In [11]:

df.info

## **BANK PERSONAL LOAN - VISUALIZATION**

```
import numpy as np
 In [1]:
           import pandas as pd
           import matplotlib.pyplot as plt
           import matplotlib as mpl
           import seaborn as sns
           df=pd.read_csv("Bank_Personal_Loan.csv")
 In [8]:
           df
 In [9]:
 Out[9]:
                                                    ZIP
                                                                                               Personal
                    ID
                       Age
                             Experience
                                         Income
                                                         Family
                                                                CCAvg Education
                                                                                   Mortgage
                                                  Code
                                                                                                  Loan
              0
                    1
                         25
                                      1
                                              49
                                                 91107
                                                              4
                                                                     1.6
                                                                                 1
                                                                                            0
                                                                                                      0
                    2
                         45
                                     19
                                                 90089
                                                              3
                                                                     1.5
                                                                                 1
                                                                                            0
                                                                                                      0
                                              34
              2
                    3
                                                                     1.0
                                                                                 1
                                                                                            0
                                                                                                      0
                         39
                                     15
                                                 94720
                                                              1
              3
                         35
                                      9
                                             100
                                                 94112
                                                              1
                                                                    2.7
                                                                                 2
                                                                                            0
                                                                                                      0
                    4
                                                                                 2
                    5
              4
                         35
                                      8
                                                              4
                                                                     1.0
                                                                                            0
                                                                                                      0
                                              45
                                                 91330
                                      3
                                                                                 3
                                                                                            0
                                                                                                      0
           4995
                 4996
                         29
                                              40
                                                 92697
                                                              1
                                                                     1.9
           4996
                 4997
                         30
                                              15
                                                 92037
                                                              4
                                                                    0.4
                                                                                 1
                                                                                           85
                                                                                                      0
           4997 4998
                         63
                                     39
                                                 93023
                                                              2
                                                                    0.3
                                                                                 3
                                                                                            0
                                                                                                      0
                                              24
           4998
                 4999
                         65
                                     40
                                              49
                                                 90034
                                                              3
                                                                    0.5
                                                                                 2
                                                                                            0
                                                                                                      0
                                                              3
                                                                                            0
                                                                                                      0
           4999
                 5000
                         28
                                      4
                                              83 92612
                                                                    0.8
                                                                                 1
          5000 rows × 14 columns
           df.shape
In [10]:
           (5000, 14)
Out[10]:
```

3, 9.32 F W						Dalik Fels	oliai Lua	Allalys	is visua	liiZaliUII				
Out[11]:				ataFrame.i	nfo c	of	ID	Age	Expe	rience	Income	ZIP	Code	Fam
		_		cation \										
	0	1	25		1	49	911		4			1		
	1	2	45		19	34	900		3			1		
	2	3	39		15	11	947		1			1		
	3	4	35		9	100	941	.12	1			2		
	4	5	35		8	45	913		4			2		
	4005	4006	• • •	•	• •	• • •		• •	• • •			• • •		
	4995		29		3	40	926		1			3		
	4996		30		4	15	920		4			1		
	4997		63		39	24	930		2			3		
	4998		65		40	49	900		3			2		
	4999	5000	28		4	83	926	12	3	0.8		1		
		Mortg	age	Personal	Loan	Securi	ties A	ccoun	t CD	Account	t Onlin	e \		
	0		0		0			:	1	(	9	0		
	1		0		0				1	(	9	0		
	2		0		0				9	(	)	0		
	3		0		0				9	(	)	0		
	4		0		0				9			0		
									•					
	4995		0		0				9			1		
	4996		85		0				9	(		1		
	4997		0		0				9			0		
	4998		0		0				9			1		
	4999		0		0				9			1		
		Credi	+Can	4										
	0	Crear		) )										
	1			9										
	2			9										
	3			9										
	4			1										
	•••		• •											
	4995			9										
	4996			9										
	4997			9										
	4998			9										
	4999			1										
	[500	0 rows	x 14	columns]>										

In [12]: df.head(15)

Out[12]:

	ID	Age	Experience	Income	ZIP Code	Family	CCAvg	Education	Mortgage	Personal Loan	Securit Accou
0	1	25	1	49	91107	4	1.6	1	0	0	
1	2	45	19	34	90089	3	1.5	1	0	0	
2	3	39	15	11	94720	1	1.0	1	0	0	
3	4	35	9	100	94112	1	2.7	2	0	0	
4	5	35	8	45	91330	4	1.0	2	0	0	
5	6	37	13	29	92121	4	0.4	2	155	0	
6	7	53	27	72	91711	2	1.5	2	0	0	
7	8	50	24	22	93943	1	0.3	3	0	0	
8	9	35	10	81	90089	3	0.6	2	104	0	
9	10	34	9	180	93023	1	8.9	3	0	1	
10	11	65	39	105	94710	4	2.4	3	0	0	
11	12	29	5	45	90277	3	0.1	2	0	0	
12	13	48	23	114	93106	2	3.8	3	0	0	
13	14	59	32	40	94920	4	2.5	2	0	0	
14	15	67	41	112	91741	1	2.0	1	0	0	

 $\triangleleft$ 

In [13]: df.tail(15)

Out[13]:

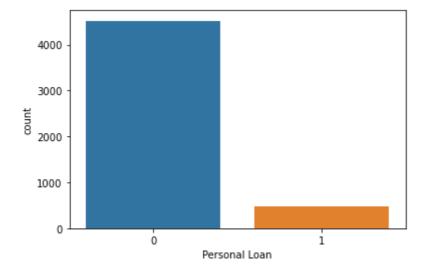
4985         4986         48         23         30         94720         3         1.70         2         162         0           4986         4987         32         6         78         95825         1         2.90         3         0         0           4987         4988         48         23         43         93943         3         1.70         2         159         0           4988         4989         34         8         85         95134         1         2.50         1         136         0           4989         4990         24         0         38         93555         1         1.00         3         0         0           4990         4991         55         25         58         95023         4         2.00         3         219         0           4991         4992         51         25         92         91330         1         1.90         2         100         0           4992         4993         30         5         13         90037         4         0.50         3         0         0           4993         4994         45         2		ID	Age	Experience	Income	ZIP Code	Family	CCAvg	Education	Mortgage	Personal Loan	Se #
4987       4988       48       23       43       93943       3       1.70       2       159       0         4988       4989       34       8       85       95134       1       2.50       1       136       0         4989       4990       24       0       38       93555       1       1.00       3       0       0         4990       4991       55       25       58       95023       4       2.00       3       219       0         4991       4992       51       25       92       91330       1       1.90       2       100       0         4992       4993       30       5       13       90037       4       0.50       3       0       0         4993       4994       45       21       218       91801       2       6.67       1       0       0         4994       4995       64       40       75       94588       3       2.00       3       0       0         4995       4996       29       3       40       92697       1       1.90       3       0       0         4997	4985	4986	48	23	30	94720	3	1.70	2	162	0	
4988       4989       34       8       85       95134       1       2.50       1       136       0         4989       4990       24       0       38       93555       1       1.00       3       0       0         4990       4991       55       25       58       95023       4       2.00       3       219       0         4991       4992       51       25       92       91330       1       1.90       2       100       0         4992       4993       30       5       13       90037       4       0.50       3       0       0         4993       4994       45       21       218       91801       2       6.67       1       0       0         4994       4995       64       40       75       94588       3       2.00       3       0       0         4995       4996       29       3       40       92697       1       1.90       3       0       0         4996       4997       30       4       15       92037       4       0.40       1       85       0         4997	4986	4987	32	6	78	95825	1	2.90	3	0	0	
4989       4990       24       0       38       93555       1       1.00       3       0       0         4990       4991       55       25       58       95023       4       2.00       3       219       0         4991       4992       51       25       92       91330       1       1.90       2       100       0         4992       4993       30       5       13       90037       4       0.50       3       0       0         4993       4994       45       21       218       91801       2       6.67       1       0       0         4994       4995       64       40       75       94588       3       2.00       3       0       0         4995       4996       29       3       40       92697       1       1.90       3       0       0         4996       4997       30       4       15       92037       4       0.40       1       85       0         4997       4998       63       39       24       93023       2       0.30       3       0       0         4998	4987	4988	48	23	43	93943	3	1.70	2	159	0	
4990       4991       55       25       58       95023       4       2.00       3       219       0         4991       4992       51       25       92       91330       1       1.90       2       100       0         4992       4993       30       5       13       90037       4       0.50       3       0       0         4993       4994       45       21       218       91801       2       6.67       1       0       0         4994       4995       64       40       75       94588       3       2.00       3       0       0         4995       4996       29       3       40       92697       1       1.90       3       0       0         4996       4997       30       4       15       92037       4       0.40       1       85       0         4997       4998       63       39       24       93023       2       0.30       3       0       0         4998       4999       65       40       49       90034       3       0.50       2       0       0	4988	4989	34	8	85	95134	1	2.50	1	136	0	
4991       4992       51       25       92       91330       1       1.90       2       100       0         4992       4993       30       5       13       90037       4       0.50       3       0       0         4993       4994       45       21       218       91801       2       6.67       1       0       0         4994       4995       64       40       75       94588       3       2.00       3       0       0         4995       4996       29       3       40       92697       1       1.90       3       0       0         4996       4997       30       4       15       92037       4       0.40       1       85       0         4997       4998       63       39       24       93023       2       0.30       3       0       0         4998       4999       65       40       49       90034       3       0.50       2       0       0	4989	4990	24	0	38	93555	1	1.00	3	0	0	
4992       4993       30       5       13       90037       4       0.50       3       0       0         4993       4994       45       21       218       91801       2       6.67       1       0       0         4994       4995       64       40       75       94588       3       2.00       3       0       0         4995       4996       29       3       40       92697       1       1.90       3       0       0         4996       4997       30       4       15       92037       4       0.40       1       85       0         4997       4998       63       39       24       93023       2       0.30       3       0       0         4998       4999       65       40       49       90034       3       0.50       2       0       0	4990	4991	55	25	58	95023	4	2.00	3	219	0	
4993       4994       45       21       218       91801       2       6.67       1       0       0         4994       4995       64       40       75       94588       3       2.00       3       0       0         4995       4996       29       3       40       92697       1       1.90       3       0       0         4996       4997       30       4       15       92037       4       0.40       1       85       0         4997       4998       63       39       24       93023       2       0.30       3       0       0         4998       4999       65       40       49       90034       3       0.50       2       0       0	4991	4992	51	25	92	91330	1	1.90	2	100	0	
4994       4995       64       40       75       94588       3       2.00       3       0       0         4995       4996       29       3       40       92697       1       1.90       3       0       0         4996       4997       30       4       15       92037       4       0.40       1       85       0         4997       4998       63       39       24       93023       2       0.30       3       0       0         4998       4999       65       40       49       90034       3       0.50       2       0       0	4992	4993	30	5	13	90037	4	0.50	3	0	0	
4995       4996       29       3       40       92697       1       1.90       3       0       0         4996       4997       30       4       15       92037       4       0.40       1       85       0         4997       4998       63       39       24       93023       2       0.30       3       0       0         4998       4999       65       40       49       90034       3       0.50       2       0       0	4993	4994	45	21	218	91801	2	6.67	1	0	0	
4996       4997       30       4       15       92037       4       0.40       1       85       0         4997       4998       63       39       24       93023       2       0.30       3       0       0         4998       4999       65       40       49       90034       3       0.50       2       0       0	4994	4995	64	40	75	94588	3	2.00	3	0	0	
4997       4998       63       39       24       93023       2       0.30       3       0       0         4998       4999       65       40       49       90034       3       0.50       2       0       0	4995	4996	29	3	40	92697	1	1.90	3	0	0	
<b>4998</b> 4999 65 40 49 90034 3 0.50 2 0 0	4996	4997	30	4	15	92037	4	0.40	1	85	0	
	4997	4998	63	39	24	93023	2	0.30	3	0	0	
<b>4999</b> 5000 28	4998	4999	65	40	49	90034	3	0.50	2	0	0	
	4999	5000	28	4	83	92612	3	0.80	1	0	0	

```
print(df.dtypes)
In [29]:
                                   int64
         Age
          Experience
                                  int64
          Income
                                  int64
          Family
                                   int64
         CCAvg
                                float64
          Education
                                  int64
         Mortgage
                                  int64
         Personal Loan
                                  int64
          Securities Account
                                  int64
         CD Account
                                  int64
         Online
                                  int64
         CreditCard
                                  int64
          dtype: object
          print(df.isnull().sum())
In [30]:
                                0
         Age
          Experience
                                0
          Income
                                0
          Family
                                0
         CCAvg
                                0
          Education
                                0
                                0
         Mortgage
         Personal Loan
                                0
         Securities Account
                                0
         CD Account
                                0
         Online
                                0
          CreditCard
                                0
          dtype: int64
          print(df['Personal Loan'].value_counts())
In [31]:
               4520
          0
                480
          1
         Name: Personal Loan, dtype: int64
          print(df.describe())
In [32]:
```

Age	Experience	Income	Family	CCAvg	\	
5000.000000 5000.000000		5000.000000	5000.000000	5000.000000		
45.338400	20.104600	73.774200	2.396400	1.937938		
11.463166	11.467954	46.033729	1.147663	1.747659		
23.000000	-3.000000	8.000000	1.000000	0.000000		
35.000000	10.000000	39.000000	1.000000	0.700000		
45.000000	20.000000	64.000000	2.000000	1.500000		
55.000000	30.000000	98.000000	3.000000	2.500000		
67.000000	43.000000	224.000000	4.000000	10.000000		
Education	Mortgage	Personal Loar	n Securities	Account \		
5000.000000	5000.000000	5000.000000	500	0.000000		
1.881000	56.498800			0.104400		
0.839869	101.713802	0.294621				
1.000000	0.000000	0.000000	9	0.000000		
1.000000	0.000000					
3.000000	101.000000	0.000000	9	0.000000		
3.000000	635.000000	1.000000	9	1.000000		
0.00000	0.000000	0.000000				
0.00000	1.000000	0.000000				
0.00000	1.000000	1.000000				
1.00000	1.000000	1.000000				
	5000.000000 45.338400 11.463166 23.000000 35.000000 45.000000 67.000000 Education 5000.000000 1.881000 0.839869 1.000000 2.000000 3.000000 3.000000 CD Account 5000.00000 0.06040 0.23825 0.00000 0.00000 0.00000	5000.000000 5000.000000 45.338400 20.104600 11.463166 11.467954 23.000000 -3.000000 35.000000 10.000000 45.000000 30.000000 67.000000 43.000000 Education Mortgage 5000.000000 56.498800 0.839869 101.713802 1.000000 0.000000 1.000000 0.000000 3.000000 101.000000 CD Account Online 5000.00000 0.596800 0.23825 0.490589 0.00000 0.000000 0.000000 0.000000 0.000000 0.000000 0.000000 0.0000000 0.000000 0.0000000 0.000000 0.0000000 0.000000 0.0000000 0.000000 0.0000000 0.000000 1.0000000000	5000.000000         5000.000000         5000.000000           45.338400         20.104600         73.774200           11.463166         11.467954         46.033729           23.000000         -3.000000         8.000000           35.000000         10.000000         39.000000           45.000000         20.000000         64.000000           55.000000         30.000000         98.000000           67.000000         43.000000         224.000000           Education         Mortgage         Personal Load           5000.000000         5000.000000         5000.00000           1.881000         56.498800         0.096000           1.000000         0.000000         0.000000           1.000000         0.000000         0.000000           1.000000         0.000000         0.000000           2.000000         0.000000         0.000000           3.000000         101.000000         0.000000           3.000000         635.000000         1.000000           CD Account         Online         CreditCard           5000.00000         5000.000000         0.294000           0.23825         0.490589         0.455637           0.00000         0.0	5000.000000         5000.000000         5000.000000         5000.000000           45.338400         20.104600         73.774200         2.396400           11.463166         11.467954         46.033729         1.147663           23.000000         -3.000000         8.000000         1.000000           35.000000         10.000000         39.000000         1.000000           45.000000         20.000000         64.000000         2.000000           55.000000         30.000000         98.000000         3.000000           67.00000         43.000000         224.000000         4.000000           1.881000         56.498800         0.096000         500           1.881000         56.498800         0.096000         500           1.000000         0.000000         0.000000         500           1.000000         0.000000         0.000000         500           1.000000         0.000000         0.000000         500           2.000000         0.000000         0.000000         0.000000           3.000000         0.000000         0.000000         0.000000           3.000000         0.000000         0.000000         0.000000           3.000000         0.000000	5000.000000         5000.000000         5000.000000         5000.000000         5000.000000         5000.000000         5000.000000         5000.000000         5000.000000         5000.000000         5000.000000         1.937938         11.463166         11.467954         46.033729         1.147663         1.747659         23.000000         -3.000000         8.000000         1.000000         0.000000         0.000000         0.000000         0.000000         0.000000         0.000000         0.000000         0.000000         1.000000         0.700000         0.700000         0.700000         1.500000         0.700000         1.500000         0.700000         1.500000         0.700000         1.500000         0.700000         1.500000         0.700000         1.500000         0.700000         1.500000         0.700000         1.500000         0.700000         1.5000000         1.500000         0.700000         1.5000000         1.5000000         0.7000000         1.5000000         0.7000000         1.5000000         1.5000000         0.1000000         1.0000000         0.1000000         0.1000000         0.1000000         0.1000000         0.1000000         0.1000000         0.0000000         0.0000000         0.0000000         0.0000000         0.0000000         0.0000000         0.0000000         0.0000000         0.0000000 </td	

Distribution of the target variable using countplot

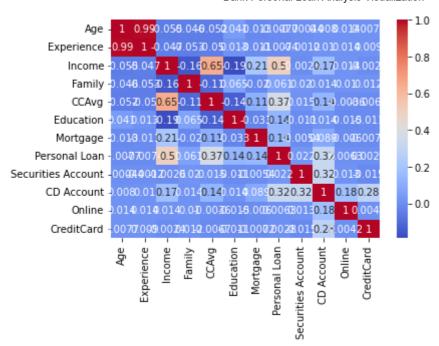
```
In [33]: sns.countplot(x='Personal Loan', data=df)
Out[33]: <AxesSubplot:xlabel='Personal Loan', ylabel='count'>
```



It appears that the dataset is imbalanced, with a small proportion of customers accepting a personal loan, as indicated by the count plot.

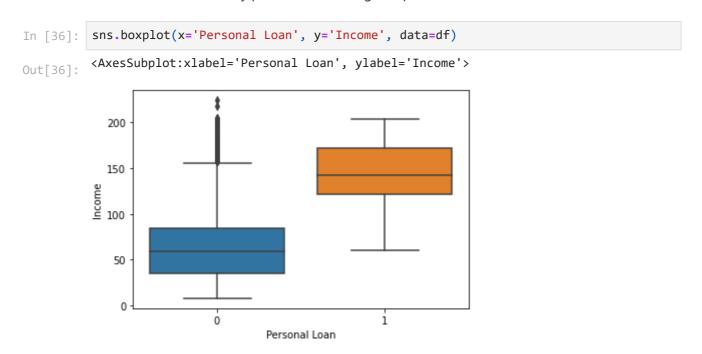
Correlation matrix using heatmap

```
In [35]: corr = df.corr()
    sns.heatmap(corr, annot=True, cmap='coolwarm')
Out[35]: <AxesSubplot:>
```



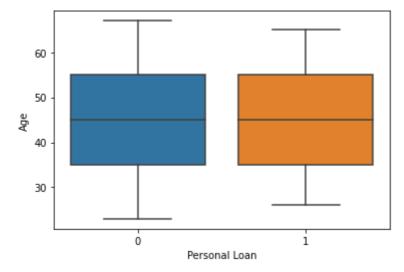
According to the correlation matrix, The most significant predictors of accepting a personal loan are income and education.

Distribution of income by personal loan using box plot



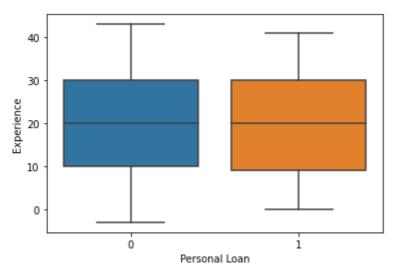
Distribution of age by personal loan using box plot

```
In [37]: sns.boxplot(x='Personal Loan', y='Age', data=df)
Out[37]: <AxesSubplot:xlabel='Personal Loan', ylabel='Age'>
```

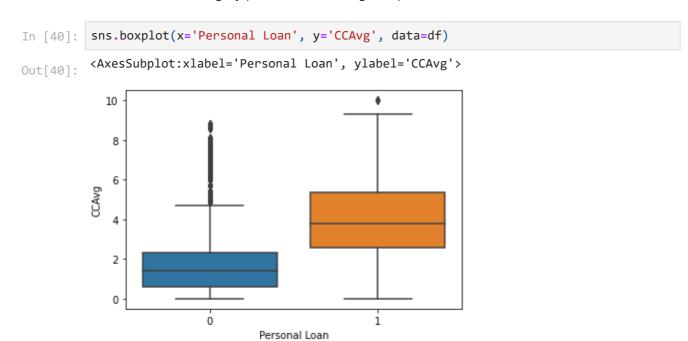


Distribution of experience by personal loan using box plot

```
In [39]: sns.boxplot(x='Personal Loan', y='Experience', data=df)
Out[39]: <AxesSubplot:xlabel='Personal Loan', ylabel='Experience'>
```

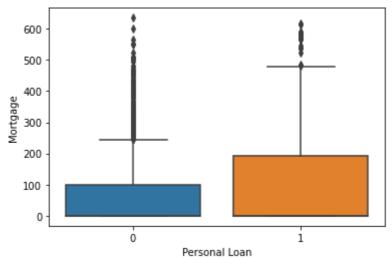


Distribution of CCAvg by personal loan using box plot



Distribution of mortgage by personal loan using box plot

```
In [41]: sns.boxplot(x='Personal Loan', y='Mortgage', data=df)
Out[41]: <AxesSubplot:xlabel='Personal Loan', ylabel='Mortgage'>
```

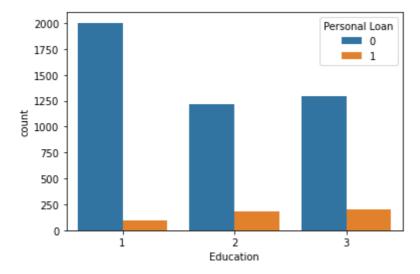


the boxplots suggest that customers who accepted personal loans tend to have higher incomes, more work experience, and slightly older ages compared to those who did not accept personal loans. Moreover, the boxplots reveal that customers who spent more on credit cards, had more mortgages, and more family members were more likely to accept personal loans.

Distribution of education by personal loan using count plot

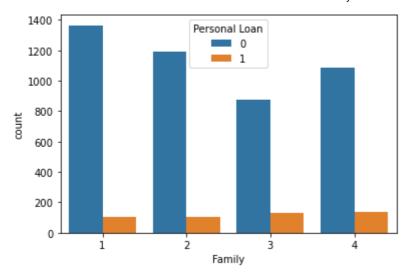
```
In [42]: sns.countplot(x='Education', hue='Personal Loan', data=df)
```

Out[42]: <AxesSubplot:xlabel='Education', ylabel='count'>



Distribution of family by personal loan using count plot

```
In [43]: sns.countplot(x='Family', hue='Personal Loan', data=df)
Out[43]: <AxesSubplot:xlabel='Family', ylabel='count'>
```



the count plots suggest that higher education levels are associated with a higher likelihood of accepting personal loans.