

This data is from Kaggle, used to predict churn. The origin is <https://www.kaggle.com/datasets/sakshigoyal7/credit-card-customers/data>

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
```

```
# Load bank_churners data
```

```
churners_data = pd.read_csv('BankChurners.csv')
```

```
# Display the first few rows of the dataframe to understand its structure
```

```
print("First few rows of the churners data:")
```

```
print(churners_data.head())
```

First few rows of the churners data:

	CLIENTNUM	Attrition_Flag	Customer_Age	Gender	Dependent_count
0	768805383	Existing Customer	45	M	3
1	818770008	Existing Customer	49	F	5
2	713982108	Existing Customer	51	M	3
3	769911858	Existing Customer	40	F	4
4	709106358	Existing Customer	40	M	3

	Education_Level	Marital_Status	Income_Category	Card_Category
0	High School	Married	\$60K - \$80K	Blue
1	Graduate	Single	Less than \$40K	Blue
2	Graduate	Married	\$80K - \$120K	Blue
3	High School	Unknown	Less than \$40K	Blue
4	Uneducated	Married	\$60K - \$80K	Blue

	Months_on_book	...	Credit_Limit	Total_Revolving_Bal
Avg_Open_To_Buy				
0	39	...	12691.0	777
11914.0				
1	44	...	8256.0	864
7392.0				
2	36	...	3418.0	0
3418.0				
3	34	...	3313.0	2517
796.0				
4	21	...	4716.0	0
4716.0				

	Total_Amt_Chng_Q4_Q1	Total_Trans_Amt	Total_Trans_Ct
0	1.335	1144	42
1	1.541	1291	33
2	2.594	1887	20
3	1.405	1171	20
4	2.175	816	28

	Avg_Utilization_Ratio
0	0.061
1	0.105
2	0.000
3	0.760
4	0.000

	Naive_Bayes_Classifier_Attrition_Flag_Card_Category_Contacts_Count_12_mon_Dependent_count_Education_Level_Months_Inactive_12_mon_1
0	0.000093
1	0.000057
2	0.000021
3	0.000134
4	0.000022

	Naive_Bayes_Classifier_Attrition_Flag_Card_Category_Contacts_Count_12_mon_Dependent_count_Education_Level_Months_Inactive_12_mon_2
0	0.99991
1	0.99994
2	0.99998
3	0.99987
4	0.99998

[5 rows x 23 columns]

#Statistics Summary

```
# Summary statistics of numerical columns
print("Summary statistics of numerical columns:")
print(churners_data.describe())
```

Summary statistics of numerical columns:

	CLIENTNUM	Customer_Age	Dependent_count	Months_on_book	\
count	1.012700e+04	10127.000000	10127.000000	10127.000000	
mean	7.391776e+08	46.325960	2.346203	35.928409	
std	3.690378e+07	8.016814	1.298908	7.986416	
min	7.080821e+08	26.000000	0.000000	13.000000	
25%	7.130368e+08	41.000000	1.000000	31.000000	
50%	7.179264e+08	46.000000	2.000000	36.000000	
75%	7.731435e+08	52.000000	3.000000	40.000000	
max	8.283431e+08	73.000000	5.000000	56.000000	

	Total_Relationship_Count	Months_Inactive_12_mon	\
count	10127.000000	10127.000000	
mean	3.812580	2.341167	
std	1.554408	1.010622	
min	1.000000	0.000000	
25%	3.000000	2.000000	
50%	4.000000	2.000000	
75%	5.000000	3.000000	
max	6.000000	6.000000	

	Contacts_Count_12_mon	Credit_Limit	Total_Revolving_Bal	\
count	10127.000000	10127.000000	10127.000000	
mean	2.455317	8631.953698	1162.814061	
std	1.106225	9088.776650	814.987335	
min	0.000000	1438.300000	0.000000	
25%	2.000000	2555.000000	359.000000	
50%	2.000000	4549.000000	1276.000000	
75%	3.000000	11067.500000	1784.000000	
max	6.000000	34516.000000	2517.000000	

	Avg_Open_To_Buy	Total_Amt_Chng_Q4_Q1	Total_Trans_Amt	Total_Trans_Ct	\
count	10127.000000	10127.000000	10127.000000	10127.000000	
mean	7469.139637	0.759941	4404.086304	64.858695	
std	9090.685324	0.219207	3397.129254	23.472570	
min	3.000000	0.000000	510.000000	10.000000	
25%	1324.500000	0.631000	2155.500000	45.000000	
50%	3474.000000	0.736000	3899.000000	67.000000	
75%	9859.000000	0.859000	4741.000000		

81.000000  
max 34516.000000 3.397000 18484.000000  
139.000000

	Total_Ct_Chng_Q4_Q1	Avg_Utilization_Ratio \
count	10127.000000	10127.000000
mean	0.712222	0.274894
std	0.238086	0.275691
min	0.000000	0.000000
25%	0.582000	0.023000
50%	0.702000	0.176000
75%	0.818000	0.503000
max	3.714000	0.999000

Naive\_Bayes\_Classifier\_Attrition\_Flag\_Card\_Category\_Contacts\_Count\_12\_mon\_Dependent\_count\_Education\_Level\_Months\_Inactive\_12\_mon\_1 \

count	10127.000000
-------	--------------

mean	0.159997
std	0.365301
min	0.000008
25%	0.000099
50%	0.000181
75%	0.000337
max	0.999580

Naive\_Bayes\_Classifier\_Attrition\_Flag\_Card\_Category\_Contacts\_Count\_12\_mon\_Dependent\_count\_Education\_Level\_Months\_Inactive\_12\_mon\_2

count	10127.000000
-------	--------------

mean	0.840003
std	0.365301
min	0.000420
25%	0.999660
50%	0.999820
75%	0.999900

max

0.999990

Summary based on the provided numerical columns:

#### Client Statistics:

- Mean client number: 7.391776e+08
- Mean customer age: 46.33 years
- Mean dependent count: 2.35
- Mean months on book: 35.93
- Mean total relationship count: 3.81
- Mean months inactive in the last 12 months: 2.34
- Mean contacts count in the last 12 months: 2.46

#### Credit Statistics:

- Mean credit limit: 8631.95
- Mean total revolving balance: 1162.81
- Mean average open to buy: 7469.14
- Mean total amount change Q4-Q1: 0.76
- Mean total transaction amount: 4404.09
- Mean total transaction count: 64.86
- Mean total count change Q4-Q1: 0.71
- Mean average utilization ratio: 0.27

#### Naive Bayes Classifier Statistics:

- Mean Naive Bayes Classifier (Attrition Flag - Card Category - Contacts Count 12 mon - Dependent count - Education Level - Months Inactive 12 mon - 1): 0.159997
- Mean Naive Bayes Classifier (Attrition Flag - Card Category - Contacts Count 12 mon - Dependent count - Education Level - Months Inactive 12 mon - 2): 0.840003

These statistics provide an overview of the numerical features in the dataset, including client demographics, credit-related information, and classifier statistics.

```
# Check for missing values
print("Missing values:")
print(churners_data.isnull().sum())
```

Missing values:

CLIENTNUM

0

Attrition\_Flag

0

Customer\_Age

0

Gender

0

```

Dependent_count
0
Education_Level
0
Marital_Status
0
Income_Category
0
Card_Category
0
Months_on_book
0
Total_Relationship_Count
0
Months_Inactive_12_mon
0
Contacts_Count_12_mon
0
Credit_Limit
0
Total_Revolving_Bal
0
Avg_Open_To_Buy
0
Total_Amt_Chng_Q4_Q1
0
Total_Trans_Amt
0
Total_Trans_Ct
0
Total_Ct_Chng_Q4_Q1
0
Avg_Utilization_Ratio
0
Naive_Bayes_Classifier_Attrition_Flag_Card_Category_Contacts_Count_12_mon_Dependent_count_Education_Level_Months_Inactive_12_mon_1    0
Naive_Bayes_Classifier_Attrition_Flag_Card_Category_Contacts_Count_12_mon_Dependent_count_Education_Level_Months_Inactive_12_mon_2    0
dtype: int64

```

#Correlations Matrix

```

# Correlation matrix
correlation_matrix = churners_data.corr()
print("Correlation matrix:")
print(correlation_matrix)

```

Correlation matrix:

CLIENTNUM

Customer_Age \		
CLIENTNUM	1.000000	
0.007613		
Customer_Age	0.007613	
1.000000		
Dependent_count	0.006772	-
0.122254		
Months_on_book	0.134588	
0.788912		
Total_Relationship_Count	0.006907	-
0.010931		
Months_Inactive_12_mon	0.005729	
0.054361		
Contacts_Count_12_mon	0.005694	-
0.018452		
Credit_Limit	0.005708	
0.002476		
Total_Revolving_Bal	0.000825	
0.014780		
Avg_Open_To_Buy	0.005633	
0.001151		
Total_Amt_Chng_Q4_Q1	0.017369	-
0.062042		
Total_Trans_Amt	-0.019692	-
0.046446		
Total_Trans_Ct	-0.002961	-
0.067097		
Total_Ct_Chng_Q4_Q1	0.007696	-
0.012143		
Avg_Utilization_Ratio	0.000266	
0.007114		
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	-0.046411	
0.018189		
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	0.046410	-
0.018189		

	Dependent_count \
CLIENTNUM	0.006772
Customer_Age	-0.122254
Dependent_count	1.000000
Months_on_book	-0.103062
Total_Relationship_Count	-0.039076
Months_Inactive_12_mon	-0.010768
Contacts_Count_12_mon	-0.040505
Credit_Limit	0.068065
Total_Revolving_Bal	-0.002688
Avg_Open_To_Buy	0.068291
Total_Amt_Chng_Q4_Q1	-0.035439
Total_Trans_Amt	0.025046

Total_Trans_Ct	0.049912
Total_Ct_Chng_Q4_Q1	0.011087
Avg_Utilization_Ratio	-0.037135
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	0.019189
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	-0.019189

	Months_on_book \
CLIENTNUM	0.134588
Customer_Age	0.788912
Dependent_count	-0.103062
Months_on_book	1.000000
Total_Relationship_Count	-0.009203
Months_Inactive_12_mon	0.074164
Contacts_Count_12_mon	-0.010774
Credit_Limit	0.007507
Total_Revolving_Bal	0.008623
Avg_Open_To_Buy	0.006732
Total_Amt_Chng_Q4_Q1	-0.048959
Total_Trans_Amt	-0.038591
Total_Trans_Ct	-0.049819
Total_Ct_Chng_Q4_Q1	-0.014072
Avg_Utilization_Ratio	-0.007541
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	0.013693
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	-0.013694

Total\_Relationship\_Count \

CLIENTNUM	0.006907
Customer_Age	-
Dependent_count	-
Months_on_book	-
Total_Relationship_Count	0.009203
Months_Inactive_12_mon	-
Contacts_Count_12_mon	0.003675
Credit_Limit	-
Total_Revolving_Bal	0.071386
Avg_Open_To_Buy	-
Total_Amt_Chng_Q4_Q1	0.050119
Total_Trans_Amt	-



0.347229	
Total_Trans_Ct	-
0.241891	
Total_Ct_Chng_Q4_Q1	
0.040831	
Avg_Utilization_Ratio	
0.067663	
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	-
0.149981	
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	
0.149981	

Months_Inactive_12_mon \	
CLIENTNUM	
0.005729	
Customer_Age	
0.054361	
Dependent_count	-
0.010768	
Months_on_book	
0.074164	
Total_Relationship_Count	-
0.003675	
Months_Inactive_12_mon	
1.000000	
Contacts_Count_12_mon	
0.029493	
Credit_Limit	-
0.020394	
Total_Revolving_Bal	-
0.042210	
Avg_Open_To_Buy	-
0.016605	
Total_Amt_Chng_Q4_Q1	-
0.032247	
Total_Trans_Amt	-
0.036982	
Total_Trans_Ct	-
0.042787	
Total_Ct_Chng_Q4_Q1	-
0.038989	
Avg_Utilization_Ratio	-
0.007503	
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	
0.153452	
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	-
0.153452	

Contacts_Count_12_mon \	
CLIENTNUM	
0.005694	
Customer_Age	-
0.018452	
Dependent_count	-
0.040505	
Months_on_book	-
0.010774	
Total_Relationship_Count	
0.055203	
Months_Inactive_12_mon	
0.029493	
Contacts_Count_12_mon	
1.000000	
Credit_Limit	
0.020817	
Total_Revolving_Bal	-
0.053913	
Avg_Open_To_Buy	
0.025646	
Total_Amt_Chng_Q4_Q1	-
0.024445	
Total_Trans_Amt	-
0.112774	
Total_Trans_Ct	-
0.152213	
Total_Ct_Chng_Q4_Q1	-
0.094997	
Avg_Utilization_Ratio	-
0.055471	
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	
0.205772	
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	-
0.205772	

	Credit_Limit \
CLIENTNUM	0.005708
Customer_Age	0.002476
Dependent_count	0.068065
Months_on_book	0.007507
Total_Relationship_Count	-0.071386
Months_Inactive_12_mon	-0.020394
Contacts_Count_12_mon	0.020817
Credit_Limit	1.000000
Total_Revolving_Bal	0.042493
Avg_Open_To_Buy	0.995981
Total_Amt_Chng_Q4_Q1	0.012813
Total_Trans_Amt	0.171730

Total_Trans_Ct	0.075927
Total_Ct_Chng_Q4_Q1	-0.002020
Avg_Utilization_Ratio	-0.482965
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	-0.023853
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	0.023853

Total\_Revolving\_Bal \

CLIENTNUM

0.000825

Customer\_Age

0.014780

Dependent\_count

-

0.002688

Months\_on\_book

0.008623

Total\_Relationship\_Count

0.013726

Months\_Inactive\_12\_mon

-

0.042210

Contacts\_Count\_12\_mon

-

0.053913

Credit\_Limit

0.042493

Total\_Revolving\_Bal

1.000000

Avg\_Open\_To\_Buy

-

0.047167

Total\_Amt\_Chng\_Q4\_Q1

0.058174

Total\_Trans\_Amt

0.064370

Total\_Trans\_Ct

0.056060

Total\_Ct\_Chng\_Q4\_Q1

0.089861

Avg\_Utilization\_Ratio

0.624022

Naive\_Bayes\_Classifier\_Attrition\_Flag\_Card\_Cate...

-

0.263033

Naive\_Bayes\_Classifier\_Attrition\_Flag\_Card\_Cate...

0.263032

Avg\_Open\_To\_Buy \

CLIENTNUM

0.005633

Customer\_Age

0.001151

Dependent\_count

0.068291

Months\_on\_book

0.006732

Total\_Relationship\_Count

-0.072601

Months\_Inactive\_12\_mon

-0.016605

Contacts_Count_12_mon	0.025646
Credit_Limit	0.995981
Total_Revolving_Bal	-0.047167
Avg_Open_To_Buy	1.000000
Total_Amt_Chng_Q4_Q1	0.007595
Total_Trans_Amt	0.165923
Total_Trans_Ct	0.070885
Total_Ct_Chng_Q4_Q1	-0.010076
Avg_Utilization_Ratio	-0.538808
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	-0.000267
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	0.000267

Total\_Amt\_Chng\_Q4\_Q1 \

CLIENTNUM

0.017369

Customer\_Age -

0.062042

Dependent\_count -

0.035439

Months\_on\_book -

0.048959

Total\_Relationship\_Count

0.050119

Months\_Inactive\_12\_mon -

0.032247

Contacts\_Count\_12\_mon -

0.024445

Credit\_Limit

0.012813

Total\_Revolving\_Bal

0.058174

Avg\_Open\_To\_Buy

0.007595

Total\_Amt\_Chng\_Q4\_Q1

1.000000

Total\_Trans\_Amt

0.039678

Total\_Trans\_Ct

0.005469

Total\_Ct\_Chng\_Q4\_Q1

0.384189

Avg\_Utilization\_Ratio

0.035235

Naive\_Bayes\_Classifier\_Attrition\_Flag\_Card\_Cate... -

0.131207

Naive\_Bayes\_Classifier\_Attrition\_Flag\_Card\_Cate...

0.131207

Total\_Trans\_Amt \

CLIENTNUM	-0.019692
Customer_Age	-0.046446
Dependent_count	0.025046
Months_on_book	-0.038591
Total_Relationship_Count	-0.347229
Months_Inactive_12_mon	-0.036982
Contacts_Count_12_mon	-0.112774
Credit_Limit	0.171730
Total_Revolving_Bal	0.064370
Avg_Open_To_Buy	0.165923
Total_Amt_Chng_Q4_Q1	0.039678
Total_Trans_Amt	1.000000
Total_Trans_Ct	0.807192
Total_Ct_Chng_Q4_Q1	0.085581
Avg_Utilization_Ratio	-0.083034
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	-0.168642
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	0.168642

	Total_Trans_Ct \
CLIENTNUM	-0.002961
Customer_Age	-0.067097
Dependent_count	0.049912
Months_on_book	-0.049819
Total_Relationship_Count	-0.241891
Months_Inactive_12_mon	-0.042787
Contacts_Count_12_mon	-0.152213
Credit_Limit	0.075927
Total_Revolving_Bal	0.056060
Avg_Open_To_Buy	0.070885
Total_Amt_Chng_Q4_Q1	0.005469
Total_Trans_Amt	0.807192
Total_Trans_Ct	1.000000
Total_Ct_Chng_Q4_Q1	0.112324
Avg_Utilization_Ratio	0.002838
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	-0.371403
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	0.371403

Total_Ct_Chng_Q4_Q1 \	
CLIENTNUM	0.007696
Customer_Age	-
Dependent_count	0.012143
Months_on_book	-
Total_Relationship_Count	0.011087
Months_Inactive_12_mon	0.014072
Contacts_Count_12_mon	0.040831
Credit_Limit	-
Total_Revolving_Bal	0.012143
Avg_Open_To_Buy	0.011087
Total_Amt_Chng_Q4_Q1	0.014072
Total_Trans_Amt	0.040831
Total_Trans_Ct	-
Total_Ct_Chng_Q4_Q1	0.012143
Avg_Utilization_Ratio	0.011087
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	0.014072
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	0.040831

0.038989	
Contacts_Count_12_mon	-
0.094997	
Credit_Limit	-
0.002020	
Total_Revolving_Bal	
0.089861	
Avg_Open_To_Buy	-
0.010076	
Total_Amt_Chng_Q4_Q1	
0.384189	
Total_Trans_Amt	
0.085581	
Total_Trans_Ct	
0.112324	
Total_Ct_Chng_Q4_Q1	
1.000000	
Avg_Utilization_Ratio	
0.074143	
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	-
0.290115	
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...	
0.290115	
Avg_Utilization_Ratio \	
CLIENTNUM	
0.000266	
Customer_Age	
0.007114	
Dependent_count	-
0.037135	
Months_on_book	-
0.007541	
Total_Relationship_Count	
0.067663	
Months_Inactive_12_mon	-
0.007503	
Contacts_Count_12_mon	-
0.055471	
Credit_Limit	-
0.482965	
Total_Revolving_Bal	
0.624022	
Avg_Open_To_Buy	-
0.538808	
Total_Amt_Chng_Q4_Q1	
0.035235	
Total_Trans_Amt	-

0.083034  
Total\_Trans\_Ct  
0.002838  
Total\_Ct\_Chng\_Q4\_Q1  
0.074143  
Avg\_Utilization\_Ratio  
1.000000  
Naive\_Bayes\_Classifier\_Attrition\_Flag\_Card\_Cate... -  
0.178405  
Naive\_Bayes\_Classifier\_Attrition\_Flag\_Card\_Cate...  
0.178405

Naive\_Bayes\_Classifier\_Attrition\_Flag\_Card\_Category\_Contacts\_Count\_12\_mon  
Dependent\_count\_Education\_Level\_Months\_Inactive\_12\_mon\_1 \ CLIENTNUM  
-0.046411

Customer\_Age  
0.018189

Dependent\_count  
0.019189

Months\_on\_book  
0.013693

Total\_Relationship\_Count  
-0.149981

Months\_Inactive\_12\_mon  
0.153452

Contacts\_Count\_12\_mon  
0.205772

Credit\_Limit  
-0.023853

Total\_Revolving\_Bal  
-0.263033

Avg\_Open\_To\_Buy  
-0.000267

Total\_Amt\_Chng\_Q4\_Q1  
-0.131207

Total\_Trans\_Amt  
-0.168642

Total\_Trans\_Ct  
-0.371403

Total\_Ct\_Chng\_Q4\_Q1  
-0.290115

Avg\_Utilization\_Ratio  
-0.178405

Naive\_Bayes\_Classifier\_Attrition\_Flag\_Card\_Cate...  
1.000000

Naive\_Bayes\_Classifier\_Attrition\_Flag\_Card\_Cate...  
-1.000000

Naive\_Bayes\_Classifier\_Attrition\_Flag\_Card\_Category\_Contacts\_Count\_12\_mon  
Dependent\_count\_Education\_Level\_Months\_Inactive\_12\_mon\_2  
CLIENTNUM  
0.046410

Customer\_Age  
-0.018189

Dependent\_count  
-0.019189

Months\_on\_book  
-0.013694

Total\_Relationship\_Count  
0.149981

Months\_Inactive\_12\_mon  
-0.153452

Contacts\_Count\_12\_mon  
-0.205772

Credit\_Limit  
0.023853

Total\_Revolving\_Bal  
0.263032

Avg\_Open\_To\_Buy  
0.000267

Total\_Amt\_Chng\_Q4\_Q1  
0.131207



```
Total_Trans_Amt  
0.168642
```

```
Total_Trans_Ct  
0.371403
```

```
Total_Ct_Chng_Q4_Q1  
0.290115
```

```
Avg_Utilization_Ratio  
0.178405
```

```
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...  
-1.000000
```

```
Naive_Bayes_Classifier_Attrition_Flag_Card_Cate...  
1.000000
```

```
<ipython-input-10-ca4bdf0fda51>:2: FutureWarning: The default value of  
numeric_only in DataFrame.corr is deprecated. In a future version, it  
will default to False. Select only valid columns or specify the value  
of numeric_only to silence this warning.  
correlation_matrix = churners_data.corr()
```

The provided correlation matrix represents the pairwise correlations between numerical features in the dataset. Here's a summary:

#### Positive Correlations:

- Customer Age is positively correlated with Months on Book (0.788912).
- Total Transaction Amount is positively correlated with Total
- Transaction Count (0.807192).
- Total Revolving Balance is positively correlated with Avg Utilization Ratio (0.624022).

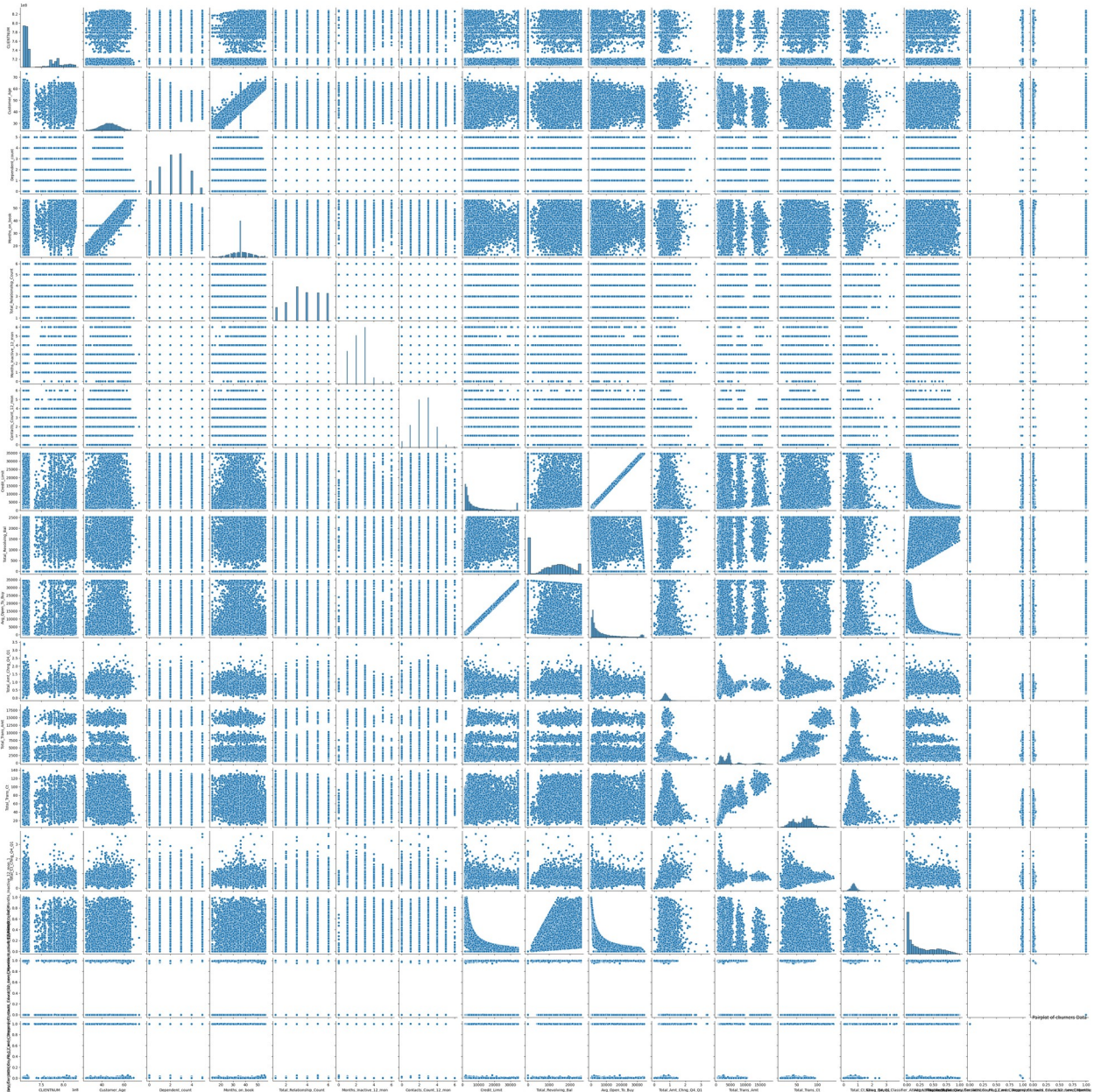
#### Negative Correlations:

- Avg Utilization Ratio is negatively correlated with Credit Limit (-0.482965).
- Total Relationship Count is negatively correlated with Total
- Transaction Amount (-0.347229).
- Total Transaction Count is negatively correlated with Naive Bayes Classifier (Attrition Flag - Card Category - Contacts Count 12 mon - Dependent count - Education Level - Months Inactive 12 mon - 1) (-0.371403).

#### Weak Correlations:

There are weak correlations (close to 0) between many pairs of features, indicating little linear relationship between them. This correlation matrix provides valuable insights into how features are related to each other within the dataset. However, it's important to note that correlation

```
# Visualization: Pairplot
sns.pairplot(churners_data)
plt.title('Pairplot of churners Data')
plt.show()
```



```
# Visualization: Correlation Heatmap
plt.figure(figsize=(10, 8))
sns.heatmap(correlation_matrix, annot=True, cmap='coolwarm',
fmt=".2f")
```

```
plt.title('Correlation Heatmap of churners Data')
plt.show()
```

