## taiwan-credit-data-preproc

August 19, 2022

## 1 Taiwan Credit: Data Preprocessing for ML and Neural Network

```
[1]: from google.colab import drive
     drive.mount('/content/gdrive/')
    Drive already mounted at /content/gdrive/; to attempt to forcibly remount, call
    drive.mount("/content/gdrive/", force_remount=True).
[2]: %cd /content/gdrive/MyDrive/Github/ml-blog
    /content/gdrive/MyDrive/Github/ml-blog
[]: !pip install xlrd==1.2.0
     !pip install matplotlib==3.5.3
[3]: import pandas as pd
     import numpy as np
     import matplotlib.pyplot as plt
     import seaborn as sns
     import os
     import xlrd
     filename = 'default of credit card clients.xls'
     DATA = os.path.relpath('/content/gdrive/MyDrive/Github/ml-blog/credit/data/' +u
      ⇔filename)
     df = pd.read_excel(DATA, 'Data', index_col=[0], header=[1], na_values='NA')
     df.head()
[3]:
         LIMIT_BAL SEX EDUCATION MARRIAGE AGE PAY_0 PAY_2 PAY_3 PAY_4 \
     ID
                                                       2
     1
                                                              2
             20000
                                           1
                                               24
                                                                     -1
                                                                            -1
            120000
                                 2
                                           2
                                               26
                                                               2
     2
                                                      -1
                                                                      0
                                                                             0
     3
             90000
                      2
                                               34
                                                       0
                                                               0
                                                                      0
                                                                             0
             50000
                                 2
     4
                      2
                                           1
                                               37
                                                       0
                                                              0
                                                                      0
                                                                             0
     5
             50000
                      1
                                 2
                                           1
                                               57
                                                               0
                                                                     -1
                                                                             0
                                                      -1
```

```
ID
                                                               0
            -2
                            0
                                        0
                                                                        689
                                                                                     0
     1
     2
             0
                         3272
                                     3455
                                                 3261
                                                               0
                                                                       1000
                                                                                 1000
     3
                        14331
                                                            1518
                                                                       1500
                                                                                 1000
             0
                                    14948
                                                15549
     4
             0
                        28314
                                    28959
                                                29547
                                                            2000
                                                                       2019
                                                                                 1200
     5
             0
                        20940
                                                            2000
                                    19146
                                                19131
                                                                     36681
                                                                                10000
         PAY AMT4
                   PAY_AMT5 PAY_AMT6 default payment next month
     ID
     1
                0
                           0
                                      0
                                                                     1
     2
                                                                    1
             1000
                           0
                                   2000
     3
                                   5000
                                                                    0
             1000
                        1000
     4
             1100
                        1069
                                   1000
                                                                    0
                                    679
                                                                    0
     5
             9000
                         689
     [5 rows x 24 columns]
[4]: X = df.iloc[:, :23]
     Y = df.iloc[:, 23]
     X.head(), Y.head()
[4]: (
          LIMIT_BAL SEX EDUCATION MARRIAGE AGE PAY_O PAY_2 PAY_3 PAY_4 \
      ID
      1
              20000
                        2
                                    2
                                               1
                                                   24
                                                            2
                                                                   2
                                                                          -1
                                                                                 -1
                                    2
      2
             120000
                        2
                                               2
                                                   26
                                                           -1
                                                                   2
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      3
              90000
                        2
                                    2
                                               2
                                                   34
                                                            0
                                                                   0
                                                                           0
                                                                                  0
      4
              50000
                        2
                                    2
                                               1
                                                   37
                                                            0
                                                                   0
                                                                           0
                                                                                  0
      5
              50000
                        1
                                    2
                                               1
                                                   57
                                                           -1
                                                                   0
                                                                          -1
                                                                                  0
          PAY 5 ... BILL AMT3 BILL AMT4 BILL AMT5 BILL AMT6 PAY AMT1
      ID
      1
             -2
                           689
                                         0
                                                     0
                                                                 0
                                                                            0
                 •••
      2
              0
                          2682
                                      3272
                                                  3455
                                                              3261
                                                                            0
      3
              0
                         13559
                                     14331
                                                 14948
                                                             15549
                                                                         1518
      4
              0
                         49291
                                     28314
                                                 28959
                                                             29547
                                                                         2000
      5
              0
                                     20940
                                                                         2000
                         35835
                                                 19146
                                                             19131
          PAY_AMT2 PAY_AMT3 PAY_AMT4 PAY_AMT5 PAY_AMT6
      ID
                689
                            0
                                       0
                                                  0
                                                             0
      1
      2
              1000
                         1000
                                    1000
                                                  0
                                                          2000
                                    1000
      3
              1500
                         1000
                                               1000
                                                          5000
      4
              2019
                         1200
                                    1100
                                               1069
                                                          1000
      5
                                    9000
             36681
                        10000
                                                689
                                                           679
```

PAY 5 ... BILL AMT4 BILL AMT5 BILL AMT6 PAY AMT1 PAY AMT2 PAY AMT3 \

```
[5 rows x 23 columns], ID
       1
      2
           1
       3
           0
      4
           0
      5
      Name: default payment next month, dtype: int64)
[10]: from sklearn.compose import ColumnTransformer
      from sklearn.preprocessing import StandardScaler, OneHotEncoder
[18]: ohe cols = ['SEX', 'EDUCATION', 'MARRIAGE', 'PAY 0', 'PAY 2', 'PAY 3',
                  'PAY_4', 'PAY_5', 'PAY_6']
      num_cols = ['LIMIT_BAL', 'AGE', 'BILL_AMT1', 'BILL_AMT2', 'BILL_AMT3', "
       'BILL_AMT5', 'BILL_AMT6', 'PAY_AMT1', 'PAY_AMT2', 'PAY_AMT3',
                  'PAY_AMT4', 'PAY_AMT5', 'PAY_AMT6']
[24]: column_transform = ColumnTransformer(
          [('category', OneHotEncoder(handle_unknown='ignore'), ohe_cols),
           ('nums', StandardScaler(), num_cols)],
           remainder='drop')
[25]: column transform.fit(X)
[25]: ColumnTransformer(transformers=[('category',
                                       OneHotEncoder(handle_unknown='ignore'),
                                       ['SEX', 'EDUCATION', 'MARRIAGE', 'PAY_O',
                                        'PAY_2', 'PAY_3', 'PAY_4', 'PAY_5',
                                        'PAY_6']),
                                      ('nums', StandardScaler(),
                                       ['LIMIT_BAL', 'AGE', 'BILL_AMT1', 'BILL_AMT2',
                                        'BILL_AMT3', 'BILL_AMT4', 'BILL_AMT5',
                                        'BILL_AMT6', 'PAY_AMT1', 'PAY_AMT2',
                                        'PAY AMT3', 'PAY AMT4', 'PAY AMT5',
                                        'PAY AMT6'])])
[26]: column_transform.get_feature_names_out()
[26]: array(['category SEX 1', 'category SEX 2', 'category EDUCATION 0',
             'category__EDUCATION_1', 'category__EDUCATION_2',
             'category_EDUCATION_3', 'category_EDUCATION_4',
             'category_EDUCATION_5', 'category_EDUCATION_6',
             'category__MARRIAGE_0', 'category__MARRIAGE_1',
             'category__MARRIAGE_2', 'category__MARRIAGE_3',
             'category__PAY_0_-2', 'category__PAY_0_-1', 'category__PAY_0_0',
```

```
'category__PAY_0_4', 'category__PAY_0_5', 'category__PAY_0 6',
             'category_PAY_0_7', 'category_PAY_0_8', 'category_PAY_2_-2',
             'category__PAY_2_-1', 'category__PAY_2_0', 'category__PAY_2_1',
             'category PAY 2 2', 'category PAY 2 3', 'category PAY 2 4',
             'category_PAY_2_5', 'category_PAY_2_6', 'category_PAY_2_7',
             'category__PAY_2_8', 'category__PAY_3_-2', 'category__PAY_3_-1',
             'category_PAY_3_0', 'category_PAY_3_1', 'category_PAY_3_2',
             'category_PAY_3_3', 'category_PAY_3_4', 'category_PAY_3_5',
             'category_PAY_3_6', 'category_PAY_3_7', 'category_PAY_3_8',
             'category__PAY_4_-2', 'category__PAY_4_-1', 'category__PAY_4_0',
             'category_PAY_4_1', 'category_PAY_4_2', 'category_PAY_4_3',
             'category_PAY_4_4', 'category_PAY_4_5', 'category_PAY_4_6',
             'category__PAY_4_7', 'category__PAY_4_8', 'category__PAY_5_-2',
             'category_ PAY_5_-1', 'category_ PAY_5_0', 'category_ PAY_5_2',
             'category__PAY_5_3', 'category__PAY_5_4', 'category__PAY_5_5',
             'category_PAY_5_6', 'category_PAY_5_7', 'category_PAY_5_8',
             'category__PAY_6_-2', 'category__PAY_6_-1', 'category__PAY_6_0',
             'category__PAY_6_2', 'category__PAY_6_3', 'category__PAY_6_4',
             'category_PAY_6_5', 'category_PAY_6_6', 'category_PAY_6_7',
             'category_PAY_6_8', 'nums__LIMIT_BAL', 'nums__AGE',
             'nums__BILL_AMT1', 'nums__BILL_AMT2', 'nums__BILL_AMT3',
             'nums__BILL_AMT4', 'nums__BILL_AMT5', 'nums__BILL_AMT6',
             'nums PAY AMT1', 'nums PAY AMT2', 'nums PAY AMT3',
             'nums__PAY_AMT4', 'nums__PAY_AMT5', 'nums__PAY_AMT6'], dtype=object)
[27]: X_prep = pd.DataFrame(column_transform.transform(X).toarray(),
       Golumns=column_transform.get_feature_names_out(), index=X.index
[30]: X_prep.head()
[30]:
         category_SEX_1 category_SEX_2 category_EDUCATION_0 \
      ID
      1
                     0.0
                                      1.0
                                                             0.0
      2
                     0.0
                                      1.0
                                                             0.0
                                                             0.0
      3
                     0.0
                                      1.0
      4
                     0.0
                                      1.0
                                                             0.0
      5
                                      0.0
                     1.0
                                                             0.0
         category_EDUCATION_1 category_EDUCATION_2 category_EDUCATION_3 \
      ID
                           0.0
      1
                                                  1.0
                                                                         0.0
                           0.0
                                                                         0.0
      2
                                                  1.0
      3
                           0.0
                                                  1.0
                                                                         0.0
      4
                           0.0
                                                                         0.0
                                                  1.0
      5
                           0.0
                                                  1.0
                                                                         0.0
```

'category PAY 0 1', 'category PAY 0 2', 'category PAY 0 3',

```
category EDUCATION 4 category EDUCATION 5 category EDUCATION 6 \
ID
1
                      0.0
                                             0.0
                                                                    0.0
2
                      0.0
                                             0.0
                                                                    0.0
3
                      0.0
                                             0.0
                                                                    0.0
4
                      0.0
                                             0.0
                                                                    0.0
5
                      0.0
                                             0.0
                                                                    0.0
    category_MARRIAGE_0 ... nums_BILL_AMT3 nums_BILL_AMT4 \
ID
                     0.0
1
                                   -0.667993
                                                    -0.672497
2
                     0.0 ...
                                   -0.639254
                                                    -0.621636
                                   -0.482408
3
                     0.0 ...
                                                    -0.449730
4
                     0.0 ...
                                   0.032846
                                                    -0.232373
5
                     0.0 ...
                                                    -0.346997
                                   -0.161189
    nums BILL AMT5 nums BILL AMT6 nums PAY AMT1 nums PAY AMT2 \
ID
          -0.663059
                                           -0.341942
1
                           -0.652724
                                                           -0.227086
2
          -0.606229
                           -0.597966
                                           -0.341942
                                                           -0.213588
3
          -0.417188
                                           -0.250292
                           -0.391630
                                                           -0.191887
          -0.186729
4
                                           -0.221191
                           -0.156579
                                                           -0.169361
5
          -0.348137
                           -0.331482
                                           -0.221191
                                                            1.335034
    nums_PAY_AMT3 nums_PAY_AMT4 nums_PAY_AMT5 nums_PAY_AMT6
ID
1
         -0.296801
                         -0.308063
                                         -0.314136
                                                         -0.293382
2
         -0.240005
                         -0.244230
                                         -0.314136
                                                         -0.180878
                                         -0.248683
3
         -0.240005
                         -0.244230
                                                         -0.012122
         -0.228645
                         -0.237846
                                                         -0.237130
                                         -0.244166
5
          0.271165
                         0.266434
                                         -0.269039
                                                         -0.255187
```

[5 rows x 91 columns]

## [31]: X\_prep.info()

<class 'pandas.core.frame.DataFrame'>
Int64Index: 30000 entries, 1 to 30000
Data columns (total 91 columns):

#	Column	Non-Null Count	Dtype
0	categorySEX_1	30000 non-null	float64
1	categorySEX_2	30000 non-null	float64
2	categoryEDUCATION_O	30000 non-null	float64
3	categoryEDUCATION_1	30000 non-null	float64
4	categoryEDUCATION_2	30000 non-null	float64
5	categoryEDUCATION_3	30000 non-null	float64
6	categoryEDUCATION_4	30000 non-null	float64

```
7
                           30000 non-null
    category_EDUCATION_5
                                           float64
8
    category__EDUCATION_6
                           30000 non-null
                                           float64
9
    category__MARRIAGE_0
                           30000 non-null
                                           float64
10
    category__MARRIAGE_1
                           30000 non-null
                                           float64
    category MARRIAGE 2
11
                           30000 non-null
                                           float64
    category__MARRIAGE_3
12
                           30000 non-null
                                           float64
    category__PAY_0_-2
                           30000 non-null
                                           float64
14
    category__PAY_0_-1
                           30000 non-null
                                           float64
15
   category__PAY_0_0
                           30000 non-null
                                           float64
16
    category__PAY_0_1
                           30000 non-null
                                           float64
    category_PAY_0_2
17
                           30000 non-null
                                           float64
    category__PAY_0_3
                           30000 non-null
18
                                           float64
    category__PAY_0_4
                           30000 non-null
19
                                           float64
20
    category__PAY_0_5
                           30000 non-null
                                           float64
21
    category__PAY_0_6
                           30000 non-null
                                           float64
                           30000 non-null
22
   category__PAY_0_7
                                           float64
23
    category__PAY_0_8
                           30000 non-null
                                           float64
24
   category__PAY_2_-2
                           30000 non-null
                                           float64
25
    category__PAY_2_-1
                           30000 non-null
                                           float64
26
    category PAY 2 0
                           30000 non-null float64
27
    category__PAY_2_1
                           30000 non-null
                                           float64
28
    category__PAY_2_2
                           30000 non-null float64
29
    category__PAY_2_3
                           30000 non-null float64
                           30000 non-null float64
30
    category__PAY_2_4
31
   category__PAY_2_5
                           30000 non-null float64
32
    category__PAY_2_6
                           30000 non-null
                                           float64
    category__PAY_2_7
                           30000 non-null
33
                                           float64
34
    category__PAY_2_8
                           30000 non-null
                                           float64
35
    category__PAY_3_-2
                           30000 non-null
                                           float64
36
    category__PAY_3_-1
                           30000 non-null
                                           float64
37
    category__PAY_3_0
                           30000 non-null
                                           float64
38
    category__PAY_3_1
                           30000 non-null
                                           float64
39
    category__PAY_3_2
                           30000 non-null
                                           float64
    category__PAY_3_3
                           30000 non-null float64
40
41
    category PAY 3 4
                           30000 non-null
                                           float64
42
    category__PAY_3_5
                           30000 non-null float64
43
    category__PAY_3_6
                           30000 non-null float64
44
    category__PAY_3_7
                           30000 non-null
                                           float64
45
   category__PAY_3_8
                           30000 non-null
                                           float64
46
    category__PAY_4_-2
                           30000 non-null float64
    category__PAY_4_-1
47
                           30000 non-null float64
    category__PAY_4_0
                           30000 non-null
48
                                           float64
49
    category__PAY_4_1
                           30000 non-null
                                           float64
50
    category_PAY_4_2
                           30000 non-null
                                           float64
51
    category__PAY_4_3
                           30000 non-null
                                           float64
    category__PAY_4_4
52
                           30000 non-null
                                           float64
53
    category__PAY_4_5
                           30000 non-null
                                           float64
54
   category__PAY_4_6
                           30000 non-null float64
```

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57
          category__PAY_5_-2
                                 30000 non-null
                                                  float64
          category__PAY_5_-1
                                 30000 non-null
      58
                                                  float64
          category PAY 5 0
                                 30000 non-null
      59
                                                 float64
          category__PAY_5_2
                                 30000 non-null
      60
                                                 float64
      61
          category__PAY_5_3
                                 30000 non-null float64
      62
          category__PAY_5_4
                                 30000 non-null float64
          category__PAY_5_5
                                 30000 non-null float64
      63
      64
          category__PAY_5_6
                                 30000 non-null
                                                 float64
          category__PAY_5_7
      65
                                  30000 non-null
                                                 float64
          category_PAY_5_8
                                 30000 non-null
      66
                                                  float64
          category__PAY_6_-2
      67
                                 30000 non-null
                                                  float64
          category__PAY_6_-1
                                  30000 non-null
      68
                                                  float64
      69
          category__PAY_6_0
                                  30000 non-null
                                                 float64
      70
          category__PAY_6_2
                                 30000 non-null float64
      71
          category__PAY_6_3
                                  30000 non-null
                                                 float64
      72
          category__PAY_6_4
                                 30000 non-null float64
      73
          category__PAY_6_5
                                 30000 non-null float64
          category__PAY_6_6
      74
                                 30000 non-null float64
          category__PAY_6_7
      75
                                  30000 non-null float64
          category__PAY_6_8
                                  30000 non-null float64
      76
      77
          nums__LIMIT_BAL
                                 30000 non-null float64
      78
          nums__AGE
                                  30000 non-null float64
      79
          nums__BILL_AMT1
                                  30000 non-null float64
          nums__BILL_AMT2
                                 30000 non-null
      80
                                                 float64
          nums__BILL_AMT3
                                 30000 non-null
      81
                                                 float64
          nums__BILL_AMT4
      82
                                  30000 non-null
                                                  float64
          nums__BILL_AMT5
      83
                                  30000 non-null
                                                  float64
      84
          nums__BILL_AMT6
                                 30000 non-null float64
          nums__PAY_AMT1
      85
                                  30000 non-null float64
      86
          nums__PAY_AMT2
                                  30000 non-null float64
          nums__PAY_AMT3
      87
                                 30000 non-null float64
      88
          nums__PAY_AMT4
                                 30000 non-null float64
          nums PAY AMT5
                                 30000 non-null float64
      90 nums__PAY_AMT6
                                 30000 non-null float64
     dtypes: float64(91)
     memory usage: 21.1 MB
[33]: | X_prep.to_csv('./credit/data/taiwan-credit-col-transform-X.csv', header=True)
```

30000 non-null

30000 non-null

float64

float64

55

56

[]:

category\_\_PAY\_4\_7

category\_PAY\_4\_8