Chi2 independency test

May 22, 2021

Chi2 independency test is carried out to check whether a given class is depend on the features/attributes selected. We can verify the hypothesis that we defined for each feature, using this test.

Lets carry out tests for each feature.

0.1 Feature 1 - Links in Meta, Script, Link tag

```
[10]: import pandas as pd #import pandas
      import numpy as np #import numpy
      import matplotlib.pyplot as plt #import matplotlib
      from scipy.stats import chi2_contingency #import chi2_contingency for chi2_u
       \rightarrow independency tet
      from matplotlib import style
      style.use('ggplot')
[43]: df = pd.read_csv('dataset1.csv')
      df.drop('url',axis=1,inplace=True)
      df.head()
[43]:
         Links_in_tags
                         Abnormal_URL
                                        Submitting_to_email
                                                               SFH
                                                                    Iframe
                                                                            popUpWidnow
             73.913043
                                                                 0
      1
              85.000000
                                    -1
                                                           0
                                                                 0
                                                                          0
                                                                                       0
      2
              97.000000
                                    -1
                                                           0
                                                                 0
                                                                          0
                                                                                       0
      3
              12.000000
                                    -1
                                                           0
                                                                 0
                                                                          0
                                                                                       0
      4
                                                                 0
                                                                          0
                                                                                       0
              55.55556
                                    -1
```

```
RightClick Redirect
   on_mouseover
0
                0
                                           0
                               0
                                           0
1
                0
                                                    1
2
                0
                               0
                                           1
                                                    1
3
                0
                               0
                                           0
                                                   -1
                0
                               0
                                           0
                                                   -1
```

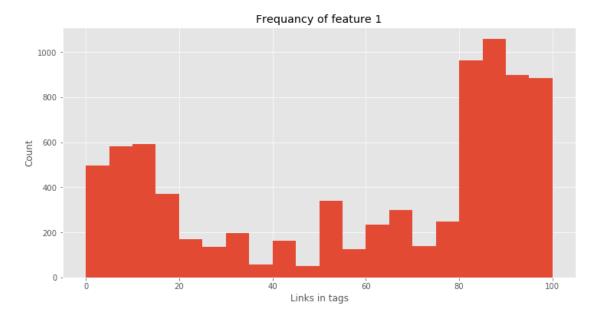
Here, we have to check whether the website status is depend on feature 1 (links in meta tags)

```
[45]: df1 = df[['Links_in_tags','Result']]
df1.head()
```

```
[45]:
         Links_in_tags
                         Result
      0
              73.913043
                               1
              85.000000
                               1
      1
      2
              97.000000
                               1
      3
              12.000000
                              -1
      4
             55.55556
                              -1
```

```
[47]: #Let's plot and check the frequency of links_in_tags feature

plt.figure(figsize=(12,6))
 plt.hist(df1['Links_in_tags'], bins=20)
 plt.title('Frequancy of feature 1')
 plt.xlabel('Links in tags')
 plt.ylabel('Count')
 plt.show()
```



```
[48]: #crosstab to check the website status and page rank.
# to get a better vissualization we will round off the values into nearest 10
df1_new = df1.copy()

df1_new.Links_in_tags = df1.Links_in_tags.round(-1) #round to nearest 10

cross_tab = pd.crosstab(df1_new['Links_in_tags'],df1_new['Result']).T
 cross_tab
```

[48]: Links_in_tags 0.0 10.0 20.0 30.0 40.0 50.0 60.0 70.0 80.0 \
Result

```
-1
                  576
                          983
                                  532
                                          178
                                                  166
                                                          261
                                                                  293
                                                                         326
                                                                                 404
                                   70
                                                   59
                                                          126
                                                                                 960
 1
                   18
                           93
                                           92
                                                                   65
                                                                         111
```

```
Links_in_tags 90.0 100.0
Result
-1 282 0
1 1520 884
```

phishing websites indicated by 1

legitimate websites indicated by -1

statstical method to check whether the website's status dependent on feature 1 or not.

```
Reject Null Hypothesis
P-Value is 0.0
Website status depends on feature1
```

Chi2 independency test tells us that the links in tags are not independent of status. We can also check it using

```
[51]: phishing_df = df1[df1['Result']==1] #store all the phishing websites in a_{\square} \rightarrow phishing legitimate_df = df1[df1['Result']==-1] #store all the legitimate websites in a_{\square} \rightarrow legitimate
```

```
[52]: phishing_df.head()
```

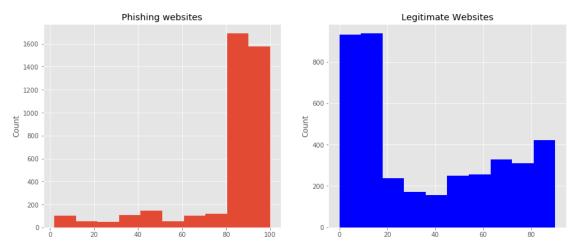
```
[52]: Links_in_tags Result
0 73.913043 1
1 85.000000 1
2 97.000000 1
5 81.000000 1
6 86.000000 1
```

```
[53]: #plot different histograms for phishing and legitmate websites fig,(ax1,ax2) = plt.subplots(1,2,figsize=(15,6))
```

```
phishing_df['Links_in_tags'].hist(ax=ax1)
ax1.set_title('Phishing websites')
ax1.set_ylabel('Count')

legitimate_df['Links_in_tags'].hist(ax=ax2,color='blue')
ax2.set_title('Legitimate Websites')
ax2.set_ylabel('Count')

plt.show()
```



```
[118]: # According to the first graph, you can clearly see the links in tag percentage

→ greater than 85 are most likely to be phishing

# According to the second graph, you can clearly see the links in tag

→ percentage less than 20 are most likely to be legitimate

[]:

[]:
```

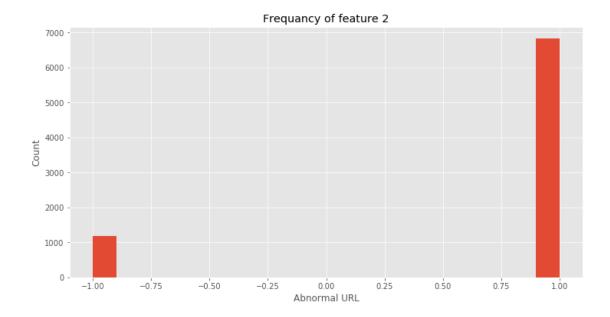
0.2 Feature 2 - Abnormal URL

[]:

```
[54]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
from scipy.stats import chi2_contingency #import chi2_contingency for chi2____

→independency test
from matplotlib import style
style.use('ggplot')
```

```
df = pd.read_csv('dataset1.csv')
      df.drop('url',axis=1,inplace=True)
      df.head()
         Links_in_tags Abnormal_URL Submitting_to_email
[54]:
                                                            SFH
                                                                 Iframe popUpWidnow \
             73.913043
      0
                                   -1
                                                              0
      1
             85.000000
                                  -1
                                                         0
                                                              0
                                                                      0
                                                                                    0
      2
             97.000000
                                  -1
                                                         0
                                                              0
                                                                      0
                                                                                    0
                                                              0
      3
             12.000000
                                  -1
                                                         0
                                                                      0
                                                                                    0
      4
             55.55556
                                  -1
                                                         0
                                                              0
                                                                      0
                                                                                    0
         on_mouseover RightClick Redirect Result
      0
      1
                    0
                                0
                                           0
                                                   1
      2
                    0
                                0
                                           1
                                                   1
                                0
                                           0
      3
                    0
                                                  -1
      4
                    0
                                0
                                           0
                                                  -1
[55]: df2 = df[['Abnormal_URL','Result']]
      df2.head()
[55]:
         Abnormal_URL Result
                   -1
      0
                   -1
      1
                            1
      2
                   -1
                            1
      3
                   -1
                           -1
                   -1
                           -1
[56]: cross_tab = pd.crosstab(df2['Abnormal_URL'],df2['Result']).T
      cross tab
[56]: Abnormal_URL
                     -1
                            1
      Result
      -1
                    741
                         3260
                    437
                         3561
[57]: #Let's plot and check the frequency of abnormal url feature
      plt.figure(figsize=(12,6))
      plt.hist(df2['Abnormal_URL'], bins=20)
      plt.title('Frequancy of feature 2')
      plt.xlabel('Abnormal URL')
      plt.ylabel('Count')
      plt.show()
```



Reject Null Hypothesis P-Value is 1.3455226733682224e-21 Website status depends on feature2

Chi2 independency test tells us that the feature 2 is not independent of status. We can also check it using

```
[59]: phishing_df2 = df2[df2['Result']==1] #store all the phishing websites in a

→phishing
legitimate_df2 = df2[df2['Result']==-1] #store all the legitimate websites in

→a legitimate
phishing_df2.head()
```

```
[59]: Abnormal_URL Result
0 -1 1
```

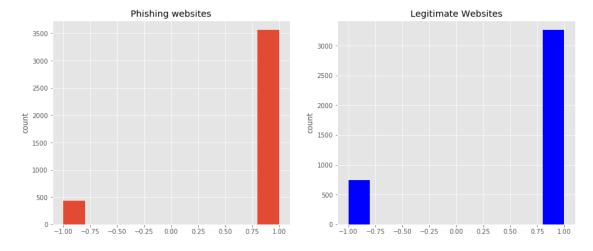
```
1 -1 1
2 -1 1
5 -1 1
6 -1 1
```

```
[60]: #plot different histograms for phishing and legitmate websites
fig,(ax1,ax2) = plt.subplots(1,2,figsize=(15,6))

phishing_df2['Abnormal_URL'].hist(ax=ax1)
ax1.set_title('Phishing websites')
ax1.set_ylabel('count')

legitimate_df2['Abnormal_URL'].hist(ax=ax2,color='blue')
ax2.set_title('Legitimate Websites')
ax2.set_ylabel('count')

plt.show()
```



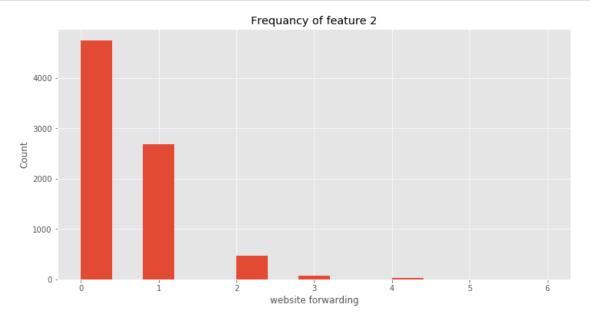
Above graphs shows that abnormal urls are higher in phsishing websites. So that we can conclude that URLs having abnormal URL feature is most likely to be phishing

0.3 Feature 3 - Website Forwarding

```
[61]: import pandas as pd
      import numpy as np
      import matplotlib.pyplot as plt
      from scipy.stats import chi2_contingency #import chi2_contigency for chi2_LL
      → independency test
      from matplotlib import style
      style.use('ggplot')
      df = pd.read_csv('dataset1.csv')
      df.drop('url',axis=1,inplace=True)
      df.head()
[61]:
         Links_in_tags Abnormal_URL Submitting_to_email
                                                            SFH
                                                                 Iframe popUpWidnow
             73.913043
                                                              0
      0
                                  -1
                                                         0
                                                                      0
      1
             85.000000
                                  -1
                                                         0
                                                              0
                                                                      0
                                                                                    0
      2
             97.000000
                                  -1
                                                         0
                                                              0
                                                                      0
                                                                                    0
                                                              0
      3
             12.000000
                                  -1
                                                         0
                                                                      0
                                                                                    0
                                                         0
                                                                      0
                                                                                    0
      4
             55.55556
                                  -1
                                                              0
         on_mouseover RightClick Redirect Result
      0
                                           0
                                                   1
                    0
                                0
                    0
                                0
                                           0
                                                   1
      1
      2
                    0
                                0
                                           1
                                                   1
      3
                    0
                                0
                                           0
                                                  -1
                    0
                                0
                                           0
                                                  -1
[63]: df3 = df[['Redirect', 'Result']]
      df3.head()
[63]:
         Redirect
                  Result
                0
                0
      1
                        1
      2
                1
                        1
      3
                0
                       -1
      4
                0
                       -1
[64]: cross_tab = pd.crosstab(df3['Redirect'],df3['Result']).T
      cross_tab
[64]: Redirect
                                       4 5
                                            6
      Result
      -1
                2311 1398 254
                                 29
                                      7 2 0
       1
                2433 1284 216 48 15 1 1
```

```
[70]: #Let's plot and check the frequency of website forwarding feature

plt.figure(figsize=(12,6))
plt.hist(df3['Redirect'], bins=15)
plt.title('Frequancy of feature 3')
plt.xlabel('website forwarding')
plt.ylabel('Count')
plt.show()
```



```
[71]: #HO : website status is independent of feature3
#H1 : website status depends on feature3
#Alpha : 0.05
alpha = 0.05

stats,p_value,degrees_of_freedom,expected = chi2_contingency(cross_tab)
if p_value > alpha:
    print(f' Accept Null Hypothesis\n P-Value is {p_value}\n Website status is_\mathrm{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\tex{
```

Reject Null Hypothesis P-Value is 0.0027864394664666 Website status depends on feature3

[]:

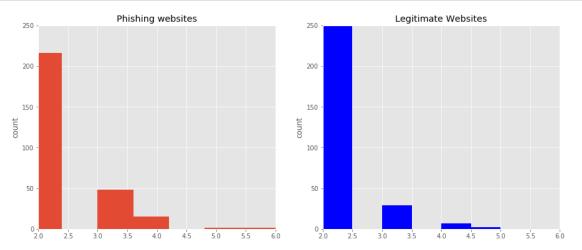
Chi2 independency test tells us that the feature 3 is not independent of Result. We can also check it as follows

```
[72]: Redirect Result
0 0 1
1 0 1
2 1 1
5 0 1
6 0 1
```

```
[80]: #plot different histograms for phishing and legitmate websites
fig,(ax1,ax2) = plt.subplots(1,2,figsize=(15,6))

phishing_df3['Redirect'].hist(ax=ax1)
ax1.set_title('Phishing websites')
ax1.set_ylabel('count')
ax1.set_xlim([2,6])
ax1.set_ylim([0,250])

legitimate_df3['Redirect'].hist(ax=ax2,color='blue')
ax2.set_title('Legitimate Websites')
ax2.set_ylabel('count')
ax2.set_xlim([2,6])
ax2.set_ylim([0,250])
```



According to the above graphs, we can clearly observe that websites with more than 3 redirections are most likely to be phishing

```
[]:
 []:
 []:
 []:
     0.4 Feature 4 - Submitting Information to Email
 [9]: import pandas as pd
      import numpy as np
      import matplotlib.pyplot as plt
      from scipy.stats import chi2_contingency #import chi2_contingency for chi2____
       \rightarrow independency test
      from matplotlib import style
      style.use('ggplot')
      df = pd.read_csv('dataset1.csv')
      df.drop('url',axis=1,inplace=True)
      df.head()
 [9]:
         Links_in_tags
                         Abnormal_URL
                                        Submitting_to_email
                                                               SFH
                                                                    Iframe
                                                                            popUpWidnow
             73.913043
                                                                 0
                                                                         0
      0
                                    -1
                                                                                       0
      1
             85.000000
                                    -1
                                                           1
                                                                 0
                                                                         0
                                                                                       0
      2
              97.000000
                                                                 0
                                                                                       0
                                    -1
                                                           1
                                                                         0
              12.000000
                                    -1
                                                                         0
                                                                                       0
      3
                                                           1
                                                                 0
                                                                 0
             55.55556
                                    -1
                                                                         0
                                                                                       0
         on_mouseover RightClick Redirect
                                               Result
      0
                                  0
                                            0
                     0
                                                     1
                     0
                                  0
                                            0
                                                     1
      1
      2
                     0
                                  0
                                            1
                                                     1
      3
                     0
                                  0
                                            0
                                                    -1
                                  0
                     0
                                                    -1
[10]: df4 = df[['Submitting_to_email', 'Result']]
      df4.head()
```

[10]:

0

Submitting_to_email Result

1

1

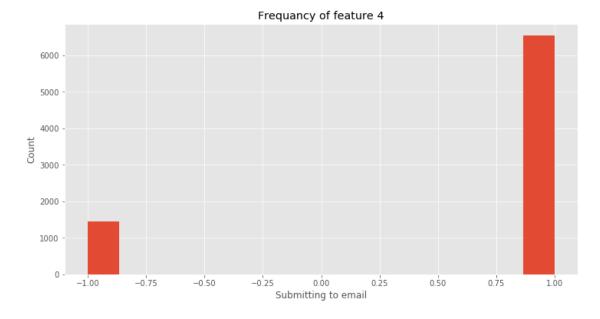
```
1 1 1
2 1 1
3 1 -1
4 1 -1
```

```
[12]: cross_tab = pd.crosstab(df4['Submitting_to_email'],df4['Result']).T
cross_tab
```

```
[12]: Submitting_to_email -1 1
Result
-1 1131 2870
1 327 3671
```

```
[13]: #Let's plot and check the frequency of submit to email feature

plt.figure(figsize=(12,6))
 plt.hist(df4['Submitting_to_email'], bins=15)
 plt.title('Frequancy of feature 4')
 plt.xlabel('Submitting to email')
 plt.ylabel('Count')
 plt.show()
```



```
[14]: #HO : website status is independent of feature4
#H1 : website status depends on feature4
#Alpha : 0.05
alpha = 0.05
```

Reject Null Hypothesis P-Value is 1.7941687293486418e-119 Website status depends on feature4

Chi2 independency test tells us that the feature 4 is not independent of Result. We can also check it as follows

```
[17]: phishing_df4 = df4[df4['Result']==1] #store all the phishing websites in a

→phishing

legitimate_df4 = df4[df4['Result']==-1] #store all the legitimate websites in

→a legitimate

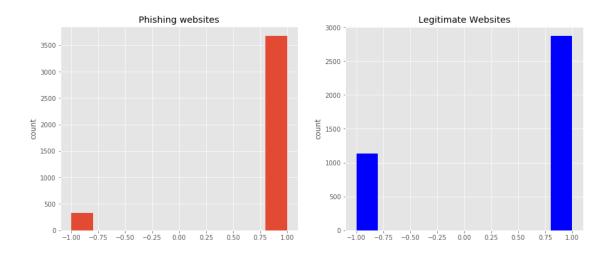
phishing_df4.head()
```

```
[19]: #plot different histograms for phishing and legitmate websites
fig,(ax1,ax2) = plt.subplots(1,2,figsize=(15,6))

phishing_df4['Submitting_to_email'].hist(ax=ax1)
ax1.set_title('Phishing websites')
ax1.set_ylabel('count')

legitimate_df4['Submitting_to_email'].hist(ax=ax2,color='blue')
ax2.set_title('Legitimate Websites')
ax2.set_ylabel('count')

plt.show()
```

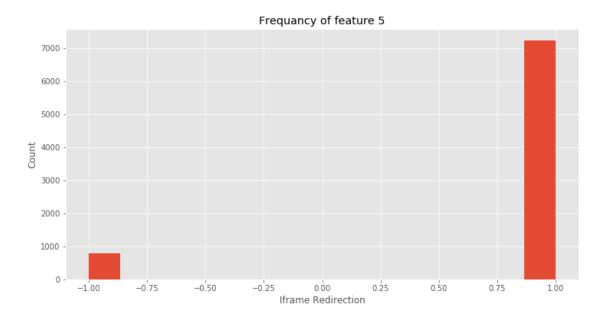


According to the above graphs, we can clearly see that "submiting to email feature is available mostly in phishing websites than the legitimate websites

0.5 Feature 5 - IFrame Redirection

```
[26]:
                                                                                  popUpWidnow
          Links_in_tags
                           Abnormal_URL
                                           Submitting_to_email
                                                                   SFH
                                                                         Iframe
      0
              73.913043
                                      -1
                                                                1
                                                                     0
                                                                             -1
                                                                                             0
              85.000000
                                       -1
                                                                1
                                                                     0
                                                                             -1
                                                                                             0
      1
      2
                                                                     0
              97.000000
                                      -1
                                                                1
                                                                             -1
                                                                                             0
      3
              12.000000
                                      -1
                                                                1
                                                                     0
                                                                               1
                                                                                             0
      4
                                                                     0
                                                                                             0
              55.55556
                                      -1
                                                                1
                                                                               1
```

```
on_mouseover RightClick Redirect Result
      0
                                                   1
                                0
                                           0
      1
                    0
                                                   1
      2
                                0
                    0
                                           1
                                                   1
      3
                    0
                                0
                                           0
                                                  -1
                    0
                                0
                                           0
                                                  -1
[27]: df5 = df[['Iframe', 'Result']]
      df5.head()
[27]:
         Iframe Result
             -1
      0
      1
             -1
                      1
      2
             -1
                      1
              1
                     -1
      3
      4
              1
                     -1
[28]: cross_tab = pd.crosstab(df5['Iframe'],df5['Result']).T
      cross_tab
[28]: Iframe
               -1
                      1
      Result
      -1
              773 3228
                7 3991
       1
[29]: #Let's plot and check the frequency of Iframe feature
      plt.figure(figsize=(12,6))
      plt.hist(df5['Iframe'], bins=15)
      plt.title('Frequancy of feature 5')
      plt.xlabel('Iframe Redirection')
      plt.ylabel('Count')
      plt.show()
```



Reject Null Hypothesis P-Value is 1.130035218017294e-182 Website status depends on feature5

Chi2 independency test tells us that the feature 5 is not independent of Result. We can also check it as follows

```
[31]: phishing_df5 = df5[df5['Result']==1] #store all the phishing websites in a

→phishing
legitimate_df5 = df5[df5['Result']==-1] #store all the legitimate websites in

→a legitimate
phishing_df5.head()
```

```
[31]: Iframe Result
0 -1 1
```

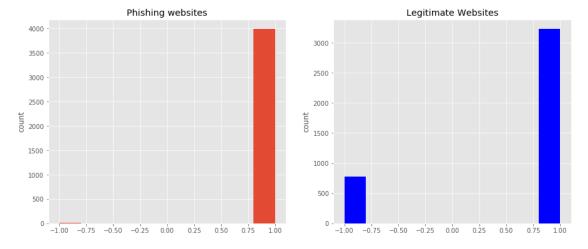
```
1 -1 1
2 -1 1
5 -1 1
6 -1 1
```

```
[32]: #plot different histograms for phishing and legitmate websites
fig,(ax1,ax2) = plt.subplots(1,2,figsize=(15,6))

phishing_df5['Iframe'].hist(ax=ax1)
ax1.set_title('Phishing websites')
ax1.set_ylabel('count')

legitimate_df5['Iframe'].hist(ax=ax2,color='blue')
ax2.set_title('Legitimate Websites')
ax2.set_ylabel('count')

plt.show()
```



According to the above graphs, we can clearly see that "Iframe redirection" feature is available mostly in phishing websites than the legitimate websites

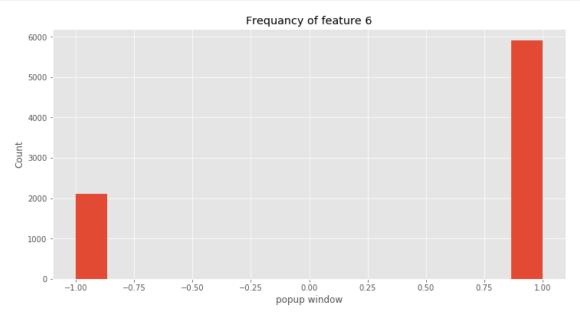
```
[]:
```

0.6 Feature 6 - Using Pop-up Window

```
[36]: import pandas as pd import numpy as np import matplotlib.pyplot as plt
```

```
from scipy.stats import chi2_contingency #import chi2_contigency for chi2_LL
       \rightarrow independency test
      from matplotlib import style
      style.use('ggplot')
      df = pd.read csv('dataset1.csv')
      df.drop('url',axis=1,inplace=True)
      df.head()
[36]:
         Links_in_tags Abnormal_URL Submitting_to_email
                                                             SFH
                                                                   Iframe popUpWidnow \
      0
             73.913043
                                                          1
                                                               0
                                                                       -1
                                                                                      1
                                   -1
      1
             85.000000
                                   -1
                                                          1
                                                               0
                                                                       -1
                                                                                      1
      2
             97.000000
                                   -1
                                                          1
                                                               0
                                                                       -1
                                                                                      1
      3
             12.000000
                                   -1
                                                          1
                                                               0
                                                                        1
                                                                                    -1
             55.55556
                                   -1
                                                          1
                                                               0
                                                                        1
                                                                                    -1
         on_mouseover RightClick Redirect Result
      0
                     0
                                 0
                                            0
                                                    1
                                            0
      1
                     0
                                 0
                                                    1
      2
                                 0
                     0
                                            1
                                                    1
      3
                     0
                                 0
                                            0
                                                   -1
      4
                     0
                                 0
                                                   -1
[37]: df6 = df[['popUpWidnow', 'Result']]
      df6.head()
[37]:
         popUpWidnow Result
      0
                   1
      1
                   1
                            1
      2
                   1
                            1
      3
                           -1
                  -1
                  -1
                           -1
[38]: cross_tab = pd.crosstab(df6['popUpWidnow'],df6['Result']).T
      cross_tab
[38]: popUpWidnow
                      -1
      Result
      -1
                   1354 2647
                    743 3255
[39]: #Let's plot and check the frequency of popup window feature
      plt.figure(figsize=(12,6))
      plt.hist(df6['popUpWidnow'], bins=15)
      plt.title('Frequancy of feature 6')
      plt.xlabel('popup window')
```

```
plt.ylabel('Count')
plt.show()
```



Reject Null Hypothesis P-Value is 4.1966169165675175e-54 Website status depends on feature6

Chi2 independency test tells us that the feature 6 is not independent of Result. We can also check it as follows

```
[41]: phishing_df6 = df6[df6['Result']==1] #store all the phishing websites in a

→phishing

legitimate_df6 = df6[df6['Result']==-1] #store all the legitimate websites in

→a legitimate

phishing_df6.head()
```

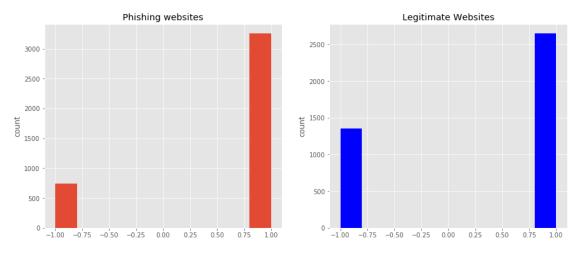
```
[41]:
           popUpWidnow
                          Result
       0
                                 1
                       1
                                 1
       1
       2
                       1
                                 1
       5
                       1
                                 1
       6
                                 1
```

```
[56]: #plot different histograms for phishing and legitmate websites
fig,(ax1,ax2) = plt.subplots(1,2,figsize=(15,6))

phishing_df6['popUpWidnow'].hist(ax=ax1)
ax1.set_title('Phishing websites')
ax1.set_ylabel('count')

legitimate_df6['popUpWidnow'].hist(ax=ax2,color='blue')
ax2.set_title('Legitimate Websites')
ax2.set_ylabel('count')

plt.show()
```

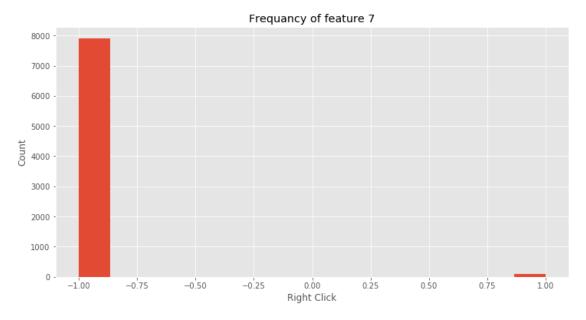


According to the above graphs, we can clearly see that "Popup window" feature is available mostly in phishing websites than the legitimate websites

0.7 Feature 7 - Disabling Right Click

```
[50]: import pandas as pd
      import numpy as np
      import matplotlib.pyplot as plt
      from scipy.stats import chi2_contingency #import chi2_contigency for chi2_LL
      → independency test
      from matplotlib import style
      style.use('ggplot')
      df = pd.read_csv('dataset1.csv')
      df.drop('url',axis=1,inplace=True)
      df.head()
         Links_in_tags Abnormal_URL Submitting_to_email
[50]:
                                                             SFH
                                                                  Iframe popUpWidnow \
      0
             73.913043
                                   -1
                                                          1
                                                               0
                                                                      -1
                                                                                     1
      1
             85.000000
                                   -1
                                                          1
                                                               0
                                                                      -1
                                                                                     1
      2
                                   -1
                                                          1
                                                               0
             97.000000
                                                                      -1
                                                                                     1
      3
             12.000000
                                   -1
                                                          1
                                                               0
                                                                       1
                                                                                    -1
      4
             55.55556
                                   -1
                                                          1
                                                               0
                                                                       1
                                                                                    -1
         on_mouseover RightClick Redirect Result
      0
                    0
                                 1
                                           0
                    0
                                 1
                                           0
                                                   1
      1
      2
                    0
                                           1
                                                   1
                                 1
      3
                    0
                                           0
                                                  -1
                                -1
      4
                    0
                                -1
                                           0
                                                  -1
[51]: df7 = df[['RightClick', 'Result']]
      df7.head()
[51]:
         RightClick Result
      0
                  1
                           1
                  1
      1
                          1
                          1
      3
                 -1
                          -1
                 -1
                         -1
[52]: cross_tab = pd.crosstab(df7['RightClick'],df7['Result']).T
      cross_tab
[52]: RightClick
      Result
      -1
                  3984
                        17
       1
                  3915 83
[53]: #Let's plot and check the frequency of right click feature
```

```
plt.figure(figsize=(12,6))
plt.hist(df7['RightClick'], bins=15)
plt.title('Frequancy of feature 7')
plt.xlabel('Right Click')
plt.ylabel('Count')
plt.show()
```



Reject Null Hypothesis P-Value is 5.957918860957485e-11 Website status depends on feature7

Chi2 independency test tells us that the feature 7 is not independent of Result. We can also check it as follows

```
[55]: phishing_df7 = df7[df7['Result']==1] #store all the phishing websites in a_\( \to \) phishing

legitimate_df7 = df7[df7['Result']==-1] #store all the legitimate websites in_\( \to a \) legitimate

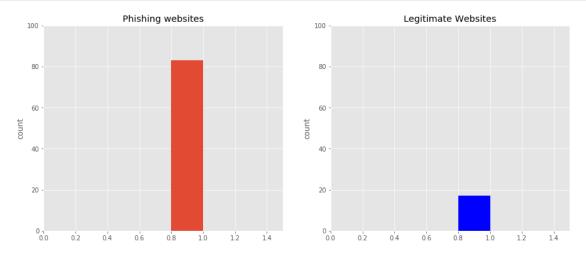
phishing_df7.head()
```

```
[55]: RightClick Result
0 1 1
1 1 1
2 1 1
5 1 1
6 1 1
```

```
[61]: #plot different histograms for phishing and legitmate websites
fig,(ax1,ax2) = plt.subplots(1,2,figsize=(15,6))

phishing_df7['RightClick'].hist(ax=ax1)
ax1.set_title('Phishing websites')
ax1.set_ylabel('count')
ax1.set_xlim([0,1.5])
ax1.set_ylim([0,100])

legitimate_df7['RightClick'].hist(ax=ax2,color='blue')
ax2.set_title('Legitimate Websites')
ax2.set_ylabel('count')
ax2.set_xlim([0,1.5])
ax2.set_ylim([0,1.5])
ax2.set_ylim([0,1.00])
```



According to the above graphs, we can clearly see that "disabling right click" feature is available

mostly in phishing websites than the legitimate websites

```
[]:
 []:
 []:
 []:
 []:
         Feature 8 - Status Bar Customization
[65]: import pandas as pd
      import numpy as np
      import matplotlib.pyplot as plt
      from scipy.stats import chi2_contingency #import chi2_contigency for chi2_LL
       → independency test
      from matplotlib import style
      style.use('ggplot')
      df = pd.read_csv('dataset1.csv')
      df.drop('url',axis=1,inplace=True)
      df.head()
[65]:
         Links_in_tags
                         Abnormal_URL
                                        Submitting_to_email
                                                              SFH
                                                                   Iframe
                                                                            popUpWidnow
      0
             73.913043
                                   -1
                                                           1
                                                                0
                                                                        -1
                                                                                      1
      1
             85.000000
                                   -1
                                                           1
                                                                0
                                                                        -1
                                                                                      1
      2
                                                                0
             97.000000
                                   -1
                                                           1
                                                                        -1
                                                                                      1
             12.000000
                                                                0
      3
                                   -1
                                                           1
                                                                        1
                                                                                     -1
      4
             55.55556
                                    -1
                                                           1
                                                                0
                                                                         1
                                                                                     -1
         on_mouseover RightClick Redirect
                                               Result
      0
                     1
                                 1
                                            0
                                                     1
                     1
                                 1
                                            0
                                                    1
      1
      2
                     1
                                 1
                                            1
                                                    1
      3
                    -1
                                            0
                                                   -1
                                -1
                    -1
                                -1
                                                   -1
[66]: df8 = df[['on_mouseover', 'Result']]
      df8.head()
[66]:
         on_mouseover
                        Result
      1
                     1
                             1
      2
                     1
                             1
      3
                    -1
                            -1
```

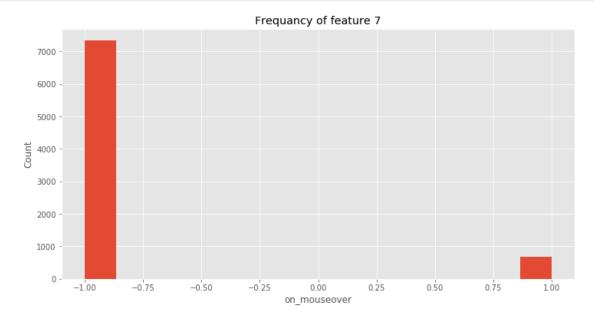
```
4 -1 -1
```

```
[67]: cross_tab = pd.crosstab(df8['on_mouseover'],df8['Result']).T
cross_tab
```

```
[67]: on_mouseover -1 1
Result
-1 3993 8
1 3338 660
```

```
[68]: #Let's plot and check the frequency of feature 8

plt.figure(figsize=(12,6))
 plt.hist(df8['on_mouseover'], bins=15)
 plt.title('Frequancy of feature 7')
 plt.xlabel('on_mouseover')
 plt.ylabel('Count')
 plt.show()
```



```
[69]: #HO : website status is independent of feature8
  #H1 : website status depends on feature8
  #Alpha : 0.05
alpha = 0.05

stats,p_value,degrees_of_freedom,expected = chi2_contingency(cross_tab)
if p_value > alpha:
```

```
print(f' Accept Null Hypothesis\n P-Value is {p_value}\n Website status is

→Independent of feature8')
else:
  print(f' Reject Null Hypothesis\n P-Value is {p_value}\n Website status

→depends on feature8')
```

Reject Null Hypothesis P-Value is 1.1138381147533346e-152 Website status depends on feature8

Chi2 independency test tells us that the feature 8 is not independent of Result. We can also check it as follows

```
[70]: phishing_df8 = df8[df8['Result']==1] #store all the phishing websites in a_\_
\topphishing
legitimate_df8 = df8[df8['Result']==-1] #store all the legitimate websites in_\_
\top a legitimate
phishing_df7.head()
```

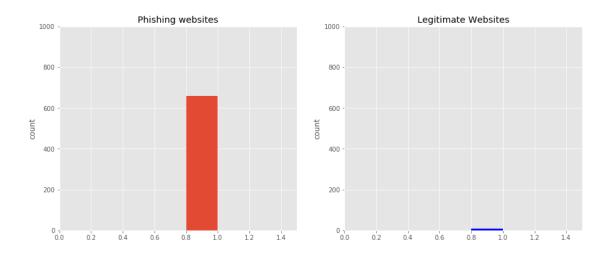
```
[70]: RightClick Result
0 1 1
1 1
2 1 1
5 1 1
6 1 1
```

```
[71]: #plot different histograms for phishing and legitmate websites
fig,(ax1,ax2) = plt.subplots(1,2,figsize=(15,6))

phishing_df8['on_mouseover'].hist(ax=ax1)
ax1.set_title('Phishing websites')
ax1.set_ylabel('count')
ax1.set_xlim([0,1.5])
ax1.set_ylim([0,1000])

legitimate_df8['on_mouseover'].hist(ax=ax2,color='blue')
ax2.set_title('Legitimate Websites')
ax2.set_ylabel('count')
ax2.set_xlim([0,1.5])
ax2.set_ylim([0,1.000])

plt.show()
```



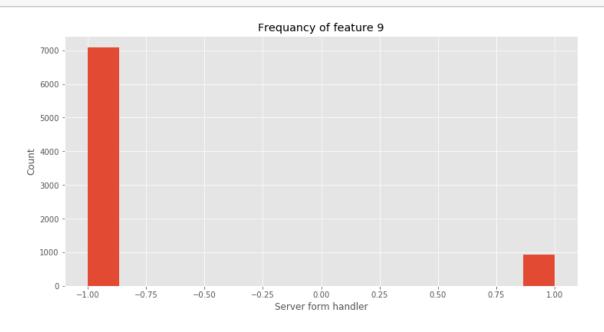
According to the above graphs, we can clearly see that "status bar customization" feature is available mostly in phishing websites than the legitimate websites

0.9 Feature 9 - Server Form Handler

[7]:	Links_in_tags	Abnormal_URL	Submitting_to_email	SFH	Iframe	popUpWidnow	\
0	73.913043	-1	1	1	-1	1	
1	85.000000	-1	1	1	-1	1	
2	97.000000	-1	1	1	-1	1	
3	12.000000	-1	1	-1	1	-1	
4	55.55556	-1	1	-1	1	-1	

	on_mouseover	RightClick	Redirect	Result
0	1	1	0	1
1	1	1	0	1
2	1	1	1	1
3	-1	-1	0	-1
4	-1	-1	0	-1

```
[8]: df9 = df[['SFH', 'Result']]
      df9.head()
 [8]:
         SFH
             Result
      0
           1
                   1
      1
           1
                   1
      2
           1
                   1
      3
          -1
                  -1
          -1
                  -1
 [9]: cross_tab = pd.crosstab(df9['SFH'],df9['Result']).T
      cross_tab
 [9]: SFH
                -1
                      1
      Result
              3889
      -1
                    112
       1
              3191 807
[10]: #Let's plot and check the frequency of SFH feature
      plt.figure(figsize=(12,6))
      plt.hist(df9['SFH'], bins=15)
      plt.title('Frequancy of feature 9')
      plt.xlabel('Server form handler')
      plt.ylabel('Count')
      plt.show()
```



Reject Null Hypothesis P-Value is 6.470665866834179e-131 Website status depends on feature9

Chi2 independency test tells us that the feature 9 is not independent of Result. We can also check it as follows

```
[12]: phishing_df9 = df9[df9['Result']==1] #store all the phishing websites in a_\( \to \) phishing
legitimate_df9 = df9[df9['Result']==-1] #store all the legitimate websites in_\( \to a \) legitimate
phishing_df9.head()
```

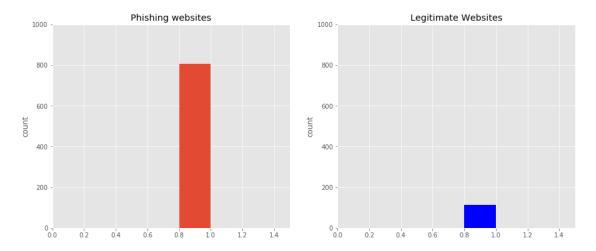
```
[12]: SFH Result
0 1 1
1 1 1
2 1 1
5 1 1
6 1 1
```

```
[14]: #plot different histograms for phishing and legitmate websites
fig,(ax1,ax2) = plt.subplots(1,2,figsize=(15,6))

phishing_df9['SFH'].hist(ax=ax1)
ax1.set_title('Phishing websites')
ax1.set_ylabel('count')
ax1.set_xlim([0,1.5])
ax1.set_ylim([0,1000])

legitimate_df9['SFH'].hist(ax=ax2,color='blue')
ax2.set_title('Legitimate Websites')
ax2.set_ylabel('count')
ax2.set_ylabel('count')
ax2.set_ylim([0,1.5])
ax2.set_ylim([0,1000])
```

plt.show()



According to the above graphs, we can clearly see that "server form handler" feature is available mostly in phishing websites than the legitimate websites

[]: