

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
%matplotlib inline
```

```
dataset = pd.read_csv("loantrain.csv")
```

```
dataset.head()
```

	Loan_ID	Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIncome
0	LP001002	Male	No	0	Graduate	No	5849	
1	LP001003	Male	Yes	1	Graduate	No	4583	19
2	LP001005	Male	Yes	0	Graduate	Yes	3000	
3	LP001006	Male	Yes	0	Not Graduate	No	2583	23
4	LP001008	Male	No	0	Graduate	No	6000	

```
dataset.shape
```

```
(614, 13)
```

```
dataset.info
```

	Loan_ID	Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIncome	LoanAmount	Loan_Amount_Term	Credit_History	Property_Area	Loan_Status
0	LP001002	Male	No	0	Graduate	No	5849	0.0	NaN	360.0			
1	LP001003	Male	Yes	1	Graduate	No	4583	1508.0	128.0	360.0			
2	LP001005	Male	Yes	0	Graduate	Yes	3000	0.0	66.0	360.0			
3	LP001006	Male	Yes	0	Not Graduate	No	2583	2358.0	120.0	360.0			
4	LP001008	Male	No	0	Graduate	No	6000	0.0	141.0	360.0			
..	...	...	...	...	...	...	...	...	...	...	...	...	...
609	LP002978	Female	No	0	Graduate	No	2900	0.0	71.0	360.0			
610	LP002979	Male	Yes	3+	Graduate	No	4106	0.0	40.0	180.0			
611	LP002983	Male	Yes	1	Graduate	No	8072	240.0	253.0	360.0			
612	LP002984	Male	Yes	2	Graduate	No	7583	0.0	187.0	360.0			
613	LP002990	Female	No	0	Graduate	Yes	4583	0.0	133.0	360.0			

```
612      1.0      Urban      Y
613      0.0  Semiurban      N
```

[614 rows x 13 columns]>

dataset.describe()

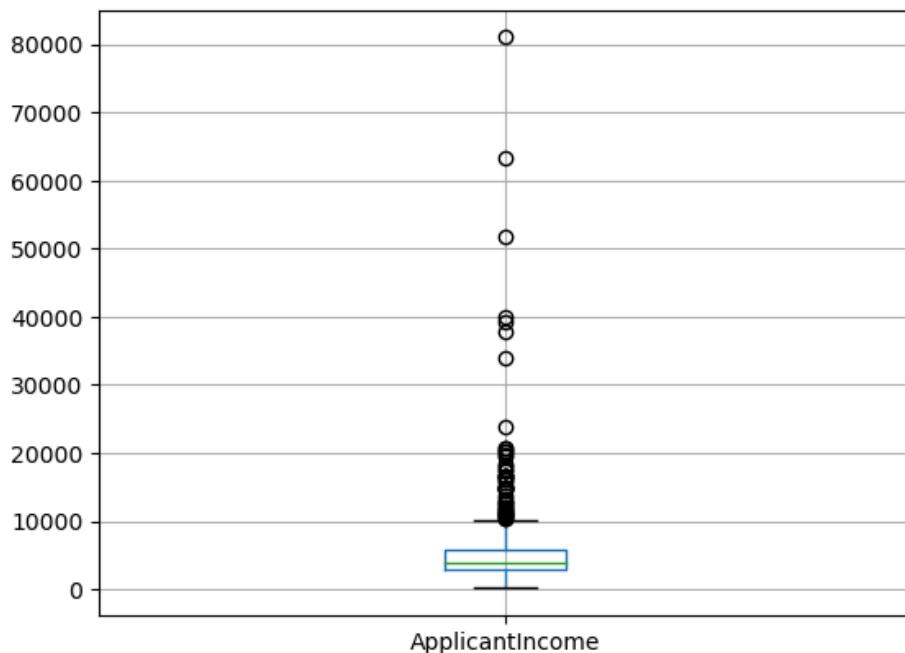
	ApplicantIncome	CoapplicantIncome	LoanAmount	Loan_Amount_Term	Credit_History
<b>count</b>	614.000000	614.000000	592.000000	600.000000	564.000000
<b>mean</b>	5403.459283	1621.245798	146.412162	342.000000	0.842199
<b>std</b>	6109.041673	2926.248369	85.587325	65.12041	0.364878
<b>min</b>	150.000000	0.000000	9.000000	12.00000	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

pd.crosstab(dataset['Credit\_History'], dataset['Loan\_Status'], margins=True)

Loan_Status	N	Y	All
Credit_History			
<b>0.0</b>	82	7	89
<b>1.0</b>	97	378	475
<b>All</b>	179	385	564

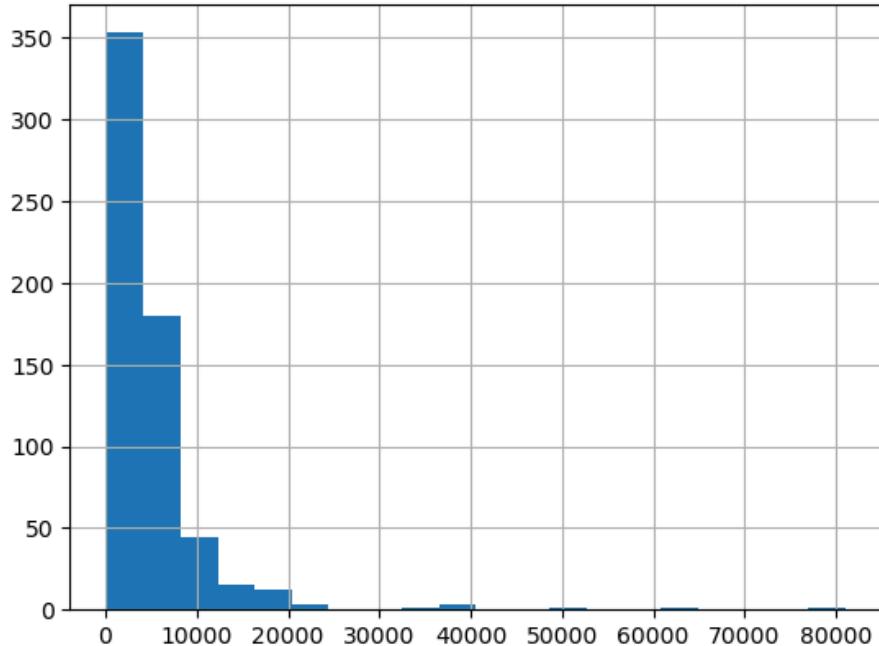
dataset.boxplot(column='ApplicantIncome')

<Axes: >



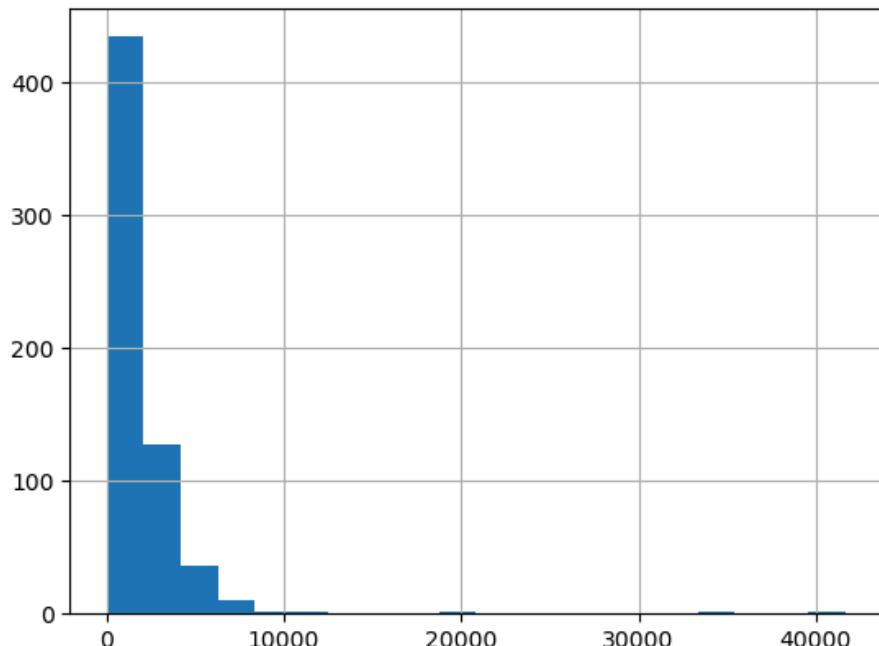
dataset['ApplicantIncome'].hist(bins=20)

&lt;Axes: &gt;



```
dataset['CoapplicantIncome'].hist(bins=20)
```

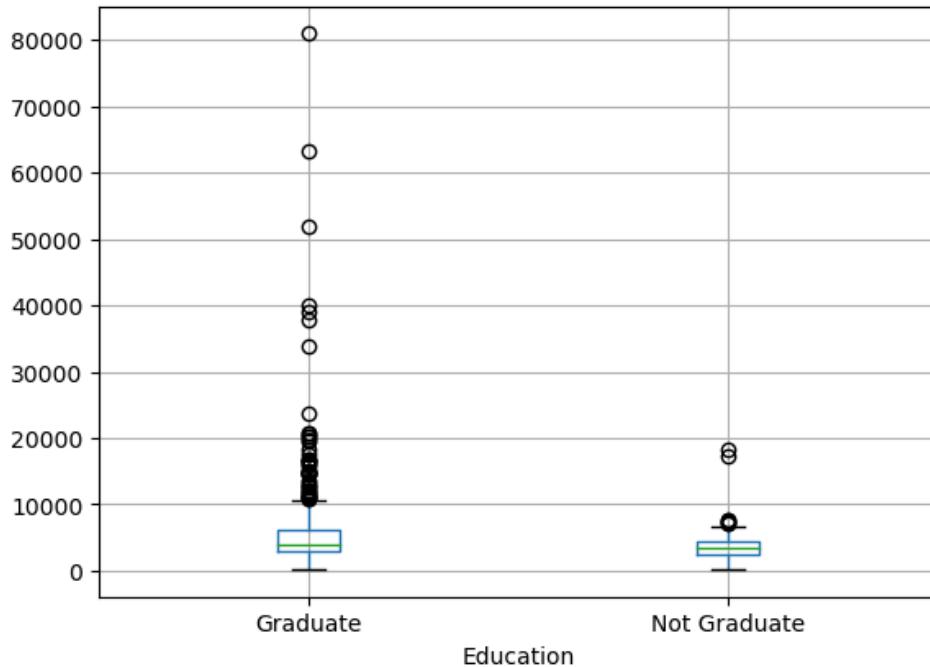
&lt;Axes: &gt;



```
dataset.boxplot(column='ApplicantIncome', by= 'Education')
```

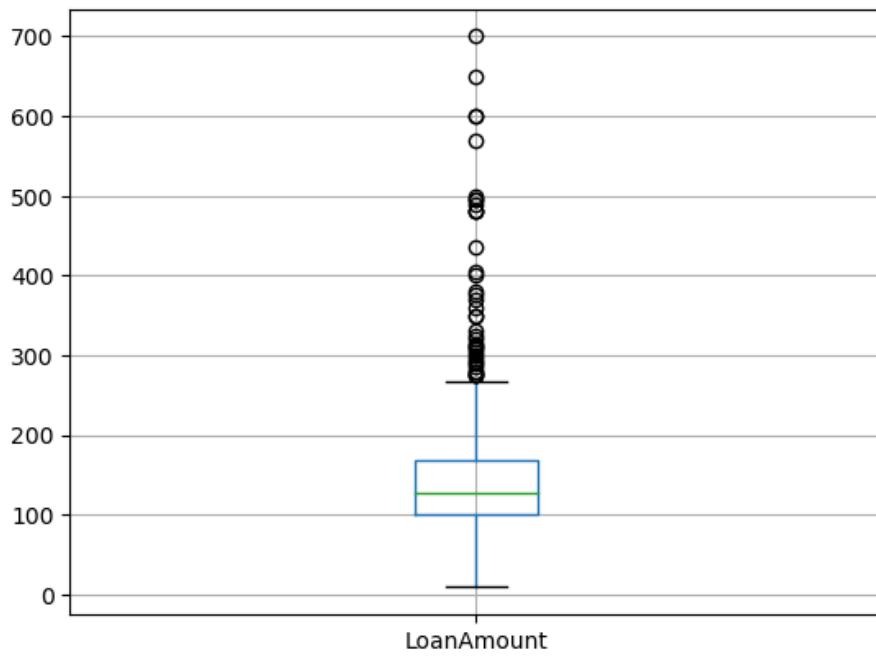
```
<Axes: title={'center': 'ApplicantIncome'}, xlabel='Education'>
```

Boxplot grouped by Education  
ApplicantIncome



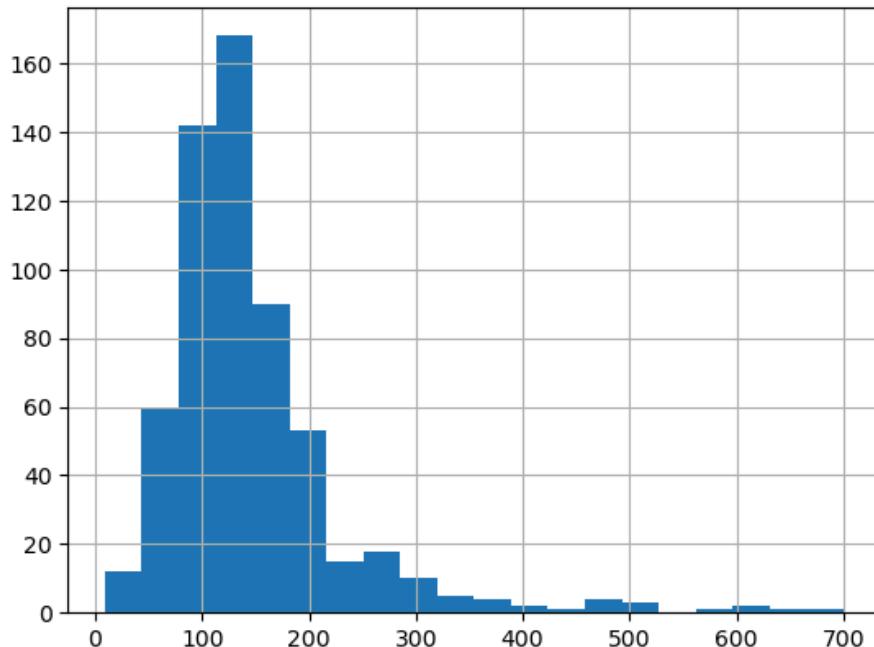
```
dataset.boxplot(column = 'LoanAmount')
```

```
<Axes: >
```



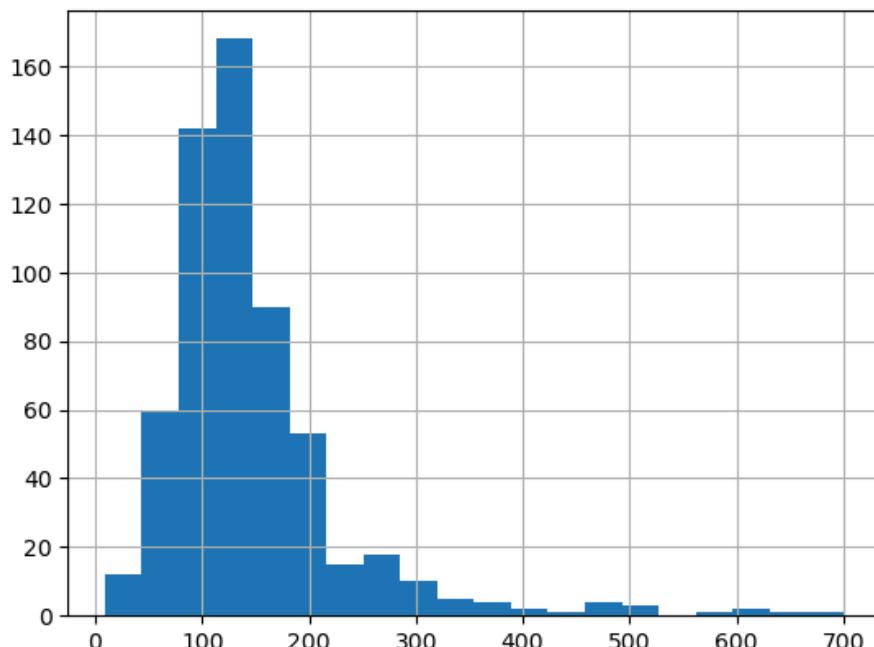
```
dataset[ 'LoanAmount' ].hist(bins=20)
```

&lt;Axes: &gt;



```
dataset['LoanAmount_log']=np.log(dataset['LoanAmount'])  
dataset['LoanAmount'].hist(bins=20)
```

&lt;Axes: &gt;



```
dataset.isnull().sum()
```

Loan_ID	0
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

```
LoanAmount_log      22  
dtype: int64
```

```
dataset['Gender'].fillna(dataset['Gender'].mode()[0], inplace=True)
```

```
dataset['Married'].fillna(dataset['Married'].mode()[0], inplace=True)
```

```
dataset['Dependents'].fillna(dataset['Dependents'].mode()[0], inplace=True)
```

```
dataset['Self_Employed'].fillna(dataset['Self_Employed'].mode()[0], inplace=True)
```

```
dataset.LoanAmount = dataset.LoanAmount.fillna(dataset.LoanAmount.mean())  
dataset.LoanAmount_log = dataset.LoanAmount_log.fillna(dataset.LoanAmount_log.mean())
```

```
dataset['Loan_Amount_Term'].fillna(dataset['Loan_Amount_Term'].mode()[0], inplace=True)
```

```
dataset['Credit_History'].fillna(dataset['Credit_History'].mode()[0], inplace=True)
```

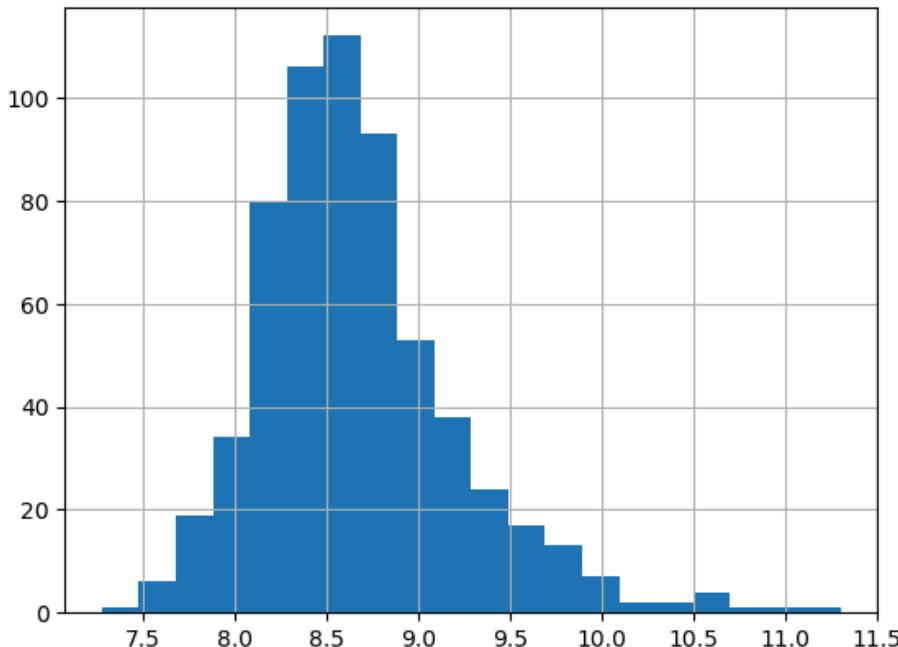
```
dataset.isnull().sum()
```

```
Loan_ID          0  
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  
LoanAmount_log    0  
dtype: int64
```

```
dataset['TotalIncome']=dataset['ApplicantIncome'] + dataset['CoapplicantIncome']  
dataset['TotalIncome_log']=np.log(dataset['TotalIncome'])
```

```
dataset['TotalIncome_log'].hist(bins=20)
```

&lt;Axes: &gt;



dataset.head()

	Loan_ID	Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIn
0	LP001002	Male	No	0	Graduate	No	5849	
1	LP001003	Male	Yes	1	Graduate	No	4583	19
2	LP001005	Male	Yes	0	Graduate	Yes	3000	
3	LP001006	Male	Yes	0	Not Graduate	No	2583	23
4	LP001008	Male	No	0	Graduate	No	6000	

```
x = dataset.iloc[:,np.r_[1:5,9:11,13:15]].values
y = dataset.iloc[:,12].values
```

x

```
array([['Male', 'No', '0', ..., 1.0, 4.857444178729352, 5849.0],
       ['Male', 'Yes', '1', ..., 1.0, 4.852030263919617, 6091.0],
       ['Male', 'Yes', '0', ..., 1.0, 4.189654742026425, 3000.0],
       ...,
       ['Male', 'Yes', '1', ..., 1.0, 5.53338948872752, 8312.0],
       ['Male', 'Yes', '2', ..., 1.0, 5.231108616854587, 7583.0],
       ['Female', 'No', '0', ..., 0.0, 4.890349128221754, 4583.0]],  
dtype=object)
```

y

```
array(['Y', 'N', 'Y', 'Y', 'Y', 'Y', 'Y', 'N', 'Y', 'N', 'Y', 'Y', 'Y',
       'N', 'Y', 'Y', 'Y', 'N', 'N', 'Y', 'N', 'Y', 'N', 'N', 'N', 'Y',
       'Y', 'Y', 'N', 'Y', 'N', 'N', 'Y', 'Y', 'N', 'Y', 'N', 'Y', 'Y',
       'Y', 'N', 'Y', 'Y', 'Y', 'Y', 'Y', 'Y', 'Y', 'N', 'Y', 'Y', 'Y', 'Y',
       'N', 'N', 'Y', 'Y', 'Y', 'Y', 'Y', 'Y', 'Y', 'N', 'Y', 'N', 'N', 'N',
       'N', 'N', 'Y', 'Y', 'Y', 'Y', 'Y', 'Y', 'N', 'Y', 'N', 'N', 'N', 'N',
       'N', 'Y', 'Y', 'Y', 'Y', 'N', 'N', 'Y', 'Y', 'Y', 'Y', 'Y', 'Y', 'Y', 'Y',
       'Y', 'Y', 'Y', 'N', 'Y', 'Y',
       'Y', 'Y', 'Y', 'Y', 'Y', 'Y', 'Y', 'Y', 'Y', 'N', 'Y', 'Y', 'Y', 'Y', 'Y',
       'Y', 'N', 'Y', 'N', 'N', 'N'])
```

```
from sklearn.model_selection import train_test_split

x_loantrain, x_loantest, y_loantrain, y_loantest = train_test_split(x, y, test_size=0.2, random_:
```

```
print(x_loantrain)

[['Male' 'Yes' '0' ... 1.0 4.875197323201151 5858.0]
 ['Male' 'No' '1' ... 1.0 5.278114659230517 11250.0]
 ['Male' 'Yes' '0' ... 0.0 5.003946305945459 5681.0]
 ...
 ['Male' 'Yes' '3+' ... 1.0 5.298317366548036 8334.0]
 ['Male' 'Yes' '0' ... 1.0 5.075173815233827 6033.0]
 ['Female' 'Yes' '0' ... 1.0 5.204006687076795 6486.0]]
```

```
from sklearn.preprocessing import LabelEncoder  
labelencoder_x = LabelEncoder()
```

```
for i in range(0,5):
    x_loantrain[:,i]=labelencoder_x.fit_transform(x_loantrain[:,i])
```

```
x_loantrain[:,7]=labelencoder_x.fit_transform(x_loantrain[:,7])
```

x loantrain

```
array([[1, 1, 0, ..., 1.0, 4.875197323201151, 267],  
       [1, 0, 1, ..., 1.0, 5.278114659230517, 407],  
       [1, 1, 0, ..., 0.0, 5.003946305945459, 249],
```

```
[...,
[1, 1, 3, ..., 1.0, 5.298317366548036, 363],
[1, 1, 0, ..., 1.0, 5.075173815233827, 273],
[0, 1, 0, ..., 1.0, 5.204006687076795, 301]], dtype=object)
```

```
labelencoder_y = LabelEncoder()  
y_loantest = labelencoder_y.fit_transform(y_loantest)
```

y\_loantrain

```
for i in range(0,5):
    x_loantest[:,i]=labelencoder_x.fit_transform(x_loantest[:,i])
```

```
x_loantest[:,7]=labelencoder_x.fit_transform(x_loantest[:,7])
```

```
labelencoder_y = LabelEncoder()
y_loantest = labelencoder_y.fit_transform(y_loantest)
```

x loantest

```
array([[1, 0, 0, 0, 5, 1.0, 4.430816798843313, 85],  
       [0, 0, 0, 0, 5, 1.0, 4.718498871295094, 28],  
       [1, 1, 0, 0, 5, 1.0, 5.780743515792329, 104],  
       [1, 1, 0, 0, 5, 1.0, 4.700480365792417, 80],  
       [1, 1, 2, 0, 5, 1.0, 4.574710978503383, 22],  
       [1, 1, 0, 1, 3, 0.0, 5.10594547390058, 70],  
       [1, 1, 3, 0, 3, 1.0, 5.056245805348308, 77],  
       [1, 0, 0, 0, 5, 1.0, 6.003887067106539, 114],  
       [1, 0, 0, 0, 5, 0.0, 4.820281565605037, 53],  
       [1, 1, 0, 0, 5, 1.0, 4.852030263919617, 55],  
       [0, 0, 0, 0, 5, 1.0, 4.430816798843313, 4],  
       [1, 1, 1, 0, 5, 1.0, 4.553876891600541, 2],  
       [0, 0, 0, 0, 5, 1.0, 5.634789603169249, 96],  
       [1, 1, 2, 0, 5, 1.0, 5.4638318050256105, 97],  
       [1, 1, 0, 0, 5, 1.0, 4.564348191467836, 117],  
       [1, 1, 1, 0, 5, 1.0, 4.204692619390966, 22],  
       [1, 0, 1, 1, 5, 1.0, 5.247024072160486, 32],  
       [1, 0, 0, 1, 5, 1.0, 4.882801922586371, 25],  
       [0, 0, 0, 0, 5, 1.0, 4.532599493153256, 1],  
       [1, 1, 0, 1, 5, 0.0, 5.198497031265826, 44],  
       [0, 1, 0, 0, 5, 0.0, 4.787491742782046, 71],  
       [1, 1, 0, 0, 5, 1.0, 4.962844630259907, 43],  
       [1, 1, 2, 0, 5, 1.0, 4.68213122712422, 91],  
       [1, 1, 2, 0, 5, 1.0, 5.10594547390058, 111],
```

```
[1, 1, 0, 0, 5, 1.0, 4.060443010546419, 35],  
[1, 1, 1, 0, 5, 1.0, 5.521460917862246, 94],  
[1, 0, 0, 0, 5, 1.0, 5.231108616854587, 98],  
[1, 1, 0, 0, 5, 1.0, 5.231108616854587, 110],  
[1, 1, 3, 0, 5, 0.0, 4.852030263919617, 41],  
[0, 0, 0, 0, 5, 0.0, 4.634728988229636, 50],  
[1, 1, 0, 0, 5, 1.0, 5.429345628954441, 99],  
[1, 0, 0, 1, 5, 1.0, 3.871201010907891, 46],  
[1, 1, 1, 1, 5, 1.0, 4.499809670330265, 52],  
[1, 1, 0, 0, 5, 1.0, 5.19295685089021, 102],  
[1, 1, 0, 0, 5, 1.0, 4.857444178729352, 95],  
[0, 1, 0, 1, 5, 0.0, 5.181783550292085, 57],  
[1, 1, 0, 0, 5, 1.0, 5.147494476813453, 65],  
[1, 0, 0, 1, 5, 1.0, 4.836281906951478, 39],  
[1, 1, 0, 0, 5, 1.0, 4.852030263919617, 75],  
[1, 1, 2, 1, 5, 1.0, 4.68213122712422, 24],  
[0, 0, 0, 0, 5, 1.0, 4.382026634673881, 9],  
[1, 1, 3, 0, 5, 0.0, 4.812184355372417, 68],  
[1, 1, 2, 0, 2, 1.0, 2.833213344056216, 0],  
[1, 1, 1, 1, 5, 1.0, 5.062595033026967, 67],  
[1, 0, 0, 0, 5, 1.0, 4.330733340286331, 21],  
[1, 0, 0, 0, 5, 1.0, 5.231108616854587, 113],  
[1, 1, 1, 0, 5, 1.0, 4.7535901911063645, 18],  
[0, 0, 0, 0, 5, 1.0, 4.74493212836325, 37],  
[1, 1, 1, 0, 5, 1.0, 4.852030263919617, 72],  
[1, 0, 0, 0, 5, 1.0, 4.941642422609304, 78],  
[1, 1, 3, 1, 5, 1.0, 4.30406509320417, 8],  
[1, 1, 0, 0, 5, 1.0, 4.867534450455582, 84],  
[1, 1, 0, 1, 5, 1.0, 4.672828834461906, 31],  
[1, 0, 0, 0, 5, 1.0, 4.857444178729352, 61],  
[1, 1, 0, 0, 5, 1.0, 4.718498871295094, 19],  
[1, 1, 0, 0, 5, 1.0, 5.556828061699537, 107],  
[1, 1, 0, 0, 5, 1.0, 4.553876891600541, 34],  
[1, 0, 0, 1, 5, 1.0, 4.890349128221754, 74],
```

y loantest

```
from sklearn.preprocessing import StandardScaler  
ss = StandardScaler()  
x_loantrain = ss.fit_transform(x_loantrain)  
x_loantest = ss.fit_transform(x_loantest)
```

```
from sklearn.tree import DecisionTreeClassifier  
DTClassifier = DecisionTreeClassifier(criterion = 'entropy', random_state = 0)  
DTClassifier.fit(x_loantrain, y_loantrain)
```

```
DecisionTreeClassifier  
DecisionTreeClassifier(criterion='entropy', random_state=0)
```

```
y_pred = DTClassifier.predict(x_loantest)  
y_pred
```

```
array([0, 1, 0, 1, 1, 0, 0, 0, 1, 1, 0, 0, 1, 1, 1, 1, 0, 1, 1, 0, 0, 1,
       1, 1, 1, 1, 0, 0, 0, 1, 0, 1, 1, 0, 1, 1, 0, 1, 1, 0, 0, 1, 1, 0, 0, 1,
       1, 1, 1, 0, 0, 0, 1, 1, 1, 1, 1, 0, 0, 0, 1, 1, 0, 0, 1, 1, 0, 0, 1, 0, 1,
       1, 1, 1, 1, 1, 1, 0, 1, 1, 1, 1, 0, 1, 0, 1, 1, 1, 0, 1, 1, 1, 1, 0, 1, 1, 1,
       1, 0, 0, 1, 0, 0, 1, 0, 1, 1, 0, 1, 0, 1, 1, 0, 1, 1, 1, 0, 1, 1, 1, 0, 1, 1, 1,
       1, 0, 1, 1, 0, 0, 1, 1, 0, 1, 0, 0, 1, 1, 1, 0, 1, 1, 1, 0, 1, 1, 1, 0, 1, 1, 1])
```

```
from sklearn import metrics  
print('The accuracy of decision tree is: ', metrics.accuracy_score(y_pred,y_loantest))
```

The accuracy of decision tree is: 0.7073170731707317

```
from sklearn.naive_bayes import GaussianNB  
NBClassifier = GaussianNB()  
NBClassifier.fit(x_loantrain,y_loantrain)
```

### ▼ GaussianNB

```
y_pred = NBClassifier.predict(x_loantest)
```

y pred

```
print('The accuracy of Naive Bayes is: ',metrics.accuracy_score(y_pred,y_loantest))
```

The accuracy of Naive Bayes is: 0.8292682926829268

```
testdata = pd.read_csv("loantest.csv")
```

```
testdata.head()
```

Unnamed: 0		Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIncome
0	LP001015	Male	Yes	0	Graduate	No	5720	
1	LP001022	Male	Yes	1	Graduate	No	3076	
2	LP001031	Male	Yes	2	Graduate	No	5000	
3	LP001035	Male	Yes	2	Graduate	No	2340	
4	LP001051	Male	No	0	Not Graduate	No	3276	

testdata.info()

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 367 entries, 0 to 366
Data columns (total 12 columns):
 #   Column           Non-Null Count  Dtype  
 ---  -- 
 0   Unnamed: 0        367 non-null    object 
 1   Gender            356 non-null    object 
 2   Married           367 non-null    object 
 3   Dependents        357 non-null    object 
 4   Education         367 non-null    object 
 5   Self_Employed     344 non-null    object 
 6   ApplicantIncome   367 non-null    int64  
 7   CoapplicantIncome 367 non-null    int64  
 8   LoanAmount        362 non-null    float64 
 9   Loan_Amount_Term  361 non-null    float64 
 10  Credit_History   338 non-null    float64 
 11  Property_Area    367 non-null    object 
```

```
dtypes: float64(3), int64(2), object(7)
memory usage: 34.5+ KB
```

```
testdata.isnull().sum()
```

```
Unnamed: 0      0
Gender         11
Married        0
Dependents    10
Education      0
Self_Employed  23
ApplicantIncome 0
CoapplicantIncome 0
LoanAmount     5
Loan_Amount_Term 6
Credit_History 29
Property_Area   0
dtype: int64
```

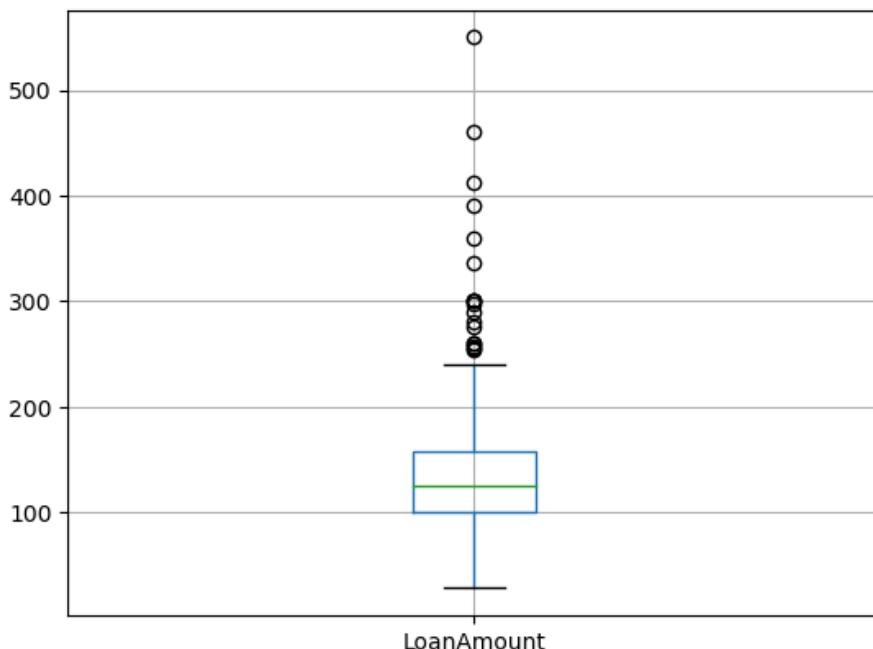
```
testdata['Gender'].fillna(testdata['Gender'].mode()[0], inplace=True)
testdata['Dependents'].fillna(testdata['Dependents'].mode()[0], inplace=True)
testdata['Self_Employed'].fillna(testdata['Self_Employed'].mode()[0], inplace=True)
testdata['Loan_Amount_Term'].fillna(testdata['Loan_Amount_Term'].mode()[0], inplace=True)
testdata['Credit_History'].fillna(testdata['Credit_History'].mode()[0], inplace=True)
```

```
testdata.isnull().sum()
```

```
Unnamed: 0      0
Gender         0
Married        0
Dependents    0
Education      0
Self_Employed  0
ApplicantIncome 0
CoapplicantIncome 0
LoanAmount     5
Loan_Amount_Term 0
Credit_History 0
Property_Area   0
dtype: int64
```

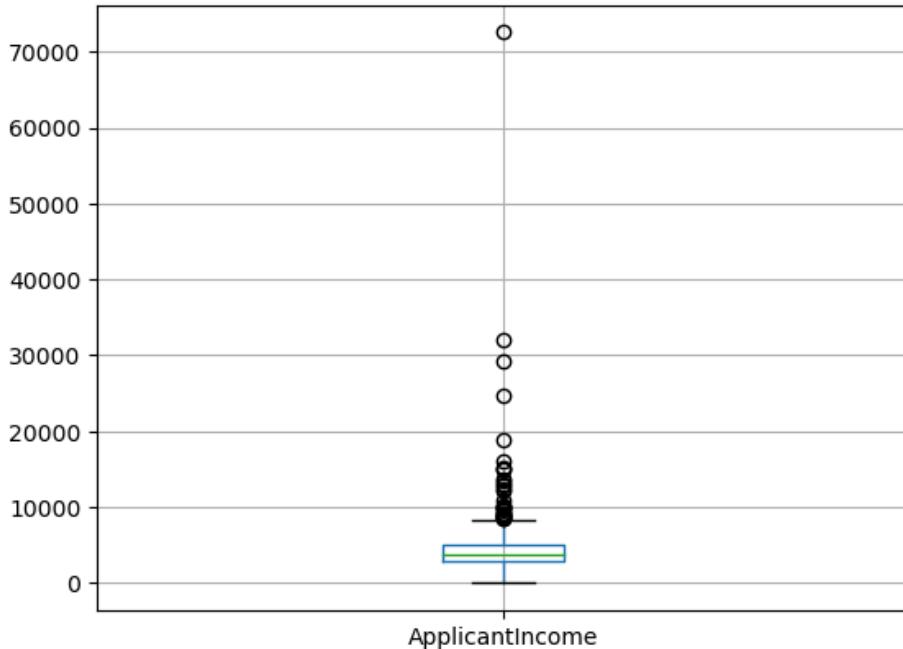
```
testdata.boxplot(column='LoanAmount')
```

```
<Axes: >
```



```
testdata.boxplot(column='ApplicantIncome')
```

<Axes: >



```
testdata.LoanAmount = testdata.LoanAmount.fillna(testdata.LoanAmount.mean())
```

```
testdata['LoanAmount_log']=np.log(testdata['LoanAmount'])
```

```
testdata.isnull().sum()
```

```
Unnamed: 0      0  
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  
LoanAmount_log    0  
dtype: int64
```

```
testdata['TotalIncome'] = testdata['ApplicantIncome'] + testdata['CoapplicantIncome']
```

```
testdata['TotalIncome_log'] = np.log(testdata['TotalIncome'])
```

```
testdata.head()
```

```
Unnamed: 0 Gender Married Dependents Education Self_Employed ApplicantIncome CoapplicantIn
```

```
test =testdata.iloc[:,np.r_[1:5,9:11,13:15]].values
```

```
1 LP001022 Male Yes 1 Graduate No 2076
```

```
for i in range(0,5):  
    test[:,i] = labelencoder_x.fit_transform(test[:,i])
```

```
3 LP001035 Male Yes 2 Graduate No 2340
```

```
test[:,7] = labelencoder_x.fit_transform(test[:,7])
```

```
Graduate
```