### SDSC3002 Credit Card Customer segmentation

PRESENTATION

### Introduction

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- 1. Analysis of how credit card products should be developed
- 2. Based on current customer segments
- 3. Targets for existing products or new products.
- 4. Segmentation is critical because
  - A. Limited resources
  - B. Identify and serve customers

# Description of the dataset

### About the dataset

- 1. Usage behavior of about 9000 active credit card holders
- 2. In last 6 months
- 3. 18 behavioral variables such as:
  - 1. Balance
  - 2. Purchase behavior
  - 3. Credit limit

### Key statistics of the dataset

1. Number of data: 8950

2. Number of column: 18

3. Number of NaN data: 313

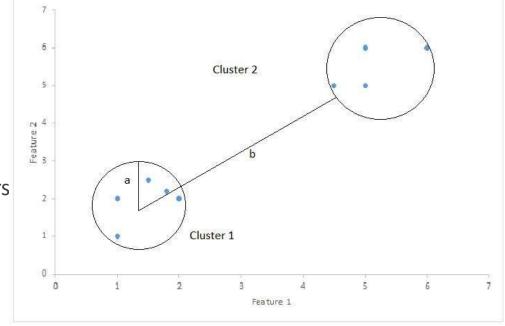
# Description of data mining tasks

### Data mining techniques used

- 1. For finding the number of clusters:
  - 1. Elbow Method
  - 2. Silhouette scores
- 2. Hierarchical Clustering
- 3. K-mean Clustering
- 4. PCA for visualization

### Silhouette Score

- Silhouette Score = (b-a)/max(a,b),
- where
- a= average intra-cluster distance
- b= average inter-cluster distance
- 1: clusters clearly distinguished.
- 0: no clear distinction between clusters
- -1: clusters mis-assigned



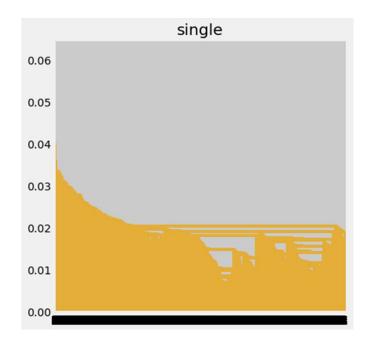
### Linkage Criteria

- Single linkage: shortest distance between a pair of observations in two clusters
- Complete linkage: longest distance between a pair of observations in two clusters
- Average linkage: average distance between each pair of observations in each cluster
- Ward linkage: sum of intra-cluster variance of two clusters

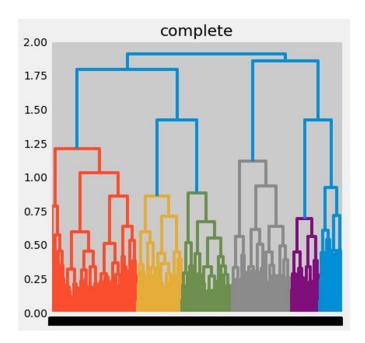
# Results for Hierarchical Clustering

### Dendrogram

#### SINGLE

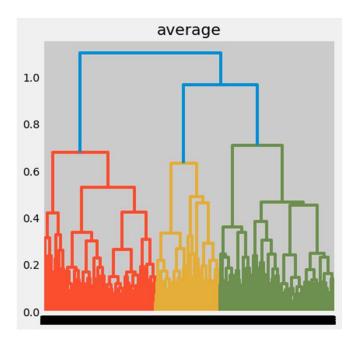


#### COMPLETE

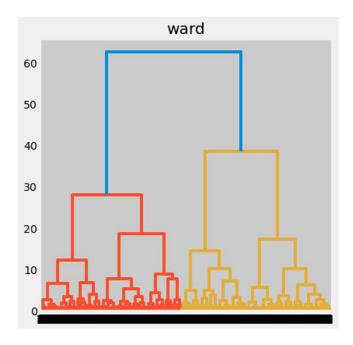


### Dendrogram

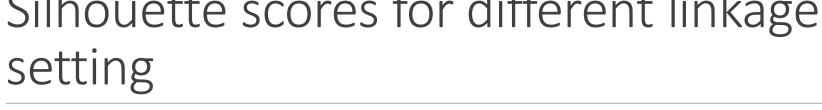
#### **AVERAGE**

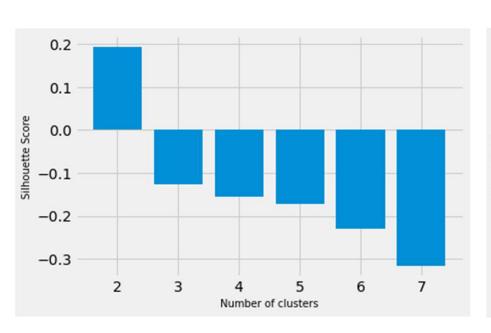


#### WARD

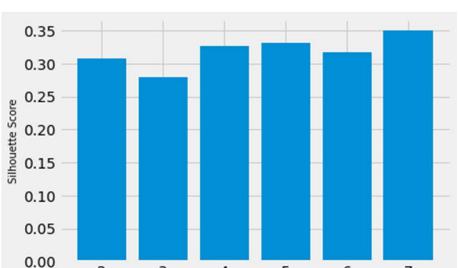


## Silhouette scores for different linkage





**SINGLE** 

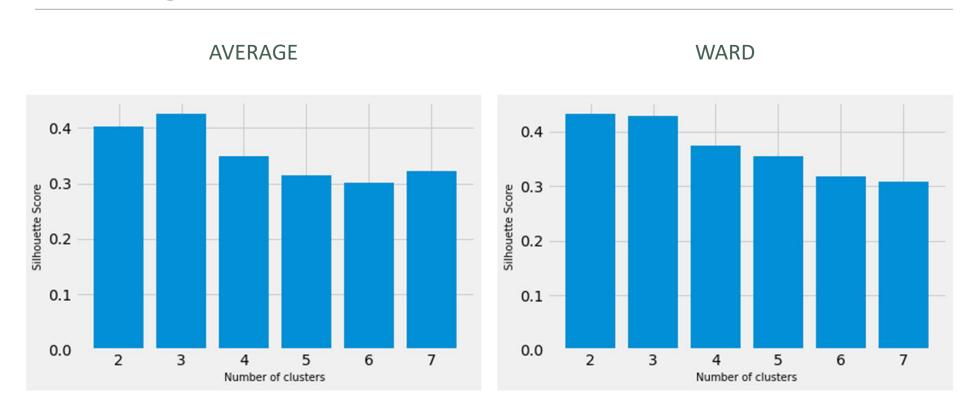


Number of clusters

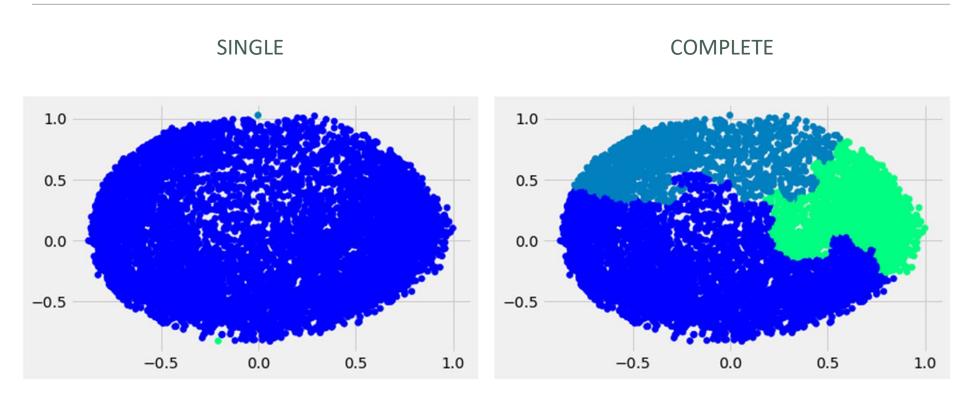
7

**COMPLETE** 

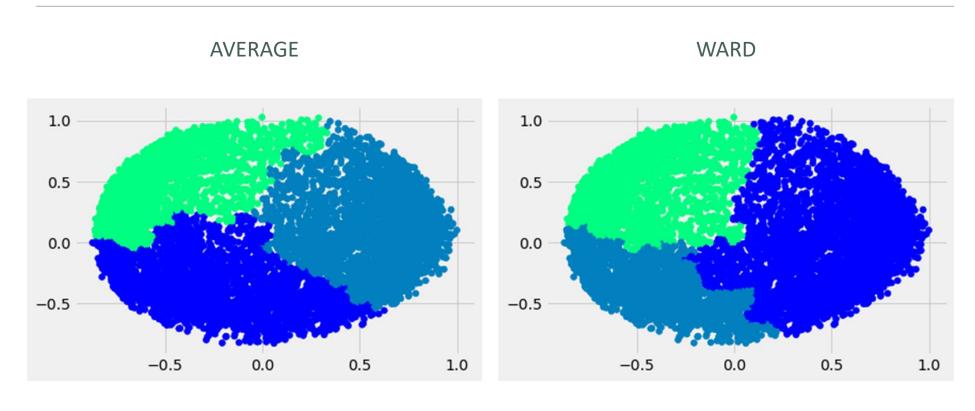
## Silhouette scores for different linkage setting



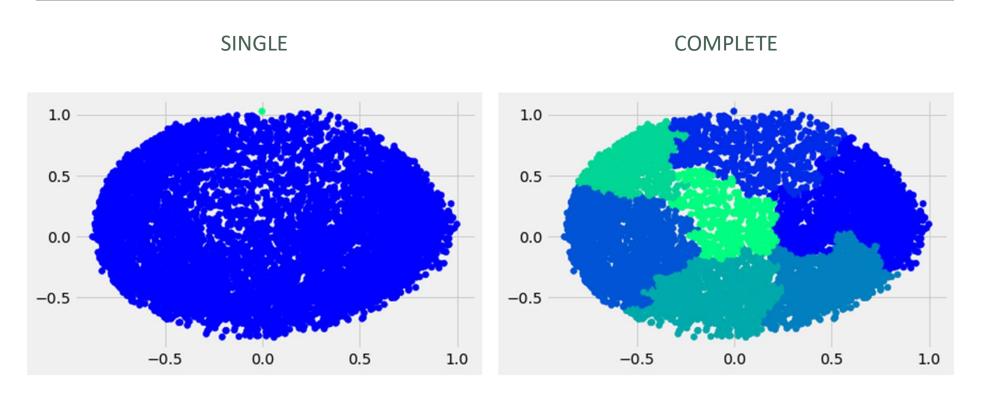
## Clustering visualization in different linkage setting with n=3



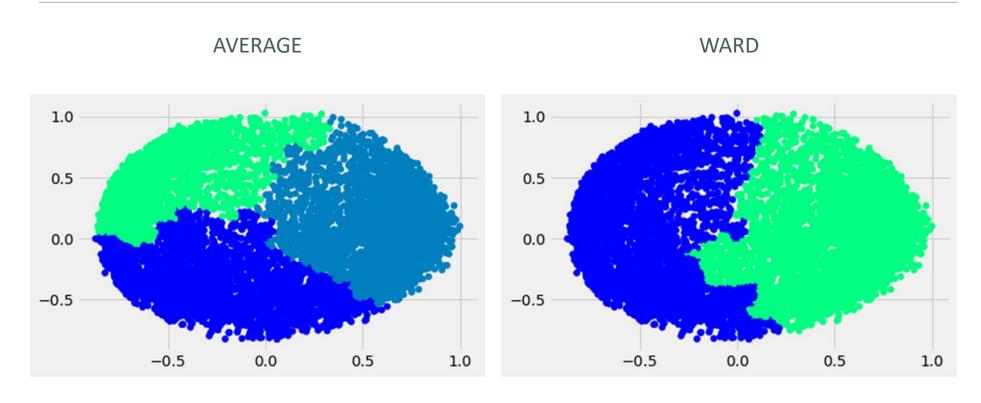
## Clustering visualization in different linkage setting with n=3



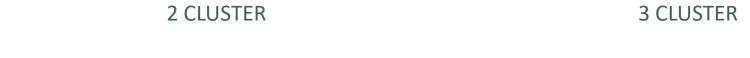
## Clustering visualization in different linkage setting with best Silhouette scores

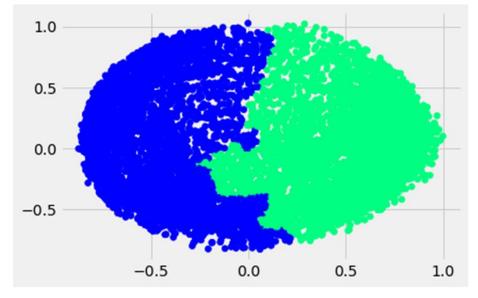


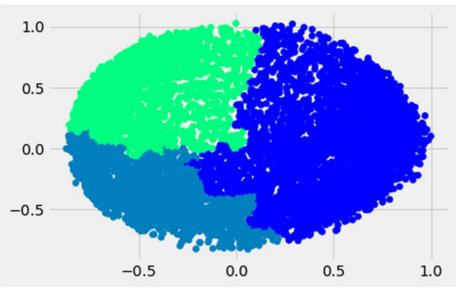
## Clustering visualization in different linkage setting with best Silhouette scores



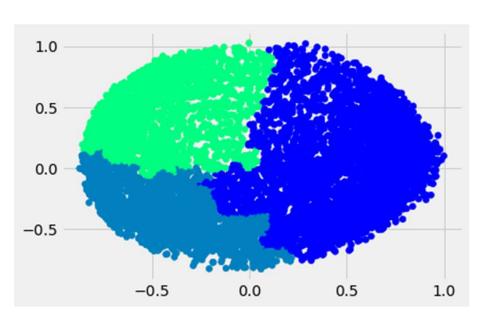
### Clustering visualization with Ward







### Results for Hierarchical Clustering

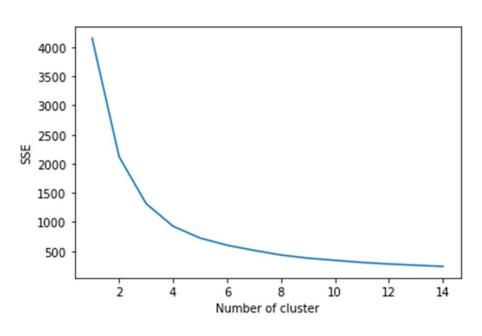


#### Method "Ward"

- 1. Highest Silhouette scores amount all method
- 2. Number of cluster: 3
  - 1. 2 and 3 has similar score
  - 2. More cluster, more flexible
  - 3. Provide more precise strategy to different group of customers

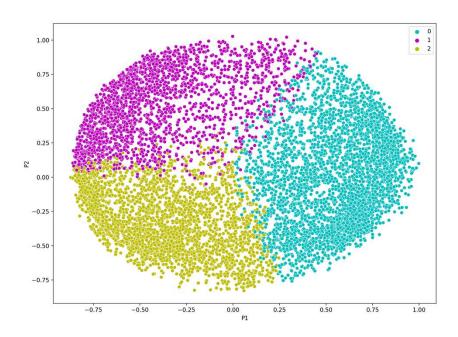
# Results for K-mean Clustering

### Elbow Method



- 1. 2 and 3 both are good choice
- 2. Validated the results for Hierarchical Clustering and choose 3

### Visualization by PCA for n=2



# Recommendation for 3 clusters

#### Recommendation for 3 cluster: Cluster 1

- 1. Low balance
- 2. Low purchase frequency
- 3. Lowest credit limit
- 4. Not the main target customers

	Cluster 1	Cluster 2	Cluster 3
Account balance	Low	Medium	High
Purchase frequency	Low	High	Medium
Credit limit	Low	Medium	High
Cash advance	Medium	Low	High

#### Recommendation for 3 cluster: Cluster 2

- 1. High purchase frequency
- Medium balance
- 3. Low cash advance
- 4. Main target because these customer frequently use the card to purchase

	Cluster 1	Cluster 2	Cluster 3
Account balance	Low	Medium	High
Purchase frequency	Low	High	Medium
Credit limit	Low	Medium	High
Cash advance	Medium	Low	High

### Recommendation for 3 cluster: Cluster 3

- 1. High balance
- 2. High cash advance
- 3. High credit limit
- 4. Use credit cards as loans

	Cluster 1	Cluster 2	Cluster 3
Account balance	Low	Medium	High
Purchase frequency	Low	High	Medium
Credit limit	Low	Medium	High
Cash advance	Medium	Low	High

### Thank you