q1 In [116]: import pandas as pd import numpy as np from matplotlib import pyplot as plt from sklearn.cluster import AgglomerativeClustering import scipy.cluster.hierarchy as sch #considering only 2 coloumns (age and reason) X = pd.read_excel('Absent.xls') X = dataset.iloc[:,[1,8]].values In [117]: #Single Linkage dendrogram = sch.dendrogram(sch.linkage(X, method='single')) In [123]: model = AgglomerativeClustering(n_clusters=5, affinity='euclidean', linkage='single') model.fit(X) labels = model.labels_ plt.scatter(X[labels==0, 0], X[labels==0, 1], s=50, marker='o', color='red') plt.scatter(X[labels==1, 0], X[labels==1, 1], s=50, marker='o', color='blue') plt.scatter(X[labels==2, 0], X[labels==2, 1], s=50, marker='o', color='green') plt.scatter(X[labels==3, 0], X[labels==3, 1], s=50, marker='o', color='purple') plt.scatter(X[labels==4, 0], X[labels==4, 1], s=50, marker='o', color='orange') plt.xlabel("Reason for Absence") plt.ylabel("Age") plt.show() 55 50 45 40 35 30 15 Reason for Absence In [119]: #Complete Linkage dendrogram = sch.dendrogram(sch.linkage(X, method='complete')) 40 -35 30 25 20 -15 10 In [124]: model = AgglomerativeClustering(n_clusters=5, affinity='euclidean', linkage='complete') model.fit(X) labels = model.labels_ plt.scatter(X[labels==0, 0], X[labels==0, 1], s=50, marker='o', color='red') plt.scatter(X[labels==1, 0], X[labels==1, 1], s=50, marker='o', color='blue') plt.scatter(X[labels==2, 0], X[labels==2, 1], s=50, marker='o', color='green') plt.scatter(X[labels==3, 0], X[labels==3, 1], s=50, marker='o', color='purple') plt.scatter(X[labels==4, 0], X[labels==4, 1], s=50, marker='o', color='orange') plt.xlabel("Reason for Absence") plt.ylabel("Age") plt.show() 55 50 45 40 35 30 15 Reason for Absence In [125]: #Average Linkage dendrogram = sch.dendrogram(sch.linkage(X, method='average')) 25 20 · 15 10 In [126]: model = AgglomerativeClustering(n_clusters=5, affinity='euclidean', linkage='average') model.fit(X) labels = model.labels_ plt.scatter(X[labels==0, 0], X[labels==0, 1], s=50, marker='o', color='red') plt.scatter(X[labels==1, 0], X[labels==1, 1], s=50, marker='o', color='blue') plt.scatter(X[labels==2, 0], X[labels==2, 1], s=50, marker='o', color='green') plt.scatter(X[labels==3, 0], X[labels==3, 1], s=50, marker='o', color='purple') plt.scatter(X[labels==4, 0], X[labels==4, 1], s=50, marker='o', color='orange') plt.xlabel("Reason for Absence") plt.ylabel("Age") plt.show() 55 50 45 40 35 30 15 20 25 Reason for Absence **q2** In [11]: #import libraries and read data import pandas as pd from mlxtend.frequent_patterns import apriori from mlxtend.frequent_patterns import association_rules df = pd.read_excel('Online Retail.xlsx') df.head() #cleaning data df['Description'] = df['Description'].str.strip() df.dropna(axis=0, subset=['InvoiceNo'], inplace=True) df['InvoiceNo'] = df['InvoiceNo'].astype('str') df = df[~df['InvoiceNo'].str.contains('C')] Out[11]: InvoiceNo StockCode InvoiceDate UnitPrice CustomerID Country **Description Quantity** WHITE HANGING HEART T-LIGHT 2010-12-01 United 536365 85123A 17850.0 HOLDER 08:26:00 2010-12-01 United 536365 71053 WHITE METAL LANTERN 3.39 17850.0 08:26:00 Kingdom CREAM CUPID HEARTS COAT 2010-12-01 United 536365 84406B 2.75 17850.0 08:26:00 KNITTED UNION FLAG HOT WATER 2010-12-01 United 536365 84029G 3.39 17850.0 Kingdom BOTTLE 08:26:00 RED WOOLLY HOTTIE WHITE 2010-12-01 United 17850.0 536365 84029E 3.39 HEART. 08:26:00 2011-12-09 12680.0 541904 581587 PACK OF 20 SPACEBOY NAPKINS 12 22613 0.85 France 12:50:00 2011-12-09 CHILDREN'S APRON DOLLY GIRL 541905 581587 22899 2.10 12680.0 France 12:50:00 2011-12-09 CHILDRENS CUTLERY DOLLY GIRL 541906 581587 23254 4.15 12680.0 France 12:50:00 CHILDRENS CUTLERY CIRCUS 2011-12-09 23255 541907 581587 4.15 12680.0 France PARADE 12:50:00 2011-12-09 581587 **BAKING SET 9 PIECE RETROSPOT** 12680.0 541908 22138 4.95 France 12:50:00 532621 rows × 8 columns In [16]: | #selecting one Australia to keep data set small basket = (df[df['Country'] =="Australi"] .groupby(['InvoiceNo', 'Description'])['Quantity'] .sum().unstack().reset_index().fillna(0) .set_index('InvoiceNo')) basket Out[16]: 3 TIER 3 TII 16 PIECE 12 12 PENCILS 12 PENCIL 3 HOOK CAKE CAI 10 3 STRIPEY **PENCILS** 20 DOLLY **CUTLERY** COLOUR **SMALL TALL TUBE HANGER** TIN Description SPACEBOY **TALL PEGS** SET MICE TUBE MAGIC RED GREEN RI TUBE PANTRY RETROSPOT **FELTCRAFT** PEN WOODLAND RETROSPOT GARDEN AND **POSY** DESIGN CREAM CRE! InvoiceNo 0.0 0.0 0.0 536389 0.0 0.0 0.0 0.0 0.0 0.0 537676 0.0 0.0 0.0 0.0 0.0 24.0 0.0 0.0 0.0 539419 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 540267 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 540280 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 540557 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 540700 0.0 0.0 0.0 0.0 0.0 12.0 0.0 0.0 0.0 541149 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 541271 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 541520 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 541657 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 542542 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 543357 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 543372 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 543376 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 543989 384.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 545065 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 545475 0.0 32.0 2(0.0 0.0 0.0 0.0 0.0 0.0 0.0 546135 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 547659 12.0 0.0 0.0 12.0 0.0 0.0 0.0 0.0 0.0 548661 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 549313 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 552956 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 553546 24.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 554037 0.0 0.0 0.0 0.0 28 0.0 0.0 0.0 0.0 0.0 554126 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 556917 48.0 240.0 0.0 0.0 0.0 0.0 120.0 0.0 0.0 556918 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 558536 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 558537 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 559919 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 559920 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 560033 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 560473 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 560491 0.0 0.0 0.0 0.0 1.0 0.0 561040 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 561228 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 563179 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 563614 0.0 0.0 0.0 0.0 0.0 0.0 0.08 0.0 0.0 565145 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 565146 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 565466 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 567085 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 568145 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 568687 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 568695 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 568708 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 569647 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 569650 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 569722 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 569723 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 574014 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 574138 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 574469 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 576394 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 576586 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 0.0 578459 0.0 0.0 0.0 0.0 0.0 0.0 0.0 57 rows × 608 columns In [18]: #encoding def encode_units(x): **if** x <= 0: return 0 **if** x >= 1: return 1 basket_sets = basket.applymap(encode_units) basket_sets.drop('POSTAGE', inplace=True, axis=1) basket_sets Out[18]: 3 TIER 3 TII 12 16 PIECE 12 PENCIL 12 PENCILS 3 HOOK CAKE CAI 10 20 DOLLY 3 STRIPEY **PENCILS CUTLERY COLOUR SMALL TALL TUBE HANGER** TIN Description TALL SET **PEGS** MICE SPACEBOY TUBE MAGIC **GREEN** RED RI TUBE PANTRY RETROSPOT **FELTCRAFT** PEN WOODLAND RETROSPOT **GARDEN** AND POSY DESIGN CREAM CREA InvoiceNo 0 536389 0 0 0 0 0 0 0 0 537676 0 0 0 0 0 1 0 0 0 539419 0 0 0 0 0 0 0 540267 0 0 0 0 0 0 0 0 0 540280 0 0 0 0 0 0 540557 0 0 0 0 0 0 0 0 0 540700 0 0 0 541149 0 0 0 0 0 0 0 0 0 541271 0 0 0 0 0 541520 0 0 0 0 0 0 0 0 0 541657 0 0 0 0 542542 0 0 0 0 0 0 0 0 0 543357 0 0 0 0 0 0 0 0 543372 0 0 0 0 0 0 0 0 0 543376 0 0 0 0 0 0 0 543989 0 0 0 0 0 0 1 0 0 0 545065 0 0 0 0 0 0 0 545475 0 0 0 0 0 0 0 1 546135 0 0 0 0 0 0 0 547659 0 0 0 0 0 1 1 0 0 548661 0 0 0 0 0 0 0 549313 0 0 0 0 0 0 0 0 0 552956 0 0 0 0 0 0 0 553546 0 0 0 0 0 0 1 0 0 554037 0 0 0 0 0 0 0 0 0 0 554126 0 0 0 0 0 0 556917 0 0 0 0 1 0 0 0 0 0 0 556918 0 0 0 558536 0 0 0 0 558537 0 0 0 0 0 0 0 0 0 559919 0 0 0 0 0 0 0 559920 0 0 0 0 0 0 0 0 0 560033 0 0 0 0 0 0 0 560473 0 0 0 0 0 0 0 0 0 560491 0 0 0 0 0 0 0 561040 0 0 0 0 0 0 0 0 0 561228 0 0 0 0 0 0 0 0 563179 0 0 0 0 0 0 0 0 0 563614 0 0 0 0 0 0 565145 0 0 0 0 0 0 0 0 0 565146 0 0 0 0 0 0 0 0 565466 0 0 0 0 0 0 0 0 0 567085 0 0 0 0 0 0 0 0 0 0 0 0 0 568145 0 0 0 0 0 568687 0 0 0 0 0 0 0 568695 0 0 0 0 0 0 0 0 0 568708 0 0 0 0 0 0 0 0 0 569647 0 0 0 0 0 0 0 569650 0 0 0 0 0 0 0 569722 0 0 0 0 0 0 0 0 0 569723 0 0 0 0 0 0 0 0 574014 0 0 0 0 0 0 0 0 0 574138 0 0 0 0 0 0 0 0 574469 0 0 0 0 0 0 0 0 0 576394 0 0 0 0 0 0 0 576586 0 0 0 0 0 0 0 0 0 578459 0 0 0 0 0 0 0 0 57 rows × 607 columns In [22]: #generate frequent itemsets and rules frequent_itemsets = apriori(basket_sets, min_support=0.07, use_colnames=True) rules = association_rules(frequent_itemsets, metric="lift", min_threshold=1) rules Out[22]: antecedent consequent consequents support confidence antecedents lift leverage conviction support support (RED (36 PENCILS TUBE RETROSPOT 0.070175 0.070175 0.070175 1.000000 14.250000 0.065251 inf RED RETROSPOT) CAKE STAND) (36 PENCILS (RED RETROSPOT **TUBE RED** 0.070175 0.070175 0.070175 1.000000 14.250000 0.065251 inf CAKE STAND) RETROSPOT) (SET OF 3 CAKE (36 PENCILS TUBE TINS PANTRY 0.157895 0.070175 0.070175 0.444444 6.333333 0.059095 1.673684 RED RETROSPOT) DESIGN) (36 PENCILS (SET OF 3 CAKE TINS 0.070175 0.157895 0.070175 1.000000 6.333333 0.059095 inf **TUBE RED** PANTRY DESIGN) RETROSPOT) (SET OF 6 (4 TRADITIONAL 4 SOLDIER 0.122807 0.087719 0.070175 0.571429 6.514286 0.059403 2.128655 SPINNING TOPS) SKITTLES) (DOLLY GIRL LUNCH (HOMEMADE JAM BOX, ROSES 795 SCENTED 0.087719 0.070175 0.070175 0.800000 11.400000 0.064020 4.649123 REGENCY TEACUP CANDLES) AN... (ROSES (DOLLY GIRL LUNCH REGENCY 796 BOX, HOMEMADE 0.140351 0.070175 0.070175 0.500000 7.125000 0.060326 1.859649 **TEACUP AND** JAM SCENTED CA... SAUCER) (REGENCY (DOLLY GIRL LUNCH BOX, HOMEMADE 0.105263 797 CAKESTAND 3 0.070175 0.070175 0.666667 9.500000 0.062789 2.789474 JAM SCENTED CA... TIER) (DOLLY GIRL LUNCH (CIRCUS PARADE 798 BOX, HOMEMADE 0.087719 0.070175 0.070175 0.800000 11.400000 0.064020 4.649123 LUNCH BOX) JAM SCENTED CA... (DOLLY GIRL LUNCH (SPACEBOY BOX, HOMEMADE 0.105263 0.070175 0.070175 0.666667 9.500000 0.062789 799 2.789474 LUNCH BOX) JAM SCENTED CA... 800 rows × 9 columns In [23]: #filtering the dataframe. large lift (6) and high confidence (.8) rules[(rules['lift'] >= 6) & (rules['confidence'] >= 0.8)] Out[23]: antecedent consequent antecedents consequents support confidence lift leverage conviction support support (RED RETROSPOT (36 PENCILS TUBE 0.070175 0.070175 0.070175 1.0 14.250000 0.065251 inf CAKE STAND) RED RETROSPOT) (36 PENCILS TUBE (RED RETROSPOT 0.070175 0.070175 0.070175 1.0 14.250000 0.065251 inf RED RETROSPOT) CAKE STAND)

(SET OF 3 CAKE

TINS PANTRY

DESIGN)
(SET OF 6

SOLDIER

SKITTLES)

(ALARM CLOCK

0.070175

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0.105263

0.157895 0.070175

0.122807 0.070175

0.105263 0.105263

1.0 6.333333 0.059095

0.8 6.514286 0.059403

1.0 9.500000 0.094183

inf

inf

4.385965

(36 PENCILS TUBE

RED RETROSPOT)

(4 TRADITIONAL

SPINNING TOPS)

(ALARM CLOCK

BAKELIKE RED) BAKELIKE GREEN)

LAB 4