# Московский государственный технический университет им. Н.Э. Баумана Факультет «Информатика и системы управления» Кафедра «Автоматизированные системы обработки информации и управления»



# Отчет Лабораторная работа № 2 По курсу Технологии машинного обучения»

### исполнитель:

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# ПРЕПОДАВАТЕЛЬ:

Гапанюк Ю.Е.

"\_\_"\_\_\_2021 г.

## Lab2

### April 20, 2021

#### 1 Lab2

dc-wikia-data

#### 1.1

```
[1]: import numpy as np
     import pandas as pd
     import seaborn as sns
     import matplotlib.pyplot as plt
     %matplotlib inline
     sns.set(style="ticks")
[2]: data = pd.read_csv('dc-wikia-data.csv', sep=",")
[3]: data.shape
[3]: (6896, 13)
[4]: data.dtypes
                            int64
[4]: page_id
    name
                           object
     urlslug
                           object
     ID
                           object
     ALIGN
                           object
     EYE
                           object
     HAIR
                           object
     SEX
                           object
     GSM
                           object
     ALIVE
                           object
     APPEARANCES
                         float64
     FIRST APPEARANCE
                           object
     YEAR
                         float64
     dtype: object
[5]: data.isnull().sum()
```

```
[5]: page_id
                              0
      name
                              0
                              0
      urlslug
      ID
                           2013
      ALIGN
                            601
      EYE
                           3628
      HAIR
                           2274
      SEX
                            125
      GSM
                           6832
      ALIVE
                              3
      APPEARANCES
                            355
      FIRST APPEARANCE
                             69
      YEAR
                             69
      dtype: int64
[42]: data.head()
[42]:
         page_id
                                           name
                                                                              urlslug \
      0
            1422
                          Batman (Bruce Wayne)
                                                        \/wiki\/Batman_(Bruce_Wayne)
      1
           23387
                         Superman (Clark Kent)
                                                       \/wiki\/Superman_(Clark_Kent)
                                                  \/wiki\/Green_Lantern_(Hal_Jordan)
      2
                   Green Lantern (Hal Jordan)
            1458
      3
            1659
                      James Gordon (New Earth)
                                                    \/wiki\/James_Gordon_(New_Earth)
            1576 Richard Grayson (New Earth)
                                                 \/wiki\/Richard_Grayson_(New_Earth)
                       TD
                                     ALIGN
                                                    EYE
                                                                HAIR
                                                                                   SEX
      O Secret Identity Good Characters
                                              Blue Eyes Black Hair Male Characters
      1 Secret Identity Good Characters
                                              Blue Eyes
                                                         Black Hair
                                                                      Male Characters
      2 Secret Identity Good Characters
                                             Brown Eves
                                                         Brown Hair
                                                                      Male Characters
      3 Public Identity
                                             Brown Eyes
                           Good Characters
                                                         White Hair
                                                                      Male Characters
      4 Secret Identity
                           Good Characters
                                              Blue Eyes
                                                         Black Hair
                                                                      Male Characters
         GSM
                                  APPEARANCES FIRST APPEARANCE
                                                                    YEAR
                           ALIVE
         {\tt NaN}
              Living Characters
                                        3093.0
                                                      1939, May
                                                                  1939.0
      1
         NaN
              Living Characters
                                        2496.0
                                                  1986, October
                                                                  1986.0
                                                  1959, October
        {\tt NaN}
             Living Characters
                                        1565.0
                                                                  1959.0
         NaN Living Characters
                                                 1987, February
                                        1316.0
                                                                  1987.0
         {\tt NaN}
             Living Characters
                                        1237.0
                                                    1940, April
                                                                  1940.0
     1.2
 [6]: #
      total_count = data.shape[0]
      num_cols = []
      for col in data.columns:
```

```
temp_null_count = data[data[col].isnull()].shape[0]
          dt = str(data[col].dtype)
          if temp_null_count>0 and (dt=='float64' or dt=='int64' or dt=='object'):
              num_cols.append(col)
              temp_perc = round((temp_null_count / total_count) * 100.0, 2)
                                                           {}, {}%.'.format(col, dt, ⊔
              print('
                           {}.
                                      {}.
       →temp_null_count, temp_perc))
                      object.
                                               2013, 29.19%.
          ID.
                                                  601, 8.72%.
          ALIGN.
                         object.
          EYE.
                       object.
                                                3628, 52.61%.
                                                 2274, 32.98%.
          HAIR.
                        object.
          SEX.
                       object.
                                                125, 1.81%.
          GSM.
                                                6832, 99.07%.
                       object.
          ALIVE.
                         object.
                                                  3, 0.04%.
          APPEARANCES.
                               float64.
                                                         355, 5.15%.
          FIRST APPEARANCE.
                                    object.
                                                             69,
     1.0%.
          YEAR.
                        float64.
                                                  69, 1.0%.
     1.2.1
                                 50%,
                                                         7 %
 [7]: data1 = data.drop(columns=['GSM', 'EYE'])
 [8]: data2 = data1.dropna(subset=['ALIVE', 'YEAR', 'SEX'])
 [9]: data2.isnull().sum()
 [9]: page_id
                              0
      name
                              0
      urlslug
                              0
      ID
                           1915
      ALIGN
                            568
      HAIR
                           2131
      SEX
                              0
      ALIVE
                              0
      APPEARANCES
                            335
      FIRST APPEARANCE
                              0
      YEAR
                              0
      dtype: int64
[10]: print(f"
                   {data.shape[0]-data2.shape[0]}
                                                          {data.shape[1]-data2.
       \rightarrowshape[1]}
          195
                    2
```

```
appearances
[11]: data2 appearances = data2[['APPEARANCES']]
 from sklearn.impute import SimpleImputer
 from sklearn.impute import MissingIndicator
 indicator = MissingIndicator()
 mask_missing_values_only = indicator.fit_transform(data2_appearances)
 mask_missing_values_only
[11]: array([[False],
    [False],
    [False],
    [True],
    [True],
    [True]])
[14]: strategies=['mean', 'median', 'most_frequent']
 def test_num_impute(strategy_param):
   imp_num = SimpleImputer(strategy=strategy_param)
   data num imp = imp num.fit transform(data2 appearances)
   return data_num_imp[mask_missing_values_only]
[15]: strategies[2], test_num_impute(strategies[2])
[15]: ('most_frequent',
```

```
appearances
     1.
[20]: data2.loc[:,'APPEARANCES'] = data2.loc[:,'APPEARANCES'].fillna(value = 1)
[21]: data2.isnull().sum()
                             0
[21]: page_id
                             0
      name
      urlslug
                             0
      ID
                          1915
      ALIGN
                           568
      HAIR
                          2131
      SEX
                             0
      ALIVE
                             0
      APPEARANCES
                              0
      FIRST APPEARANCE
                             0
      YEAR
                              0
      dtype: int64
[22]: from sklearn.preprocessing import LabelEncoder, OneHotEncoder
[23]: data2['ID'].unique()
[23]: array(['Secret Identity', 'Public Identity', nan, 'Identity Unknown'],
            dtype=object)
[24]: data2['ID'].value_counts()
[24]: Public Identity
                          2409
      Secret Identity
                          2368
      Identity Unknown
      Name: ID, dtype: int64
                  2 -
                                                            Identity unknown,
                                                                                   Identity
     Unknown.
[25]: data2.loc[:,'ID'] = data2.loc[:,'ID'].fillna(value = 'Identity Unknown')
[26]: data2['ALIGN'].unique()
[26]: array(['Good Characters', 'Bad Characters', 'Neutral Characters', nan,
             'Reformed Criminals'], dtype=object)
[27]: data2['ALIGN'].value_counts()
```

```
[27]: Bad Characters
                             2815
      Good Characters
                             2765
      Neutral Characters
                              550
      Reformed Criminals
                                3
      Name: ALIGN, dtype: int64
[28]: data2.loc[:,'ALIGN'] = data2.loc[:,'ALIGN'].fillna(value = 'Bad Characters')
[29]: data2.loc[:,'HAIR'] = data2.loc[:,'HAIR'].fillna(value = 'Unknown Hair')
[30]: data2.isnull().sum()
[30]: page_id
                          0
                           0
     name
                           0
      urlslug
      ID
                           0
      ALIGN
                           0
      HAIR
                           0
      SEX
                           0
      ALIVE
                           0
      APPEARANCES
                           0
     FIRST APPEARANCE
                           0
     YEAR
                           0
      dtype: int64
                ##
[32]: data2.dtypes
[32]: page_id
                             int64
     name
                           object
      urlslug
                           object
      ID
                           object
      ALIGN
                           object
      HAIR
                           object
      SEX
                           object
      ALIVE
                           object
      APPEARANCES
                          float64
     FIRST APPEARANCE
                           object
      YEAR
                           float64
      dtype: object
[34]: from sklearn.preprocessing import LabelEncoder, OneHotEncoder
      le = LabelEncoder()
      cat_enc_le = le.fit_transform(data2.loc[:, 'name'])
      print(le.inverse_transform(np.unique(cat_enc_le)))
      data2.loc[:, 'name'] = cat_enc_le
```

```
['3g4 (New Earth)' '500-ZQ (New Earth)' "A'Hwiirdh-Paan'A (New Earth)" ...
      'Zyklon (New Earth)' 'Zyn (New Earth)' 'Zzlrrrzzzm (New Earth)']
[35]: le = LabelEncoder()
      cat_enc_le = le.fit_transform(data2.loc[:, 'urlslug'])
      print(le.inverse_transform(np.unique(cat_enc_le)))
      data2.loc[:, 'urlslug'] = cat_enc_le
     ['\\/wiki\\/3g4_(New_Earth)' '\\/wiki\\/500-ZQ_(New_Earth)'
      '\\/wiki\\/A%27Hwiirdh-Paan%27A_(New_Earth)' ...
      '\\/wiki\\/Zyklon_(New_Earth)' '\\/wiki\\/Zyn_(New_Earth)'
      '\\/wiki\\/Zzlrrrzzzm (New Earth)']
[44]: cat_enc_le = le.fit_transform(data2.loc[:, 'ID'])
      print(le.inverse_transform(np.unique(cat_enc_le)))
      data2.loc[:, 'ID'] = cat_enc_le
     [0 1 2]
[50]: cat_enc_le = le.fit_transform(data2.loc[:, 'ALIGN'])
      print(le.inverse_transform(np.unique(cat_enc_le)))
      data2.loc[:, 'ALIGN'] = cat_enc_le
     ['Bad Characters' 'Good Characters' 'Neutral Characters'
      'Reformed Criminals'
[45]: cat_enc_le = le.fit_transform(data2.loc[:, 'HAIR'])
      print(le.inverse_transform(np.unique(cat_enc_le)))
      data2.loc[:, 'HAIR'] = cat_enc_le
     ['Black Hair' 'Blond Hair' 'Blue Hair' 'Brown Hair' 'Gold Hair'
      'Green Hair' 'Grey Hair' 'Orange Hair' 'Pink Hair' 'Platinum Blond Hair'
      'Purple Hair' 'Red Hair' 'Reddish Brown Hair' 'Silver Hair'
      'Strawberry Blond Hair' 'Unknown Hair' 'Violet Hair' 'White Hair']
[46]: cat_enc_le = le.fit_transform(data2.loc[:, 'SEX'])
      print(le.inverse_transform(np.unique(cat_enc_le)))
      data2.loc[:, 'SEX'] = cat_enc_le
     ['Female Characters' 'Genderless Characters' 'Male Characters'
      'Transgender Characters']
[47]: cat enc le = le.fit transform(data2.loc[:, 'ALIVE'])
      print(le.inverse_transform(np.unique(cat_enc_le)))
      data2.loc[:, 'ALIVE'] = cat_enc_le
     ['Deceased Characters' 'Living Characters']
[48]: cat_enc_le = le.fit_transform(data2.loc[:, 'FIRST APPEARANCE'])
      print(le.inverse_transform(np.unique(cat_enc_le)))
      data2.loc[:, 'FIRST APPEARANCE'] = cat_enc_le
```

```
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      '2011, January' '2011, July' '2011, June' '2011, March' '2011, May'
      '2011, November' '2011, October' '2011, September' '2012, December'
      '2012, June' '2012, March' '2012, May' '2013, October']
[51]: data2.dtypes
[51]: page_id
                            int64
                            int64
     name
      urlslug
                            int32
      ID
                            int64
      ALIGN
                            int32
      HAIR
                            int32
      SEX
                            int32
                            int32
      ALIVE
                          float64
      APPEARANCES
      FIRST APPEARANCE
                            int32
      YEAR
                          float64
      dtype: object
[52]: data2.head()
```

'2001, July' '2001, June' '2001, March' '2001, May' '2001, November'

```
[52]:
                                   ID
                                        ALIGN
                                               HAIR
                                                      SEX
                                                           ALIVE
                                                                   APPEARANCES
         page_id
                   name
                          urlslug
      0
                                                        2
             1422
                    583
                              583
                                     2
                                            1
                                                   0
                                                                1
                                                                         3093.0
                                                        2
      1
           23387
                   5830
                             5830
                                     2
                                            1
                                                   0
                                                                1
                                                                         2496.0
      2
             1458
                   2410
                             2410
                                     2
                                            1
                                                   3
                                                        2
                                                                1
                                                                         1565.0
                                                        2
      3
             1659
                   2908
                             2909
                                     1
                                            1
                                                  17
                                                                1
                                                                         1316.0
      4
                             5123
                                     2
                                            1
                                                        2
                                                                1
             1576
                   5123
                                                   0
                                                                         1237.0
         FIRST APPEARANCE
                               YEAR
      0
                             1939.0
                         14
      1
                        452
                             1986.0
      2
                        155
                             1959.0
      3
                        458
                             1987.0
      4
                         19
                             1940.0
               . ##
[55]:
      data2.describe()
[55]:
                    page_id
                                      name
                                                urlslug
                                                                    ID
                                                                               ALIGN
                6701.000000
                              6701.000000
                                            6701.000000
                                                           6701.000000
                                                                         6701.000000
      count
              146507.050739
                              3350.000000
                                            3350.000000
                                                              1.066259
                                                                            0.578123
      mean
                              1934.556409
      std
              108109.027918
                                            1934.556409
                                                              0.797625
                                                                            0.640936
                1380.000000
                                 0.00000
                                                              0.000000
                                                                            0.00000
      min
                                               0.000000
      25%
               43057.000000
                              1675.000000
                                            1675.000000
                                                              0.000000
                                                                            0.000000
      50%
              139771.000000
                              3350.000000
                                            3350.000000
                                                              1.000000
                                                                            0.00000
              212191.000000
                              5025.000000
      75%
                                            5025.000000
                                                              2.000000
                                                                            1.000000
              404010.000000
                              6700.000000
                                            6700.000000
                                                              2.000000
                                                                            3.000000
      max
                     HAIR
                                     SEX
                                                 ALIVE
                                                        APPEARANCES
                                                                      FIRST APPEARANCE
              6701.000000
                            6701.000000
                                          6701.000000
                                                        6701.000000
                                                                            6701.000000
      count
                 7.362632
                               1.416356
                                             0.751977
                                                          22.884793
                                                                             506.694523
      mean
      std
                 6.705654
                               0.907873
                                             0.431897
                                                          86.403863
                                                                             188.394358
      min
                 0.000000
                               0.000000
                                             0.000000
                                                           1.000000
                                                                               0.000000
      25%
                 1.000000
                               0.000000
                                             1.000000
                                                           2.000000
                                                                             413.000000
      50%
                 3.000000
                               2.000000
                                             1.000000
                                                           6.000000
                                                                             532.000000
      75%
                15.000000
                               2.000000
                                             1.000000
                                                           15.000000
                                                                             663.000000
                17.000000
                               3.000000
                                             1.000000
                                                        3093.000000
                                                                             771.000000
      max
                     YEAR
              6701.000000
      count
      mean
              1989.729145
      std
                16.853253
      min
              1935.000000
      25%
              1983.000000
      50%
              1992.000000
      75%
              2003.000000
              2013.000000
      max
```

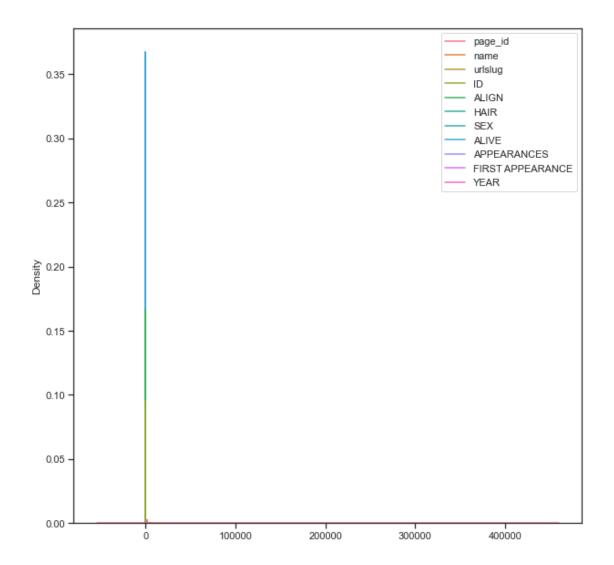
```
[57]: def draw_kde(col_list, df1, df2, label1, label2):
    fig, (ax1, ax2) = plt.subplots(
        ncols=2, figsize=(12, 5))

#
    ax1.set_title(label1)
    sns.kdeplot(data=df1[col_list], ax=ax1)

#
    ax2.set_title(label2)
    sns.kdeplot(data=df2[col_list], ax=ax2)
    plt.show()
    #draw_kde(['page_id', 'name', 'urlslug', 'ID', 'ALIGN', 'HAIR', 'SEX', \under 'ALIVE', 'APPEARANCES', 'YEAR', 'FIRST APPEARANCE'], data2, data2, 'still', \under 'still')
```

```
[61]: plt.figure(figsize = (10, 10))
sns.kdeplot(data=data2)
```

[61]: <AxesSubplot:ylabel='Density'>



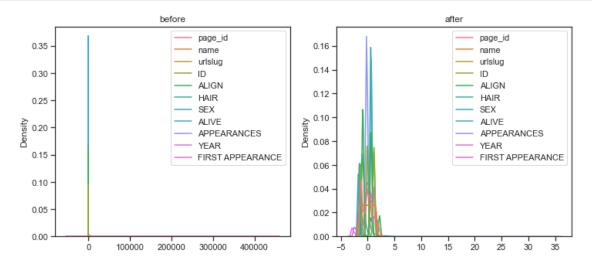
,

```
[71]: from sklearn.preprocessing import StandardScaler
      from sklearn.preprocessing import RobustScaler
[75]: #
            StandardScaler
      cs11 = StandardScaler()
      data_cs11_scaled_temp = cs11.fit_transform(data2)
             DataFrame
      data_cs11_scaled = pd.DataFrame(data_cs11_scaled_temp, columns=data2.columns)
      data_cs11_scaled.head()
[75]:
                                                                         SEX \
                              urlslug
                                             ID
                                                   ALIGN
                                                              HAIR
         page_id
                      name
```

0 -1.342125 -1.430409 -1.430409 1.170739 0.65827 -1.098056 0.642918 1 -1.138936 1.282043 1.282043 1.170739 0.65827 -1.098056 0.642918

```
2 -1.341792 -0.485936 -0.485936 1.170739 0.65827 -0.650639 0.642918
3 -1.339933 -0.228493 -0.227976 -0.083076 0.65827 1.437308 0.642918
4 -1.340701 0.916558 0.916558 1.170739 0.65827 -1.098056 0.642918
     ALIVE APPEARANCES FIRST APPEARANCE
                                               YEAR
0 0.574306
              35.534804
                                -2.615425 -3.010275
                                -0.290341 -0.221288
1 0.574306
              28.624875
2 0.574306
              17.849089
                                -1.866939 -1.823472
3 0.574306
              14.967059
                                -0.258491 -0.161948
                                -2.588883 -2.950935
4 0.574306
              14.052680
```

[68]: draw\_kde(['page\_id', 'name', 'urlslug', 'ID', 'ALIGN', 'HAIR', 'SEX', 'ALIVE', \
\( \to 'APPEARANCES', 'YEAR', 'FIRST APPEARANCE'], data2, data\_cs11\_scaled, \( \to 'before', 'after') \)



,

#### [78]: data\_cs11\_scaled.corr()

```
[78]:
                   page_id
                              name
                                   urlslug
                                               ID
                                                     ALIGN
                                                             HAIR
                   1.000000 -0.005713 -0.005714 -0.164841 -0.027130
                                                          0.034827
    page_id
    name
                  -0.005713
                          1.000000
                                  1.000000 -0.003745
                                                  0.006856
                                                          0.006946
    urlslug
                  -0.005714 1.000000
                                  1.000000 -0.003749 0.006852 0.006949
                  -0.164841 -0.003745 -0.003749 1.000000 -0.035527 -0.081372
    ID
    ALIGN
                  HAIR
                  0.034827
                          SEX
                  -0.070401 0.022336 0.022338 0.028266 -0.106437 0.146174
    ALIVE
                  0.028640
                          0.002052
                                  0.003869
                                  0.003871 0.110948 0.093915 -0.072017
    APPEARANCES
                  -0.236994
    FIRST APPEARANCE 0.253672 -0.021682 -0.021687 0.020654 -0.059530 0.023376
    YEAR
                  0.253560 -0.023463 -0.023468 0.011161 -0.059715 0.026616
```

```
0.253560
      page_id
                        -0.070401
                                   0.028640
                                                -0.236994
                                                                   0.253672
      name
                         0.022336
                                   0.002052
                                                 0.003869
                                                                   -0.021682 -0.023463
                        0.022338
                                   0.002051
                                                0.003871
                                                                   -0.021687 -0.023468
      urlslug
      TD
                        0.028266 -0.034174
                                                0.110948
                                                                   0.020654
                                                                             0.011161
                        -0.106437
      ALIGN
                                   0.047900
                                                                  -0.059530 -0.059715
                                                0.093915
      HAIR
                         0.146174 -0.012848
                                                -0.072017
                                                                   0.023376 0.026616
      SEX
                         1.000000 -0.070045
                                                0.009033
                                                                   -0.107070 -0.109871
      ALIVE
                        -0.070045
                                   1.000000
                                                                   0.048810 0.047527
                                                0.017544
      APPEARANCES
                         0.009033
                                   0.017544
                                                 1.000000
                                                                   -0.238503 -0.247670
      FIRST APPEARANCE -0.107070
                                   0.048810
                                                -0.238503
                                                                   1.000000
                                                                              0.993906
      YEAR
                        -0.109871
                                   0.047527
                                                -0.247670
                                                                   0.993906
                                                                              1.000000
[79]:
     data2.corr()
[79]:
                         page_id
                                       name
                                              urlslug
                                                              ID
                                                                      ALIGN
                                                                                 HAIR
                         1.000000 -0.005713 -0.005714 -0.164841 -0.027130
                                                                             0.034827
      page_id
                        -0.005713
                                   1.000000
                                             1.000000 -0.003745
                                                                  0.006856
                                                                             0.006946
      name
      urlslug
                                   1.000000
                                             1.000000 -0.003749
                        -0.005714
                                                                  0.006852
                                                                             0.006949
      ID
                        -0.164841 -0.003745 -0.003749
                                                      1.000000 -0.035527 -0.081372
      ALIGN
                                   0.006856
                                             0.006852 -0.035527
                        -0.027130
                                                                  1.000000 -0.132652
      HAIR
                        0.034827
                                   0.006946
                                             0.006949 -0.081372 -0.132652
                                                                             1.000000
      SEX
                        -0.070401
                                   0.022336
                                             0.022338
                                                        0.028266 -0.106437
                                                                             0.146174
                                   0.002052
                                             0.002051 -0.034174
      ALIVE
                        0.028640
                                                                 0.047900 -0.012848
      APPEARANCES
                        -0.236994
                                   0.003869
                                             0.003871
                                                        0.110948
                                                                 0.093915 -0.072017
      FIRST APPEARANCE 0.253672 -0.021682 -0.021687
                                                        0.020654 -0.059530
                                                                            0.023376
      YEAR
                        0.253560 -0.023463 -0.023468
                                                        0.011161 -0.059715
                                                                            0.026616
                              SEX
                                      ALIVE
                                             APPEARANCES
                                                           FIRST APPEARANCE
                                                                                  YEAR
                        -0.070401
                                   0.028640
                                                -0.236994
                                                                             0.253560
                                                                   0.253672
      page id
                        0.022336
                                   0.002052
                                                 0.003869
                                                                  -0.021682 -0.023463
      name
      urlslug
                        0.022338
                                   0.002051
                                                 0.003871
                                                                   -0.021687 -0.023468
      ID
                        0.028266 -0.034174
                                                0.110948
                                                                   0.020654 0.011161
      ALIGN
                        -0.106437
                                   0.047900
                                                 0.093915
                                                                  -0.059530 -0.059715
      HAIR
                        0.146174 -0.012848
                                                -0.072017
                                                                   0.023376 0.026616
      SEX
                         1.000000 -0.070045
                                                0.009033
                                                                  -0.107070 -0.109871
                        -0.070045
      ALIVE
                                   1.000000
                                                0.017544
                                                                   0.048810 0.047527
      APPEARANCES
                         0.009033
                                   0.017544
                                                 1.000000
                                                                   -0.238503 -0.247670
      FIRST APPEARANCE -0.107070
                                   0.048810
                                                -0.238503
                                                                   1.000000
                                                                             0.993906
      YEAR
                        -0.109871
                                   0.047527
                                                -0.247670
                                                                   0.993906
                                                                              1.000000
```

APPEARANCES

FIRST APPEARANCE

YEAR

SEX

ALIVE

16