

# Univariate, Bivariate and Multivariate Analysis

```
In [2]: import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
%matplotlib inline
import seaborn as sns
import math
```

```
In [3]: card_approval_df=pd.read_csv('clean_dataset.csv')
print(card_approval_df.head())
```

	Gender	Age	Debt	Married	BankCustomer	Industry	Ethnicity	\
0	1	30.83	0.000	1	1	Industrials	White	
1	0	58.67	4.460	1	1	Materials	Black	
2	0	24.50	0.500	1	1	Materials	Black	
3	1	27.83	1.540	1	1	Industrials	White	
4	1	20.17	5.625	1	1	Industrials	White	

	YearsEmployed	PriorDefault	Employed	CreditScore	DriversLicense	\
0	1.25	1	1	1	0	
1	3.04	1	1	6	0	
2	1.50	1	0	0	0	
3	3.75	1	1	5	1	
4	1.71	1	0	0	0	

	Citizen	ZipCode	Income	Approved
0	ByBirth	202	0	1
1	ByBirth	43	560	1
2	ByBirth	280	824	1
3	ByBirth	100	3	1
4	ByOtherMeans	120	0	1

```
In [4]: print(card_approval_df.info())
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 690 entries, 0 to 689
Data columns (total 16 columns):
#   Column                Non-Null Count  Dtype
---  ---
0   Gender                690 non-null    int64
1   Age                   690 non-null    float64
2   Debt                  690 non-null    float64
3   Married               690 non-null    int64
4   BankCustomer          690 non-null    int64
5   Industry              690 non-null    object
6   Ethnicity             690 non-null    object
7   YearsEmployed         690 non-null    float64
8   PriorDefault          690 non-null    int64
9   Employed              690 non-null    int64
10  CreditScore           690 non-null    int64
11  DriversLicense        690 non-null    int64
12  Citizen               690 non-null    object
13  ZipCode               690 non-null    int64
14  Income                690 non-null    int64
15  Approved              690 non-null    int64
dtypes: float64(3), int64(10), object(3)
memory usage: 86.4+ KB
None
```

```
In [5]: card_approval_df.duplicated().sum()

Out[5]: 0
```

# Univariate Analysis of continuous Variables

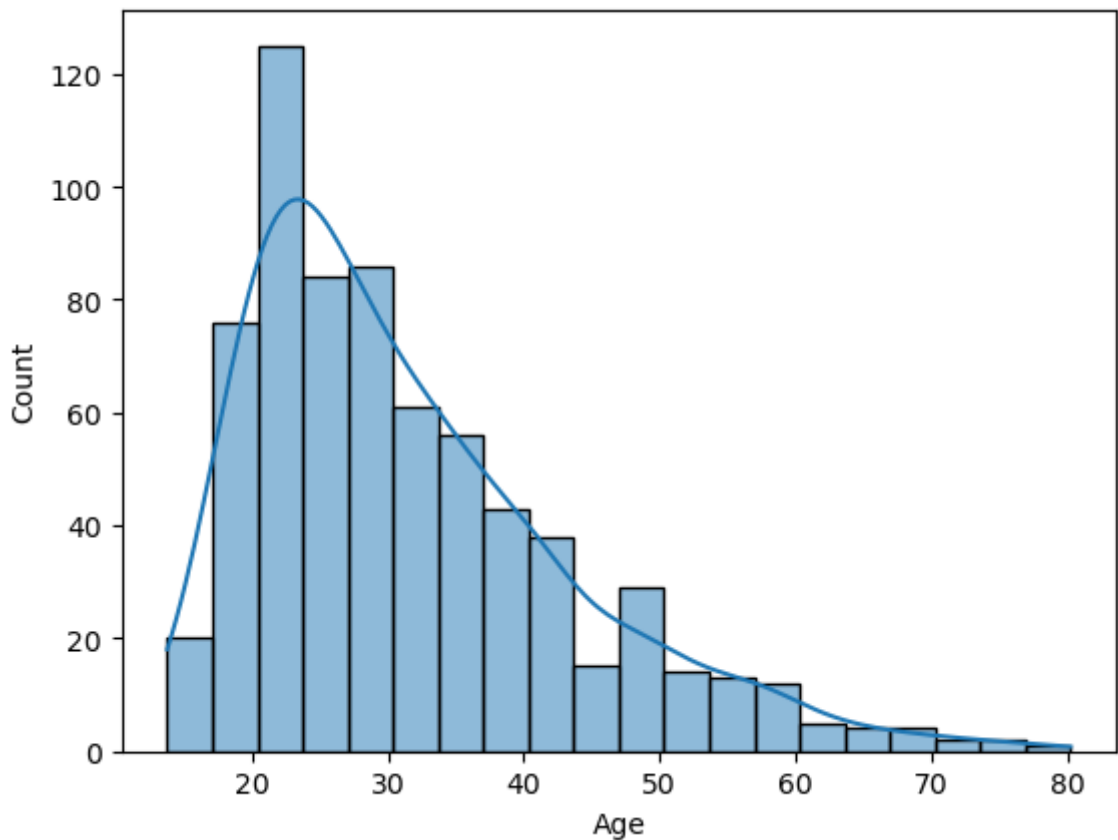
```
In [6]: card_approval_df[['Age', 'Debt', 'YearsEmployed', 'CreditScore', 'Income']].describe()
```

Out[6]:

	Age	Debt	YearsEmployed	CreditScore	Income
count	690.000000	690.000000	690.000000	690.000000	690.000000
mean	31.514116	4.758725	2.223406	2.400000	1017.385507
std	11.860245	4.978163	3.346513	4.86294	5210.102598
min	13.750000	0.000000	0.000000	0.000000	0.000000
25%	22.670000	1.000000	0.165000	0.000000	0.000000
50%	28.460000	2.750000	1.000000	0.000000	5.000000
75%	37.707500	7.207500	2.625000	3.000000	395.500000
max	80.250000	28.000000	28.500000	67.000000	100000.000000

```
In [7]: sns.histplot(card_approval_df.Age, kde=True)

Out[7]: <AxesSubplot:xlabel='Age', ylabel='Count'>
```



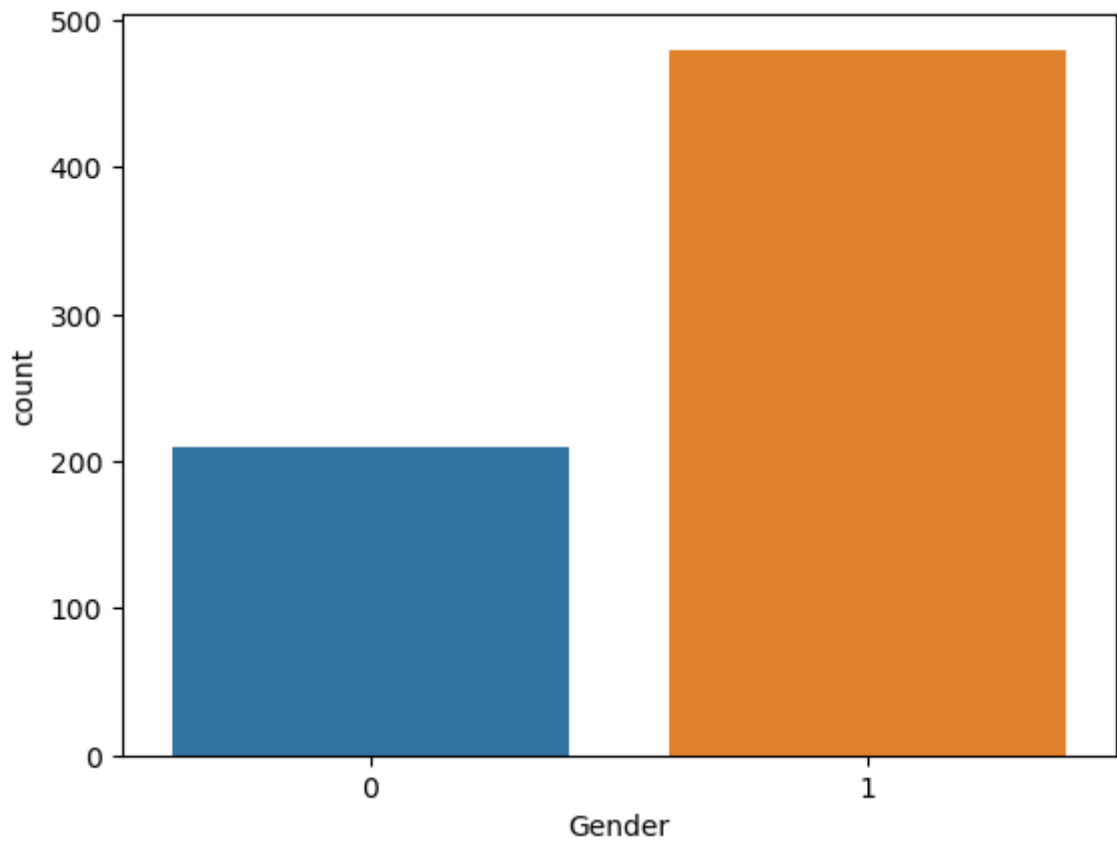
## Univariate Analysis of categorical Variables

```
In [8]: sns.countplot(card_approval_df.Gender)
```

C:\Users\gptkgf\anaconda3\lib\site-packages\seaborn\\_decorators.py:36: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

warnings.warn(

```
Out[8]: <AxesSubplot:xlabel='Gender', ylabel='count'>
```

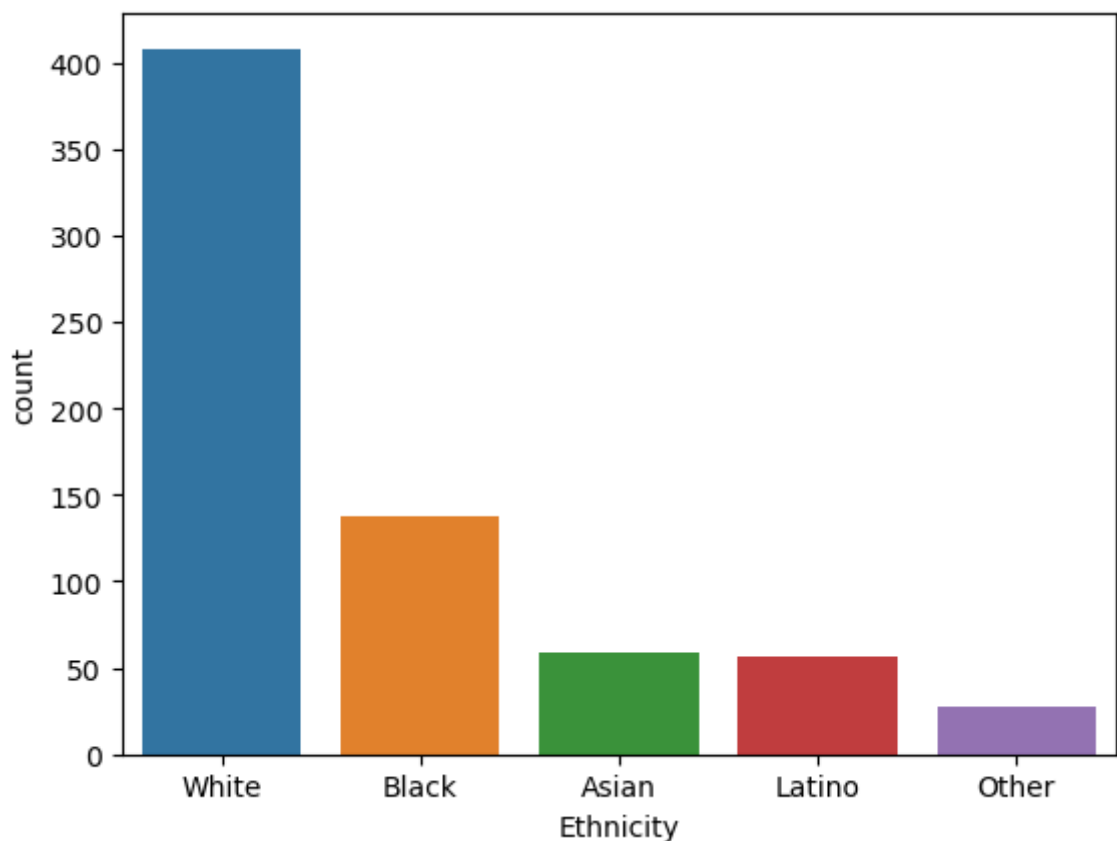


```
In [9]: sns.countplot(card_approval_df.Ethnicity)
```

C:\Users\gptkgf\anaconda3\lib\site-packages\seaborn\\_decorators.py:36: FutureWarning: Pass the following variable as a keyword arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

```
warnings.warn(
```

```
Out[9]: <AxesSubplot:xlabel='Ethnicity', ylabel='count'>
```



# Bivariate analysis of continuous variable

```
In [10]: card_approval_df[['Age', 'Debt', 'YearsEmployed', 'CreditScore', 'Income']].corr()
```

```
Out[10]:
```

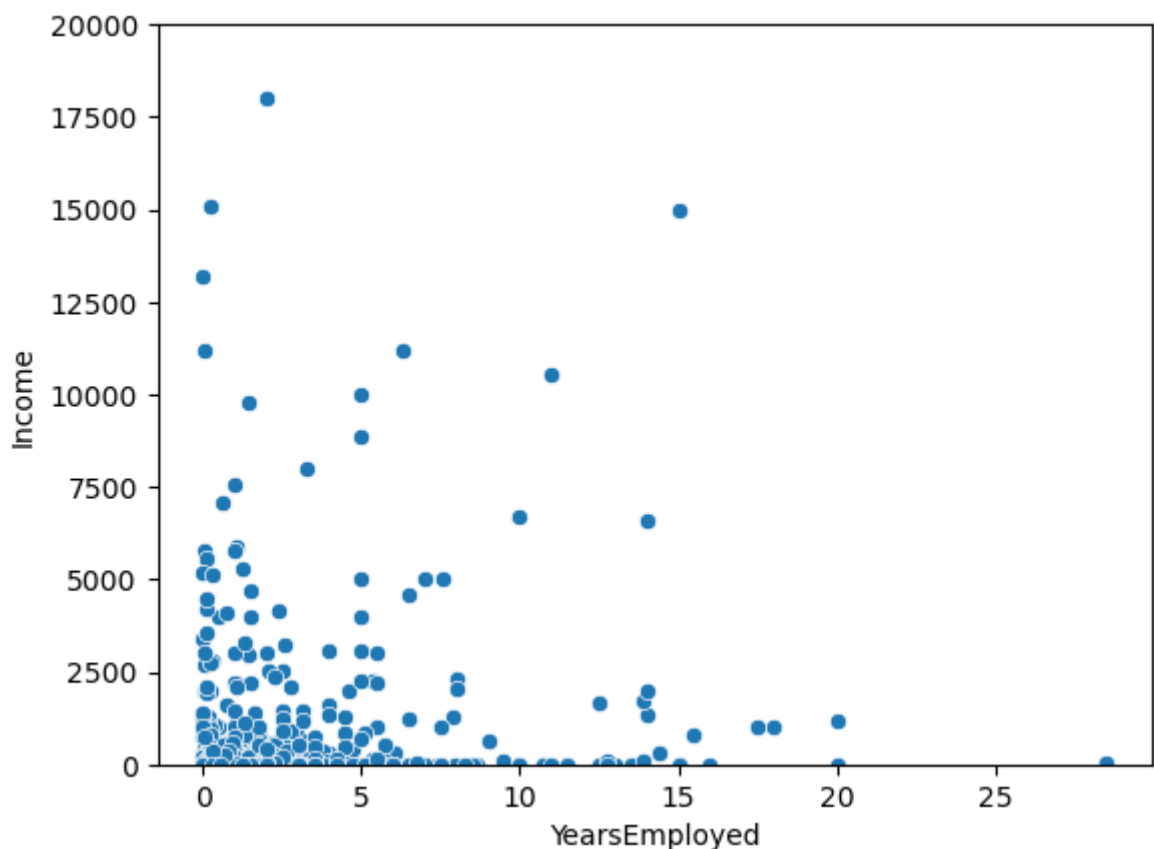
	Age	Debt	YearsEmployed	CreditScore	Income
Age	1.000000	0.202177	0.391464	0.187327	0.018719
Debt	0.202177	1.000000	0.298902	0.271207	0.123121
YearsEmployed	0.391464	0.298902	1.000000	0.322330	0.051345
CreditScore	0.187327	0.271207	0.322330	1.000000	0.063692
Income	0.018719	0.123121	0.051345	0.063692	1.000000

```
In [12]: sns.scatterplot(card_approval_df.YearsEmployed, card_approval_df.Income)
plt.ylim(0, 20000)
```

C:\Users\gptkgf\anaconda3\lib\site-packages\seaborn\\_decorators.py:36: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

```
warnings.warn(
(0.0, 20000.0))
```

```
Out[12]:
```



## Bivariate Analysis of Categorical Variables vs Continuous Variables

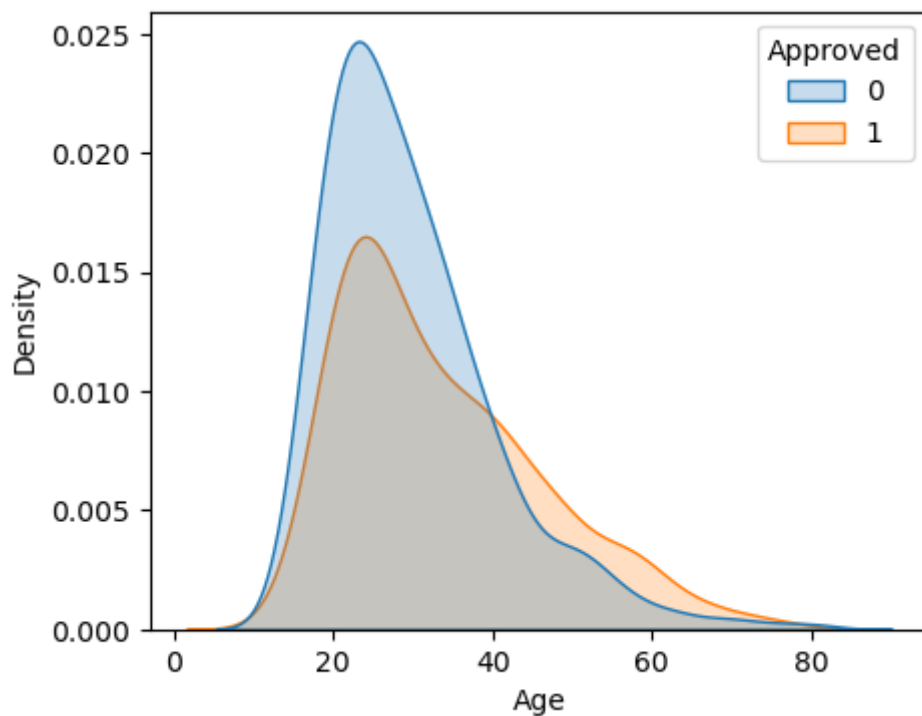
```
In [13]: card_approval_df.groupby(by='Approved').agg('mean')[['Age', 'Debt', 'YearsEmployed',
```

Out[13]:

	Age	Debt	YearsEmployed	CreditScore	Income
Approved					
0	29.773029	3.839948	1.257924	0.631854	198.605744
1	33.686221	5.904951	3.427899	4.605863	2038.859935

```
In [19]: plt.figure(figsize=(5,4))  
sns.kdeplot(data=card_approval_df,x='Age',hue='Approved',fill=True)
```

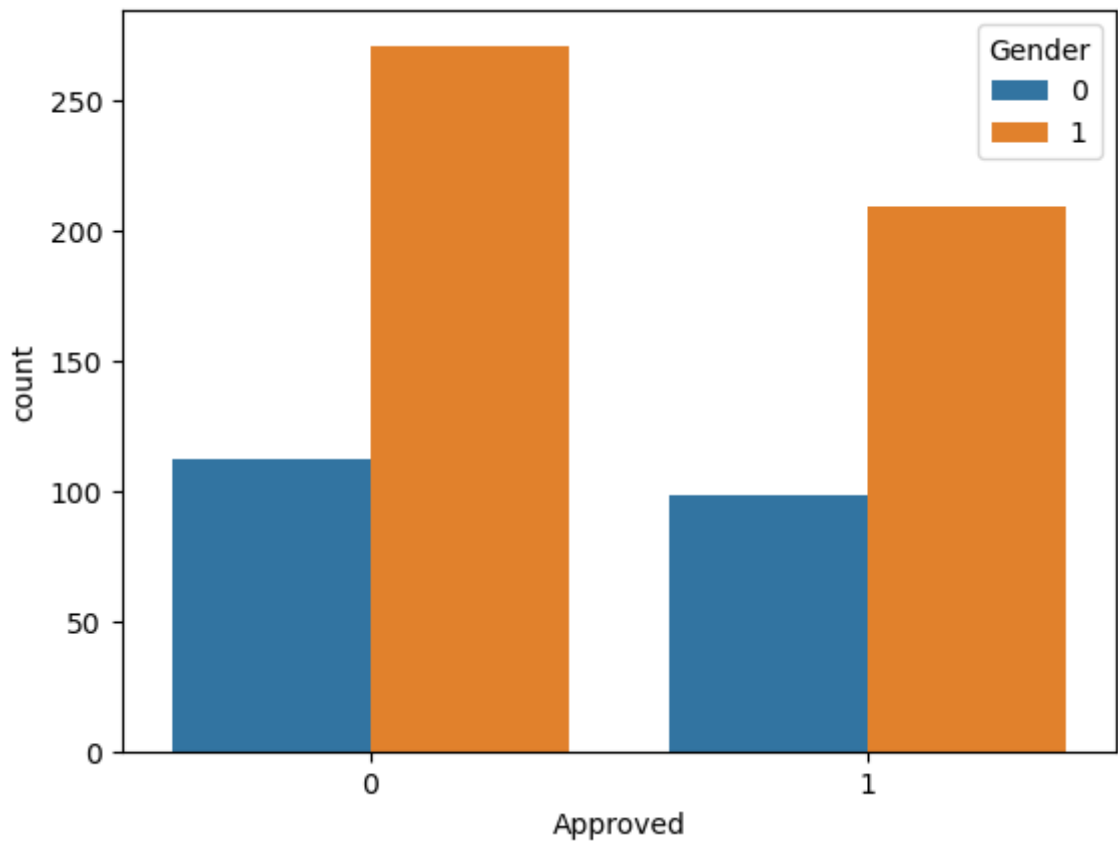
Out[19]: &lt;AxesSubplot:xlabel='Age', ylabel='Density'&gt;



## Bivariate Analysis of Categorical Variables vs Categorical Variables

```
In [20]: sns.countplot(data=card_approval_df,x='Approved',hue='Gender')
```

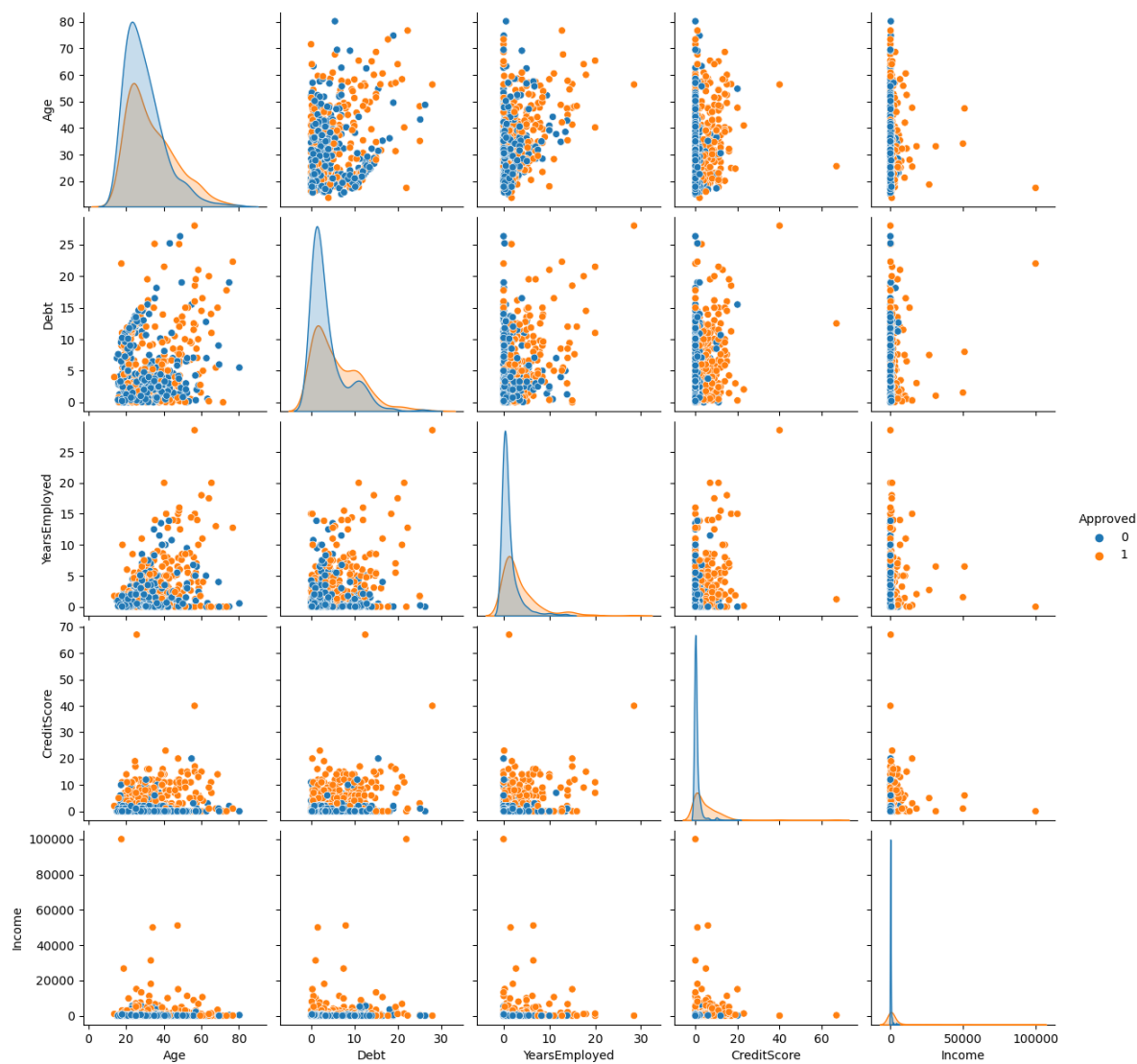
Out[20]: &lt;AxesSubplot:xlabel='Approved', ylabel='count'&gt;



## Multivariate Analysis

```
In [21]: sns.pairplot(data=card_approval_df[['Age', 'Debt', 'YearsEmployed', 'CreditScore', 'Income', 'Approved']])
```

```
Out[21]: <seaborn.axisgrid.PairGrid at 0x23b342f37c0>
```



In [ ]: