Market Basket Analysis

May 17, 2023

```
[6]: import pandas as pd
      import numpy as np
     df=pd.read_csv('supermarket.csv')
      df.head(10)
 [8]:
 [8]:
                      MILK, BREAD, BISCUIT
      0
          BREAD, MILK, BISCUIT, CORNFLAKES
      1
                     BREAD, TEA, BOURNVITA
      2
                    JAM, MAGGI, BREAD, MILK
      3
                       MAGGI, TEA, BISCUIT
      4
                     BREAD, TEA, BOURNVITA
      5
                    MAGGI, TEA, CORNFLAKES
      6
                 MAGGI, BREAD, TEA, BISCUIT
      7
                     JAM, MAGGI, BREAD, TEA
      8
                               BREAD, MILK
         COFFEE, COCK, BISCUIT, CORNFLAKES
[15]: from mlxtend.preprocessing import TransactionEncoder
      from mlxtend.frequent_patterns import apriori,association_rules
     df1=df["MILK,BREAD,BISCUIT"].apply(lambda t: t.split(","))
[10]:
[11]:
     df1
[11]: 0
              [BREAD, MILK, BISCUIT, CORNFLAKES]
      1
                         [BREAD, TEA, BOURNVITA]
      2
                       [JAM, MAGGI, BREAD, MILK]
                            [MAGGI, TEA, BISCUIT]
      3
      4
                          [BREAD, TEA, BOURNVITA]
                        [MAGGI, TEA, CORNFLAKES]
      5
      6
                    [MAGGI, BREAD, TEA, BISCUIT]
      7
                        [JAM, MAGGI, BREAD, TEA]
      8
                                    [BREAD, MILK]
      9
             [COFFEE, COCK, BISCUIT, CORNFLAKES]
      10
             [COFFEE, COCK, BISCUIT, CORNFLAKES]
      11
                      [COFFEE, SUGER, BOURNVITA]
```

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12
                          [BREAD, COFFEE, COCK]
                        [BREAD, SUGER, BISCUIT]
      13
                    [COFFEE, SUGER, CORNFLAKES]
      14
                      [BREAD, SUGER, BOURNVITA]
      15
      16
                         [BREAD, COFFEE, SUGER]
                         [BREAD, COFFEE, SUGER]
      17
      18
                [TEA, MILK, COFFEE, CORNFLAKES]
      Name: MILK, BREAD, BISCUIT, dtype: object
[12]: df1=list(df1)
      df1
[12]: [['BREAD', 'MILK', 'BISCUIT', 'CORNFLAKES'],
       ['BREAD', 'TEA', 'BOURNVITA'],
       ['JAM', 'MAGGI', 'BREAD', 'MILK'],
       ['MAGGI', 'TEA', 'BISCUIT'],
       ['BREAD', 'TEA', 'BOURNVITA'],
       ['MAGGI', 'TEA', 'CORNFLAKES'],
       ['MAGGI', 'BREAD', 'TEA', 'BISCUIT'],
       ['JAM', 'MAGGI', 'BREAD', 'TEA'],
       ['BREAD', 'MILK'],
       ['COFFEE', 'COCK', 'BISCUIT', 'CORNFLAKES'],
       ['COFFEE', 'COCK', 'BISCUIT', 'CORNFLAKES'],
       ['COFFEE', 'SUGER', 'BOURNVITA'],
       ['BREAD', 'COFFEE', 'COCK'],
       ['BREAD', 'SUGER', 'BISCUIT'],
       ['COFFEE', 'SUGER', 'CORNFLAKES'],
       ['BREAD', 'SUGER', 'BOURNVITA'],
       ['BREAD', 'COFFEE', 'SUGER'],
       ['BREAD', 'COFFEE', 'SUGER'],
       ['TEA', 'MILK', 'COFFEE', 'CORNFLAKES']]
[16]: te=TransactionEncoder()
[17]: df2=te.fit(df1).transform(df1)
[22]: fte=pd.DataFrame(df2,columns=te.columns_)
[23]:
     fte
[23]:
                                      COCK
                                            COFFEE CORNFLAKES
                                                                  JAM MAGGI
          BISCUIT
                  BOURNVITA BREAD
                                                                               MILK \
      0
             True
                       False
                               True False
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                       True
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      10
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      14
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                       False False False
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                                                           True False False
                                                                                True
          SUGER
                   TEA
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      14
           True False
      15
           True False
      16
           True
                False
      17
           True
                False
      18
         False
                  True
[66]: freq=apriori(fte,min_support=0.1,use_colnames=True)
[67]: freq
           support
                                                itemsets
      0
          0.315789
                                               (BISCUIT)
      1
          0.210526
                                             (BOURNVITA)
      2
          0.631579
                                                 (BREAD)
      3
          0.157895
                                                  (COCK)
          0.421053
                                                (COFFEE)
      4
          0.315789
      5
                                            (CORNFLAKES)
```

(JAM)

[67]:

6

0.105263

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8
          0.210526
                                                    (MILK)
      9
          0.315789
                                                   (SUGER)
      10
          0.368421
                                                     (TEA)
          0.157895
                                         (BREAD, BISCUIT)
      11
                                          (COCK, BISCUIT)
      12
          0.105263
      13
          0.105263
                                        (COFFEE, BISCUIT)
      14
                                    (CORNFLAKES, BISCUIT)
          0.157895
                                         (MAGGI, BISCUIT)
      15
          0.105263
          0.105263
                                           (TEA, BISCUIT)
      16
          0.157895
                                       (BREAD, BOURNVITA)
      17
                                       (SUGER, BOURNVITA)
      18
          0.105263
      19
          0.105263
                                         (TEA, BOURNVITA)
      20
          0.157895
                                          (BREAD, COFFEE)
                                             (BREAD, JAM)
      21
          0.105263
          0.157895
                                           (MAGGI, BREAD)
      22
                                            (BREAD, MILK)
      23
          0.157895
                                           (SUGER, BREAD)
      24
          0.210526
                                             (TEA, BREAD)
      25
          0.210526
                                           (COFFEE, COCK)
      26
          0.157895
                                       (CORNFLAKES, COCK)
      27
          0.105263
                                     (CORNFLAKES, COFFEE)
          0.210526
      28
      29
          0.210526
                                          (SUGER, COFFEE)
                                       (CORNFLAKES, MILK)
      30
          0.105263
                                        (CORNFLAKES, TEA)
      31
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      32
          0.105263
                                             (MAGGI, JAM)
                                             (MAGGI, TEA)
      33
          0.210526
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                                  (COFFEE, COCK, BISCUIT)
      34
                             (CORNFLAKES, COCK, BISCUIT)
      35
          0.105263
                           (CORNFLAKES, COFFEE, BISCUIT)
      36
          0.105263
                                    (MAGGI, TEA, BISCUIT)
      37
          0.105263
                                  (TEA, BREAD, BOURNVITA)
      38
          0.105263
          0.105263
                                   (SUGER, BREAD, COFFEE)
      39
                                      (MAGGI, BREAD, JAM)
      40
          0.105263
      41
          0.105263
                                      (MAGGI, TEA, BREAD)
      42
         0.105263
                               (CORNFLAKES, COFFEE, COCK)
                     (CORNFLAKES, COFFEE, COCK, BISCUIT)
         0.105263
     asr=association_rules(freq,metric="confidence",min_threshold=0.3)
[69]:
      asr
[69]:
                antecedents
                                                 consequents
                                                               antecedent support
      0
                   (BISCUIT)
                                                      (BREAD)
                                                                          0.315789
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                      (COCK)
                                                    (BISCUIT)
                                                                          0.157895
      2
                   (BISCUIT)
                                                       (COCK)
                                                                          0.315789
      3
                   (BISCUIT)
                                                     (COFFEE)
                                                                          0.315789
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(MAGGI)

0.263158

7

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                                          (CORNFLAKES, COCK)
      87
          (COFFEE, BISCUIT)
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            (COCK, BISCUIT)
                                        (CORNFLAKES, COFFEE)
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      89
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                                     (COCK, COFFEE, BISCUIT)
                                                                          0.315789
      90
                              (CORNFLAKES, COFFEE, BISCUIT)
                      (COCK)
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      91
                   (BISCUIT)
                                  (COCK, CORNFLAKES, COFFEE)
                                                                          0.315789
          consequent support
                                support
                                          confidence
                                                           lift leverage conviction \
      0
                     0.631579
                               0.157895
                                            0.500000
                                                      0.791667 -0.041551
                                                                              0.736842
      1
                     0.315789
                               0.105263
                                            0.666667
                                                      2.111111 0.055402
                                                                              2.052632
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                     0.157895
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                                            0.333333 2.111111
                                                                0.055402
                                                                              1.263158
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                                            0.333333 0.791667 -0.027701
                                                                              0.868421
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                                            0.500000 1.583333
                     0.315789
                                                                0.058172
                                                                              1.368421
      87
                     0.105263
                                            1.000000 9.500000
                                                                0.094183
                               0.105263
                                                                                   inf
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                                            1.000000 4.750000
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                     0.210526
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          zhangs metric
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      88
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      89
               1.000000
      90
               1.000000
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               1.000000
      [92 rows x 10 columns]
[70]: asr=association rules(freq,metric="lift",min threshold=0.3)
[71]:
      asr
[71]:
               antecedents
                                                consequents
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                    (BREAD)
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(BISCUIT)

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4

(CORNFLAKES)

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(COCK, BISCUIT)
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109
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        (CORNFLAKES)
                             (COCK, COFFEE, BISCUIT)
                                                                  0.315789
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111
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                                                                  0.421053
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112
               (COCK)
                                                                  0.157895
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                          (COCK, CORNFLAKES, COFFEE)
                                                                  0.315789
                                                     lift leverage conviction \
     consequent support
                           support
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                                       0.250000 0.791667 -0.041551
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                          0.157895
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                                       0.666667
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3
                                       0.333333
                                                 2.111111 0.055402
               0.157895
                          0.105263
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               0.315789
                          0.105263
                                       0.250000 0.791667 -0.027701
                                                                        0.912281
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                                                                        2.684211
113
               0.105263
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                                                3.166667
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                                                                        1.342105
     zhangs_metric
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1
         -0.277778
2
          0.625000
3
          0.769231
4
         -0.312500
. .
          0.882353
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110
          1.000000
111
          1.000000
112
          1.000000
113
          1.000000
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[114 rows x 10 columns]

[]: