

**A Mini Project Report On**

**CUSTOMER SEGMENTATION FOR ENHANCED MARKETING  
STRATEGIES USING DATA SCIENCE**

*Submitted to partial fulfillment of the requirements for the award of the degree of*

**BACHELOR OF TECHNOLOGY**

**in**

**COMPUTER SCIENCE AND ENGINEERING**

**by**

<b>K. THARUN</b>	<b>(21915A6703)</b>
<b>D. GANESH</b>	<b>(21915A6701)</b>
<b>V. DHATRESH</b>	<b>(20911A6757)</b>
<b>J. VARDHAN</b>	<b>(21915A6702)</b>

*Under the Guidance of*

**Mr. R. YOGESH**  
Associate. Professor



**DEPARTMENT OF COMPUTER SCIENCE & ENGINEERING**

**VIDYA JYOTHI INSTITUTE OF TECHNOLOGY**

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**(Approved by AICTE, Accredited by NAAC, NBA & permanently Affiliated to  
JNTUH, Hyderabad) Aziz Nagar Gate, C.B. Post, Hyderabad-500075**

**2023-2024**



**VIDYA JYOTHI**  
**INSTITUTE OF TECHNOLOGY**  
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**DEPARTMENT OF COMPUTER SCIENCE AND ENGINEERING**

**CERTIFICATE**

This is to certify that the project report titled “**CUTOMER SEGMENTATION FOR ENHANCED MARKETING STRATEGIES**” is being submitted by **K.THARUN (21915A6703), D.GANESH (21915A6701), V.DHATRESH (20911A6757), J.VARDHAN (21915A6702)** in partial fulfillment for the award of the Degree of Bachelor of Technology in **Computer Science and Engineering**, is a record of bonafide work carried out by them under my guidance and supervision. These results embodied in this project report have not been submitted to any other University or Institute for the award of any degree or diploma.

***Internal Guide***

Mr. R. Yogesh

Associate. Professor

***Head of Department***

Dr. D Aruna Kumari

Professor

**External Examiner**

## **DECLARATION**

We hereby certify that the work which is being presented in the project entitled “**Customer Segmentation for Enhanced Marketing Strategies using Data Science**” in partial fulfillment of the requirements for the award of Degree of Bachelor of Technology and submitted in the Department of Computer Science and Engineering, Vidya Jyothi Institute of Technology, Aziz nagar is an authentic record of my own work carried under the guidance of **Mr.R.Yogesh**, Associate Professor. The work presented in this project report has not been submitted by us for the award of any other degree of this or any other Institute/University.

<b>Date:</b>	<b>K.THARUN</b>	<b>(21915A6703)</b>
<b>Place: Hyderabad</b>	<b>D.GANESH</b>	<b>(21915A6701)</b>
	<b>V.DHATRESH</b>	<b>(20911A6757)</b>
	<b>J.VARDHAN</b>	<b>(21915A6702)</b>

# ABSTRACT

The “**Customer Segmentation**” project aims to develop a comprehensive framework for customer segmentation by leveraging advanced data analytics techniques. The research involves the collection and analysis of various customer data points, such as demographics, purchasing behavior, social media interactions, and customer feedback. By applying clustering algorithms and machine learning algorithms, the project seeks to identify homogeneous customer segments and discover meaningful insights.

The anticipated outcomes of this project are manifold. Firstly, it will provide a deeper understanding of customer behavior and preferences, enabling organizations to make data-driven decisions. Secondly, it will facilitate the development of personalized marketing campaigns that resonate with specific customer segments, leading to improved customer acquisition and retention. Finally, the project will contribute to the growing field of customer segmentation, providing valuable insights and practical guidance for businesses across various industries.

## **ACKNOWLEDGEMENT**

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**K.THARUN (21915A6703)**

**D.GANESH (21915A6701)**

**V.DHATRESH (20911A6757)**

**J.VARDHAN (21915A6702)**

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# ***Chapter 1***

## **INTRODUCTION**

In today's dynamic market, businesses face the challenge of understanding their customers' diverse needs and preferences. Customer segmentation emerges as a powerful tool to address this challenge. It involves dividing a customer base into distinct groups based on shared characteristics, such as demographics, behaviors, preferences, and needs.

Customer segmentation offers a multitude of benefits for businesses, including increased marketing effectiveness, improved sales performance, enhanced customer satisfaction, reduced costs, and greater customer loyalty. By tailoring marketing campaigns, sales strategies, and customer service approaches to each segment, businesses can create a more personalized and satisfying customer experience.

There are various ways to segment a customer base, with some of the most common bases being demographics, behaviors, psychographics, and geographic factors. The customer segmentation process typically involves identifying segmentation goals, collecting customer data, analyzing customer data, developing segmentation criteria, creating customer segments, profiling each segment, developing targeted strategies, and continuously measuring and refining the segmentation.

Customer segmentation is an ongoing process that requires continuous adaptation to changing customer preferences and behaviors. By effectively segmenting their customer base, businesses can gain a deeper understanding of their customers, enabling them to deliver more personalized and effective marketing campaigns, improve sales performance, enhance customer satisfaction, and ultimately achieve their overall business goals.

# *Chapter 2*

## LITERATURE SURVEY

Customer segmentation in marketing involves categorizing a diverse customer base into distinct groups based on shared characteristics. A literature survey on this topic would cover various aspects, including methodologies, benefits, and applications.

### 2.1 EVOLUTION OF CUSTOMER SEGMENTATION

- **Traditional Approaches:** Historically, customer segmentation was often conducted manually, relying on subjective assessments and limited data.
- **Data-driven Segmentation:** The advent of big data and analytics has transformed customer segmentation, enabling businesses to leverage vast amounts of customer data to identify patterns and insights.

### 2.2 KEY FEATURES OF CUSTOMER SEGMENTATION

- **Dynamic Customer Data Management:** Modern customer segmentation platforms prioritize dynamic customer data management, allowing businesses to seamlessly collect, update, and analyse customer information.
- **Advanced Segmentation Techniques:** Businesses now employ sophisticated segmentation techniques, such as predictive modelling, machine learning, and artificial intelligence, to uncover hidden customer segments and gain deeper insights into customer behaviour.
- **Customized Customer Strategies:** Customer segmentation enables businesses to develop targeted marketing campaigns, sales strategies, and customer service approaches tailored to each segment's unique needs and preferences.

### 2.3 CHALLENGES AND ETHICAL CONSIDERATIONS

- **Data Privacy and Security:** With the increasing collection and use of customer data, concerns arise about data privacy, security, and the responsible use of customer information.

- **Integration with Existing Systems:** Integrating customer segmentation platforms with existing customer relationship management (CRM) and marketing automation (MA) systems can be challenging.

## 2.4 FUTURE DIRECTIONS AND INNOVATIONS

- **AI-driven Segmentation:** The integration of artificial intelligence (AI) is expected to further enhance customer segmentation, enabling real-time segmentation, predictive modeling, and personalized customer experiences.
- **Omnichannel Customer Segmentation:** Customer segmentation will likely extend to omnichannel data, enabling businesses to understand customer behavior across various channels and devices.
- **Customer Segmentation as a Continuous Process:** Customer segmentation will evolve into an ongoing process, with businesses continuously adapting their strategies based on changing customer needs and behaviors.

## *Chapter 3*

### **FEASIBILITY STUDY**

Customer segmentation is the process of dividing a customer base into smaller groups based on shared characteristics. This allows businesses to tailor their marketing and sales efforts to specific segments, which can improve customer satisfaction and loyalty.

A customer segmentation project can be a valuable investment for businesses of all sizes. However, it is important to carefully consider the feasibility of such a project before proceeding. This feasibility study will assess the potential benefits and risks of a customer segmentation project for a hypothetical company.

#### **3.1 POTENTIAL BENEFITS**

There are many potential benefits to customer segmentation, including:

- **Increased customer satisfaction and loyalty:** By understanding the needs and preferences of different customer segments, businesses can tailor their products, services, and marketing messages to better meet those needs. This can lead to increased customer satisfaction and loyalty.
- **Improved customer acquisition and retention:** Customer segmentation can help businesses identify and target potential customers who are most likely to be interested in their products or services. This can lead to improved customer acquisition and retention rates.
- **More effective marketing and sales campaigns:** By understanding the different customer segments, businesses can develop more effective marketing and sales campaigns that are specifically targeted to each segment. This can lead to increased sales and revenue.
- **Reduced costs:** Customer segmentation can help businesses identify and eliminate wasteful spending on marketing and sales efforts that are not targeted to the right audience. This can lead to reduced costs and increased profitability.

## 3.2 POTENTIAL RISKS

There are also some potential risks associated with customer segmentation, including:

- **Cost of implementation:** Customer segmentation projects can be expensive to implement, especially if they require the purchase of new software or the hiring of additional personnel.
- **Data quality issues:** The success of a customer segmentation project is heavily dependent on the quality of the data used to create the segments. If the data is incomplete, inaccurate, or outdated, the segmentation results will be unreliable.
- **Privacy concerns:** Customer segmentation can raise privacy concerns, as it involves collecting and storing personal information about customers. It is important to have a clear privacy policy in place to protect customer data.
- **Change management:** Implementing a customer segmentation project can be disruptive to the organization, and it is important to have a plan in place to manage change effectively.

## 3.3 FEASIBILITY ASSESSMENT

Based on the potential benefits and risks of customer segmentation, the following factors should be considered when assessing the feasibility of a customer segmentation project:

- **Business goals:** What are the business goals for the customer segmentation project? What is the company hoping to achieve by segmenting its customer base?
- **Data availability:** Does the company have access to the data needed to segment its customer base? Is the data accurate and complete?
- **Resources:** Does the company have the resources to implement a customer segmentation project? This includes financial resources, personnel, and technology.
- **Management commitment:** Is there strong management commitment to the customer segmentation project? Is management prepared to invest the time and resources necessary to make the project successful?

## *Chapter 4*

# **SYSTEM REQUIREMENTS**

### **4.1 EXISTING SYSTEM**

The existing system in old customer segmentation projects is often manual and time-consuming.

This manual process can be very time-consuming and error-prone, especially for businesses with large customer bases. Additionally, it can be difficult to identify all of the relevant customer segments and to accurately analyze the segments.

### **4.2 PROPOSED SYSTEM:**

#### **New approaches to customer segmentation:**

- A number of new approaches to customer segmentation are emerging that address some of the challenges of existing systems. For example, machine learning can be used to develop more dynamic and sophisticated segmentation models. Machine learning models can be trained to learn from customer data over time and identify new patterns and relationships.
- Another new approach to customer segmentation is real-time segmentation. Real-time segmentation allows companies to segment their customers based on their current behavior or context. For example, a company could segment its customers based on the products they are viewing on their website or the products they are searching for on social media.

This project proposes a system for customer segmentation using machine learning. The system will be able to identify customer segments based on their purchase behavior, demographics, and other relevant data. This information can then be used to develop targeted marketing campaigns.

## 4.3 SYSTEM REQUIREMENTS

### 4.3.1 SOFTWARE REQUIREMENTS

- **Operating system** : Windows 7 and above.
- **Coding Language** : Python
- **Libraries** : Pandas  
NumPy  
Matplotlib  
Scikit Learn  
Seaborn  
SciPy
- **IDE** : Jupiter Note Book

### 4.3.2 HARDWARE REQUIREMENTS

- **Processor** : Minimum dual-core processor.
- **RAM** : At least 4 GB for smooth operation.
- **Storage** : Sufficient storage for database and software.

## 4.4 REQUIREMENTS DEFINATION

After the severe continuous analysis of the problems that arose in the existing system, we are now familiar with the requirement required by the current system. The requirements that the system needs are categorized into functional and non-functional requirements. These requirements are listed below:

### 4.4.1 FUNCTIONAL REQUIREMENTS

- **Customer Data Management:** The system should provide a centralized platform for managing customer data, including customer demographics, purchase history, and preferences.

- **Segmentation Analysis:** The system should enable users to segment customer data based on various criteria, such as demographics, behaviors, psychographics, and geographic factors.
- **Targeted Marketing Campaigns:** The system should allow users to create and manage targeted marketing campaigns based on customer segments.
- **Customer Insights:** The system should provide insights into customer behavior, preferences, and trends to help businesses make informed decisions.

#### 4.4.2 NON-FUNCTIONAL REQUIREMENTS

- **Data Security:** The system should implement robust security measures to protect sensitive customer data, including encryption, access controls, and data loss prevention.
- **Scalability:** The system should be able to handle increasing volumes of customer data and user traffic without compromising performance or stability.
- **Usability:** The system should provide an intuitive and user-friendly interface that is easy to navigate and use for both technical and non-technical users.
- **Integration:** The system should integrate seamlessly with existing CRM and marketing automation systems to streamline customer management and marketing processes.



# ***Chapter 5***

## **SYSTEM DESIGN**

### **5.1 UML DIAGRAMS**

UML diagram is designed to let developers and customers view a software system from a different perspective and in varying degrees of abstraction. In its simplest form, a use case can be described as a specific way of using the system from a User's (actor's) perspective.

- a pattern of behaviour the system exhibits and a sequence of related transactions by actor. delivering something of value to the actor. Use cases provide a means to capture system requirements and communicate with the end users and domain experts Test the system
- A UML system is represented using five different views that describe the system from a distinctly different perspective. Each view is defined by a set of diagrams, which is as follows.

#### **User Model View**

- This view represents the system from the user's perspective.
- The analysis representation describes a usage scenario from the end user's perspective.

#### **Structural model view**

- In this model, the data and functionality come from inside the system.
- This model view models the static structures.

#### **Behavioural Model View**

- It represents the dynamic of behaviour as parts of the system, depicting the interactions of collection between various structural elements described in the user model and structural model view.

#### **Implementation Model View**

- In this, the structural and behavioural parts of the system are represented as they are to be built.

#### **Environmental Model View**

- In this, the structural and behavioural aspects of the environment in which the system is to be implemented are represented.
- UML is specifically constructed through two different domains they are:

- UML Analysis modelling, which focuses on the user model and structural model views of the system.

### 5.1.1 CLASS DIAGRAM

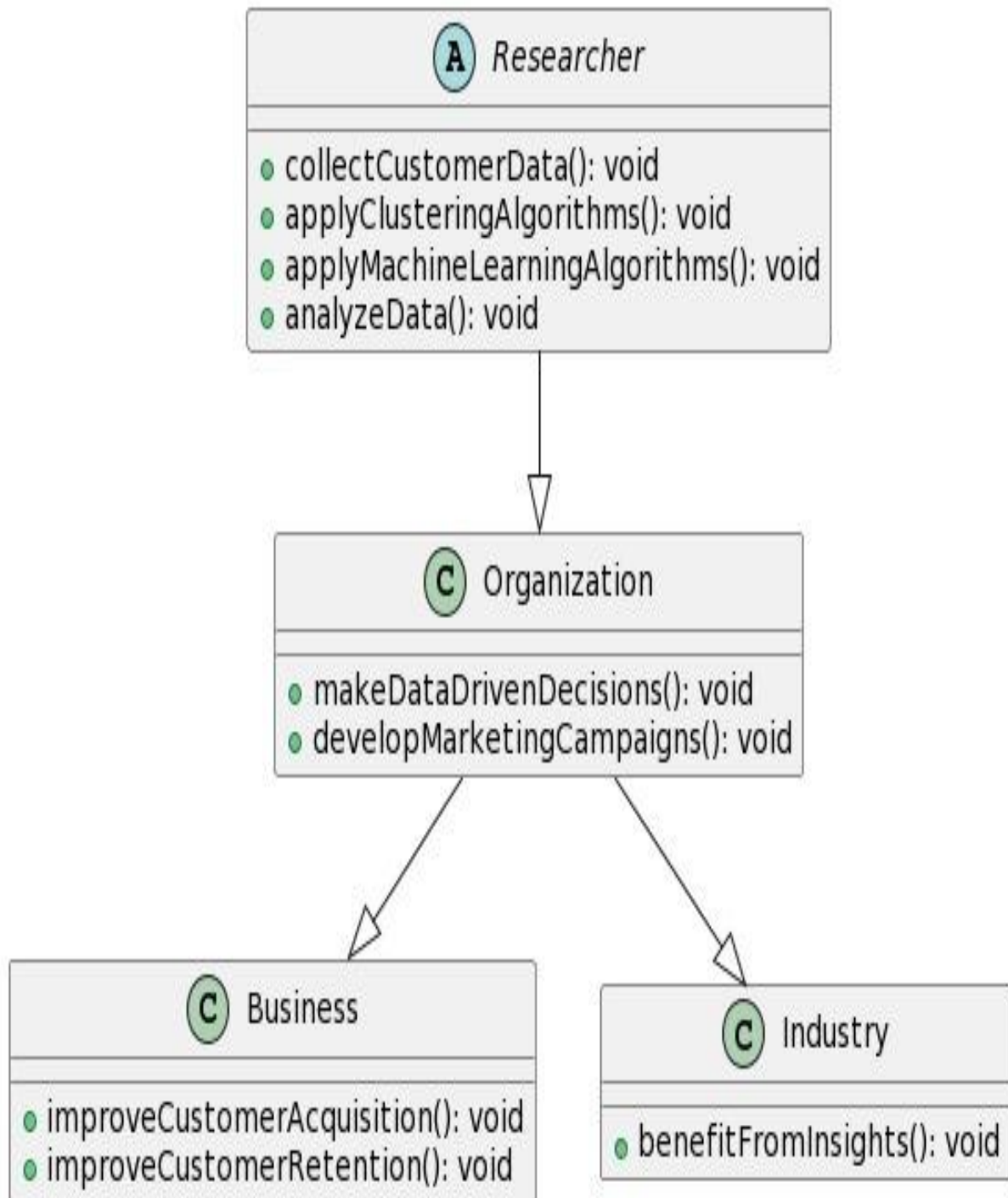


Figure 5.1: Class Diagram

### 5.1.2 COMPONENT DIAGRAM

A customer segmentation system is a complex software application that involves various components working together to collect, store, analyze, and utilize customer data for segmentation purposes. The following is a description of the key components of a customer segmentation system.

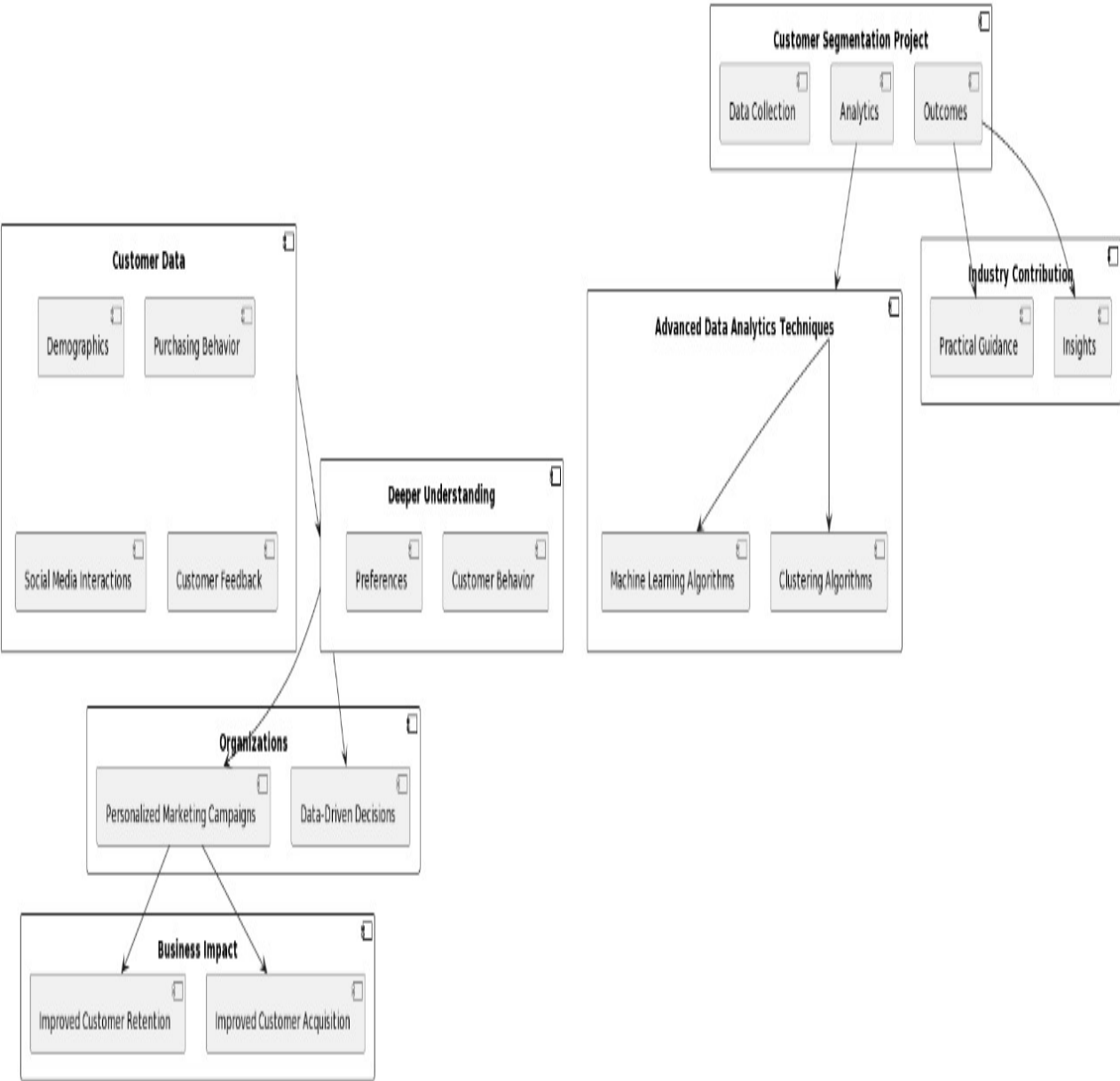


Figure. 5.2: Component diagram

5.1.3 ACTIVITY DIAGRAM

Customer segmentation is a crucial process for businesses to understand their customers' diverse needs and preferences. This activity diagram illustrates the steps involved in the customer segmentation process. Activity diagram provides a clear representation of the customer segmentation process, emphasizing the importance of data-driven decision-making and continuous improvement.

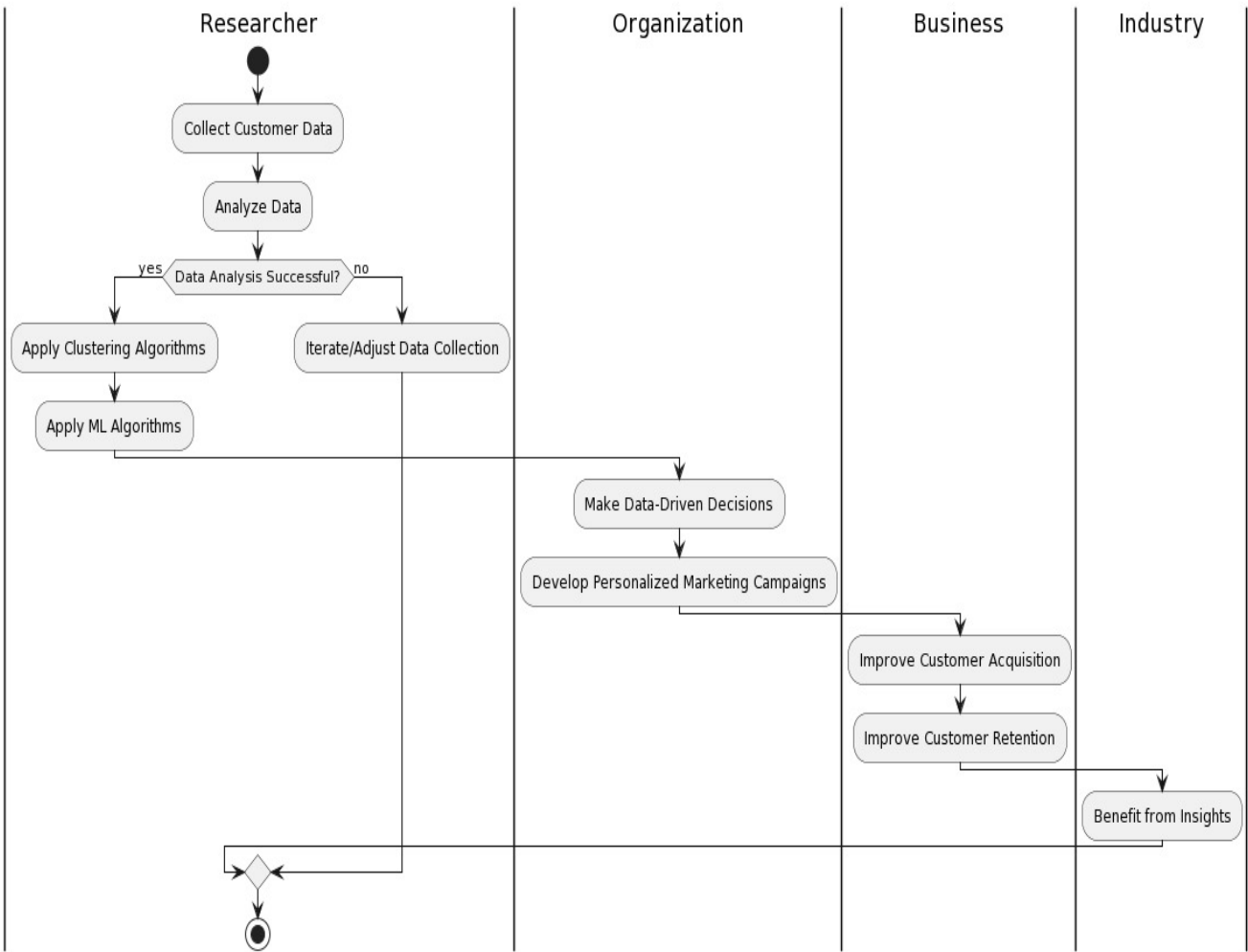


Figure. 5.3: Activity diagram

### 5.1.4 STATE DIAGRAM

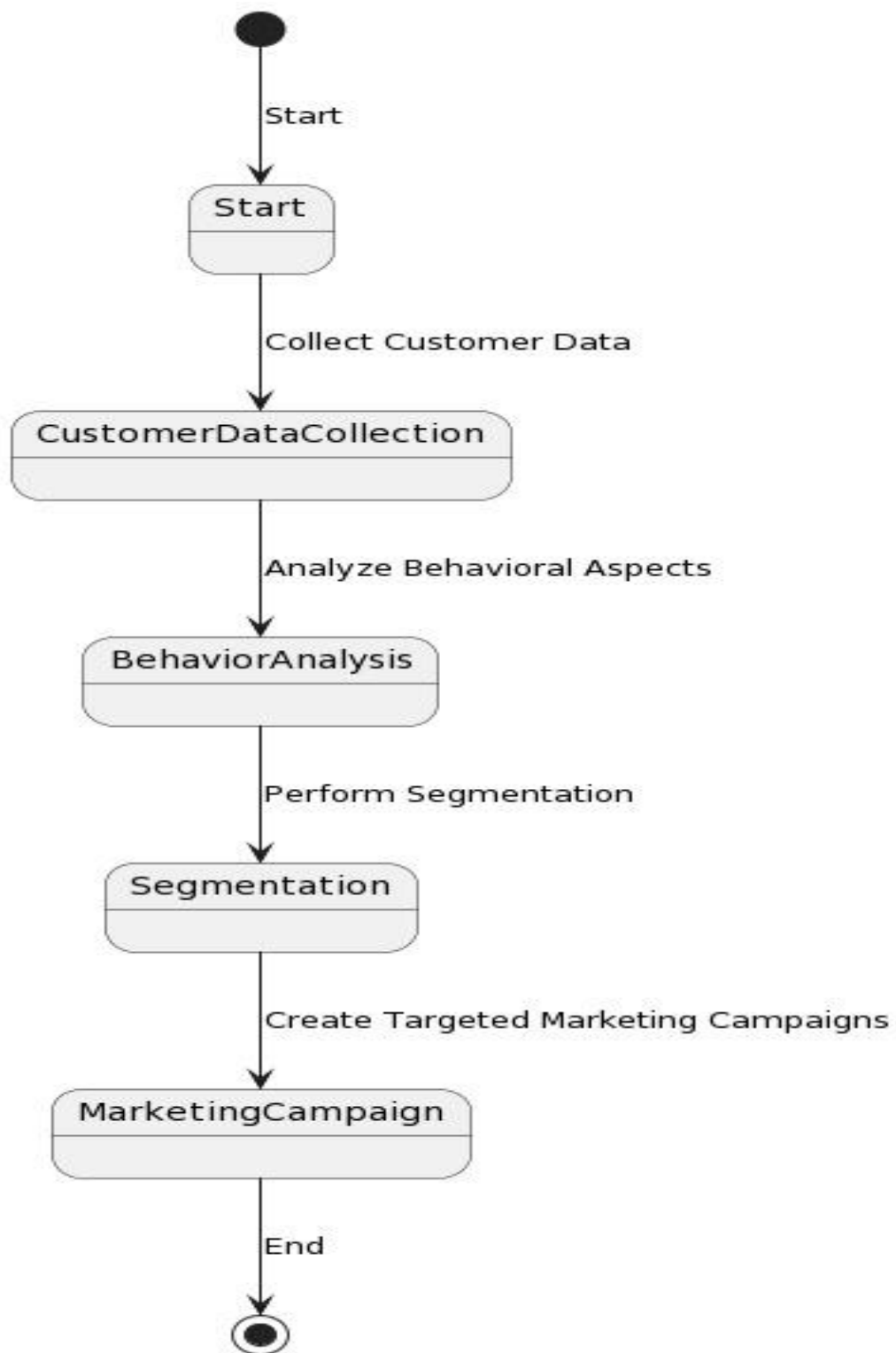


Figure. 5.4: State diagram

### 5.1.5 SEQUENCE DIAGRAM

The sequence diagram illustrates the process of customer segmentation, highlighting the interactions between the customer data source, the customer segmentation system, and the marketing and sales teams. The flow of events depicts the data exchange, segmentation process, strategy generation, and implementation of targeted strategies. The diagram emphasizes the continuous nature of customer segmentation, as updated customer data triggers resegmentation and strategy refinement.

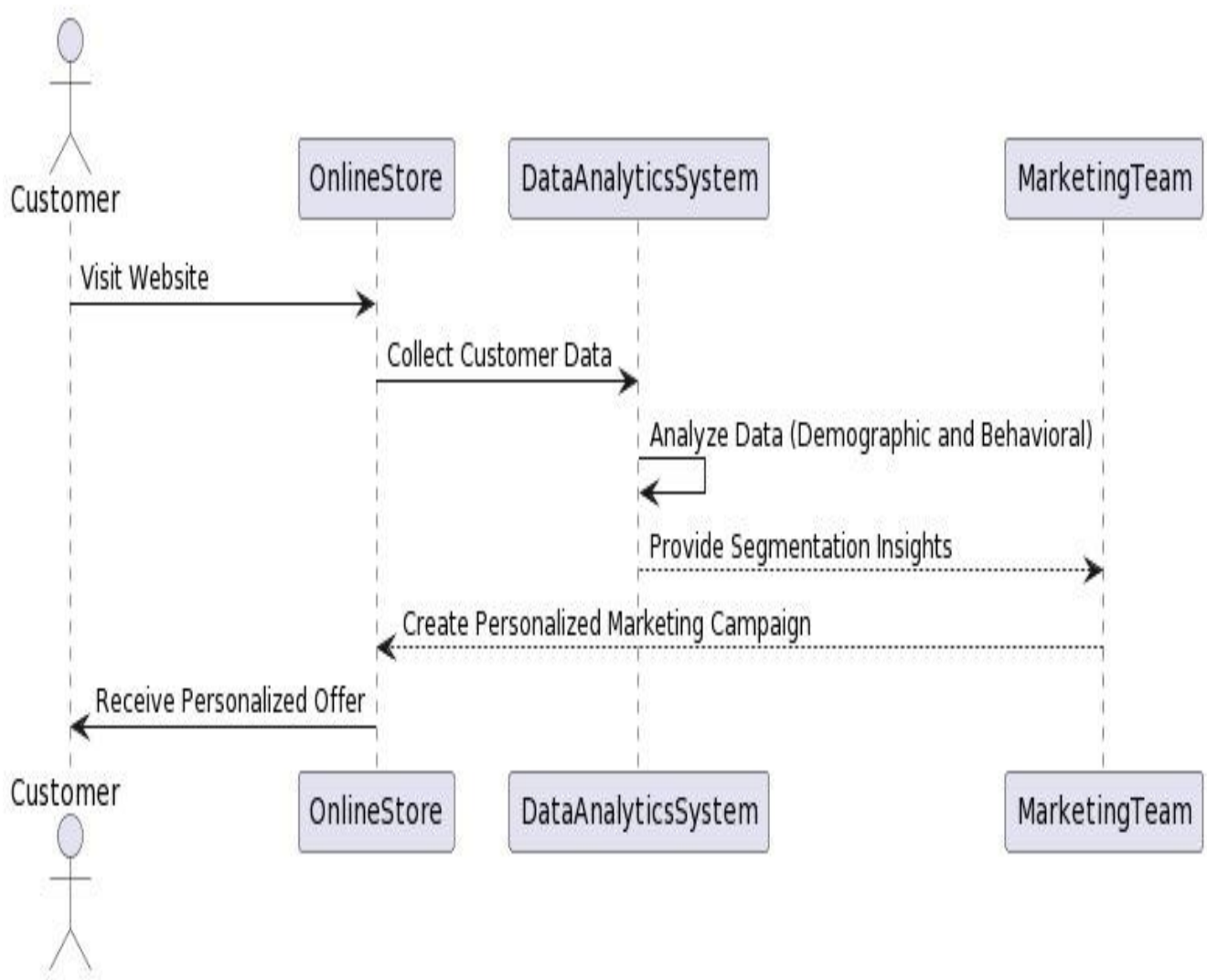


Figure. 5.5: Sequence diagram

### 5.1.6 DEPLOYMENT DIAGRAM

The deployment diagram for customer segmentation would show these components deployed on different servers or cloud platforms. The specific deployment architecture would depend on the organization's specific needs and requirements. For instance, a small organization might choose to deploy the entire system on a single server, while a large enterprise might choose to use a cloud-based deployment with multiple servers distributed across different regions.

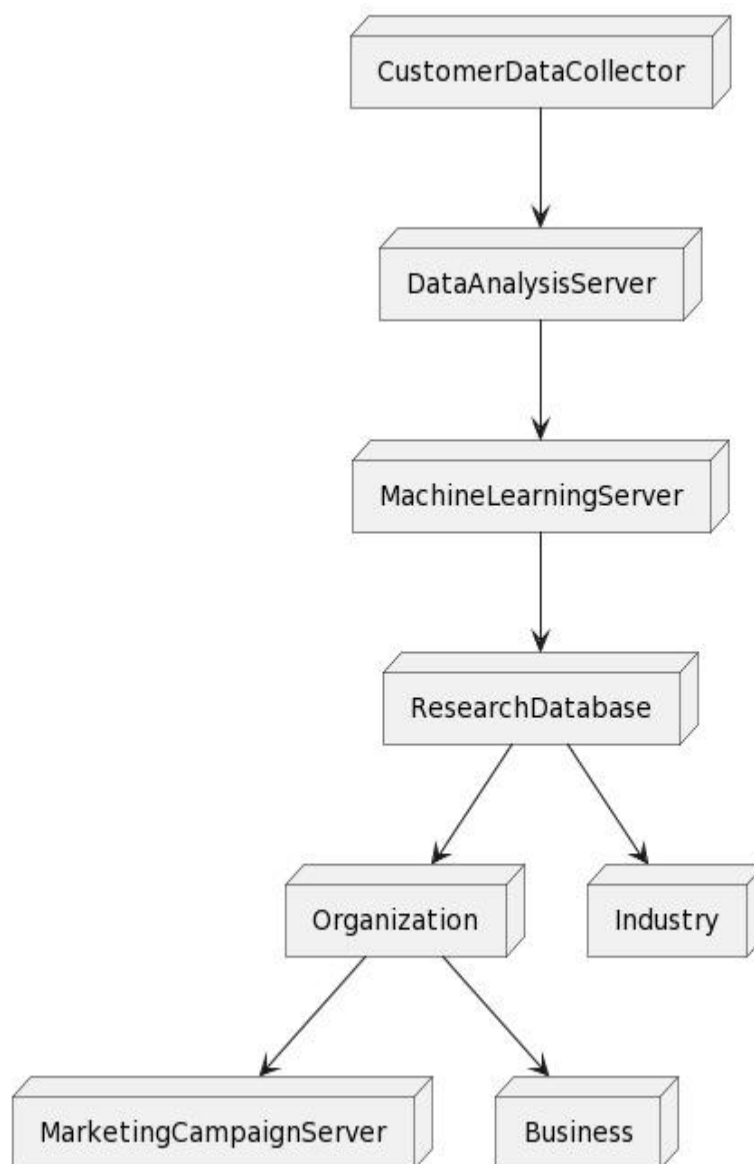


Figure. 5.6: Deployment diagram

# *Chapter 6*

## **SOFTWARE IMPLEMENTATION**

### **6.1 DEVELOPMENT ENVIRONMENT SETUP:**

- **Integrated Development Environment (IDE):** Choose a suitable programming language and IDE for coding the project. Popular options include Python with PyCharm, JavaScript with Visual Studio Code, or Java with Eclipse.
- **Data Analytics Tool:** Set up and configure a data analytics tool like Python's pandas library or R to perform data manipulation, analysis, and segmentation.

### **6.2 DATA COLLECTION AND PREPARATION:**

- **Data Sources:** Identify and gather relevant customer data from various sources, such as CRM systems, transaction records, social media interactions, and website analytics.
- **Data Cleaning and Preprocessing:** Clean and prepare the collected data to ensure accuracy, consistency, and completeness. This may involve handling missing values, outliers, and data inconsistencies.

### **6.3 CUSTOMER SEGMENTATION DESIGN AND IMPLEMENTATION:**

- **Segmentation Strategy:** Define the segmentation criteria and objectives based on business goals and customer insights. Common segmentation factors include demographics, behaviors, and psychographics.
- **Segmentation Algorithm:** Choose or develop an appropriate segmentation algorithm, such as k-means clustering, hierarchical clustering, or rule-based segmentation, to group customers into distinct segments.

### **6.4 MODEL EVALUATION AND VALIDATION:**

- **Performance Metrics:** Evaluate the effectiveness of the segmentation model using metrics like silhouette score, Calinski-Harabasz index, or Dunn's index.



- **Validation Techniques:** Validate the segmentation model using techniques like cross-validation or holdout data to ensure its generalizability and predictive power.

## 6.5 APPLICATION DEPLOYMENT AND MAINTENANCE:

- **Deployment Strategy:** Choose a suitable deployment strategy, such as cloud-based hosting or on-premises installation, depending on infrastructure and security requirements.
- **Monitoring and Maintenance:** Monitor the system's performance, data quality, and segmentation accuracy, and implement regular updates and maintenance to ensure its continued effectiveness.

## 6.6 SAMPLE CODE:

```
#importing the dependencies
```

```
import numpy as np
```

```
import pandas as pd
```

```
import matplotlib.pyplot as plt
```

```
import seaborn as sns
```

```
from sklearn.cluster import KMeans
```

```
#Data collection & analysis
```

```
customer_data=pd.read_csv('Mall_customer.csv')
```

```
#first 5 rows in the dataframe
```

```
customer_data.head()
```

```
df=pd.read_csv("Mall_customer.csv")
```

```
df.head()
```

```
# checking for missing values
```

```
customer_data.isnull().sum()
```

```
# Clustering the 2D data
```

```
#choosing the number of clusters wcss -> within clusters sum of squares
```

### # Elbow Method

```
wcss = []  
for i in range(1,11):  
    kmeans= KMeans(n_clusters=i, init='k-means++', random_state=42)  
    kmeans.fit(X)  
    wcss.append(kmeans.inertia_)
```

### #The elbow curve

```
plt.figure(figsize=(12,6))  
plt.plot(range(1,11),wcss)  
plt.plot(range(1,11),wcss, linewidth=2, color="red", marker ="8")  
plt.xlabel("K Value")  
plt.xticks(np.arange(1,11,1))  
plt.ylabel("WCSS")  
plt.show()
```

### #Taking 5 clusters

```
km1=KMeans(n_clusters=5)  
km1.fit(X)  
y=km1.predict(X)  
df["label"] = y
```

### #Cluster plots

```
plt.figure(figsize=(10,6))  
sns.scatterplot(x = 'Annual Income (k$)',y = 'Spending Score (1-100)',hue="label",  
                palette=['green','orange','brown','dodgerblue','red'], legend='full',data = df ,s =  
60 )  
  
plt.xlabel('Annual Income (k$)')  
plt.ylabel('Spending Score (1-100)')  
plt.title('Spending Score (1-100) vs Annual Income (k$)')  
plt.show()
```

### #Clustering

```
cust1=df[df["label"]==1]  
print('Number of customer in 1st group=', len(cust1))
```

```

print('They are -', cust1["CustomerID"].values)
print("-----")
cust2=df[df["label"]==2]
print('Number of customer in 2nd group=', len(cust2))
print('They are -', cust2["CustomerID"].values)
print("-----")
cust3=df[df["label"]==0]
print('Number of customer in 3rd group=', len(cust3))
print('They are -', cust3["CustomerID"].values)
print("-----")
cust4=df[df["label"]==3]
print('Number of customer in 4th group=', len(cust4))
print('They are -', cust4["CustomerID"].values)
print("-----")
cust5=df[df["label"]==4]
print('Number of customer in 5th group=', len(cust5))
print('They are -', cust5["CustomerID"].values)
print("-----")

```

## #Clustering the 3d data

```

df=data[["CustomerID","Gender","Age","Annual Income (k$)","Spending Score (1-100)"]]
df.head()
X2=df[["Age","Annual Income (k$)","Spending Score (1-100)"]]
wcss = []
for k in range(1,11):
    kmeans = KMeans(n_clusters=k, init="k-means++")
    kmeans.fit(X2)
    wcss.append(kmeans.inertia_)

```

## #Elbow graph

```

plt.figure(figsize=(12,6))

plt.plot(range(1,11),wcss, linewidth=2, color="red", marker="8")
plt.xlabel("K Value")
plt.xticks(np.arange(1,11,1))

```

```
plt.ylabel("WCSS")
plt.show()
```

```
km2 = KMeans(n_clusters=5)
y2 = km.fit_predict(X2)
df["label"] = y2
df.head()
```

#3D Plot as we did the clustering on the basis of 3 input features

```
fig = plt.figure(figsize=(20,10))
ax = fig.add_subplot(111, projection='3d')
ax.scatter(df.Age[df.label == 0], df["Annual Income (k$)"][df.label == 0], df["Spending Score (1-100)"][df.label == 0], c='purple', s=60)
ax.scatter(df.Age[df.label == 1], df["Annual Income (k$)"][df.label == 1], df["Spending Score (1-100)"][df.label == 1], c='red', s=60)
ax.scatter(df.Age[df.label == 2], df["Annual Income (k$)"][df.label == 2], df["Spending Score (1-100)"][df.label == 2], c='blue', s=60)
ax.scatter(df.Age[df.label == 3], df["Annual Income (k$)"][df.label == 3], df["Spending Score (1-100)"][df.label == 3], c='green', s=60)
ax.scatter(df.Age[df.label == 4], df["Annual Income (k$)"][df.label == 4], df["Spending Score (1-100)"][df.label == 4], c='yellow', s=60)
ax.view_init(35, 185)
plt.xlabel("Age")
plt.ylabel("Annual Income (k$)")
ax.set_zlabel('Spending Score (1-100)')
plt.show()
```

#groups

```
cust1=df[df["label"]==1]
print('Number of customer in 1st group=', len(cust1))
print("They are -", cust1["CustomerID"].values)
print("-----")
cust2=df[df["label"]==2]
print('Number of customer in 2nd group=', len(cust2))
print("They are -", cust2["CustomerID"].values)
```

```

print("-----")
cust3=df[df["label"]==0]
print('Number of customer in 3rd group=', len(cust3))
print('They are -', cust3["CustomerID"].values)
print("-----")
cust4=df[df["label"]==3]
print('Number of customer in 4th group=', len(cust4))
print('They are -', cust4["CustomerID"].values)
print("-----")
cust5=df[df["label"]==4]
print('Number of customer in 5th group=', len(cust5))
print('They are -', cust5["CustomerID"].values)
print("-----")

```

# ***Chapter 7***

## **SYSTEM TESTING**

Sure, here is a high-level overview of the testing strategies and types of testing you can consider for a Customer Segmentation System:

### **7.1 UNIT TESTING**

**Objective:** Verify the correctness of individual components or modules of the customer segmentation algorithm and data manipulation functions.

- **Test Case 1:** Validate the customer data cleaning module to ensure accurate handling of missing values, outliers, and data inconsistencies.
- **Test Case 2:** Test the customer segmentation algorithm with a mock dataset to confirm correct grouping of customers based on the defined segmentation criteria.
- **Test Case 3:** Evaluate the effectiveness of the personalized recommendation engine by comparing its suggestions against expected outcomes.

### **7.2 INTEGRATION TESTING**

**Objective:** Assess the interactions between integrated components of the customer segmentation system and related applications.

- **Test Case 4:** Validate the integration of the customer segmentation module with the CRM system to ensure synchronized customer data.
- **Test Case 5:** Test the integration of the segmentation results with the marketing automation platform for targeted email campaigns.
- **Test Case 6:** Confirm the integration of the segmentation data with the personalized recommendation engine for tailored product suggestions.

## 7.3 FUNCTIONAL TESTING

**Objective:** Ensure that the customer segmentation system functions according to specified requirements and business goals.

- **Test Case 7:** Validate that the system can generate accurate customer segments based on the defined segmentation strategy and criteria.
- **Test Case 8:** Confirm that the system can generate personalized recommendations and marketing campaigns tailored to each customer segment.
- **Test Case 9:** Test the system's ability to track and analyze customer behavior changes and adapt segmentation accordingly.

## 7.4 DATA TESTING

**Objective:** Evaluate the integrity and accuracy of data storage, retrieval, and manipulation within the customer segmentation system.

- **Test Case 10:** Verify that customer data is correctly stored and retrieved from the database or data warehouse.
- **Test Case 11:** Validate that segmentation results and personalized recommendations are accurately generated based on the underlying customer data.
- **Test Case 12:** Confirm that data manipulation processes, such as data cleaning and feature engineering, are performed correctly without compromising data integrity.

## 7.5 PERFORMANCE TESTING

**Objective:** Evaluate the system's responsiveness, scalability, and resource utilization under various load conditions.

- **Test Case 13:** Assess the system's response time when handling large volumes of customer data and segmentation requests.

- **Test Case 14:** Conduct stress testing to determine the system's limits and identify potential bottlenecks under high user traffic.
- **Test Case 15:** Monitor system performance metrics, such as CPU usage, memory consumption, and database query times, to ensure efficient operation.

## 7.6 COMPATIBILITY TESTING

**Objective:** Confirm the system's compatibility across different environments and platforms.

- **Test Case 16:** Test the system's functionality on different web browsers and devices to ensure cross-browser compatibility.
- **Test Case 17:** Verify that the system works on various operating systems and databases to ensure compatibility with different IT infrastructures.
- **Test Case 18:** Evaluate the system's compatibility with different data formats and APIs to ensure seamless integration with external systems.

## 7.7 DOCUMENTATION AND TRAINING TESTING

**Objective:** Validate the accuracy and usefulness of system documentation and training materials.

- **Test Case 19:** Confirm that user manuals and technical documentation are comprehensive, accurate, and easy to understand.
- **Test Case 20:** Conduct training sessions for system administrators and users to assess the effectiveness of instructional materials and hands-on training.

## 7.8 MAINTENANCE and UPDATES TESTING

**Objective:** Ensure that system updates and new features are implemented seamlessly without disrupting existing functionality.

- **Test Case 21:** Verify that system updates are backward compatible and do not affect existing user access or data.



- **Test Case 22:** Confirm that new features and enhancements are integrated smoothly and do not introduce any regressions or performance issues.
- **Test Case 23:** Conduct regression testing after system updates or new feature implementations to ensure that existing functionality remains intact.

By executing these test cases across different testing types, you can ensure a comprehensive evaluation of the customer segmentation system, addressing various aspects of functionality, performance, compatibility, and user experience. This will help you identify and resolve any potential issues before the system is deployed to production.

## ***Chapter 8***

### **RESULTS AND OUTPUT SCREENS**

#### **8.1 NUMBER OF MALE AND FEMALE GRAPH**

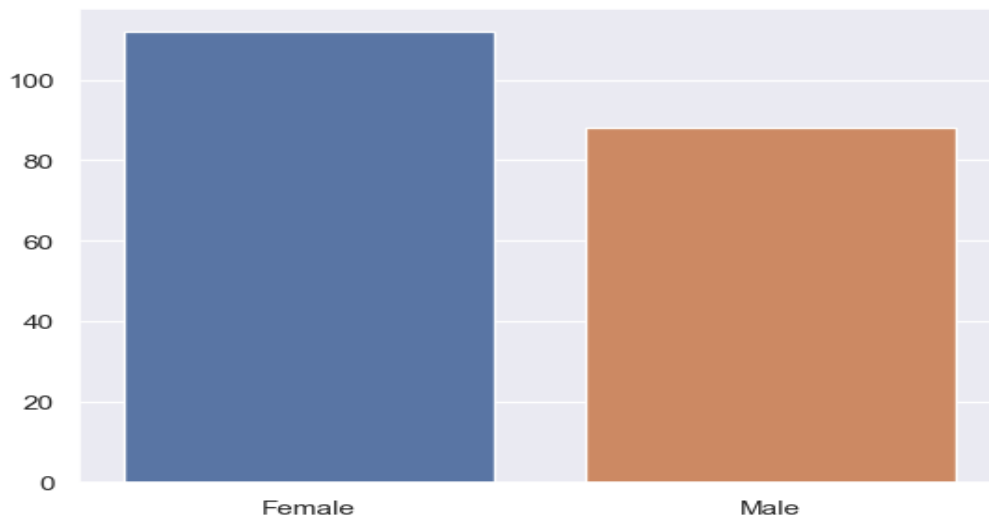


Figure. 8.1: Number of male and female graph

#### **8.2 NUMBER OF CUSTOMERS AND AGES GRAPH**

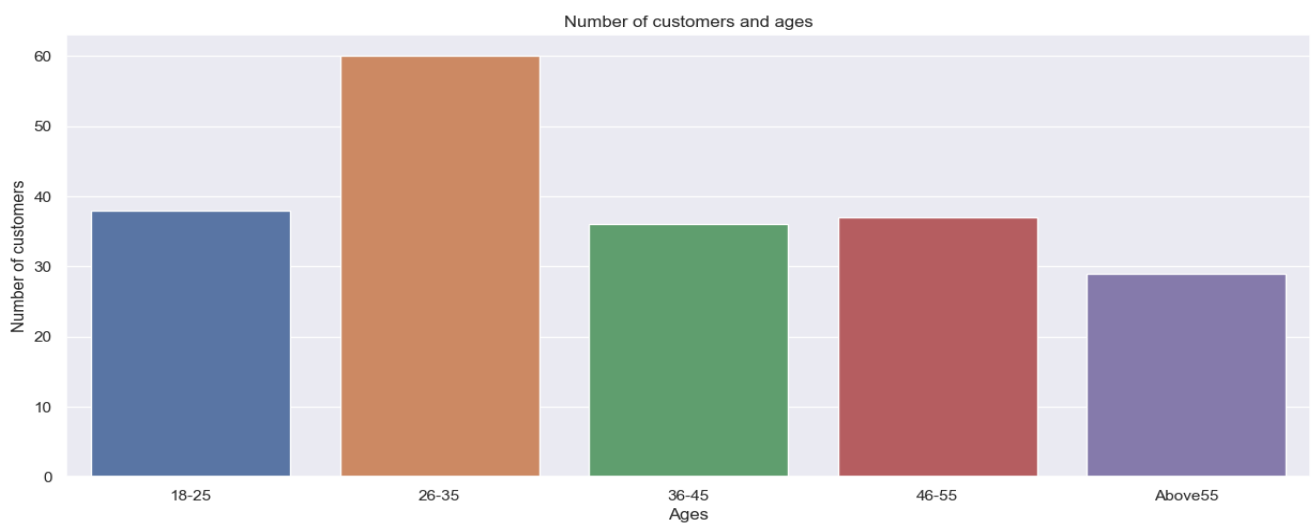


Figure. 8.2: Number of customers and ages graph

### 8.3 SPENDING SCORES GRAPH

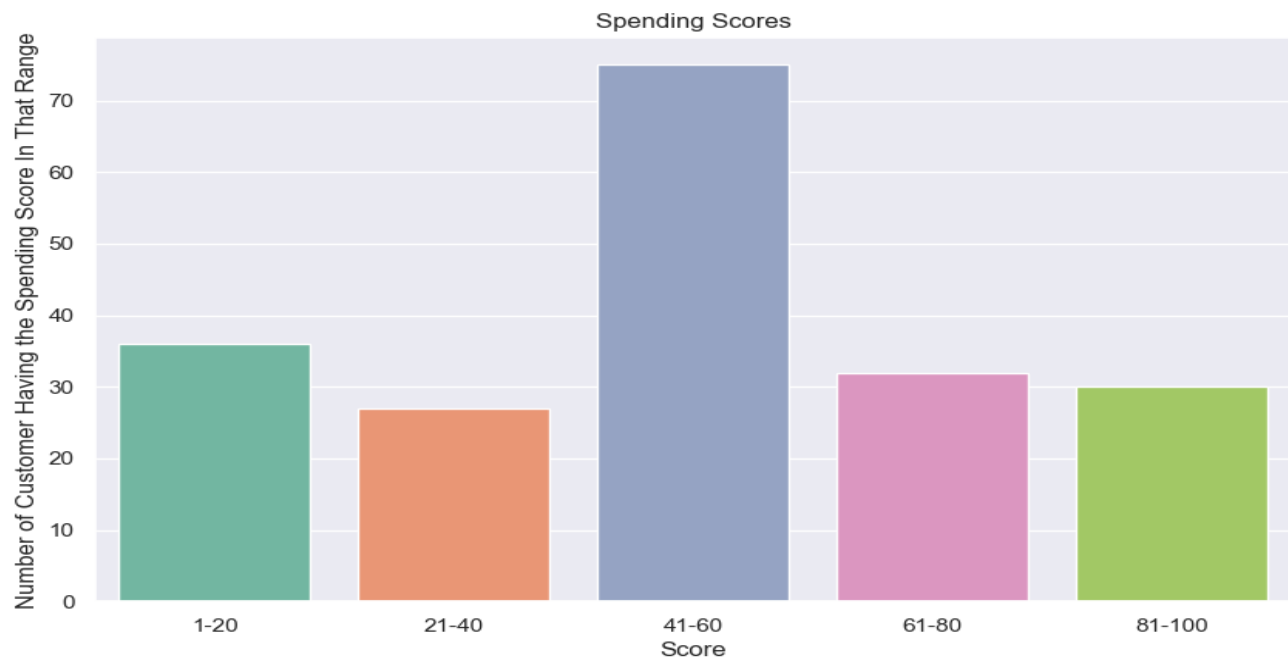


Figure. 8.3: Spending scores graph

### 8.4 ANNUAL INCOMES GRAPH

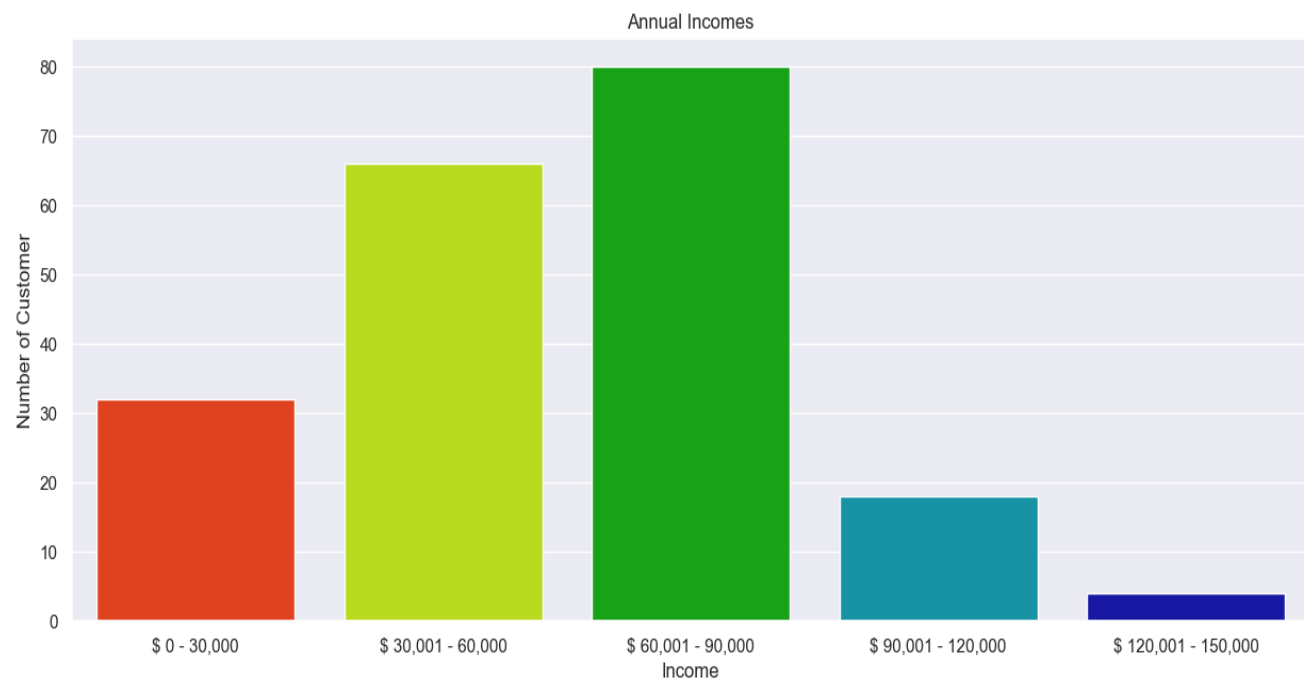


Figure. 8.4: Annual incomes graph

## 8.5 ELBOW GRAPH

In cluster analysis, the **elbow method** is a heuristic used in determining the number of clusters in a data set. The method consists of plotting the explained variation as a function of the number of clusters and picking the elbow of the curve as the number of clusters to use. The same method can be used to choose the number of parameters in other data-driven models, such as the number of principal components to describe a data set.

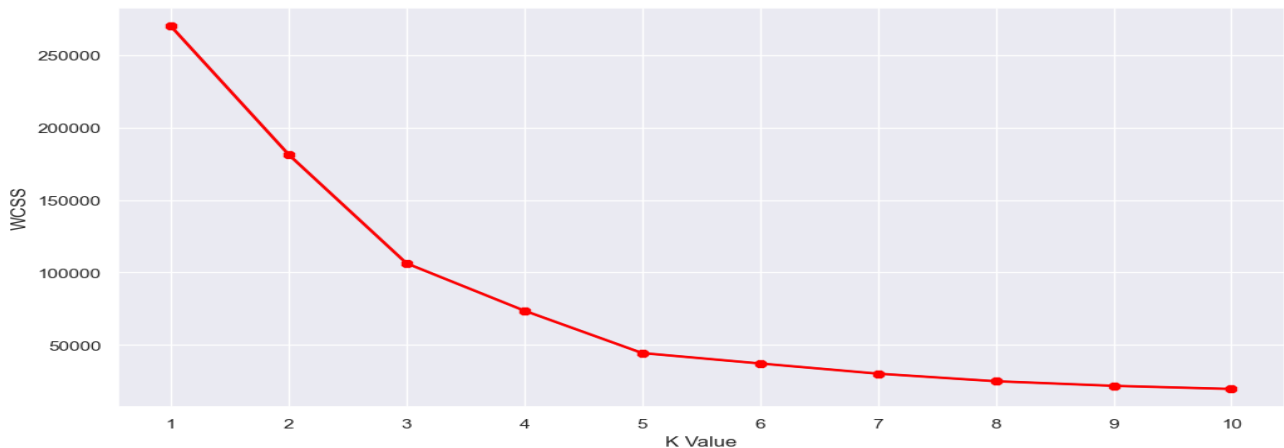


Figure. 8.5: Elbow graph

## 8.6 CLUSTERING(Spending Score vs Annual Income) 2D GRAPH

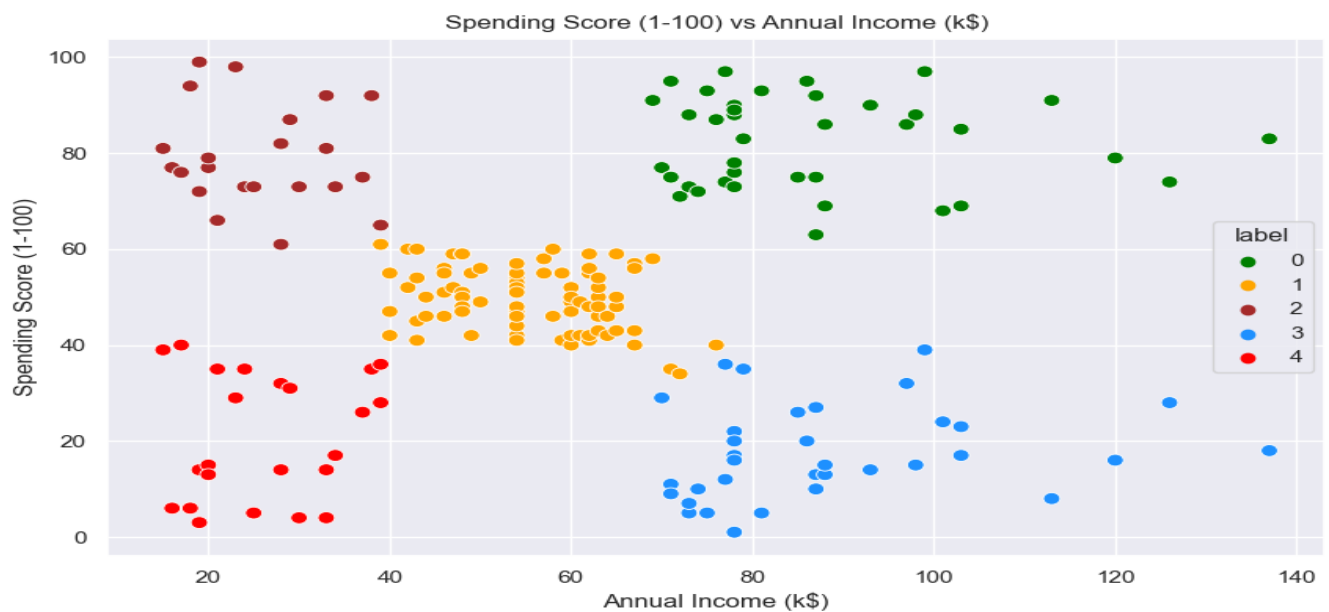


Figure. 8.6: Clustering(Spending Score vs Annual Income) 2D graph

## OUTPUT:

### 8.7 NUMBER OF CUSTOMER IN DIFFERENT GROUPS ( 2D GRAPH)

```
Number of customer in 1st group= 81
They are - [ 44 47 48 49 50 51 52 53 54 55 56 57 58 59 60 61 62 63
64 65 66 67 68 69 70 71 72 73 74 75 76 77 78 79 80 81
82 83 84 85 86 87 88 89 90 91 92 93 94 95 96 97 98 99
100 101 102 103 104 105 106 107 108 109 110 111 112 113 114 115 116 117
118 119 120 121 122 123 127 133 143]
-----
Number of customer in 2nd group= 22
They are - [ 2 4 6 8 10 12 14 16 18 20 22 24 26 28 30 32 34 36 38 40 42 46]
-----
Number of customer in 3rd group= 39
They are - [124 126 128 130 132 134 136 138 140 142 144 146 148 150 152 154 156 158
160 162 164 166 168 170 172 174 176 178 180 182 184 186 188 190 192 194
196 198 200]
-----
Number of customer in 4th group= 35
They are - [125 129 131 135 137 139 141 145 147 149 151 153 155 157 159 161 163 165
167 169 171 173 175 177 179 181 183 185 187 189 191 193 195 197 199]
-----
Number of customer in 5th group= 23
They are - [ 1 3 5 7 9 11 13 15 17 19 21 23 25 27 29 31 33 35 37 39 41 43 45]
-----
```

Figure. 8.7: Number of customers in different groups (2D graph)

### 8.8 CLUSTERING(Spending Score vs Annual Income vs Age) 3D GRAPH

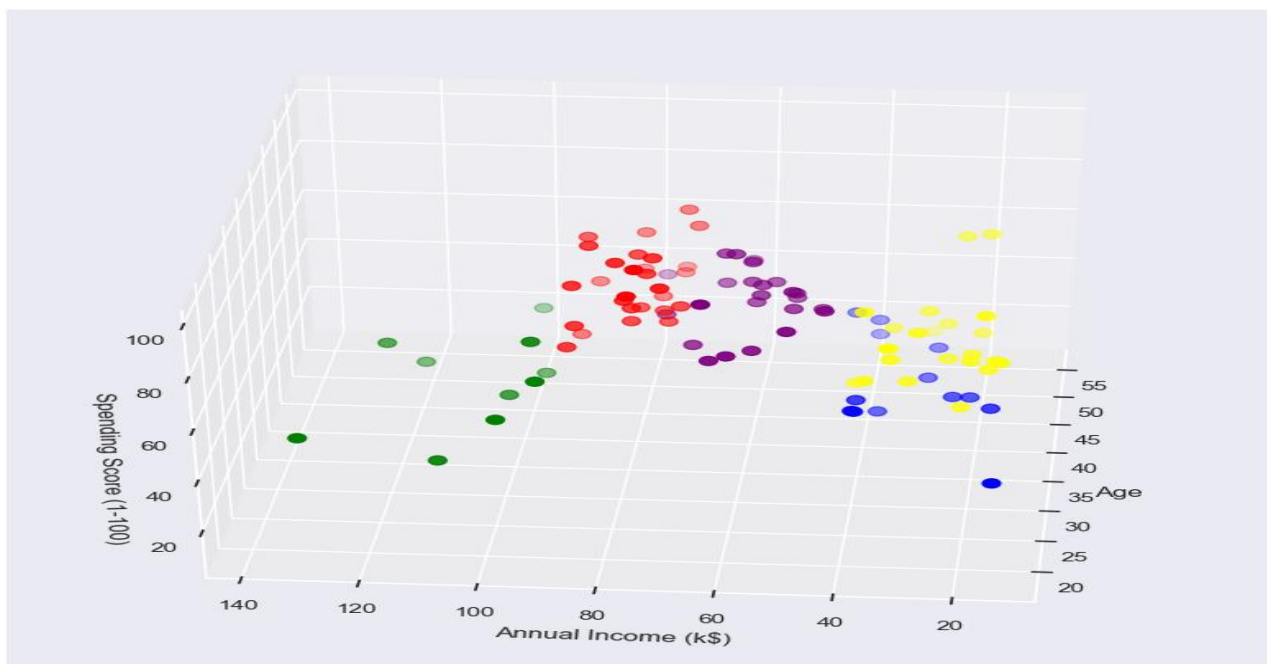


Figure. 8.8: Clustering(Spending Score vs Annual Income vs Age) 3D graph

## ***Chapter 9***

### **CONCLUSION**

Customer segmentation is an invaluable tool for businesses of all sizes, enabling them to tailor their marketing efforts, product development, and customer service strategies to specific groups of customers. By understanding the unique needs, preferences, and behaviors of different customer segments, businesses can create more effective marketing campaigns, develop products that better meet customer expectations, and provide more personalized customer service. Customer segmentation can also help businesses identify new market opportunities, optimize pricing strategies, and improve customer retention rates.

In today's competitive marketplace, businesses that can effectively segment their customer base are well-positioned for success. By implementing a customer segmentation strategy, businesses can gain a deeper understanding of their customers, develop more effective marketing campaigns, and ultimately drive business growth.

Customer segmentation is an ongoing process that requires regular review and refinement. As customer needs and preferences evolve, businesses need to adapt their segmentation strategies to ensure that they are still effective. However, the investment in customer segmentation is well worth the effort, as it can lead to significant improvements in marketing effectiveness, product development, customer satisfaction, customer retention, and business growth.

# *Chapter 10*

## **FUTURE ENHANCEMENTS**

### **Enhancements**

- **AI-Powered Customer Segmentation:** Leverage AI algorithms to analyze customer data and identify distinct customer segments based on their preferences, behaviors, and purchase history. This would enable businesses to tailor marketing campaigns, product recommendations, and customer service strategies to specific segments, enhancing customer satisfaction and boosting conversion rates.
- **Real-time Customer Insights:** Integrate analytics to provide real-time insights into customer behavior, preferences, and purchase patterns. This data-driven approach would enable businesses to make informed decisions about product development, marketing strategies, and customer engagement initiatives, ultimately driving customer loyalty and retention.
- **Mobile Customer Engagement Platform:** Develop a mobile app to extend system accessibility and provide customers with a convenient platform to manage their accounts, track orders, access personalized recommendations, and receive real-time updates. This would enhance customer engagement, improve brand perception, and foster stronger customer relationships.
- **Enhanced Customer Data Security:** Implement advanced security protocols like multi-factor authentication and data encryption to protect sensitive customer information. Additionally, consider utilizing blockchain technology to secure and track customer data changes, ensuring transparency and data integrity.
- **Personalized Customer Experiences:** Develop gamification features within the application to engage customers, such as interactive rewards programs, personalized challenges, and personalized product recommendations. This would encourage active participation, increase customer satisfaction, and foster brand loyalty.

- **Cloud-Based Customer Relationship Management (CRM):** Transition the customer data management system to a cloud-based infrastructure to ensure scalability, flexibility, and better accessibility. This would facilitate easy upgrades, maintenance, and reduced hardware dependencies, adapting to future technological advancements and customer demand.

These enhancements aim to elevate the system's capabilities in customer segmentation, data analysis, security, and personalized customer experiences. By leveraging AI, real-time analytics, and cloud-based infrastructure, businesses can gain a deeper understanding of their customers, develop more effective customer engagement strategies, and ultimately drive business growth.



# REFERENCES

Here are some references for customer segmentation:

- Kumar, V., & Ravikumar, K. (2018). Customer segmentation and customer relationship management (CRM). In *Customer Relationship Management* (pp. 1-18). Springer, Cham.

This book provides a comprehensive overview of customer segmentation and its role in CRM. It discusses the different types of segmentation bases, the steps involved in developing a segmentation strategy, and the benefits of segmentation for businesses.

- Lilienfeld, R., & Rangaswamy, A. (2010). *Marketing strategy* (7th ed.). McGraw-Hill/Irwin.

This chapter on customer segmentation discusses the importance of segmentation, the different types of segmentation bases, and the steps involved in developing a segmentation strategy. It also includes a discussion of how to use segmentation to target marketing campaigns and develop new products.

- Smith, D. E. (2013). *Customer segmentation: The guide to grouping customers into profitable, manageable segments*. Kogan Page.

This book provides a practical guide to customer segmentation. It includes a discussion of the different types of segmentation bases, the steps involved in developing a segmentation strategy, and how to use segmentation to improve marketing effectiveness.

- Scott, D. M., & Verhoef, P. C. (2010). Customer segmentation in retail: An overview of the state of the practice and some new perspectives. *European Retail Review*, 18(4), 450-458.\*\*

This article provides an overview of the state of the practice of customer segmentation in retail. It discusses the different types of segmentation bases that are used in retail, the benefits of segmentation, and some of the challenges of implementing segmentation strategies.