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Курс «Технологии машинного обучения»

Отчёт по лабораторной работе №2

«Обработка пропусков в данных, кодирование категориальных признаков, масштабирование данных»

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Обработка пропусков, кодирование категориальных признаков и масштабирование данных

```
import numpy as np
import pandas as pd
from sklearn.impute import SimpleImputer
from sklearn.preprocessing import MinMaxScaler
import matplotlib.pyplot as plt
```

Обзор данных

```
data = pd.read csv('aug train.csv')
data.shape
(19158, 14)
pd.concat({'Object type':data.dtypes, 'Null
count':data.isnull().sum()}, axis=1)
                        Object type Null count
enrollee id
                              int64
                                              0
city
                             object
                                              0
city development index
                                              0
                            float64
                                           4508
gender
                             object
relevent experience
                             object
                                              0
enrolled university
                                            386
                             object
education level
                             object
                                            460
major_discipline
                                            2813
                             object
experience
                             object
                                             65
                                           5938
                             object
company size
                                           6140
company type
                             object
last new job
                             object
                                            423
training hours
                              int64
                                              0
                                               0
target
                            float64
data.head()
   enrollee id
                     city
                           city_development_index gender \
0
          8949 city 103
                                            0.920
                                                     Male
         29725
                                            0.776
1
                 city_40
                                                     Male
2
         11561
                 city 21
                                             0.624
                                                      NaN
3
                city_115
         33241
                                            0.789
                                                      NaN
4
           666
                city 162
                                            0.767
                                                     Male
       relevent experience enrolled university education level \
0
  Has relevent experience
                                  no enrollment
                                                        Graduate
1
    No relevent experience
                                  no enrollment
                                                        Graduate
2
    No relevent experience
                               Full time course
                                                        Graduate
    No relevent experience
                                                        Graduate
                                            NaN
  Has relevent experience
                                  no enrollment
                                                         Masters
```

```
major discipline experience company size
                                                 company type
last new job
0
               STEM
                            >20
                                          NaN
                                                           NaN
1
1
               STEM
                             15
                                        50-99
                                                       Pvt Ltd
>4
2
               STEM
                                          NaN
                                                           NaN
never
   Business Degree
                             <1
                                          NaN
                                                       Pvt Ltd
never
                            >20
                                        50-99 Funded Startup
4
               STEM
4
   training hours
                    target
0
                36
                        1.0
1
                47
                        0.0
2
                        0.0
                83
3
                52
                        1.0
4
                 8
                        0.0
```

```
Берем колонку 'enrolled_university' для заполнения пустых ячеек
data['enrolled university'].unique()
array(['no enrollment', 'Full time course', nan, 'Part time course'],
      dtype=object)
# количество для каждого значения столба без учета null
nonNullValues =
data['enrolled university'].value counts(ascending=False)
# количество null
nullValues = pd.Series({'nan':
data['enrolled_university'].isnull().sum()})
pd.concat([nonNullValues, nullValues], axis=0)
no enrollment
                    13817
Full time course
                     3757
Part time course
                     1198
                      386
dtype: int64
```

Заполняем пропуски наиболее популярным значением

```
# создаем импьютор
imp = SimpleImputer(missing_values=np.nan, strategy='most_frequent')
filledColumn = imp.fit_transform(data[['enrolled_university']])
filledColumn
```

```
array([['no enrollment'],
       ['no enrollment'],
       ['Full time course'],
       ['no enrollment'],
       ['no enrollment'],
       ['no enrollment']], dtype=object)
np.unique(filledColumn)
array(['Full time course', 'Part time course', 'no enrollment'],
      dtype=object)
# ndarray to Series
filledColumnSeries = pd.Series(map(lambda x: x[0], filledColumn))
filledColumnSeries
0
            no enrollment
1
            no enrollment
2
         Full time course
3
            no enrollment
4
            no enrollment
               . . .
19153
            no enrollment
19154
            no enrollment
            no enrollment
19155
19156
            no enrollment
            no enrollment
19157
Length: 19158, dtype: object
# check if 'no enrollment' number increases
filledColumnSeries.value counts()
no enrollment
                    14203
Full time course
                     3757
Part time course
                     1198
Name: count, dtype: int64
data['enrolled university'] = filledColumnSeries
data['enrolled university'].isnull().sum()
0
```

Кодирование категориального признака

```
edu_level = pd.DataFrame(data['education_level'])
edu_level.head()

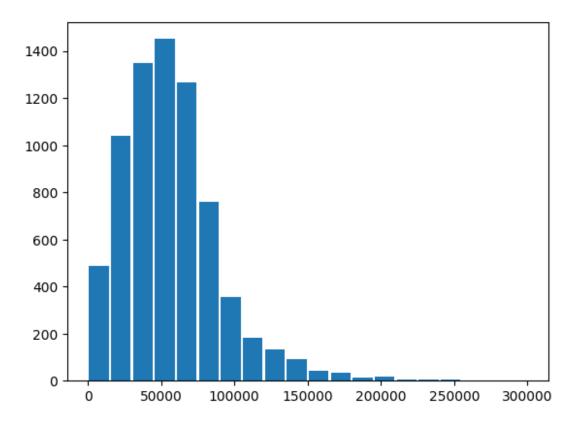
education_level
0     Graduate
1     Graduate
2     Graduate
```

```
3
         Graduate
4
          Masters
edu level['education level'].unique()
array(['Graduate', 'Masters', 'High School', nan, 'Phd', 'Primary
School'1,
      dtype=object)
imp = SimpleImputer(missing values=np.nan, strategy='constant',
fill value='NA')
filledColumn = imp.fit transform(edu level)
np.unique(filledColumn)
array(['Graduate', 'High School', 'Masters', 'NA', 'Phd',
       'Primary School'], dtype=object)
edu level['education level'] = pd.Series(pd.Series(map(lambda x: x[0],
filledColumn)))
print(edu level.head(), edu level['education level'].unique(), sep='\
n')
  education level
0
         Graduate
1
         Graduate
2
         Graduate
3
         Graduate
          Masters
['Graduate' 'Masters' 'High School' 'NA' 'Phd' 'Primary School']
d = {'NA': 0, 'Primary School': 1, 'High School': 2, 'Graduate': 3,
'Masters': 4, 'Phd': 5}
edu level['coded'] = edu level['education level'].map(d)
edu level.head(10)
  education level coded
0
         Graduate
                       3
                       3
1
         Graduate
2
         Graduate
                       3
                       3
3
         Graduate
                       4
4
          Masters
5
                       3
         Graduate
                       2
6
      High School
7
                       3
         Graduate
                       3
8
         Graduate
                       3
9
         Graduate
```

```
Масштабирование данных (другой датасет)
```

```
cars = pd.read_csv('used_cars_data.csv')
cars.head()
```

```
S.No.
                                               Location
                                                         Year \
                                       Name
0
                    Maruti Wagon R LXI CNG
                                                         2010
       0
                                                 Mumbai
1
       1
          Hyundai Creta 1.6 CRDi SX Option
                                                   Pune
                                                         2015
2
       2
                               Honda Jazz V
                                                Chennai
                                                         2011
3
       3
                         Maruti Ertiga VDI
                                                Chennai
                                                         2012
       4
           Audi A4 New 2.0 TDI Multitronic Coimbatore
                                                         2013
   Kilometers Driven Fuel Type Transmission Owner Type
                                                            Mileage
Engine \
               72000
                           CNG
                                      Manual
                                                  First 26.6 km/kg
998 CC
                        Diesel
               41000
                                      Manual
                                                  First 19.67 kmpl
1
1582 CC
               46000
                        Petrol
                                      Manual
                                                  First
                                                          18.2 kmpl
1199 CC
               87000
                        Diesel
                                      Manual
                                                  First
                                                         20.77 kmpl
1248 CC
               40670
                        Diesel
                                  Automatic
                                                 Second
                                                          15.2 kmpl
1968 CC
       Power
              Seats
                     New Price
                                 Price
                5.0
  58.16 bhp
                           NaN
                                 1.75
                5.0
                                12.50
1
  126.2 bhp
                           NaN
2
  88.7 bhp
                5.0
                     8.61 Lakh
                                 4.50
3 88.76 bhp
                7.0
                           NaN
                                 6.00
4 140.8 bhp
                5.0
                           NaN
                                17.74
cars.shape
(7253, 14)
# Удаляем записи, где пробег сильно больше большинства
cars = cars[cars.Kilometers Driven <= 300000]</pre>
cars.shape
(7245, 14)
plt.hist(cars['Kilometers_Driven'], rwidth=0.9, bins=20)
plt.show()
```



```
scaler = MinMaxScaler()
scaledKilometersDriven =
scaler.fit_transform(cars[['Kilometers_Driven']])
plt.hist(scaledKilometersDriven, rwidth=0.9, bins=20, color='orange')
plt.show()
```

