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3 Faces recognition example using eigenfaces and SVMs
6 The dataset used in this example is a preprocessed excerpt
  of the
7 "Labeled Faces in the Wild", aka LFW :
9 http://vis-www.cs.umass.edu/lfw/lfw-funneled.tgz (233MB)
10
11 .. LFW: http://vis-www.cs.umass.edu/lfw/
12
13 Expected results for the top 5 most represented people in
  the dataset:
14
16
               precision recall f1-score support
Ariel Sharon 0.67
                                  0.77
18
                           0.92
                                           13
19
     Colin Powell
                   0.75
                          0.78
                                  0.76
                                           60
20 Donald Rumsfeld
                   0.78
                          0.67
                                  0.72
                                           27
21
    George W Bush
                   0.86
                          0.86
                                 0.86
                                          146
22 Gerhard Schroeder
                   0.76
                          0.76
                                 0.76
                                           25
                          0.67
23
     Hugo Chavez
                   0.67
                                 0.67
                                           15
24
      Tony Blair
                   0.81
                          0.69
                                 0.75
                                           36
25
26
     avg / total 0.80 0.80 0.80
                                       322
28
29 """
30 from future import print function
31
32 from time import time
33 import logging
34 import matplotlib.pyplot as plt
35
36 from sklearn.model selection import train test split
37 from sklearn.model selection import GridSearchCV
38 from sklearn.datasets import fetch lfw people
39 from sklearn.metrics import classification report
40 from sklearn.metrics import confusion matrix
41 from sklearn.decomposition import PCA
42 from sklearn.svm import SVC
43
44
```

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45 print ( doc )
46
47 # Display progress logs on stdout
48 logging.basicConfig(level=logging.INFO, format='%(asctime)
  s % (message) s')
49
50
########################
52 # Download the data, if not already on disk and load it as
   numpy arrays
53
54 lfw people = fetch lfw people(min faces per person=70,
  resize=0.4)
55
56 # introspect the images arrays to find the shapes (for
  plotting)
57 n samples, h, w = lfw people.images.shape
58
59 # for machine learning we use the 2 data directly (as
  relative pixel
60 # positions info is ignored by this model)
61 X = 1 fw people.data
62 n features = X.shape[1]
63
64 # the label to predict is the id of the person
65 y = 1 fw people.target
66 target names = lfw people.target names
67 n classes = target names.shape[0]
68
69 print("Total dataset size:")
70 print("n samples: %d" % n samples)
71 print("n features: %d" % n features)
72 print("n classes: %d" % n classes)
73
74
#########################
76 # Split into a training set and a test set using a
  stratified k fold
77
78 # split into a training and testing set
79 X train, X test, y train, y test = train test split(
80
      X, y, test size=0.25, random state=42)
81
82
```

```
##########################
84 # Compute a PCA (eigenfaces) on the face dataset (treated
    as unlabeled
85 # dataset): unsupervised feature extraction /
   dimensionality reduction
86 \text{ n components} = 150
87
88 print("Extracting the top %d eigenfaces from %d faces"
         % (n components, X train.shape[0]))
90 t0 = time()
91 pca = PCA(n components=n components, svd solver='
   randomized',
92
            whiten=True).fit(X train)
93 print("done in %0.3fs" % (time() - t0))
95 eigenfaces = pca.components .reshape((n components, h, w)
96
97 print ("Projecting the input data on the eigenfaces
   orthonormal basis")
98 t0 = time()
99 X train pca = pca.transform(X train)
100 X test pca = pca.transform(X test)
101 print("done in %0.3fs" % (time() - t0))
102
103
##########################
105 # Train a SVM classification model
106
107 print("Fitting the classifier to the training set")
108 t0 = time()
109 param grid = {'C': [1e3, 5e3, 1e4, 5e4, 1e5],
                'gamma': [0.0001, 0.0005, 0.001, 0.005, 0.
110
   01, 0.1], }
111 clf = GridSearchCV(SVC(kernel='rbf', class weight='
   balanced'), param grid)
112 clf = clf.fit(X train pca, y train)
113 print("done in %0.3fs" % (time() - t0))
114 print("Best estimator found by grid search:")
115 print(clf.best estimator )
116
117
#########################
```

```
119 # Quantitative evaluation of the model quality on the
   test set
120
121 print("Predicting people's names on the test set")
122 t0 = time()
123 y pred = clf.predict(X test pca)
124 print("done in %0.3fs" % (time() - t0))
125
126 print(classification report(y test, y pred, target names=
   target names))
127 print(confusion matrix(y test, y pred, labels=range(
   n classes)))
128
129
########################
131 # Qualitative evaluation of the predictions using
   matplotlib
132
133 def plot gallery(images, titles, h, w, n row=3, n col=4):
134
       """Helper function to plot a gallery of portraits"""
       plt.figure(figsize=(1.8 * n col, 2.4 * n row))
135
       plt.subplots adjust(bottom=0, left=.01, right=.99,
136
   top=.90, hspace=.35)
       for i in range(n row * n col):
137
138
           plt.subplot(n row, n col, i + 1)
139
           plt.imshow(images[i].reshape((h, w)), cmap=plt.cm
   .gray)
140
           plt.title(titles[i], size=12)
141
           plt.xticks(())
142
           plt.yticks(())
143
144
145 # plot the result of the prediction on a portion of the
   test set
146
147 def title(y pred, y test, target names, i):
148
       pred name = target names[y pred[i]].rsplit(' ', 1)[-1
149
       true name = target names[y test[i]].rsplit(' ', 1)[-1
   1
150
       return 'predicted: %s\ntrue:
                                        %s' % (pred name,
   true name)
151
152 prediction titles = [title(y pred, y test, target names,
```

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153
                         for i in range(y_pred.shape[0])]
154
155 plot_gallery(X_test, prediction_titles, h, w)
156
157 # plot the gallery of the most significative eigenfaces
158
159 eigenface titles = ["eigenface %d" % i for i in range(
    eigenfaces.shape[0])]
160 plot gallery(eigenfaces, eigenface titles, h, w)
161
162 plt.show()
163
```