1_Create_Training_Dataset

May 3, 2021

```
[1]: import modin.pandas as pd
[2]: col_names = pd.read_csv('./DATA/columns.csv', sep='\t')
     col_names.head()
    UserWarning: Ray execution environment not yet initialized. Initializing...
    To remove this warning, run the following python code before doing dataframe
    operations:
        import ray
        ray.init()
[2]:
                                                       Orig \
     0
                                               Credit Score
     1
                                        First Payment Date
     2
                                 First Time Homebuyer Flag
     3
                                              Maturity Date
       Metropolitan Statistical Area (MSA) Or Metropo...
                                    Svcg
     0
                   Loan Sequence Number
     1
               Monthly Reporting Period
                     Current Actual UPB
     2
     3 Current Loan Delinquency Status
     4
                                Loan Age
[3]: orig_prefix = './DATA/sample_orig_'
     svcg_prefix = './DATA/sample_svcg_'
     years = [y \text{ for } y \text{ in } range(2010, 2021)]
[4]: deldf_subs = []
     for year in years:
         print("Retrieving monthly data for loans of year " + str(year))
         month_df = pd.read_csv(svcg_prefix+str(year)+'.
      →txt',sep='|',names=list(col_names['Svcg']))
         tf1 = month_df['Loan Age'] < 12
```

```
tf2 = month_df['Delinquency Due to Disaster'] != 'Y'
  tf3 = ~month_df['Current Loan Delinquency Status'].isin(['R','XX','
                                                                          '])
  tf = tf1 & tf2 & tf3
  month_df = month_df[tf].copy()
  month_df['Current Loan Delinquency Status'] = month_df['Current Loan⊔
→Delinquency Status'].astype(int)
   agg dict = {'Current Loan Delinquency Status':sum,
           'Monthly Reporting Period': 'count'}
  deldf_sub = month_df.groupby('Loan Sequence Number').agg(agg_dict)
   col_dct = {'Monthly Reporting Period':'NumMonths'}
  deldf_sub.reset_index(inplace=True)
  deldf_sub.rename(columns=col_dct, inplace=True)
  deldf_sub = deldf_sub[deldf_sub['NumMonths'] == 12].copy()
   if len(deldf_sub) == 0:
       continue
  deldf sub['Loan Deliquency Within Year'] = True
  tf = deldf sub['Current Loan Delinquency Status'] == 0
  deldf_sub.loc[tf, 'Loan Deliquency Within Year'] = False
   deldf_subs.append(deldf_sub)
```

```
Retrieving monthly data for loans of year 2010
Retrieving monthly data for loans of year 2011
Retrieving monthly data for loans of year 2012
Retrieving monthly data for loans of year 2013
Retrieving monthly data for loans of year 2014
Retrieving monthly data for loans of year 2015
Retrieving monthly data for loans of year 2016
Retrieving monthly data for loans of year 2016
Retrieving monthly data for loans of year 2017
Retrieving monthly data for loans of year 2018
Retrieving monthly data for loans of year 2019
Retrieving monthly data for loans of year 2020
```

UserWarning: `DataFrame.copy` for empty DataFrame defaulting to pandas implementation.

To request implementation, send an email to feature_requests@modin.org.
UserWarning: Distributing <class 'pandas.core.frame.DataFrame'> object. This may take some time.

```
[5]: delinq_df = pd.concat(deldf_subs)[['Loan Sequence Number','Loan Deliquency

→Within Year']]

delinq_df.head()
```

```
[5]:
      Loan Sequence Number Loan Deliquency Within Year
               F110Q1000008
     0
                                                    False
    2
               F110Q1000064
                                                    False
     3
               F110Q1000072
                                                    False
     4
               F110Q1000080
                                                    False
               F110Q1000096
                                                    False
[6]: orig_subs = []
     for year in years:
         print("Retrieving origination data for loans of year " + str(year))
         orig_sub = pd.read_csv(orig_prefix+str(year)+'.
      dtxt',sep='|',names=list(col_names['Orig']))
         orig_subs.append(orig_sub)
    Retrieving origination data for loans of year 2010
    Retrieving origination data for loans of year 2011
    Retrieving origination data for loans of year 2012
    Retrieving origination data for loans of year 2013
    Retrieving origination data for loans of year 2014
    Retrieving origination data for loans of year 2015
    Retrieving origination data for loans of year 2016
    Retrieving origination data for loans of year 2017
    Retrieving origination data for loans of year 2018
    Retrieving origination data for loans of year 2019
    Retrieving origination data for loans of year 2020
[7]: orig df = pd.concat(orig subs)
     orig_df.head()
        Credit Score First Payment Date First Time Homebuyer Flag Maturity Date \
[7]:
     0
                 804
                                  201004
                                                                            204003
                                                                  N
                 786
     1
                                  201004
                                                                  9
                                                                            204003
     2
                                                                  N
                 816
                                  201003
                                                                            204002
     3
                 783
                                                                            204002
                                  201003
                                                                  N
     4
                 667
                                  201003
                                                                            204002
        Metropolitan Statistical Area (MSA) Or Metropolitan Division \
                                                   17860.0
     0
     1
                                                       NaN
     2
                                                   44220.0
     3
                                                   45820.0
     4
                                                   17900.0
        Mortgage Insurance Percentage (MI %) Number of Units Occupancy Status \
     0
                                           0
                                                             1
                                                                              Ρ
                                                                              Р
     1
                                           0
                                                             1
     2
                                           0
                                                             1
                                                                              Ρ
```

```
3
                                              0
                                                                1
     4
                                              0
                                                                                  Ρ
        Original Combined Loan-to-Value (CLTV)
     0
     1
                                               50
     2
                                               56
     3
                                               80
     4
                                               80
                                                   Original Loan Term
        Original Debt-to-Income (DTI) Ratio
     0
                                            20
     1
                                            43
                                                                   360
     2
                                            27
                                                                   360
     3
                                            36
                                                                   360
     4
                                            20
                                                                   360
       Number of Borrowers
                                Seller Name
                                                Servicer Name Super Conforming Flag \
     0
                          2
                             Other sellers
                                               U.S. BANK N.A.
     1
                             Other sellers
                                             Other servicers
                                                                                  NaN
     2
                             Other sellers
                                              Other servicers
                                                                                  NaN
     3
                          2 Other sellers
                                               U.S. BANK N.A.
                                                                                  {\tt NaN}
     4
                             Other sellers Other servicers
                                                                                  {\tt NaN}
       Pre-HARP Loan Sequence Number Program Indicator HARP Indicator
     0
                                   NaN
                                                                        NaN
                                                        9
     1
                                   NaN
                                                                        NaN
     2
                                   NaN
                                                        9
                                                                        NaN
                                                        9
     3
                                   NaN
                                                                        NaN
     4
                                                        9
                                   NaN
                                                                        NaN
        Property Valuation Method Interest Only (I/O) Indicator
     0
                                  9
     1
                                                                 NaN
     2
                                  9
                                                                 NaN
     3
                                  9
                                                                 NaN
                                                                 NaN
     [5 rows x 31 columns]
[8]: delinq_df['Loan Sequence Number'].nunique()
[8]: 396338
     orig_df['Loan Sequence Number'].nunique()
[9]: 525000
```

```
[10]: training_dat = delinq_df.merge(orig_df, on='Loan Sequence Number', how='left')
      training_dat.head()
        Loan Sequence Number Loan Deliquency Within Year
                                                             Credit Score
[10]:
                F110Q1000008
      0
                                                      False
                                                                       804
      1
                F110Q1000064
                                                      False
                                                                       816
      2
                F110Q1000072
                                                      False
                                                                       783
      3
                F110Q1000080
                                                      False
                                                                       667
                F110Q1000096
                                                                       799
                                                      False
         First Payment Date First Time Homebuyer Flag Maturity Date \
                      201004
                                                      N
                                                                 204003
      0
                      201003
                                                      N
                                                                 204002
      1
                      201003
                                                      N
                                                                 204002
      2
      3
                      201003
                                                      N
                                                                 204002
      4
                      201003
                                                      N
                                                                 204002
         Metropolitan Statistical Area (MSA) Or Metropolitan Division \
      0
                                                     17860.0
      1
                                                     44220.0
      2
                                                     45820.0
      3
                                                     17900.0
                                                         NaN
         Mortgage Insurance Percentage (MI %)
                                                Number of Units Occupancy Status
      0
                                              0
                                                                1
                                                                                 Ρ
                                                                                 Ρ
      1
                                              0
                                                                1
      2
                                              0
                                                                1
                                                                                 Ρ
                                                                                 Ρ
      3
                                              0
                                                                1
      4
                                              0
                                                                1
                                                                                 Ρ
            Original Loan Term Number of Borrowers
                                                        Seller Name
      0
                            360
                                                   2 Other sellers
                            360
                                                   1 Other sellers
      1
                            360
                                                   2 Other sellers
      2
                                                      Other sellers
      3
                            360
                                                      Other sellers
                            360
           Servicer Name Super Conforming Flag Pre-HARP Loan Sequence Number \
      0
          U.S. BANK N.A.
                                             NaN
                                                                            NaN
      1 Other servicers
                                             NaN
                                                                            NaN
          U.S. BANK N.A.
                                             NaN
                                                                            NaN
      3 Other servicers
                                             NaN
                                                                            NaN
          U.S. BANK N.A.
                                             NaN
                                                                            NaN
        Program Indicator HARP Indicator Property Valuation Method \
      0
                                      NaN
```

```
1
      2
                        9
                                     NaN
                                                                  9
      3
                        9
                                                                  9
                                     NaN
                        9
      4
                                     NaN
        Interest Only (I/O) Indicator
      0
      1
                                  NaN
      2
                                  NaN
      3
                                  NaN
      4
                                  NaN
      [5 rows x 32 columns]
[11]: len(training_dat)
[11]: 396338
[12]: training_dat['Loan Deliquency Within Year'].value_counts()
     UserWarning: value_counts defaulting to pandas implementation.
[12]: False
               387901
      True
                 8437
      Name: Loan Deliquency Within Year, dtype: int64
[13]: training_dat['Program Indicator'] = training_dat['Program Indicator'].
       →astype(str)
[15]: training_dat.to_pickle('./PROCESSED/training_dat.pkl')
     UserWarning: `DataFrame.to_pickle` defaulting to pandas implementation.
     UserWarning: Distributing <class 'pandas.core.frame.DataFrame'> object. This may
     take some time.
 []: # Drop month diff > 12
 []:
```

 ${\tt NaN}$

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