Task 3: Customer Segmentation

```
import pandas as pd
import numpy as np
{\tt import\ matplotlib.pyplot\ as\ plt}
from sklearn.preprocessing import StandardScaler
from sklearn.cluster import KMeans
from \ sklearn.metrics \ import \ davies\_bouldin\_score
customers = pd.read_csv('/content/Customers.csv')
products = pd.read_csv('/content/Products.csv')
transactions = pd.read_csv('/content/Transactions.csv')
# Data Preparation (# Feature Engineering)
customer_transactions = transactions.merge(customers, on='CustomerID')
customer_features = customer_transactions.groupby('CustomerID').agg({
    'TotalValue': 'sum',
    'Quantity': 'sum',
    'TransactionDate': 'count'
}).reset_index()
# Standardize features
scaler = StandardScaler()
customer_features_scaled = scaler.fit_transform(customer_features[['TotalValue', 'Quantity', 'TransactionDate']])
# Determining optimal number of clusters (using Elbow method)
inertia = []
for k in range(2, 11):
    kmeans = KMeans(n_clusters=k, random_state=42)
    kmeans.fit(customer_features_scaled)
    inertia.append(kmeans.inertia_)
plt.figure(figsize=(10, 5))
plt.plot(range(2, 11), inertia, marker='o')
plt.title('Elbow Method for Optimal k')
plt.xlabel('Number of Clusters (k)')
plt.ylabel('Inertia')
plt.show()
```



Elbow Method for Optimal k 250 200 175 100 75 50 2 3 4 5 6 7 8 9 10 Number of Clusters (k)

kmeans = KMeans(n_clusters=3, random_state=42)
kmeans.fit(customer_features_scaled)

```
₹
                   KMeans
     KMeans(n_clusters=3, random_state=42)
# Calculate DB Index
db_index = davies_bouldin_score(customer_features_scaled, kmeans.labels_)
print(f"DB Index: {db_index}")
DB Index: 0.7726853895682169
# Visualize clusters
plt.figure(figsize=(8, 6))
plt.scatter(customer_features_scaled[:, 0], customer_features_scaled[:, 1], c=kmeans.labels_, cmap='viridis')
plt.title('Customer Segments')
plt.xlabel('Total Value (Standardized)')
plt.ylabel('Purchase Frequency (Standardized)')
plt.show()
₹
                                           Customer Segments
          3
          2
      Purchase Frequency (Standardized)
          1
          0
         ^{-1}
                           -1
                                          Total Value (Standardized)
    4
# Adding cluster assignments to customer data
customer_features['Cluster'] = kmeans.labels_
# Cluster column is converted to numeric
try:
  customer_features['Cluster'] = pd.to_numeric(customer_features['Cluster'])
  # Handle potential conversion errors (e.g., non-numeric characters)
  print("Warning: Cluster labels might contain non-numeric characters. Consider encoding or cleaning them.")
# Analyze cluster characteristics
numeric_features = customer_features.select_dtypes(include=np.number)
print(numeric_features.groupby(customer_features['Cluster']).mean())
\overline{2}
               TotalValue Quantity TransactionDate Cluster
```

Cluster

1

6136.099189 22.027027

1795.821351 6.932432

3750.785341 13.738636

8.162162

2.905405

5.488636

0.0

1.0

2.0