

Feature Selection-Chi Square Test

Estimated time needed: 20 minutes

Objectives

After completing this lab you will have a good understanding in:

• F/P Values

Out[25]:

survived pclass sex age sibsp parch

- Chi Square Test
- Hypothesis Testing

This Notebook is created for Python Module

Fisher Score- Chisquare Test For Feature Selection

Compute chi-squared stats between each non-negative feature and class.

• This score should be used to evaluate categorical variables in a classification task.

This score can be used to select the n_features features with the highest values for the test chi-squared statistic from X, which must contain only non-negative features such as booleans or frequencies (e.g., term counts in document classification), relative to the classes.

Recall that the chi-square test measures dependence between stochastic variables, so using this function "weeds out" the features that are the most likely to be independent of class and therefore irrelevant for classification. The Chi Square statistic is commonly used for testing relationships between categorical variables.

It compares the observed distribution of the different classes of target Y among the different categories of the feature, against the expected distribution of the target classes, regardless of the feature categories.

```
In [1]:
          import seaborn as sns
          df=sns.load_dataset('titanic')
          import numpy as np
          import pandas as pd
 In [2]:
          DF = df.to_csv('titanic.csv', index = False)
 In [3]:
          df.sample(4)
               survived pclass
                                                         fare embarked class who adult_male deck embark_town alive alone
 Out[3]:
                                    age sibsp parch
          703
                            3 male 25.0
                                             0
                                                   0
                                                        7.7417
                                                                     Q Third man
                                                                                         True
                                                                                               NaN
                                                                                                      Queenstown
                                                                                                                        True
                                                                                                     Southampton
          108
                                    38.0
                                             0
                                                   0
                                                       7.8958
                                                                     S
                                                                        Third man
                                                                                               NaN
                              male
                                                                                         True
                                                                                                                        True
                                                                                                                   no
          663
                                    36.0
                                                       7.4958
                                                                                               NaN
                                                                                                     Southampton
                                                                              man
                                                                                          True
                                                                                                                        True
          607
                            1 male 27.0
                                             0
                                                   0 30.5000
                                                                         First man
                                                                                         True
                                                                                               NaN
                                                                                                     Southampton
                                                                                                                  yes
                                                                                                                        True
 In [6]:
          ##['sex','embarked','alone','pclass','Survived']
          df=df[['sex','embarked','alone','pclass','survived']]
          df.head()
               sex embarked alone pclass survived
 Out[6]:
                           S False
                           С
          1 female
                              False
          2 female
                           S
                              True
          3 female
                             False
                                        3
                                                 0
                           S
                              True
              male
In [25]:
          df['sex']=np.where(df['sex']=="male",1,0)
          df.head()
```

fare embarked class

who adult_male deck embark_town alive alone

```
deck embark_town alive
                                                         fare embarked class
             survived pclass sex
                                   age
                                        sibsp
                                               parch
                                                                                 who adult_male
                                                                                                                            alone
          0
                           3
                                1
                                   22.0
                                            1
                                                   0
                                                       7.2500
                                                                      S
                                                                         Third
                                                                                             True
                                                                                                   NaN
                                                                                                          Southampton
                                                                                                                             False
                                                                                  man
                                                                                                                         no
           1
                    1
                           1
                                0
                                   38.0
                                            1
                                                   0
                                                      71.2833
                                                                      С
                                                                          First woman
                                                                                             False
                                                                                                      С
                                                                                                            Cherbourg
                                                                                                                        yes
                                                                                                                             False
           2
                    1
                           3
                                            0
                                0
                                   26.0
                                                   0
                                                       7.9250
                                                                      S
                                                                         Third
                                                                                                   NaN
                                                                                                          Southampton
                                                                               woman
                                                                                             False
                                                                                                                        yes
                                                                                                                              True
           3
                                                                                                          Southampton
                    1
                           1
                                0 35.0
                                            1
                                                   0 53.1000
                                                                          First woman
                                                                                             False
                                                                                                      С
                                                                                                                        yes
                                                                                                                             False
In [28]:
           ### Let's perform label encoding on sex column
           import numpy as np
           ### let's perform label encoding on embarked
           ordinal_label = {k: i for i, k in enumerate(df['embarked'].unique(), 0)}
           df['embarked'] = df['embarked'].map(ordinal_label)
In [29]:
           df.sample(10)
                                                                  embarked
Out[29]:
                                                                              class
                                                                                                                           alive
                survived pclass
                                sex
                                      age
                                          sibsp
                                                 parch
                                                             fare
                                                                                       who
                                                                                            adult_male
                                                                                                        deck
                                                                                                              embark_town
                                                                                                                                  alone
          543
                       1
                              2
                                   1 32.0
                                                         26.0000
                                               1
                                                     0
                                                                          0
                                                                            Second
                                                                                                   True
                                                                                                         NaN
                                                                                                               Southampton
                                                                                                                                  False
                                                                                       man
                                                                                                                             yes
           341
                       1
                              1
                                   0
                                     24.0
                                               3
                                                     2
                                                        263.0000
                                                                          0
                                                                                                           С
                                                                                                               Southampton
                                                                               First woman
                                                                                                  False
                                                                                                                             yes
                                                                                                                                  False
                      0
                              3
                                                                          0
           250
                                   1
                                               0
                                                     0
                                                           7.2500
                                                                               Third
                                                                                                         NaN
                                     NaN
                                                                                       man
                                                                                                   True
                                                                                                               Southampton
                                                                                                                              no
                                                                                                                                   True
           643
                       1
                              3
                                               0
                                                     0
                                                         56.4958
                                                                          0
                                                                               Third
                                   1 NaN
                                                                                       man
                                                                                                   True
                                                                                                         NaN
                                                                                                               Southampton
                                                                                                                                   True
                                                                                                                             yes
           402
                      0
                              3
                                   0
                                     21.0
                                               1
                                                     0
                                                          9.8250
                                                                          0
                                                                               Third woman
                                                                                                         NaN
                                                                                                               Southampton
                                                                                                  False
                                                                                                                              no
                                                                                                                                  False
                              2
                                   0 30.0
           747
                       1
                                               0
                                                     0
                                                         13.0000
                                                                          0
                                                                             Second woman
                                                                                                  False
                                                                                                         NaN
                                                                                                               Southampton
                                                                                                                             yes
                                                                                                                                   True
           324
                      0
                              3
                                               8
                                                     2
                                                         69.5500
                                                                          0
                                                                               Third
                                   1 NaN
                                                                                                   True
                                                                                                         NaN
                                                                                                               Southampton
                                                                                                                                  False
                                                                                       man
                                                                                                                              no
           711
                      0
                                     NaN
                                               0
                                                         26.5500
                                                                          0
                                                                               First
                                                                                                   True
                                                                                                           С
                                                                                                               Southampton
                                                                                                                                   True
                                                                                       man
                                                                                                                              no
                       1
                              1
                                   0
                                               0
                                                                          1
                                                                                                           Ε
           337
                                     41.0
                                                     0
                                                        134.5000
                                                                               First woman
                                                                                                  False
                                                                                                                 Cherbourg
                                                                                                                             yes
                                                                                                                                   True
           500
                      0
                              3
                                     17.0
                                               0
                                                     0
                                                          8.6625
                                                                          0
                                                                               Third
                                                                                                         NaN
                                                                                                               Southampton
                                   1
                                                                                       man
                                                                                                   True
                                                                                                                                   True
                                                                                                                              no
In [30]:
           ### let's perform label encoding on alone
           df['alone']=np.where(df['alone']==True,1,0)
In [31]:
           df.head()
Out[31]:
                                                              embarked
                                                                         class
                                                                                 who adult_male
             survived
                       pclass
                              sex
                                   age
                                        sibsp
                                               parch
                                                         fare
                                                                                                  deck
                                                                                                        embark_town
                                                                                                                      alive
                                                                                                                            alone
          0
                    0
                           3
                                1 22.0
                                            1
                                                   0
                                                       7.2500
                                                                      0
                                                                         Third
                                                                                  man
                                                                                             True
                                                                                                   NaN
                                                                                                          Southampton
                                                                                                                         no
                                                                                                                                0
           1
                    1
                           1
                                0
                                   38.0
                                            1
                                                   0
                                                     71.2833
                                                                          First woman
                                                                                                     С
                                                                                                                                0
                                                                                             False
                                                                                                            Cherbourg
                                                                                                                        yes
                           3
                    1
                                0
                                   26.0
                                            0
                                                   0
                                                       7.9250
                                                                      0
                                                                         Third
                                                                                             False
                                                                                                   NaN
                                                                                                          Southampton
                                                                                                                                1
                                                                               woman
                                                                                                                        yes
                    1
          3
                           1
                                0
                                   35.0
                                            1
                                                   0
                                                      53.1000
                                                                      0
                                                                          First
                                                                               woman
                                                                                             False
                                                                                                     С
                                                                                                          Southampton
                                                                                                                                0
                    0
           4
                           3
                                1 35.0
                                            0
                                                   0
                                                      8.0500
                                                                      0
                                                                         Third
                                                                                                                                1
                                                                                  man
                                                                                             True
                                                                                                   NaN
                                                                                                          Southampton
                                                                                                                         no
In [15]:
           ### train Test split is usually done to avaoid overfitting
           from sklearn.model_selection import train_test_split
           X_train,X_test,y_train,y_test=train_test_split(df[['sex','embarked','alone','pclass']],
                                                                df['survived'],test_size=0.3,random_state=100)
In [16]:
           X_train.head()
Out[16]:
                sex embarked alone pclass
            69
                            0
                                   0
                                          3
                  1
            85
                  0
                            0
                                   0
                                          3
          794
                                          3
           161
           815
In [17]:
           X_train['sex'].unique()
Out[17]: array([1, 0])
In [18]:
           X_train.isnull().sum()
Out[18]: sex
                        0
          embarked
                        0
          alone
                        0
          pclass
          dtype: int64
```

```
In [19]:
          ## Perform chi2 test
          ### chi2 returns 2 values
          ### Fscore and the pvalue
          from sklearn.feature_selection import chi2
          f_p_values=chi2(X_train,y_train)
In [20]:
          f_p_values
Out[20]: (array([65.67929505, 7.55053653, 10.88471585, 21.97994154]),
          array([5.30603805e-16, 5.99922095e-03, 9.69610546e-04, 2.75514881e-06]))
In [21]:
          import pandas as pd
          p_values=pd.Series(f_p_values[1])
          p_values.index=X_train.columns
          p_values
Out[21]: sex
                     5.306038e-16
                     5.999221e-03
         embarked
         alone
                     9.696105e-04
         pclass
                     2.755149e-06
         dtype: float64
In [22]:
          p_values.sort_index(ascending=False)
                     5.306038e-16
Out[22]: sex
         pclass
                     2.755149e-06
                     5.999221e-03
         embarked
         alone
                     9.696105e-04
         dtype: float64
```

Observation

Sex Column is the most important column when compared to the output feature Survived

Great Job!

That's all we need to know for now! Congratulations, you have learnt one more topic and hands-on with Python. This Notebook is prepared by Sumit Kumar Shukla IBM ICE.

About Author

Mr. Sumit is a Subject Matter Expert at IBM, and a data Scientist with more than five years of experience tutoring students from IITs, NITs, IISc, IIMs, and other prestigious institutions. Google Data Studio certified and IBM certified data analyst Data Science, Machine Learning Models, Graph Databases, and Data Mining techniques for Predictive Modeling and Analytics, as well as data integration, require expertise in Machine Learning and programming languages such as Python, R, and Tableau.

