```
•••
```

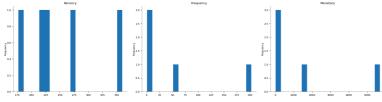
```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
from sklearn.model_selection import train_test_split
from sklearn.ensemble import RandomForestRegressor
from sklearn.metrics import mean_absolute_error, mean_squared_error
import warnings
warnings.filterwarnings('ignore')
import pandas as pd
df = pd.read_csv('Sales Transaction v.4a.csv')
df.head()
→
        TransactionNo
                            Date ProductNo
                                                               ProductName Price Quantity CustomerNo
                                                                                                                          丽
                                                                                                               Country
     0
               581482 12/9/2019
                                      22485
                                                 Set Of 2 Wooden Market Crates
                                                                             21.47
                                                                                        12.0
                                                                                                 17490.0 United Kingdom
               581475 12/9/2019
                                      22596 Christmas Star Wish List Chalkboard
                                                                             10.65
                                                                                        36.0
                                                                                                 13069.0 United Kingdom
      1
     2
               581475 12/9/2019
                                      23235
                                                      Storage Tin Vintage Leaf
                                                                                        12.0
                                                                                                 13069.0 United Kingdom
                                                                             11.53
      3
               581475 12/9/2019
                                      23272
                                                Tree T-Light Holder Willie Winkie
                                                                             10.65
                                                                                        12.0
                                                                                                 13069.0 United Kingdom
                581475 12/9/2019
                                      23239
                                              Set Of 4 Knick Knack Tins Ponnies
                                                                             11 94
                                                                                         6 N
                                                                                                 13069 0 United Kingdom
import pandas as pd
data = pd.read csv('Sales Transaction v.4a.csv')
print(data.head())
\overline{z}
      TransactionNo
                           Date ProductNo
                                                                     ProductName \
     0
              581482 12/9/2019
                                                  Set Of 2 Wooden Market Crates
                                     22485
              581475 12/9/2019
                                     22596 Christmas Star Wish List Chalkboard
    1
              581475 12/9/2019
                                                       Storage Tin Vintage Leaf
     2
                                     23235
    3
              581475 12/9/2019
                                    23272
                                              Tree T-Light Holder Willie Winkie
              581475 12/9/2019
                                    23239
                                              Set Of 4 Knick Knack Tins Poppies
        Price Quantity CustomerNo
                                             Country
     0
        21.47
                     12
                            17490.0 United Kingdom
    1 10.65
                     36
                            13069.0 United Kingdom
    2 11.53
                     12
                            13069.0 United Kingdom
     3
       10.65
                     12
                            13069.0 United Kingdom
     4 11.94
                            13069.0 United Kingdom
data.rename(columns={
    'TransactionNo': 'InvoiceNo',
    'Date': 'InvoiceDate',
    'ProductNo': 'ProductID',
    'Price': 'UnitPrice',
    'Quantity': 'Quantity',
    'CustomerNo': 'CustomerID',
    'Country': 'Country'
}, inplace=True)
data['Quantity'] = pd.to_numeric(data['Quantity'], errors='coerce')
data['UnitPrice'] = pd.to_numeric(data['UnitPrice'], errors='coerce')
data = data.dropna(subset=['CustomerID'])
data['InvoiceDate'] = pd.to_datetime(data['InvoiceDate'], errors='coerce')
data['TotalPrice'] = data['Quantity'] * data['UnitPrice']
print(data.isnull().sum())
print(data.head())
    InvoiceNo
     InvoiceDate
                    0
     ProductID
                    0
     ProductName
                    0
     UnitPrice
```

```
Quantity
                    0
     CustomerID
                    0
     Country
                    0
     TotalPrice
     dtype: int64
       InvoiceNo InvoiceDate ProductID
                                                                   ProductName
                                                Set Of 2 Wooden Market Crates
          581482
                  2019-12-09
                                  22485
     1
          581475
                  2019-12-09
                                  22596
                                         Christmas Star Wish List Chalkboard
          581475
                  2019-12-09
                                  23235
                                                     Storage Tin Vintage Leaf
                                            Tree T-Light Holder Willie Winkie
          581475
                  2019-12-09
                                  23272
     3
                                            Set Of 4 Knick Knack Tins Poppies
     4
          581475
                  2019-12-09
                                  23239
        UnitPrice
                   Quantity
                             CustomerID
                                                  Country TotalPrice
     0
                                 17490.0
                                          United Kingdom
                                                                257.64
            21.47
                         12
     1
            10.65
                          36
                                 13069.0
                                          United Kingdom
                                                                383.40
     2
            11.53
                          12
                                 13069.0
                                          United Kingdom
                                                                138.36
                                          United Kingdom
            10.65
                                 13069.0
                                                                127.80
     3
                          12
                                                                 71.64
            11.94
                           6
                                 13069.0 United Kingdom
TODAY = data['InvoiceDate'].max() + pd.Timedelta(days=1)
rfm = data.groupby('CustomerID').agg({
    'InvoiceDate': lambda x: (TODAY - x.max()).days,
                                                        # Recency
    'InvoiceNo': 'count',
                                                         # Frequency
    'TotalPrice': 'sum'
                                                         # Monetary (Total Purchase)
rfm.rename(columns={
    'InvoiceDate': 'Recency',
    'InvoiceNo': 'Frequency',
    'TotalPrice': 'Monetary'
}, inplace=True)
rfm.head()
₹
                                                                                                           1 to 5 of 5 entries Filter
     CustomerID
                          Recency
                                                                                                       Monetary
                                                         Frequency
         12004.0
                                         228
                                                                           56
                                                                                                                                   1509.6
         12006.0
                                        219
                                                                            1
                                                                                                                                   24.76
         12008.0
                                        277
                                                                          203
                                                                                                                                  5689.57
         12013.0
                                        360
                                                                                                                        69.96000000000001
                                                                            1
                                                                                                                        149.51999999999998
         12024.0
                                                                            5
                                         177
     Show 25 ✓ per page
```

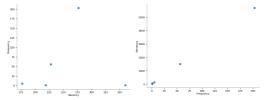
Like what you see? Visit the data table notebook to learn more about interactive tables.

Distributions

})



2-d distributions



Values

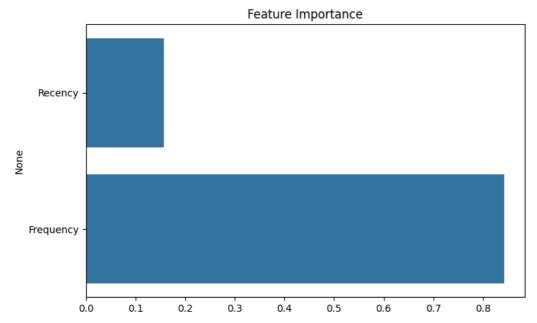


Generate code with rfm Next steps: (View recommended plots New interactive sheet

```
X = rfm[['Recency', 'Frequency']]
y = rfm['Monetary']
```

```
X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_state=42)
model = RandomForestRegressor(n_estimators=100, random_state=42)
model.fit(X_train, y_train)
y_pred = model.predict(X_test)
print("MAE (Mean Absolute Error):", mean_absolute_error(y_test, y_pred))
print("RMSE (Root Mean Squared Error):", np.sqrt(mean_squared_error(y_test, y_pred)))
MAE (Mean Absolute Error): 12496.292228572464
     RMSE (Root Mean Squared Error): 54880.6044020451
importances = model.feature_importances_
features = X.columns
plt.figure(figsize=(8,5))
sns.barplot(x=importances, y=features)
plt.title('Feature Importance')
plt.show()
₹
                                                 Feature Importance
          Recency
      None
         Frequency
                  0.0
                           0.1
                                    0.2
                                             0.3
                                                       0.4
                                                                0.5
                                                                         0.6
                                                                                  0.7
                                                                                           0.8
predicted_ltv = pd.DataFrame({
    'CustomerID': X_test.index,
    'ActualLTV': y_test,
    'PredictedLTV': y_pred
})
predicted_ltv.to_csv('Predicted_Customer_LTV.csv', index=False)
print("Predicted LTV saved to CSV <a>\sigma")
→ Predicted LTV saved to CSV 
plt.figure(figsize=(8,5))
sns.barplot(x=importances, y=features)
plt.title('Feature Importance')
plt.show()
```





predicted_ltv.to_csv('Predicted_Customer_LTV.csv', index=False)

from google.colab import files
files.download('Predicted_Customer_LTV.csv')

