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8 import pandas as pd
9 import numpy as np
10 from sklearn.decomposition import PCA
11 from sklearn.preprocessing import StandardScaler
12 import seaborn as sns
13 from pandas import DataFrame
14 df=pd.read_csv('recipes_muffins_cupcakes_scones.csv')
15 features=df.keys()
16 features=features.drop('Type')
17 x=np.array(df.loc[:, 'Flour': 'Salt'])
18 y=np.array(df['Type'])
19 fig, ax=plt.subplots(nrows=1,ncols=2)
20 x=StandardScaler().fit_transform(x)
21 pca=PCA(n_components=2)
22 principalComponents=pca.fit_transform(x)
23 explained_variance=pca.explained_variance_ratio_
24 print(f'variance ratio: {explained_variance}')
25 for i in range(len(df)):
26     if i<=9:
27         ax[0].scatter(principalComponents[0:i,0],principalComponents[0:i,1],c='y')
28     elif i>9 and i<=19:
29         ax[0].scatter(principalComponents[10:i,0],principalComponents[10:i,1],c='g')
30     else:
31         ax[0].scatter(principalComponents[20:i,0],principalComponents[20:i,1],c='b')
32 ax[1].plot(np.cumsum(explained_variance))
33 plt.show()
34 df_comp=pd.DataFrame(pca.components_)
35 sns.heatmap(df_comp,cmap='plasma')
36 plt.show()
37 pca1=abs(df_comp.iloc[0])
38 pca2=abs(df_comp.iloc[1])
39 max1=pca1.idxmax()
40 min1=pca1.idxmin()
41 max2=pca2.idxmax()
42 min2=pca2.idxmin()
43 print(f'max var pca1: {features[max1]} min var pca1: {features[min1]}\nmax var pca2: {features[max2]} min var pca2: {features[min2]}')
44 cov_mat=np.cov(x.T)
45 sns.heatmap(cov_mat)
46 plt.show()

```





