Introduction to Data Science

Data Science Program



Outline

- Data Science Challenges
- Data Science Workflow
- Data Science Roles
- Group Assignment



What is Data Science?

And, why it is important skill nowadays?



What is Data Science?

What is it?

- Is it a Role or Position?
- Is it a Process?
- Is it a problem / challenge?

Correlations to this term:

- Big Data
- Data Driven
- Machine Learning
- AI
- Distributed computing

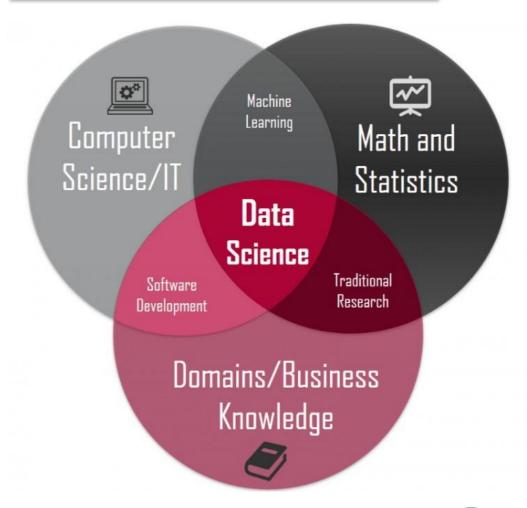


Data Science Definition

- **Data science** is an inter-disciplinary field that uses scientific methods, processes, algorithms and systems to extract knowledge and insights from many **structural** and **unstructured data**.
- Data science is a "concept to unify statistics, data analysis, machine learning and their related methods" in order to "understand and analyze actual phenomena" with data.
- Data science is an interdisciplinary field focused on extracting knowledge from data sets, which are typically large (big data).



Data Science Skill





Machine Learning Definition

- Arthur Samuel (1959). Machine Learning: Field of study that gives computers the ability to learn without being explicitly programmed.
- Tom Mitchell (1998) in his book "Machine Learning" provides a definition:

A computer program is said to **learn** from experience **E** with respect to some tasks **T** and some performance measure **P**, if its performance at tasks in **T**, as measured by **P**, improves with experience **E**.



Machine Learning Analogy

Membuat model Machine Learning (ML) bisa dianalogikan dengan mengajar seorang anak. Misalnya, kita ingin memberikan kemampuan untuk mengenali pohon atau bukan (classification problem).

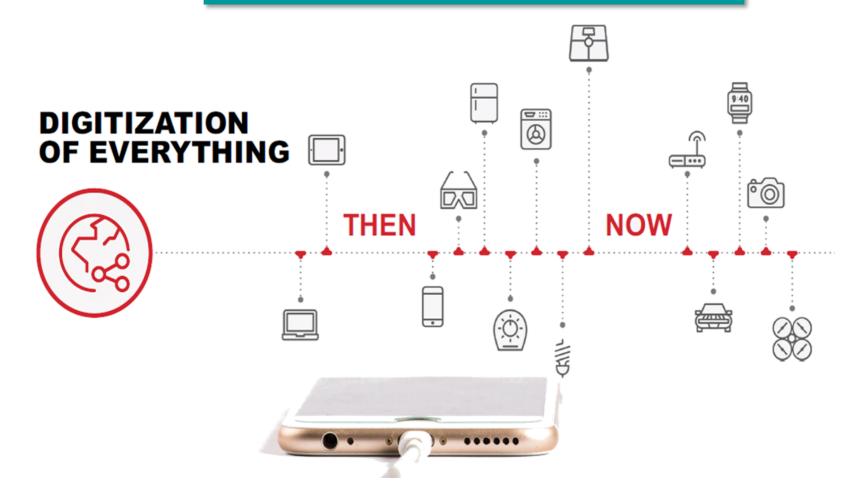
Untuk membentuk kemampuan ini, anak ini diajak ke sebuah taman yang berisi beberapa jenis pohon. Di dalam taman, juga terdapat beberapa benda dan makhluk hidup yang bukan tergolong pohon. Anak ini diberi tahu mana yang termasuk pohon dan mana yang bukan pohon.

Untuk menguji kemampuan anak ini, kita ajak anak ini ke taman lain yang juga berisi pohon dan bukan pohon. Lalu kita uji seberapa tepat anak ini mampu mengenali pohon dan bukan pohon.

Tentu manusia dan mesin berbeda. Manusia memiliki multi-kemampuan. Sedangkan mesin memiliki kemampuan yang terbatas dan tergantung seberapa bagus data yang digunakan untuk belajar (data training).



THE RISE OF INTERNET



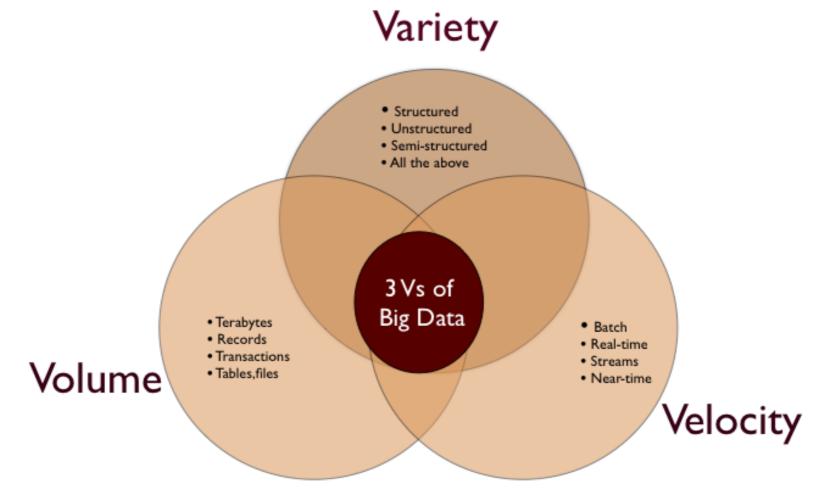


THE RISE OF INTERNET





BIG DATA: 3V





MULTI DISCIPLINARY



We need to understand the PROBLEM

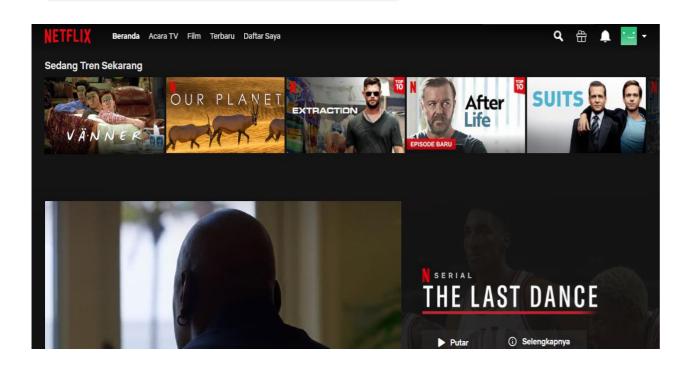
- 1. How the management think
- 2. How the customer think
- 3. How the market shifts





USE CASE:

NETFLIX



Netflix mampu memahami perilaku konsumennya (customer behavior) dengan membaca pola konsumsi konsumen.

Sehingga, rekomendasi film atau series yang ditawarkan oleh Netflix sangat *customize* sesuai dengan preferensi setiap konsumen. Ini satu contoh penerapan *Machine Learning* jenis *Recommender System*.



ANOTHER USE CASES

- Credit Approval
- Customer Churn
- NLP
- House Price Prediction
- Fraud Detection
- Image Recognition
- Etc.



THE QUESTIONS

"Kami mau pasang iklan, tapi tidak tahu channel mana yang paling efektif"

"Ada beberapa produk kami yang tidak laku, walau review sangat bagus"

"Kredit nasabah kami banyak yang macet"

"Stock barang selalu habis/terlalu banyak"

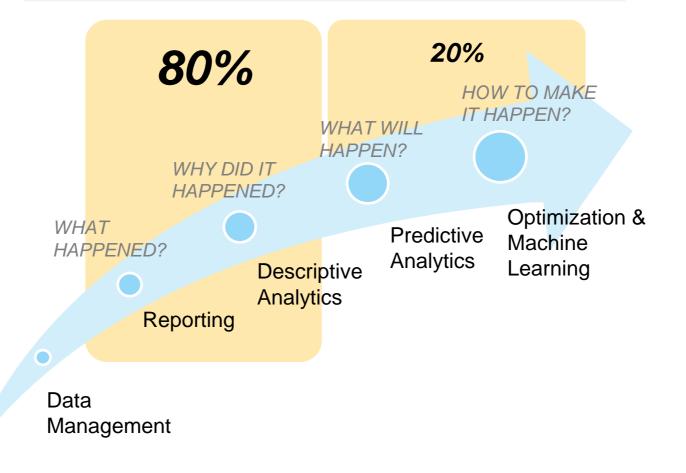
"Kami tidak tahu seberapa efisien sales person kami"



Data Science Challenges



DATA SCIENCE CHALLENGES



Data gathering, restructuring

Extracting information

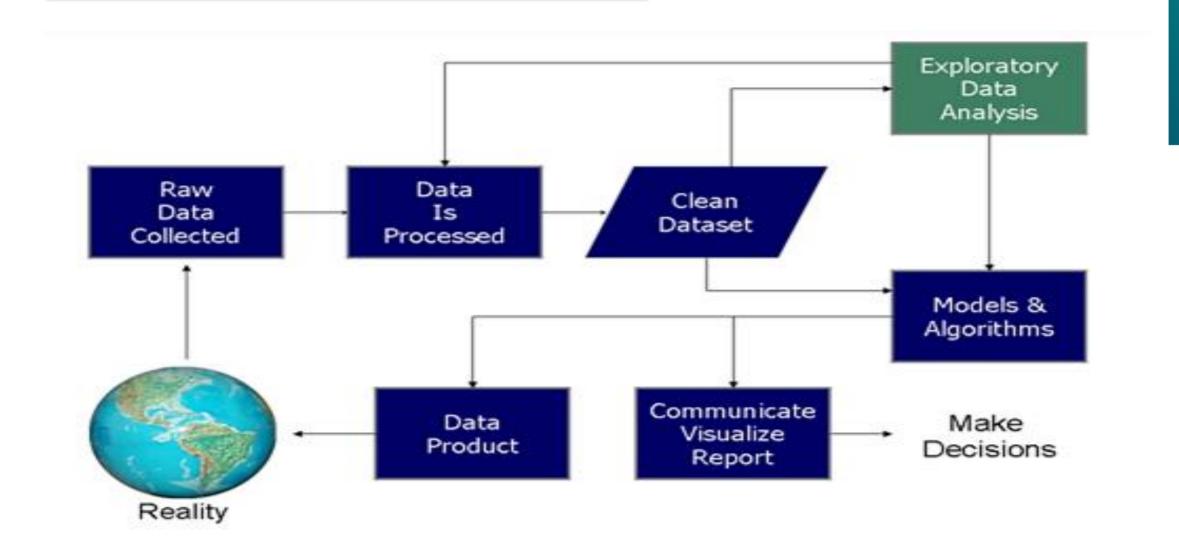


Step to step solving the problems as Data Scientist









Ask Questions

- Who are the customers?
- Why are they buying our product?
- How do we predict if a customer is going to buy our product?
- What is different from segments who are performing well and those that are performing below expectations?
- How much money will we lose if we don't actively sell the product to these groups?



DATA ACQUISITION

What needs to be considered?

- Data Sources
- 2. Data Location
- 3. Data Format
- 4. Data Types
- 5. Acquisition Methods
- 6. Data Privacy



DATA ACQUISITION

Data Sources:

- Users Profile
- Users Activity/Transaction
- Enterprise resources
- World trends/activity

Data Format

- Hard copy
- Digital Documents
- Database
- Streams

Data Location

- Inter Department
- Across Department
- External Data
- Public Data

Data Types

- Numerical
- Text
- Image
- Audio
- Video



Data Access

- Data warehousing
- REST API
- Web scraping

Data Privacy:

- User Consent : User needs to give consent for any usage purposes
- Data Privacy Law :
 - EU General Data Protection Regulation
 - RUU Perlindungan Data Pribadi



DATA PREPARATION

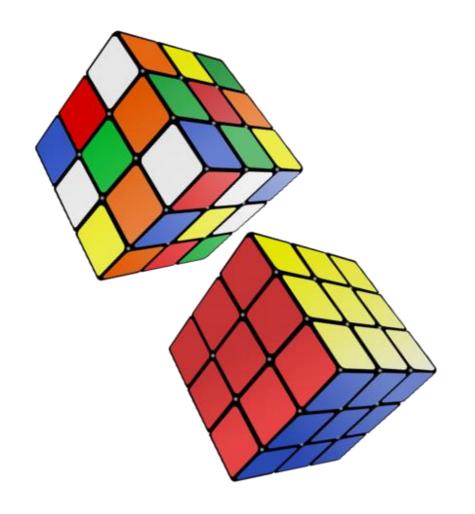
- Data cleansing
 - Format normalization
 - Typing inconsistency
- Handling null values
- Handling outliers
- Feature selection/engineering



DATA ANALYSIS

- Always aim to answer the problem definition
- Identify:
 - Variations
 - Correlations
 - Trends
 - Outliers





Structured Data

Vs

Unstructured Data



Structured Data

Structured data is most often categorized as quantitative data, and it's the type of data most of us are used to working with. Think of data that fits neatly within fixed fields and columns in relational databases and spreadsheets.

Examples of structured data include names, dates, addresses, credit card numbers, stock information, geo-location, and more.

Unstructured Data

Unstructured data is most often categorized as qualitative data, and it cannot be processed and analyzed using conventional tools and methods.

Examples of unstructured data include text, video, audio, mobile activity, social media activity, satellite imagery, surveillance imagery – the list goes on and on.

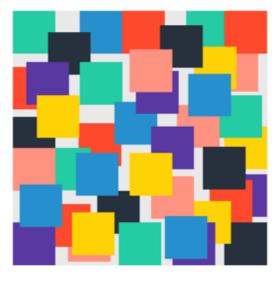


DATA STRUCTURE

Structured data

Database, CRM, ERP

Unstructured data



Text, audio, videos

More than **80 percent** of all data generated today is considered **unstructured**, and this number will continue to rise with the prominence of the internet of things.

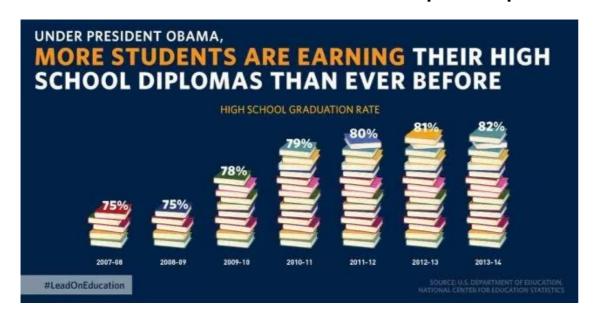
Unstructured data is difficult to deconstruct. Instead, non-relational, or **NoSQL** databases, are best fit for managing **unstructured data**.

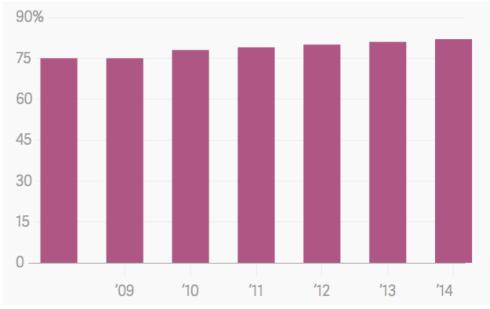
The programming language used for managing **structured data** is called structured query language, also known as **SQL**.



Data Visualization

- Know the audience
- Visualization is all about perception

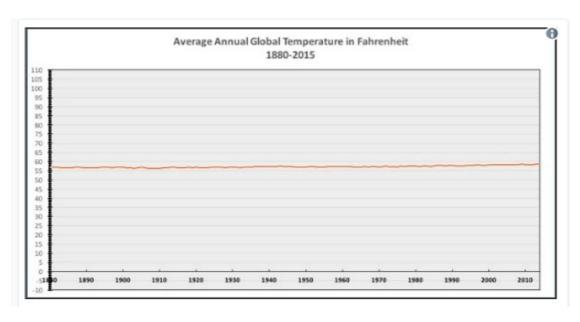


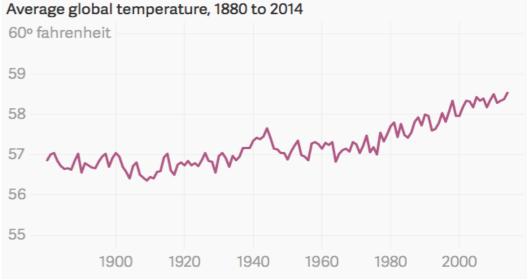




DATA VISUALIZATION

Data Visualization







Data Scientist, Data Engineer, Business Analyst, Domain Expert, etc.



DATA SCIENTIST

Activities

- Data cleansing and Preparation
- Evaluating statistical models
- Build ML Model

Tools

- R
- Python
- Matlab
- Stata
- SQL
- Spark

- Domain Knowledge/Business Understanding
- Statistical theories and methodologies
- Database systems
- Programming skills



DATA ENGINEER

Activities

- Data Integration
- Product Development (Dashboard, API)
- Scalability and Automation

Tools

- Database systems: SQL, NoSQL
- Python, Node
- Google Cloud Platform, Amazon AWS
- Distributed System

- Programming skills
- Database system and modelling
- IT Infrastructure and Cloud environment



BUSINESS ANALYSIST

Activities

- Framing the problem
- Data Exploration
- Presenting Analysis insights

Tools

- Dashboard
- Visualization tools :Tableau, QlikView
- Open Refine
- Powerpoint and Excel

- Business and Domain knowledge
- Communication
- Database query language



DOMAIN EXPERT

Activities

- Framing the problem
- Provides Consultation to the real world problems

Tools

(depends on the field)

- Business and Domain knowledge
- Communication



OTHER ROLES

- Database Admin: Query/Prepare data to be processed/analyze
- Data Architect: Design information architect
- Statistician
- Developer



"Keep it lean, Grow as you go"



Challenge:

Sebuah perusahaan *financial technology* (fintech) ingin mengetahui karakteristik nasabah yang berpotensi kreditnya macet *(Credit Risk).* Tujuannya agar tim marketing memahami karakteristik target calon nasabah yang kreditnya tidak berpotensi macet.

Direksi meminta bantuan kepada tim Data Science untuk memahami karakteristik nasabah yang macet dan lancar.



PROBLEM IDENTIFICATION

Define the problem, identify the questions:

- What is the problem?
- Who is having the problem?
- When is it happening?
- Where is it happening?
- What are the expected output?
- What have happened in the past?



Plan the data driven Process!

- Data Acquisition:
 What data do I need, and how to access them?
- Data Preparation :
 Define the ideal data format, and ways to prepare them



Plan the data driven Process!

- Data Acquisition:
 What data do I need, and how to access them?
- Data Preparation :
 Define the ideal data format, and ways to prepare them
- Data Analysis:
 What insigths do you need, and how to analyse them?
- Data Visualization:
 How and to whom do you share your insights



DATA SCIENCE MODULE



Data Science Module

• Materi: Data types, condition, function, looping, function, OOP, HTML, CSS, Git & Github.

• Target Modul 1: Mampu melakukan programming dengan bahasa Python.

• Target Modul 2: Mampu menganalisa dan memvisualisasi data.

• Materi: Numpy, Pandas, Practical Statistic, Matplotlib, Seaborn, REST API, Flask, MySQL, Mongo DB, & Tableau.

• Target Modul 3: Mampu membuat dan mengevaluasi model Machine Learning.

• Materi: Intro to Machine Learning, Regression, Classification, Clustering, Model Evaluation, Recommender System, Dashboard with Flask.



FINAL PROJECT GUIDANCE



Final Project Guidance

Data yang dipakai harus legal dan jelas sumbernya.

 Masalah yang dipilih harus jelas, penting, dan memberi added value ke perusahaan atau pemerintah.

Buat slide presentasi yang menjelaskan workflow final project.

Buat dokumentasi setiap step final project di Jupyter Notebook.

- Buatlah dashboard Flask untuk menampilkan data, visualisasi, dan uji coba model Machine Learning.
- Final project juga menguji pemahaman Statistik, Data Visualization, Machine Learning, dan SQL.



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