กัก by CHERRYMAN

CHERRYMAN 96,747 views • 3 weeks ago

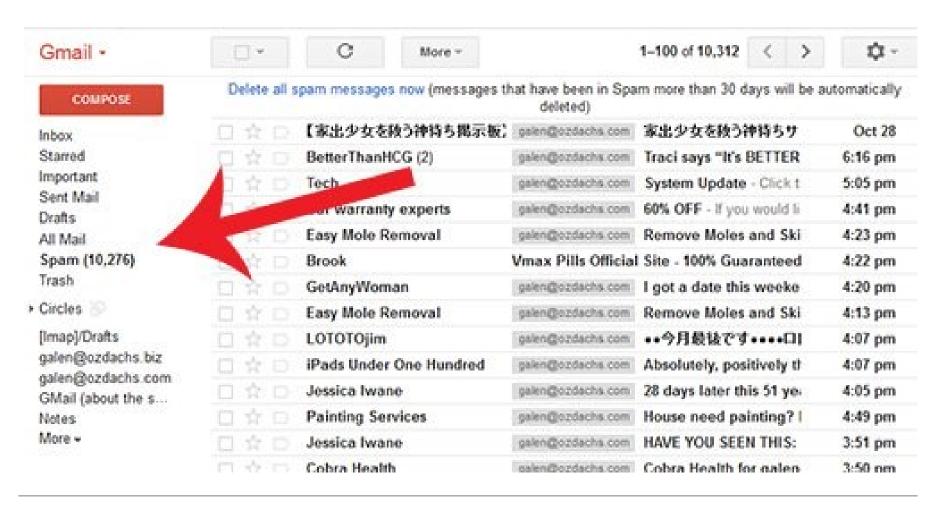


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Suppakit Thongdee 5,859 views • 1 year ago

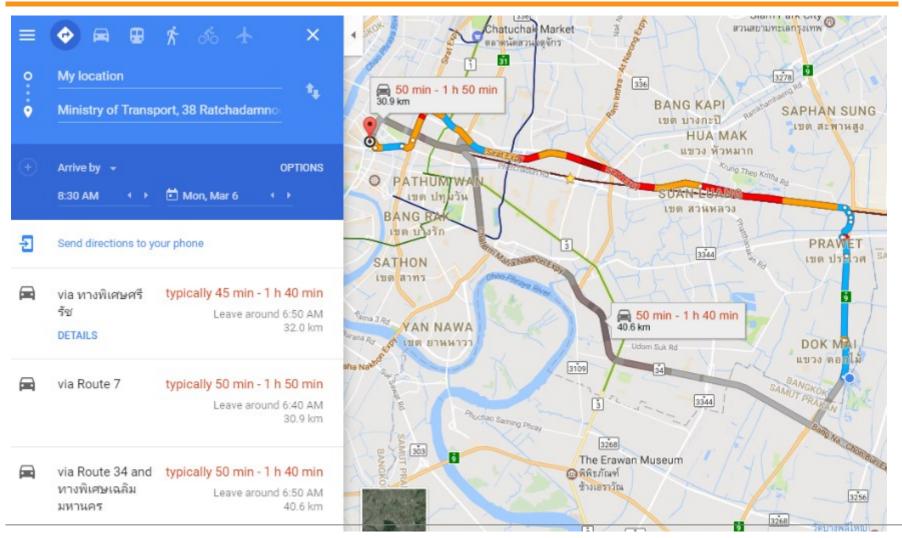
Ref: • (image) Youtube.com

### **Gmail**



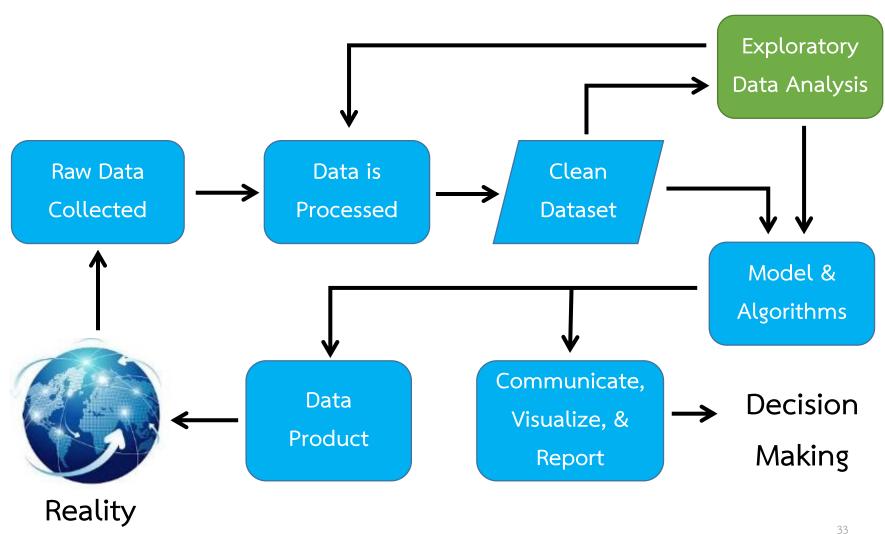
**Ref:** • (image) mail.google.com

## Google Map



Ref: • (image) map.google.com

### Data Science Process



# Reality





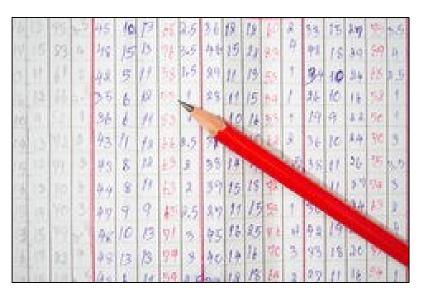








### Raw Data Collected

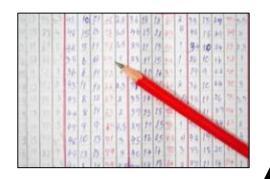


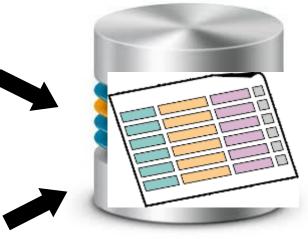


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2	4h 37m	mail.google.com/a/	Comm (Email)	all-comm google-apps work	[edit]
3	3h 31m	Photoshop	Design/Presentation	design webdev work	[edit]
4	2h 36m	mail.google.com	Comm (Email)	all-comm google-apps work	[edit]
5	1h 30m	news.ycombinator.com	News/Blogs	personal	[edit]
6	1h 23m	twitter.com	Social Networking	personal social	[edit]
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9	36m 3s	google.com/reader	News/Blogs	google-apps work	[edit]
10	34m 58s	deck.rescuetime.com	Dev Tools	design webdev work	[edit]
1 to 10	0 of 212 - 10	per page	<< prev 1 2 3 4 5 21 2	2 next>>	Export to CSV

### Data is Processed





Machine-Readable Format

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	Time	App /Site (11x 18)	Category	Tags	bulk edit
1	80-40 m	Enpareneparign	DevToels	welconwork.	3690
2	4h 37 m	mail.google.com/al	Comm (Simall)	ali-commigosgle-apps wark	[edd]
3	3h 31m	Pheloshop	Design/Fresentation	design vehicles verk	[edi]
4	2h 36 m	mail.google.com	Comm (Dmail)	ali-commigospie-apps wark	[ed]
5	11:30m	news your binatocom	News/Blogs	personal	(44)
8	16-23m	Selborcom	Social Networking	personal social	(446)
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1361	of212- 10	★ beckels	ocator 1 2 3 4 5 21 2	2 ment in	Врениоск

- (content) URL
- (image) URL

### Data is Processed

Merge Data Sets into the same format

Rebuild Missing Data with appropriate values

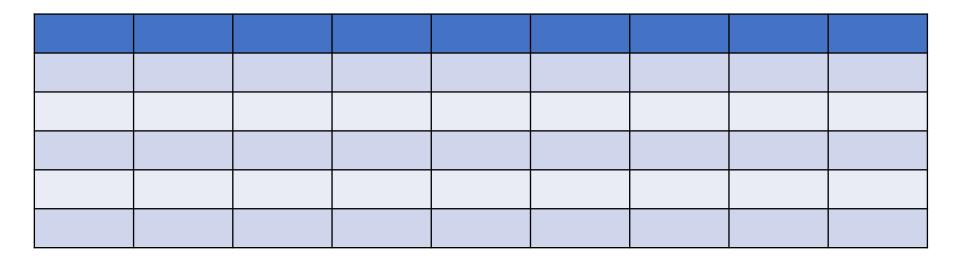
Standardize e.g. same column name

Normalizee.g. same date format

De-Duplicated

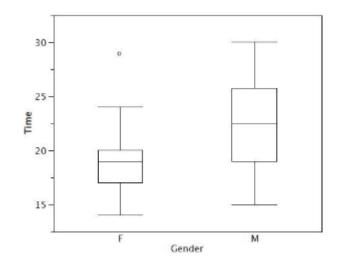
Verify & Enrich e.g. update the salary values

### Clean Dataset



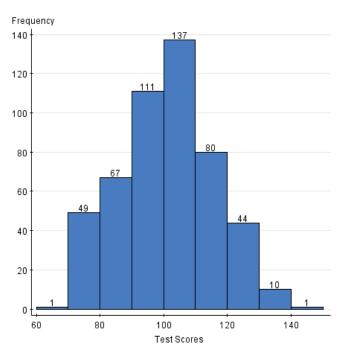
- Good Format
- Good Shape
- Ready for Data Analysis

## **Exploratory Data Analysis**



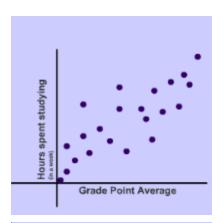
**Box Plot** 

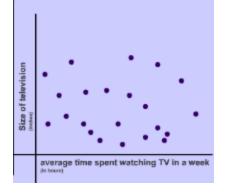
ความเร็วในการบอกชื่อสีที่เห็น ระหว่างผู้หญิงกับผู้ชาย



Histogram

คะแนนสอบ กับจำนวนผู้ที่ได้คะแนน





Scatter plot

ดูความสัมพันธ์

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## Model & Algorithms

#### Algorithm

a process or set of rules to be followed in calculations or other problem-solving operations, especially by a computer.

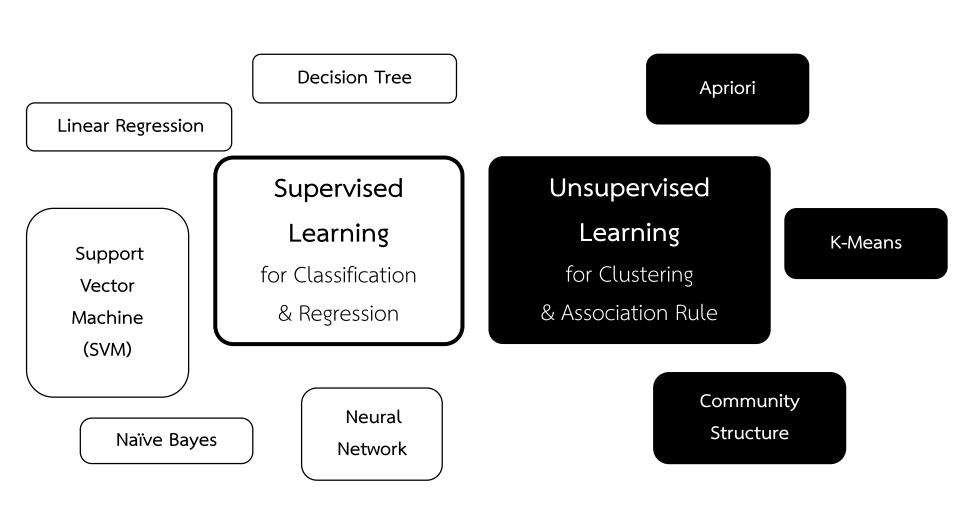
#### Model

A model is a computation or a formula formed as a result of an algorithm that takes some values as input and produces some value as output.

### Example

- Model: Decision Tree with structure
- Algorithm: A process to build an accurate decision tree

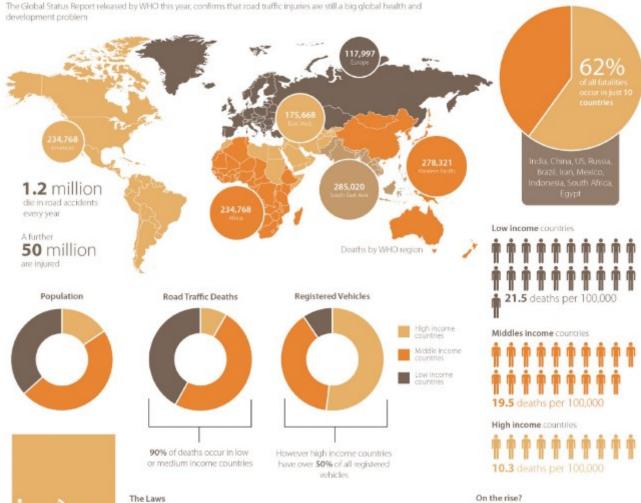
## Model & Algorithms (Example)



# Communicate, Visualize, & Report

#### Road Traffic Accidents: The Modern Killer







Only 49% of countries stipulate a legal blood alcohol concentration limit of less than 0.05g per decilitre



Only 57% of countries requires seatbelts to be used by passengers



Only 40% of countries have a comprehensive helmet law and require helments to be of a specific standard

Road traffic accidents are predicted to rise to the 5th leading cause of death by 2030, higher than AIDS, lung cancer and diabetes



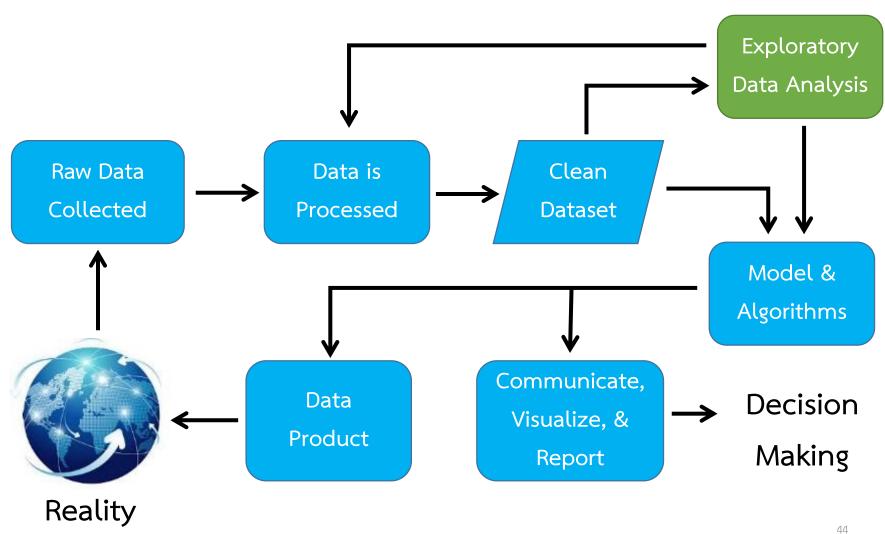
number 1 killer for 15-29 year-olds

### **Data Product**

A Product that is mainly produced by data analytics

- Amazon : Recommendation Engine for recommending next products
- Netflix : Recommendation Engine for recommending next movies
- Gmail : Spam filter for identifying junk emails
- Self-Driving Car: to drive to the destination by understanding traffic signs and traffic conditions in realtime.

### Data Science Process



### **MODERN DATA SCIENTIST**

Data Scientist, the sexiest job of 21th century requires a mixture of multidisciplinary skills ranging from an intersection of mathematics, statistics, computer science, communication and business. Finding a data scientist is hard. Finding people who understand who a data scientist is, is equally hard. So here is a little cheat sheet on who the modern data scientist really is.

#### MATH & STATISTICS

- ☆ Machine learning
- ☆ Statistical modeling
- ☆ Experiment design
- ☆ Bayesian inference
- Supervised learning: decision trees, random forests, logistic regression
- ☆ Unsupervised learning: clustering, dimensionality reduction
- ☆ Optimization: gradient descent and variants

#### PROGRAMMING & DATABASE

- ☆ Computer science fundamentals
- ☆ Scripting language e.g. Python
- ☆ Statistical computing package e.g. R
- ☆ Databases SOL and NoSOL
- ☆ Relational algebra
- ☆ Parallel databases and parallel query processing
- ☆ MapReduce concepts
- ☆ Hadoop and Hive/Pig
- ☆ Custom reducers
- ★ Experience with xaaS like AWS

#### DOMAIN KNOWLEDGE & SOFT SKILLS

- ☆ Passionate about the business
- ☆ Curious about data
- ☆ Influence without authority
- ☆ Hacker mindset
- ☆ Problem solver
- ☆ Strategic, proactive, creative, innovative and collaborative

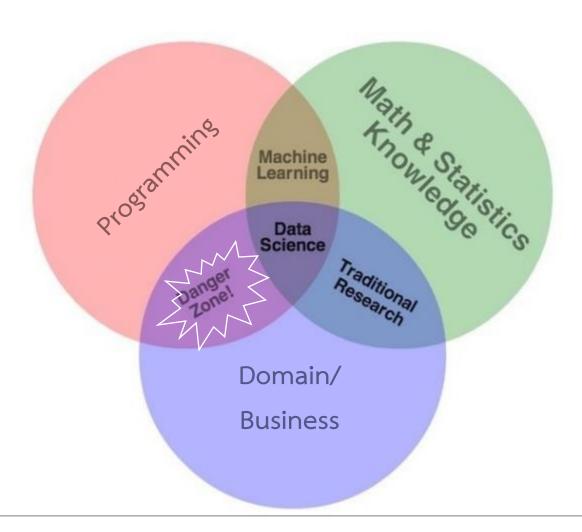


- Able to engage with senior management
- ☆ Story telling skills
- ☆ Translate data-driven insights into decisions and actions
- ☆ Visual art design
- ☆ R packages like ggplot or lattice
- Knowledge of any of visualization tools e.g. Flare, D3.js, Tableau





### One Last Thing





The goal is to turn data into information, and information into insight.

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Carly Fiorina