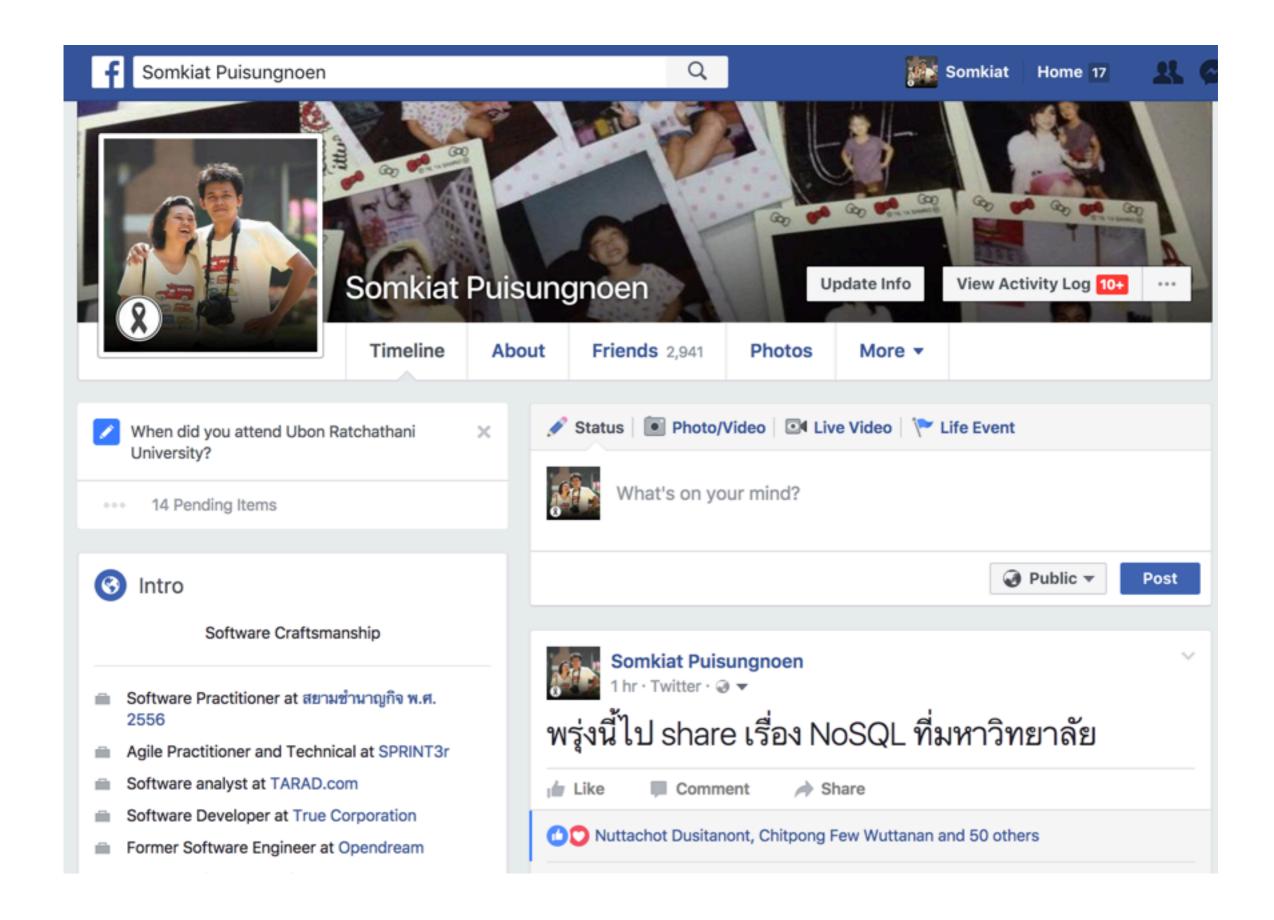
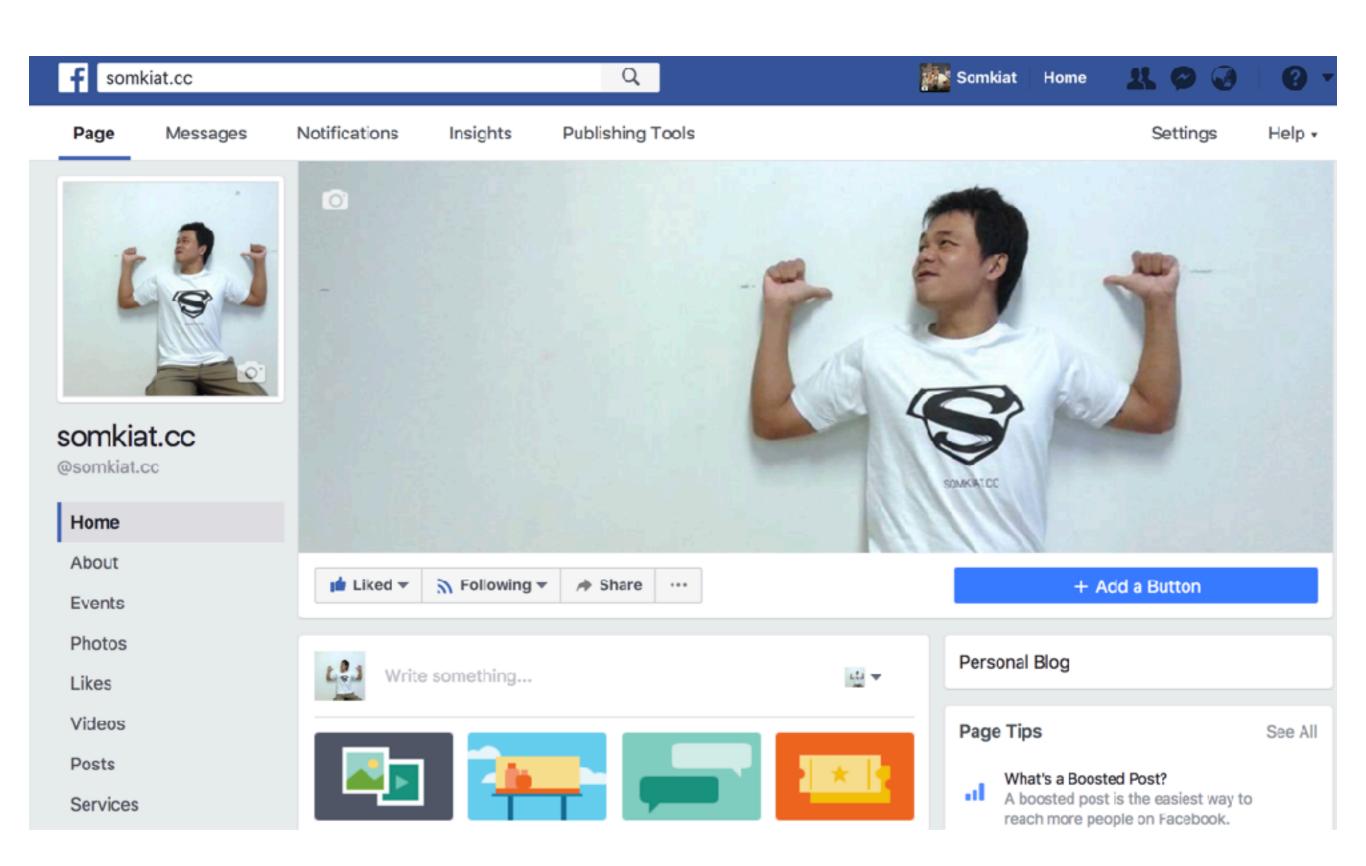


#### Data Analysis

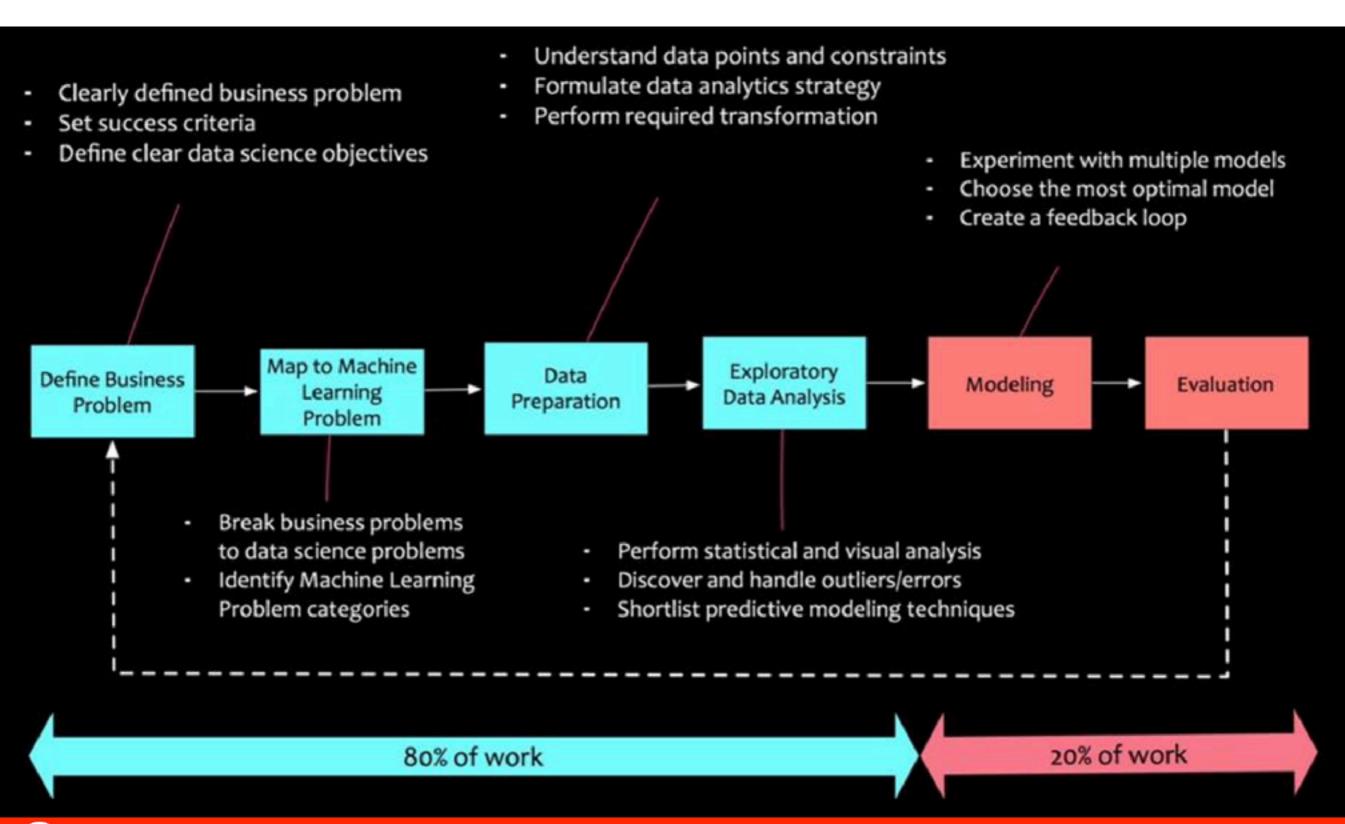






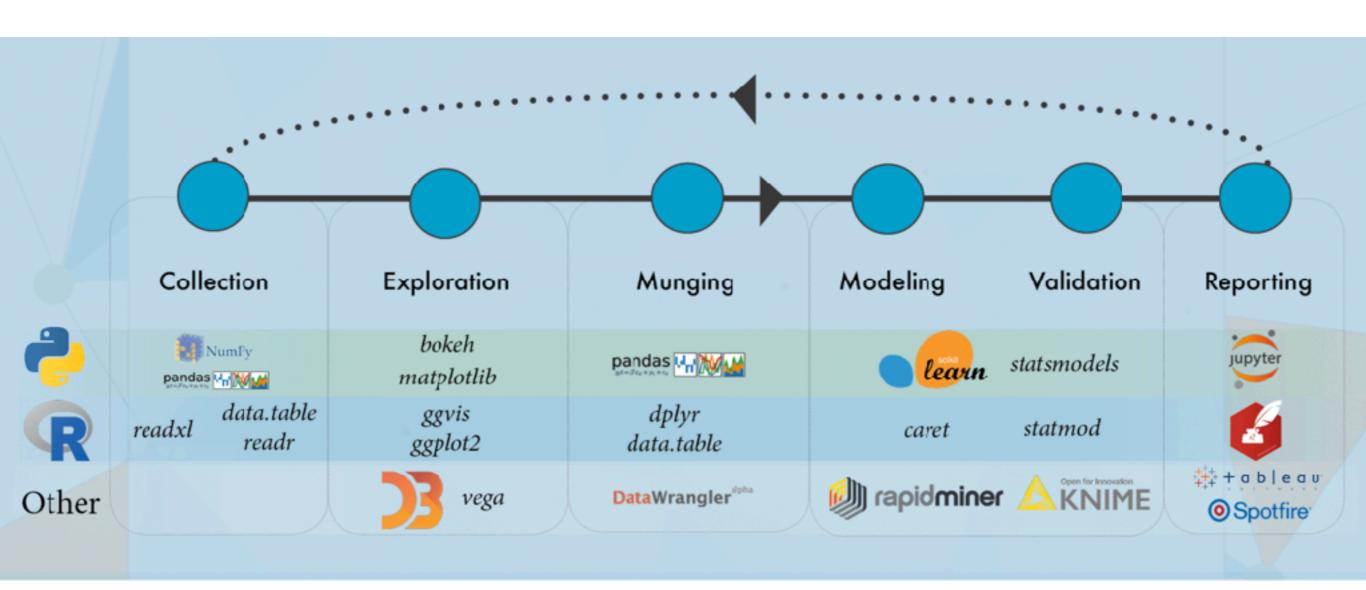


#### Data Science Process



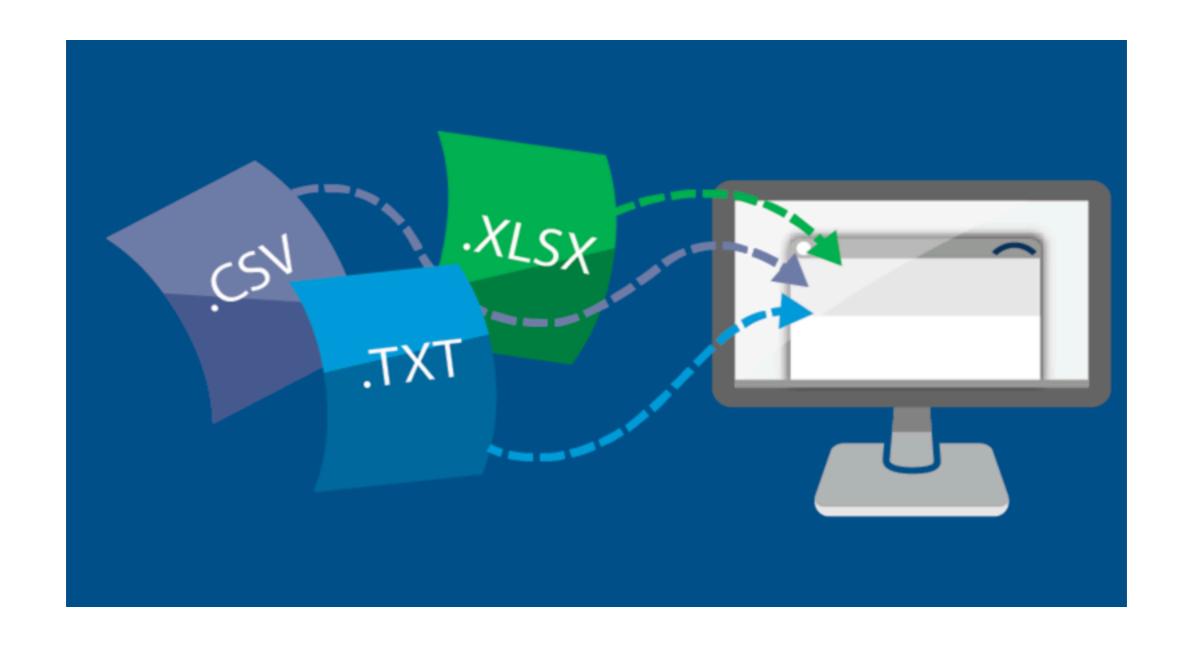


#### Data Science Workflow





#### Access data from multiple source



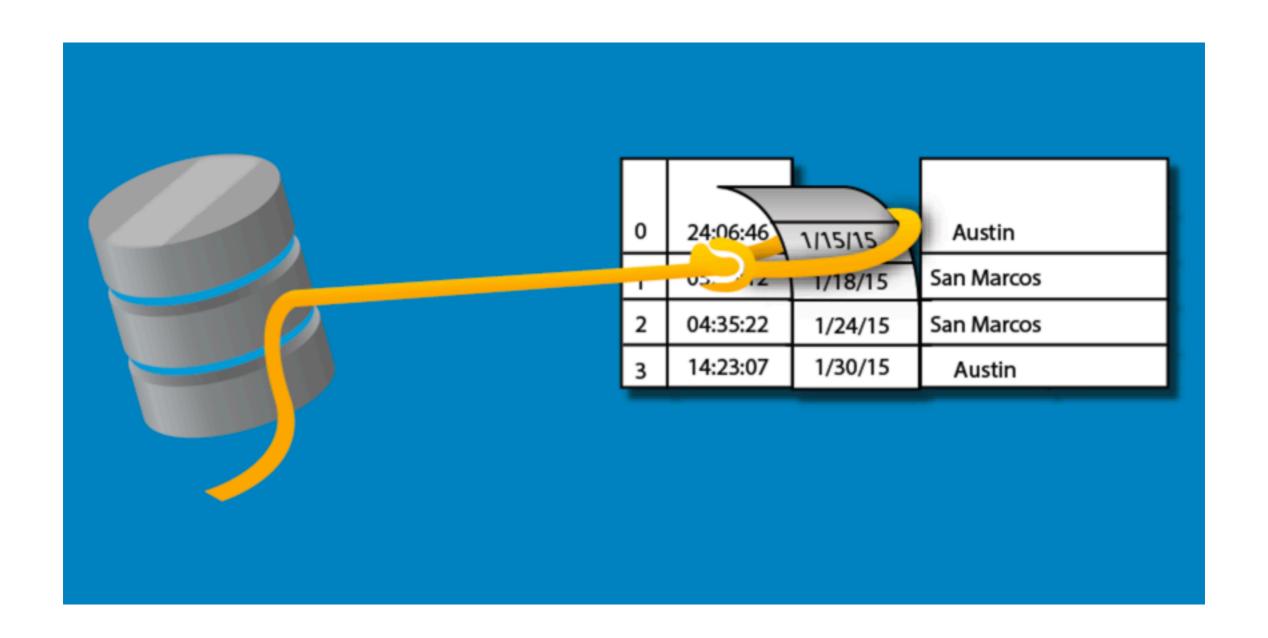


### Cleaning and preparing data



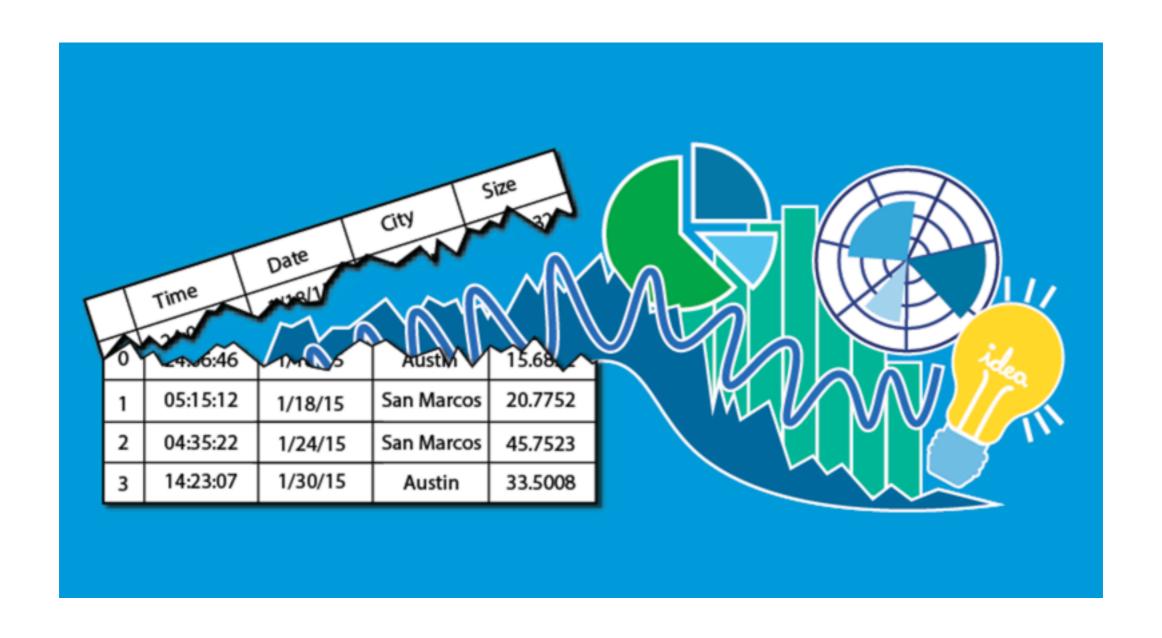


#### Data Wrangling



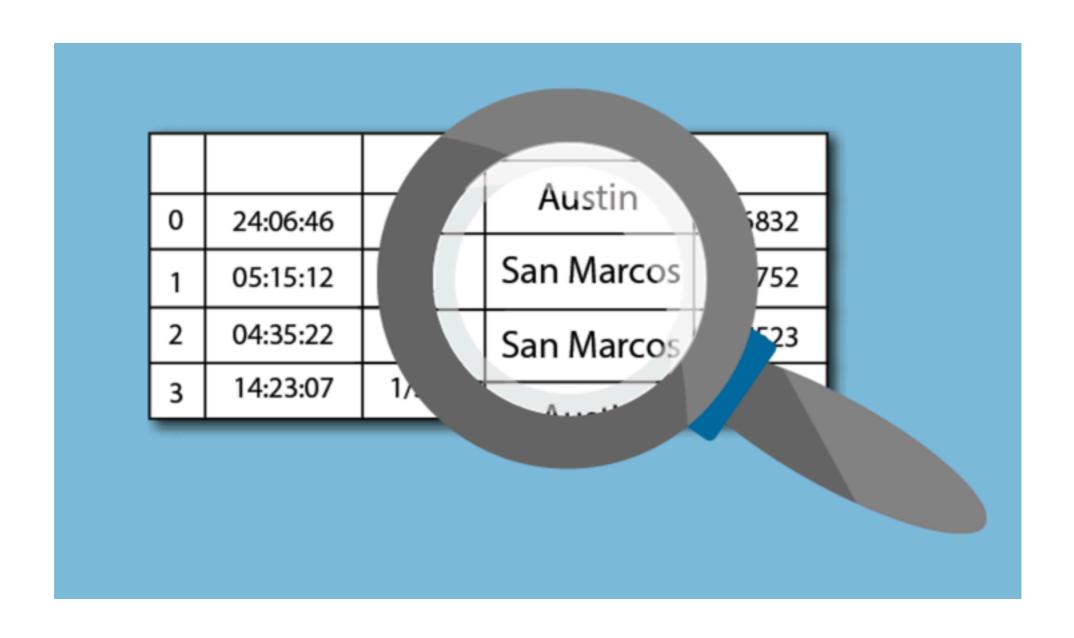


#### Data Visualization



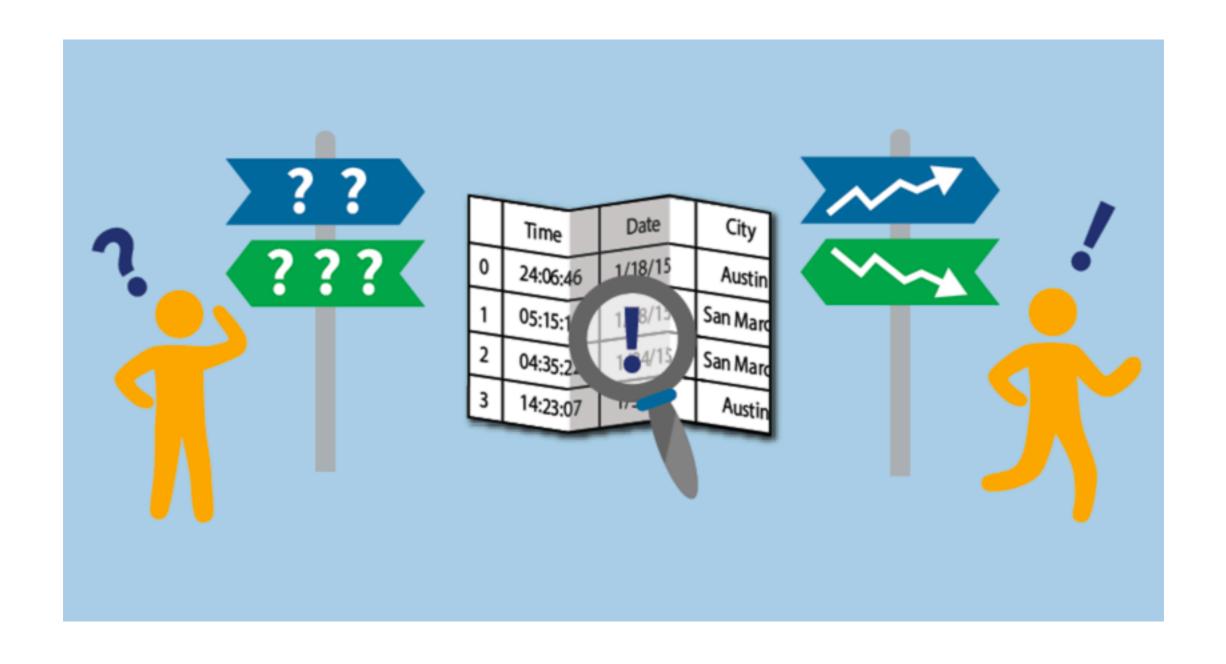


#### Data Analysis





## Modeling and Problem Solving



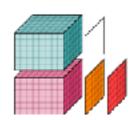


## Learning path

































## Import libraries

```
import numpy as np
import matplotlib.pyplot as plt
import pandas as pd
import seaborn as sns
import sklearn as sk
import statsmodels as sm
```



## NumPy

(Numerical Python)



#### NumPy

Efficiency Multi-dimensional array
Fast operations on array without loop
Read and write data
Linear algebra
Random number generator



## Operation for data analysis

Data munging/wrangling
Data cleaning
Data filtering
Data transformation
Data aggregation/summarize
Data sorting



## Create array with 1M

```
from timeit import default_timer as timer

start = timer()

my_list = list(range(1000000))
for _ in range(10): my_list2 = [x * 2 for x in my_list]

end = timer()
print(end - start)
```



## Create array with 1M

```
import numpy as np
from timeit import default_timer as timer
start = timer()
my_arr = np.arange(1000000)
for _ in range(10): my_arr2 = my_arr * 2
end = timer()
print(end - start)
```



## Numpy Performance

10-100 times faster than pure Python



## Multi-dimensional array object

N-dimensional array object (ndarray) Fast and flexible for large data set



## Create array with random data

```
import numpy as np
data = np.random.randn(2, 3)
print(data)
# Operation on array
print(data * 2)
print(data + data)
# Properties of araay
print(data.dtype)
print(data.shape)
```



## Create ndarray

```
import numpy as np

data1 = [1, 2, 3.5, 4, 5]
arr1 = np.array(data1)
print(arr1)

data2 = [[1, 2, 3,], [4, 5, 6]]
arr2 = np.array(data2)
print(arr2)
```



## Create ndarray

np.zeros(5) np.ones(5) np.empty(5) np.arange(5)



## Operation on array and scalar

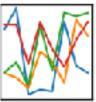
```
import numpy as np
arr = np.array([[1,2,3], [4,5,6]])
print(arr)
print(arr + arr)
print(arr - arr)
print(arr * arr)
print(1 / arr)
print(arr ** 2)
```

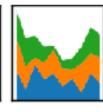


# Pandas (Panel Data Structure)











#### Pandas

Python data analysis library Build on top of Numpy



## Key features

DataFrame object for data manipulation
Read and write data
Data alignment and missing data
Reshaping and pivoting of data
Merging, Joining and grouping data
Time series functionality



#### Data Structure



#### Data Structure

Series (1D)

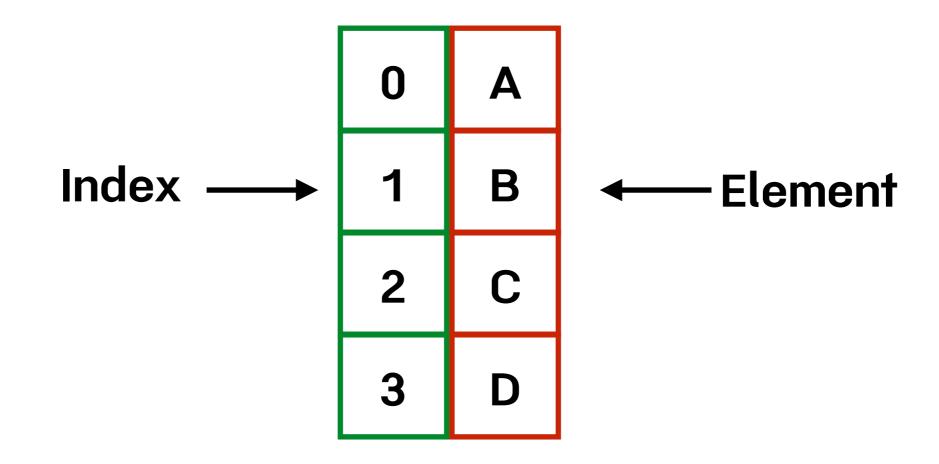
DataFrame (2D)

Panel (3D)



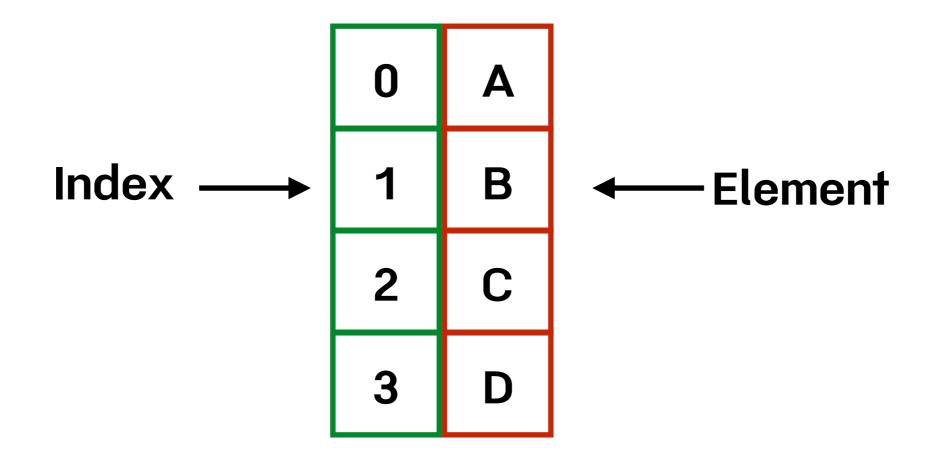
#### Series

A one-dimensional labeled array capable of holding any data type





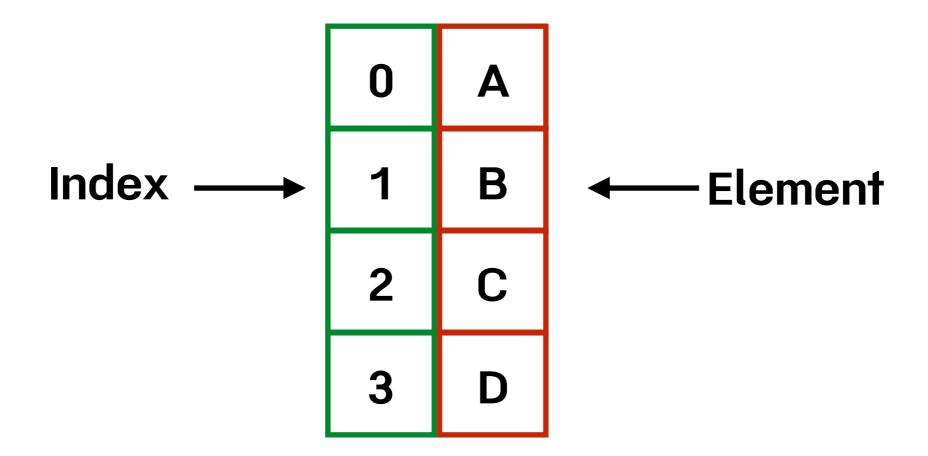
#### Series



pd.Series(['A', 'B', 'C', 'D'])



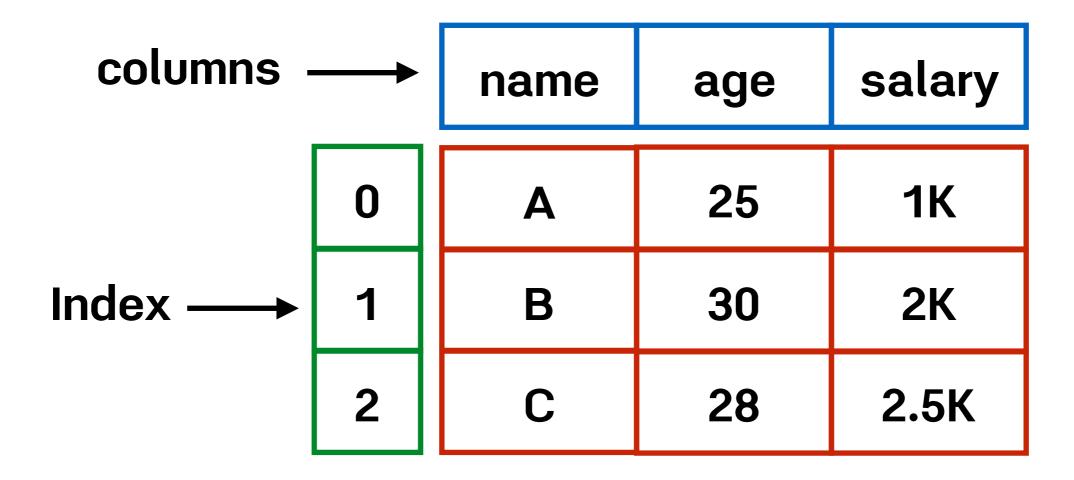
#### Series



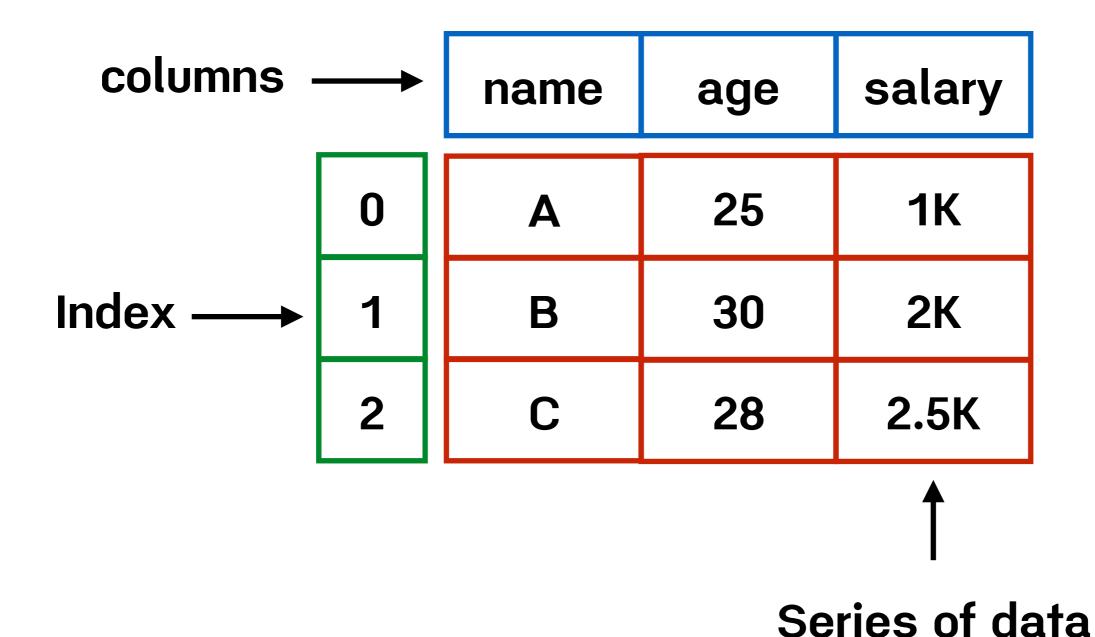
pd.Series(['A', 'B', 'C', 'D'], index=[0, 1, 2, 3])



A two-dimensional labeled data structure with columns of potentially different types









Create dataframe from Python's dictionary



#### Improve sequence of columns



# Data loading

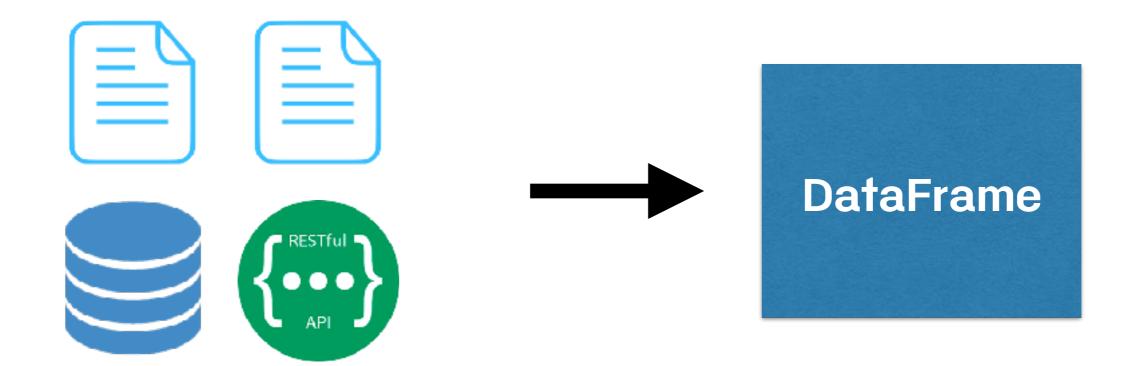


### Read data from text format

Function	Description
read_csv	อ่านข้อมูลในรูปแบบ CSV โดยแยกด้วย comma
read_table	อ่านข้อมูลในรูปแบบ table โดยแยกด้วย TAB
read_fwf	อ่านข้อมูลในรูปแบบ fixed-length ของ column
read_excel	อ่านข้อมูลในรูปแบบของ MS Excel
read_html	อ่านข้อมูลในรูปแบบ HTML
read_json	อ่านข้อมูลในรูปแบบ JSON (JavaScript Object Notation)
read_sql	อ่านข้อมูลจาก SQL Query ใช้งานผ่าน SQLAlchemy



#### Read data from datasource





#### Data Sources

Text file
Binary
Web API
Database



# Data cleaning and preparation



### Data wrangling



### Data aggregation



# Plotting and Visualization



### Time Series



### workshop



#### axis = 0

```
[[1 2 3] [[1 2 3] [5 7 9] [7 8 9]] [12 15 18]]
```



#### axis = 1

