```
clustering_by_silhouette - implementation
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        Introduction
         import & define essential modules + variables
In [10]: from clustering_by_silhouette import silhouette_clustering
         import pandas as pd
         from create_3d_gif import pd_to_gif
         from sklearn.decomposition import PCA
         MPL_Colors=['blue', 'green', 'red', 'gold', 'purple', 'lime', 'tomato', 'navy', 'teal', 'maro
         on',
                     'olive', 'orange', 'sienna', 'indigo', 'yellow', 'darkgreen', 'darkblue', 'chocol
         ate',
                    'black']
         def pca(df, dim):
             return PCA(n_components=dim).fit(df.T).components_
         import data
In [11]: df1 = pd.read_excel('data_1.xlsx')
         df2 = pd.read_excel('data_2.xlsx')
         fields1 = ['a', 'b', 'c', 'd', 'e', 'f', 'g', 'h', 'i', 'j', 'k', 'l', 'm', 'n']
         fields2 = ['f' + str(i) for i in range(1, 15)] # fields names
        Analysis
         run silhouette_clustering for hdbscan & kmeans
In [19]: | m_label = silhouette_clustering(df1[fields1], typ='meanshift', org=9, lim=13) # MeanShift
         h_label = silhouette_clustering(df2[fields2], typ='hdbscan')
                                                                                   # HDBSCAN
         k_label = silhouette_clustering(df2[fields2], org=3 ,lim=10)
                                                                                   # Kmeans (defa
        ult)
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         cluster kind: meanshift,
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        cluster kind: meanshift, input value = 13, silhouette = 46.2%
         cluster kind: hdbscan, input value = 2, silhouette = 8.3%
         cluster kind: hdbscan,
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In [20]: | print(f'meanshift number of clusters: {len(set(m_label))}\nkmeans
         n(set(k_label))}\nhdbscan number of clusters: {len(set(h_label))-1}')
         meanshift number of clusters: 5
                  number of clusters: 5
         kmeans
                  number of clusters: 4
         hdbscan
         Plot Results
         Arrange Data
In [21]: | df1['x'], df1['y'], df1['z'] = pca(df1[fields1],3)
         df2['x'], df2['y'], df2['z'] = pca(df2[fields2],3)
         df1['m_color'] = [MPL_Colors[i] for i in m_label]
         df2['h_color'] = [MPL_Colors[i] for i in h_label]
         df2['k_color'] = [MPL_Colors[i] for i in k_label]
         Plot Data
In [23]:
        pd_to_gif(df1 ,['x','y','z'] ,'meanshift_plot',clrs='m_color')
         pd_to_gif(df2 ,['x','y','z'] ,'hdbscan_plot',clrs='h_color')
         pd_to_gif(df2 ,['x','y','z'] ,'kmeans_plot' ,clrs='k_color')
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GIF version for this graphs available in here