## rk1\_TMO\_khanunov

## May 4, 2023

```
[25]: import numpy as np
      import pandas as pd
      import seaborn as sns
      import matplotlib.pyplot as plt
      %matplotlib inline
      sns.set(style="ticks")
      from sklearn.impute import SimpleImputer
      from sklearn.impute import MissingIndicator
      from sklearn.preprocessing import LabelEncoder, OneHotEncoder
      from sklearn.preprocessing import MinMaxScaler, StandardScaler, Normalizer
      import plotly.express as px
[26]: df = pd.read_csv('googleplaystore.csv')
[27]: df.head()
[27]:
                                                                              Rating
                                                        App
                                                                   Category
            Photo Editor & Candy Camera & Grid & ScrapBook ART_AND_DESIGN
      0
                                                                                 4.1
      1
                                        Coloring book moana
                                                             ART_AND_DESIGN
                                                                                 3.9
        U Launcher Lite - FREE Live Cool Themes, Hide ... ART_AND_DESIGN
                                                                               4.7
      2
      3
                                      Sketch - Draw & Paint ART_AND_DESIGN
                                                                                 4.5
      4
                     Pixel Draw - Number Art Coloring Book ART_AND_DESIGN
                                                                                 4.3
        Reviews
                 Size
                          Installs
                                    Type Price Content Rating
            159
                           10,000+
      0
                  19M
                                    Free
                                              0
                                                      Everyone
      1
            967
                  14M
                          500,000+
                                    Free
                                              0
                                                      Everyone
          87510 8.7M
      2
                        5,000,000+
                                    Free
                                              0
                                                      Everyone
                       50,000,000+
      3
        215644
                  25M
                                              0
                                                          Teen
                                    Free
            967 2.8M
                          100,000+
                                              0
                                    Free
                                                      Everyone
                            Genres
                                         Last Updated
                                                              Current Ver \
      0
                      Art & Design
                                      January 7, 2018
                                                                     1.0.0
        Art & Design; Pretend Play
                                     January 15, 2018
                                                                     2.0.0
      1
      2
                      Art & Design
                                       August 1, 2018
                                                                     1.2.4
      3
                      Art & Design
                                         June 8, 2018
                                                       Varies with device
      4
           Art & Design; Creativity
                                        June 20, 2018
                                                                       1.1
```

```
1 4.0.3 and up
      2 4.0.3 and up
      3
          4.2 and up
          4.4 and up
[28]: df.info()
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 10841 entries, 0 to 10840
     Data columns (total 13 columns):
          Column
                          Non-Null Count Dtype
          _____
                          _____
                                          ----
      0
          App
                          10841 non-null
                                          object
      1
          Category
                          10841 non-null object
      2
          Rating
                          9367 non-null
                                          float64
                          10841 non-null object
      3
          Reviews
      4
          Size
                          10841 non-null object
      5
          Installs
                          10841 non-null object
      6
          Type
                          10840 non-null object
      7
          Price
                          10841 non-null object
      8
          Content Rating 10840 non-null object
          Genres
                          10841 non-null object
                          10841 non-null object
      10 Last Updated
      11 Current Ver
                          10833 non-null
                                          object
      12 Android Ver
                          10838 non-null object
     dtypes: float64(1), object(12)
     memory usage: 1.1+ MB
[29]: def miss(df):
         total = df.isnull().sum().sort_values(ascending=False)
         percent = (df.isnull().sum()/df.isnull().count()).sort_values(ascending=__
       →False)
         missing_data = pd.concat([total, percent], axis=1, keys=['Total', 'Perce'])
         return missing_data
      miss(df)
[29]:
                     Total
                               Perce
                       1474 0.135965
      Rating
      Current Ver
                         8 0.000738
      Android Ver
                          3 0.000277
      Туре
                          1 0.000092
      Content Rating
                          1 0.000092
                            0.000000
      App
      Category
                         0.000000
      Reviews
                         0 0.000000
      Size
                         0.000000
      Installs
                         0 0.000000
```

0 4.0.3 and up

```
Genres
                          0.000000
      Last Updated
                          0 0.000000
[30]: total = df.shape[0]
[31]: numb_col = []
      for col in df.columns:
          temp_null_count = df[df[col].isnull()].shape[0]
          dt = str(df[col].dtype)
          if temp_null_count>0 and (dt=='float64' or dt =='int64') :
              numb_col.append(col)
              temp_perc = round((temp_null_count / total) * 100.0, 2)
              print('
                         {}.
                                                         {}, {}%.'.format(numb_col,__
       →dt, temp_null_count, temp_perc))
                                                       1474, 13.6%.
          ['Rating'].
                             float64.
[32]: df_num =df[numb_col]
      df num
[32]:
             Rating
                4.1
      0
      1
                3.9
      2
                4.7
                4.5
                4.3
      10836
                4.5
      10837
                5.0
      10838
                NaN
      10839
                4.5
                4.5
      10840
      [10841 rows x 1 columns]
[33]: for col in df_num:
          plt.hist(df[col], 50)
          plt.xlabel(col)
          plt.show()
```

0.000000

Price

```
3000 -

2500 -

1500 -

1000 -

500 -

2.5 5.0 7.5 10.0 12.5 15.0 17.5

Rating
```

```
[34]:
      strategies=['mean', 'median', 'most_frequent']
[35]: def test_num_impute_col(dataset, column, strategy_param):
          temp_data = dataset[[column]]
          indicator = MissingIndicator()
          mask_missing_values_only = indicator.fit_transform(temp_data)
          imp_num = SimpleImputer(strategy=strategy_param)
          data_num_imp = imp_num.fit_transform(temp_data)
          filled_data = data_num_imp[mask_missing_values_only]
          return column, strategy_param, filled_data.size, filled_data[0],__
       →filled data[1]
[36]: test num impute col(df, 'Rating', strategies[0])
[36]: ('Rating', 'mean', 1474, 4.193338315362443, 4.193338315362443)
[37]: test_num_impute_col(df, 'Rating', strategies[1])
[37]: ('Rating', 'median', 1474, 4.3, 4.3)
[38]: test_num_impute_col(df, 'Rating', strategies[2])
[38]: ('Rating', 'most_frequent', 1474, 4.4, 4.4)
[39]: df['Rating'] = df['Rating'].fillna(df['Rating'].median())
```

```
[40]: numb_col = []
      for col in df.columns:
          temp_null_count = df[df[col].isnull()].shape[0]
          dt = str(df[col].dtype)
          if temp_null_count>0 and dt=='object' :
              numb_col.append(col)
              temp_perc = round((temp_null_count / total) * 100.0, 2)
              print('
                        {}.
                                    {}.
                                                         {}, {}%.'.format(numb_col, __

dt, temp_null_count, temp_perc))
          ['Type'].
                           object.
                                                   1, 0.01%.
          ['Type', 'Content Rating'].
                                             object.
          1, 0.01%.
          ['Type', 'Content Rating', 'Current Ver'].
                                                             object.
               8, 0.07%.
          ['Type', 'Content Rating', 'Current Ver', 'Android Ver'].
     object.
                             3, 0.03%.
[41]: df_num = df[numb_col]
      df num
[41]:
             Type Content Rating
                                         Current Ver
                                                              Android Ver
      0
             Free
                        Everyone
                                                1.0.0
                                                             4.0.3 and up
                        Everyone
                                                2.0.0
                                                             4.0.3 and up
      1
             Free
      2
             Free
                        Everyone
                                                1.2.4
                                                             4.0.3 and up
      3
             Free
                            Teen Varies with device
                                                               4.2 and up
      4
             Free
                        Everyone
                                                  1.1
                                                               4.4 and up
                         •••
      10836 Free
                        Everyone
                                                 1.48
                                                               4.1 and up
                                                               4.1 and up
      10837 Free
                        Everyone
                                                 1.0
      10838 Free
                        Everyone
                                                  1.0
                                                               2.2 and up
      10839 Free
                      Mature 17+ Varies with device Varies with device
      10840 Free
                        Everyone Varies with device Varies with device
      [10841 rows x 4 columns]
[42]: cat_temp_data = df[['Type']]
      cat_temp_data.head()
[42]:
         Type
      0 Free
      1 Free
      2 Free
      3 Free
      4 Free
```

```
[43]: | imp2 = SimpleImputer(missing_values=np.nan, strategy='most_frequent')
      data_imp2 = imp2.fit_transform(cat_temp_data)
      data_imp2
[43]: array([['Free'],
             ['Free'],
             ['Free'],
             ['Free'],
             ['Free'],
             ['Free']], dtype=object)
[44]: np.unique(data_imp2)
[44]: array(['0', 'Free', 'Paid'], dtype=object)
[45]: col = ['0', 'Free', 'Paid']
      for i in col:
          k = data_imp2[data_imp2==i].size
          print('
                                {}
                                       {}'.format(i, k))
                          1
                    Free
                             10040
                             800
                    Paid
[46]: | imp3 = SimpleImputer(missing_values=np.nan, strategy='constant', fill_value=i)
      data_imp3 = imp3.fit_transform(cat_temp_data)
      data_imp3
[46]: array([['Free'],
             ['Free'],
             ['Free'],
             ['Free'],
             ['Free'],
             ['Free']], dtype=object)
[47]: df['Type'] = df['Type'].fillna('unk')
[48]: sns.jointplot(y='Rating', x='Reviews', data=df)
      plt.show()
```

