```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
import warnings
warnings.filterwarnings('ignore')
Reading data
data = pd.read csv("loan data.csv")
data.head()
   credit.policy
                              purpose int.rate
                                                  installment
log.annual.inc \
               1 debt consolidation
                                          0.1189
                                                        829.10
11.350407
               1
                          credit card
                                          0.1071
                                                        228.22
1
11.082143
2
               1
                   debt consolidation
                                          0.1357
                                                        366.86
10.373491
               1
                  debt_consolidation
                                          0.1008
                                                        162.34
3
11.350407
               1
                          credit card
                                          0.1426
                                                        102.92
11.299732
         fico
                days.with.cr.line revol.bal
                                                revol.util
     dti
ing.last.6mths
                \
  19.48
           737
                       5639.958333
                                         28854
                                                      52.1
0
                                                      76.7
1
  14.29
           707
                       2760.000000
                                         33623
0
2
                                                      25.6
  11.63
           682
                       4710.000000
                                          3511
1
3
   8.10
           712
                       2699.958333
                                         33667
                                                      73.2
1
4
   14.97
           667
                       4066.000000
                                          4740
                                                      39.5
0
                          not.fully.paid
   deling.2yrs
                pub.rec
0
             0
1
                       0
                                        0
             0
2
             0
                       0
                                        0
3
             0
                       0
                                        0
4
             1
                       0
                                        0
Checking for null values
data.isnull().sum()
credit.policy
                      0
purpose
                      0
```

0

int.rate

```
installment
log.annual.inc
                      0
dti
                      0
fico
                      0
days.with.cr.line
                      0
revol.bal
                      0
revol.util
                      0
inq.last.6mths
                      0
deling.2yrs
                      0
                      0
pub.rec
not.fully.paid
                      0
dtype: int64
data.isna().sum()
credit.policy
                      0
                      0
purpose
int.rate
                      0
installment
                      0
log.annual.inc
                      0
dti
                      0
                      0
fico
days.with.cr.line
                      0
                      0
revol.bal
revol.util
                      0
ing.last.6mths
                      0
deling.2yrs
                      0
pub.rec
                      0
not.fully.paid
                      0
dtype: int64
```

data.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 9578 entries, 0 to 9577
Data columns (total 14 columns):

| (10101 - 1 | · · · · · · · · · · · · · · · · · · · | |
|-------------------|--|--|
| Column | Non-Null Count | Dtype |
| | | |
| credit.policy | 9578 non-null | int64 |
| purpose | 9578 non-null | object |
| int.rate | 9578 non-null | float64 |
| installment | 9578 non-null | float64 |
| log.annual.inc | 9578 non-null | float64 |
| dti | 9578 non-null | float64 |
| fico | 9578 non-null | int64 |
| days.with.cr.line | 9578 non-null | float64 |
| revol.bal | 9578 non-null | int64 |
| revol.util | 9578 non-null | float64 |
| inq.last.6mths | 9578 non-null | int64 |
| deling.2yrs | 9578 non-null | int64 |
| pub.rec | 9578 non-null | int64 |
| | credit.policy purpose int.rate installment log.annual.inc dti fico days.with.cr.line revol.bal revol.util inq.last.6mths delinq.2yrs | credit.policy 9578 non-null purpose 9578 non-null int.rate 9578 non-null installment 9578 non-null log.annual.inc 9578 non-null fico 9578 non-null days.with.cr.line revol.bal 9578 non-null revol.util 9578 non-null inq.last.6mths 9578 non-null delinq.2yrs 9578 non-null |

```
13 not.fully.paid
                         9578 non-null
                                          int64
dtypes: float64(6), int64(7), object(1)
memory usage: 1.0+ MB
data["purpose"].value counts()
debt consolidation
                       3957
all other
                       2331
credit card
                       1262
home improvement
                        629
small business
                        619
major purchase
                        437
educational
                        343
Name: purpose, dtype: int64
Transform categorical values into numerical values
data = pd.get dummies(data, columns = ["purpose"])
data.head()
   credit.policy int.rate installment log.annual.inc
                                                              dti
fico \
               1
                                                11.350407
                     0.1189
                                  829.10
                                                            19.48
                                                                    737
                                  228.22
                                                11.082143
                                                                    707
1
               1
                     0.1071
                                                            14.29
2
                                  366.86
               1
                     0.1357
                                                10.373491 11.63
                                                                    682
3
                                  162.34
                                                11.350407
               1
                     0.1008
                                                             8.10
                                                                    712
4
               1
                     0.1426
                                  102.92
                                                11.299732 14.97
                                                                    667
   days.with.cr.line revol.bal revol.util inq.last.6mths
deling.2yrs
         5639.958333
                           28854
                                         52.1
                                                             0
0
0
1
         2760.000000
                                         76.7
                           33623
                                                             0
0
2
         4710.000000
                            3511
                                         25.6
                                                             1
0
3
         2699.958333
                           33667
                                         73.2
                                                             1
0
4
         4066.000000
                            4740
                                         39.5
                                                             0
1
            not.fully.paid purpose all other
                                                 purpose credit card
   pub.rec
0
         0
                                                                    0
         0
                          0
                                              0
                                                                    1
1
2
         0
                          0
                                              0
                                                                    0
3
                                              0
         0
                          0
                                                                    0
```

| | purpose_debt_consolidat | ion | purpose_educational |
|--------|-------------------------|-----|---------------------|
| pu | rpose_home_improvement | \ | |
| 0 | | 1 | Θ |
| 0 | | _ | _ |
| 1 | | 0 | Θ |
| 0 | | _ | |
| 2 | | 1 | Θ |
| 0 | | | |
| 3 | | 1 | Θ |
| 0 | | ^ | 0 |
| 4 0 | | 0 | Θ |
| U | | | |
| | purpose_major_purchase | nur | nose small business |
| 0 | 0 | Pu. | 0 |
| 1 | 0 | | 0 |
| 2 | 0 | | Θ |
| 3 | 0 | | 0 |
| 4 | 0 | | 0 |

data.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 9578 entries, 0 to 9577
Data columns (total 20 columns):

| # | Column | Non-Null Count | Dtype |
|---|--|---|---|
| # 0 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 | credit.policy int.rate installment log.annual.inc dti fico days.with.cr.line revol.bal revol.util inq.last.6mths delinq.2yrs pub.rec not.fully.paid purpose_all_other purpose_credit_card purpose_debt_consolidation purpose_home_improvement purpose major purchase | 9578 non-null | int64 float64 float64 float64 float64 int64 float64 int64 int64 int64 int64 int68 uint8 uint8 uint8 uint8 |
| 19 | purpose_small_business | 9578 non-null | uint8 |

dtypes: float64(6), int64(7), uint8(7)
memory usage: 1.0 MB

EDA

data.describe().T

| min \ | count | mean | std |
|--|--------|--------------|--------------|
| min \ credit.policy | 9578.0 | 0.804970 | 0.396245 |
| 0.000000 int.rate | 9578.0 | 0.122640 | 0.026847 |
| 0.060000 installment | 9578.0 | 319.089413 | 207.071301 |
| 15.670000 log.annual.inc | 9578.0 | 10.932117 | 0.614813 |
| 7.547502 dti | 9578.0 | 12.606679 | 6.883970 |
| 0.000000 fico | 9578.0 | 710.846314 | 37.970537 |
| 612.000000 days.with.cr.line | 9578.0 | 4560.767197 | 2496.930377 |
| 178.958333 revol.bal | 9578.0 | 16913.963876 | 33756.189557 |
| 0.000000 revol.util | 9578.0 | 46.799236 | 29.014417 |
| 0.000000 inq.last.6mths | 9578.0 | 1.577469 | 2.200245 |
| 0.000000 delinq.2yrs | 9578.0 | 0.163708 | 0.546215 |
| 0.000000 pub.rec | 9578.0 | 0.062122 | 0.262126 |
| 0.000000 not.fully.paid | 9578.0 | 0.160054 | 0.366676 |
| 0.000000 purpose_all_other | 9578.0 | 0.243370 | 0.429139 |
| 0.000000 purpose credit card | 9578.0 | 0.131760 | 0.338248 |
| 0.000000 purpose_debt_consolidation | | 0.413134 | 0.492422 |
| 0.000000 purpose_educational | 9578.0 | 0.035811 | 0.185829 |
| 0.000000 purpose home improvement | 9578.0 | 0.065671 | 0.247720 |
| 0.000000 purpose_major_purchase | 9578.0 | 0.045625 | 0.208682 |
| 0.000000 | 9578.0 | 0.064627 | 0.245880 |
| <pre>purpose_small_business 0.000000</pre> | שוסונפ | 0.004027 | U.24306U |

| <pre>credit.policy int.rate installment log.annual.inc dti fico days.with.cr.line revol.bal revol.util inq.last.6mths delinq.2yrs pub.rec not.fully.paid purpose_all_other purpose_credit_card purpose_debt_consolidation purpose_debt_consolidation purpose_home_improvement purpose_major_purchase purpose_small_business</pre> | 1.000000 0.103900 163.770000 10.558414 7.212500 682.000000 2820.000000 22.600000 0.000000 0.000000 0.000000 0.000000 | 1.000000 0.122100 268.950000 10.928884 12.665000 707.000000 4139.958333 8596.000000 1.0000000 0.0000000 0.0000000 0.0000000 0.000000 | 1.000000 0.140700 432.762500 11.291293 17.950000 737.000000 5730.000000 70.900000 2.000000 0.000000 0.000000 0.000000 1.000000 0.000000 0.000000 0.000000 0.000000 |
|---|--|--|--|
| credit.policy int.rate installment log.annual.inc dti fico days.with.cr.line revol.bal revol.util inq.last.6mths delinq.2yrs pub.rec not.fully.paid purpose_all_other purpose_credit_card purpose_debt_consolidation purpose_educational purpose_major_purchase purpose_small_business | max 1.000000e+00 2.164000e-01 9.401400e+02 1.452835e+01 2.996000e+01 8.270000e+02 1.763996e+04 1.207359e+06 1.190000e+02 3.300000e+01 1.300000e+01 5.000000e+00 1.000000e+00 1.000000e+00 1.000000e+00 1.000000e+00 1.000000e+00 1.000000e+00 1.000000e+00 | | |
| data.corr() | | | |
| <pre>credit.policy int.rate installment log.annual.inc</pre> | credit.policy 1.000000 -0.294089 0.058770 0.034900 | 0 -0.294089 9 1.000000 0 0.276140 | installment \ 0.058770 0.276140 1.000000 0.448102 |

```
dti
                                -0.090901
                                           0.220006
                                                        0.050202
fico
                                 0.348319 -0.714821
                                                        0.086039
days.with.cr.line
                                 0.099026 -0.124022
                                                        0.183297
revol.bal
                                -0.187518
                                           0.092527
                                                        0.233625
revol.util
                                -0.104095
                                           0.464837
                                                        0.081356
ing.last.6mths
                                -0.535511
                                           0.202780
                                                       -0.010419
                                -0.076318
                                           0.156079
deling.2yrs
                                                       -0.004368
                                -0.054243
                                                       -0.032760
pub.rec
                                           0.098162
not.fully.paid
                                -0.158119
                                           0.159552
                                                        0.049955
purpose all other
                                -0.025412 -0.124000
                                                       -0.203103
purpose credit card
                                 0.003216 -0.042109
                                                        0.000774
purpose_debt_consolidation
                                 0.020193 0.123607
                                                        0.161658
purpose educational
                                -0.031346 -0.019618
                                                       -0.094510
purpose home improvement
                                 0.006036 -0.050697
                                                        0.023024
purpose_major_purchase
                                 0.024281 -0.068978
                                                       -0.079836
purpose small business
                                -0.003511 0.151247
                                                        0.145654
                            log.annual.inc
                                                 dti
                                                          fico
                                                               \
credit.policy
                                  0.034906 -0.090901
                                                      0.348319
int.rate
                                  installment
                                  0.448102
                                            0.050202 0.086039
log.annual.inc
                                  1.000000 -0.054065
                                                      0.114576
dti
                                 -0.054065
                                           1.000000 -0.241191
                                  0.114576 -0.241191
fico
                                                      1.000000
days.with.cr.line
                                  0.336896 0.060101
                                                      0.263880
                                  0.372140 0.188748 -0.015553
revol.bal
                                  0.054881 0.337109 -0.541289
revol.util
                                  0.029171 0.029189 -0.185293
ing.last.6mths
                                  0.029203 -0.021792 -0.216340
deling.2yrs
                                  0.016506 0.006209 -0.147592
pub.rec
not.fully.paid
                                 -0.033439 0.037362 -0.149666
purpose all other
                                 -0.080077 -0.125825
                                                      0.067184
purpose_credit_card
                                  0.072942 0.084476 -0.012512
                                 -0.026214 0.179149 -0.154132
purpose debt consolidation
purpose educational
                                 -0.119799 -0.035325 -0.013012
purpose home improvement
                                  0.116375 -0.092788
                                                     0.097474
purpose major purchase
                                 -0.031020 -0.077719
                                                      0.067129
purpose small business
                                  0.091540 -0.069245
                                                      0.063292
                            days.with.cr.line revol.bal
revol.util \
credit.policy
                                     0.099026
                                               -0.187518
                                                           -0.104095
                                    -0.124022
                                                0.092527
int.rate
                                                            0.464837
installment
                                     0.183297
                                                0.233625
                                                            0.081356
log.annual.inc
                                     0.336896
                                                0.372140
                                                            0.054881
dti
                                     0.060101
                                                0.188748
                                                            0.337109
```

| fico | 0.263880 | -0.015553 | -0.541289 |
|--|---|--|--|
| days.with.cr.line | 1.000000 | 0.229344 | -0.024239 |
| revol.bal | 0.229344 | 1.000000 | 0.203779 |
| revol.util | -0.024239 | 0.203779 | 1.000000 |
| inq.last.6mths | -0.041736 | 0.022394 | -0.013880 |
| delinq.2yrs | 0.081374 | -0.033243 | -0.042740 |
| pub.rec | 0.071826 | -0.031010 | 0.066717 |
| not.fully.paid | -0.029237 | 0.053699 | 0.082088 |
| purpose_all_other | -0.056574 | -0.067728 | -0.138535 |
| purpose_credit_card | 0.046220 | 0.072316 | 0.091321 |
| <pre>purpose_debt_consolidation</pre> | -0.009318 | 0.005785 | 0.211869 |
| purpose_educational | -0.042621 | -0.034743 | -0.053128 |
| <pre>purpose_home_improvement</pre> | 0.068087 | 0.003258 | -0.114449 |
| purpose_major_purchase | -0.020561 | -0.062395 | -0.108079 |
| purpose_small_business | 0.034883 | 0.083069 | -0.060962 |
| <pre>credit.policy int.rate installment log.annual.inc dti fico</pre> | inq.last.6mths d -0.535511 0.202780 -0.010419 0.029171 0.029189 -0.185293 | 0.029203 -0.021792 | pub.rec \ 0.054243 0.098162 0.032760 0.016506 0.006209 |
| days.with.cr.line revol.bal revol.util inq.last.6mths delinq.2yrs pub.rec not.fully.paid purpose_all_other purpose_credit_card | -0.041736 0.022394 -0.013880 1.000000 0.021245 0.072673 0.149452 0.017795 -0.033640 | 0.081374 -0.033243 - -0.042740 0.021245 1.000000 0.009184 0.008881 | 0.071826 0.031010 0.066717 0.072673 0.009184 1.000000 0.048634 0.030451 0.014842 |

| purpose_educational purpose_home_improvement purpose_major_purchase purpose_major_purchase purpose_small_business 0.024243 -0.013698 0.0047744 -0.013521 -0.004085 -0.011734 -0.004085 -0.011734 -0.004085 -0.011734 -0.004595 -0.01734 -0.005595 not.fully.paid credit.policy int.rate | purpose debt consolidation | -0.044240 | -0.000697 0.026845 |
|--|----------------------------|-----------------|---------------------|
| purpose_nome_improvement purpose_major_purchase purpose_major_purchase purpose_small_business 0.043827 | | | |
| purpose_major_purchase purpose_small_business -0.0042567 -0.004148 -0.005595 credit.policy int.rate installment 0.049955 0.049955 -0.124000 0.029313 0.080077 dti days.with.cr.line revol.bal inq.last.6mths 0.043362 0.085689 0.067728 0.085699 -0.067184 0.067728 0.067728 0.0149666 0.067184 0.067728 0.067728 0.067728 0.067728 0.01795 0.01 | · · · — | | |
| purpose_small_business 0.042567 -0.004148 -0.005595 credit.policy not.fully.paid one of the purpose_all_other of the purpose of the purp | | | |
| not.fully.paid purpose_all_other \ credit.policy | | | |
| redit.policy | | | |
| redit.policy | | not.fully.paid | purpose all other \ |
| installment | credit.policy | | |
| log.annual.inc dti | | 0.159552 | -0.124000 |
| dti 0.837362 -0.125825 fico -0.149666 0.067184 days.with.cr.line -0.029237 -0.055574 revol.bal 0.083699 -0.067728 revol.util 0.082088 -0.138535 inq.last.6mths 0.149452 0.017795 delinq.2yrs 0.008881 0.016658 pub.rec 0.0448634 -0.030451 not.fully.paid 1.000000 0.092233 purpose_all_other 0.009233 1.000000 purpose_debt_consolidation -0.017543 -0.475848 purpose_debt_consolidation -0.017543 -0.475848 purpose_major_purchase -0.028580 -0.124004 purpose_small_business 0.084460 -0.149076 purpose_debt_consolidation 0.084460 -0.149076 o.020193 1nt.rate -0.042109 o.123607 0.003216 -0.149076 o.154132 0.004204 -0.004209 olificts 0.084476 -0.012512 -0.012512 olificts <td< td=""><td>installment</td><td>0.049955</td><td>-0.203103</td></td<> | installment | 0.049955 | -0.203103 |
| fico | log.annual.inc | -0.033439 | -0.080077 |
| days.with.cr.line -0.029237 -0.056574 revol.bal 0.053699 -0.067728 revol.util 0.082088 -0.138535 inq.last.6mths 0.149452 0.017795 delinq.2yrs 0.008881 0.016658 pub.rec 0.048634 -0.030451 not.fully.paid 1.000000 0.009233 purpose_all_other 0.009233 1.000000 purpose_credit_card -0.047136 -0.220935 purpose_debt_consolidation -0.017543 -0.475848 purpose_debt_consolidation -0.021609 -0.109380 purpose_major_purchase -0.028580 -0.124004 purpose_small_business 0.084460 -0.149076 Purpose_debt_consolidation credit_policy 0.020193 int.rate 0.020193 int.rate 0.009774 0.161658 log.annual.inc 0.072942 0.009784 dti 0.179149 fico 1.000000 0.0000000000000000000000000 | | | |
| revol.bal revol.util 0.082088 -0.138535 inq.last.6mths 0.149452 0.017795 delinq.Zyrs 0.008881 0.016658 pub.rec 0.048634 -0.030451 not.fully.paid 1.000000 0.009233 purpose_all_other 0.09233 1.000000 purpose_credit_card 0.047136 -0.220935 purpose_debt_consolidation purpose_deucational 0.021609 -0.109300 purpose_major_purchase 0.0828580 -0.124004 purpose_major_purchase 0.084460 -0.149076 purpose_debt_consolidation credit.policy 0.003216 0.020193 int.rate 0.002724 -0.150359 int.rate 0.009774 0.161658 log.annual.inc 0.072942 -0.026214 dti 0.0984476 0.179149 fico 0.026214 dti 0.084476 0.179149 fico 0.058580 -0.012512 0.05938 -0.012512 0.05938 -0.012512 0.05938 -0.009318 condition 0.072316 0.005785 revol.util 0.091321 0.211869 inq.last.6mths -0.033640 - | | | |
| revol.util | | | |
| inq.last.6mths 0.149452 0.017795 delinq.2yrs 0.008881 0.016658 pub.rec 0.048634 -0.030451 not.fully.paid 1.000000 0.09233 purpose_all_other 0.009233 1.000000 purpose_debt_card -0.047136 -0.220935 purpose_debt_consolidation -0.017543 -0.475848 purpose_educational 0.021609 -0.109300 purpose_major_purchase -0.028580 -0.124004 purpose_major_purchase -0.028580 -0.124004 purpose_small_business 0.084460 -0.149076 Purpose_debt_consolidation credit.policy 0.020193 int.rate -0.042109 0.123607 installment 0.060774 0.161658 log.annual.inc 0.072942 -0.026214 dti 0.084476 0.179149 fico -0.0926214 dti 0.084476 0.179149 fico -0.09318 revol.bal 0.09318 revol.bal 0.09318 revol.bal 0.0972316 0.0972316 0.095785 revol.util 0.211869 inq.last.6mths -0.033640 - - | | | |
| deling.2yrs 0.008881 0.016658 pub.rec 0.048634 -0.030451 not.fully.paid 1.000000 0.009233 purpose_all_other 0.009233 1.000000 purpose_credit_card -0.047136 -0.220935 purpose_debt_consolidation -0.017543 -0.475848 purpose_home_improvement 0.021609 -0.109300 purpose_major_purchase -0.028580 -0.124004 purpose_small_business 0.084460 -0.149076 purpose_debt_consolidation credit.policy 0.020193 int.rate -0.042109 0.123607 installment 0.060774 0.161658 log.annual.inc 0.072942 -0.026214 dti 0.084476 0.179149 fico -0.026214 dti 0.084476 0.179149 fico 0.0154132 days.with.cr.line 0.046220 -0.009318 revol.bal 0.005785 revol.bal 0.005785 revol.util 0.091321 0.211869 inq.last.6mths -0.033640 - -0.033640 - | | | |
| pub.rec 0.048634 -0.030451 not.fully.paid 1.000000 0.09233 purpose_all_other 0.009233 1.000000 purpose_credit_card -0.047136 -0.220935 purpose_debt_consolidation -0.017543 -0.475848 purpose_educational 0.021609 -0.109300 purpose_home_improvement 0.007272 -0.150359 purpose_major_purchase -0.028580 -0.124004 purpose_small_business 0.084460 -0.149076 purpose_credit_card purpose_credit_card purpose_credit_card purpose_credit_card purpose_credit_card purpose_debt_consolidation credit_policy 0.003216 0.020193 -0.042109 -0.149076 0.123607 -0.042109 0.123607 -0.042109 0.161658 -0.0900774 0.06214 -0.084476 0.179149 -0.012512 fico -0.012512 0.154132 -0.009318 revol.bal 0.072316 0.009785 -0.009318 revol.bal 0.091321 <td>•</td> <td></td> <td></td> | • | | |
| not.fully.paid 1.000000 0.009233 purpose_all_other 0.009233 1.000000 purpose_credit_card -0.047136 -0.220935 purpose_debt_consolidation -0.017543 -0.475848 purpose_educational 0.021609 -0.109300 purpose_home_improvement 0.007272 -0.150359 purpose_major_purchase -0.028580 -0.124004 purpose_small_business 0.084460 -0.149076 | | | |
| purpose_all_other 0.009233 1.000000 purpose_credit_card -0.047136 -0.220935 purpose_debt_consolidation -0.017543 -0.475848 purpose_educational 0.021609 -0.109300 purpose_home_improvement 0.007772 -0.150359 purpose_major_purchase -0.028580 -0.124004 purpose_small_business 0.084460 -0.149076 | | | |
| purpose_credit_card -0.047136 -0.220935 purpose_debt_consolidation -0.017543 -0.475848 purpose_educational 0.021609 -0.109300 purpose_home_improvement 0.007272 -0.150359 purpose_major_purchase -0.028580 -0.124004 purpose_small_business 0.084460 -0.149076 purpose_credit_card purpose_credit_card purpose_credit_card purpose_debt_consolidation | | | |
| purpose_debt_consolidation -0.017543 -0.475848 purpose_educational 0.021609 -0.109300 purpose_home_improvement 0.007272 -0.150359 purpose_major_purchase -0.028580 -0.124004 purpose_small_business 0.084460 -0.149076 purpose_credit_card purpose_debt_consolidation 0.003216 0.02160 0.020193 0.003216 0.022109 int.rate -0.042109 0.123607 installment 0.000774 0.161658 log.annual.inc 0.072942 - 0.026214 0.084476 0.179149 fico -0.012512 - 0.154132 - - days.with.cr.line 0.046220 - 0.009318 - - revol.bal 0.072316 - 0.005785 - - revol.util 0.091321 - 0.211869 - - ing.last.6mths - - | | | |
| purpose_educational 0.021609 -0.109300 purpose_home_improvement 0.007272 -0.150359 purpose_major_purchase -0.028580 -0.124004 purpose_small_business 0.084460 -0.149076 purpose_credit_card purpose_debt_consolidation 0.003216 0.0149076 0.020193 0.003216 0.042109 0.123607 0.15607 0.000774 0.161658 0.0072942 - 0.026214 0.084476 - 0.179149 - - fico -0.012512 - 0.154132 - - days.with.cr.line 0.046220 - 0.009318 - - revol.bal 0.072316 - 0.005785 - - revol.util 0.091321 - 0.211869 - - ing.last.6mths - - | | | |
| purpose_home_improvement 0.007272 -0.150359 purpose_major_purchase -0.028580 -0.124004 purpose_small_business 0.084460 -0.149076 | | | |
| purpose_major_purchase -0.028580 -0.124004 purpose_small_business 0.084460 -0.149076 purpose_credit_card purpose_debt_consolidation 0.003216 credit.policy 0.003216 0.020193 -0.042109 int.rate -0.042109 0.123607 -0.161658 log.annual.inc 0.072942 - 0.026214 -0.084476 dti 0.084476 0.179149 - - fico -0.012512 - 0.154132 - - days.with.cr.line 0.046220 - 0.009318 - - revol.bal 0.072316 - 0.005785 - - revol.util 0.091321 - 0.211869 - - inq.last.6mths - - | | | |
| purpose_small_business | | | |
| purpose_debt_consolidation | purpose_major_purchase | | |
| purpose_debt_consolidation \ credit.policy | pur pose_silla cc_business | 0.004400 | -0.149070 |
| credit.policy 0.003216 0.020193 -0.042109 int.rate -0.042109 0.123607 | | purpose_credit_ | card |
| 0.020193 int.rate | | • | _ |
| int.rate | | 0.00 | 3216 |
| 0.123607 installment | | | |
| installment 0.000774 0.161658 log.annual.inc 0.072942 - 0.026214 dti 0.084476 0.179149 fico -0.012512 - 0.154132 days.with.cr.line 0.046220 - 0.009318 revol.bal 0.072316 0.005785 revol.util 0.091321 0.211869 ing.last.6mths -0.033640 - | | -0.04 | 2109 |
| 0.161658 log.annual.inc 0.072942 - 0.026214 0.084476 - dti 0.084476 - 0.179149 - - fico -0.012512 - 0.154132 - - days.with.cr.line 0.046220 - 0.099318 - - revol.bal 0.072316 - 0.005785 - - revol.util 0.091321 - 0.211869 - - inq.last.6mths - - | | 0.00 | 20774 |
| log.annual.inc | | 0.00 | 00//4 |
| 0.026214 dti | | 0.07 | 220.42 |
| dti0.0844760.179149-0.012512fico-0.0125120.154132-days.with.cr.line0.0462200.009318-revol.bal0.0723160.005785-revol.util0.0913210.211869-inq.last.6mths-0.033640 | | 0.07 | |
| 0.179149 fico | | 0.00 | 24476 |
| fico -0.012512 - 0.154132 days.with.cr.line 0.046220 - 0.009318 revol.bal 0.072316 0.005785 revol.util 0.091321 0.211869 inq.last.6mths -0.033640 - | | 0.00 | 14470 |
| 0.154132 days.with.cr.line 0.046220 0.009318 revol.bal 0.072316 0.005785 revol.util 0.091321 0.211869 inq.last.6mths -0.033640 | | -0 01 | 2512 - |
| <pre>days.with.cr.line 0.046220 - 0.009318 revol.bal 0.072316 0.005785 revol.util 0.211869 inq.last.6mths -0.033640 -</pre> | | -0.01 | .2312 |
| 0.009318 revol.bal 0.072316 0.005785 revol.util 0.091321 0.211869 inq.last.6mths -0.033640 - | | 0.04 | - |
| revol.bal 0.072316 0.005785 0.091321 0.211869 -0.033640 - | • | 0.0. | |
| 0.005785 revol.util 0.091321 0.211869 inq.last.6mths -0.033640 - | | 0.07 | 2316 |
| 0.211869 inq.last.6mths -0.033640 - | | | |
| inq.last.6mths -0.033640 - | revol.util | 0.09 | 1321 |
| | 0.211869 | | |
| 0.044240 | | -0.03 | 33640 - |
| | 0.044240 | | |

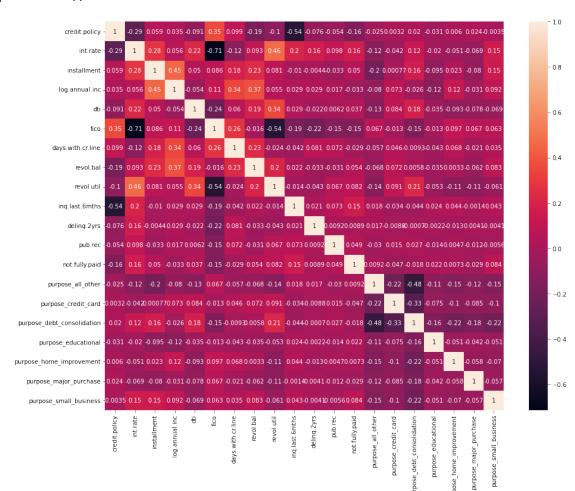
| delinq.2yrs 0.000697 | -0.008817 | - |
|--|-----------------|---|
| pub.rec | 0.014842 | |
| 0.026845 not.fully.paid | -0.047136 | _ |
| 0.017543 | | |
| purpose_all_other 0.475848 | -0.220935 | - |
| <pre>purpose_credit_card 0.326850</pre> | 1.000000 | - |
| <pre>purpose_debt_consolidation 1.000000</pre> | -0.326850 | |
| <pre>purpose_educational 0.161698</pre> | -0.075076 | - |
| <pre>purpose_home_improvement 0.222441</pre> | -0.103279 | - |
| purpose_major_purchase 0.183451 | -0.085176 | - |
| purpose_small_business 0.220542 | -0.102397 | - |
| nurna | ose_educational | |
| <pre>purpose_home_improvement \</pre> | _ | |
| credit.policy 0.006036 | -0.031346 | |
| int.rate | -0.019618 | - |
| 0.050697 installment | -0.094510 | |
| 0.023024 log.annual.inc | -0.119799 | |
| 0.116375 | | |
| dti 0.092788 | -0.035325 | - |
| fico 0.097474 | -0.013012 | |
| days.with.cr.line 0.068087 | -0.042621 | |
| revol.bal 0.003258 | -0.034743 | |
| revol.util | -0.053128 | - |
| 0.114449 inq.last.6mths | 0.024243 | |
| 0.043827 deling.2yrs | -0.002214 | - |
| 0.013098 pub.rec | -0.013521 | |
| 0.004704 not.fully.paid | 0.021609 | |
| 0.007272 purpose_all_other | -0.109300 | - |
| | | |

| 0.150359 | | |
|---|------------------------|---|
| <pre>purpose_credit_card 0.103279</pre> | -0.075076 | - |
| <pre>purpose_debt_consolidation</pre> | -0.161698 | - |
| 0.222441 purpose_educational | 1.000000 | - |
| 0.051094 purpose_home_improvement | -0.051094 | |
| <pre>1.000000 purpose_major_purchase</pre> | -0.042138 | - |
| 0.057967 purpose_small_business | -0.050658 | _ |
| 0.069687 | | |
| | purpose_major_purchase | |
| <pre>purpose_small_business credit.policy</pre> | 0.024281 | - |
| 0.003511 int.rate | -0.068978 | |
| 0.151247 installment | -0.079836 | |
| 0.145654 log.annual.inc | -0.031020 | |
| 0.091540 dti | -0.077719 | _ |
| 0.069245 fico | 0.067129 | |
| 0.063292 | | |
| days.with.cr.line 0.034883 | -0.020561 | |
| revol.bal 0.083069 | -0.062395 | |
| revol.util 0.060962 | -0.108079 | - |
| inq.last.6mths | -0.001445 | |
| 0.042567 delinq.2yrs | 0.004085 | - |
| 0.004148 pub.rec | -0.011734 | _ |
| 0.005595 not.fully.paid | -0.028580 | |
| 0.084460 | | |
| purpose_all_other 0.149076 | -0.124004 | - |
| <pre>purpose_credit_card 0.102397</pre> | -0.085176 | - |
| purpose_debt_consolidation 0.220542 | -0.183451 | - |
| purpose_educational | -0.042138 | - |
| 0.050658 | | |

```
purpose_home_improvement -0.057967 -
0.069687
purpose_major_purchase 1.000000 -
0.057472
purpose_small_business -0.057472
1.000000
```

Corelation Heatmap before splitting

```
plt.figure(figsize = (15,12))
sns.heatmap(data = data.corr(), annot = True)
plt.show()
```



Splitting data

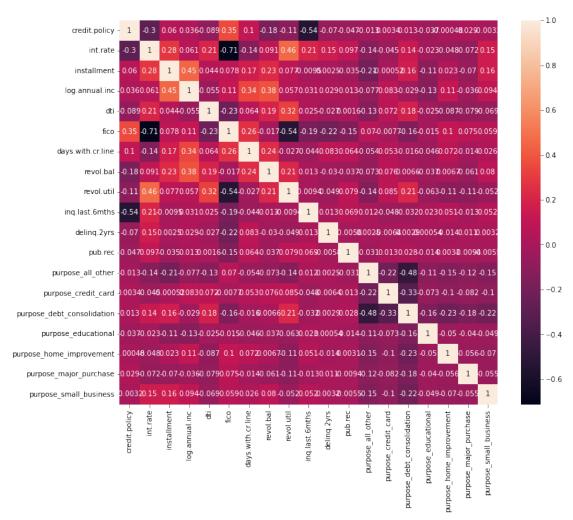
```
X = data.drop("not.fully.paid", axis = 1)
y = data["not.fully.paid"]
```

from sklearn.model selection import train test split

```
X_train, X_test, y_train, y_test = train_test_split(X, y, test_size =
0.3, random_state = 4)
```

Corelation Heatmap after data split

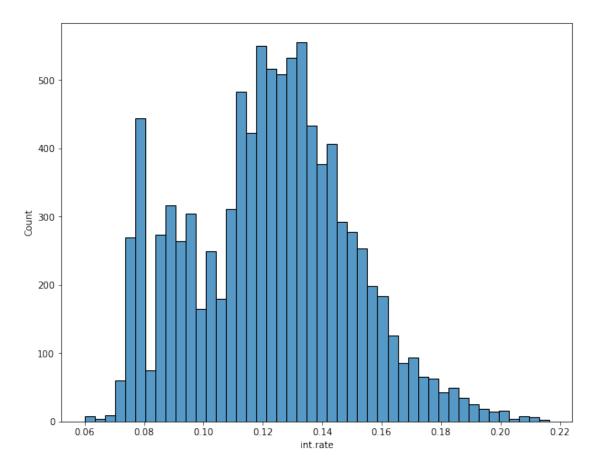
```
plt.figure(figsize = (12,10))
sns.heatmap(data = X_train.corr(), annot = True)
plt.show()
```



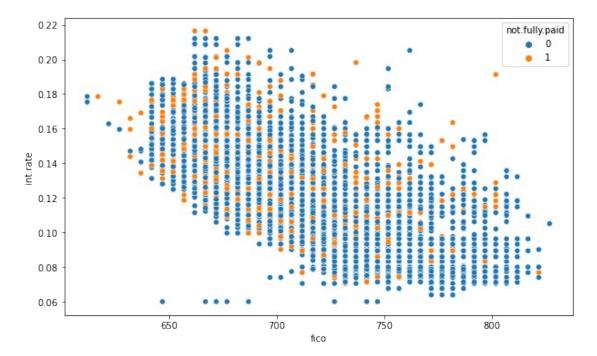
from the correlation heatmaps we can observe that no two features have positive corelation of more than 0.7, so we will not remove any feature.

EDA

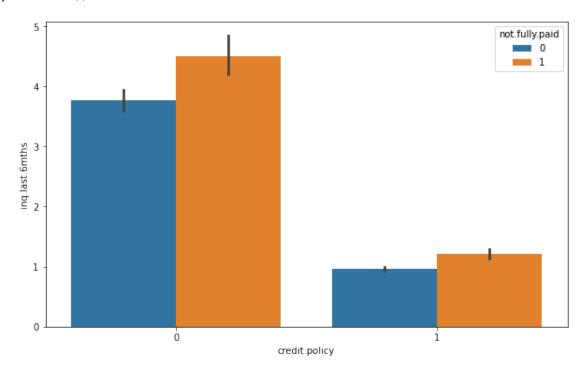
```
plt.figure(figsize = (10,8))
sns.histplot(data = data, x = "int.rate")
plt.show()
```



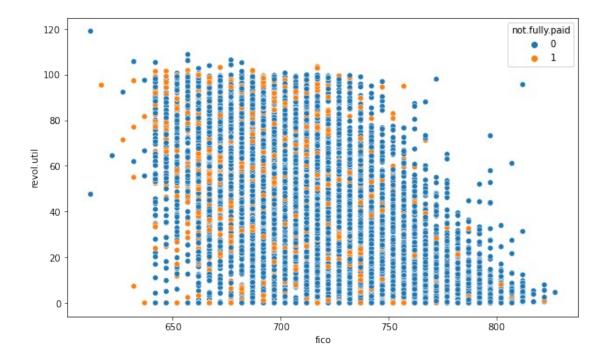
```
plt.figure(figsize = (10,6))
sns.scatterplot(data = data, x = "fico", y = "int.rate", hue =
"not.fully.paid")
plt.show()
```



plt.figure(figsize = (10, 6))
sns.barplot(data = data, x = "credit.policy", y = "inq.last.6mths",
hue = "not.fully.paid")
plt.show()



```
plt.figure(figsize = (10, 6))
sns.scatterplot(data = data, x = "fico", y = "revol.util", hue =
"not.fully.paid")
plt.show()
```



Feature Scaling

```
from sklearn.preprocessing import StandardScaler
sc = StandardScaler()
X train = sc.fit transform(X train)
X test = sc.transform(X test)
print(X train.shape , X test.shape)
(6704, 19) (2874, 19)
import tensorflow as tf
from tensorflow.keras.models import Sequential
from tensorflow.keras.layers import Dense, BatchNormalization, Dropout
from tensorflow.keras.optimizers import Adam
from tensorflow.keras.callbacks import EarlyStopping
Building Model, Defining Model architecture
model = Sequential()
model.add(Dense(units = 128,
               activation = 'relu',
               input shape = (X train.shape[1],)))
model.add(BatchNormalization())
model.add(Dropout(0.2, seed = 123))
model.add(Dense(units = 64,
               activation = 'tanh'))
model.add(BatchNormalization())
model.add(Dropout(0.2, seed = 123))
```

mode c. Summar y ()

Model: "sequential"

| Layer (type) | Output Shape | Param # |
|--|--------------|---------|
| dense (Dense) | (None, 128) | 2560 |
| <pre>batch_normalization (BatchN ormalization)</pre> | (None, 128) | 512 |
| dropout (Dropout) | (None, 128) | 0 |
| dense_1 (Dense) | (None, 64) | 8256 |
| <pre>batch_normalization_1 (Batc hNormalization)</pre> | (None, 64) | 256 |
| dropout_1 (Dropout) | (None, 64) | 0 |
| dense_2 (Dense) | (None, 32) | 2080 |
| <pre>batch_normalization_2 (Batc hNormalization)</pre> | (None, 32) | 128 |
| dropout_2 (Dropout) | (None, 32) | 0 |
| dense_3 (Dense) | (None, 1) | 33 |
| | | |

Total params: 13,825 Trainable params: 13,377 Non-trainable params: 448

```
Model Training
result = model.fit(X_train, y_train,
           validation data = (X test, y test),
           callbacks = [es],
           epochs = 100)
Epoch 1/100
- accuracy: 0.8128 - val loss: 0.4087 - val accuracy: 0.8497
Epoch 2/100
- accuracy: 0.8346 - val loss: 0.4051 - val accuracy: 0.8497
Epoch 3/100
- accuracy: 0.8349 - val loss: 0.4017 - val accuracy: 0.8497
- accuracy: 0.8356 - val loss: 0.4003 - val accuracy: 0.8497
Epoch 5/100
210/210 [============= ] - 2s 7ms/step - loss: 0.4187
- accuracy: 0.8356 - val loss: 0.4037 - val accuracy: 0.8497
Epoch 6/100
- accuracy: 0.8359 - val loss: 0.3979 - val accuracy: 0.8497
Epoch 7/100
210/210 [============= ] - 2s 9ms/step - loss: 0.4177
- accuracy: 0.8346 - val loss: 0.3960 - val accuracy: 0.8497
Epoch 8/100
- accuracy: 0.8359 - val_loss: 0.4009 - val_accuracy: 0.8497
Epoch 9/100
- accuracy: 0.8364 - val loss: 0.4084 - val accuracy: 0.8497
Epoch 10/100
- accuracy: 0.8346 - val loss: 0.4014 - val accuracy: 0.8497
Epoch 11/100
- accuracy: 0.8352 - val loss: 0.4006 - val accuracy: 0.8497
Epoch 12/100
- accuracy: 0.8349 - val loss: 0.4080 - val accuracy: 0.8368
Epoch 13/100
- accuracy: 0.8356 - val loss: 0.4014 - val accuracy: 0.8497
y pred = model.predict(X test) >=0.5
y pred train = model.predict(X train) >=0.5
```

```
Model testing
from sklearn.metrics import accuracy score, confusion matrix
accuracy score(y pred, y test)
0.8496868475991649
accuracy score(y pred train, y train)
0.8357696897374701
confusion matrix(y pred, y test)
array([[2442, 432],
                0]], dtype=int64)
       [ 0,
confusion matrix(y pred train, y train)
array([[5603, 1101],
                0]], dtype=int64)
       [ 0,
Hyperparameter Tunning
!pip install -q -U keras-tuner
def build model(hp):
    model = Sequential()
    model.add(Dense(units = hp.Int('units', min value = 32, max value
= 1024, step = 16),
                    activation = hp.Choice('actiivation',['relu',
'tanh']),
                   input shape = (X train.shape[1],)))
    model.add(BatchNormalization())
    model.add(Dropout(hp.Float('rate', min value = 0.1, max value =
0.4, step = 0.1), seed = 1234))
    model.add(Dense(units = hp.Int("units", min value = 32, max value
= 128, step = 16),
                   activation = hp.Choice("activation", ["relu",
"tanh"])))
    model.add(BatchNormalization())
    model.add(Dropout(hp.Float("rate",min value = 0.1, max value =
0.4, step = 0.1), seed = 1234))
    model.add(Dense(units = hp.Int("units", min value = 32, max value
= 64, step = 16),
                   activation = hp.Choice("activation", ["relu",
"tanh"])))
    model.add(BatchNormalization())
    model.add(Dropout(hp.Float("rate",min value = 0.1, max value =
0.4, step = 0.1), seed = 1234))
```

```
model.add(Dense(units = 1, activation = "sigmoid"))
   learning rate = hp.Float("learning rate", min value = 0.001,
max value = 0.1, step = 0.01)
   model.compile(optimizer = tf.keras.optimizers.Adam(learning rate),
                loss = "binary crossentropy",
               metrics = ["accuracv"])
   return model
import keras tuner as kt
build model(kt.HyperParameters())
<keras.engine.sequential.Sequential at 0x2fbf0152160>
rtuner = kt.RandomSearch(hypermodel = build model,
   objective='val accuracy',
   max trials=3,
   executions per trial=2,
   overwrite=True,
   directory='my dir',
   project name='diab')
rtuner.search(X train, y train, epochs=2, validation data=(X test,
y test))
Trial 1 Complete [00h 00m 11s]
val accuracy: 0.849686861038208
Best val accuracy So Far: 0.849686861038208
Total elapsed time: 00h 00m 11s
Search: Running Trial #2
Value
                |Best Value So Far |Hyperparameter
528
                1112
                                 lunits
tanh
                Irelu
                                 |actiivation
0.3
                0.1
                                 Irate
relu
                ltanh
                                 lactivation
0.001
                0.021
                                 |learning_rate
Epoch 1/2
0.6121 - accuracy: 0.7321 - val loss: 0.4349 - val accuracy: 0.8399
Epoch 2/2
- accuracy: 0.8143 - val loss: 0.4411 - val accuracy: 0.8278
Epoch 1/2
210/210 [============ ] - 10s 37ms/step - loss:
0.6109 - accuracy: 0.7443 - val loss: 0.4287 - val accuracy: 0.8452
Epoch 2/2
```

```
101/210 [=========>.....] - ETA: 3s - loss: 0.4858 -
accuracy: 0.8103

models = rtuner.get_best_models(num_models=2)

models[1].summary()

y_predh = models[1].predict(X_test) >=0.5
accuracy_score(y_predh, y_test)
```