Feature Engineering (1)

August 19, 2022

[1]: import pandas as pd

```
import seaborn as sns
     import matplotlib.pyplot as plt
     from pickle import dump
[2]: data = pd.DataFrame({'ID' : [1, 2, 3, 4, 5, 6, 7, 8, 9, 10],
                   'Name' : ['John', 'Jack', 'Mariah', 'Krishna', 'Danny', 'Lisa',

→'Andrew', 'Ravi', 'Garima', 'Kavita'],
                   'Gender' : ['Male', 'Male', 'Female', 'Male', 'Male', 'Female', '

→ 'Male', 'Male', 'Female', 'Female'],
                    'Profession' : ['Manager', 'Manager', 'Developer', 'Team Lead', |
      →'Team Lead', 'Assistant Manager', 'Assistant Manager', 'Manager', 'Assistant
      →Manager', 'CEO'],
                    'Salary': [100000, 120000, 95000, 99000, 105000, 145000, 155000, U
      →78000, 167000, 195000],
                    'Experience': [10, 13, 6, 8, 10, 13, 19, 15, 20, 24]})
[3]: data
[3]:
        ID
               Name
                     Gender
                                     Profession
                                                 Salary
                                                         Experience
     0
         1
               John
                       Male
                                        Manager
                                                  100000
                                                                  10
     1
         2
               Jack
                       Male
                                        Manager
                                                  120000
                                                                  13
     2
         3
             Mariah
                     Female
                                      Developer
                                                   95000
                                                                   6
     3
         4
            Krishna
                       Male
                                      Team Lead
                                                   99000
                                                                   8
     4
         5
              Danny
                       Male
                                      Team Lead
                                                                  10
                                                 105000
     5
         6
               Lisa
                    Female
                              Assistant Manager
                                                  145000
                                                                  13
     6
         7
             Andrew
                       Male
                              Assistant Manager
                                                                  19
                                                  155000
     7
         8
               Ravi
                       Male
                                        Manager
                                                   78000
                                                                  15
     8
             Garima Female
                             Assistant Manager
                                                  167000
                                                                  20
             Kavita Female
        10
                                            CEO
                                                  195000
                                                                  24
[4]: data.describe()
[4]:
                  ID
                              Salary
                                      Experience
            10.00000
                           10.000000
     count
                                       10.000000
             5.50000
                      125900.000000
                                       13.800000
     mean
                       37698.953714
     std
             3.02765
                                        5.731007
```

```
min
        1.00000
                  78000.000000
                                  6.000000
25%
        3.25000
                  99250.000000
                                 10.000000
50%
        5.50000 112500.000000
                                 13.000000
75%
        7.75000 152500.000000
                                 18.000000
       10.00000 195000.000000
                                 24.000000
max
```

0.0.1 Explore the data types

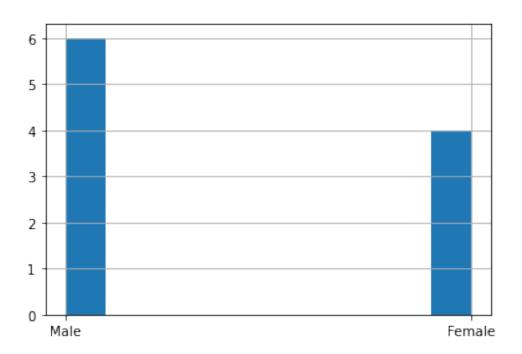
0.0.2 Separating categorical and numeric features

```
[59]: dictionary={}
  dictionary['num'] = data.dtypes[data.dtypes=='int64'].index
  dictionary['cat'] = data.dtypes[data.dtypes=='object'].index
  dictionary
```

0.0.3 Cardinality of Categorical Variables

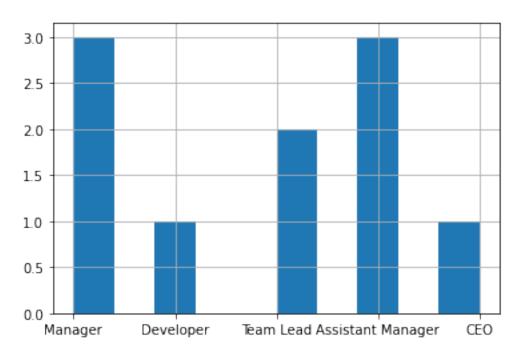
0.0.4 Frequency of categories in a categorical variable

```
[63]: data['Name'].value_counts()
[63]: Danny
                 1
      Krishna
                 1
      Kavita
                 1
      John
                 1
      Ravi
      Mariah
                 1
      Garima
                 1
      Jack
                 1
      Lisa
                 1
      Andrew
      Name: Name, dtype: int64
[64]: data['Gender'].value_counts()
[64]: Male
                6
      Female
                4
      Name: Gender, dtype: int64
[65]: data['Profession'].value_counts()
[65]: Manager
                            3
      Assistant Manager
                            3
      Team Lead
                            2
      Developer
                            1
      CE0
                            1
      Name: Profession, dtype: int64
[66]: data['Gender'].hist()
[66]: <AxesSubplot:>
```

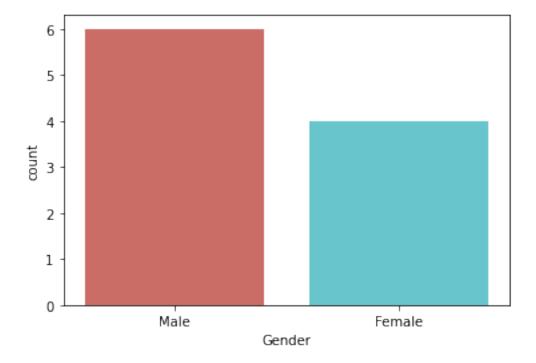


[67]: data['Profession'].hist()

[67]: <AxesSubplot:>



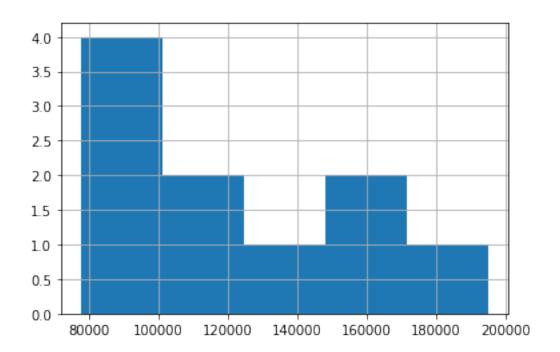
```
[68]: sns.countplot(x='Gender',data=data,palette='hls')
plt.show()
```



Numerical Variables

[69]: data['Salary'].hist(bins=5)

[69]: <AxesSubplot:>



[70]: data[dictionary['cat']] [70]: Profession Name Gender 0 John Male Manager 1 Jack Male Manager 2 Mariah Female Developer 3 Krishna Male Team Lead Danny Male Team Lead 4 5 Lisa Female Assistant Manager 6 Andrew Male Assistant Manager 7 Ravi Male Manager Garima Female Assistant Manager 8 Kavita Female 9 CE₀ [71]: from sklearn.preprocessing import MinMaxScaler, StandardScaler, LabelEncoder [72]: # Profession column is ordinal data. Hence I can use the label encoder le_profession = LabelEncoder() le_profession.fit(data['Profession']) [72]: LabelEncoder() [73]: le_profession.classes_

```
[73]: array(['Assistant Manager', 'CEO', 'Developer', 'Manager', 'Team Lead'],
            dtype=object)
     fit method learns the transformer's attributes. It does not change the column. To change the
     column we will now use the learnt attribute to do the transformation by using transform function
[74]: data['Profession'] = le_profession.transform(data['Profession'])
      data
[74]:
         ID
                 Name
                       Gender
                               Profession
                                            Salary
                                                     Experience
                 John
                         Male
                                            100000
      0
          1
                                                             10
                         Male
      1
          2
                 Jack
                                         3 120000
                                                             13
                                         2
      2
          3
              Mariah Female
                                             95000
                                                              6
      3
             Krishna
                         Male
                                             99000
                                                              8
      4
          5
               Danny
                         Male
                                         4 105000
                                                             10
                Lisa Female
                                         0 145000
      5
          6
                                                             13
      6
          7
              Andrew
                         Male
                                         0 155000
                                                             19
      7
                Ravi
                         Male
                                            78000
                                                             15
          8
                                         3
      8
          9
              Garima Female
                                         0 167000
                                                             20
              Kavita Female
         10
                                         1 195000
                                                             24
[75]: le profession.inverse transform(data['Profession'])
[75]: array(['Manager', 'Manager', 'Developer', 'Team Lead', 'Team Lead',
              'Assistant Manager', 'Assistant Manager', 'Manager',
             'Assistant Manager', 'CEO'], dtype=object)
[76]: # Gender is nominal data because it cannot be ranked. Hence we will apply one
       \rightarrowhot encoder
      pd.get_dummies(data['Gender'])
[76]:
         Female
                 Male
      0
              0
                     1
              0
      1
                     1
      2
               1
      3
              0
                     1
      4
              0
                     1
      5
              1
                     0
      6
              0
                     1
      7
              0
                     1
               1
      8
                     0
               1
                     0
[77]: data.drop(['Name'], inplace = True, axis = 1)
```

data

```
[77]:
         ID
             Gender Profession
                                   Salary
                                            Experience
          1
                Male
                                   100000
                                                     10
      0
          2
                Male
                                   120000
      1
                                3
                                                     13
      2
          3
             Female
                                2
                                    95000
                                                      6
          4
                Male
                                    99000
                                                      8
      3
                                4
      4
          5
                Male
                                4
                                   105000
                                                     10
      5
             Female
          6
                                0
                                   145000
                                                     13
                Male
          7
                                   155000
      6
                                                     19
      7
                Male
                                3
                                    78000
                                                     15
          8
             Female
                                   167000
                                                     20
      8
          9
                                0
      9
         10
             Female
                                   195000
                                                     24
                                1
[78]: data = pd.get_dummies(data)
      data
[78]:
             Profession
                          Salary
                                   Experience
                                                Gender Female
                                                                 Gender Male
      0
                           100000
                                            10
                                                                            1
      1
          2
                       3
                          120000
                                            13
                                                             0
                                                                            1
      2
                       2
                            95000
                                             6
                                                                            0
          3
                                                             1
      3
          4
                       4
                            99000
                                             8
                                                             0
                                                                            1
      4
          5
                       4 105000
                                            10
                                                             0
                                                                            1
      5
          6
                       0
                          145000
                                            13
                                                             1
                                                                            0
      6
          7
                                                             0
                       0
                          155000
                                            19
                                                                            1
      7
          8
                       3
                            78000
                                            15
                                                             0
                                                                            1
      8
          9
                       0
                          167000
                                            20
                                                             1
                                                                            0
         10
                           195000
                                            24
                                                             1
                                                                            0
     Scaling Numerical Variables using MinMax
[80]: min_max_sal = MinMaxScaler()
      min_max_sal.fit(data[['Salary']])
[80]: MinMaxScaler()
[82]: min_max_sal.data_max_, min_max_sal.data_min_
[82]: (array([195000.]), array([78000.]))
[83]:
      data
             Profession Salary
[83]:
                                                Gender_Female
         ID
                                   Experience
                                                                 Gender_Male
      0
          1
                       3
                           100000
                                            10
                                                             0
                                                                            1
          2
                       3
                          120000
                                            13
                                                             0
                                                                            1
      1
      2
                       2
                                             6
                                                                            0
          3
                            95000
                                                             1
      3
          4
                                             8
                       4
                                                             0
                                                                            1
                            99000
      4
          5
                       4 105000
                                            10
                                                             0
                                                                            1
          6
                           145000
                                            13
                                                                            0
```

```
7
          8
                        3
                            78000
                                             15
                                                              0
                                                                             1
      8
          9
                        0
                           167000
                                             20
                                                              1
                                                                             0
      9
                                                                             0
         10
                           195000
                                             24
                                                              1
[16]: min_max_sal.data_max_
[16]: array([195000.])
[84]: data['Salary_min_max_scaled'] = min_max_sal.transform(data[['Salary']])
      data
[84]:
          ID
              Profession
                           Salary
                                    Experience
                                                 Gender_Female
                                                                  Gender_Male
          1
                        3
                           100000
      0
                                             10
                                                              0
                                                                             1
          2
                        3
                           120000
      1
                                             13
                                                              0
                                                                             1
      2
          3
                        2
                            95000
                                              6
                                                              1
                                                                             0
      3
          4
                        4
                            99000
                                              8
                                                              0
                                                                             1
      4
          5
                        4
                           105000
                                             10
                                                              0
                                                                             1
      5
          6
                        0
                           145000
                                             13
                                                              1
                                                                             0
          7
      6
                        0
                           155000
                                             19
                                                              0
                                                                             1
      7
                        3
                                                              0
          8
                            78000
                                             15
                                                                             1
      8
          9
                                             20
                        0
                           167000
                                                              1
                                                                             0
         10
                        1
                           195000
                                             24
                                                              1
                                                                             0
         Salary_min_max_scaled
      0
                        0.188034
      1
                        0.358974
      2
                        0.145299
      3
                        0.179487
      4
                        0.230769
      5
                        0.572650
      6
                        0.658120
      7
                        0.00000
      8
                        0.760684
      9
                        1.000000
[85]:
      data.describe()
[85]:
                    ID
                         Profession
                                              Salary
                                                      Experience
                                                                    Gender_Female \
              10.00000
                          10.000000
                                           10.000000
                                                        10.000000
                                                                         10.000000
      count
               5.50000
                           2.000000
                                      125900.000000
                                                        13.800000
                                                                          0.400000
      mean
      std
               3.02765
                           1.632993
                                       37698.953714
                                                         5.731007
                                                                          0.516398
      min
               1.00000
                           0.000000
                                       78000.000000
                                                         6.000000
                                                                          0.000000
      25%
               3.25000
                           0.250000
                                       99250.000000
                                                        10.000000
                                                                          0.000000
      50%
                           2.500000
               5.50000
                                      112500.000000
                                                        13.000000
                                                                          0.000000
      75%
               7.75000
                           3.000000
                                      152500.000000
                                                        18.000000
                                                                          1.000000
      max
              10.00000
                           4.000000
                                      195000.000000
                                                        24.000000
                                                                          1.000000
```

19

0

1

6

7

0

155000

```
Gender_Male
                     Salary_min_max_scaled
count
         10.000000
                                  10.000000
mean
          0.600000
                                   0.409402
std
          0.516398
                                   0.322213
min
          0.000000
                                   0.000000
25%
          0.000000
                                   0.181624
50%
          1.000000
                                   0.294872
75%
          1.000000
                                   0.636752
          1.000000
                                   1.000000
max
```

8

0.760684

```
Scaling Numerical Variables using StandardScaler
[86]: std_scale_sal = StandardScaler()
      std_scale_sal.fit(data[['Salary']])
[86]: StandardScaler()
[87]: std_scale_sal.mean_, std_scale_sal.scale_
[87]: (array([125900.]), array([35764.36774221]))
[88]: data['Salary standard scaled'] = std scale_sal.transform(data[['Salary']])
      data
                                                                Gender_Male
[88]:
         ID
             Profession
                         Salary
                                   Experience
                                                Gender_Female
                          100000
      0
          1
                                           10
                                                                          1
      1
          2
                       3
                          120000
                                           13
                                                            0
                                                                          1
      2
          3
                       2
                           95000
                                            6
                                                                          0
                                                            1
          4
                       4
                           99000
                                            8
                                                            0
      3
                                                                          1
      4
                                                            0
          5
                       4 105000
                                           10
                                                                          1
      5
          6
                       0
                         145000
                                           13
                                                            1
                                                                          0
          7
      6
                       0
                          155000
                                           19
                                                            0
                                                                          1
      7
                       3
                                                            0
          8
                           78000
                                           15
                                                                          1
      8
          9
                       0
                          167000
                                           20
                                                            1
                                                                          0
      9
         10
                          195000
                                           24
                                                            1
                                                                          0
                       1
                                 Salary_standard_scaled
         Salary_min_max_scaled
      0
                       0.188034
                                                -0.724184
      1
                       0.358974
                                                -0.164969
      2
                       0.145299
                                                -0.863988
      3
                       0.179487
                                                -0.752145
      4
                       0.230769
                                                -0.584381
      5
                       0.572650
                                                 0.534051
      6
                       0.658120
                                                 0.813659
      7
                       0.000000
                                                -1.339322
```

1.149188

[89]: data.describe() [89]: ID Profession Salary Experience Gender_Female count 10.00000 10.000000 10.000000 10.000000 10.000000 2.000000 125900.000000 13.800000 0.400000 mean 5.50000 3.02765 1.632993 37698.953714 5.731007 std 0.516398 min 1.00000 0.000000 78000.000000 6.000000 0.000000 25% 3.25000 0.250000 99250.000000 10.000000 0.000000 50% 5.50000 2.500000 112500.000000 13.000000 0.00000 75% 7.75000 3.000000 152500.000000 18.000000 1.000000 max 10.00000 4.000000 195000.000000 24.000000 1.000000 Gender_Male Salary_min_max_scaled Salary_standard_scaled 10.000000 10.000000 1.000000e+01 count mean 0.600000 0.409402 -2.220446e-17 std 0.516398 0.322213 1.054093e+00 min -1.339322e+00 0.000000 0.00000 25% 0.000000 0.181624 -7.451551e-01 50% 1.000000 0.294872 -3.746746e-01 75% 1.000000 0.636752 7.437570e-01 max 1.000000 1.000000 1.932091e+00 [22]: std_scale_sal.inverse_transform(data[['Salary_standard_scaled']]) [22]: array([[100000.], [120000.], [95000.], [99000.], [105000.], [145000.], [155000.], [78000.], [167000.], [195000.]]) [91]: dump(std_scale_sal,open('std_scaler.pkl','wb')) []:

1.932091

9

1.000000