Московский государственный технический университет имени Н.Э.Баумана

Кафедра «Системы обработки информации и управления»

## ОТЧЕТ

Лабораторная работа №2 по дисциплине «Методы машинного обучения» на тему «Изучение библиотек обработки данных»

Выполнил:

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```
import pandas as pd
 pd.set_option('display.max.columns', 100)
 import matplotlib.pyplot as plt
 import seaborn as sns
 In [31]:
 data = pd.read_csv('data/adult.data.csv')
 data.head()
Out[31]:
                                                                                                                                                                                                                                       hours-
                                                                              education-
                                                                                                      marital-
                                                                                                                                                                                                     capital- capital-
                                                                                                                                                                                                                                                         native-
                                                                                                                       occupation relationship
        age workclass
                                        fnlwgt education
                                                                                                                                                                         race
                                                                                                                                                                                           sex
                                                                                                                                                                                                                                           per-
                                                                                          num
                                                                                                         status
                                                                                                                                                                                                           gain
                                                                                                                                                                                                                            loss
                                                                                                                                                                                                                                                       country
                                                                                                                                                                                                                                          week
                                                                                                                                  Adm-
                                                                                                                                                                                                                                                        United-
                                                                                                        Never-
                                                                                                                                                        Not-in-
          39
                    State-gov
                                           77516 Bachelors
                                                                                              13
                                                                                                                                                                        White
                                                                                                                                                                                         Male
                                                                                                                                                                                                          2174
                                                                                                                                                                                                                                 0
                                                                                                                                                                                                                                               40
                                                                                                       married
                                                                                                                                clerical
                                                                                                                                                          family
                                                                                                                                                                                                                                                          States
                                                                                                      Married-
                                                                                                                                  Exec-
                                                                                                                                                                                                                                                        United-
                    Self-emp-
           50
                                           83311
                                                         Bachelors
                                                                                                             civ-
                                                                                                                                                     Husband
                                                                                                                                                                        White
                                                                                                                                                                                         Male
                                                                                                                                                                                                                0
                                                                                                                                                                                                                                 0
                                                                                                                                                                                                                                               13
                         not-inc
                                                                                                                         managerial
                                                                                                                                                                                                                                                          States
                                                                                                        spouse
                                                                                                                           Handlers-
                                                                                                                                                                                                                                                        United-
                                                                                                                                                        Not-in-
           38
                         Private 215646
                                                            HS-grad
                                                                                               9 Divorced
                                                                                                                                                                        White
                                                                                                                                                                                         Male
                                                                                                                                                                                                                0
                                                                                                                                                                                                                                 0
                                                                                                                                                                                                                                               40
                                                                                                                              cleaners
                                                                                                                                                          family
                                                                                                                                                                                                                                                          States
                                                                                                      Married-
                                                                                                                           Handlers-
                                                                                                                                                                                                                                                        United-
           53
                         Private 234721
                                                                   11th
                                                                                                                                                                                                                0
                                                                                                                                                                                                                                 0
                                                                                                                                                     Husband
                                                                                                                                                                        Black
                                                                                                                                                                                         Male
                                                                                                             civ-
                                                                                                                              cleaners
                                                                                                                                                                                                                                                          States
                                                                                                        spouse
                                                                                                      Married-
                                                                                                                                   Prof-
           28
                         Private 338409 Bachelors
                                                                                                             civ-
                                                                                                                                                             Wife Black Female
                                                                                                                                                                                                                O
                                                                                                                                                                                                                                 O
                                                                                                                                                                                                                                               40
                                                                                                                                                                                                                                                           Cuba
                                                                                                                             specialty
                                                                                                        spouse
 In [33]:
 data['sex'].value counts()
Out[33]:
Male
                          21790
                          10771
Female
Name: sex, dtype: int64
 In [34]:
 data.loc[data['sex'] == 'Female', 'age'].mean()
 Out[34]:
 36.85823043357163
 In [37]:
 float((data['native-country'] == 'Germany').sum()) / data.shape[0]
 Out[37]:
 0.004207487485028101
 In [38]:
 ages1 = data.loc[data['salary'] == '>50K', 'age']
 ages2 = data.loc[data['salary'] == '<=50K', 'age']</pre>
 print("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years, poor - {2} +- {3} years.".format("The average age of the rich: {0} +- {1} years.").format("The average age of the rich: {0} +- {1} years.").format("The average age of the rich: {0} +- {1} years.").format("The average age of the rich: {0} +- {1} years.").format("The average age of the rich: {0} +- {1} years.").format("The average age of the rich: {0} +- {1} years.").format("The average age of the rich: {0} +- {1} years.").format("The average age of the rich: {0} +- {1} years.").format("The average age of the rich: {0} +- {1} years.").format("The average age of the rich: {0} +- {1} years.").format("The average age of the rich: {0} +- {1} years.").format("The average age of the rich: {0} 
            round(ages1.mean()), round(ages1.std(), 1),
            round(ages2.mean()), round(ages2.std(), 1)))
 The average age of the rich: 44.0 +- 10.5 years, poor - 37.0 +- 14.0 years.
 In [39]:
data.loc[data['salary'] == '>50K', 'education'].unique()
```

```
Out[39]:
array(['HS-grad', 'Masters', 'Bachelors', 'Some-college', 'Assoc-voc',
        'Doctorate', 'Prof-school', 'Assoc-acdm', '7th-8th', '12th',
       '10th', '11th', '9th', '5th-6th', '1st-4th'], dtype=object)
In [40]:
for (race, sex), sub_df in data.groupby(['race', 'sex']):
    print("Race: {0}, sex: {1}".format(race, sex))
    print(sub_df['age'].describe())
Race: Amer-Indian-Eskimo, sex: Female
        119.000000
         37.117647
mean
std
          13.114991
min
          17.000000
25%
          27.000000
50%
          36.000000
75%
          46.000000
         80.000000
max
Name: age, dtype: float64
Race: Amer-Indian-Eskimo, sex: Male
count
        192.000000
mean
          37.208333
         12.049563
std
          17.000000
min
25%
          28.000000
50%
          35.000000
75%
          45.000000
         82,000000
max
Name: age, dtype: float64
Race: Asian-Pac-Islander, sex: Female
count
         346.000000
mean
          35.089595
std
          12.300845
          17,000000
min
25%
          25.000000
50%
          33.000000
75%
          43.750000
          75.000000
Name: age, dtype: float64
Race: Asian-Pac-Islander, sex: Male
         693.000000
mean
         39.073593
          12.883944
std
min
          18.000000
         29.000000
25%
         37.000000
75%
         46.000000
         90.000000
max
Name: age, dtype: float64
Race: Black, sex: Female
       1555.000000
count
          37.854019
std
           12.637197
min
           17.000000
25%
           28.000000
          37.000000
50%
75%
           46.000000
max
           90.000000
Name: age, dtype: float64
Race: Black, sex: Male
        1569.000000
count
          37.682600
mean
std
           12.882612
          17.000000
min
25%
           27.000000
50%
           36.000000
           46.000000
75%
           90.000000
Name: age, dtype: float64
Race: Other, sex: Female
count
        109.000000
```

```
mean
          31.678899
          11,631599
std
          17.000000
min
25%
          23.000000
50%
          29.000000
75%
          39.000000
max
         74.000000
Name: age, dtype: float64
Race: Other, sex: Male
        162.000000
count
mean
         34.654321
std
          11.355531
          17.000000
min
         26.000000
25%
50%
          32.000000
75%
         42.000000
          77.000000
max
Name: age, dtype: float64
Race: White, sex: Female
         8642.000000
          36.811618
mean
std
           14.329093
min
           17.000000
          25,000000
25%
50%
          35.000000
75%
          46.000000
max
           90.000000
Name: age, dtype: float64
Race: White, sex: Male
        19174.000000
count
           39.652498
mean
           13.436029
std
min
            17.000000
25%
            29.000000
            38.000000
50%
75%
           49.000000
max
           90.000000
Name: age, dtype: float64
In [41]:
data.loc[(data['sex'] == 'Male') &
     (data['marital-status'].isin(['Never-married',
                                    'Separated',
                                    'Divorced',
                                    'Widowed'])), 'salary'].value counts()
Out[41]:
<=50K
         7552
>50K
         697
Name: salary, dtype: int64
In [42]:
data.loc[(data['sex'] == 'Male') &
     (data['marital-status'].str.startswith('Married')), 'salary'].value_counts()
Out[42]:
<=50K
         7576
>50K
         5965
Name: salary, dtype: int64
In [43]:
data['marital-status'].value counts()
Out[43]:
Married-civ-spouse
                         14976
Never-married
                         10683
Divorced
                          4443
                          1025
Separated
```

```
993
Widowed
Married-spouse-absent
                           418
Married-AF-spouse
                            23
Name: marital-status, dtype: int64
In [44]:
max_load = data['hours-per-week'].max()
print("Max time - {0} hours./week.".format(max load))
num workaholics = data[data['hours-per-week'] == max load].shape[0]
print("Total number of such hard workers {0}".format(num_workaholics))
rich share = float(data['hours-per-week'] == max load)
                 & (data['salary'] == '>50K')].shape[0]) / num_workaholics
print("Percentage of rich among them {0}%".format(int(100 * rich_share)))
Max time - 99 hours./week.
Total number of such hard workers 85
Percentage of rich among them 29%
In [46]:
pd.crosstab(data['native-country'], data['salary'],
           values=data['hours-per-week'], aggfunc=np.mean).T
Out[46]:
 native-
                                                          Dominican-
             ? Cambodia
                          Canada
                                   China Columbia
                                                     Cuba
                                                                    Ecuador
                                                                                     England
                                                                                              France
country
                                                            Republic
                                                                            Salvador
  salary
 >50K 45.547945 40.000000 45.641026 38.900000 50.000000 42.440000
                                                          47.000000 48.750000 45.000000 44.533333 50.750000
In [48]:
user usage = pd.read csv('data/user usage.csv')
user_device = pd.read_csv('data/user_device.csv')
devices = pd.read_csv('data/android_devices.csv')
In [49]:
result = pd.merge(user usage,
                 user_device[['use_id', 'platform', 'device']],
                 on='use_id')
result.head()
Out[49]:
   outgoing_mins_per_month outgoing_sms_per_month monthly_mb use_id platform
                                                                    device
0
                  21.97
                                      4.82
                                             1557.33
                                                    22787
                                                           android
                                                                  GT-I9505
                1710.08
                                    136.88
                                             7267.55
                                                    22788
                                                          android SM-G930F
1
                1710.08
                                    136.88
                                             7267.55 22789
                                                           android SM-G930F
2
3
                  94.46
                                     35.17
                                              519.12 22790
                                                          android
                                                                    D2303
                  71.59
                                     79.26
                                             1557.33 22792
                                                          android SM-G361F
```

### In [51]:

```
import pandasql as ps
from pandasql import sqldf
from datetime import datetime
import time
```

```
In [52]:
```

Смержено за: 0.0053 seconds

#### In [53]:

```
pysqldf = lambda q: sqldf(q, globals())
q = """
SELECT * FROM user_usage, user_device
WHERE user_usage.use_id = user_device.use_id;
"""
tic = time.perf_counter()
joined = pysqldf(q)
toc = time.perf_counter()
print(f"Смержено за: {toc - tic:0.4f} seconds")
```

Смержено за: 0.0293 seconds

### In [54]:

```
joined.head()
```

### Out[54]:

|   | outgoing_mins_per_month | outgoing_sms_per_month | monthly_mb | use_id | use_id | user_id | platform | platform_version | device       | use_ty |
|---|-------------------------|------------------------|------------|--------|--------|---------|----------|------------------|--------------|--------|
| 0 | 21.97                   | 4.82                   | 1557.33    | 22787  | 22787  | 12921   | android  | 4.3              | GT-<br>19505 |        |
| 1 | 1710.08                 | 136.88                 | 7267.55    | 22788  | 22788  | 28714   | android  | 6.0              | SM-<br>G930F |        |
| 2 | 1710.08                 | 136.88                 | 7267.55    | 22789  | 22789  | 28714   | android  | 6.0              | SM-<br>G930F |        |
| 3 | 94.46                   | 35.17                  | 519.12     | 22790  | 22790  | 29592   | android  | 5.1              | D2303        |        |
| 4 | 71.59                   | 79.26                  | 1557.33    | 22792  | 22792  | 28217   | android  | 5.1              | SM-<br>G361F |        |
|   |                         |                        |            |        |        |         |          |                  |              |        |

## In [55]:

```
joined.describe()
```

### Out[55]:

|       | outgoing_mins_per_month | outgoing_sms_per_month | monthly_mb   | use_id       | use_id       | user_id      | platform_version |
|-------|-------------------------|------------------------|--------------|--------------|--------------|--------------|------------------|
| count | 159.000000              | 159.000000             | 159.000000   | 159.000000   | 159.000000   | 159.000000   | 159.000000       |
| mean  | 203.331509              | 87.978742              | 4180.378616  | 22922.327044 | 22922.327044 | 25960.918239 | 5.554717         |
| std   | 248.660581              | 92.386434              | 5216.463795  | 76.511974    | 76.511974    | 6275.640431  | 0.828656         |
| min   | 0.500000                | 0.250000               | 0.000000     | 22787.000000 | 22787.000000 | 2873.000000  | 4.100000         |
| 25%   | 70.070000               | 22.855000              | 1557.330000  | 22861.500000 | 22861.500000 | 24683.500000 | 5.000000         |
| 50%   | 137.060000              | 62.850000              | 2076.450000  | 22931.000000 | 22931.000000 | 29366.000000 | 6.000000         |
| 75%   | 241.035000              | 119.675000             | 5191.120000  | 22986.500000 | 22986.500000 | 29673.000000 | 6.000000         |
| max   | 1710.080000             | 540.600000             | 31146.670000 | 23053.000000 | 23053.000000 | 29725.000000 | 10.100000        |
|       |                         |                        |              |              |              |              |                  |

#### In [56]:

```
joined.groupby("platform_version")["outgoing_sms_per_month"].describe()
```

# Out[56]:

|                  | count | mean       | std        | min    | 25%      | 50%     | 75%      | max    |
|------------------|-------|------------|------------|--------|----------|---------|----------|--------|
| platform_version |       |            |            |        |          |         |          |        |
| 4.1              | 5.0   | 102.328000 | 51.393475  | 26.94  | 91.7600  | 91.760  | 150.5900 | 150.59 |
| 4.2              | 1.0   | 24.080000  | NaN        | 24.08  | 24.0800  | 24.080  | 24.0800  | 24.08  |
| 4.3              | 3.0   | 66.366667  | 82.035137  | 4.82   | 19.8000  | 34.780  | 97.1400  | 159.50 |
| 4.4              | 17.0  | 108.699412 | 131.771975 | 7.67   | 7.6700   | 22.360  | 261.3300 | 327.33 |
| 5.0              | 17.0  | 99.321176  | 83.228036  | 5.83   | 60.8300  | 69.200  | 114.0600 | 273.75 |
| 5.1              | 23.0  | 63.606957  | 38.369532  | 4.64   | 41.2050  | 52.470  | 79.2600  | 162.39 |
| 6.0              | 88.0  | 86.057841  | 86.776242  | 0.25   | 22.2100  | 72.485  | 136.8800 | 435.29 |
| 7.0              | 2.0   | 39.035000  | 42.659752  | 8.87   | 23.9525  | 39.035  | 54.1175  | 69.20  |
| 7.1              | 1.0   | 15.380000  | NaN        | 15.38  | 15.3800  | 15.380  | 15.3800  | 15.38  |
| 9.3              | 1.0   | 540.600000 | NaN        | 540.60 | 540.6000 | 540.600 | 540.6000 | 540.60 |
| 10.1             | 1.0   | 47.350000  | NaN        | 47.35  | 47.3500  | 47.350  | 47.3500  | 47.35  |

# In [ ]: