S2 - HOPE kNN_v2

November 30, 2020

0.1 Import data from DB.

[1]:
```
import pandas as pd
import numpy as np
```

[2]:
```
dfOrg = pd.read_csv('hope_dataset_cleaned.csv')

print(dfOrg.shape[0])
```

```
1243
```

[3]:
```
dfOrg.head(10)
```

[3]:

	pedido.data.attributes.age	pedido.data.attributes.diagnostic_main	pedido.data.attributes.gender	articulo	respuesta.articlesRevisedYear	respuesta.articlesRevisedMonth
0	75.0	FISTULA PERITONEAL	male	27395425	2018	
1	75.0	FISTULA PERITONEAL	male	28560554	2018	
2	75.0	FISTULA PERITONEAL	male	28641726	2017	
3	75.0	FISTULA PERITONEAL	male	26245344	2016	
4	75.0	FISTULA PERITONEAL	male	28942543	2018	
5	75.0	FISTULA PERITONEAL	male	24782153	2014	
6	75.0	FISTULA PERITONEAL	male	28002229	2018	
7	75.0	FISTULA PERITONEAL	male	27505109	2017	
8	75.0	FISTULA PERITONEAL	male	24850546	2015	
9	75.0	FISTULA PERITONEAL	male	29371050	2019	

```
0                                  1
1                                  4
2                                 12
3                                 12
4                                  6
5                                  6
6                                  9
7                                  4
8                                  1
9                                  4
```

	respuesta.pubmed_keys	utilidad
0	Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…	1.0
1	Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…	NaN
2	Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…	NaN
3	Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…	NaN
4	Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…	NaN
5	Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…	NaN
6	Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…	NaN
7	Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…	NaN
8	Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…	NaN
9	Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…	NaN

Remove “articulo” and “gender” to remove attributes without value

[4]:
```
dfOrg = dfOrg.drop([
    'pedido.data.attributes.gender',
    'articulo'
], axis=1)

dfOrg.head(10)
```

[4]:

	pedido.data.attributes.age	pedido.data.attributes.diagnostic_main	\
0	75.0	FISTULA PERITONEAL	
1	75.0	FISTULA PERITONEAL	
2	75.0	FISTULA PERITONEAL	
3	75.0	FISTULA PERITONEAL	
4	75.0	FISTULA PERITONEAL	
5	75.0	FISTULA PERITONEAL	
6	75.0	FISTULA PERITONEAL	
7	75.0	FISTULA PERITONEAL	
8	75.0	FISTULA PERITONEAL	
9	75.0	FISTULA PERITONEAL	

	respuesta.articlesRevisedYear	respuesta.articlesRevisedMonth	\
0	2018	1	
1	2018	4	

```
2                              2017                                12
3                              2016                                12
4                              2018                                 6
5                              2014                                 6
6                              2018                                 9
7                              2017                                 4
8                              2015                                 1
9                              2019                                 4

                                  respuesta.pubmed_keys  utilidad
0  Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…       1.0
1  Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…       NaN
2  Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…       NaN
3  Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…       NaN
4  Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…       NaN
5  Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…       NaN
6  Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…       NaN
7  Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…       NaN
8  Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…       NaN
9  Abdomen,Adenocarcinoma,Antiemetics,Blood Cultu…       NaN
```

Expand pubmed_keys attribute

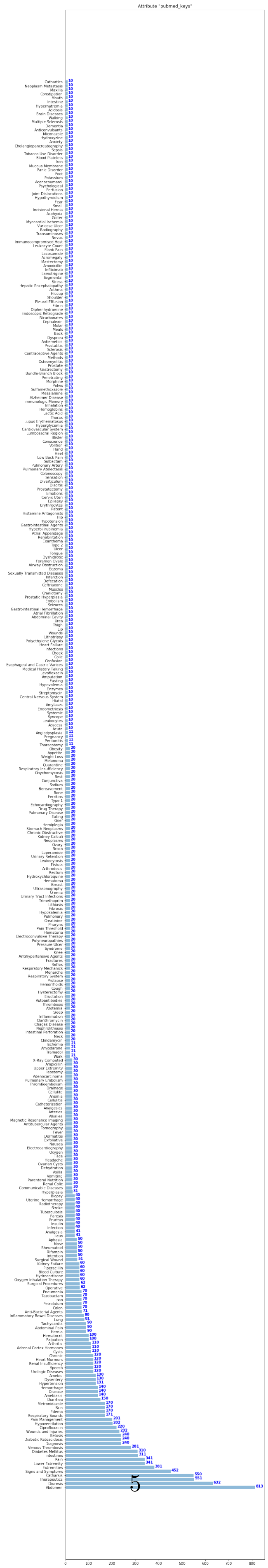
[5]:
```
dfOrg['respuesta.pubmed_keys'] = dfOrg['respuesta.pubmed_keys'].apply(lambda x :
 ↪ str(x).split(','))

dfOrg = dfOrg.explode('respuesta.pubmed_keys').reset_index(drop=True)

dfOrg.head(10)
```

[5]:
```
   pedido.data.attributes.age pedido.data.attributes.diagnostic_main  \
0                        75.0                     FISTULA PERITONEAL
1                        75.0                     FISTULA PERITONEAL
2                        75.0                     FISTULA PERITONEAL
3                        75.0                     FISTULA PERITONEAL
4                        75.0                     FISTULA PERITONEAL
5                        75.0                     FISTULA PERITONEAL
6                        75.0                     FISTULA PERITONEAL
7                        75.0                     FISTULA PERITONEAL
8                        75.0                     FISTULA PERITONEAL
9                        75.0                     FISTULA PERITONEAL

   respuesta.articlesRevisedYear  respuesta.articlesRevisedMonth  \
0                           2018                               1
1                           2018                               1
2                           2018                               1
3                           2018                               1
```

```
4                          2018                                1
5                          2018                                1
6                          2018                                1
7                          2018                                1
8                          2018                                1
9                          2018                                1

  respuesta.pubmed_keys  utilidad
0               Abdomen       1.0
1        Adenocarcinoma       1.0
2           Antiemetics       1.0
3         Blood Culture       1.0
4             Catharsis       1.0
5              Diuresis       1.0
6               Fistula       1.0
7           Gastrectomy       1.0
8     Incisional Hernia       1.0
9            Intestines       1.0
```

[6]:
```
import matplotlib.pyplot as plt

categoriesORGPubMedKeys = dfOrg['respuesta.pubmed_keys'].value_counts()

print("total: " + str(categoriesORGPubMedKeys.size))

y_values = np.arange(len(categoriesORGPubMedKeys.index))

plt.figure(figsize=(10,80))
plt.barh(y_values, categoriesORGPubMedKeys.values, align='center', alpha=0.5)
plt.yticks(y_values, categoriesORGPubMedKeys.index)

for i, v in enumerate(categoriesORGPubMedKeys.values):
    plt.text(v + 3, i, str(v), color='blue', fontweight='bold', fontsize=10)

plt.title('Attribute "pubmed_keys"')

plt.show()
```

```
total: 353
```


Attribute "pubmed_keys"

0.2 Transform (factorice) from Categories to continuous atributes

Transform 'pedido.data.attributes.diagnostic_main' atribute

[7]:
```
dfKNN = dfOrg

categoriesORGDiagnosticMain = dfKNN['pedido.data.attributes.diagnostic_main'].
 ↪value_counts()

print("total: " + str(categoriesORGDiagnosticMain.size))

categoriesORGDiagnosticMain
```

```
total: 31
```

[7]:
```
INFECCION DE PARTES BLANDAS    3270
DOLOR ABDOMINAL                2137
CETOACIDOSIS DIABETICA         1430
REHABILITACION NEUROLOGICA     1050
INSUFICIENCIA RESPIRATORIA      910
FISTULA PERITONEAL              770
REACCION ALERGICA               660
DIFICULTAD RESPIRATORIA         550
INFECCION URINARIA              470
DISNEA                          430
SINDROME FEBRIL                 390
LEGRADO                         360
CEFALEA INTENSA                 320
NEUMONIA                        320
ACV.ISQUEMICO                   310
INSUFICIENCIA CARDIACA          310
TEP                             250
PROLAPSO                        200
METRORRAGIA                     170
DIABETES                        160
ANEMIA                          150
HEMORRAGIA DIGESTIVA            140
ABDOMEN AGUDO                   121
ARTRITIS SEPTICA                120
POLITRAUMATISMO                 110
TORACOTOMIA                     110
LUXACION COLUMNA CERVICAL       100
CA GASTRICO                      90
DOLOR                            90
ADENOMA DE PROSTATA              40
```

```
DERMOLIPECTOMIA                   40
Name: pedido.data.attributes.diagnostic_main, dtype: int64
```

[8]:
```
dataDiagnosticMain, categoriesDiagnosticMain = pd.factorize(dfKNN['pedido.data.
↪attributes.diagnostic_main'])

dfKNN['pedido.data.attributes.diagnostic_main'] = dataDiagnosticMain
```

Transform 'respuesta.pubmed_keys' atribute

[9]:
```
categoriesORGPubMedKeys = dfKNN['respuesta.pubmed_keys'].value_counts()

print("total: " + str(categoriesORGPubMedKeys.size))
```

```
total: 353
```

[10]:
```
dataPubMedKeys, categoriesPubMedKeys = pd.factorize(dfKNN['respuesta.
↪pubmed_keys'])

dfKNN['respuesta.pubmed_keys'] = dataPubMedKeys
```

[11]:
```
dfKNN.head(10)
```

[11]:

	pedido.data.attributes.age	pedido.data.attributes.diagnostic_main	\
0	75.0	0	
1	75.0	0	
2	75.0	0	
3	75.0	0	
4	75.0	0	
5	75.0	0	
6	75.0	0	
7	75.0	0	
8	75.0	0	
9	75.0	0	

	respuesta.articlesRevisedYear	respuesta.articlesRevisedMonth	\
0	2018	1	
1	2018	1	
2	2018	1	
3	2018	1	
4	2018	1	
5	2018	1	
6	2018	1	
7	2018	1	
8	2018	1	
9	2018	1	

	respuesta.pubmed_keys	utilidad
0	0	1.0
1	1	1.0
2	2	1.0
3	3	1.0
4	4	1.0
5	5	1.0
6	6	1.0
7	7	1.0
8	8	1.0
9	9	1.0

[12]:
```
print("age NaN => " + str(dfKNN[pd.isnull(dfKNN['pedido.data.attributes.age'])].
 ↪shape[0]))
print("diagnostic_main NaN => " + str(dfKNN[pd.isnull(dfKNN['pedido.data.
 ↪attributes.diagnostic_main'])].shape[0]))
print("articlesRevisedYear NaN => " + str(dfKNN[pd.isnull(dfKNN['respuesta.
 ↪articlesRevisedYear'])].shape[0]))
print("articlesRevisedMonth NaN => " + str(dfKNN[pd.isnull(dfKNN['respuesta.
 ↪articlesRevisedMonth'])].shape[0]))
print("pubmed_keys NaN => " + str(dfKNN[pd.isnull(dfKNN['respuesta.
 ↪pubmed_keys'])].shape[0]))
print("utilidad NaN => " + str(dfKNN[pd.isnull(dfKNN['utilidad'])].shape[0]))
```

```
age NaN => 10
diagnostic_main NaN => 0
articlesRevisedYear NaN => 0
articlesRevisedMonth NaN => 0
pubmed_keys NaN => 0
utilidad NaN => 14758
```

Remove row with age eq NaN

[13]:
```
dfKNN = dfKNN[pd.notnull(dfKNN['pedido.data.attributes.age'])]
```

0.3 Separe data by utilidad is defined

[14]:
```
dfDataSetComplete = dfKNN[pd.notnull(dfKNN['utilidad'])]

print(dfDataSetComplete.shape[0])

dfDataSetToPredict = dfKNN[pd.isnull(dfKNN['utilidad'])]

print(dfDataSetToPredict.shape[0])
```

```
830
14748
```

[15]:
```
dfDataSetComplete.head(10)
```

[15]:

	pedido.data.attributes.age	pedido.data.attributes.diagnostic_main	\
0	75.0	0	
1	75.0	0	
2	75.0	0	
3	75.0	0	
4	75.0	0	
5	75.0	0	
6	75.0	0	
7	75.0	0	
8	75.0	0	
9	75.0	0	

	respuesta.articlesRevisedYear	respuesta.articlesRevisedMonth	\
0	2018	1	
1	2018	1	
2	2018	1	
3	2018	1	
4	2018	1	
5	2018	1	
6	2018	1	
7	2018	1	
8	2018	1	
9	2018	1	

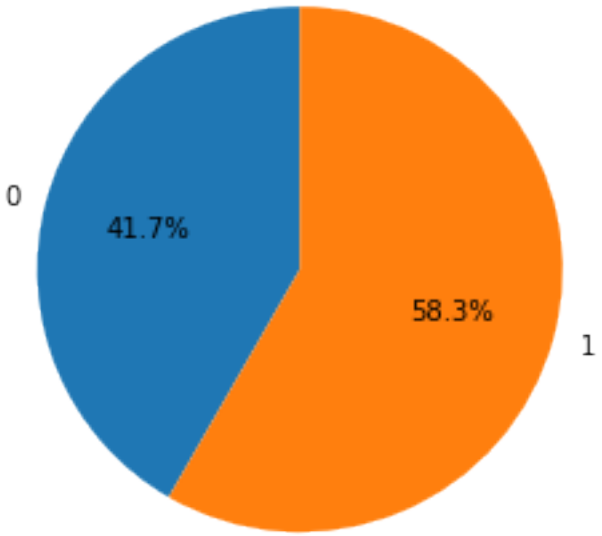
	respuesta.pubmed_keys	utilidad
0	0	1.0
1	1	1.0
2	2	1.0
3	3	1.0
4	4	1.0
5	5	1.0
6	6	1.0
7	7	1.0
8	8	1.0
9	9	1.0

0.4 Check distribution of "utilidad" attribute

[16]:
```
utilityValues = dfDataSetComplete['utilidad'].value_counts()

print(utilityValues)

import matplotlib.pyplot as plt

labels = '0', '1'
```

```
sizes = [utilityValues.get(0.0), utilityValues.get(1.0)]

fig1, ax1 = plt.subplots()
ax1.pie(sizes, labels=labels, autopct='%1.1f%%', startangle=90)
ax1.axis('equal')

plt.show()
```

```
1.0    484
0.0    346
Name: utilidad, dtype: int64
```



0.5 k-NN

[17]:
```
from sklearn.neighbors import KNeighborsClassifier
from sklearn.model_selection import train_test_split
from sklearn.preprocessing import MinMaxScaler
from matplotlib.colors import ListedColormap
import matplotlib.pyplot as plt
```

[18]:
```
X = dfDataSetComplete[['pedido.data.attributes.diagnostic_main',
       'respuesta.articlesRevisedYear',
       'respuesta.articlesRevisedMonth',
       'respuesta.pubmed_keys']].values

y = dfDataSetComplete['utilidad'].values
```

```
X_train, X_test, y_train, y_test = train_test_split(X, y, random_state=0)
```

[19]:
```
scaler = MinMaxScaler()
X_train = scaler.fit_transform(X_train)
X_test = scaler.transform(X_test)
```

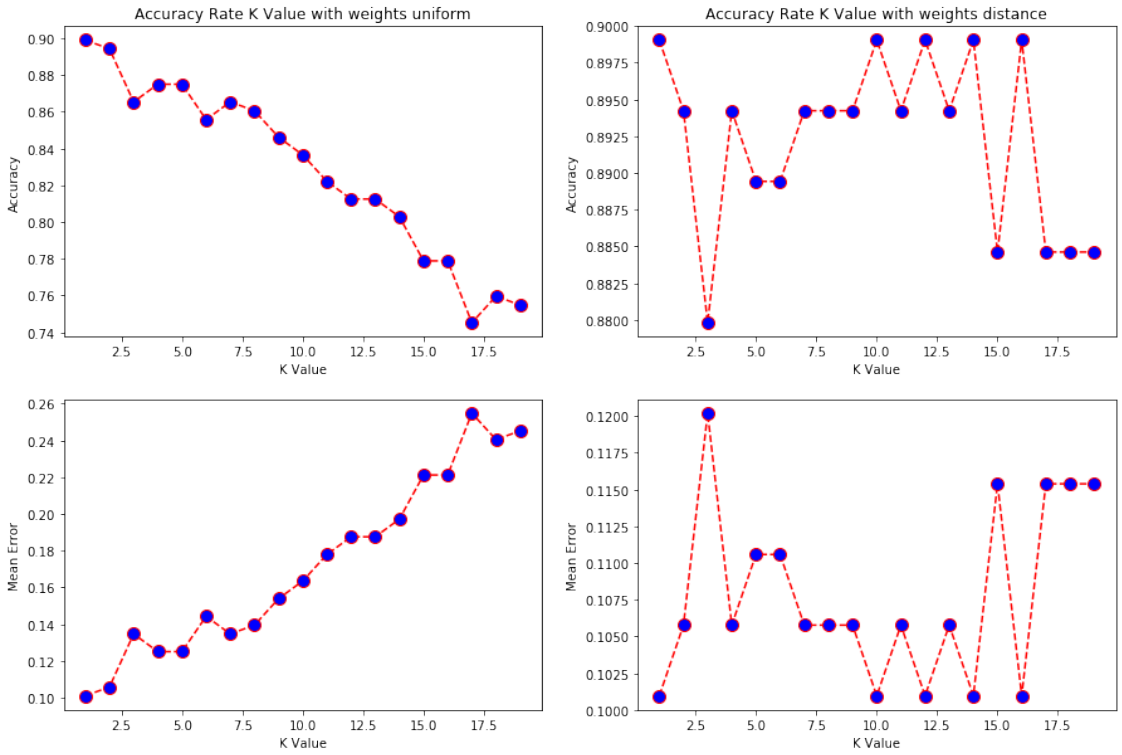
[20]:
```
k_range = range(1, 20)
accuracy_weights_uniform = []
error_weights_uniform = []
for k in k_range:
    knn = KNeighborsClassifier(n_neighbors = k, weights='uniform', n_jobs=4)
    knn.fit(X_train, y_train)
    y_pred = knn.predict(X_test)
    accuracy_weights_uniform.append(knn.score(X_test, y_test))
    error_weights_uniform.append(np.mean(y_pred != y_test))
```

[21]:
```
k_range = range(1, 20)
accuracy_weights_distance = []
error_weights_distance = []
for k in k_range:
    knn = KNeighborsClassifier(n_neighbors = k, weights='distance', n_jobs=4)
    knn.fit(X_train, y_train)
    y_pred = knn.predict(X_test)
    accuracy_weights_distance.append(knn.score(X_test, y_test))
    error_weights_distance.append(np.mean(y_pred != y_test))
```

[22]:
```
fig, axs = plt.subplots(2, 2,figsize=(15, 10))
axs[0, 0].plot(range(1, 20), accuracy_weights_uniform, color='red',␣
 ↪linestyle='dashed', marker='o',
         markerfacecolor='blue', markersize=10)
axs[0, 0].set_title('Accuracy Rate K Value with weights uniform')
axs[0, 0].set_xlabel('K Value')
axs[0, 0].set_ylabel('Accuracy')
axs[0, 1].plot(range(1, 20), accuracy_weights_distance, color='red',␣
 ↪linestyle='dashed', marker='o',
         markerfacecolor='blue', markersize=10)
axs[0, 1].set_title('Accuracy Rate K Value with weights distance')
axs[0, 1].set_xlabel('K Value')
axs[0, 1].set_ylabel('Accuracy')
axs[1, 0].plot(range(1, 20), error_weights_uniform, color='red',␣
 ↪linestyle='dashed', marker='o',
         markerfacecolor='blue', markersize=10)
axs[1, 0].set_xlabel('K Value')
axs[1, 0].set_ylabel('Mean Error')
axs[1, 1].plot(range(1, 20), error_weights_distance, color='red',␣
 ↪linestyle='dashed', marker='o',
         markerfacecolor='blue', markersize=10)
```

```
axs[1, 1].set_xlabel('K Value')
axs[1, 1].set_ylabel('Mean Error')
```

[22]: Text(0, 0.5, 'Mean Error')



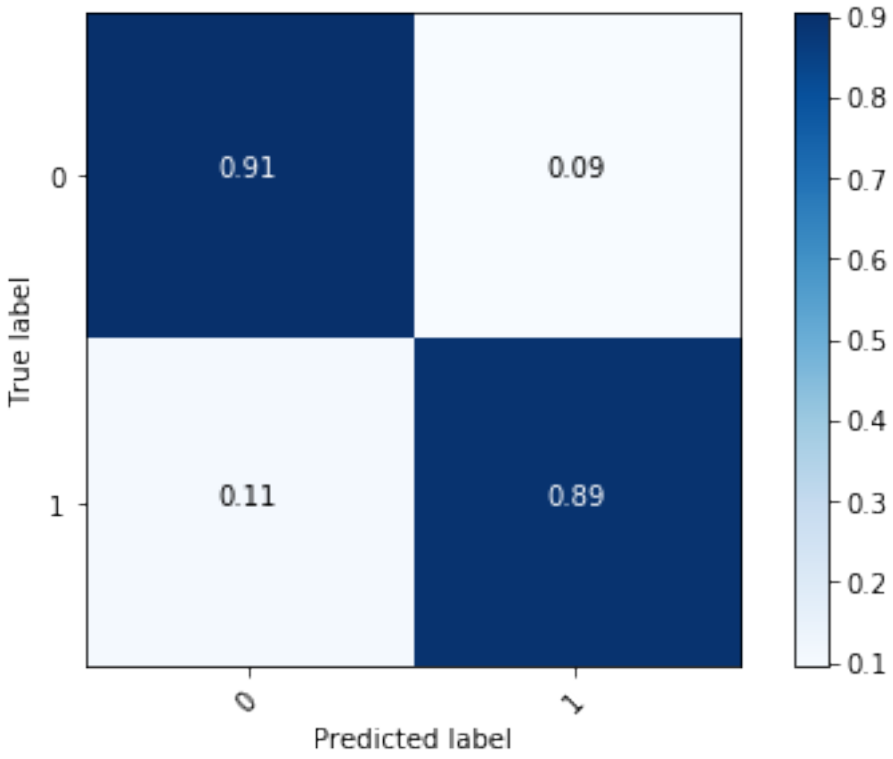
[23]:
```
n_neighbors = 1

knn = KNeighborsClassifier(n_neighbors, weights='uniform', n_jobs=4)
knn.fit(X_train, y_train)
print('Accuracy of K-NN classifier on training set: {:.2f}'
     .format(knn.score(X_train, y_train)))
print('Accuracy of K-NN classifier on test set: {:.2f}'
     .format(knn.score(X_test, y_test)))
```

```
Accuracy of K-NN classifier on training set: 0.95
Accuracy of K-NN classifier on test set: 0.90
```

Show confusion matrix:

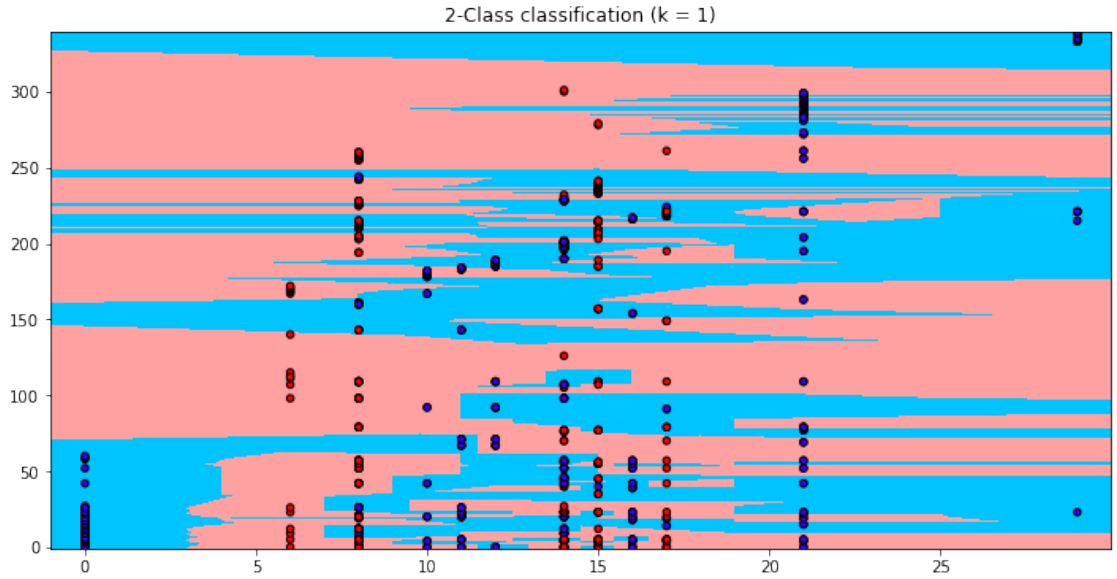
[24]:
```
import itertools
from sklearn.metrics import confusion_matrix

preds = knn.predict(X_test)
cnf_matrix = confusion_matrix(y_test, preds)
```

```
def plot_confusion_matrix(cm, classes):
    cm = cm.astype('float') / cm.sum(axis=1)[:, np.newaxis]

    cmap=plt.cm.Blues

    plt.imshow(cm, interpolation='nearest', cmap=cmap)
    plt.colorbar()
    tick_marks = np.arange(len(classes))
    plt.xticks(tick_marks, classes, rotation=45)
    plt.yticks(tick_marks, classes)

    thresh = cm.max() / 2.
    for i, j in itertools.product(range(cm.shape[0]), range(cm.shape[1])):
        plt.text(j, i, format(cm[i, j], ".2f"),
                 horizontalalignment="center",
                 color="white" if cm[i, j] > thresh else "black")

    plt.tight_layout()
    plt.ylabel('True label')
    plt.xlabel('Predicted label')

n_classes=["0","1"]
plot_confusion_matrix(cnf_matrix, classes=n_classes)
```



0.6 Print the K-NN classification only with the attributes "diagnostic_main" and "pubmed_keys"

[25]:
```
X_plot = dfDataSetComplete[['pedido.data.attributes.diagnostic_main',
       'respuesta.pubmed_keys']].values
y_plot = dfDataSetComplete['utilidad'].values

h = .02  # step size in the mesh

# Create color maps
cmap_light = ListedColormap(['#ffa1a1', '#00c4ff'])
cmap_bold = ListedColormap(['#ff0000', '#3a00ff'])

# we create an instance of Neighbours Classifier and fit the data.
clf = KNeighborsClassifier(n_neighbors)
clf.fit(X_plot, y_plot)

# Plot the decision boundary. For that, we will assign a color to each
# point in the mesh [x_min, x_max]x[y_min, y_max].
x_min, x_max = X_plot[:, 0].min() - 1, X_plot[:, 0].max() + 1
y_min, y_max = X_plot[:, 1].min() - 1, X_plot[:, 1].max() + 1
xx, yy = np.meshgrid(np.arange(x_min, x_max, h),
                     np.arange(y_min, y_max, h))
Z = clf.predict(np.c_[xx.ravel(), yy.ravel()])

# Put the result into a color plot
Z = Z.reshape(xx.shape)
plt.figure(figsize=(12, 6))
plt.pcolormesh(xx, yy, Z, cmap=cmap_light)

# Plot also the training points
plt.scatter(X_plot[:, 0], X_plot[:, 1], c=y_plot, cmap=cmap_bold,
            edgecolor='k', s=20)
plt.xlim(xx.min(), xx.max())
plt.ylim(yy.min(), yy.max())
plt.title("2-Class classification (k = 1)")

plt.show()
```



0.7 Run Prediction

[26]:
```
def runPrediction(row):
    valuesrow = np.array([row.get(['pedido.data.attributes.diagnostic_main',
       'respuesta.articlesRevisedYear',
       'respuesta.articlesRevisedMonth',
       'respuesta.pubmed_keys']).values])
    return knn.predict(valuesrow)

dfDataSetToPredict.apply(runPrediction, axis=1)
```

[26]:
```
28        [0.0]
29        [1.0]
30        [1.0]
31        [1.0]
32        [1.0]
          ...
15583     [1.0]
15584     [1.0]
15585     [1.0]
15586     [1.0]
15587     [1.0]
Length: 14748, dtype: object
```

[ ]: