

Online Signature Verification Challenge

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Entrée [1]:

```
1 import numpy as np
2 import os
3 import pandas as pd
4 from sklearn.neighbors import KNeighborsClassifier
5 from sklearn import preprocessing
6 from sklearn import svm
7 from sklearn import tree
8 from sklearn.ensemble import RandomForestClassifier
9 from sklearn.linear_model import LogisticRegression
10 import matplotlib.pyplot as plt
```

Extraction des donnees

Entrée [2]:

```
1 #Creation du matrice qui contient 7 column
2 def Create_Matrix(file):
3     Rows_Affected=0
4     Total_Rows=0
5     Matrix=None
6     with open(file,'r') as data:
7         rows=data.readlines()
8         for row in rows:
9             if Rows_Affected==0:
10                 Total_Rows=int(row)
11                 Matrix=np.zeros((Total_Rows,7))
12                 Rows_Affected+=1
13             else:
14                 line=row.strip().split(" ")
15                 if len(line)==7:
16                     Matrix[Rows_Affected-1,0]=float(line[0])
17                     Matrix[Rows_Affected-1,1]=float(line[1])
18                     Matrix[Rows_Affected-1,2]=float(line[2])
19                     Matrix[Rows_Affected-1,3]=float(line[3])
20                     Matrix[Rows_Affected-1,4]=float(line[4])
21                     Matrix[Rows_Affected-1,5]=float(line[5])
22                     Matrix[Rows_Affected-1,6]=float(line[6])
23                     Rows_Affected+=1
24                 Rows_Affected-=1
25                 while((Total_Rows-Rows_Affected)!=0):
26                     Matrix=np.delete(Matrix,Total_Rows-1, 0)
27                     Total_Rows=Total_Rows-1
28     return Matrix
```

Creation de la Methode DTW

Entrée [3]:

```

1 def Distance_X_Y(pt1,pt2):
2     return np.sqrt((pt1[0]-pt2[0])**2+(pt1[1]-pt2[1])**2)
3
4 def Distance_Other_Fea(pt1,pt2):
5     return np.sqrt((pt1-pt2)**2)
6
7 def Extra_Point(Mat):
8     Points=np.zeros((Mat.shape[0],2))
9     for i in range(Mat.shape[0]):
10         Points[i,0]=Mat[i,0]
11         Points[i,1]=Mat[i,1]
12     return Points
13
14 def Extra_Feat(Mat,dim):
15     if dim>=2 and dim<7:
16         Feat=np.zeros((Mat.shape[0],1))
17         for i in range(Mat.shape[0]):
18             Feat[i,0]=Mat[i,dim]
19         return Feat
20     else:
21         return None
22

```

Entrée [4]:

```

1 def DTW_X_AND_Y(Mat_Ref,Mat_Requ):
2     X_Y_Ref=Extra_Point(Mat_Ref)
3     X_Y_Requ=Extra_Point(Mat_Requ)
4     n =X_Y_Ref.shape[0]
5     m =X_Y_Requ.shape[0]
6     cost_matrix = np.full((n+1, m+1), np.inf)
7     cost_matrix[0, 0] = 0
8     for i in range(1, n+1):
9         for j in range(1, m+1):
10             cost = Distance_X_Y(X_Y_Ref[i-1], X_Y_Requ[j-1])
11             cost_matrix[i, j] = cost + min(cost_matrix[i-1, j], cost_matrix[i, j-1])
12
13     i = n
14     j = m
15     path = [(i, j)]
16     while i > 1 and j > 1:
17         if cost_matrix[i-1, j] < cost_matrix[i-1, j-1] and cost_matrix[i-1, j] <
18             i -= 1
19         elif cost_matrix[i, j-1] < cost_matrix[i-1, j-1] and cost_matrix[i, j-1]
20             j -= 1
21         else:
22             i -= 1
23             j -= 1
24         path.append((i, j))
25     path.append((1, 1))
26
27     return cost_matrix[n, m] / len(path)
28
29

```

Entrée [5]:

```

1 def DTW_Other_Features(Mat_Ref,Mat_Requ):
2     Coe={}
3     dim=2
4     while(dim<7):
5         Feat_Ref=Extra_Feat(Mat_Ref,dim)
6         Feat_Req=Extra_Feat(Mat_Requ,dim)
7         n = Feat_Ref.shape[0]
8         m = Feat_Req.shape[0]
9         cost_matrix = np.full((n+1, m+1), np.inf)
10        cost_matrix[0, 0] = 0
11        for i in range(1, n+1):
12            for j in range(1, m+1):
13                cost = Distance_Other_Fea(Feat_Ref[i-1], Feat_Req[j-1])
14                cost_matrix[i, j] = cost + min(cost_matrix[i-1, j], cost_matrix[i, j-1])
15
16        i = n
17        j = m
18        path = [(i, j)]
19        while i > 1 and j > 1:
20            if cost_matrix[i-1, j] < cost_matrix[i-1, j-1] and cost_matrix[i-1, j] <
21                i -= 1
22            elif cost_matrix[i, j-1] < cost_matrix[i-1, j-1] and cost_matrix[i, j-1] <
23                j -= 1
24            else:
25                i -= 1
26                j -= 1
27            path.append((i, j))
28        path.append((1, 1))
29        if dim==2:
30            Coe['time stamp']=cost_matrix[n, m] / len(path)
31        elif dim==3:
32            Coe['button status']=cost_matrix[n, m] / len(path)
33        elif dim==4:
34            Coe['azimuth']=cost_matrix[n, m] / len(path)
35        elif dim==5:
36            Coe['altitude']=cost_matrix[n, m] / len(path)
37        elif dim==6:
38            Coe['pressure']=cost_matrix[n, m] / len(path)
39        dim+=1
40    return Coe
41
42 def DTW_ALL_Features(SigRef,SigRequ):
43     Mat_Ref=Create_Matrix(SigRef)
44     Mat_Requ=Create_Matrix(SigRequ)
45     dict=DTW_Other_Features(Mat_Ref,Mat_Requ)
46     dict['X_Y']=DTW_X_AND_Y(Mat_Ref,Mat_Requ)
47     return dict

```

CREATION DU DATAFRAME

**on a calculer DTW entre deux signatures du meme utilisateur
chaque utilisateur possède un dossier qui contient leur
signatures**

**Dans un premier temps en calcule DTW entre 2 signatures pour
toutes les signatures de chaque utilisateur**

**on refait la meme action pour tous les utilisateurs et on donne a
la colonne Similary la valeur 1**

Entrée [6]:

```

1 df = pd.DataFrame(columns=['X_Y', 'time stamp','button status','azimuth','altitude',
2 #SIMILAR
3 for i in range(1,34):
4 dir='online_signature_verification/data/Task1/New_Data/User'+str(i)
5 for k in range(len(os.listdir(dir))):
6     file1=os.listdir(dir)[k]
7     file1=dir+'/'+file1
8     for j in range(k+1,len(os.listdir(dir))):
9         file2=os.listdir(dir)[j]
10        file2=dir+'/'+file2
11        dict=DTW_ALL_Features(file1,file2)
12        dict['Similary']=True
13        df.loc[df.shape[0]]=[dict['X_Y'],dict['time stamp'],dict['button status'],dict
14 #NONE
15 for i in range(1,32):
16     dir1='online_signature_verification/data/Task1/New_Data/User'+str(i)
17     for k in range(len(os.listdir(dir1))-3):
18         file1=dir1+'/'+os.listdir(dir1)[k]
19         dir2='online_signature_verification/data/Task1/New_Data/User'+str(i+1)
20         for j in range(len(os.listdir(dir2))-3):
21             file2=dir2+'/'+os.listdir(dir2)[j]
22             dict=DTW_ALL_Features(file1,file2)
23             dict['Similary']=False
24             df.loc[df.shape[0]]=[dict['X_Y'],dict['time stamp'],dict['button status'],
25
26 df

```

Entrée [7]:

```

1 df.to_csv('online_signature_verification/data/Task1/New_Data.csv',index=False, heade
2 df=pd.read_csv('online_signature_verification/data/Task1/New_Data.csv')
3 df=df.replace({False:0,True:1})
4 df.head()

```

Out[7]:

| | X_Y | time stamp | button status | azimuth | altitude | pressure | Similary |
|---|------------|--------------|---------------|------------|-----------|-----------|----------|
| 0 | 770.575241 | 2299.813953 | 0.00 | 31.509434 | 13.951613 | 60.000000 | 1 |
| 1 | 614.169296 | 4173.857143 | 0.00 | 35.445545 | 38.931298 | 60.888889 | 1 |
| 2 | 345.186713 | 6476.132530 | 0.00 | 102.149533 | 29.701493 | 63.509615 | 1 |
| 3 | 826.504983 | 14148.638298 | 0.02 | 36.967213 | 87.181818 | 62.816794 | 1 |
| 4 | 345.188928 | 1872.219780 | 0.00 | 11.698113 | 33.816794 | 40.369748 | 1 |

A cette etape en implémente 5 modele et en fait une élection a chaque teste pour voir la majeur réponse

Entrée [8]:

```

1
2 Featu=df.drop(['Similary'],axis=1)
3 Label=df['Similary']
4 Model_Line=LogisticRegression().fit(Featu, Label)
5 Model_Arbre=tree.DecisionTreeClassifier().fit(Featu,Label)
6 Model_Fore=RandomForestClassifier(n_estimators=50).fit(Featu,Label)
7 Model_KNN=KNeighborsClassifier().fit(Featu,Label)
8 Model_SVM=svm.SVR().fit(Featu,Label)
9 Model_Used=[Model_Line,Model_Arbre,Model_Fore,Model_KNN,Model_SVM]
10
11
12

```

Entrée [9]:

```

1 def Voting_Model(dict,Tab_Model):
2     Vote_Oui=0
3     Vote_Non=0
4     for Model in Tab_Model:
5         Predct=Model.predict([[dict['X_Y'],dict['time stamp'],dict['button status']],
6         if Predct==True:
7             Vote_Oui+=1
8         else:
9             Vote_Non+=1
10    if Vote_Non<Vote_Oui:
11        return True
12    else:
13        return False
14
15 def CompareSing(SigRef,SingReq,Model_Used):
16     dict=DTW_ALL_Features(SigRef,SingReq)
17     return Voting_Model(dict,Model_Used)
18

```

Entrée [10]:

```

1 CompareSing('online_signature_verification/data/Task1/New_Data/User1/U1S1.TXT',
2             'online_signature_verification/data/Task1/New_Data/User1/U1S2.TXT',Model_Used)
3

```

C:\Users\DATA\AppData\Local\Packages\PythonSoftwareFoundation.Python.3.10_qbz5n2kfra8p0\LocalCache\local-packages\Python310\site-packages\sklearn\base.py:439: UserWarning: X does not have valid feature names, but LogisticRegression was fitted with feature names

warnings.warn(

C:\Users\DATA\AppData\Local\Packages\PythonSoftwareFoundation.Python.3.10_qbz5n2kfra8p0\LocalCache\local-packages\Python310\site-packages\sklearn\base.py:439: UserWarning: X does not have valid feature names, but DecisionTreeClassifier was fitted with feature names

warnings.warn(

C:\Users\DATA\AppData\Local\Packages\PythonSoftwareFoundation.Python.3.10_qbz5n2kfra8p0\LocalCache\local-packages\Python310\site-packages\sklearn\base.py:439: UserWarning: X does not have valid feature names, but RandomForestClassifier was fitted with feature names

warnings.warn(

C:\Users\DATA\AppData\Local\Packages\PythonSoftwareFoundation.Python.3.10_qbz5n2kfra8p0\LocalCache\local-packages\Python310\site-packages\sklearn\base.py:439: UserWarning: X does not have valid feature names, but KNeighborsClassifier was fitted with feature names

warnings.warn(

C:\Users\DATA\AppData\Local\Packages\PythonSoftwareFoundation.Python.3.10_qbz5n2kfra8p0\LocalCache\local-packages\Python310\site-packages\sklearn\base.py:439: UserWarning: X does not have valid feature names, but SVR was fitted with feature names

warnings.warn(

Out[10]:

True

CREATION DU FICHIER CSV

Entrée [21]:

```

1  dir='online_signature_verification/data/Task1/Test'
2  df = pd.DataFrame(columns=['Sing_FileName1', 'Sing_FileName2', 'Similary'])
3
4  for i in range(len(os.listdir(dir))-1):
5      file1=dir+'/'+os.listdir(dir)[i]
6      file2=dir+'/'+os.listdir(dir)[i+1]
7      result=CompareSing(file1,file2,Model_Used)
8      df.loc[df.shape[0]]=[file1,file2,result]
9
10 df
11

```

C:\Users\DATA\AppData\Local\Packages\PythonSoftwareFoundation.Python.3.10_qbz5n2kfra8p0\LocalCache\local-packages\Python310\site-packages\sklearn\base.py:439: UserWarning: X does not have valid feature names, but LogisticRegression was fitted with feature names

warnings.warn(

C:\Users\DATA\AppData\Local\Packages\PythonSoftwareFoundation.Python.3.10_qbz5n2kfra8p0\LocalCache\local-packages\Python310\site-packages\sklearn\base.py:439: UserWarning: X does not have valid feature names, but DecisionTreeClassifier was fitted with feature names

warnings.warn(

C:\Users\DATA\AppData\Local\Packages\PythonSoftwareFoundation.Python.3.10_qbz5n2kfra8p0\LocalCache\local-packages\Python310\site-packages\sklearn\base.py:439: UserWarning: X does not have valid feature names, but RandomForestClassifier was fitted with feature names

warnings.warn(

C:\Users\DATA\AppData\Local\Packages\PythonSoftwareFoundation.Python.3.10_qbz5n2kfra8p0\LocalCache\local-packages\Python310\site-packages\sklearn\base.py:439: UserWarning: X does not have valid feature names, but KNeighborsClassifier was fitted with feature names

ACCURACY

Entrée [33]:

```

1 df.to_csv('online_signature_verification/data/Task1/Result.csv',index=False, header=
2 df.shape
3 df=df.replace({False:0,True:1})
4 # Nbr Impaire False
5 # Nbr Paire True
6 Accu=0
7 result=0
8 for i in range(df.shape[0]):
9     if i%2==0:
10         result=1
11         if df['Similary'][i]==result:
12             Accu+=1
13     else:
14         result=0
15         if df['Similary'][i]==result:
16             Accu+=1
17
18 Accu/df.shape[0]

```

Out[33]:

0.8923076923076924

CONFUSION MATRIX

Entrée [34]:

```

1 Matrix_Conf=np.zeros((2,2))
2 result=0
3 for i in range(df.shape[0]):
4     if i%2==0:
5         result=1
6     else:
7         result=0
8     if result==0 and df['Similary'][i]==0:
9         Matrix_Conf[0,0]+=1
10    elif result==1 and df['Similary'][i]==0:
11        Matrix_Conf[0,1]+=1
12    elif result==0 and df['Similary'][i]==1:
13        Matrix_Conf[1,0]+=1
14    else:
15        Matrix_Conf[1,1]+=1
16
17 Matrix_Conf
18

```

Out[34]:

```
array([[29.,  4.],
       [ 3., 29.]])
```

Type *Markdown* and LaTeX: α^2

Entrée []:

| | |
|---|--|
| 1 | |
|---|--|

Entrée []:

| | |
|---|--|
| 1 | |
|---|--|