Exercicio 4: KMeans

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1 Descrição do exercicio

Use os dados do arquivo cluster-data.csv (os dados sao uma media de 30 medidas por vez da pessoa 1 do dataset Activity Recognition from Single Chest-Mounted Accelerometer Data Set

- 1. Rode o kmeans nos dados, com numero de restarts = 5
- 2. Use alguma metrica interna (algum Dunn, Silhouette, Calinski-Harabaz index) apenas uma -para escolher o k entre 2 e 10.
- 3. O arquivo cluster-data-class.csv contem a classe correta de cada ponto. Use alguma medida externa (Normalized/adjusted Rand, Mutual information, variation of information) para decidir no k.
- 4. Plote os graficos correspondentes das 2 metricas (interna e externa) para os varios valores de k (extra).

2 Resultados

Os resultados foram obtidos rodando o script apresentado na seção 3. Rodando o script em python obtemos os seguintes valores:

```
1
   --- Metricas Internas
 2
             K
                  Silhouette
                                Calinski
3
                  0.583
                           0.516
          k=2
4
                  0.583
                           0.465
                  0.456
                           0.474
5
          k=4
6
           k=5
                  0.444
                           0.465
7
          k=6
                  0.410
                           0.447
                  0.422
                           0.437
8
          k=7
9
                  0.408
                           0.428
          k=8
10
          k=9
                  0.410
                           0.418
11
         k=10
                  0.384
                           0.413
```

```
best score:
                  0.583031835373
   best metric intern:
13
                           Silouette
14
   best k: 2
15
16
   --- Metricas Externas ---
17
            K
                 Homogen
                           v_meas adj_rand
                                              mutual
                 0.295
                          0.413
                                   0.365
                                            0.295
18
          k=2
                 0.387
19
          k=3
                          0.446
                                   0.465
                                            0.386
20
                 0.396
                                   0.467
                                            0.395
          k=4
                          0.451
21
                 0.457
                          0.462
                                   0.496
                                            0.456
          k=5
22
                 0.434
                          0.400
                                   0.352
                                            0.369
          k=6
23
                 0.456
                          0.411
                                   0.366
                                            0.372
          k=7
24
          k=8
                 0.509
                          0.442
                                   0.384
                                            0.389
25
          k=9
                 0.498
                          0.410
                                   0.317
                                            0.347
26
                 0.542
                          0.436
                                   0.341
                                            0.363
         k=10
27
   best score:
                  0.541596182352
28
   best metric extern:
                           Homogeneity
29
   best k:
              10
```

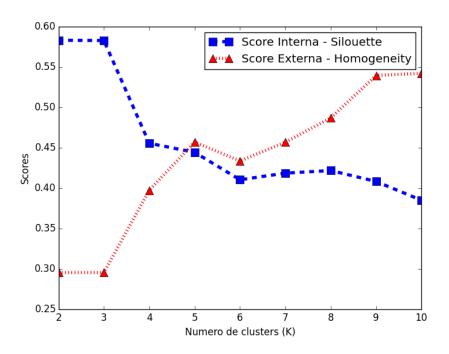


Figure 1: Figura dos scores interno e externo

3 Codigo fonte em python

Listing 1: Codigo em Python

```
#!/usr/bin/python
1
2
3 import sys, os, csv
4 \quad \mathtt{import} \quad \mathtt{pandas}
5 import numpy as np
6 import math
7 from sklearn.model_selection import StratifiedKFold
8 from sklearn.cluster import KMeans
9 from sklearn.decomposition import PCA
10 from sklearn import metrics
11 from sklearn.preprocessing import scale
12 import matplotlib.pyplot as plt
13
14 datFileName="cluster-data.csv"
15 labelsFileName="cluster-data-class.csv"
16 dirPath=os.path.dirname(os.path.realpath(__file__))
17 classList=[]
18 data=[]
19
20
  def load_data(fileName):
21
       raw_data = open(fileName, 'rb')
22
       #rawData = pandas.read_csv(raw_data, delimiter=" ")
23
       rawData = pandas.read_csv(raw_data, delimiter=",", skiprows=1)
24
       return rawData.values
25
26
  def getData(rawData):
27
       #print "\n--- Getting data from File ----"
28
       lineNum = rawData.shape[0]
29
       colNum = rawData.shape[1]
30
       data = np.array(rawData[0:lineNum, 0:colNum-1])
31
       for i in range(lineNum):
32
            classList.append(rawData[i][colNum - 1])
33
       return [data, np.array(classList) ]
34
35
   def get_labels(fileName):
36
       labelData = load_data(dirPath + "/" + fileName)
37
       labels = labelData[:,0].clip(min=0)
38
       return np.array(labels)
39
40
  def bench_k_means_inter(estimator, name, data):
41
42
       estimator.fit(data)
43
       best_score = 0.0
```

```
44
        best_metric = ''
45
        scores = [metrics.silhouette\_score(data, estimator.labels\_, \leftarrow)
           metric='euclidean', sample_size=5416),
                 \verb|metrics.calinski_harabaz_score(data, estimator.labels\_{\leftarrow}|
46
                     )/10000 ]
        print('% 9s
                      %.3f
                             %.3f'
47
              % (name, scores[0], scores[1]))
48
49
50
        if scores[0] > best_score:
51
            best_score = scores[0]
52
            best_metric = "Silouette"
53
54
        if scores[1] > best_score:
55
            best_score = scores[1]
56
            best_metric = "calinski"
57
58
       return [best_score, best_metric]
59
60
   def bench_k_means_ext(estimator, name, data, labels):
61
        estimator.fit(data)
62
        best_score = 0.0
63
        best_metric = ''
64
        scores = [metrics.homogeneity_score(labels, estimator.labels_),
65
                 metrics.v_measure_score(labels, estimator.labels_),
66
                 metrics.adjusted_rand_score(labels, estimator.labels_) ←
67
                 metrics.adjusted_mutual_info_score(labels,
                     labels_) ]
                              %.3f
        print('% 9s
                                     %.3f
                                             %.3f'
68
                       %.3f
69
              % (name, scores[0], scores[1], scores[2], scores[3]))
70
71
        if scores[0] > best_score:
72
            best_score = scores[0]
73
            best_metric = "Homogeneity"
74
75
        if scores[1] > best_score:
76
            best_score = scores[1]
77
            best_metric = "v_measure"
78
79
        if scores[2] > best_score:
80
            best_score = scores[2]
81
            best_metric = "adjusted_rand"
82
83
        if scores[3] > best_score:
84
            best_score = scores[3]
85
            best_metric = "adjusted_mutual"
86
87
       return [best_score, best_metric]
```

```
88
89
   def main(argv=None):
90
        if argv is None:
91
             arv = sys.argv
92
93
        data = load_data(datFileName)
94
        labels = get_labels(labelsFileName)
95
        data = scale(data)
96
97
        best_metric_int = ''
98
        best_metric_ext = ''
99
        range_n_clusters = [2, 3, 4, 5, 6, 7, 8, 9, 10]
100
        print("--- Metricas Internas ---")
101
102
        print('%9s %s %s' % ('K', 'Silhouette', 'Calinski'))
103
        best_score = 0.0
104
        best_metric = ''
105
        best_k = 0
106
        for n_clusters in range_n_clusters:
107
             new_name = "k=" + str(n_clusters)
             [last\_best\_score\ ,\ last\_best\_metric]\ =\ bench\_k\_means\_inter\ (\hookleftarrow
108
                KMeans(init=\frac{k-means++}{n}, n\_clusters=n\_clusters, n\_init \leftarrow
                =5), name=new_name, data=data)
109
             if last_best_score > best_score:
110
                 best_score = last_best_score
111
                 best_metric_int = last_best_metric
112
                 best_k = n_clusters
113
        print "best score: ", best_score
114
115
        print "best metric intern: ", best_metric_int
116
        print "best k:", best_k
117
118
        best_score=0.0
        print("")
119
120
        print("--- Metricas Externas ---")
                      %s %s %s %s' % ('K', 'Homogen', 'v_meas', '\leftarrow
121
        print('%9s
            adj_rand', 'mutual'))
122
        for n_clusters in range_n_clusters:
123
             new_name = "k=" + str(n_clusters)
             [last_best_score, last_best_metric] = bench_k_means_ext(←
124
                KMeans(init=\frac{k-means++}{n}, n_clusters=n_clusters, n_init\leftarrow
                =5), name=new_name, data=data, labels=labels)
125
             if last_best_score > best_score:
126
                 best_score = last_best_score
127
                 best_metric_ext = last_best_metric
128
                 best_k = n_clusters
129
130
        print "best score: ", best_score
```

```
131
        print "best metric extern: ", best_metric_ext
132
        print "best k: ", best_k
133
134
        final_score_int=[]
135
        final_score_ext=[]
136
137
        for n_clusters in range_n_clusters:
138
            kmeans = KMeans(init=\frac{k-means++}{n}, n_clusters=n_clusters, \leftarrow
                n_init=5)
139
            kmeans.fit(data)
140
            final_score_int.append( metrics.silhouette_score(data, <--</pre>
                kmeans.labels_, metric='euclidean', sample_size=5416))
            final_score_ext.append( metrics.homogeneity_score(labels, ~
141
                kmeans.labels_))
142
143
        legen_int = 'Score Interna - ' + str(best_metric_int)
144
        legen_ext = 'Score Externa - ' + str(best_metric_ext)
145
146
        plt.plot(range_n_clusters, final_score_int, 'bs--', linewidth←
           =4, markersize=10, label=legen_int)
147
        plt.plot(range_n_clusters, final_score_ext, 'r^:', linewidth=4, ←
             markersize=10, label=legen_ext)
        plt.xlabel('Numero de clusters (K)')
148
149
        plt.ylabel('Scores')
        plt.legend()
150
151
        plt.show()
152
153 if __name__ == "__main__":
154
        sys.exit(main())
```