DimensionReductionWithFAMD

May 4, 2023

```
[45]: #package prince https://github.com/MaxHalford/prince
      #FAMD Factor Analysis of Mixed Data
      #For mixture of categorical and numerical data
 [4]: #Importing the necessary package
      import math
      import pandas as pd
      import numpy as np
      from prince import FAMD#Dataset preparation with mixed numerical and categorical
       \rightarrow features
      df = pd.read_csv('SurveyAnswers.csv')
 [5]: df=df.set_index('CDR_name')
      df.drop(['commercial','opensource'],axis=1,inplace=True)
      df
               rest_api another_api gui api_n gui_n aql sql json_xml \
 [5]:
      CDR_name
      ehrbase
                                           4.00
                                                      0
                                                                         2
                      У
                                   У
                                       У
                                                          У
                                                              n
      better
                                           4.00
                                                                         2
                                                      3
                      У
                                                          У
                                                              n
                                   У
                                       У
      base24
                                           4.00
                                                                         2
                      У
                                   У
                                       У
                                                              n
                                                                         2
      cabo
                                           2.91
                                                      3
                                                          n
                                                              n
                      У
                                   У
                                       У
      arenaehr
                                           4.00
                                                      0
                                                          У
                                                                         2
                      У
                                   n
                                       У
                                                              n
                                           0.00
                                                      3
                                                                         0
      eweave
                    n
                                   n
                                       У
                                                          У
                                                              У
      ehrcare
                                           3.33
                                                      0
                                                                         1
                      У
                                   У
                                       n
                                                          У
                                                              n
      clever
                                           4.00
                                                      3
                                                                        0
                                                          n
                      У
                                   У
                                       У
                                                              У
                                                                         2
      ehrdb
                                           4.00
                                                      3
                                                          У
                      У
                                   У
                                       У
                                                              n
      rhp
                                           4.00
                                                      3
                                                                         0
                      У
                                                              У
                                   У
                                       У
                                           3.00
                                                      2
                                                                         0
      ehrn
                      У
                                   n
                                                          У
                                                              У
                flat_struct opt_wt openehrextr_fhir add_openehr add_others
      CDR_name
      ehrbase
                           2
                                   2
                                                      1
                                                                   1
                                                                                1
      better
                           2
                                   2
                                                      1
                                                                   2
                                                                                4
      base24
                           0
                                   1
                                                                                2
                                                      1
                                                                   1
      cabo
                           0
                                   1
                                                                   0
                                                                                0
                                   2
                                                      1
                                                                   2
                                                                                2
      arenaehr
```

```
0
                                                                               1
      ehrcare
                          1
                                   1
                                                                  1
      clever
                          1
                                   1
                                                     1
                                                                  2
                                                                               3
                          2
                                                                               3
      ehrdb
                                                                  1
      rhp
                          1
                                   1
                                                     0
                                                                  2
                                                                               4
      ehrn
                          1
                                   1
                                                     1
                                                                  0
                                                                               1
 [6]: famd = FAMD(n_components = 2, n_iter = 3, random_state = 101,engine="sklearn")
      famd=famd.fit(df)
      df_famd = famd.transform(df)
      df famd
                       0
 [6]:
                                  1
      CDR_name
      ehrbase -1.355253 -0.847850
      better
               -1.320558 0.241814
      base24
               -0.356374 0.962018
      cabo
               -0.102387 0.257373
      arenaehr -0.806795 -0.965018
      eweave
                3.262109 -0.663478
      ehrcare -0.209372 -1.446912
      clever
                0.249242 1.496386
      ehrdb
               -0.871460 0.025389
                0.553719 1.558004
      rhp
                0.957130 -0.617726
      ehrn
 [7]: famd.explained_inertia_ #variance explained
 [7]: array([0.34520031, 0.20760006])
 [8]: round(sum(famd.explained_inertia_)*100,1)
 [8]: 55.3
 [9]: famd.eigenvalues_
 [9]: array([0.14130948, 0.08498213])
[10]: import plotly.express as px
      fig=px.scatter(df_famd, x=0, y=1, color=df.index)
      fig.show()
[11]: famd = FAMD(n_components = 3, n_iter = 3, random_state = 101,engine="sklearn")
      famd = famd.fit(df)
      df_famd = famd.transform(df)
      df_famd
```

eweave

0

0

0

2

1

```
[11]:
                       0
                                 1
      CDR_name
      ehrbase -1.355253 -0.847850 -0.114822
      better
               -1.320558 0.241814 -0.978906
      base24
               -0.356374 0.962018 1.140254
      cabo
               -0.102387 0.257373 1.926911
      arenaehr -0.806795 -0.965018 -0.695325
      eweave
                3.262109 -0.663478 -0.296131
      ehrcare -0.209372 -1.446912 0.404369
      clever
               0.249242 1.496386 -0.398770
      ehrdb
               -0.871460 0.025389 -0.213718
                0.553719 1.558004 -0.740811
      rhp
      ehrn
                0.957130 -0.617726 -0.033051
[12]: famd.explained_inertia_ #variance explained
[12]: array([0.34520031, 0.20760006, 0.15088997])
[13]: round(sum(famd.explained_inertia_)*100,1)
[13]: 70.4
[14]: famd.eigenvalues_
[14]: array([0.14130948, 0.08498213, 0.06176757])
[15]:
      famd.row_coordinates(df)
[15]:
                       0
                                 1
                                           2
      CDR_name
      ehrbase -1.355253 -0.847850 -0.114822
      better
               -1.320558 0.241814 -0.978906
      base24
               -0.356374 0.962018 1.140254
      cabo
               -0.102387 0.257373 1.926911
      arenaehr -0.806795 -0.965018 -0.695325
      eweave
                3.262109 -0.663478 -0.296131
      ehrcare -0.209372 -1.446912 0.404369
      clever
               0.249242 1.496386 -0.398770
      ehrdb
               -0.871460 0.025389 -0.213718
                0.553719 1.558004 -0.740811
      rhp
      ehrn
                0.957130 -0.617726 -0.033051
[19]: %matplotlib notebook
      import matplotlib.pyplot as plt
      from mpl_toolkits.mplot3d import Axes3D
```

```
from matplotlib import interactive, pyplot
from mpl_toolkits.mplot3d import Axes3D
from numpy.random import rand
from pylab import figure
m=rand(3,3) # m is an array of (x,y,z) coordinate triplets
fig = figure()
ax = fig.add_subplot(projection='3d')
listofloc=[]
mycolors=['r','r','b','b','r','k','r','g','r','g','r']
mymarkers=['s','s','o','o','s','v','s','^','s','^','s']
nloc=[0]*len(df_famd)
for i in range(len(df_famd)): #plot each point + its index as text above
          ax.scatter(df_famd.iloc[i,0],df_famd.iloc[i,1],df_famd.
  →iloc[i,2],color=mycolors[i],marker=mymarkers[i])
         if [df_famd.iloc[i,0],df_famd.iloc[i,1],df_famd.iloc[i,2]] in listofloc:
                   nloc[listofloc.index([df_famd.iloc[i,0],df_famd.iloc[i,1],df_famd.
  \rightarrowiloc[i,2]])]+=1
                   pad=0.12*(nloc[listofloc.index([df_famd.iloc[i,0],df_famd.
  \rightarrowiloc[i,1],df_famd.iloc[i,2]])]-1)
         else:
                   listofloc.append([df_famd.iloc[i,0],df_famd.iloc[i,1],df_famd.iloc[i,2]])
                   nloc[listofloc.index([df_famd.iloc[i,0],df_famd.iloc[i,1],df_famd.
  \rightarrowiloc[i,2]])]=1
                   pad=0
         ax.text(df_famd.iloc[i,0],df_famd.iloc[i,1],df_famd.iloc[i,2]+pad, '%s' %_L' & '%s' %_L'
  →(df.index[i]), size=13, zorder=1,
         color=mycolors[i])
ax.set_xlabel(f'component 0 {round(famd.explained_inertia_[0]*100,1)}%',__
  →fontsize=14)
ax.set_ylabel(f'component 1 {round(famd.explained_inertia_[1]*100,1)}%',,,
  →fontsize=14)
ax.set_zlabel(f'component 2 {round(famd.explained_inertia_[2]*100,1)}%',__
  →fontsize=14)
plt.show()
```

<IPython.core.display.Javascript object>

```
[20]: import plotly.express as px
     labels = {
         str(i): f"Comp {i+1} ({var:.1f}%)"
         for i, var in enumerate(famd.explained_inertia_ * 100)
     mycolors=['red','red','blue','blue','red','black','red','green','red','green','red']
     #mycolors=[0,0,1,1,0,2,0,3,0,3,0]
     mymarkers=['circle','circle','square','square','circle','triangle-down','circle','triangle-up',
     #mymarkers=[' ',' ','','',' ','_',' ','-',' ','-',' ']
     mycolors=df_famd.index
     mysymbols=df_famd.index
     mycolor_discrete_map={'ehrbase':'red','better':'red','base24':'blue','cabo':
      'eweave':'black','ehrcare':'red','clever':'green','ehrdb':
      →'red','rhp':'green','ehrn':'red'}
     mysymbol_map={'ehrbase':'circle','better':'circle','base24':'square','cabo':
      'eweave':'triangle-down','ehrcare':'circle','clever':
      'rhp':'triangle-up','ehrn':'circle'}
     fig = px.scatter_matrix(
         df_famd,
         labels=labels,
         dimensions=range(3),
         color_discrete_map=mycolor_discrete_map,
         symbol_map=mysymbol_map,
         color=mycolors,
         symbol=mysymbols
     fig.update_traces(diagonal_visible=False)
     fig.show()
```