benz project

January 15, 2022

```
[2]:
      import pandas as pd
      df_test=pd.read_csv('test.csv')
     df_train=pd.read_csv('train.csv')
[5]:
     df_test
[5]:
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      [4209 rows x 377 columns]
```

[6]: df_train

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      [4209 rows x 378 columns]
 [7]: y_train=df_train['y'].values
 [8]: y_train
 [8]: array([130.81, 88.53, 76.26, ..., 109.22, 87.48, 110.85])
 [9]: cols = [c for c in df_train.columns if 'X' in c]
      print('Number of features: {}'.format(len(cols)))
      Number of features: 376
[10]: df_train[cols].dtypes.value_counts()
[10]: int64
                  368
                    8
      object
      dtype: int64
[11]: import numpy as np
```

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[12]: counts = [[], [], []]
      for c in cols:
          typ = df_train[c].dtype
          uniq = len(np.unique(df_train[c]))
          if uniq == 1:
              counts[0].append(c)
          elif uniq == 2 and typ == np.int64:
              counts[1].append(c)
          else:
              counts[2].append(c)
[13]: print('Constant features: {} Binary features: {} Categorical features: {}'.
       →format(*[len(c) for c in counts]))
      print('Constant features:', counts[0])
      print('Categorical features:', counts[2])
     Constant features: 12 Binary features: 356 Categorical features: 8
     Constant features: ['X11', 'X93', 'X107', 'X233', 'X235', 'X268', 'X289',
     'X290', 'X293', 'X297', 'X330', 'X347']
     Categorical features: ['X0', 'X1', 'X2', 'X3', 'X4', 'X5', 'X6', 'X8']
[14]: usable_columns = list(set(df_train.columns) - set(['ID', 'y']))
      y_train = df_train['y'].values
      id_test = df_test['ID'].values
      x_train = df_train[usable_columns]
      x_test = df_test[usable_columns]
[15]: def check missing values(df):
          if df.isnull().any().any():
              print("There are missing values in the dataframe")
              print("There are no missing values in the dataframe")
      check_missing_values(x_train)
      check_missing_values(x_test)
     There are no missing values in the dataframe
     There are no missing values in the dataframe
[16]: for column in usable_columns:
          cardinality = len(np.unique(x_train[column]))
          if cardinality == 1:
              x_train.drop(column, axis=1)
              x_test.drop(column, axis=1)
          if cardinality > 2:
              mapper = lambda x: sum([ord(digit) for digit in x])
              x_train[column] = x_train[column].apply(mapper)
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x_test[column] = x_test[column].apply(mapper)
      x_train.head()
     <ipython-input-16-331f1819b51b>:8: SettingWithCopyWarning:
     A value is trying to be set on a copy of a slice from a DataFrame.
     Try using .loc[row_indexer,col_indexer] = value instead
     See the caveats in the documentation: https://pandas.pydata.org/pandas-
     docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
       x_train[column] = x_train[column].apply(mapper)
     <ipython-input-16-331f1819b51b>:9: SettingWithCopyWarning:
     A value is trying to be set on a copy of a slice from a DataFrame.
     Try using .loc[row_indexer,col_indexer] = value instead
     See the caveats in the documentation: https://pandas.pydata.org/pandas-
     docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
       x_test[column] = x_test[column].apply(mapper)
[16]:
         X91
              X283 X66 X341
                               X308 X187 X108 X346
                                                        X51
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      [5 rows x 376 columns]
[17]: print('Feature types:')
      x_train[cols].dtypes.value_counts()
     Feature types:
[17]: int64
               376
      dtype: int64
[18]: from sklearn.decomposition import PCA
[19]: n_{comp} = 12
      pca = PCA(n_components=n_comp, random_state=420)
      pca2_results_train = pca.fit_transform(x_train)
```

```
pca2_results_test = pca.transform(x_test)
[20]: pca2_results_train
[20]: array([[-49.08156207, -4.90948084, -17.25085325, ...,
                                                             1.6580127 ,
                0.93309992,
                            1.67820505],
             [-48.94680383, -7.22674339, -13.7631947, ..., -0.21430878,
                0.10908942, 0.44947029],
             [ 92.62761708, 31.9940341 , -26.17503456, ..., -0.62193667,
                2.92597561, -0.5274524],
             [89.47970814, 20.44554421, 48.11999819, ..., -1.27197787,
              -0.28720258, 2.00793054],
             [ 96.97110845, 31.50977186, 49.20059282, ..., 0.14366082,
              -0.97983972, 0.99197679],
             [-17.21024322, -14.22166025, 55.38091289, ..., -0.28903843,
              -0.31649851, 0.69134356]])
[21]: pca2_results_test
[21]: array([[ 9.22615149e+01, 3.29260839e+01, -3.01130736e+01, ...,
             -4.11416844e-01, 3.62102894e+00, -1.20770031e+00],
             [-3.48622379e+01, 6.87132606e+00, -3.74760829e+01, ...,
              6.09260099e-01, -6.95791780e-01, -4.24922762e-01],
             [ 4.36560426e+01, -5.05939489e+01, -6.10591086e+01, ...,
             -3.20449914e-01, 2.60139386e+00, -1.53758244e+00],
             [-2.52437784e+01, -2.63794193e+01, 5.40742341e+01, ...,
              6.03523571e-01, 2.61335990e-02, 3.66998572e-02],
             [ 4.53823778e+01, -6.38062446e+01, 3.58666036e+01, ...,
             -9.15193005e-01, -6.72301188e-01, 5.15233353e-01],
             [-4.23807477e+01, -2.52862351e+01, 6.10815522e+01, ...,
             -2.98845820e-01, -9.77125995e-01, 5.35472021e-02]])
[22]: import xgboost as xgb
      from sklearn.metrics import r2_score
[23]: from sklearn.model_selection import train_test_split
[24]: |x_train, x_test, y_train, y_test = train_test_split(pca2_results_train,y_train,_
      →test size=0.2,random state=4242)
[25]: d_train = xgb.DMatrix(x_train, label=y_train)
      d_valid = xgb.DMatrix(x_test, label=y_test)
      d_test = xgb.DMatrix(pca2_results_test)
```

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[26]: params = {}
      params['objective'] = 'reg:linear'
      params['eta'] = 0.02
      params['max_depth'] = 4
[27]: def xgb_r2_score(preds, dtrain):
          labels = dtrain.get_label()
          return 'r2', r2_score(labels, preds)
      watchlist = [(d_train, 'train'), (d_valid, 'valid')]
[28]: clf = xgb.train(params, d_train,1000, watchlist,__
       →early_stopping_rounds=50,feval=xgb_r2_score, maximize=True, verbose_eval=10)
     [08:13:03] WARNING: C:/Users/Administrator/workspace/xgboost-
     win64_release_1.5.1/src/objective/regression_obj.cu:188: reg:linear is now
     deprecated in favor of reg:squarederror.
     [0]
             train-rmse:99.14838
                                     train-r2:-58.35295
                                                              valid-rmse:98.26298
     valid-r2:-67.63754
             train-rmse:81.27657
     [10]
                                     train-r2:-38.88428
                                                              valid-rmse:80.36432
     valid-r2:-44.91014
     [20]
             train-rmse:66.71610
                                     train-r2:-25.87403
                                                              valid-rmse:65.77333
     valid-r2:-29.75260
             train-rmse:54.86957
                                     train-r2:-17.17752
                                                              valid-rmse:53.88974
     valid-r2:-19.64401
     [40]
             train-rmse:45.24491
                                     train-r2:-11.35979
                                                              valid-rmse:44.21970
     valid-r2:-12.89996
     [50]
             train-rmse:37.44730
                                     train-r2:-7.46666
                                                              valid-rmse:36.37237
     valid-r2:-8.40428
             train-rmse:31.14750
     [60]
                                     train-r2:-4.85757
                                                              valid-rmse:30.01874
     valid-r2:-5.40571
     [70]
             train-rmse:26.08661
                                     train-r2:-3.10872
                                                              valid-rmse:24.90890
     valid-r2:-3.41053
     [80]
             train-rmse:22.04639
                                     train-r2:-1.93458
                                                              valid-rmse:20.83274
     valid-r2:-2.08514
             train-rmse:18.84412
                                     train-r2:-1.14399
                                                              valid-rmse:17.60176
     [90]
     valid-r2:-1.20239
     Γ1007
             train-rmse:16.33254
                                     train-r2:-0.61057
                                                              valid-rmse:15.08443
     valid-r2:-0.61748
             train-rmse:14.39915
     Γ110]
                                     train-r2:-0.25183
                                                              valid-rmse:13.14876
     valid-r2:-0.22900
     [120]
             train-rmse:12.91704
                                     train-r2:-0.00739
                                                              valid-rmse:11.68509
     valid-r2:0.02939
     [130]
             train-rmse:11.80783
                                     train-r2:0.15819
                                                              valid-rmse:10.61558
     valid-r2:0.19893
             train-rmse:10.98127
                                     train-r2:0.27192
                                                              valid-rmse:9.84689
     valid-r2:0.31074
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[150]
             train-rmse:10.38013
                                     train-r2:0.34946
                                                              valid-rmse:9.31964
     valid-r2:0.38258
                                     train-r2:0.40503
     [160]
             train-rmse:9.92687
                                                              valid-rmse:8.95210
     valid-r2:0.43032
     Γ170]
             train-rmse:9.59379
                                     train-r2:0.44428
                                                              valid-rmse:8.70924
     valid-r2:0.46081
     Γ180]
             train-rmse:9.34597
                                      train-r2:0.47262
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     valid-r2:0.48046
            train-rmse:9.16139
                                     train-r2:0.49325
                                                              valid-rmse:8.44279
     Г190Т
     valid-r2:0.49330
     [200]
             train-rmse:9.02101
                                      train-r2:0.50866
                                                              valid-rmse:8.37317
     valid-r2:0.50162
     [210]
             train-rmse:8.91451
                                                              valid-rmse:8.33436
                                      train-r2:0.52019
     valid-r2:0.50623
     [220]
             train-rmse:8.84139
                                      train-r2:0.52803
                                                              valid-rmse:8.30600
     valid-r2:0.50958
     [230]
             train-rmse:8.77508
                                     train-r2:0.53509
                                                              valid-rmse:8.29487
     valid-r2:0.51089
     [240]
             train-rmse:8.72891
                                      train-r2:0.53996
                                                              valid-rmse:8.28582
     valid-r2:0.51196
     [250]
             train-rmse:8.68671
                                      train-r2:0.54440
                                                              valid-rmse:8.28124
     valid-r2:0.51250
            train-rmse:8.65006
                                     train-r2:0.54824
                                                              valid-rmse:8.27879
     valid-r2:0.51279
     [270]
            train-rmse:8.62073
                                     train-r2:0.55130
                                                              valid-rmse:8.27846
     valid-r2:0.51283
             train-rmse:8.59450
     [280]
                                      train-r2:0.55402
                                                              valid-rmse:8.27990
     valid-r2:0.51266
     [290]
             train-rmse:8.56474
                                      train-r2:0.55711
                                                              valid-rmse:8.27987
     valid-r2:0.51266
                                      train-r2:0.55938
     [300]
             train-rmse:8.54270
                                                              valid-rmse:8.28130
     valid-r2:0.51250
     [310]
             train-rmse:8.51389
                                     train-r2:0.56235
                                                              valid-rmse:8.28044
     valid-r2:0.51260
     [317]
            train-rmse:8.49794
                                     train-r2:0.56399
                                                              valid-rmse:8.28072
     valid-r2:0.51256
[29]: p_test = clf.predict(d_test)
[30]: sub = pd.DataFrame()
      sub['ID'] = id_test
      sub['y'] = p_test
      sub.to_csv('xgb.csv', index=False)
[31]: sub.head()
```

```
[31]: ID y
0 1 82.747520
1 2 97.118401
2 3 83.643776
3 4 77.565765
4 5 111.726906
```