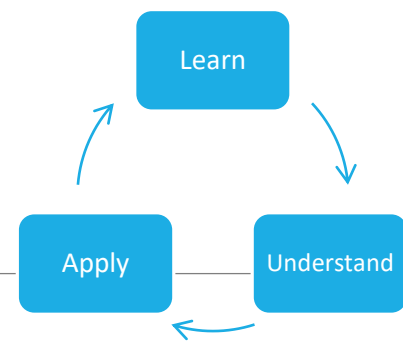


Travel Review Ratings

Subject: Machine Learning



Presented By,

Rajaraman Ganesan – 251056279 (M.Eng)

Vatsal Shah – 251041322 (M.Eng)

Department of Electrical & Computer Engineering (M.Engg)

Western University, Canada

Objective & Goal

Dataset Overview

Approach Design

Visualization
Overview

Machine Learning
Model

Results

Amazon SageMaker

Future Work &
*QR Code

Objective & Goal



Understand the process & difference by applying algorithms with custom models and pre-build libraries in Python



Apply algorithm in most-demanded languages in the industry - Python & R



Compare process, results and time complexity



Use Amazon SageMaker - understand the flow

Objective & Goal

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Dataset overview

- Travel planning has become one of important commercial use.
- Many tourists look for some places like malls, restaurants or vacation spots, etc. online in recent times.
- Online review plays a critical role in the tourism industry, which mainly offers services and focuses on customer satisfaction.

No Kaggle Kernels



Oriented: UCI Machine Learning Repository ([Link](#))

Attributes : 25

Tuples: 5456

Attribute 1 : Unique user id

Attribute 2 : Average ratings on churches

Attribute 3 : Average ratings on resorts

Attribute 4 : Average ratings on beaches

Attribute 5 : Average ratings on parks

Attribute 6 : Average ratings on theatres

Attribute 7 : Average ratings on museums

Attribute 8 : Average ratings on malls

Attribute 9 : Average ratings on zoo

Attribute 10 : Average ratings on restaurants

Attribute 11 : Average ratings on pubs/bars

Attribute 12 : Average ratings on local services

Attribute 13 : Average ratings on burger/pizza shops

Attribute 14 : Average ratings on hotels/other

lodgings

Attribute 15 : Average ratings on juice bars

Attribute 16 : Average ratings on art galleries

Attribute 17 : Average ratings on dance clubs

Attribute 18 : Average ratings on swimming pools

Attribute 19 : Average ratings on gyms

Attribute 20 : Average ratings on bakeries

Attribute 21 : Average ratings on beauty & spas

Attribute 22 : Average ratings on cafes

Attribute 23 : Average ratings on view points

Attribute 24 : Average ratings on monuments

Attribute 25 : Average ratings on gardens

```
In [9]: # Importing the dataset
data = pd.read_csv('C:/train.csv')
print(data.shape)
data.head()
```

(5456, 25)

Out[9]:

	User	Category 1	Category 2	Category 3	Category 4	Category 5	Category 6	Category 7	Category 8	Category 9
0	User 1	0.0	0.0	3.63	3.65	5.0	2.92	5.0	2.35	2.35
1	User 2	0.0	0.0	3.63	3.65	5.0	2.92	5.0	2.64	2.35
2	User 3	0.0	0.0	3.63	3.63	5.0	2.92	5.0	2.64	2.35
3	User 4	0.0	0.5	3.63	3.63	5.0	2.92	5.0	2.35	2.35
4	User 5	0.0	0.0	3.63	3.63	5.0	2.92	5.0	2.64	2.35

5 rows × 25 columns

File Plots Session Build Debug Profile Tools Help

	Beaches	Parks	Theatres	Museums	Malls	Zoo	Restaurants	Pubs/Bars	Local Services	Burgers/Pizza Shops	Hotels/Other Lodgings	Juice Bars	Art Galleries	Dance Clubs	Swimming Pools	Gyms	Bakeries
results	3.63	3.63	5.00	2.92	5.00	2.35	2.33	2.64	1.70	1.69	1.70	1.72	1.74	0.59	0.50	0.00	0
0.00	3.63	3.65	5.00	2.92	5.00	2.64	2.33	2.65	1.70	1.69	1.70	1.72	1.74	0.59	0.50	0.00	0
0.00	3.63	3.63	5.00	2.92	5.00	2.64	2.33	2.64	1.70	1.69	1.70	1.72	1.74	0.59	0.50	0.00	0
0.50	3.63	3.63	5.00	2.92	5.00	2.35	2.33	2.64	1.70	1.69	1.70	1.72	1.74	0.59	0.50	0.00	0
0.00	3.63	3.63	5.00	2.92	5.00	2.64	2.33	2.64	1.70	1.69	1.70	1.72	1.74	0.59	0.50	0.00	0
0.00	3.63	3.63	5.00	2.92	5.00	2.63	2.33	2.65	1.71	1.69	1.69	1.72	1.74	0.59	0.50	0.00	0
5.00	3.63	3.63	5.00	2.92	3.03	2.35	2.33	2.64	1.73	1.68	1.69	1.71	1.75	0.59	0.50	0.00	0
5.00	3.63	3.63	5.00	2.92	5.00	2.63	2.33	2.64	1.70	1.68	1.69	1.71	1.74	0.60	0.50	0.00	0
5.00	3.64	3.64	5.00	2.92	3.03	2.62	2.32	2.63	1.71	1.67	1.68	1.70	0.75	0.60	0.00	0.00	0
5.00	3.64	3.64	5.00	2.92	5.00	2.35	2.32	2.63	1.69	1.67	1.67	1.70	0.74	0.59	0.00	0.00	0
0.53	3.65	3.67	5.00	2.92	5.00	2.61	2.32	2.63	1.67	1.66	1.67	1.69	0.74	0.59	0.00	0.00	0
0.53	3.65	3.66	5.00	2.93	5.00	2.61	2.31	2.62	1.67	1.65	1.66	1.68	0.73	0.58	0.00	0.00	0
0.54	3.66	3.68	5.00	2.93	5.00	2.61	2.30	2.62	1.67	1.64	1.65	1.68	0.72	0.58	0.00	0.00	0
0.54	3.66	3.67	5.00	2.93	5.00	2.32	2.30	2.60	1.65	1.64	1.65	1.27	0.76	0.62	0.00	0.00	0
0.53	3.67	3.68	2.95	2.93	5.00	2.33	2.31	2.62	1.65	1.64	1.65	1.27	0.76	0.53	0.00	0.00	0
0.52	3.69	3.66	2.95	2.93	5.00	2.98	2.31	2.33	1.65	1.64	1.64	1.27	0.76	0.53	0.00	0.00	0
0.52	3.68	3.66	2.96	2.93	2.96	2.98	1.70	2.62	1.65	1.64	1.65	1.27	0.76	0.53	0.00	0.00	0
0.53	3.69	3.66	2.95	2.93	2.95	3.00	1.70	2.62	1.65	1.64	1.65	1.27	0.76	0.53	0.00	0.00	0
0.52	3.60	3.66	2.96	2.93	2.99	2.99	1.70	2.62	1.65	1.64	1.65	1.27	0.77	0.59	0.00	0.00	0
5.00	3.70	3.66	2.95	2.93	2.94	2.99	1.70	2.62	1.65	1.64	1.65	1.27	0.81	0.59	0.00	0.00	0
0.51	5.00	3.67	2.94	2.93	2.95	2.98	1.70	2.62	1.65	1.64	1.65	1.27	0.81	0.64	0.00	0.00	0
5.00	5.00	3.66	2.94	2.93	2.94	3.00	1.70	2.31	1.65	1.64	1.64	1.27	0.81	0.62	0.00	0.00	0
0.51	5.00	3.66	2.95	2.93	2.94	3.00	1.70	2.31	1.65	1.64	1.64	1.27	0.91	0.62	0.00	0.00	0
0.51	5.00	3.66	2.95	2.94	2.95	2.97	1.71	2.31	1.65	1.64	1.64	1.27	0.89	0.60	0.00	0.00	0
0.51	0.52	3.66	2.96	2.94	2.94	2.63	1.71	2.31	1.66	1.64	1.64	1.67	1.70	0.70	0.52	0.00	0
0.52	0.52	3.66	2.95	2.94	2.94	2.96	1.71	2.31	1.66	1.64	1.64	1.66	1.76	0.69	0.53	0.00	0
0.55	0.52	3.66	2.95	2.94	2.94	2.63	1.72	2.31	1.66	1.64	1.64	1.66	1.76	0.69	0.55	0.00	0
0.51	5.00	3.67	2.95	2.94	2.94	2.63	1.71	2.31	1.66	1.64	1.64	1.66	1.76	0.69	0.55	0.00	0
0.53	0.52	3.67	2.95	2.94	2.94	2.63	1.71	2.31	1.66	1.64	1.64	1.68	1.76	0.67	0.55	0.00	0
0.53	0.52	3.67	2.96	2.94	2.94	2.63	1.71	2.31	1.66	1.64	1.64	1.65	1.76	0.57	0.56	0.00	0

```
min.    10.00000  min.    10.00  min.    10.00000  min.    10.0000  min.    10.0000  min.    10.0000
1st Qu. 10.12000  1st Qu. 10.14  1st Qu. 10.17000  1st Qu. 10.1700  1st Qu. 10.1700  1st Qu. 10.1700
Median  10.69000  Median 10.69  Median 10.76000  Median 11.0300  Median 11.0700  Median 11.2900
Mean    10.96998  Mean    11.00  Mean    10.96958  Mean    11.7513  Mean    11.5813  Mean    11.5613
3rd Qu. 10.86000  3rd Qu. 10.86  3rd Qu. 11.00000  3rd Qu. 12.0700  3rd Qu. 11.3600  3rd Qu. 11.4600
Max.     15.00000  Max.     15.00  Max.     15.00000  Max.     15.0000  Max.     15.0000  Max.     15.0000
```

Objective & Goal

Dataset Overview

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Amazon SageMaker

Future Work &
*QR Code

Process Design



Unsupervised learning approach



Don't have a preliminary info on output values



Explore data to find some intrinsic structures in them



Use of clustering algorithm technique like k-means algorithm.

Approach Design

Preparation of data

Visualization Overview

Applying model

Apply custom model

Evaluate model

Objective & Goal

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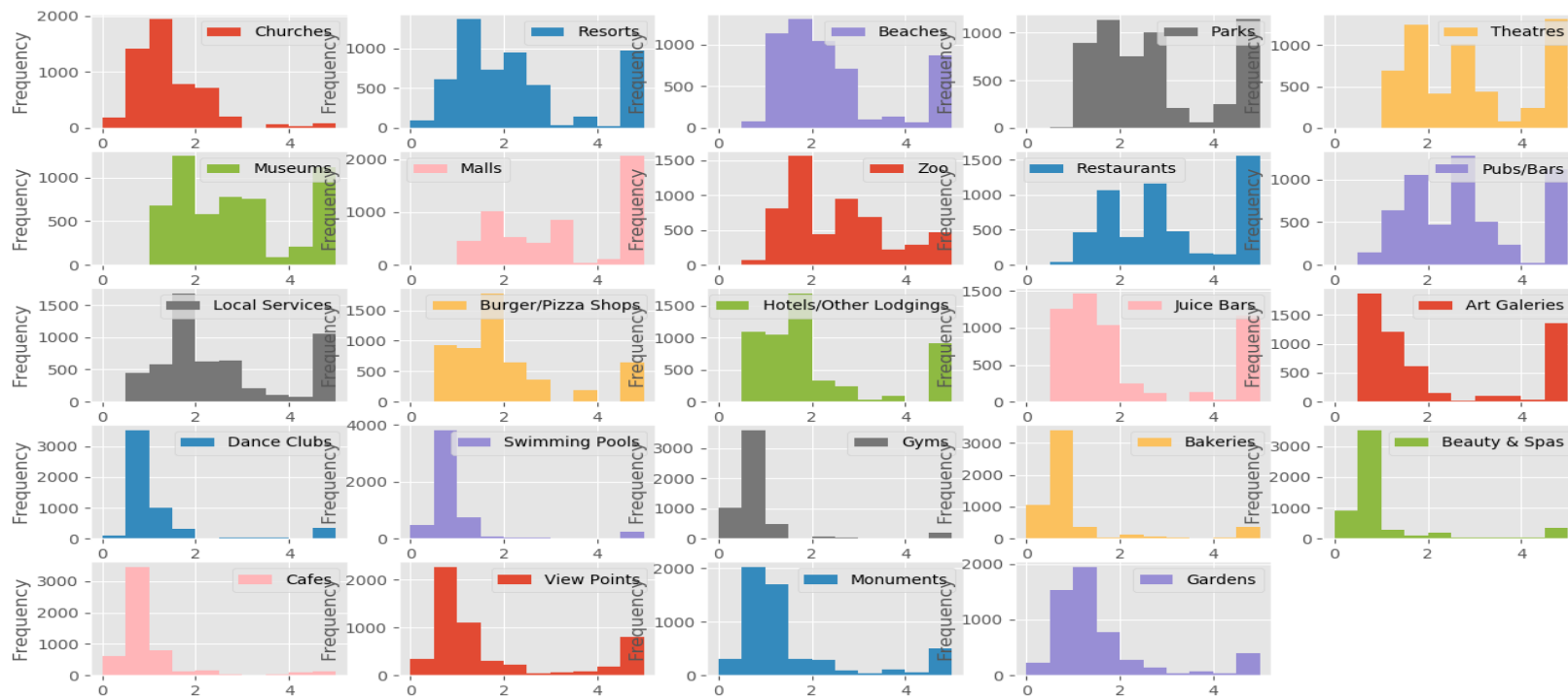
Results

Amazon SageMaker

Future Work &
*QR Code

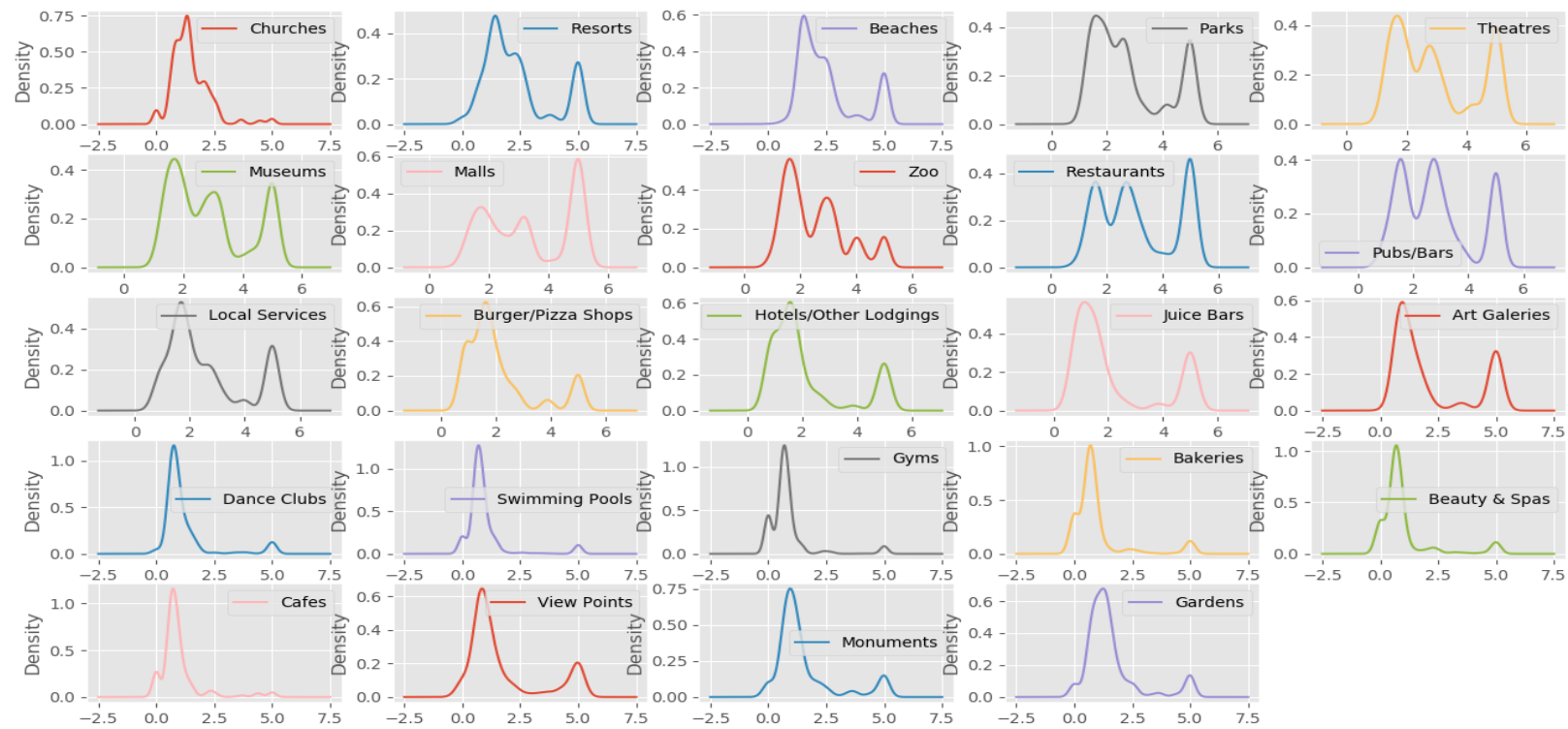
Visualization Overview

Shows 24 categories reviewed by users with hist diagram



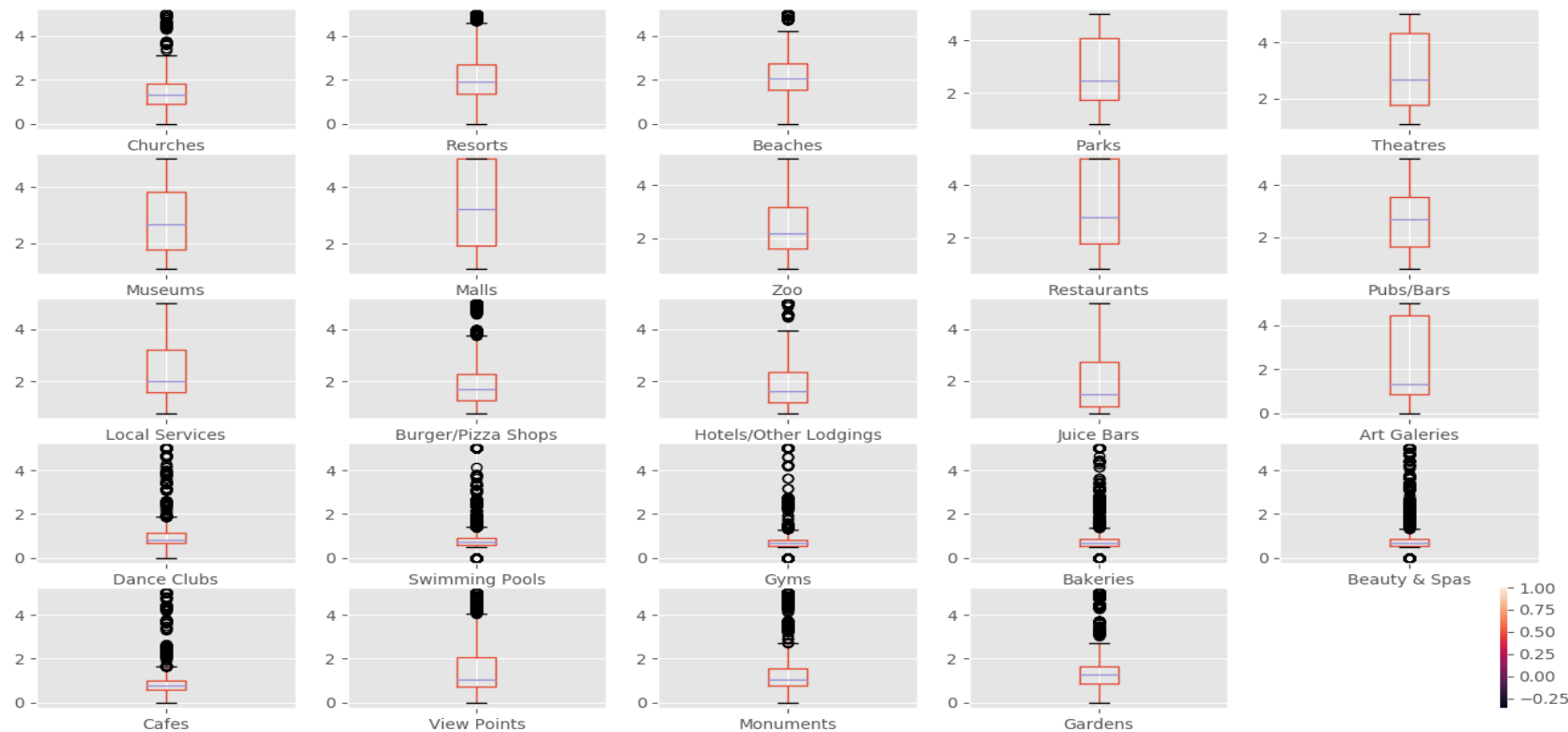
Continue...

Shows 24 categories reviewed by users with density diagram



Continue...

Shows 24 categories reviewed by users with box plot diagram



Objective & Goal

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Approach Design

Visualization
Overview

Machine Learning
Model

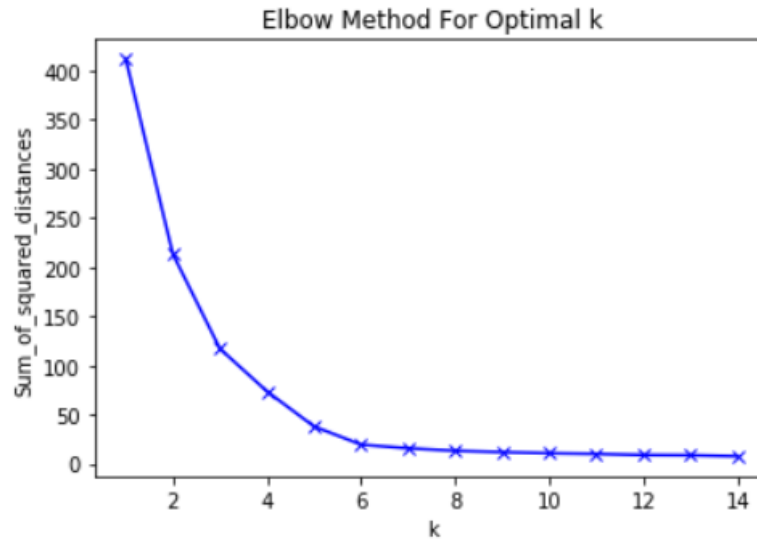
Results

Amazon SageMaker

Future Work &
*QR Code

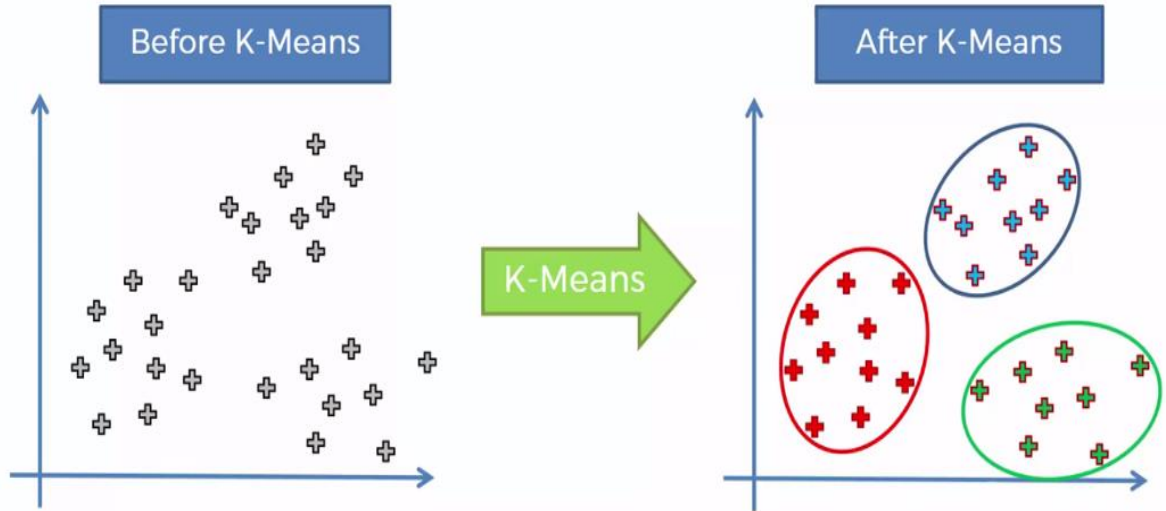
K-Means Algorithm

- **Choose no: of clusters**
 - Initialization
 - Assign cluster
 - Move centroid
 - Optimization
 - Convergence
- Within-cluster sum of squares is a measure of the variability of the observations within each cluster
 - Idea behind using elbow method to choose after which **WSS** is almost constant.



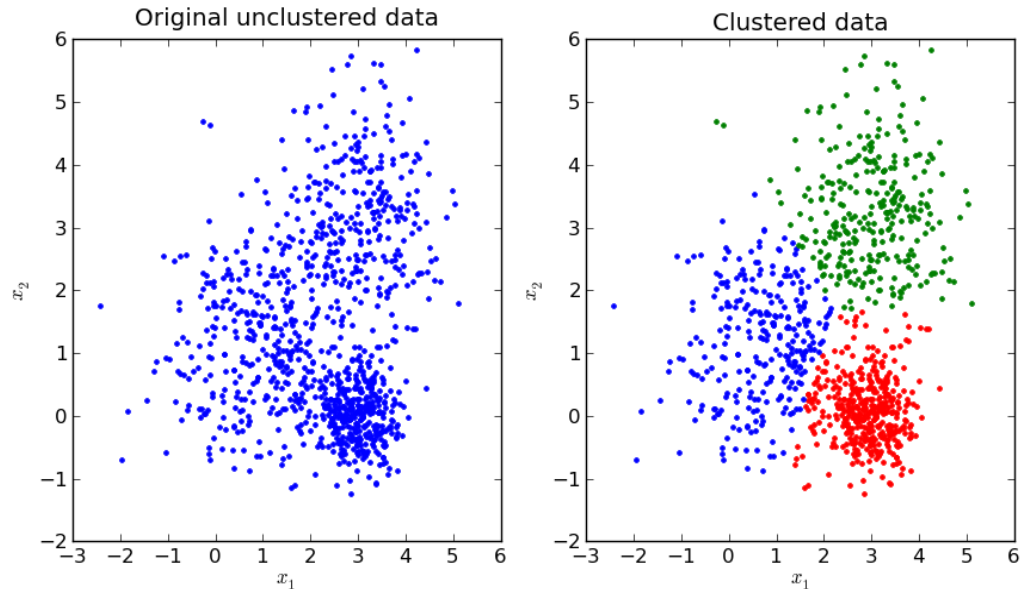
K-Means Algorithm

- Choose no: of clusters
 - **Initialization**
 - Assign cluster
 - Move centroid
 - Optimization
 - Convergence
- Initialize k points, randomly
 - Value of clusters are determined by elbow curve.



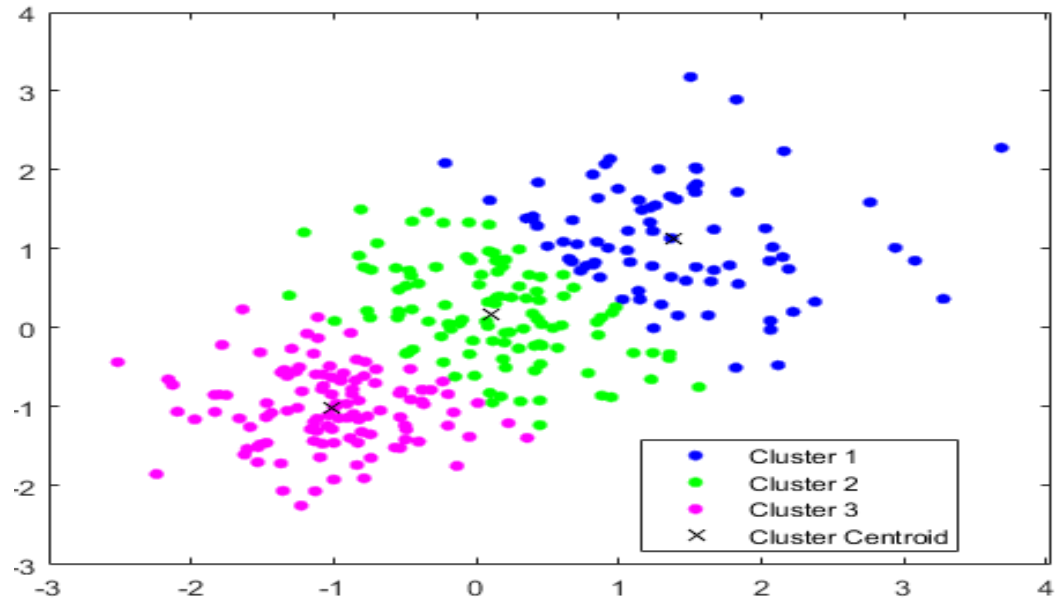
K-Means Algorithm

- Choose no: of clusters
 - Initialization
 - **Assign cluster**
 - Move centroid
 - Optimization
 - Convergence
- Dist. between data points and centroid are computed.
 - Based on min. Distance, data are divided into groups.



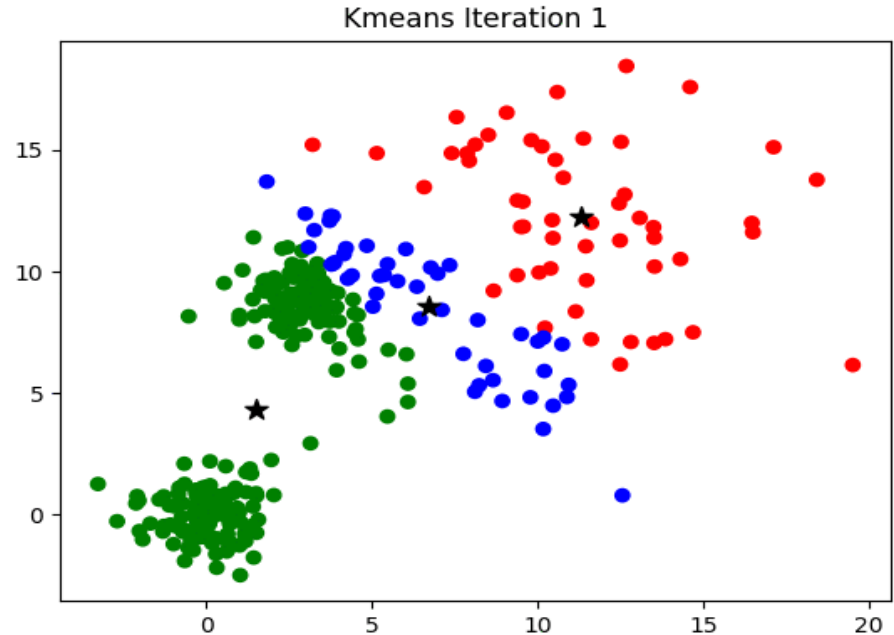
K-Means Algorithm

- Choose no: of clusters
 - Initialization
 - Assign cluster
 - **Move centroid**
 - Optimization
 - Convergence
- Compute the mean of all three dots.
 - Reposition blue, green, pink cluster centroid to this mean.



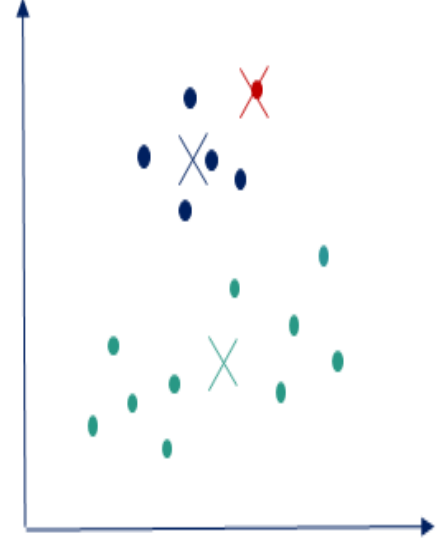
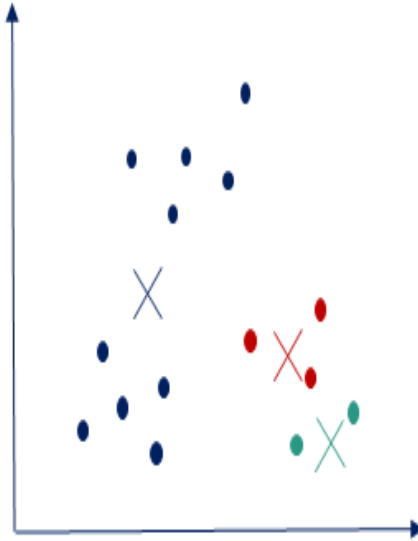
K-Means Algorithm

- Choose no: of clusters
 - Initialization
 - Assign cluster
 - Move centroid
 - **Optimization**
 - Convergence
- Redo the above steps till cluster stop changing their positions.



K-Means Algorithm

- Choose no: of clusters
 - Initialization
 - Assign cluster
 - Move centroid
 - Optimization
 - **Convergence**
- Divide the data points to clusters, once the algorithm converges.



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Overview

Machine Learning
Model

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Amazon SageMaker

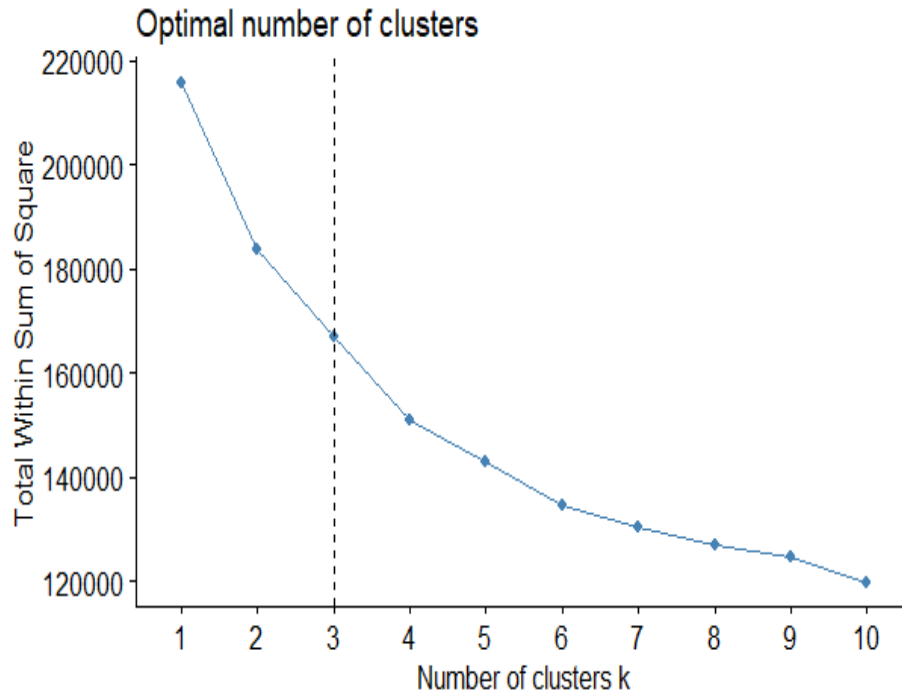
Future Work &
*QR Code

R - Library

- `library(cluster)` –
 - Finding groups in data
- `library(ggplot2)` –
 - system for declaratively creating graphs
- `library(factoextra)` –
 - Used to visualize clusters

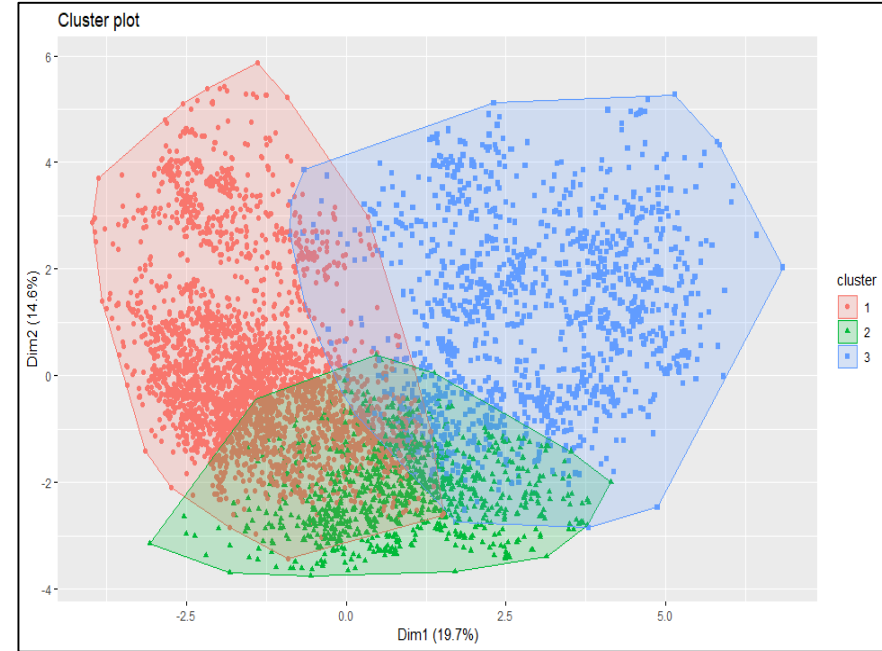
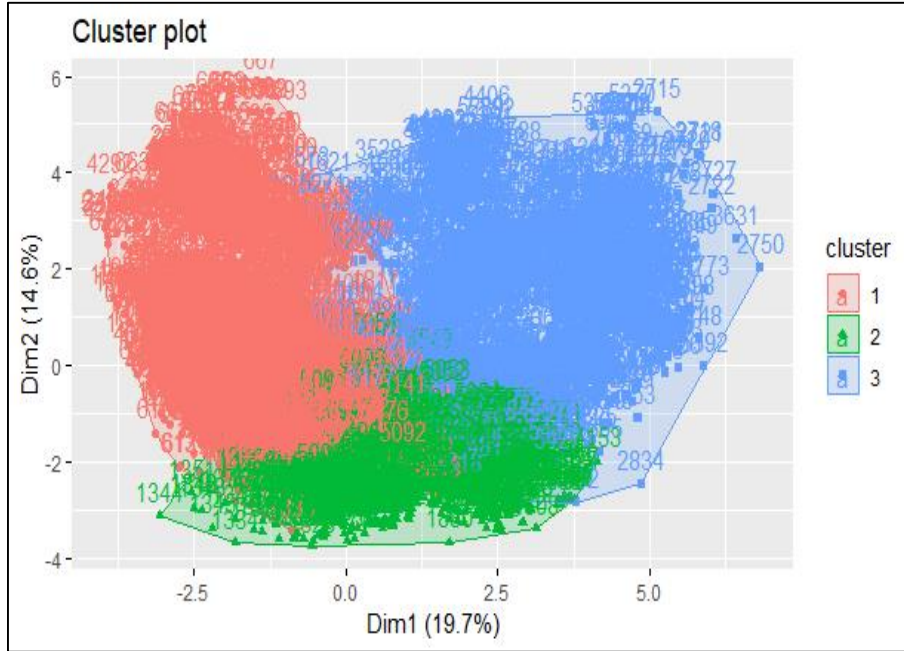
```
,  
>  
> km.res$size  
[1] 1093 2460 1903  
>  
>  
>  
>  
> |
```

Results - R



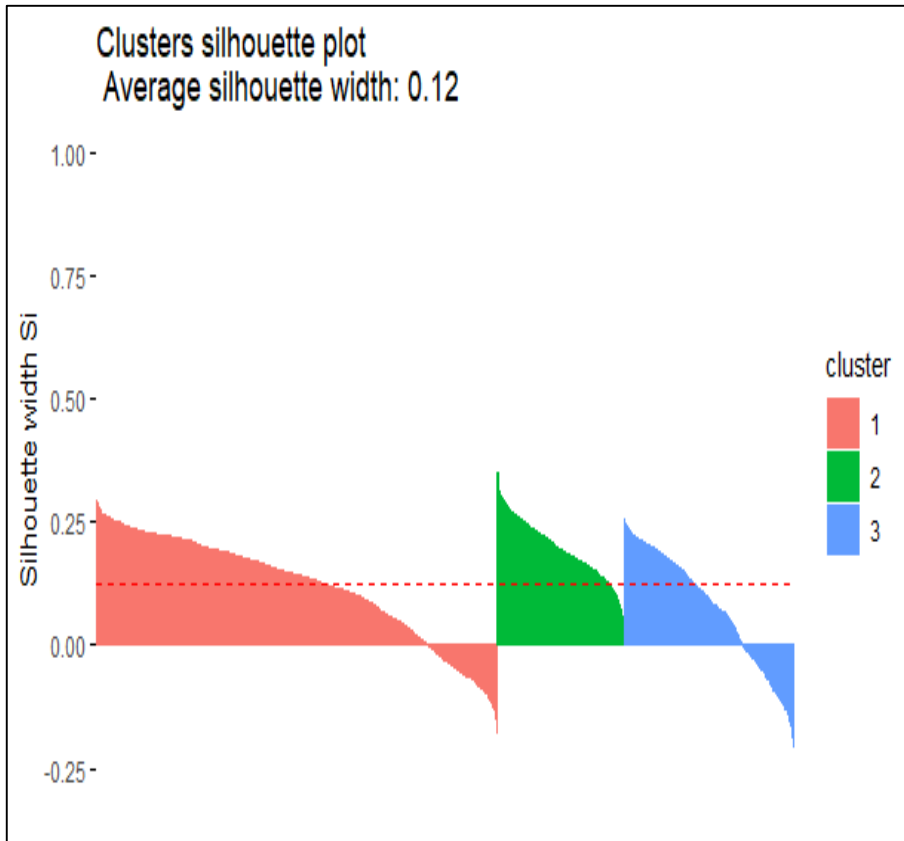
- Method to validate the number of clusters is the elbow method.
- Help finding the appropriate number of clusters in a dataset.
- Here, 3 clusters are suggested.

Continue...



- As it a multidimensional dataset, to visualize cluster plot PCA is used.
- Reduce the dimensionality of a data set consisting of many variables correlated with each other

Continue...

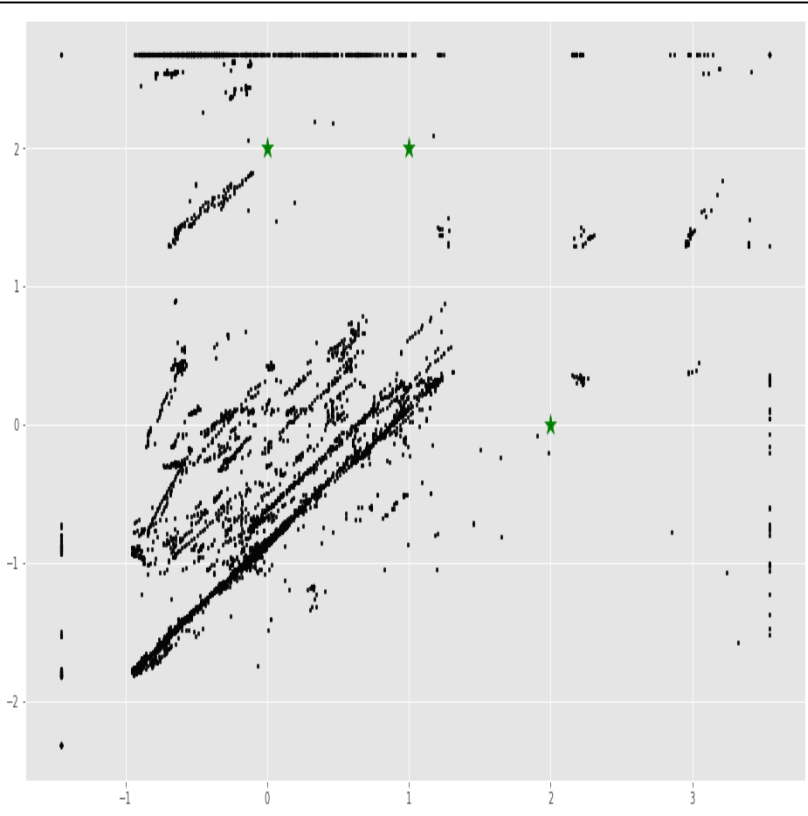


Silhouette Plot shows for each cluster:

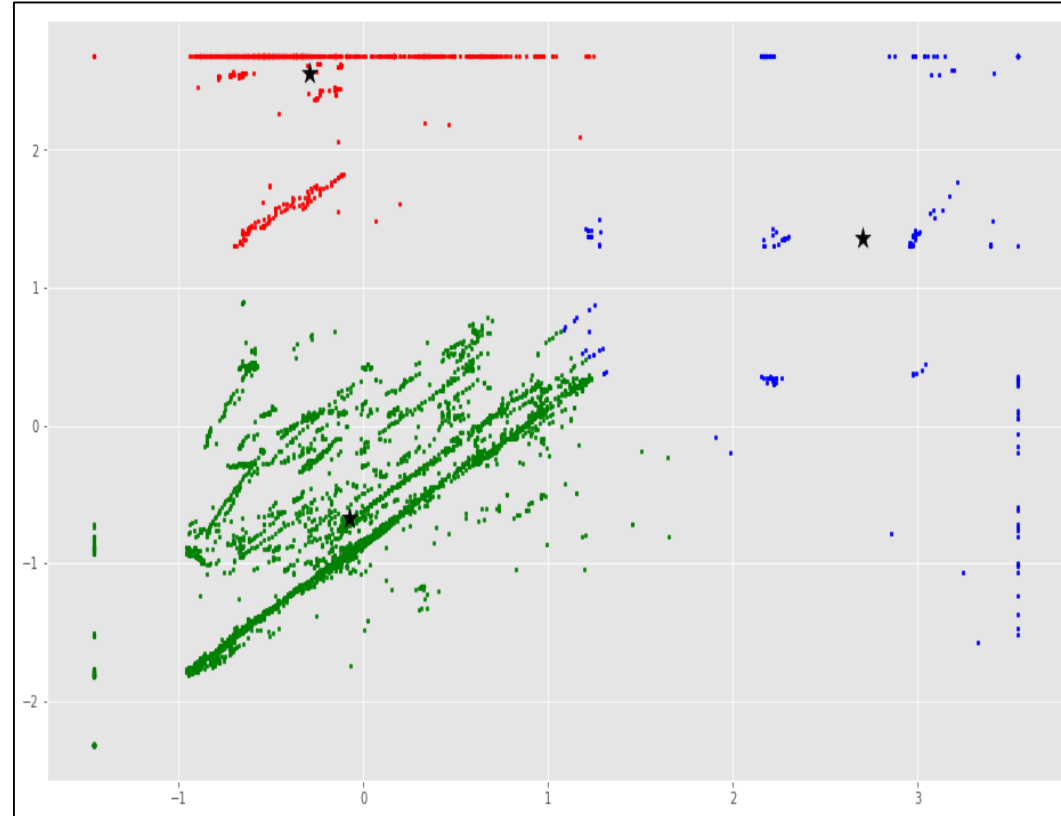
- Each vertical line corresponds to an element.
- The average silhouette width

```
cluster size ave.sil.width
1      1 3140          0.12
2      2  992          0.19
3      3 1324          0.08
> |
```

Results - Python



Plot along with random centroid



Assigning new centroid

(Screenshot taken during evaluation process)

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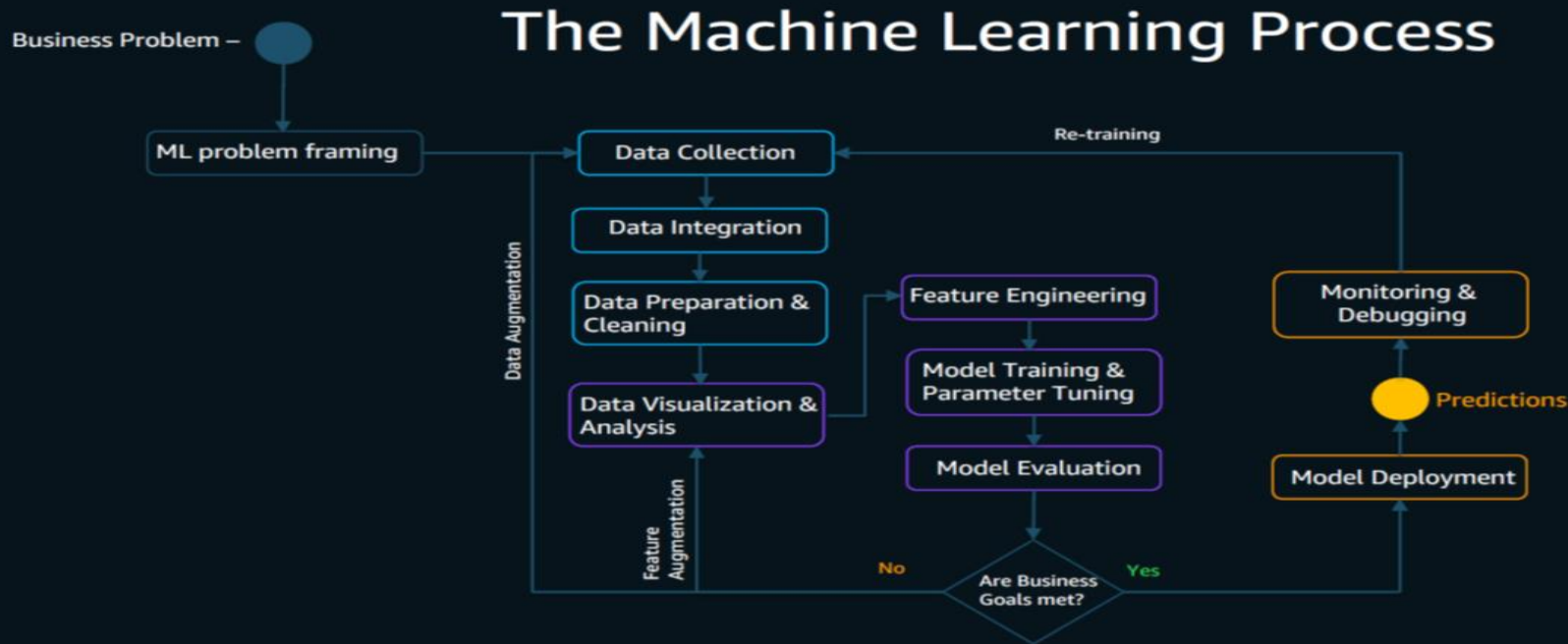
Amazon SageMaker

Future Work &
*QR Code

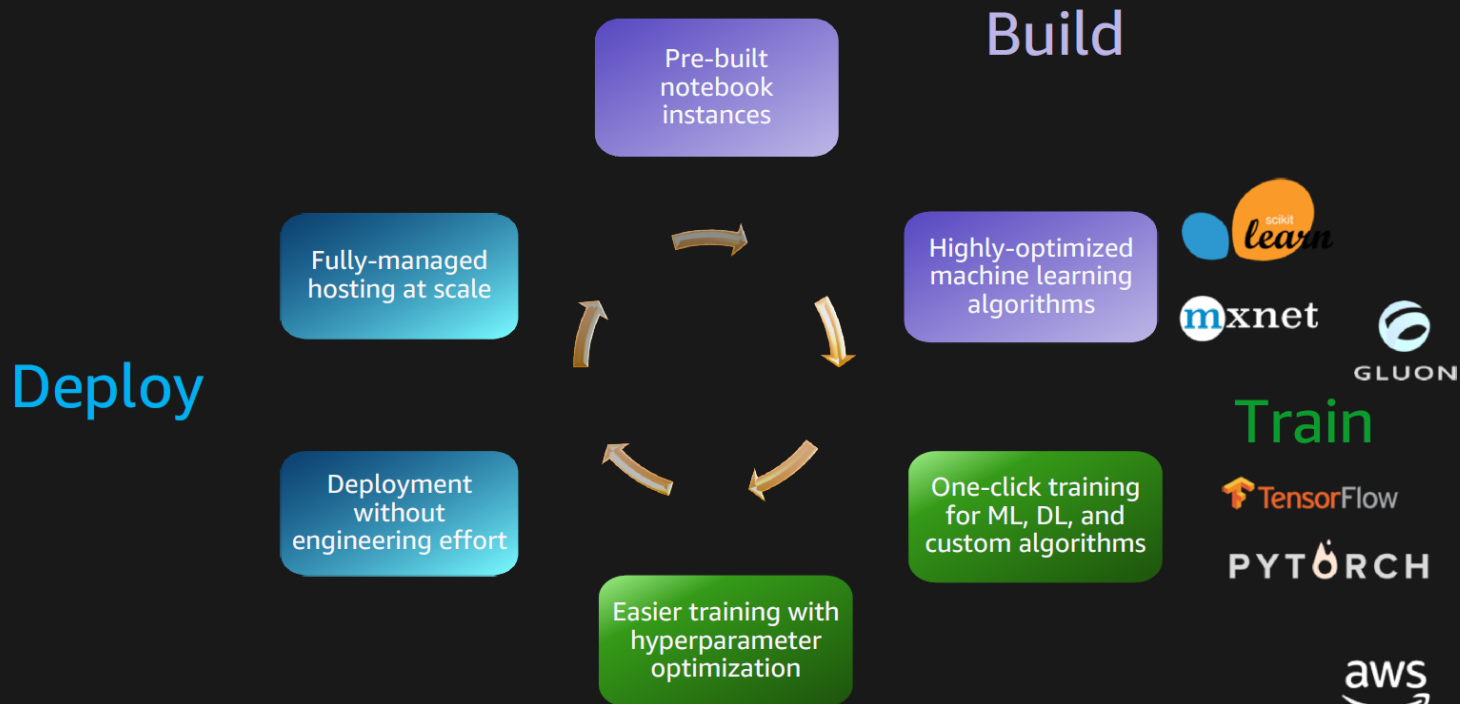
The background of the slide features three large, overlapping circles in a medium blue color. These circles are arranged horizontally, with the middle circle overlapping both the left and right circles. The circles are semi-transparent, allowing the dark gray background to show through. A horizontal white band cuts across the middle of the circles, containing the text.

Amazon SageMaker

ML Process on AWS



Amazon SageMaker



Dashboard

aws

Services

Resource Groups

Amazon SageMaker

Dashboard

Search

Ground Truth

Notebook

Training

Inference

Set up and manage labeling jobs for highly accurate training datasets using active learning and human labeling.

Availability of AWS and SageMaker SDKs and sample notebooks to create training Jobs and deploy models.

Train and tune models at any scale. Leverage high performance AWS algorithms or bring your own.

Create models from training jobs or import external models for hosting to run inferences on new data.

Labeling jobs

Notebook instances

Training jobs

Hyperparameter tuning jobs

Models

Endpoints

Batch transform jobs

Recent activity

Recent activity within the Last 7 days

Ground Truth

Labeling jobs

No recent activity.

Notebook

Notebook instances

1 Created

Training

Training jobs

No recent activity.

Hyperparameter tuning jobs

No recent activity.

Inference

Models

No recent activity.

Endpoints

No recent activity.

Batch transform jobs

No recent activity.

Feedback



English (US)


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Notebook instances

 **Services** ▾ **Resource Groups** ▾ 

 vatsal ▾ N. Virginia ▾ Support ▾

[Amazon SageMaker](#) > Notebook instances

Notebook instances

Creation time after : Apr 01, 2019 20:19 UTC ✕

Actions ▾



Create notebook instance


< 1 > 

	Name ▾	Instance	Creation time ▾	Status ▾	Actions
<input type="radio"/>	western-kmean-project	ml.t2.medium	Apr 02, 2019 18:33 UTC	⊖ Stopped	Start

 Feedback  English (US)© 2008 - 2019, Amazon Internet Services Private Ltd. or its affiliates. All rights reserved. [Privacy Policy](#) [Terms of Use](#)

Instance in pending status

 Services ▾ Resource Groups ▾ 

 vatsal ▾ N. Virginia ▾ Support ▾

Amazon SageMaker > Notebook instances

Notebook instances

Creation time after : Apr 01, 2019 20:19 UTC ✕

Actions ▾

Create notebook instance

< 1 > 



	Name ▾	Instance	Creation time ▾	Status ▾	Actions
<input type="radio"/>	western-kmean-project	mL.t2.medium	Apr 02, 2019 18:33 UTC	 Pending	-


Feedback 

English (US) 

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In Service

 Services ▾ Resource Groups ▾ 

 vatsal ▾ N. Virginia ▾ Support ▾

Amazon SageMaker > Notebook instances

Notebook instances

Creation time after : Apr 01, 2019 20:19 UTC ✕

Actions ▾

Create notebook instance

< 1 > 

	Name ▾	Instance	Creation time	▼	Status ▾	Actions
<input type="radio"/>	western-kmean-project	mL.t2.medium	Apr 02, 2019 18:33 UTC		 InService	Open Jupyter Open JupyterLab

 Feedback  English (US)© 2008 - 2019, Amazon Internet Services Private Ltd. or its affiliates. All rights reserved. [Privacy Policy](#) [Terms of Use](#)

Jupyter Lab

The screenshot displays the Jupyter Lab web interface. At the top, a menu bar includes 'File', 'Edit', 'View', 'Run', 'Kernel', 'Git', 'Tabs', 'Settings', and 'Help'. Below the menu, the left sidebar shows a file browser for 'machine-learning-kmeans ...' with a 'History' tab. The history list includes 'EC2 Default User' (f9216ff, 6 days ago), 'Updated', 'Vatsal Shah' (dda620c, 6 days ago), and 'Initial commit'. A red box highlights the GitHub icon in the sidebar, with a red arrow pointing to the text 'GITHUB' below it. The main area is the 'Launcher' tab, titled 'machine-learning-kmeans'. It features a 'Notebook' section with a grid of 14 icons: 7 Python-based conda environments (conda_pytho..., conda_amaz..., conda_amaz..., conda_amaz..., conda_amaz..., conda_chain..., conda_chain...), 7 more Python-based conda environments (conda_mxne..., conda_mxne..., conda_pytho..., conda_pytor..., conda_pytor..., conda_tenso..., conda_tenso...), and 4 Sparkmagic environments (Sparkmagic (...)). Below the 'Notebook' section is a 'Console' section with 7 Python-based conda environment icons.

Jupyter

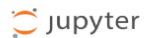
[Open JupyterLab](#)[Quit](#)[Files](#)[Running](#)[Clusters](#)[SageMaker Examples](#)

Select items to perform actions on them.

[Upload](#)[New ▾](#)

0 ▾ / machine-learning-kmeans			Name ▾	Last Modified	File size
...				seconds ago	
<input type="checkbox"/>		project.ipynb		6 days ago	566 B
<input type="checkbox"/>		main.py		6 days ago	149 B
<input type="checkbox"/>		README.md		6 days ago	76 B
<input type="checkbox"/>		train.csv		6 days ago	637 kB

Examples

[Open JupyterLab](#)[Quit](#)[Files](#)[Running](#)[Clusters](#)[SageMaker Examples](#)[Conda](#)

A collection of Amazon SageMaker sample notebooks.

[Introduction to Amazon Algorithms](#)[Introduction to Applying Machine Learning](#)[Advanced Functionality](#)[Hyperparameter Tuning](#)[Reinforcement Learning](#)[Additional Examples Github Fastai Course V3](#)[Additional Examples Github Pytorch Tutorials](#)[Ground Truth Labeling Jobs](#)[Sagemaker Python Sdk](#)[Scientific Details of Algorithms](#)[Sagemaker Spark](#)

On AWS

Amazon SageMaker | JupyterLab | machine-learning-kmeans/ | project

https://western-kmean-project.notebook.us-east-1.sagemaker.aws/notebooks/machine-learning-kmeans/project.ipynb

jupyter project Last Checkpoint: Last Tuesday at 2:48 PM (unsaved changes)

File Edit View Insert Cell Kernel Widgets Help Not Trusted conda_python3

In [1]: `%matplotlib inline
from copy import deepcopy
import numpy as np
import pandas as pd
from mpl_toolkits.mplot3d import Axes3D
from matplotlib import pyplot as plt
from sklearn.cluster import KMeans`

In [2]: `plt.rcParams['figure.figsize'] = (16, 9)
plt.style.use('ggplot')`

In [3]: `# Importing the dataset
data = pd.read_csv('./train.csv', index_col = ["User"])
Drop last column from dataset
data = data.iloc[:, :-1]`

In [4]: `print(data.shape)
data.head()`

Out[4]:

	Category 1	Category 2	Category 3	Category 4	Category 5	Category 6	Category 7	Category 8	Category 9	Category 10	...	Category 15	Category 16	Category 17	Category 18
User															
User 1	0.0	0.0	3.63	3.65	5.0	2.92	5.0	2.35	2.33	2.64	...	1.74	0.59	0.5	0.0
User 2	0.0	0.0	3.63	3.65	5.0	2.92	5.0	2.64	2.33	2.65	...	1.74	0.59	0.5	0.0
User 3	0.0	0.0	3.63	3.63	5.0	2.92	5.0	2.64	2.33	2.64	...	1.74	0.59	0.5	0.0
User 4	0.0	0.5	3.63	3.63	5.0	2.92	5.0	2.35	2.33	2.64	...	1.74	0.59	0.5	0.0
User 5	0.0	0.0	3.63	3.63	5.0	2.92	5.0	2.64	2.33	2.64	...	1.74	0.59	0.5	0.0

Objective & Goal

Dataset Overview

Approach Design

Visualization
Overview

Machine Learning
Model

Results

Amazon SageMaker

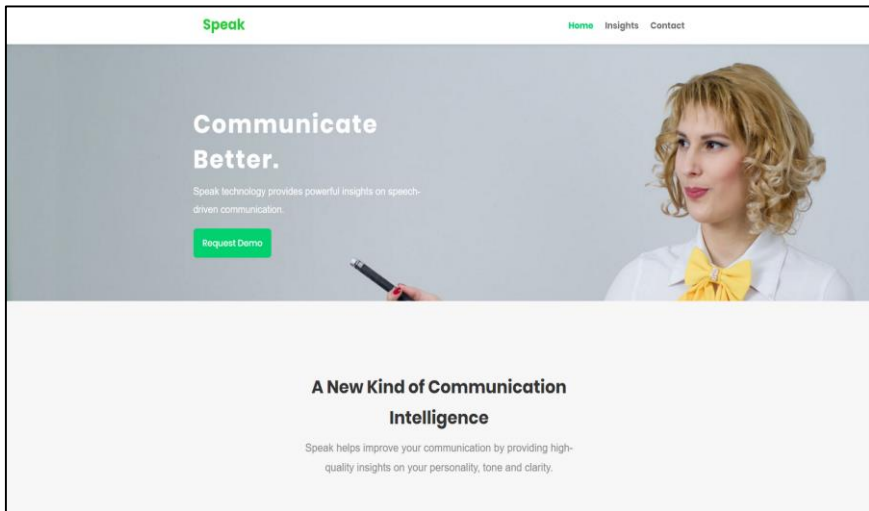
Future Work &
*QR Code

Technologies Used



Amazon SageMaker

Future work



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R	Updates	21 minutes ago
Resources	Merge branch 'master' of https://github.com/vatsal2210/Machine-Learni...	30 seconds ago
Group 16 - Presentation.pptx	Updates	a minute ago
Project_information.pdf	Updates	18 hours ago
README.md	Updates	18 hours ago
train.csv	changes	20 days ago

README.md

Machine-Learning-Project-Western

A project is on user's rating of travelling. There are various 24 attractions included in this database.

Dataset description

- Total categories: 24
- Total Number of users: 5456
- ID Column: Users ID

Columns:

Attribute 1 : Unique user id Attribute 2 : churches Attribute 3 : resorts Attribute 4 : beaches Attribute 5 : parks Attribute 6 : theatres Attribute 7 : museums Attribute 8 : malls Attribute 9 : zoo Attribute 10 : restaurants Attribute 11 : pubs/bars

Resources:

- Getting started with Amazon SageMaker: [Link](#)
- Use the Amazon SageMaker SDK: Python: [Link](#)
- 'Evaluation of Partitioning Clustering Algorithms for Processing Social Media Data in Tourism domain', Shini Renjith, A. Sreekumar, M. Jathavedan, 2018 IEEE Recent Advances in Intelligent Computational Systems (RAICS) | December 06 - 08, 2018 , Trivandrum [Link](#)
- 'Use and Impact of Online Travel Reviews', Markus Schuckert , Liu XianweiRob Law [Link](#)
- 'Hospitality and Tourism Online Reviews: Recent Trends and Future Directions', Ulrike Gretzel , Kyung-Hyan Yoo [Link](#)
- SageMaker Examples: [Link](#)
- Python vs R Comparison: [Link](#)
- Python Libraries: [Link](#)
- R Libraries : [Link](#)
- K-means Algorithm: [Link](#)



time for **questions**

THANK YOU