

## Importing The Libraries

```
In [11]: import numpy as np
import pandas as pd
import pickle
import seaborn as sns
import matplotlib.pyplot as plt
%matplotlib inline
import sklearn
from sklearn.preprocessing import LabelEncoder
from sklearn.tree import DecisionTreeClassifier
from sklearn.ensemble import GradientBoostingClassifier, RandomForestClassifier
from sklearn.neighbors import KNeighborsClassifier
from sklearn.model_selection import RandomizedSearchCV
from xgboost import XGBClassifier
from sklearn.ensemble import RandomForestClassifier
import imblearn
from imblearn.under_sampling import RandomUnderSampler
from sklearn.model_selection import train_test_split
from sklearn.preprocessing import scale
from sklearn.preprocessing import StandardScaler
from sklearn.metrics import accuracy_score, classification_report, confusion_matrix, f1_score
```

## Reading The Dataset

```
In [118]: df=pd.read_csv('Loan_dataset.csv')
df
```

Out[118]:

	Loan_ID	Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIncome	Loan_Amount_Term
0	LP001002	Male	No	0	Graduate	No	5849	0.0	360
1	LP001003	Male	Yes	1	Graduate	No	4583	1508.0	360
2	LP001005	Male	Yes	0	Graduate	Yes	3000	0.0	360
3	LP001006	Male	Yes	0	Not Graduate	No	2583	2358.0	360
4	LP001008	Male	No	0	Graduate	No	6000	0.0	360
...	...	...	...	...	...	...	...	...	...
609	LP002978	Female	No	0	Graduate	No	2900	0.0	360
610	LP002979	Male	Yes	3+	Graduate	No	4106	0.0	360
611	LP002983	Male	Yes	1	Graduate	No	8072	240.0	360
612	LP002984	Male	Yes	2	Graduate	No	7583	0.0	360
613	LP002990	Female	No	0	Graduate	Yes	4583	0.0	360

614 rows × 10 columns

```
In [119]: df.head()
```

Out[119]:

	Loan_ID	Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIncome	Loan_Amount_Term
--	---------	--------	---------	------------	-----------	---------------	-----------------	-------------------	------------------

	Loan_ID	Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIncome	Loa
0	LP001002	Male	No	0	Graduate	No	5849	0.0	
1	LP001003	Male	Yes	1	Graduate	No	4583	1508.0	
2	LP001005	Male	Yes	0	Graduate	Yes	3000	0.0	
3	LP001006	Male	Yes	0	Not Graduate	No	2583	2358.0	
4	LP001008	Male	No	0	Graduate	No	6000	0.0	

```
In [120]: df.info()
```

```
RangeIndex: 614 entries, 0 to 613
```

```
Data columns (total 13 columns):
```

#	Column	Non-Null Count	Dtype
0	Loan_ID	614 non-null	object
1	Gender	601 non-null	object
2	Married	611 non-null	object
3	Dependents	599 non-null	object
4	Education	614 non-null	object
5	Self_Employed	582 non-null	object
6	ApplicantIncome	614 non-null	int64
7	CoapplicantIncome	614 non-null	float64
8	LoanAmount	592 non-null	float64
9	Loan_Amount_Term	600 non-null	float64
10	Credit_History	564 non-null	float64
11	Property_Area	614 non-null	object
12	Loan_Status	614 non-null	object

```
dtypes: float64(4), int64(1), object(8)
```

```
memory usage: 62.5+ KB
```

```
In [121]: df.shape
```

```
Out[121]: (614, 13)
```

```
In [122]: df=df.drop(columns=["Loan_ID"],axis=1)
```

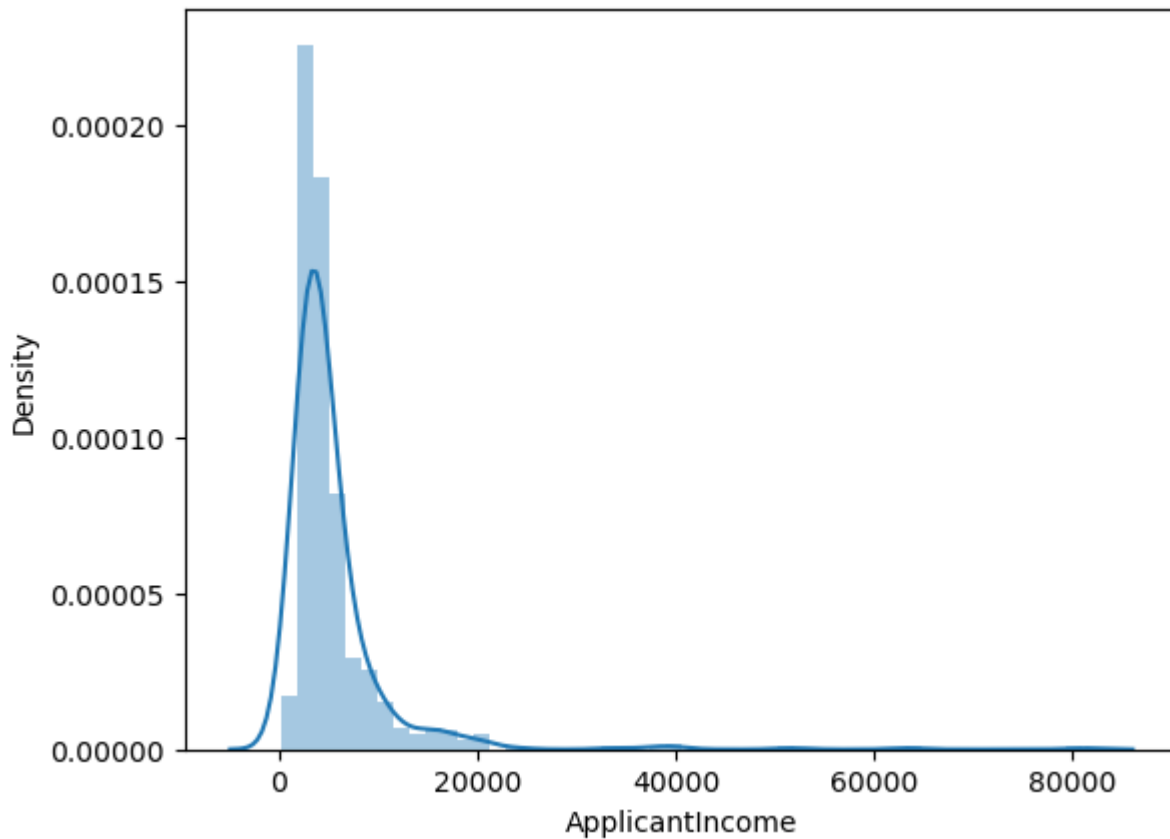
Uni-Variate Analysis

```
In [42]: sns.distplot(df.ApplicantIncome)
```

C:\ProgramData\Anaconda3\lib\site-packages\seaborn\distributions.py:2619: FutureWarning: `dist plot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).

```
warnings.warn(msg, FutureWarning)
```

```
Out[42]:
```

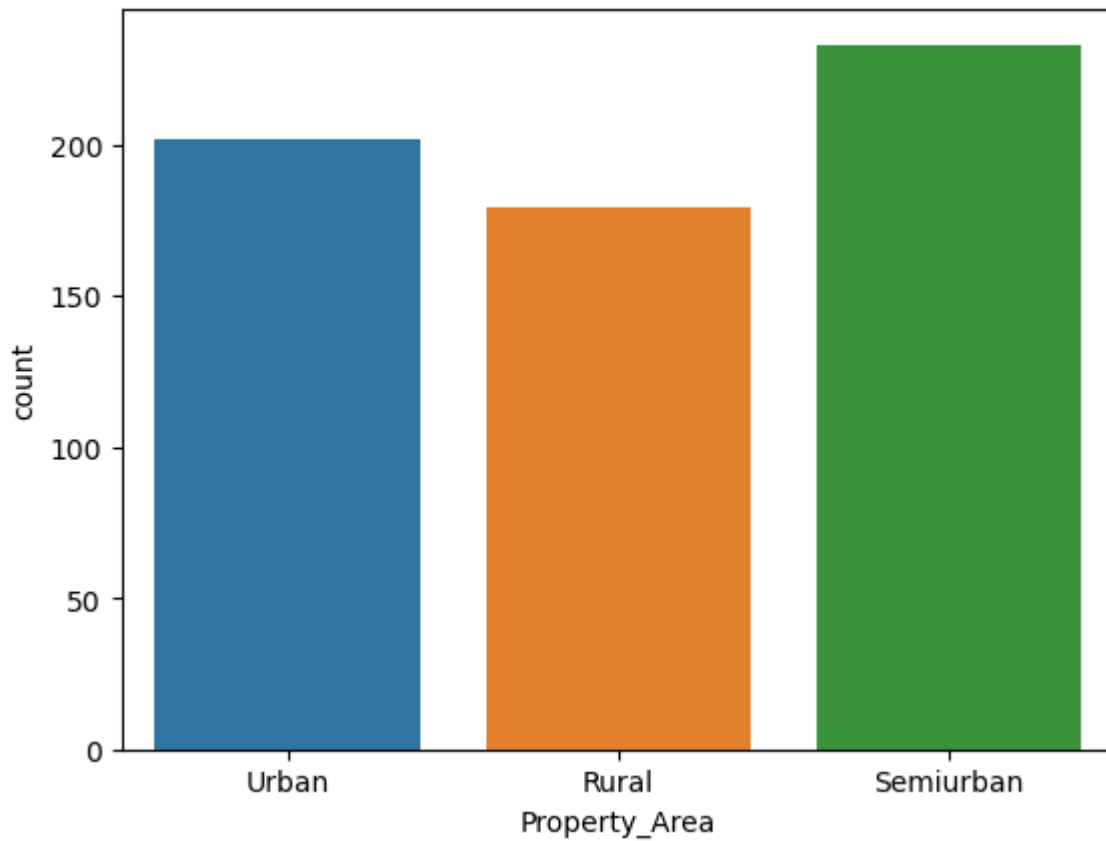


```
In [43]: sns.countplot(df.Property_Area)
```

C:\ProgramData\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[43]:
```

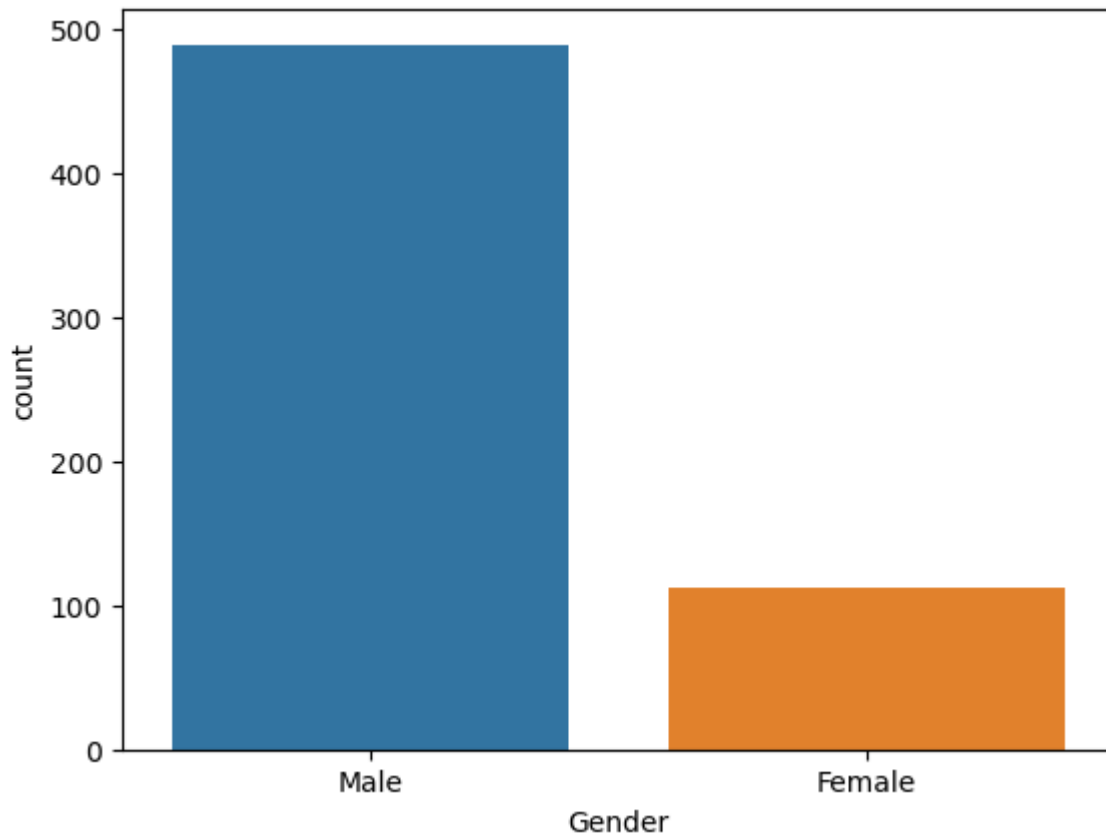


```
In [44]: sns.countplot(df.Gender)
```

C:\ProgramData\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[44]:
```

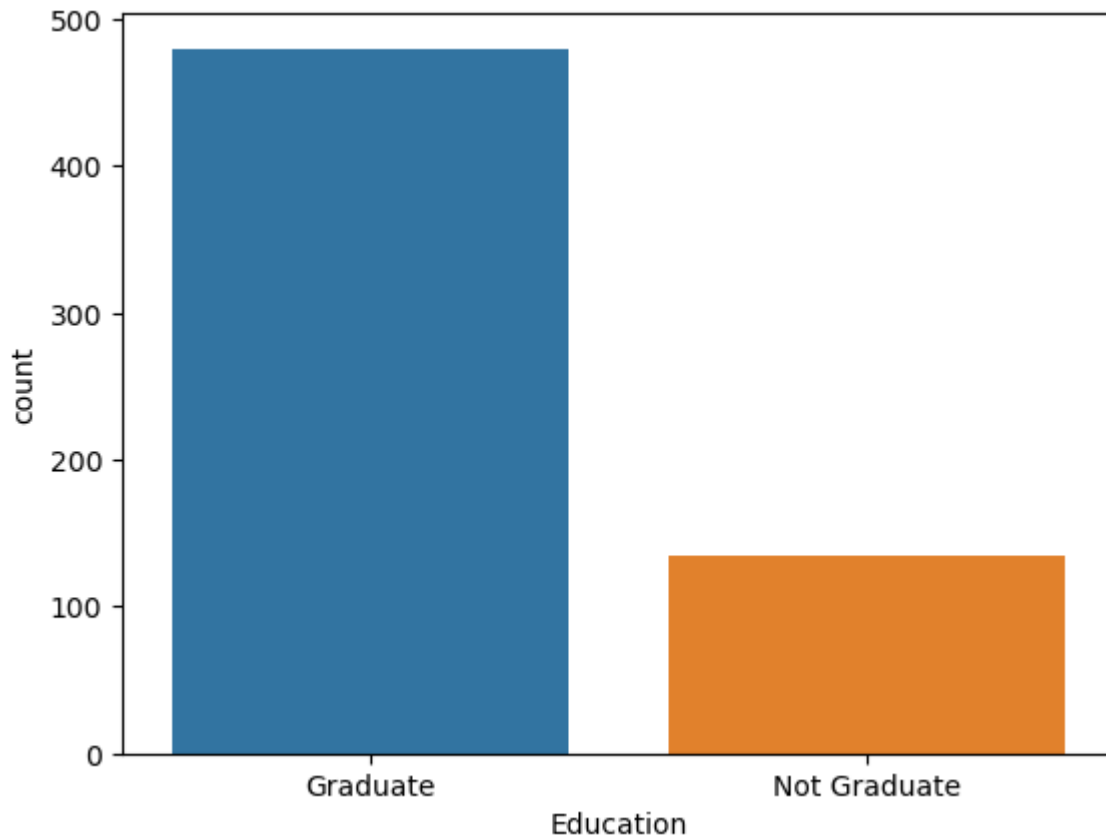


```
In [45]: sns.countplot(df.Gender)
```

C:\ProgramData\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[45]:
```

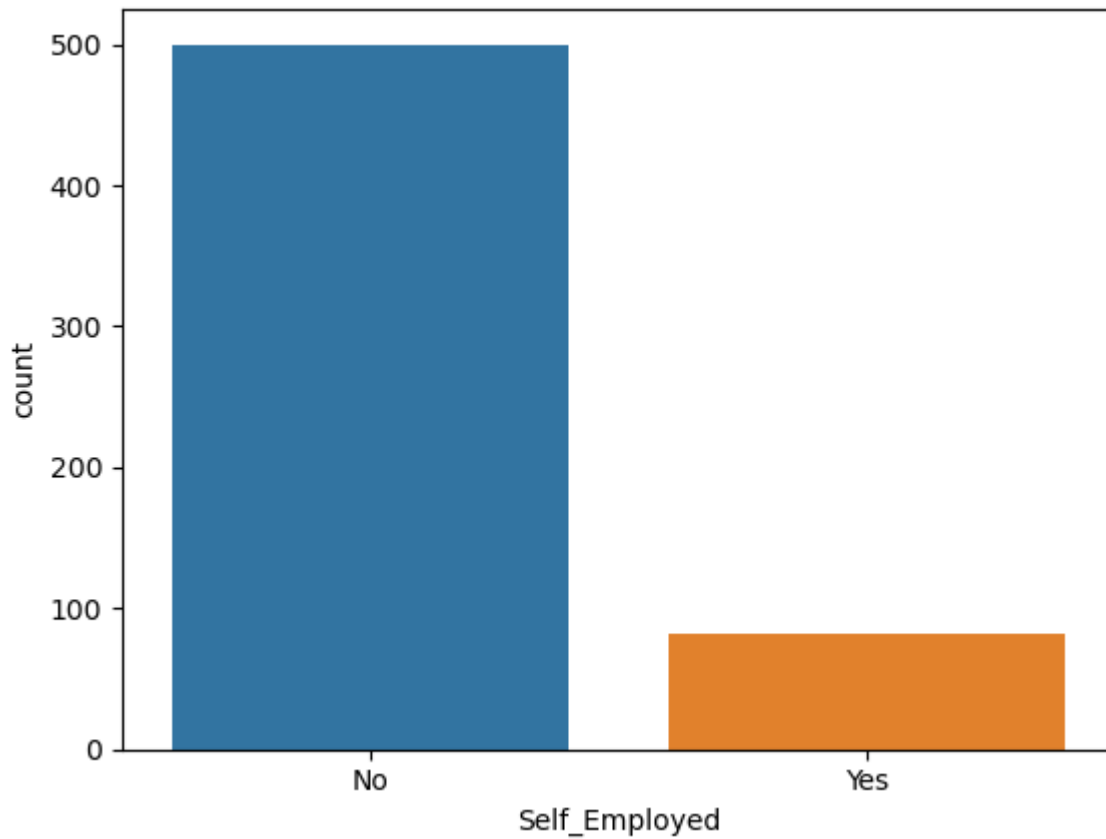


```
In [46]: sns.countplot(df.Self_Employed)
```

C:\ProgramData\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[46]:
```

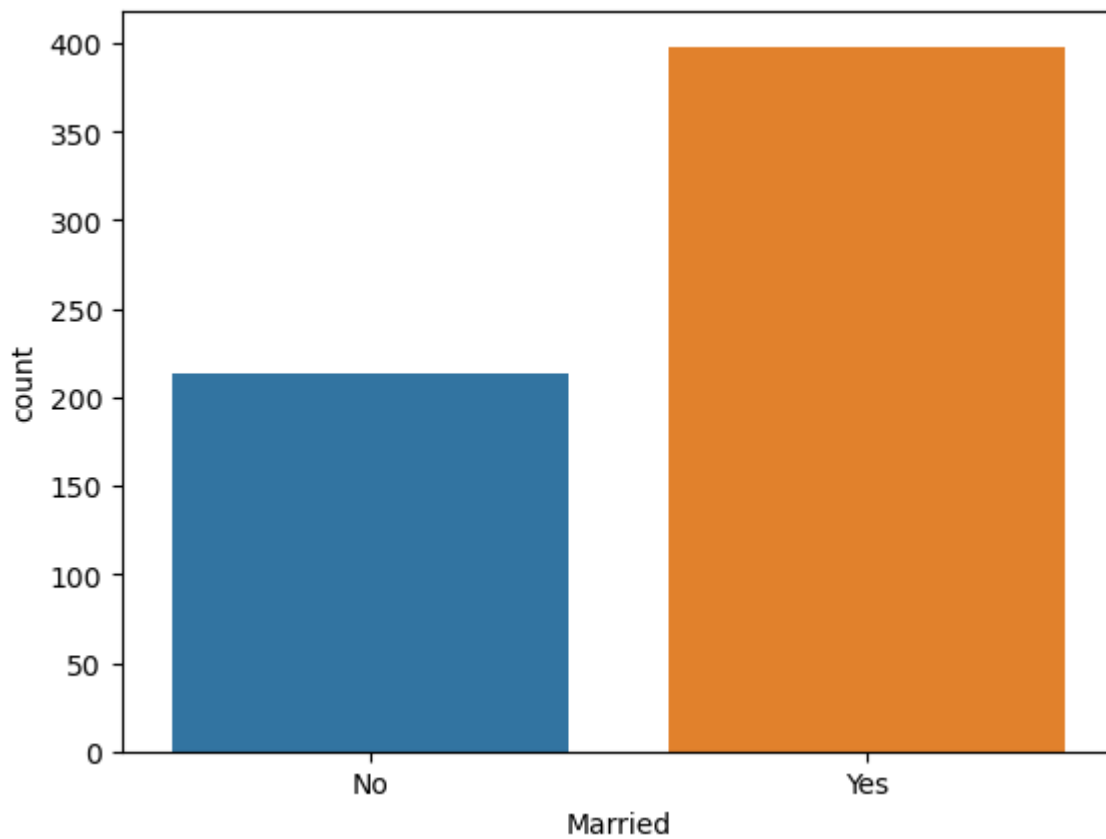


```
In [47]: sns.countplot(df.Married)
```

C:\ProgramData\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.

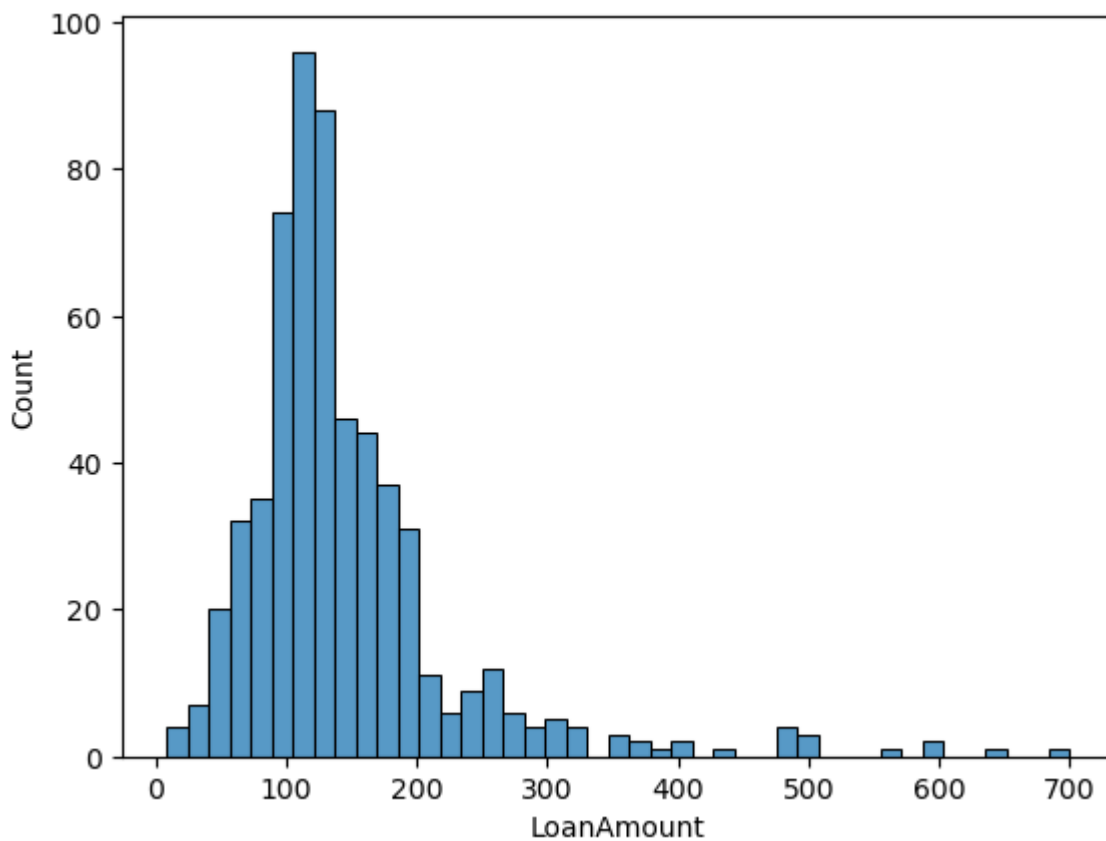
```
warnings.warn(
```

```
Out[47]:
```



In [48]: `sns.histplot(df.LoanAmount)`

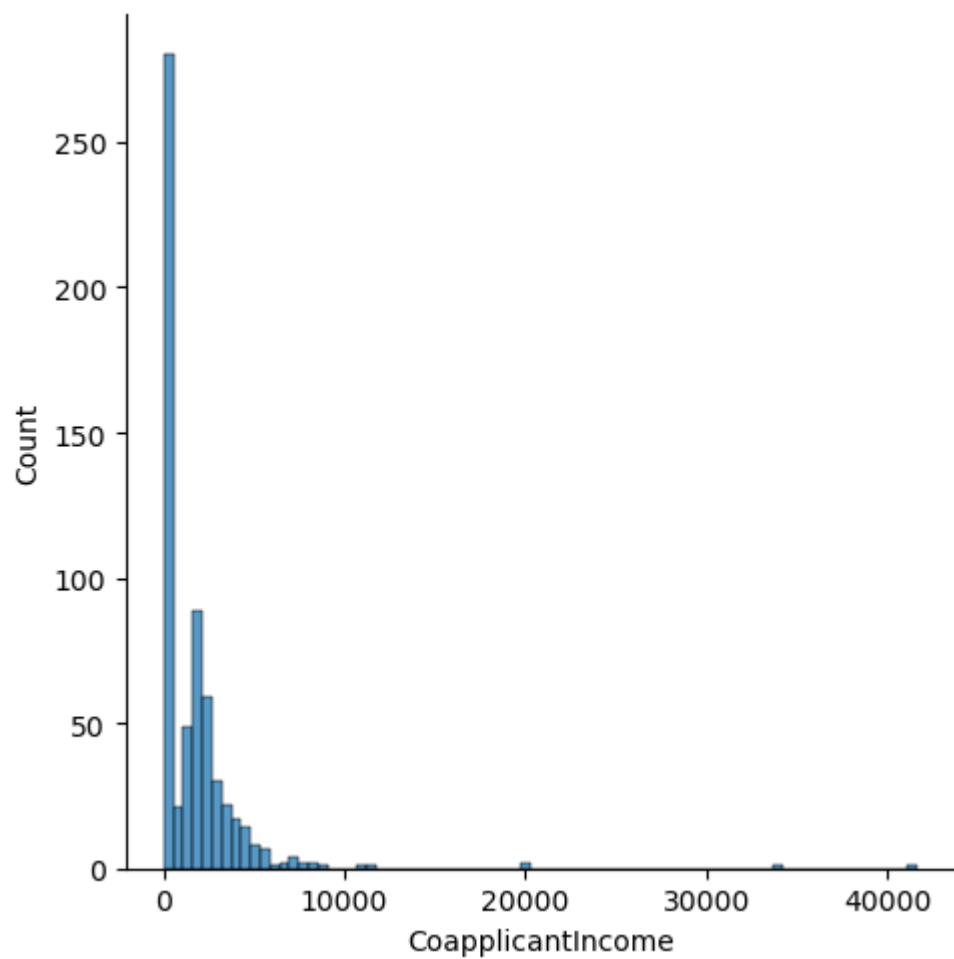
Out[48]:



In [49]: `sns.displot(df.CoapplicantIncome)`

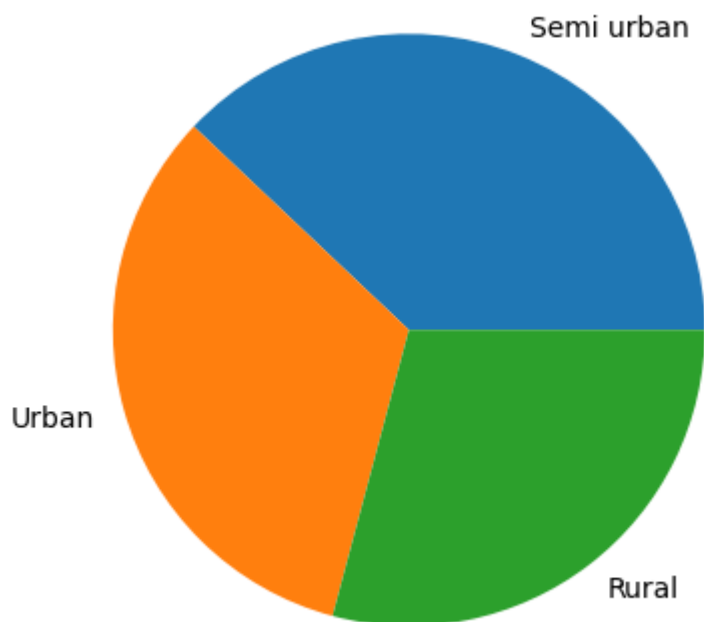


Out[49]:



In [50]: `plt.pie(df.Property_Area.value_counts(),[0,0,0],labels=['Semi urban','Urban','Rural'])`

Out[50]: ([, ],  
[Text(0.40661098511372595, 1.0220897743275028, 'Semi urban'),  
Text(-1.0582795633383781, -0.3000739339235115, 'Urban'),  
Text(0.67000963198199, -0.8724030565348555, 'Rural')])



```
In [123]: df.Loan_Status.value_counts()
```

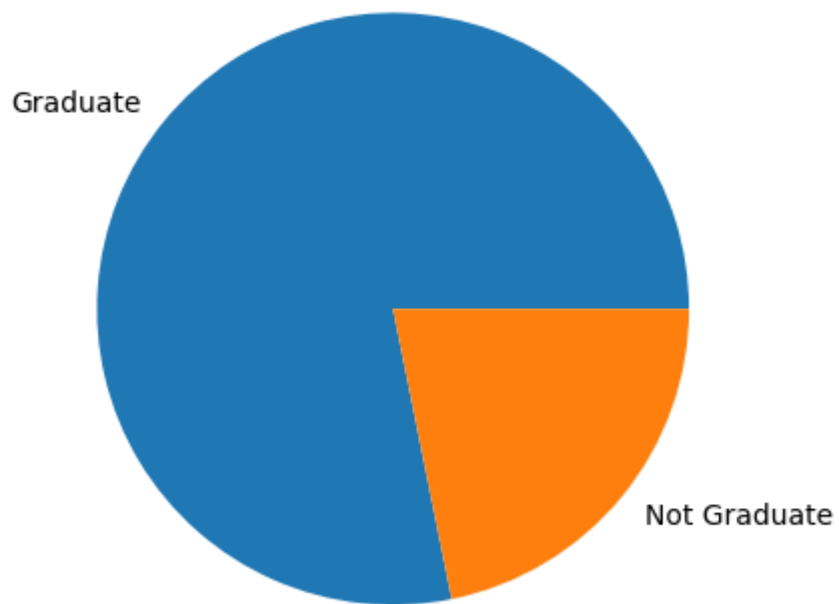
```
Out[123]: Y      422  
         N      192  
         Name: Loan_Status, dtype: int64
```

```
In [124]: df.Credit_History.value_counts()
```

```
Out[124]: 1.0      475  
         0.0       89  
         Name: Credit_History, dtype: int64
```

```
In [125]: plt.pie(df.Education.value_counts(),[0,0],labels=['Graduate','Not Graduate'])
```

```
Out[125]: ([,
],
 [Text(-0.8514262161117528, 0.6964721089301588, 'Graduate'),
  Text(0.8514262161117524, -0.6964721089301593, 'Not Graduate')])
```



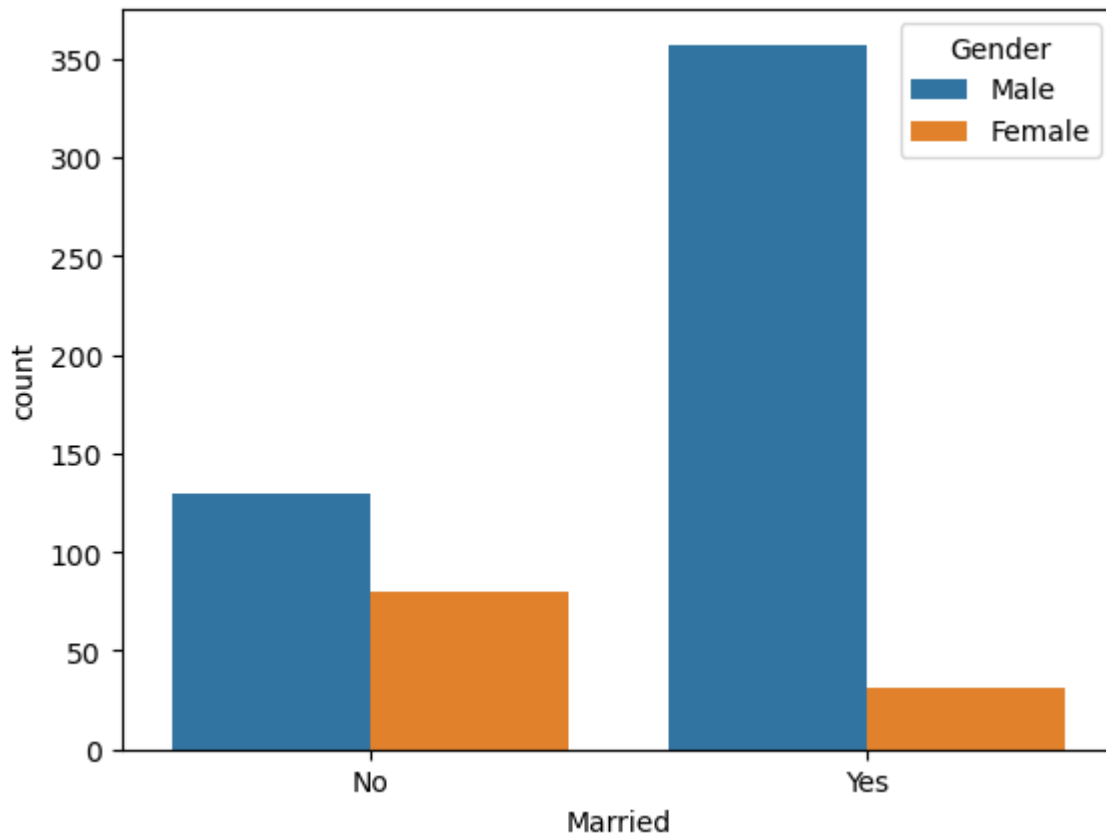
Bivariate Analysis

In [51]: `sns.countplot(df['Married'], hue=df['Gender'])`

C:\ProgramData\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[51]:

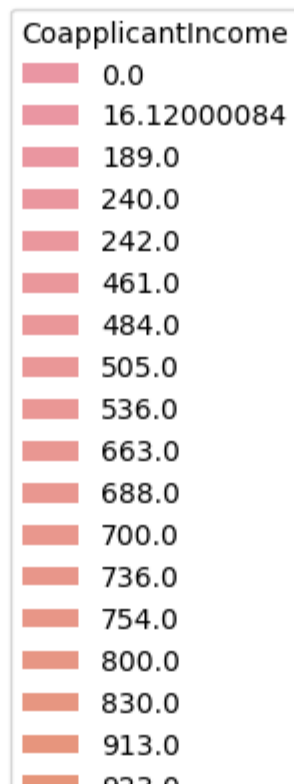


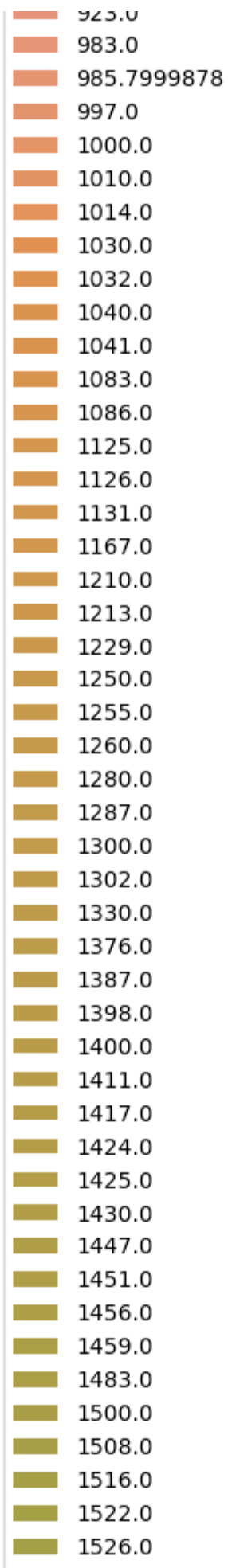
In [52]: `sns.countplot(df['ApplicantIncome'], hue=df['CoapplicantIncome'])`

C:\ProgramData\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[52]:





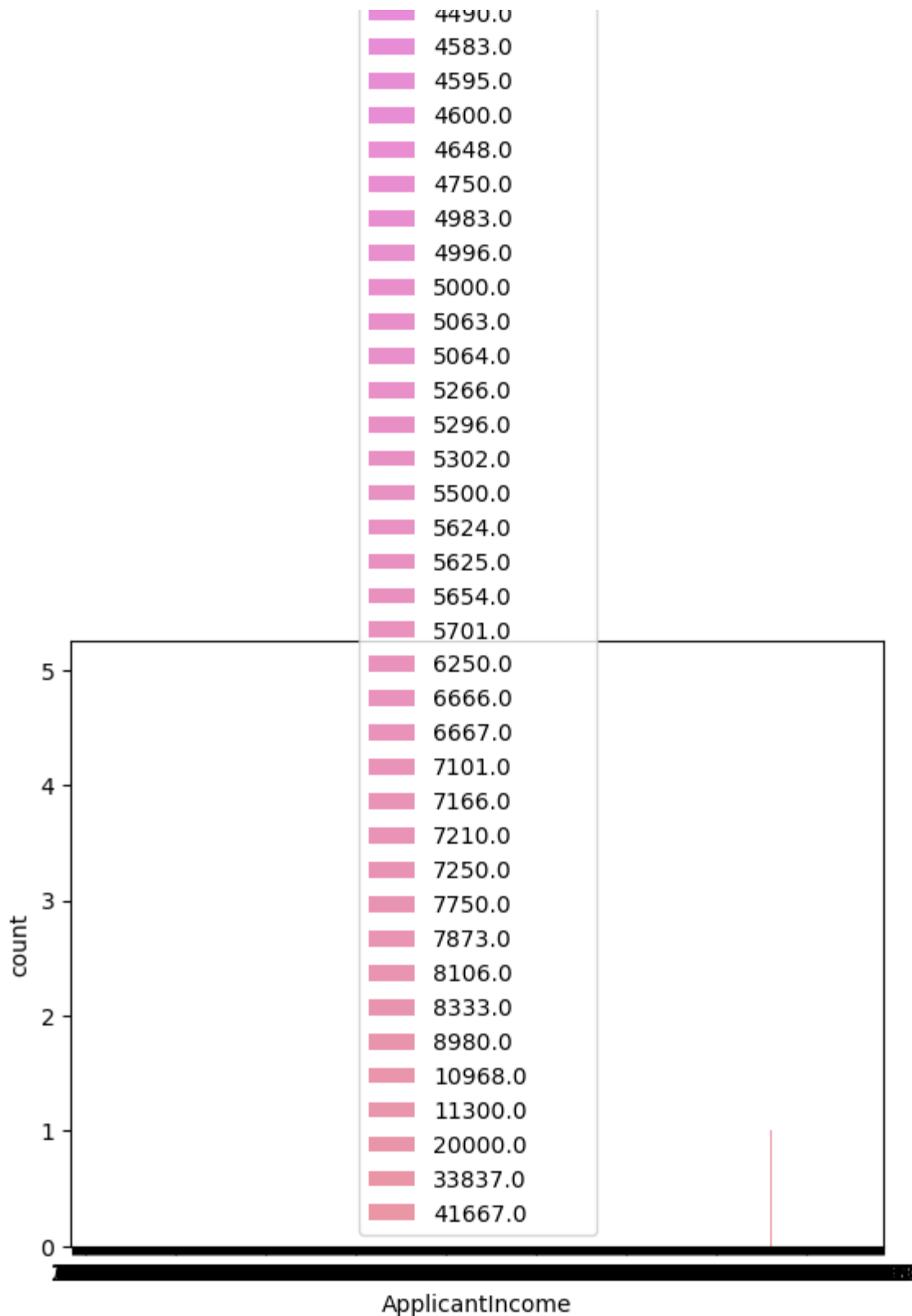
■	1542.0
■	1560.0
■	1587.0
■	1590.0
■	1591.0
■	1600.0
■	1603.0
■	1619.0
■	1625.0
■	1632.0
■	1640.0
■	1644.0
■	1664.0
■	1666.0
■	1667.0
■	1668.0
■	1695.0
■	1700.0
■	1710.0
■	1717.0
■	1719.0
■	1733.0
■	1742.0
■	1750.0
■	1769.0
■	1774.0
■	1775.0
■	1779.0
■	1783.0
■	1793.0
■	1800.0
■	1803.0
■	1811.0
■	1820.0
■	1833.0
■	1840.0
■	1842.0
■	1843.0
■	1851.0
■	1857.0
■	1863.0
■	1868.0
■	1872.0
■	1875.0
■	1881.0
■	1911.0
■	1915.0

1917.0
1929.0
1950.0
1964.0
1983.0
1987.0
1993.0
2000.0
2004.0
2014.0
2016.0
2033.0
2034.0
2035.0
2042.0
2054.0
2064.0
2067.0
2079.0
2083.0
2087.0
2100.0
2115.0
2118.0
2134.0
2138.0
2142.0
2157.0
2160.0
2166.0
2167.0
2168.0
2188.0
2200.0
2209.0
2210.0
2223.0
2232.0
2250.0
2253.0
2254.0
2275.0
2283.0
2302.0
2306.0
2330.0
2333.0

2336.0
2340.0
2358.0
2365.0
2375.0
2383.0
2400.0
2405.0
2416.0
2417.0
2426.0
2436.0
2451.0
2458.0
2466.0
2500.0
2504.0
2524.0
2531.0
2541.0
2569.0
2583.0
2598.0
2667.0
2669.0
2739.0
2773.0
2785.0
2791.0
2792.0
2816.0
2840.0
2845.0
2857.0
2859.0
2900.0
2917.0
2925.0
2934.0
2985.0
3000.0
3013.0
3021.0
3022.0
3033.0
3053.0
3066.0



3088.0
3136.0
3150.0
3166.0
3167.0
3230.0
3237.0
3250.0
3263.0
3274.0
3300.0
3333.0
3334.0
3369.0
3416.0
3428.0
3440.0
3447.0
3449.0
3500.0
3541.0
3583.0
3600.0
3666.0
3667.0
3683.0
3750.0
3796.0
3800.0
3806.0
3850.0
3890.0
3906.0
4000.0
4083.0
4114.0
4167.0
4196.0
4232.0
4250.0
4266.0
4300.0
4301.0
4333.0
4416.0
4417.0
4486.0
4488.0

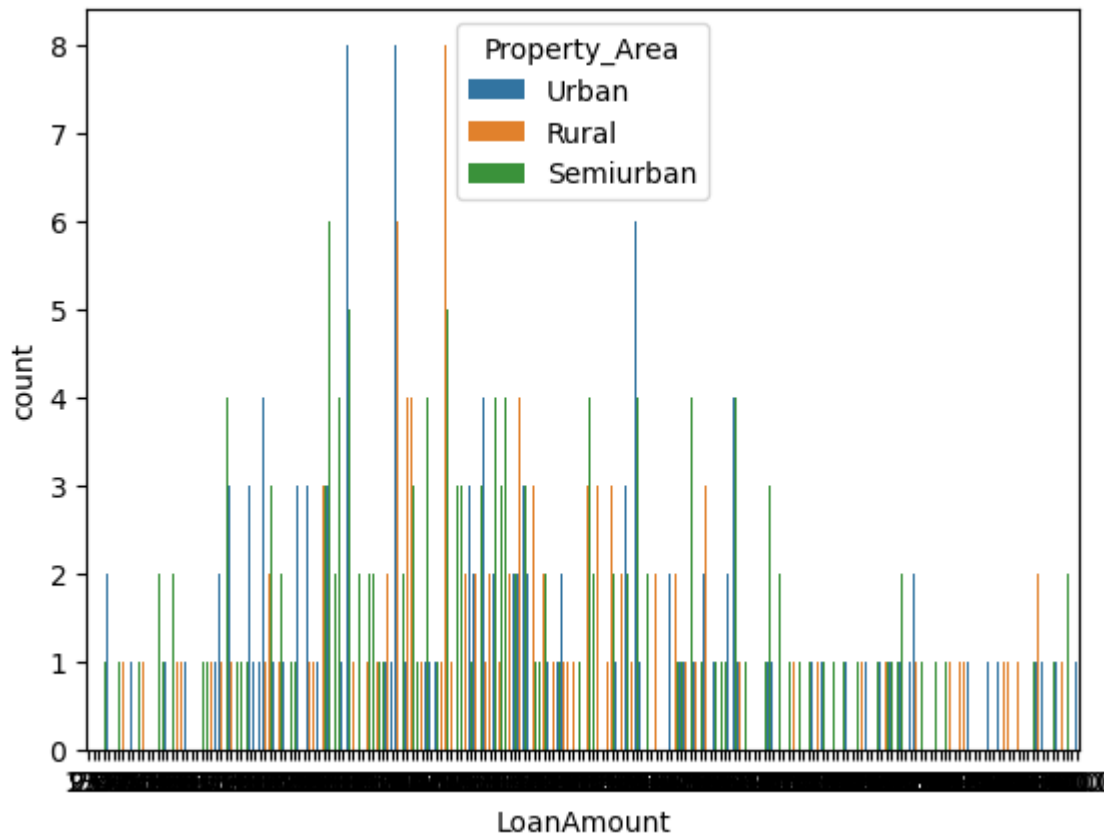


```
In [53]: sns.countplot(df['LoanAmount'],hue=df['Property_Area'])
```

C:\ProgramData\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[53]:
```

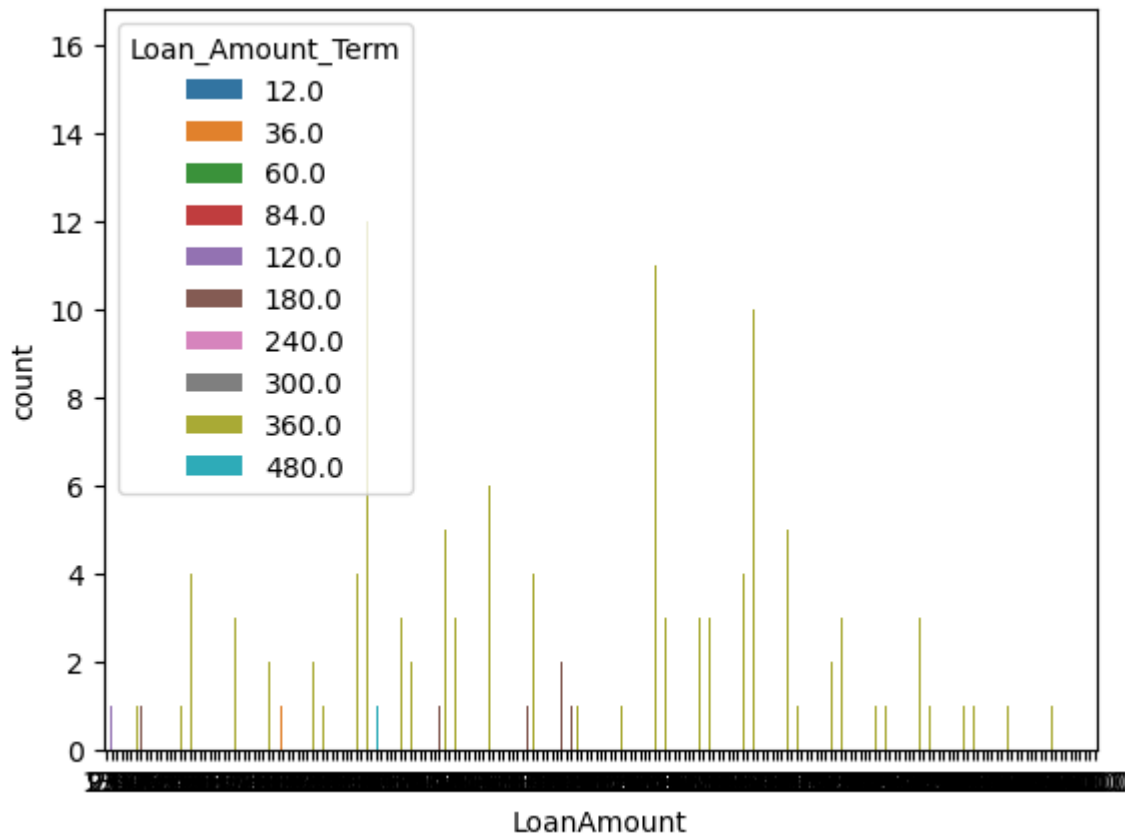


```
In [126]: sns.countplot(df['LoanAmount'],hue=df['Loan_Amount_Term'])
```

C:\ProgramData\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[126]:

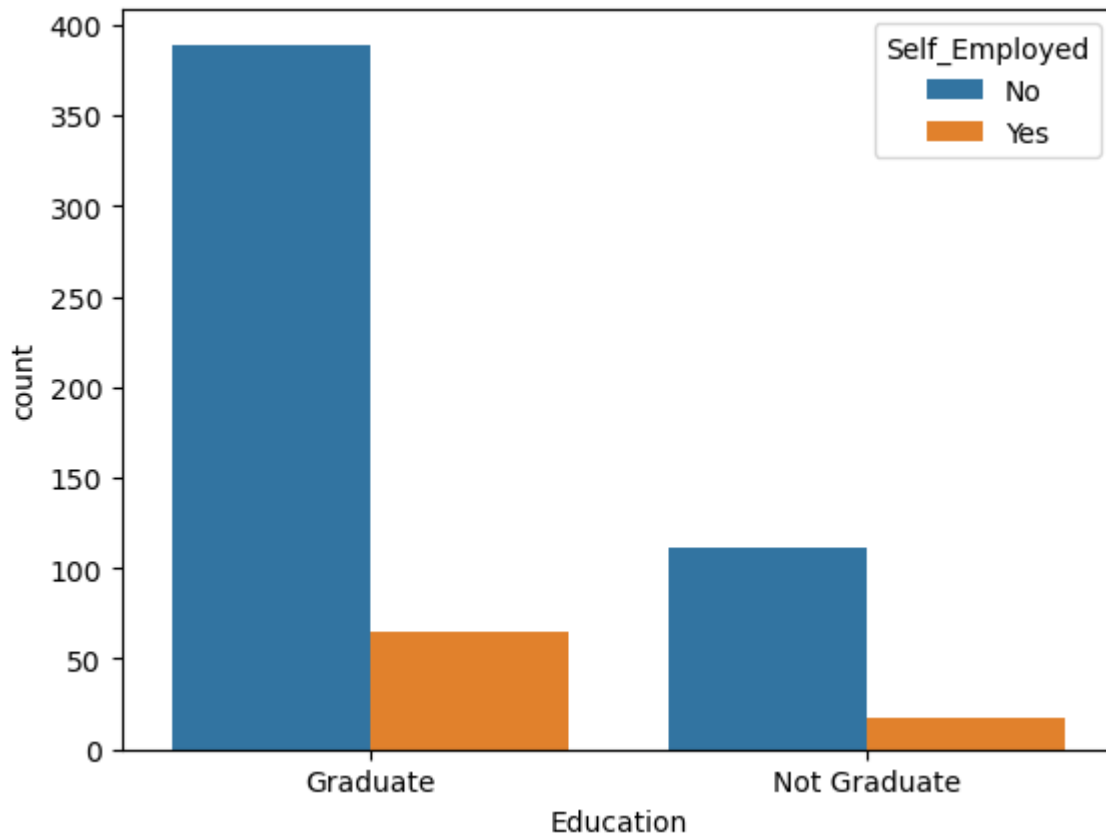


```
In [127]: sns.countplot(df['Education'], hue=df['Self_Employed'])
```

C:\ProgramData\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[127]:

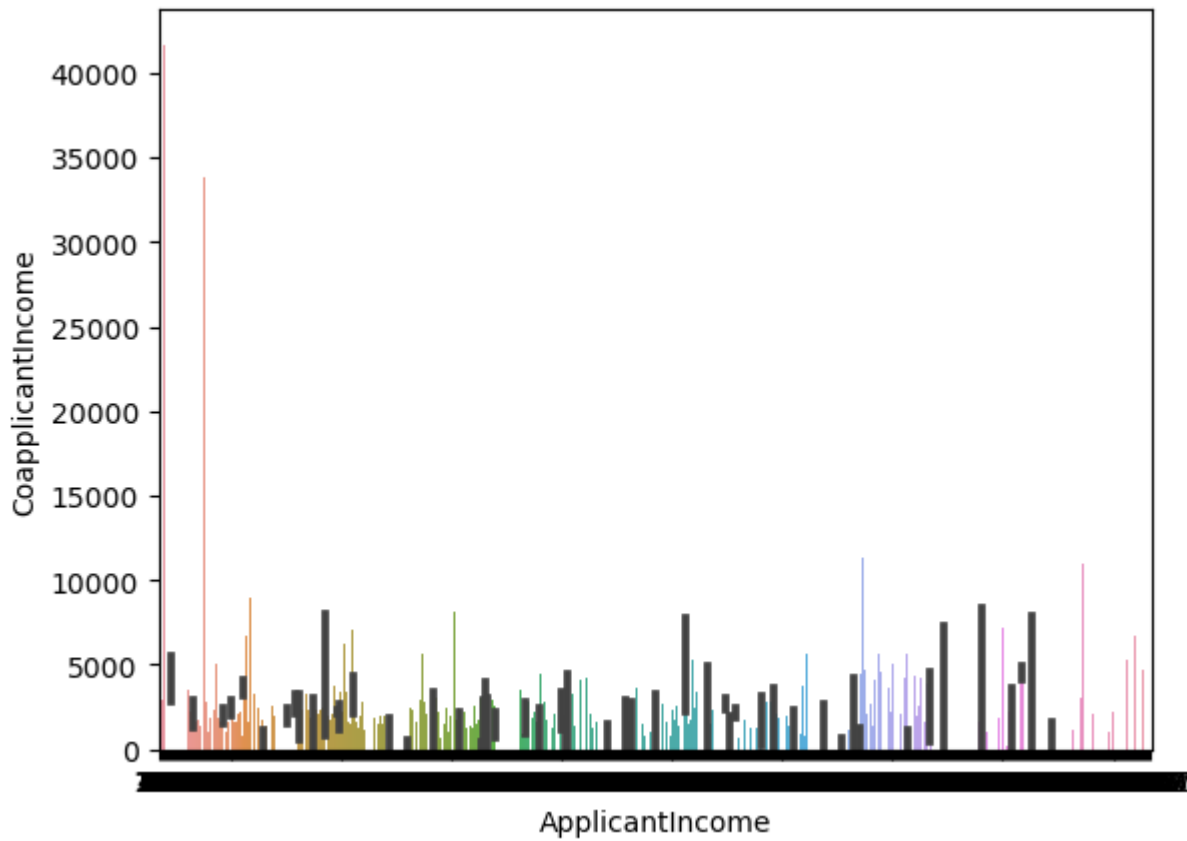


```
In [128]: sns.barplot(df.ApplicantIncome,df.CoapplicantIncome)
```

C:\ProgramData\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.

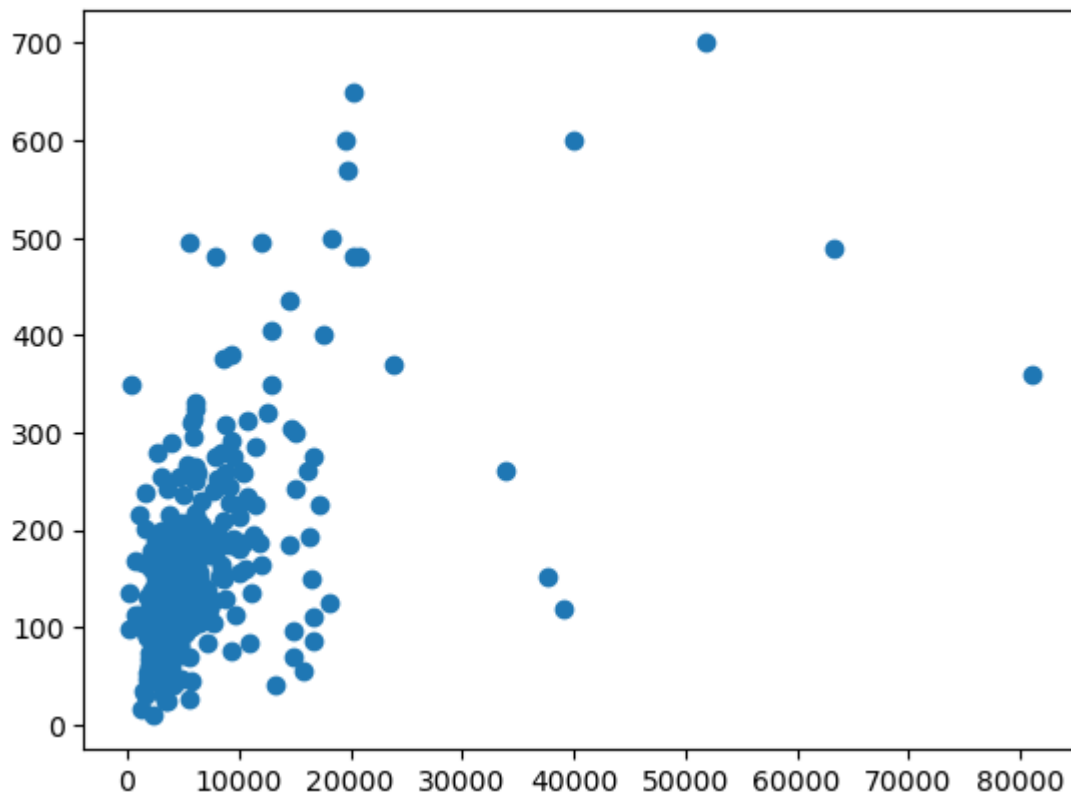
```
warnings.warn(
```

```
Out[128]:
```



```
In [129]: plt.scatter(df.ApplicantIncome,df.LoanAmount)
```

Out[129]:

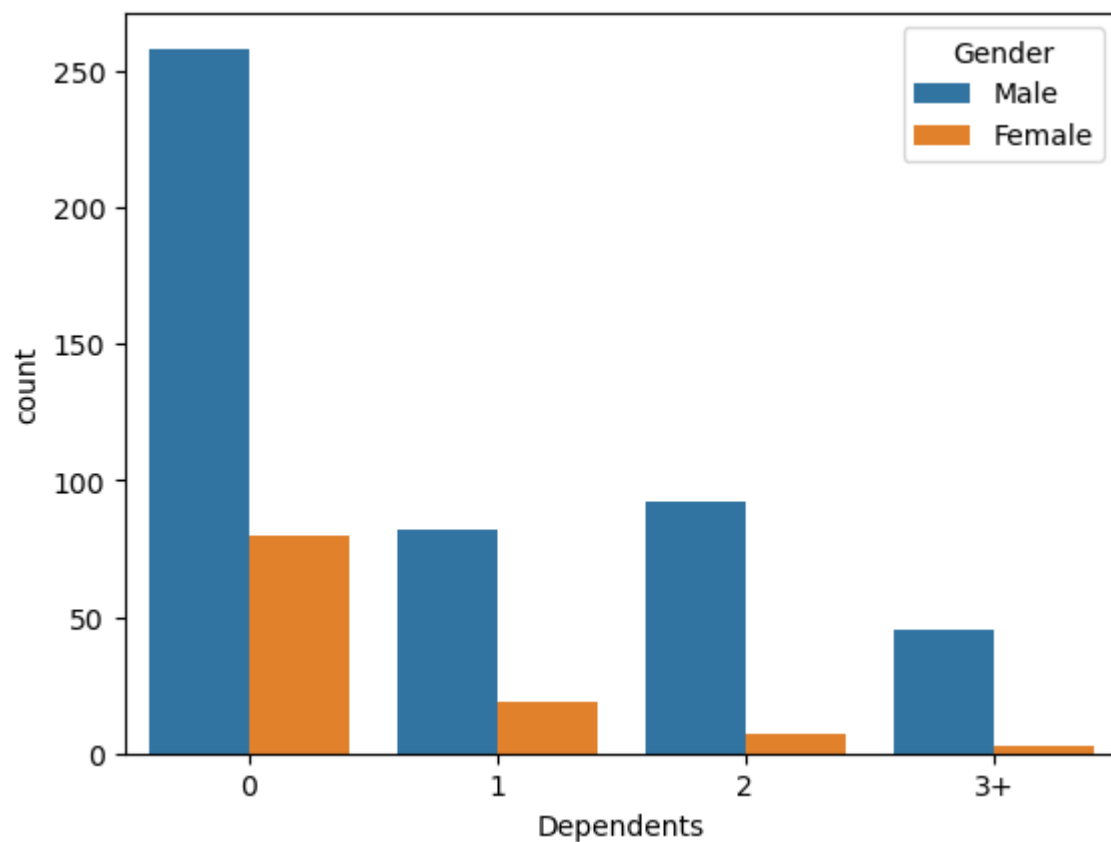


```
In [130]: sns.countplot(df['Dependents'],hue=df['Gender'])
```

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(
```

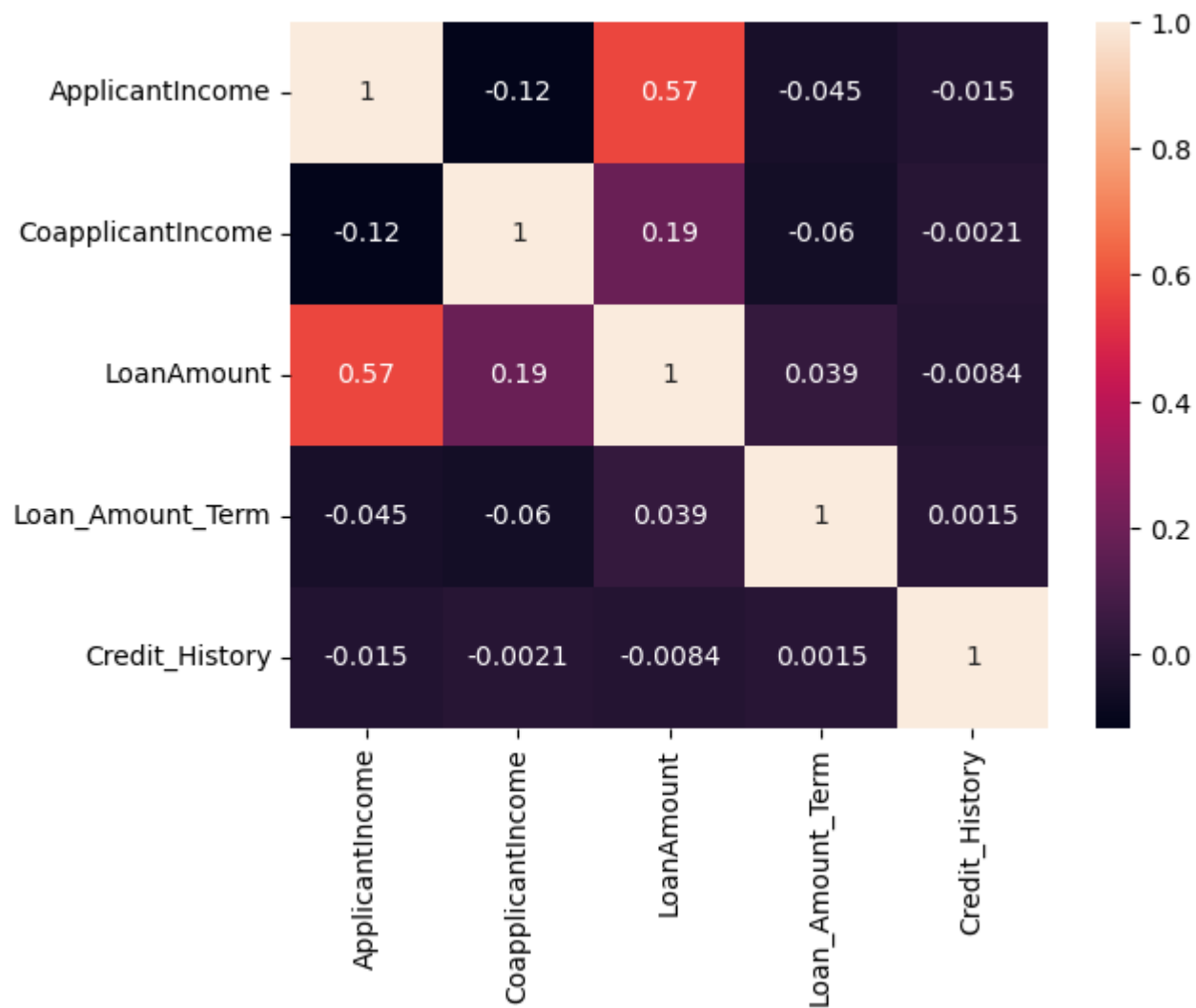
Out[130]:



Multi variate Analysis

In [54]: `sns.heatmap(df.corr(),annot=True)`

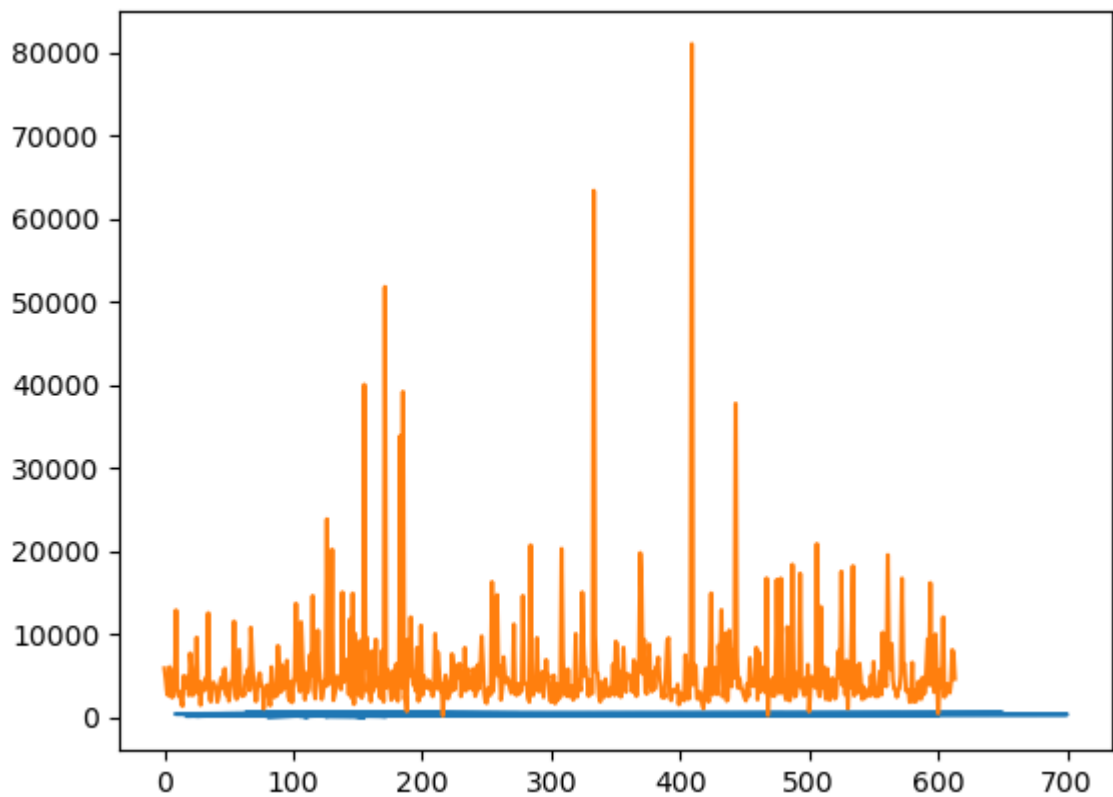
Out[54]:



In [55]: `plt.plot(df.LoanAmount,df.Loan_Amount_Term,df.ApplicantIncome)`

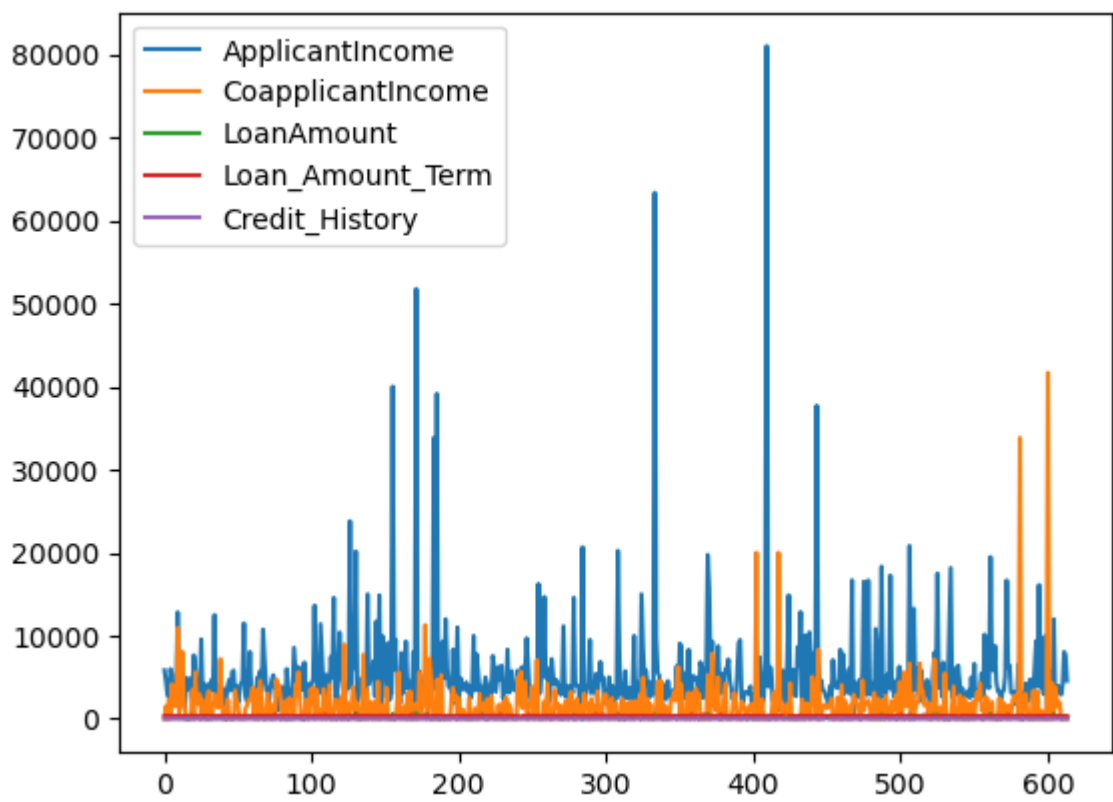
Out[55]:  
[ ,  
 ]





In [56]:  
df.plot.line()

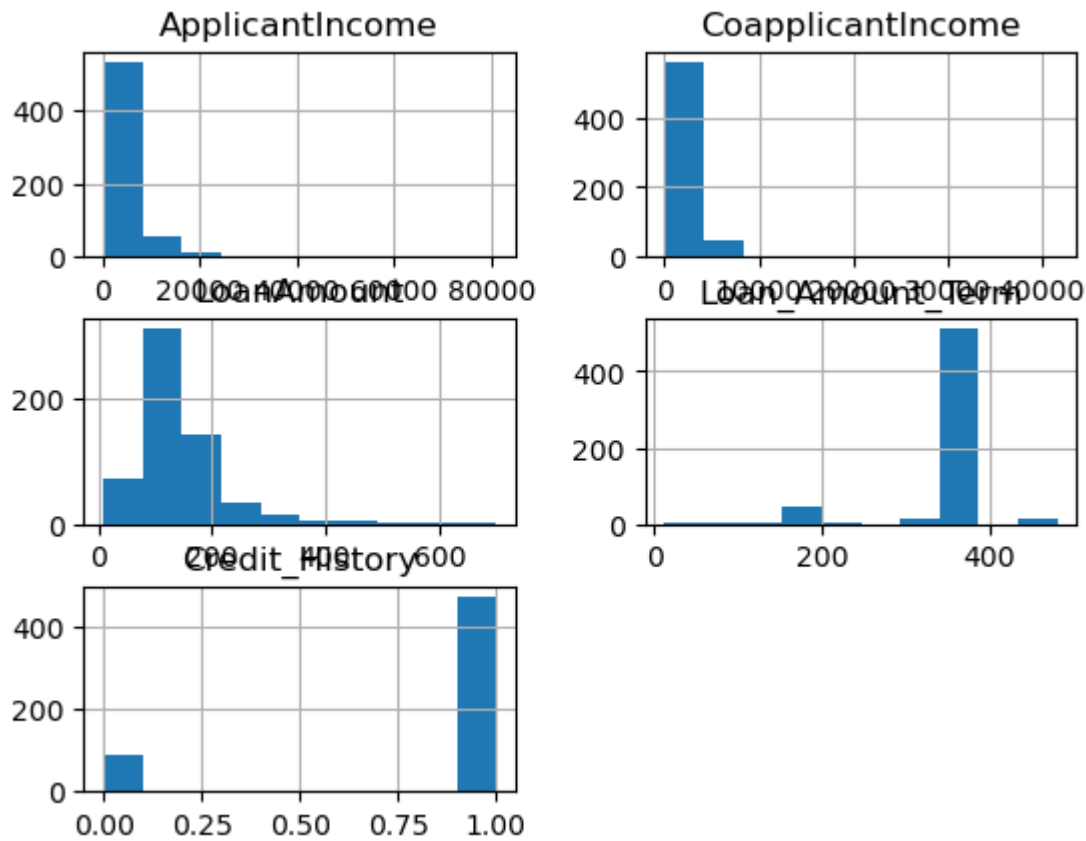
Out[56]:



In [57]:  
df.hist()

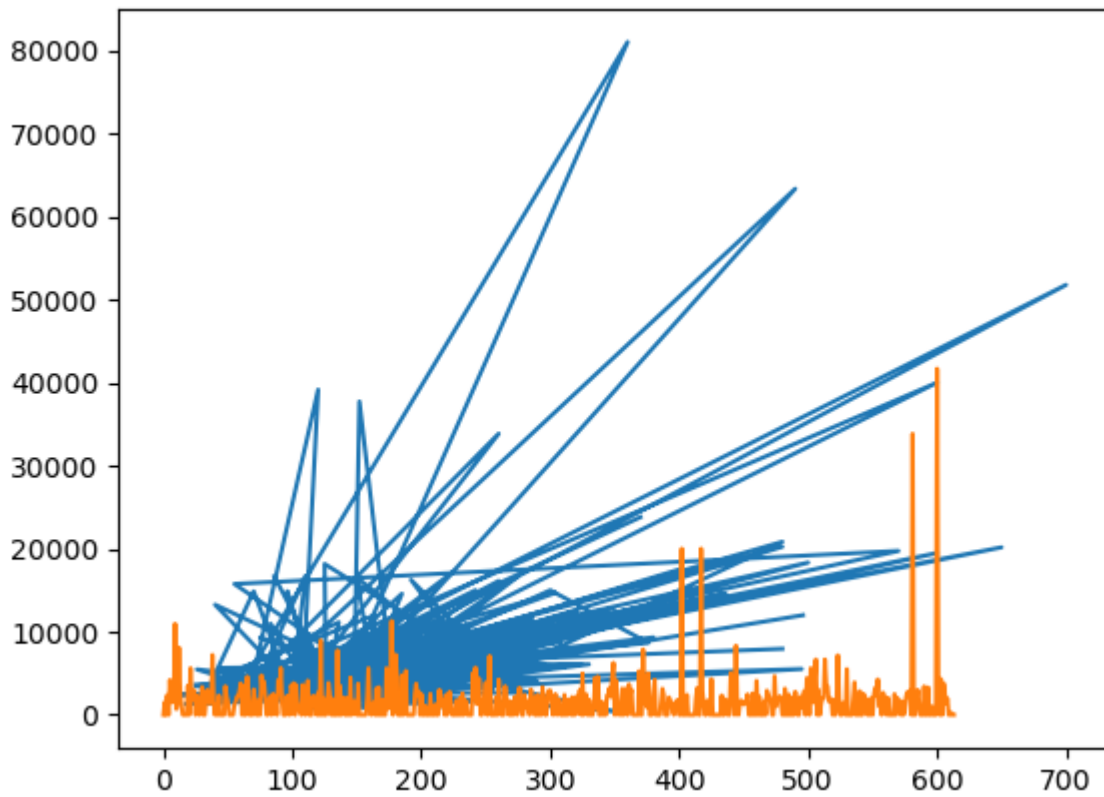
Out[57]:array([[ ,  
 ],

```
[,
 ],
[, ]],
dtype=object)
```



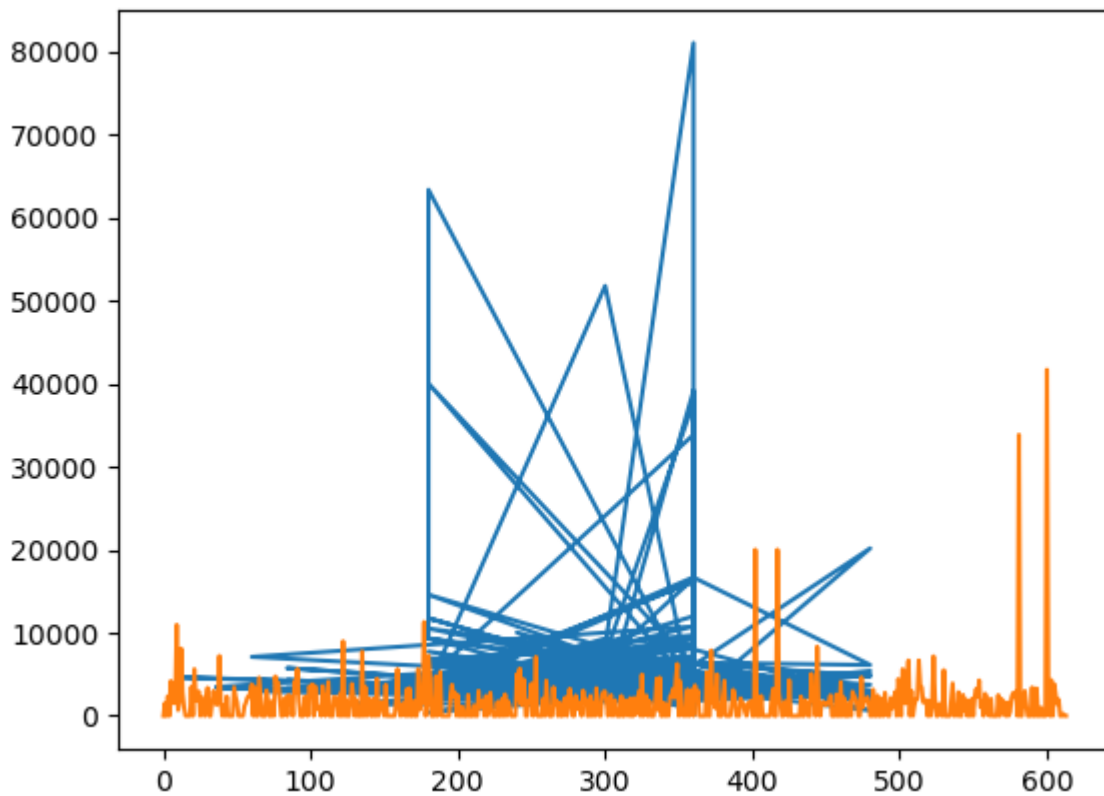
```
In [131]: plt.plot(df.LoanAmount,df.ApplicantIncome,df.CoapplicantIncome)
```

```
Out[131]:[,
 ]
```



In [132]: `plt.plot(df.Loan_Amount_Term,df.ApplicantIncome,df.CoapplicantIncome)`

Out[132]:  
[ ,  
 ]



Descriptive Analysis¶

In [58]: `df.describe()`

```
Out[58]:
```

	ApplicantIncome	CoapplicantIncome	LoanAmount	Loan_Amount_Term	Credit_History
<b>count</b>	614.000000	614.000000	592.000000	600.000000	564.000000
<b>mean</b>	5403.459283	1621.245798	146.412162	342.000000	0.842199
<b>std</b>	6109.041673	2926.248369	85.587325	65.12041	0.364878
<b>min</b>	150.000000	0.000000	9.000000	12.000000	0.000000
<b>25%</b>	2877.500000	0.000000	100.000000	360.000000	1.000000
<b>50%</b>	3812.500000	1188.500000	128.000000	360.000000	1.000000
<b>75%</b>	5795.000000	2297.250000	168.000000	360.000000	1.000000
<b>max</b>	81000.000000	41667.000000	700.000000	480.000000	1.000000

```
In [133]: df.mean()
```

C:\Users\Aishwarya\AppData\Local\Temp\ipykernel\_6568\3698961737.py:1: FutureWarning: Dropping of nuisance columns in DataFrame reductions (with 'numeric\_only=None') is deprecated; in a future version this will raise TypeError. Select only valid columns before calling the reduction.

```
df.mean()
Out[133]: ApplicantIncome    5403.459283
CoapplicantIncome    1621.245798
LoanAmount          146.412162
Loan_Amount_Term     342.000000
Credit_History       0.842199
dtype: float64
```

```
In [134]: df.mode()
```

```
Out...
```

	Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIncome	LoanAmount
<b>0</b>	Male	Yes	0	Graduate	No	2500	0.0	120.0

```
In [135]: df.std()
```

C:\Users\Aishwarya\AppData\Local\Temp\ipykernel\_6568\3390915376.py:1: FutureWarning: Dropping of nuisance columns in DataFrame reductions (with 'numeric\_only=None') is deprecated; in a future version this will raise TypeError. Select only valid columns before calling the reduction.

```
df.std()
Out[135]: ApplicantIncome    6109.041673
CoapplicantIncome    2926.248369
LoanAmount          85.587325
Loan_Amount_Term     65.120410
Credit_History       0.364878
dtype: float64
```

```
In [136]: df.count()
```

```
Out[136]: Gender          601
Married          611
Dependents       599
Education        614
```

```
Self_Employed      582
ApplicantIncome     614
CoapplicantIncome   614
LoanAmount          592
Loan_Amount_Term    600
Credit_History     564
Property_Area       614
Loan_Status         614
dtype: int64
```

Data Pre-Processing

Check for Null Values

```
In [137]: df.isnull().any()
```

```
Out[137]:Gender      True
Married             True
Dependents          True
Education           False
Self_Employed       True
ApplicantIncome     False
CoapplicantIncome   False
LoanAmount          True
Loan_Amount_Term    True
Credit_History      True
Property_Area       False
Loan_Status         False
dtype: bool
```

```
In [138]: df.isnull().sum()
```

```
Out[138]:Gender      13
Married             3
Dependents          15
Education            0
Self_Employed       32
ApplicantIncome      0
CoapplicantIncome    0
LoanAmount           22
Loan_Amount_Term     14
Credit_History       50
Property_Area         0
Loan_Status           0
dtype: int64
```

```
In [139]: df['LoanAmount']=df['LoanAmount'].fillna(df['LoanAmount'].mean())
df['Loan_Amount_Term']=df['Loan_Amount_Term'].fillna(df['Loan_Amount_Term'].mean())
df['Credit_History']=df['Credit_History'].fillna(df['Credit_History'].mean())
```

```
In [140]: df['Gender']=df['Gender'].fillna(df['Gender'].mode()[0])
df['Married']=df['Married'].fillna(df['Married'].mode()[0])
df['Dependents']=df['Dependents'].fillna(df['Dependents'].mode()[0])
df['Self_Employed']=df['Self_Employed'].fillna(df['Self_Employed'].mode()[0])
```

```
In [141]: df.isnull().any()
```

```
Out[141]:Gender      False
Married             False
Dependents          False
```

```
Education          False
Self_Employed      False
ApplicantIncome     False
CoapplicantIncome   False
LoanAmount          False
Loan_Amount_Term    False
Credit_History      False
Property_Area       False
Loan_Status         False
dtype: bool
```

```
In [142]: df.isnull().sum()
```

```
Out[142]: Gender          0
Married          0
Dependents        0
Education         0
Self_Employed     0
ApplicantIncome   0
CoapplicantIncome  0
LoanAmount        0
Loan_Amount_Term  0
Credit_History    0
Property_Area     0
Loan_Status       0
dtype: int64
```

Handling Categorical Values

```
In [143]: df.head()
```

```
Out...   Gender  Married  Dependents  Education  Self_Employed  ApplicantIncome  CoapplicantIncome  LoanAmount
0    Male      No          0  Graduate          No             5849              0.0         146.412162
1    Male      Yes          1  Graduate          No             4583             1508.0        128.000000
2    Male      Yes          0  Graduate          Yes             3000              0.0         66.000000
3    Male      Yes          0    Not Graduate          No             2583             2358.0        120.000000
4    Male      No          0  Graduate          No             6000              0.0        141.000000
```

```
In [144]: le=LabelEncoder()
```

```
In [145]: df.Gender=le.fit_transform(df.Gender)
df.Married=le.fit_transform(df.Married)
df.Education=le.fit_transform(df.Education)
df.Self_Employed=le.fit_transform(df.Self_Employed)
df.Property_Area=le.fit_transform(df.Property_Area)
df.Loan_Status=le.fit_transform(df.Loan_Status)
df.Dependents=le.fit_transform(df.Dependents)
```

```
In [146]: df.head()
```

```
Out...   Gender  Married  Dependents  Education  Self_Employed  ApplicantIncome  CoapplicantIncome  LoanAmount
```

	Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIncome	LoanAmount
0	1	0	0	0	0	5849	0.0	146.412162
1	1	1	1	0	0	4583	1508.0	128.000000
2	1	1	0	0	1	3000	0.0	66.000000
3	1	1	0	1	0	2583	2358.0	120.000000
4	1	0	0	0	0	6000	0.0	141.000000

Splitting into dependent and independent data

In [147]:  
df.head()

Out...	Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIncome	LoanAmount
0	1	0	0	0	0	5849	0.0	146.412162
1	1	1	1	0	0	4583	1508.0	128.000000
2	1	1	0	0	1	3000	0.0	66.000000
3	1	1	0	1	0	2583	2358.0	120.000000
4	1	0	0	0	0	6000	0.0	141.000000

In [148]:  
x=df.iloc[:, :-1]  
y=df.Loan\_Status

In [149]:  
x.head()

Out[...	Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIncome	LoanAmount
0	1	0	0	0	0	5849	0.0	146.412162
1	1	1	1	0	0	4583	1508.0	128.000000
2	1	1	0	0	1	3000	0.0	66.000000
3	1	1	0	1	0	2583	2358.0	120.000000
4	1	0	0	0	0	6000	0.0	141.000000

In [150]:  
y.head()

Out[150]:  
0 1  
1 0  
2 1  
3 1  
4 1  
Name: Loan\_Status, dtype: int32

Scaling The Data

In [151]:  
x\_scale=pd.DataFrame(scale(x),columns=x.columns)

```
x_scale.head()
```

```
Out[...   Gender  Married  Dependents  Education  Self_Employed  ApplicantIncome  CoapplicantIncome  LoanAmount
```

0	0.472343	-1.372089	-0.737806	-0.528362	-0.392601	0.072991	-0.554487	0.000000
1	0.472343	0.728816	0.253470	-0.528362	-0.392601	-0.134412	-0.038732	-0.219270
2	0.472343	0.728816	-0.737806	-0.528362	2.547117	-0.393747	-0.554487	-0.957640
3	0.472343	0.728816	-0.737806	1.892641	-0.392601	-0.462062	0.251980	-0.314540
4	0.472343	-1.372089	-0.737806	-0.528362	-0.392601	0.097728	-0.554487	-0.064450

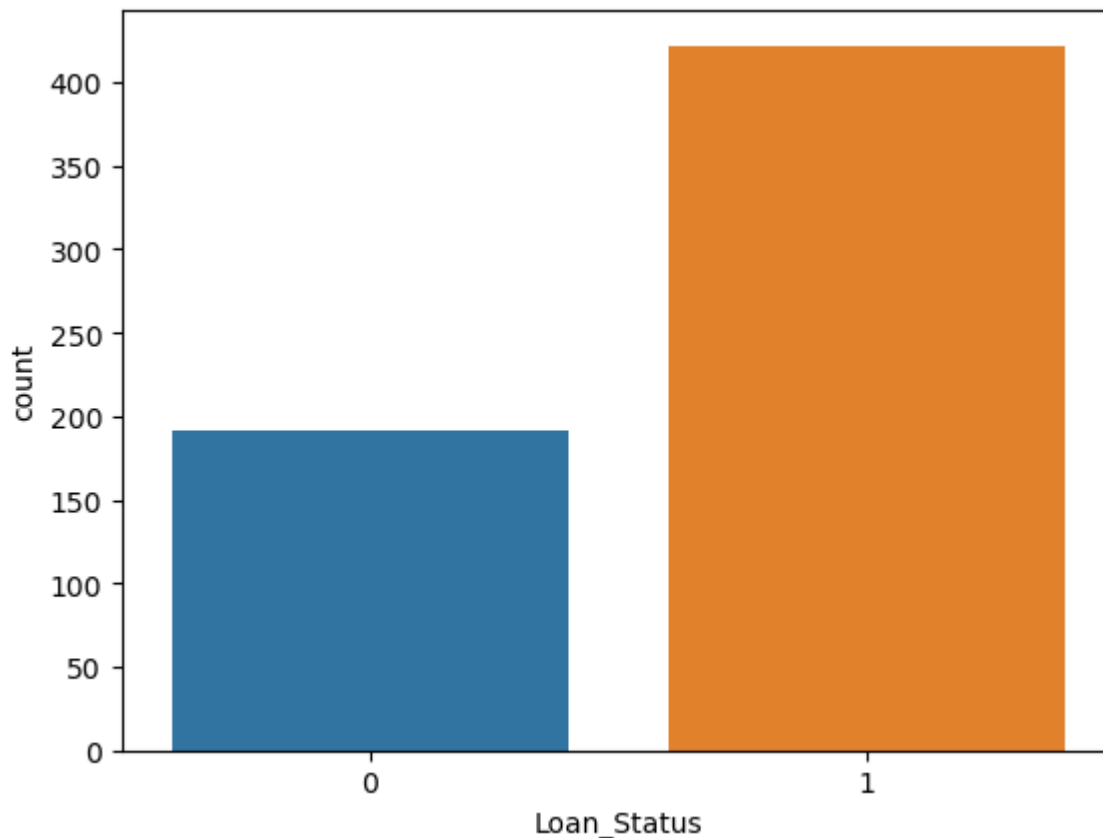
Balancing The Dataset

```
In [163]: sns.countplot(df.Loan_Status)
```

C:\ProgramData\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.

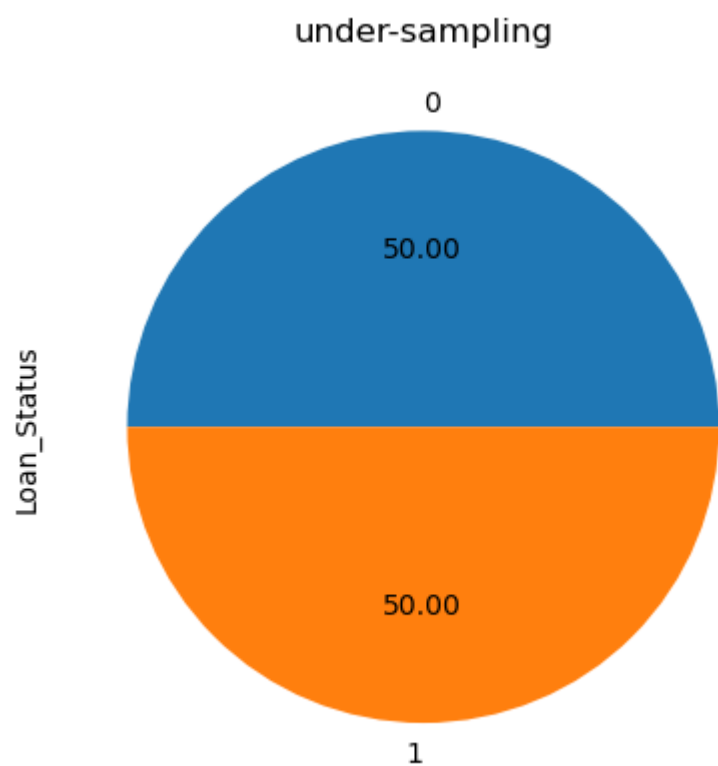
```
warnings.warn(
```

```
Out[163]:
```



```
In [164]: rus=RandomUnderSampler(sampling_strategy=1)
x_res,y_res=rus.fit_resample(x,y)
ax=y_res.value_counts().plot.pie(autopct='%.2f')
_=ax.set_title("under-sampling")
```





Splitting Data Into Train and Test

```
In [165]: xtrain,xtest,ytrain,ytest=train_test_split(x,y,test_size=0.3,random_state=10)
```

```
In [166]: xtrain.head()
```

```
Out[...]
```

	Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIncome	LoanAmount
245	1	0	0	0	1	6050	4333.0	120
413	1	1	0	1	0	2253	2033.0	110
126	1	1	3	0	0	23803	0.0	370
531	1	1	3	0	0	4281	0.0	100
188	1	1	0	0	1	674	5296.0	168

```
In [167]: xtest.head()
```

```
Out[...]
```

	Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIncome	LoanAmount
285	1	0	0	0	0	3158	3053.0	89
323	0	0	0	0	0	3166	2985.0	132
482	1	1	0	0	0	2083	3150.0	128
173	1	1	0	0	0	5708	5625.0	187
518	1	0	0	0	0	4683	1915.0	185

```
In [168]: ytrain.head()
```

```
Out[168]:245    0
         413    1
         126    1
         531    1
         188    1
         Name: Loan_Status, dtype: int32
```

```
In [169]: ytest.head()
```

```
Out[169]:285    1
         323    1
         482    1
         173    1
         518    0
         Name: Loan_Status, dtype: int32
```

```
In [170]: xtrain.shape
```

```
Out[170]:(429, 11)
```

```
In [171]: xtest.shape
```

```
Out[171]:(185, 11)
```

```
In [172]: ytrain.shape
```

```
Out[172]:(429,)
```

```
In [173]: ytest.shape
```

```
Out[173]:(185,)
```

Model Building

Decision Tree Model

```
In [174]: dmodel=DecisionTreeClassifier(random_state=100)
```

```
In [175]: dmodel.fit(x_res,y_res)
```

```
Out[175]:DecisionTreeClassifier(random_state=100)
```

**In a Jupyter environment, please rerun this cell to show the HTML representation or trust the notebook.**

**On GitHub, the HTML representation is unable to render, please try loading this page with nbviewer.org.**

```
In [176]: ypred=dmodel.predict(xtest)
```

```
In [177]: ypred2d=dmodel.predict(xtrain)
```

Random Forest Model

```
In [212]: Rmodel=RandomForestClassifier(n_estimators=100)
```

```
In [213]: Rmodel.fit(x_res,y_res)
```

Out[21]...RandomForestClassifier()

**In a Jupyter environment, please rerun this cell to show the HTML representation or trust the notebook.**

**On GitHub, the HTML representation is unable to render, please try loading this page with nbviewer.org.**

In [214]:  
ypredR=Rmodel.predict(xtest)

In [215]:  
ypred2R=Rmodel.predict(xtrain)

KNN Model

In [182]:  
kmodel=KNeighborsClassifier()

In [183]:  
kmodel.fit(x\_res,y\_res)

Out[18]...KNeighborsClassifier()

**In a Jupyter environment, please rerun this cell to show the HTML representation or trust the notebook.**

**On GitHub, the HTML representation is unable to render, please try loading this page with nbviewer.org.**

In [184]:  
ypredk=kmodel.predict(xtest)

In [185]:  
ypred2k=kmodel.predict(xtrain)

Xgboost Model

In [186]:  
xmodel=XGBClassifier(eval\_metric='mlogloss',n\_estimators=100,random\_state=100)

In [187]:  
xmodel.fit(x\_res,y\_res)

Out[18]...XGBClassifier(base\_score=0.5, booster='gbtree', callbacks=None,  
colsample\_bylevel=1, colsample\_bynode=1, colsample\_bytree=1,  
early\_stopping\_rounds=None, enable\_categorical=False,  
eval\_metric='mlogloss', gamma=0, gpu\_id=-1,  
grow\_policy='depthwise', importance\_type=None,  
interaction\_constraints='', learning\_rate=0.300000012,  
max\_bin=256, max\_cat\_to\_onehot=4, max\_delta\_step=0, max\_depth=6,  
max\_leaves=0, min\_child\_weight=1, missing=nan,  
monotone\_constraints='()', n\_estimators=100, n\_jobs=0,  
num\_parallel\_tree=1, predictor='auto', random\_state=100,  
reg\_alpha=0, reg\_lambda=1, ...)

**In a Jupyter environment, please rerun this cell to show the HTML representation or trust the notebook.**

**On GitHub, the HTML representation is unable to render, please try loading this page with nbviewer.org.**

In [188]:  
ypredx=xmodel.predict(xtest)

In [189]:  
ypred2x=xmodel.predict(xtrain)

Compare The Model

```
In [190]: print("Decision Tree Model Testing Accuracy")
          print(accuracy_score(ytest,ypredd))
          print("Decision Tree Model Training Accuracy")
          print(accuracy_score(ytrain,ypred2d))
```

Decision Tree Model Testing Accuracy  
0.8594594594594595  
Decision Tree Model Training Accuracy  
0.8741258741258742

```
In [216]: print("Random Forest Model Testing Accuracy")
          print(accuracy_score(ytest,ypredR))
          print("Random Forest Model Training Accuracy")
          print(accuracy_score(ytrain,ypred2R))
```

Random Forest Model Testing Accuracy  
0.9243243243243243  
Random Forest Model Training Accuracy  
0.9300699300699301

```
In [192]: print("KNN Model Testing Accuracy")
          print(accuracy_score(ytest,ypredk))
          print("KNN Model Training Accuracy")
          print(accuracy_score(ytrain,ypred2k))
```

KNN Model Testing Accuracy  
0.6054054054054054  
KNN Model Training Accuracy  
0.6503496503496503

```
In [218]: print("Xgboost Model Testing Accuracy")
          print(accuracy_score(ytest,ypredx))
          print("Xgboost Model Training Accuracy")
          print(accuracy_score(ytrain,ypred2x))
```

Xgboost Model Testing Accuracy  
0.9135135135135135  
Xgboost Model Training Accuracy  
0.9020979020979021

In []: