Лабораторная работа 3 по дисциплине «Методы машинного обучения» на тему

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

Выполнил: студент группы ИУ5-21М Могильников И. А.

Москва — 2019 г.

1. Описание задания

Цель лабораторной работы: изучение способов предварительной обработки данных для дальнейшего формирования моделей.

Задание:

- 1. Выбрать набор данных (датасет), содержащий категориальные признаки и пропуски в данных. Для выполнения следующих пунктов можно использовать несколько различных наборов данных (один для обработки пропусков, другой для категориальных признаков и т.д.)
- 2. Для выбранного датасета (датасетов) на основе материалов лекции решить следующие задачи:
- обработку пропусков в данных;
- кодирование категориальных признаков;
- масштабирование данных.

2. Ход выполнения лабораторной работы

```
In [0]: !pip install -U -q PyDrive
      import os
      from pydrive.auth import GoogleAuth
      from pydrive.drive import GoogleDrive
      from google.colab import auth
      from oauth2client.client import GoogleCredentials
In [0]: # 1. Authenticate and create the PyDrive client.
      auth.authenticate user()
      gauth = GoogleAuth()
      gauth.credentials = GoogleCredentials.get application default()
      drive = GoogleDrive(gauth)
In [0]: # choose a local (colab) directory to store the data.
      local download path = os.path.expanduser(^{\prime \sim}/data^{\prime})
       os.makedirs(local download path)
      except: pass
In [0]: # 2. Auto-iterate using the query syntax
      # https://developers.google.com/drive/v2/web/search-parameters
      file list = drive.ListFile(
         {'q': "title='dc-wikia-data.csv'"}).GetList()
In [0]: for f in file list:
        # 3. Create & download by id.
       print('title: %s, id: %s' % (f['title'], f['id']))
       fname = os.path.join(local download path, f['title'])
       print('downloading to {}'.format(fname))
       f = drive.CreateFile(\{'id': f['id']\})
       f .GetContentFile(fname)
```

```
title: dc-wikia-data.csv, id: 1mp_Y-6OLZLTtpzYI8UA7-_EulThJZK-o downloading to /root/data/dc-wikia-data.csv
```

```
In [0]: import numpy as np
     import pandas as pd
     import seaborn as sns
     import matplotlib.pyplot as plt
     %matplotlib inline
     sns.set(style="ticks")
In [0]: data = pd.read csv(fname, sep=",")
In [0]: data.head()
Out[0]:
         page id
                                                           urlslug \
                                  name
          1422
                    Batman (Bruce Wayne)
                                                \with Variable Mayne
     0
     1
         23387
                    Superman (Clark Kent)
                                               \/wiki\/Superman (Clark Kent)
     2
         1458
                Green Lantern (Hal Jordan)
                                            \/wiki\/Green Lantern (Hal Jordan)
     3
                 James Gordon (New Earth)
                                              \/wiki\/James Gordon (New Earth)
          1659
     4
          1576 Richard Grayson (New Earth) \/wiki\/Richard Grayson (New Earth)
                ID
                           ALIGN
                                        EYE
                                                  HAIR
                                                                 SEX \
     0 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 Eyes Brown Hair Male Characters
     3 Public Identity Good Characters Brown Eyes White Hair Male Characters
     4 Secret Identity Good Characters
                                        Blue Eyes Black Hair Male Characters
       GSM
                      ALIVE APPEARANCES FIRST APPEARANCE
                                                                       YEAR
     0 NaN Living Characters
                                              1939, May 1939.0
                                  3093.0
     1 NaN Living Characters
                                  2496.0
                                           1986, October 1986.0
                                           1959, October 1959.0
       NaN Living Characters
                                  1565.0
     3 NaN Living Characters
                                          1987, February 1987.0
                                  1316.0
     4 NaN Living Characters
                                  1237.0
                                            1940, April 1940.0
In [0]: data.shape
Out[0]: (6896, 13)
In [0]: data.dtypes
Out[0]: page id
                        int64
                      object
     name
     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
In [0]: data.isnull().sum()
Out[0]: page id
                          0
     name
                        0
     urlslug
                       0
     ID
                    2013
     ALIGN
                       601
     EYE
                      3628
                      2274
     HAIR
     SEX
                      125
     GSM
                      6832
     ALIVE
                         3
     APPEARANCES
                             355
     FIRST APPEARANCE
                                69
     YEAR
                        69
     dtype: int64
2.1. Удаление
In [0]: # Удаление колонок
     data new 1 = data.dropna(axis=1, how='any')
     (data.shape, data new 1.shape)
Out[0]: ((6896, 13), (6896, 3))
In [0]: # Удаление строк
     data new 2 = \text{data.dropna}(\text{axis}=0, \text{how}='\text{any'})
     (data.shape, data new 2.shape)
Out[0]: ((6896, 13), (38, 13))
2.2. Заполнение нулями
In [0]: # Заполнение всех пропущенных значений нулями
     data new 3 = \text{data.fillna}(0)
     data new 3.head()
Out[0]:
         page id
                                                            urlslug \
                                  name
     0
          1422
                    Batman (Bruce Wayne)
                                                 \/wiki\/Batman (Bruce Wayne)
                    Superman (Clark Kent)
                                                \/wiki\/Superman (Clark Kent)
     1
         23387
                                             \/wiki\/Green Lantern (Hal Jordan)
     ^{2}
          1458
                Green Lantern (Hal Jordan)
     3
                  James Gordon (New Earth)
                                               \/wiki\/James Gordon (New Earth)
          1659
          1576 Richard Grayson (New Earth) \/wiki\/Richard Grayson (New Earth)
     4
                ID
                           ALIGN
                                         EYE
                                                   HAIR
                                                                  SEX \
     0 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 Eyes Brown Hair Male Characters
- 3 Public Identity Good Characters Brown Eyes White Hair Male Characters
- 4 Secret Identity Good Characters Blue Eyes Black Hair Male Characters

GSM ALIVE APPEARANCES FIRST APPEARANCE YEAR

```
0 0 Living Characters
                                       1939, May 1939.0
                           3093.0
  0 Living Characters
                           2496.0
                                    1986, October 1986.0
  0 Living Characters
                           1565.0
                                    1959, October 1959.0
                                   1987, February 1987.0
3
  0 Living Characters
                           1316.0
  0 Living Characters
                                      1940, April 1940.0
                           1237.0
```

2.3. Внедрение значений (числовые данные)

```
In [0]: # Выберем числовые колонки с пропущенными значениями

# Цикл по колонкам датасета

total_count = data.shape[0]

num_cols = []

for col in data.columns:

# Количество пустых значений

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'):

num_cols.append(col)

temp_perc = round((temp_null_count / total_count) * 100.0, 2)

print('Колонка {}. Тип данных {}. Количество пустых значений {}, {}%.'

.format(col, dt, temp_null_count, temp_perc))
```

Колонка APPEARANCES. Тип данных float64. Количество пустых значений 355, 5.15%. Колонка YEAR. Тип данных float64. Количество пустых значений 69, 1.0%.

```
In [0]: data_num = data[num_cols] data_num
```

```
Out[0]:
            APPEARANCES
                                YEAR
     0
              3093.0 1939.0
      1
              2496.0 1986.0
     2
              1565.0 1959.0
      3
              1316.0 1987.0
      4
              1237.0 1940.0
     5
              1231.0 1941.0
     6
              1121.0 1941.0
      7
              1095.0 1989.0
     8
              1075.0 1969.0
     9
              1028.0 1956.0
      10
              1028.0 1956.0
      11
               969.0 1940.0
      12
               951.0 1967.0
     13
               951.0 1940.0
     14
               934.0 1938.0
```

15	930.0 1943	0.
16	803.0 1940	0.
17	716.0 1994	.0
18	706.0 1961	.0
19	677.0 1986	.0
20	654.0 1941	.0
21	635.0 1976	.0
22	605.0 1942	
23	595.0 1965	
$\frac{2}{24}$	593.0 1968	
25	584.0 1980	
$\frac{26}{26}$	560.0 1993	
20 27	558.0 1960	
28	557.0 1986	
29	549.0 1971	.0
		37.0
6866		57.0
6867		57.0
6868		57.0
6869		57.0
6870		57.0
6871		66.0
6872		66.0
6873	NaN 196	65.0
6874	NaN 196	63.0
6875	NaN 196	52.0
6876	NaN 196	0.0
6877	NaN 195	55.0
6878	NaN 194	48.0
6879	NaN 194	16.0
6880	NaN 194	16.0
6881	NaN 194	14.0
6882	NaN 194	11.0
6883	NaN 194	11.0
6884	NaN 194	10.0
6885		10.0
6886	_	36.0
6887		NaN
6888		Val
6889		NaN
6890		NaN
6891		NaN
6892		NaN
6893		NaN
6894		NaN
6895	NaN I	NaN

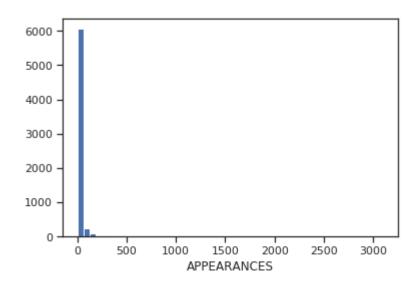
[6896 rows x 2 columns]

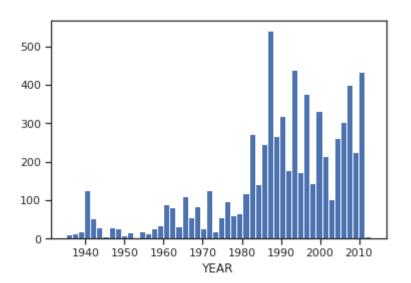
In [0]: # Гистограмма по признакам for col in data_num:

```
plt.hist(data[col], 50)
plt.xlabel(col)
plt.show()
```

/usr/local/lib/python3.6/dist-packages/numpy/lib/function_base.py:780: RuntimeWarning: invalate | (tmp_a >= first_edge)

/usr/local/lib/python3.6/dist-packages/numpy/lib/function_base.py:781: RuntimeWarning: invalkeep &= (tmp_a \leq last_edge)





In [0]: # Фильтр по пустым значениям поля YEAR data[data['YEAR'].isnull()]

1400	64303	Hadley Jaggar (New Earth)
1401	13097	Nergal (New Earth)
1832		Gregory Wolfe (New Earth)
1937		Clarence Charles Batson V (New Earth)
1938	113413	Chad Graham (New Earth)
2065	344513	Jupiter (New Earth)
2066	344983	Pegasus (New Earth)
2067	286906	Asteroth (New Earth)
2230	155569	Red Panzer IV (New Earth)
2231	19044	Gernsback (New Earth)
2232	202057	Henry Cosgei (New Earth)
2413	216380	Marilyn Batson (New Earth)
2414	178197	Michael Tree (New Earth)
2841	383108	Brunhilde (New Earth)
2842	251517	Kuan Ti (New Earth)
3104	383914	Helen of Troy (New Earth)
3105	256793	Pluto (New Earth)
3431	15909	Ammon-Ra (New Earth)
3432	348898	Kreaven (New Earth)
3433	345589	Vulcan (New Earth)
3434	57839	Donna Cavanagh (New Earth)
3435	68612	Amadeus Arkham (New Earth)
3819	182833	Scott Spencer (New Earth)
3820	213354	Maria Montez (New Earth)
3821	345591	Diana, Goddess of the Hunt (New Earth)
3822	47346	Gregory the Gargoyle (New Earth)
3823	345586	Minerva (Roman Goddess) (New Earth)
3824		Auerbach (New Earth)
4320	139807	Virgil Adams (New Earth)
1020	100001	Virgii ridanis (riew Laitii)
 5527	112333	Lisa Morice (New Earth)
5528	189975	Carter Nichols (New Earth)
5529	139768	Cupid (New Earth)
5529 5530	345585	Juno (New Earth)
5530	271506	Luki Lo (New Earth)
5531	177249	Stanley Wilson (New Earth)
	250224	,
5533		Elena Leal (New Earth)
5534	185720	Druid (New Earth)
5535	218828	Crone (New Earth)
5536	95738	Fancy Feet (New Earth)
5537	182478	Rico Strada (New Earth)
5538	31642	Benjamin Hubbard (New Earth)
6532	159528	Materna Minnx (New Earth)
6533	19799	Frank Baker, Jr. (New Earth)
6534	242167	Prowley (New Earth)
6535	95767	Smother (New Earth)
6536	16094	Mark Antaeus (New Earth)
6537	128000	Jerome Cox (New Earth)
6538	345590	Apollo (Roman God) (New Earth)
6539	15050	Ben Lo (New Earth)

```
6540
      205584
                      Auctioneer II (New Earth)
                      Herbert Hoover (New Earth)
6887
      283661
                  William Howard Taft (New Earth)
6888
      283657
                   Frank Fitzsimmons (New Earth)
6889
      21655
6890
                      James Garfield (New Earth)
      283482
6891
      66302
                        Nadine West (New Earth)
6892
                      Warren Harding (New Earth)
      283475
                    William Harrison (New Earth)
6893
      283478
6894
      283471
                    William McKinley (New Earth)
6895
      150660
                           Mookie (New Earth)
                                               ID
                               urlslug
             \/wiki\/Jakeem_Williams (New Earth) Secret Identity
386
              \/wiki\/Hadley Jaggar (New Earth) Secret Identity
1400
1401
                   \width / \text{Nergal} (\text{New Earth})
1832
              \/wiki\/Gregory Wolfe (New Earth) Public Identity
      \/wiki\/Clarence Charles Batson V (New Earth) Public Identity
1937
                \/wiki\/Chad Graham (New Earth) Secret Identity
1938
2065
                  \/wiki\/Jupiter (New Earth)
                                                         NaN
                                                         NaN
                  \/wiki\/Pegasus (New Earth)
2066
                  \/wiki\/Asteroth (New Earth) Secret Identity
2067
2230
              \/wiki\/Red Panzer IV (New Earth) Secret Identity
2231
                 \/wiki\/Gernsback (New Earth)
                                                          NaN
2232
               \/wiki\/Henry Cosgei (New Earth) Secret Identity
              \/wiki\/Marilyn Batson (New Earth) Public Identity
2413
               \/wiki\/Michael Tree (New Earth)
2414
                                                           NaN
                 \/wiki\/Brunhilde (New Earth)
                                                          NaN
2841
                  \/wiki\/Kuan Ti (New Earth) Public Identity
2842
3104
              \/wiki\/Helen of Troy (New Earth)
3105
                    \/wiki\/Pluto (New Earth) Public Identity
                  \/wiki\/Ammon-Ra (New Earth) Secret Identity
3431
                  \/wiki\/Kreaven (New Earth) Public Identity
3432
                   \width / Vulcan (New Earth)
3433
                                                         NaN
              \/wiki\/Donna Cavanagh (New Earth) Public Identity
3434
3435
              \/wiki\/Amadeus Arkham (New Earth) Public Identity
3819
              \/wiki\/Scott Spencer (New Earth) Public Identity
3820
               \/wiki\/Maria Montez (New Earth)
                                                            NaN
     \/wiki\/Diana, Goddess of the Hunt (New Earth)
3821
                                                                  NaN
         \/wiki\/Gregory the Gargoyle (New Earth)
                                                               NaN
3822
3823
       \/wiki\/Minerva (Roman Goddess) (New Earth)
                                                                 NaN
                  \/wiki\/Auerbach (New Earth) Secret Identity
3824
4320
               \/wiki\/Virgil Adams (New Earth) Public Identity
5527
                \/wiki\/Lisa Morice (New Earth) Public Identity
              \/wiki\/Carter Nichols (New Earth) Public Identity
5528
5529
                    \/wiki\/Cupid (New Earth)
                                                         NaN
                    \width / Juno (New Earth)
5530
                                                        NaN
                  \/wiki\/Luki Lo (New Earth)
5531
                                                          NaN
5532
              \width \sqrt{\operatorname{Stanley}} Wilson (New Earth)
                                                            NaN
5533
                \/wiki\/Elena Leal (New Earth) Public Identity
```

```
5534
                                       \/wiki\/Druid (New Earth) Secret Identity
5535
                                       \/wiki\/Crone (New Earth) Secret Identity
5536
                                 \/wiki\/Fancy Feet (New Earth)
                                                                                                                    NaN
                               \/wiki\/Rico Strada (New Earth)
                                                                                                                    NaN
5537
                        \width 
5538
                                                                                                                           NaN
                             \/wiki\/Materna Minnx (New Earth) Public Identity
6532
                         \with Vert Baker, Jr. (New Earth) Public Identity
6533
6534
                                     \/wiki\/Prowley (New Earth) Public Identity
6535
                                     \/\iki\/Smother_(New_Earth)
                                                                                                                  NaN
6536
                              \/wiki\/Mark Antaeus (New Earth) Public Identity
                                 \/wiki\/Jerome Cox (New Earth) Public Identity
6537
                      \/wiki\/Apollo (Roman God)_(New_Earth)
6538
                                                                                                                              NaN
                                      \/wiki\/Ben Lo (New Earth) Public Identity
6539
6540
                             \/wiki\/Auctioneer II (New Earth) Secret Identity
6887
                           \/wiki\/Herbert Hoover (New Earth) Public Identity
6888
                     \/wiki\/William Howard Taft (New Earth) Public Identity
6889
                       \/wiki\/Frank Fitzsimmons (New Earth) Public Identity
                           \/wiki\/James Garfield (New Earth) Public Identity
6890
                               \/wiki\/Nadine West (New Earth) Public Identity
6891
                           \/wiki\/Warren Harding (New Earth) Public Identity
6892
                        \/wiki\/William Harrison (New Earth) Public Identity
6893
6894
                         \/wiki\/William McKinley (New Earth) Public Identity
6895
                                      \/wiki\/Mookie (New Earth) Public Identity
                         ALIGN
                                                    EYE
                                                                                       HAIR \
                              NaN
                                          Brown Eves
386
                                                                                           NaN
                                                   Blue Eves
                                                                                      Blond Hair
1400
               Good Characters
1401
                Bad Characters Yellow Eves
                                                                                               NaN
          Neutral Characters
                                                 Brown Eyes
                                                                                        Black Hair
1832
1937
               Good Characters
                                                          NaN
                                                                                     Black Hair
1938
                Bad Characters
                                                          NaN
                                                                                    Blond Hair
               Good Characters
                                                          NaN
                                                                                     White Hair
2065
                                                          NaN
2066
               Good Characters
                                                                                     Black Hair
                Bad Characters Yellow Eyes
2067
                                                                                     Black Hair
2230
                Bad Characters
                                                          NaN
                                                                                             NaN
2231
               Good Characters
                                                          NaN
                                                                                              NaN
2232
               Good Characters
                                                 Black Eyes
                                                                                      Black Hair
2413
               Good Characters
                                                 Brown Eyes
                                                                                        Brown Hair
                                                                              Black Hair
                                                     NaN
2414
                               NaN
2841
               Good Characters
                                                           NaN
                                                                                              NaN
2842
               Good Characters
                                                          NaN
                                                                                     Black Hair
3104
               Good Characters
                                                          NaN
                                                                                     Blond Hair
3105
                Bad Characters
                                                          NaN
                                                                                             NaN
3431 Neutral Characters
                                                          NaN
                                                                                              NaN
3432 Neutral Characters
                                                          NaN
                                                                                              NaN
3433
               Good Characters
                                                          NaN
                                                                                              NaN
3434
               Good Characters
                                                 Green Eyes
                                                                                       Blond Hair
                                                          NaN
3435
               Good Characters
                                                                                              NaN
3819 Neutral Characters
                                                          NaN
                                                                                    Black Hair
3820
                               NaN
                                                     NaN
                                                                                        NaN
```

3821	Good Characters	NaN	NaN
3822	Good Characters	NaN	NaN
3823	Good Characters	NaN	NaN
3824	NaN	NaN	Brown Hair
4320	Bad Characters	NaN	Black Hair
5527	Good Characters	Grey Eyes	Strawberry Blond Hair
5528	Good Characters	NaN	Brown Hair
5529	Good Characters	NaN	NaN
5530	Good Characters	NaN	NaN
5531	Good Characters	NaN	Black Hair
5532	Good Characters	NaN	Black Hair
5533	Good Characters	NaN	White Hair
5534	Bad Characters	NaN	Black Hair
5535	Bad Characters	NaN	Grey Hair
5536	Bad Characters	NaN	m NaN
5537	Bad Characters	Blue Eyes	Blond Hair
5538	NaN	$\mathrm{NaN}^{"}$	NaN
6532	NaN	NaN	Brown Hair
6533	Neutral Characters	Blue Eyes	Grey Hair
6534	Neutral Characters	Yellow Eyes	Black Hair
6535	Neutral Characters	m NaN	NaN
6536	Good Characters	Blue Eyes	Black Hair
6537	Bad Characters	NaN	NaN
6538	Good Characters	NaN	NaN
6539	Good Characters	Brown Eyes	Black Hair
6540	Bad Characters	NaN	White Hair
6887	Good Characters	NaN	NaN
6888	Good Characters	NaN	NaN
6889	Good Characters	NaN	Grey Hair
6890	Good Characters	NaN	NaN
6891	Good Characters	NaN	NaN
6892	Good Characters	NaN	NaN
6893	Good Characters	NaN	NaN
6894	Good Characters	NaN	NaN
6895	Bad Characters	Blue Eyes	Blond Hair
	SEX	GSM	f ALIVE \
386	Male Characters	Ι	NaN Living Characters
1400	Male Characters	-	NaN Deceased Characters
1401	Male Characters	-	NaN Living Characters
1832	Male Characters	-	NaN Living Characters
1937	Male Characters	-	NaN Deceased Characters
1938	Male Characters		NaN Deceased Characters
2065	Male Characters	-	NaN Living Characters
2066	Female Characters		NaN Living Characters
2067	Male Characters		NaN Living Characters
2230	Male Characters		NaN Living Characters
2231	Male Characters		NaN Living Characters
2232	Male Characters	-	NaN Living Characters

2413	Female Characters	NaN Deceased Characters
	Female Characters	NaN Living Characters
2841	Female Characters	NaN Living Characters
2842	Male Characters	NaN Living Characters
3104	Female Characters	NaN Living Characters
3105		NaN Living Characters
3431	Male Characters	NaN Living Characters
3432	Male Characters	NaN Living Characters
3433	Male Characters	NaN Living Characters
3434	Female Characters	Homosexual Characters Living Characters
3435	Male Characters	NaN Living Characters
3819	Male Characters	NaN Living Characters
3820	Female Characters	NaN Living Characters
3821	Female Characters	NaN Living Characters
3822	Male Characters	NaN Living Characters
3823	Female Characters	NaN Living Characters
3824	Male Characters	NaN Living Characters
4320	Male Characters	NaN Living Characters
•••		
5527	Female Characters	NaN Living Characters
5528	Male Characters	NaN Deceased Characters
5529	Male Characters	NaN Living Characters
5530	Female Characters	NaN Living Characters
5531	Male Characters	NaN Living Characters
5532	Male Characters	NaN Living Characters
5533	Female Characters	NaN Living Characters
5534	Male Characters	NaN Living Characters
5535	Female Characters	NaN Living Characters
5536	Male Characters	NaN Living Characters
5537	Male Characters	NaN Living Characters
5538	Male Characters	NaN Living Characters
6532	Female Characters	NaN Living Characters
6533	Male Characters	NaN Living Characters
6534	NaN	NaN Living Characters
6535	Female Characters	NaN Living Characters
6536	Male Characters	NaN Deceased Characters
6537	Male Characters	NaN Living Characters
6538	Male Characters	NaN Living Characters
6539	Male Characters	NaN Living Characters
6540	Male Characters	NaN Living Characters
6887	Male Characters	NaN Living Characters
6888	Male Characters	NaN Living Characters
6889	Male Characters	NaN Living Characters
6890	Male Characters	NaN Living Characters
6891	Female Characters	NaN Living Characters
6892	Male Characters	NaN Living Characters
6893	Male Characters	NaN Living Characters
6894	Male Characters	NaN Living Characters
6895	Male Characters	NaN Living Characters
5555		Tion, Diving Citationolis

APPEARANCES FIRST APPEARANCE YEAR 386NaN NaN 79.019.0 NaN NaN 1400 1401 19.0 NaN NaN 1832NaN 14.0 NaN 1937 NaN 13.0 NaN NaN 1938 13.0 NaN NaN 206512.0 NaN 2066 12.0 NaN NaN 2067 NaN 12.0 NaN 223011.0 NaN NaN 223111.0 NaN NaN 2232 11.0 NaN NaN 2413NaN NaN 10.0 241410.0 NaN NaN 2841 8.0 NaN NaN 2842 8.0 NaN NaN 3104NaN 7.0 NaN 3105 7.0 NaN NaN 3431 6.0 NaN NaN 3432NaN NaN 6.0 3433 6.0 NaN NaN 34346.0NaN NaN 34356.0 NaN NaN 3819 NaN 5.0 NaN 3820 5.0 NaN NaN 38215.0 NaNNaN 3822 NaN 5.0 NaN 38235.0 NaN NaN 38245.0 NaN NaN 4320 4.0 NaN NaN 55272.0 NaN NaN 5528NaN NaN 2.0 5529NaN NaN 2.0 5530 2.0 NaN NaN 5531 2.0 NaN NaN 55322.0 NaN NaN 55332.0 NaN NaN 55342.0 NaN NaN 5535 NaN NaN 2.0 5536NaN 2.0 NaN5537 2.0 NaN NaN 5538 NaN 2.0 NaN 6532NaN NaN 1.0 65331.0 NaN NaN 6534 NaN 1.0 NaN 6535NaN NaN 1.0 NaN 65361.0 NaN

6537

1.0

NaN

NaN

```
6538
          1.0
                      NaN
                            NaN
                      NaN
6539
          1.0
                            NaN
6540
          1.0
                      NaN
                            NaN
                        NaN
6887
          NaN
                             NaN
          NaN
                       NaN
                             NaN
6888
                       NaN
                             NaN
6889
          NaN
                       NaN
6890
          NaN
                             NaN
          NaN
                       NaN
                             NaN
6891
6892
          NaN
                       NaN
                             NaN
6893
          NaN
                       NaN
                             NaN
6894
          NaN
                        NaN
                             NaN
          NaN
                       NaN
6895
                             NaN
```

[69 rows x 13 columns]

```
In [0]: # Запоминаем индексы строк с пустыми значениями flt_index = data[data['YEAR'].isnull()].index flt_index
```

In [0]: # Проверяем что выводятся нужные строки data[data.index.isin(flt_index)]

```
Out[0]:
           page id
                                            name \
     386
             1891
                          Jakeem Williams (New Earth)
                            Hadley Jaggar (New Earth)
     1400
            64303
                                 Nergal (New Earth)
     1401
            13097
     1832
            65286
                            Gregory Wolfe (New Earth)
                    Clarence Charles Batson V (New Earth)
     1937
            146333
     1938
                              Chad Graham (New Earth)
            113413
     2065
                                 Jupiter (New Earth)
           344513
     2066
           344983
                                 Pegasus (New Earth)
     2067
            286906
                                Asteroth (New Earth)
                             Red Panzer IV (New Earth)
     2230
           155569
     2231
                               Gernsback (New Earth)
            19044
     2232
                             Henry Cosgei (New Earth)
           202057
     2413
                            Marilyn Batson (New Earth)
           216380
     2414
                             Michael Tree (New Earth)
           178197
     2841
            383108
                                Brunhilde (New Earth)
                                 Kuan Ti (New Earth)
     2842
           251517
                             Helen of Troy (New Earth)
     3104
           383914
                                  Pluto (New Earth)
     3105
           256793
     3431
            15909
                                Ammon-Ra (New Earth)
```

```
3432
      348898
                           Kreaven (New Earth)
                            Vulcan (New Earth)
3433
      345589
3434
      57839
                      Donna Cavanagh (New Earth)
3435
      68612
                      Amadeus Arkham (New Earth)
                       Scott Spencer (New Earth)
3819
      182833
3820
                        Maria Montez (New Earth)
      213354
3821
      345591 Diana, Goddess of the Hunt (New Earth)
3822
      47346
                  Gregory the Gargoyle (New Earth)
3823
      345586
                Minerva (Roman Goddess) (New Earth)
3824
      66157
                          Auerbach (New Earth)
4320
      139807
                        Virgil Adams (New Earth)
. . .
      ...
                         Lisa Morice (New Earth)
5527
      112333
                      Carter Nichols (New Earth)
5528
      189975
5529
      139768
                             Cupid (New Earth)
5530
      345585
                              Juno (New Earth)
5531
      271506
                           Luki Lo (New Earth)
      177249
5532
                      Stanley Wilson (New Earth)
5533
      250224
                         Elena Leal (New Earth)
5534
                             Druid (New Earth)
      185720
5535
      218828
                             Crone (New Earth)
5536
                         Fancy Feet (New Earth)
      95738
5537
      182478
                         Rico Strada (New Earth)
5538
                    Benjamin Hubbard (New Earth)
      31642
                       Materna Minnx (New Earth)
6532
      159528
                     Frank Baker, Jr. (New Earth)
6533
      19799
                           Prowley (New Earth)
6534
      242167
6535
      95767
                           Smother (New Earth)
                       Mark Antaeus (New Earth)
6536
      16094
6537
                         Jerome Cox (New Earth)
      128000
                    Apollo (Roman God) (New Earth)
6538
      345590
                            Ben Lo (New Earth)
6539
      15050
6540
                       Auctioneer II (New Earth)
      205584
6887
      283661
                      Herbert Hoover (New Earth)
6888
      283657
                   William Howard Taft (New Earth)
6889
      21655
                    Frank Fitzsimmons (New Earth)
6890
      283482
                      James Garfield (New Earth)
6891
      66302
                        Nadine West (New Earth)
6892
      283475
                      Warren Harding (New Earth)
6893
                     William Harrison (New Earth)
      283478
6894
      283471
                     William McKinley (New Earth)
6895
      150660
                            Mookie (New Earth)
                                urlslug
                                                ID
             \/wiki\/Jakeem Williams (New Earth) Secret Identity
386
1400
               \/wiki\/Hadley Jaggar (New Earth) Secret Identity
                    \/ \ \/ \wiki\/\Nergal_(\New_Earth)
                                                          NaN
1401
               \/wiki\/Gregory Wolfe (New Earth) Public Identity
1832
1937
      \/wiki\/Clarence_Charles_Batson_V_(New_Earth) Public Identity
1938
                \/wiki\/Chad Graham (New Earth) Secret Identity
```

```
2065
                  \/wiki\/Jupiter (New Earth)
                                                       NaN
2066
                  \/\iki\/\Pegasus_(New Earth)
                                                        NaN
2067
                 \/wiki\/Asteroth (New Earth) Secret Identity
              \/wiki\/Red Panzer IV (New Earth) Secret Identity
2230
                 \/wiki\/Gernsback (New Earth)
2231
                                                         NaN
2232
               \/wiki\/Henry Cosgei (New Earth) Secret Identity
             \/wiki\/Marilyn Batson (New Earth) Public Identity
2413
2414
               \/wiki\/Michael Tree (New Earth)
                                                          NaN
2841
                 \/wiki\/Brunhilde (New Earth)
                                                        NaN
                  \/wiki\/Kuan Ti (New Earth) Public Identity
2842
              \/wiki\/Helen_ of Troy (New Earth)
3104
                                                           NaN
                   \/wiki\/Pluto (New Earth) Public Identity
3105
                 \/wiki\/Ammon-Ra (New Earth) Secret Identity
3431
                  \/wiki\/Kreaven (New Earth) Public Identity
3432
3433
                   \width / Vulcan (New Earth)
             \/wiki\/Donna_Cavanagh (New Earth) Public Identity
3434
3435
             \/wiki\/Amadeus Arkham (New Earth) Public Identity
              \/wiki\/Scott Spencer (New Earth) Public Identity
3819
3820
              \/wiki\/Maria Montez (New Earth)
                                                           NaN
3821
     \/wiki\/Diana, Goddess of the Hunt (New Earth)
                                                                NaN
3822
         \/wiki\/Gregory the Gargoyle (New Earth)
                                                             NaN
3823
       \/wiki\/Minerva (Roman Goddess) (New Earth)
                                                                NaN
3824
                 \/wiki\/Auerbach (New Earth) Secret Identity
4320
              \/wiki\/Virgil Adams (New Earth) Public Identity
               \/wiki\/Lisa Morice (New Earth) Public Identity
5527
             \/wiki\/Carter Nichols (New Earth) Public Identity
5528
5529
                   \/wiki\/Cupid (New Earth)
                                                       NaN
5530
                    \/wiki\/Juno (New Earth)
                                                       NaN
5531
                  \/wiki\/Luki Lo (New Earth)
                                                         NaN
             \/wiki\/Stanley Wilson (New Earth)
                                                          NaN
5532
                \/wiki\/Elena Leal (New Earth) Public Identity
5533
                   \/wiki\/Druid_(New Earth) Secret Identity
5534
                   \/wiki\/Crone_(New Earth) Secret Identity
5535
5536
                \/wiki\/Fancy Feet (New Earth)
                                                         NaN
               \/wiki\/Rico Strada (New Earth)
                                                         NaN
5537
5538
            \/wiki\/Benjamin Hubbard (New Earth)
                                                             NaN
              \/wiki\/Materna Minnx (New Earth) Public Identity
6532
             /wiki\/Frank Baker, Jr. (New Earth) Public Identity
6533
6534
                  \/wiki\/Prowley (New Earth) Public Identity
                  \width / Smother (New Earth)
6535
6536
              \/wiki\/Mark Antaeus (New Earth) Public Identity
6537
                \/wiki\/Jerome Cox (New Earth) Public Identity
6538
          \/wiki\/Apollo (Roman God) (New Earth)
                   \/wiki\/Ben Lo (New Earth) Public Identity
6539
6540
              \/wiki\/Auctioneer II (New Earth) Secret Identity
             \/wiki\/Herbert Hoover (New Earth) Public Identity
6887
6888
          \/wiki\/William Howard Taft (New Earth) Public Identity
6889
           \/wiki\/Frank Fitzsimmons (New Earth) Public Identity
6890
             \/wiki\/James Garfield (New Earth) Public Identity
```

```
6891
                \/wiki\/Nadine West (New Earth) Public Identity
6892
              \/wiki\/Warren_Harding_(New_Earth) Public Identity
            \/wiki\/William Harrison (New Earth) Public Identity
6893
            \/wiki\/William McKinley (New Earth) Public Identity
6894
                   \/wiki\/Mookie (New Earth) Public Identity
6895
             ALIGN
                           EYE
                                            HAIR \
386
               NaN
                     Brown Eyes
                                               NaN
1400
       Good Characters
                          Blue Eyes
                                            Blond Hair
1401
        Bad Characters Yellow Eyes
                                                 NaN
1832 Neutral Characters
                         Brown Eves
                                             Black Hair
1937
       Good Characters
                                           Black Hair
                              NaN
        Bad Characters
                             NaN
                                           Blond Hair
1938
                              NaN
2065
       Good Characters
                                           White Hair
2066
       Good Characters
                              NaN
                                           Black Hair
2067
        Bad Characters Yellow Eves
                                            Black Hair
2230
        Bad Characters
                             NaN
                                                NaN
2231
       Good Characters
                              NaN
                                                NaN
2232
       Good Characters
                                            Black Hair
                         Black Eyes
                         Brown Eyes
2413
       Good Characters
                                             Brown Hair
2414
                NaN
                           NaN
                                        Black Hair
2841
       Good Characters
                              NaN
                                                NaN
2842
       Good Characters
                              NaN
                                           Black Hair
3104
       Good Characters
                              NaN
                                           Blond Hair
3105
        Bad Characters
                             NaN
                                                NaN
3431 Neutral Characters
                              NaN
                                                NaN
3432 Neutral Characters
                              NaN
                                                NaN
3433
       Good Characters
                              NaN
                                                NaN
3434
       Good Characters
                         Green Eyes
                                             Blond Hair
3435
       Good Characters
                              NaN
                                                NaN
3819 Neutral Characters
                              NaN
                                           Black Hair
3820
                NaN
                           NaN
                                             NaN
3821
       Good Characters
                              NaN
                                                NaN
3822
       Good Characters
                              NaN
                                                NaN
3823
       Good Characters
                              NaN
                                                NaN
3824
                NaN
                           NaN
                                        Brown Hair
4320
        Bad Characters
                             NaN
                                           Black Hair
                          Grey Eyes Strawberry Blond Hair
5527
       Good Characters
5528
       Good Characters
                              NaN
                                           Brown Hair
5529
       Good Characters
                              NaN
                                                NaN
5530
       Good Characters
                              NaN
                                                NaN
5531
       Good Characters
                              NaN
                                           Black Hair
5532
       Good Characters
                              NaN
                                           Black Hair
       Good Characters
5533
                              NaN
                                           White Hair
                             NaN
5534
        Bad Characters
                                           Black Hair
5535
        Bad Characters
                             NaN
                                           Grey Hair
5536
        Bad Characters
                             NaN
                                                NaN
        Bad Characters
                         Blue Eyes
                                           Blond Hair
5537
5538
                NaN
                           NaN
                                             NaN
```

6532	m NaN	NaN	Brown Hair
	Neutral Characters	Blue Eyes	Grey Hair
			Black Hair
	Neutral Characters Neutral Characters	Yellow Eyes NaN	
			NaN Dladr Hain
6536	Good Characters	Blue Eyes	Black Hair
6537	Bad Characters	NaN	NaN
6538	Good Characters	NaN	NaN
6539	Good Characters	Brown Eye	
6540	Bad Characters	NaN	White Hair
6887	Good Characters	NaN	NaN
6888	Good Characters	NaN	NaN
6889	Good Characters	NaN	Grey Hair
6890	Good Characters	NaN	NaN
6891	Good Characters	NaN	NaN
6892	Good Characters	NaN	NaN
6893	Good Characters	NaN	NaN
6894	Good Characters	NaN	NaN
6895	Bad Characters	Blue Eyes	Blond Hair
	SEX	GSI	M ALIVE \
386	Male Characters		NaN Living Characters
1400	Male Characters		NaN Deceased Characters
1401	Male Characters		NaN Living Characters
1832	Male Characters		NaN Living Characters
1937	Male Characters		NaN Deceased Characters
1938	Male Characters		NaN Deceased Characters
2065	Male Characters		NaN Living Characters
	Female Characters		NaN Living Characters
2067	Male Characters		NaN Living Characters
2230	Male Characters		NaN Living Characters
2231	Male Characters		NaN Living Characters
2232			NaN Living Characters
	Female Characters		NaN Deceased Characters
	Female Characters		NaN Living Characters
	Female Characters		NaN Living Characters
2842	Male Characters		NaN Living Characters
	Female Characters		NaN Living Characters
3104 3105	Male Characters		NaN Living Characters
3431			NaN Living Characters
3431 3432			NaN Living Characters
3432 3433	Male Characters		NaN Living Characters
		Homosexual	O
	Male Characters	Homosexuar	9
3435			8
3819			NaN Living Characters
	Female Characters		NaN Living Characters
3821	Female Characters		NaN Living Characters
3822	Male Characters		NaN Living Characters
	Female Characters		NaN Living Characters
3824			NaN Living Characters
4320	Male Characters		NaN Living Characters

•••	•••		
5527	Female Characters	NaN	Living Characters
5528	Male Characters	NaN	Deceased Characters
5529	Male Characters	NaN	Living Characters
5530	Female Characters	NaN	Living Characters
5531	Male Characters	NaN	Living Characters
5532	Male Characters	NaN	Living Characters
5533	Female Characters	NaN	Living Characters
5534	Male Characters	NaN	Living Characters
5535	Female Characters	NaN	Living Characters
5536	Male Characters	NaN	Living Characters
5537	Male Characters	NaN	Living Characters
5538	Male Characters	NaN	Living Characters
6532	Female Characters	NaN	Living Characters
6533	Male Characters	NaN	Living Characters
6534	NaN	NaN L	iving Characters
6535	Female Characters	NaN	Living Characters
6536	Male Characters	NaN	Deceased Characters
6537	Male Characters	NaN	Living Characters
6538	Male Characters	NaN	Living Characters
6539	Male Characters	NaN	Living Characters
6540	Male Characters	NaN	Living Characters
6887	Male Characters	NaN	Living Characters
6888	Male Characters	NaN	Living Characters
6889	Male Characters	NaN	Living Characters
6890	Male Characters	NaN	Living Characters
6891	Female Characters	NaN	Living Characters
6892	Male Characters	NaN	Living Characters
6893	Male Characters	NaN	Living Characters
6894	Male Characters	NaN	Living Characters
6895	Male Characters	NaN	Living Characters

APPEARANCES FIRST APPEARANCE YEAR

386	79.0	NaN	NaN
1400	19.0	NaN	NaN
1401	19.0	NaN	NaN
1832	14.0	NaN	NaN
1937	13.0	NaN	NaN
1938	13.0	NaN	NaN
2065	12.0	NaN	NaN
2066	12.0	NaN	NaN
2067	12.0	NaN	NaN
2230	11.0	NaN	NaN
2231	11.0	NaN	NaN
2232	11.0	NaN	NaN
2413	10.0	NaN	NaN
2414	10.0	NaN	NaN
2841	8.0	NaN	NaN
2842	8.0	NaN	NaN
3104	7.0	NaN	NaN

3105	7.0	NaN	NaN
3431	6.0	NaN	NaN
3432	6.0	NaN	NaN
3433	6.0	NaN	NaN
3434	6.0	NaN	NaN
3435	6.0	NaN	NaN
3819	5.0	NaN	NaN
3820	5.0	NaN	NaN
3821	5.0	NaN	NaN
3822	5.0	NaN	NaN
3823	5.0	NaN	NaN
3824	5.0	NaN	NaN
4320	4.0	NaN	NaN
		•••	
5527	2.0	NaN	NaN
5528	2.0	NaN	NaN
5529	2.0	NaN	NaN
5530	2.0	NaN	NaN
5531	2.0	NaN	NaN
5532	2.0	NaN	NaN
5533	2.0	NaN	NaN
5534	2.0	NaN	NaN
5535	2.0	NaN	NaN
5536	2.0	NaN	NaN
5537	2.0	NaN	NaN
5538	2.0	NaN	NaN
6532	1.0	NaN	NaN
6533	1.0	NaN	NaN
6534	1.0	NaN	NaN
6535	1.0	NaN	NaN
6536	1.0	NaN	NaN
6537	1.0	NaN	NaN
6538	1.0	NaN	NaN
6539	1.0	NaN	NaN
6540	1.0	NaN	NaN
6887	NaN	NaN	NaN
6888	NaN	NaN	
6889	NaN	NaN	NaN
6890	NaN	NaN	
6891	NaN	NaN	NaN
6892	NaN	NaN	NaN
6893	NaN	NaN	NaN
6894	NaN	NaN	
6895	NaN	NaN	NaN

 $[69~{\rm rows}~{\rm x}~13~{\rm columns}]$

 $\begin{array}{l} \text{In [0]: } \operatorname{data_num_Year} = \operatorname{data_num}[['YEAR']] \\ \operatorname{data_num_Year.head}() \end{array}$

Out[0]: YEAR

```
0 1939.0
      1 1986.0
     2 1959.0
      3 1987.0
      4 1940.0
In [0]: from sklearn.impute import SimpleImputer
      from sklearn.impute import MissingIndicator
In [0]: # Фильтр для проверки заполнения пустых значений
      indicator = MissingIndicator()
      mask missing values only = indicator.fit transform(data num Year)
     mask missing values only
Out[0]: array([[False],
           |False|,
           [False],
           [True],
           [True],
           [True]])
In [0]: strategies=['mean', 'median', 'most frequent']
In [0]: def test num impute(strategy param):
        imp num = SimpleImputer(strategy=strategy param)
        data num imp = imp num.fit transform(data num Year)
        return data num imp[mask missing values only]
In [0]: strategies[0], test num impute(strategies[0])
Out[0]: ('mean', array([1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178, 1989.76666178, 1989.76666178, 1989.76666178,
           1989.76666178]))
In [0]: strategies[1], test num impute(strategies[1])
```

```
Out[0]: ('median',
      array([1992., 1992., 1992., 1992., 1992., 1992., 1992., 1992., 1992.,
           1992., 1992., 1992., 1992., 1992., 1992., 1992., 1992.,
           1992., 1992., 1992., 1992., 1992., 1992., 1992., 1992.,
           1992., 1992., 1992., 1992., 1992., 1992., 1992., 1992., 1992.,
           1992., 1992., 1992., 1992., 1992., 1992., 1992., 1992.,
           1992., 1992., 1992., 1992., 1992., 1992., 1992., 1992.,
           1992., 1992., 1992., 1992., 1992., 1992., 1992., 1992.,
           1992., 1992., 1992., 1992., 1992., 1992.]))
In [0]: strategies[2], test num impute(strategies[2])
Out[0]: ('most frequent',
      array([2006., 2006., 2006., 2006., 2006., 2006., 2006., 2006., 2006.,
           2006., 2006., 2006., 2006., 2006., 2006., 2006., 2006., 2006.,
           2006., 2006., 2006., 2006., 2006., 2006., 2006., 2006., 2006.,
           2006., 2006., 2006., 2006., 2006., 2006., 2006., 2006.,
           2006., 2006., 2006., 2006., 2006., 2006., 2006., 2006., 2006.,
           2006., 2006., 2006., 2006., 2006., 2006., 2006., 2006., 2006.
           2006., 2006., 2006., 2006., 2006., 2006., 2006., 2006.,
           2006., 2006., 2006., 2006., 2006., 2006.]))
2.4. Внедрение значений (категориальные данные)
In [0]: # Выберем категориальные колонки с пропущенными значениями
      # Цикл по колонкам датасета
     cat cols = []
     for col in data.columns:
         # Количество пустых значений
        temp null count = data[data[col].isnull()].shape[0]
        dt = str(data[col].dtype)
        if temp_null_count>0 and (dt=='object'):
           cat cols.append(col)
           temp_perc = round((temp_null_count / total_count) * 100.0, 2)
           print('Колонка {}. Тип данных {}. Количество пустых значений {}, {}%.'
                .format(col, dt, temp_null_count, temp_perc))
Колонка ID. Тип данных object. Количество пустых значений 2013, 29.19%.
Колонка ALIGN. Тип данных object. Количество пустых значений 601, 8.72%.
Колонка EYE. Тип данных object. Количество пустых значений 3628, 52.61%.
Колонка НАІР. Тип данных објест. Количество пустых значений 2274, 32.98%.
Колонка SEX. Тип данных object. Количество пустых значений 125, 1.81%.
Колонка GSM. Тип данных object. Количество пустых значений 6832, 99.07%.
Колонка ALIVE. Тип данных object. Количество пустых значений 3, 0.04%.
Колонка FIRST APPEARANCE. Тип данных object. Количество пустых значений 69, 1.0%.
In [0]: cat temp data = data [['HAIR']]
     cat temp data.tail(10)
```

Out[0]:

6886

HAIR NaN

```
6887
                NaN
                NaN
     6888
     6889
            Grey Hair
                NaN
     6890
     6891
                NaN
     6892
                NaN
                NaN
     6893
     6894
                NaN
     6895 Blond Hair
In [0]: cat temp data['HAIR'].unique()
Out[0]: array(['Black Hair', 'Brown Hair', 'White Hair', 'Blond Hair', 'Red Hair',
           nan, 'Green Hair', 'Strawberry Blond Hair', 'Grey Hair',
           'Silver Hair', 'Orange Hair', 'Purple Hair', 'Gold Hair',
           'Blue Hair', 'Reddish Brown Hair', 'Pink Hair', 'Violet Hair',
           'Platinum Blond Hair', dtype=object)
In [0]: cat temp data[cat temp data['HAIR'].isnull()].shape
Out[0]: (2274, 1)
In [0]: # Импьютация наиболее частыми значениями
     imp2 = SimpleImputer(missing values=np.nan, strategy='most frequent')
     data imp2 = imp2.fit transform(cat temp data)
     data imp2
Out[0]: array([['Black Hair'],
           ['Black Hair'],
           ['Brown Hair'],
           ['Black Hair'],
           ['Black Hair'],
           ['Blond Hair']], dtype=object)
In [0]: # Пустые значения отсутствуют
     np.unique(data imp2)
Out[0]: array(['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',
           'Violet Hair', 'White Hair', dtype=object)
2.5. Преобразование категориальных признаков в числовые
In [0]: cat enc = pd.DataFrame(\{'c1':data\ imp2.T[0]\})
     cat_enc
Out[0]:
                 c1
          Black Hair
     0
          Black Hair
     1
```

- 2 Brown Hair
- 3 White Hair
- Black Hair 4
- 5 Black Hair
- 6 Blond Hair
- 7 Black Hair
- 8 Blond Hair
- 9 Blond Hair
- 10 Blond Hair
- 11 Blond Hair
- 12 Red Hair
- 13 Brown Hair
- 14 Black Hair
- Black Hair 15
- 16 Brown Hair
- 17 Black Hair
- 18 Black Hair
- 19 Black Hair
- 20 Red Hair
- 21 Blond Hair
- 22 Black Hair
- 23 Green Hair
- 24 Red Hair
- 25
- Black Hair
- 26 Black Hair
- 27 Red Hair
- 28 Red Hair
- 29 Black Hair

- 6866 Black Hair
- 6867 Black Hair
- 6868 Black Hair
- 6869 Black Hair
- 6870 Black Hair
- 6871 Black Hair
- 6872 Black Hair
- 6873 Black Hair
- 6874 Black Hair
- 6875 Black Hair
- 6876 Red Hair
- 6877 Black Hair
- 6878 Blond Hair
- 6879 Black Hair
- 6880 Black Hair
- 6881 Red Hair
- 6882 Brown Hair
- 6883 Black Hair
- 6884 Black Hair
- 6885 Black Hair
- 6886 Black Hair

```
6887 Black Hair
      6888 Black Hair
      6889 Grey Hair
      6890 Black Hair
      6891 Black Hair
      6892 Black Hair
      6893 Black Hair
      6894 Black Hair
      6895 Blond Hair
      |6896 rows x 1 columns
2.5.1. Label encoding
In [0]: from sklearn.preprocessing import LabelEncoder, OneHotEncoder
In [0]: le = LabelEncoder()
      cat enc le = le.fit transform(cat enc['c1'])
In [0]: cat enc['c1'].unique()
Out[0]: array(['Black Hair', 'Brown Hair', 'White Hair', 'Blond Hair', 'Red Hair',
           'Green Hair', 'Strawberry Blond Hair', 'Grey Hair', 'Silver Hair',
           'Orange Hair', 'Purple Hair', 'Gold Hair', 'Blue Hair',
           'Reddish Brown Hair', 'Pink Hair', 'Violet Hair',
           'Platinum Blond Hair', dtype=object)
In [0]: np.unique(cat enc le)
Out[0]: array([0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14, 15, 16])
In [0]: le.inverse transform([x \text{ for } x \text{ in range}(16)])
Out[0]: array(['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'.
           'Violet Hair', dtype=object)
In [0]: cat enc le
Out[0]: array([0, 0, 3, ..., 0, 0, 1])
2.5.2. One-hot encoding
In [0]: ohe = OneHotEncoder()
      cat\_enc\_ohe = ohe.fit\_transform(cat\_enc[['c1']])
In [0]: cat enc.shape
Out[0]: (6896, 1)
In [0]: cat enc ohe.shape
```

```
Out[0]: <6896x17 sparse matrix of type '<class 'numpy.float64'>'
     with 6896 stored elements in Compressed Sparse Row format>
In [0]: cat enc ohe.todense()[0:10]
[0.],
     0.|,
     1.],
     [0.],
     [0.],
     0.|,
     [0.]
2.5.3. Или
In [0]: pd.get dummies(cat enc).tail()
     Out[0]:
  6891
         1
               0
                              0
  6892
         1
               0
                    0
                         0
                              0
         1
               0
                         0
  6893
                    0
                              0
         1
               0
                    0
                         0
                              0
  6894
         0
               1
                         0
                              0
  6895
                    0
    c1 Green Hair c1 Grey Hair c1 Orange Hair c1 Pink Hair \
  6891
                    0
         0
              0
         0
                    0
                         0
  6892
              0
                         0
  6893
         0
              0
                    0
              0
                         0
  6894
         0
                    0
         0
              0
  6895
                    0
                         0
    c1_Platinum Blond Hair c1_Purple Hair c1_Red Hair \
  6891
            0
                  0
                       0
```

Out[0]: (6896, 17)

In [0]: cat enc ohe

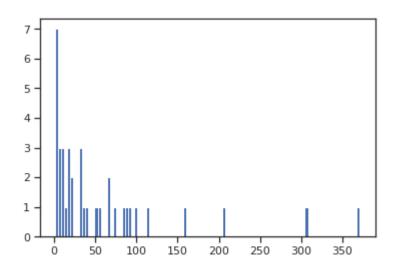
0000	O	O	O		
6894	0	0	0		
6895	0	0	0		
(e1_Reddish Brown	Hair c1_Silv	er Hair c1_S	Strawberry Blon	d Hair \
6891	_ 0	_0	_	0	
6892	0	0		0	
6893	0	0		0	
	0	0			
6894	0	0		0	
6895	0	0		0	
	1 Wieles Heim at	W71-:4 a II a:			
	c1_Violet Hair c1_	_			
6891	0	0			
6892	0	0			
6893	0	0			
6894	0	0			
6895	0	0			
In [0]: pd.ge	${ m et_dummies(cat_t)}$	emp_data, du	ımmy_na=T	rue).tail()	
0 4[0]	IIAID Disal IIa'	IIAID DI.	1 11	D D1 . II.' II	AID D - II.' \
Out[0]:	_	_	id nair nai.	_	AIR_Brown Hair \
6891	0	0	Ū	0	
6892	0	0	0	0	
6893	0	0	0	0	
6894	0	0	0	0	
6895	0	1	0	0	
.					
	HAIR_Gold Hair l	HAIR_Green	Hair HAIR_	_Grey Hair HA	IR_Orange Hair \
6891	0	0	0	0	
6892	0	0	0	0	
6893	0	0	0	0	
6894	0	0	0	0	
6895	0	0	0	0	
I	HAIR_Pink Hair I	HAIR_Platinu	ım Blond Ha	ir HAIR_Purpl	e Hair \
6891	0	0	C)	
6892	0	0	C		
6893	0	0	C		
6894	0	0	C		
6895	0	0	0		
0099	U	U	C	•	
I	HAIR_Red Hair H	AIR Reddish	n Brown Hair	HAIR Silver I	Hair \
6891	0	0	0	·—··	,
6892	0	Ü	0		
	_	U	0		
6893	0	Ü	0		
6894	0	Ü	0		
6895	0	0	0		
I	HAIR Strawberry	Blond Hair H	IAIR Violet	Hair HAIR W	hite Hair HAIR_nan
6891	TITIL DUAW DELLY	0	0	0 1	mod nan man _nan
		0		_	
6892		0	0	0 1	

6893	0	0	0	1
6894	0	0	0	1
6895	0	0	0	0

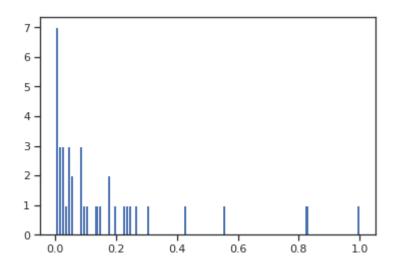
2.6. Масштабирование данных

In [0]: from sklearn.preprocessing import MinMaxScaler, StandardScaler, Normalizer

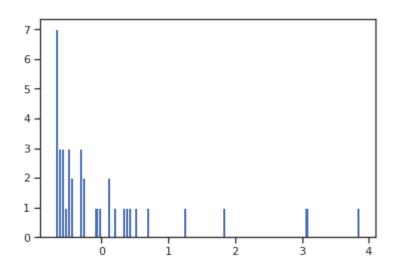
2.6.1. МіпМах масштабирование



In [0]: plt.hist(sc1_data, 100) plt.show()



2.6.2. Z-оценка



2.6.3. Нормализация данных

