Assignment 6

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Apriori Algorithm

```
In [1]: import numpy as np
         import pandas as pd
         from mlxtend.frequent_patterns import apriori, association_rules
In [2]: low_memory = False
In [3]: |data = pd.read_excel('./Online Retail.xlsx')
Out[3]:
                  InvoiceNo StockCode
                                                Description Quantity InvoiceDate UnitPrice CustomerID
                                                                                                      Country
                                            WHITE HANGING
                                                                      2010-12-01
                                                                                                       United
               0
                               85123A
                                             HEART T-LIGHT
                    536365
                                                                                     2.55
                                                                                             17850.0
                                                                        08:26:00
                                                                                                      Kingdom
                                                  HOLDER
                                              WHITE METAL
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                    536365
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                                        HOT WATER BOTTLE
                                                                                                      Kingdom
                                                                        08:26:00
                                       RED WOOLLY HOTTIE
                                                                      2010-12-01
                                                                                                        United
               4
                    536365
                               84029E
                                                                  6
                                                                                     3.39
                                                                                             17850.0
                                              WHITE HEART.
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                                                PACK OF 20
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          541904
                    581587
                                22613
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                                                                                     0.85
                                                                                             12680.0
                                                                                                       France
                                        SPACEBOY NAPKINS
                                                                        12:50:00
                                         CHILDREN'S APRON
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                                                                                                       France
                                            CIRCUS PARADE
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                                        BAKING SET 9 PIECE
                                                                      2011-12-09
          541908
                    581587
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                                                                                             12680.0
                                                                  3
                                                                                     4.95
                                                                                                       France
                                               RETROSPOT
                                                                        12:50:00
         541909 rows x 8 columns
In [4]: data.columns
Out[4]: Index(['InvoiceNo', 'StockCode', 'Description', 'Quantity', 'InvoiceDate',
                  'UnitPrice', 'CustomerID', 'Country'],
                dtype='object')
In [5]: data.Country.unique()
Out[5]: array(['United Kingdom', 'France', 'Australia', 'Netherlands', 'Germany',
                  'Norway', 'EIRE', 'Switzerland', 'Spain', 'Poland', 'Portugal',
                  'Italy', 'Belgium', 'Lithuania', 'Japan', 'Iceland',
                  'Channel Islands', 'Denmark', 'Cyprus', 'Sweden', 'Austria',
                  'Israel', 'Finland', 'Bahrain', 'Greece', 'Hong Kong', 'Singapore',
                  'Lebanon', 'United Arab Emirates', 'Saudi Arabia',
                  'Czech Republic', 'Canada', 'Unspecified', 'Brazil', 'USA',
                  'European Community', 'Malta', 'RSA'], dtype=object)
```

Clean The Dataset

```
In [6]: data['Description'] = data['Description'].str.strip()
         data.dropna(axis = 0, subset = ['InvoiceNo'], inplace = True)
In [7]:
          data['InvoiceNo'] = data['InvoiceNo'].astype('str')
In [8]: | data
Out[8]:
                   InvoiceNo StockCode
                                                   Description Quantity
                                                                        InvoiceDate UnitPrice CustomerID
                                                                                                           Country
                                              WHITE HANGING
                                                                         2010-12-01
                                                                                                             United
                                               HEART T-LIGHT
                0
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                                                                                         3.39
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                                                CREAM CUPID
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                                           HOT WATER BOTTLE
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                                           SPACEBOY NAPKINS
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                                           CHILDREN'S APRON
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                                                                                                   12680.0
                                                                                                             France
                                                  DOLLY GIRL
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                                         CHILDRENS CUTLERY
                                                                          2011-12-09
           541906
                     581587
                                  23254
                                                                                                   12680.0
                                                                                         4.15
                                                                                                             France
                                                  DOLLY GIRL
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                                         CHILDRENS CUTLERY
                                                                          2011-12-09
           541907
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                                                                                                             France
                                              CIRCUS PARADE
                                                                            12:50:00
                                          BAKING SET 9 PIECE
                                                                          2011-12-09
           541908
                     581587
                                  22138
                                                                                         4.95
                                                                                                   12680.0
                                                                                                             France
                                                  RETROSPOT
                                                                            12:50:00
          541909 rows × 8 columns
         data = data[~data['InvoiceNo'].str.contains('C')]
```

Split the data according to the region of transaction

```
basket_france = (data[data['Country'] = "France"].groupby(['InvoiceNo', "Description"])['Q
In [10]:
In [11]:
         basket_israel = (data[data['Country'] = "Israel"].groupby(['InvoiceNo', 'Description'])[
        basket_portugal = (data[data['Country'] = "Portugal"].groupby(['InvoiceNo',"Description"]
In [12]:
         basket_sweden = (data[data['Country'] = "Sweden"].groupby(['InvoiceNo', "Description"])['Q
         Hot Encoding the data set to provide to the apriori algorithm to have better results
In [14]:
         def hot_encode(target):
             if int(target) ≤ 0:
                 return 0
             if int(target) > 0:
                 return 1
```

```
In [15]: basket_france = basket_france.applymap(hot_encode)
In [16]: basket_israel = basket_israel.applymap(hot_encode)
In [17]: basket_portugal = basket_portugal.applymap(hot_encode)
In [18]: basket_sweden = basket_sweden.applymap(hot_encode)
```

Building the models and analysing the results

```
In [19]: fre_items = apriori(basket_france, min_support = 0.05, use_colnames = True)
          rules = association_rules(fre_items, metric = "lift", min_threshold = 1)
          rules = rules.sort_values(['confidence','lift'], ascending = [False,False])
          print(rules)
                                                         antecedents \
          199
                                       (JUMBO BAG WOODLAND ANIMALS)
          468
                           (InvoiceNo, JUMBO BAG WOODLAND ANIMALS)
          471
                                       (JUMBO BAG WOODLAND ANIMALS)
                (RED TOADSTOOL LED NIGHT LIGHT, PLASTERS IN TI...
          952
                (PLASTERS IN TIN WOODLAND ANIMALS, RED TOADSTO...
          962
                                                          (InvoiceNo)
          709
          842
                                                         (InvoiceNo)
          1090
                                                         (InvoiceNo)
          1119
                                                          (InvoiceNo)
          1203
                                                          (InvoiceNo)
                                                         consequents antecedent support \
          199
                                                           (POSTAGE)
                                                                                  0.076531
                                                            (POSTAGE)
          468
                                                                                  0.076531
          471
                                                (POSTAGE, InvoiceNo)
                                                                                  0.076531
          952
                                                           (POSTAGE)
                                                                                  0.051020
                                                            (POSTAGE)
          962
                                                                                  0.053571
          . . .
          709
                                   (RED HARMONICA IN BOX, POSTAGE)
                                                                                  1.000000
          842
                (ROUND SNACK BOXES SET OF4 WOODLAND, RED RETRO...
                                                                                  1.000000
                                                                                  1.000000
          1090
                (POSTAGE, LUNCH BAG SPACEBOY DESIGN, LUNCH BAG...
          1119
                (LUNCH BAG RED RETROSPOT, POSTAGE, LUNCH BAG W...
                                                                                  1.000000
          1203
                (POSTAGE, RED TOADSTOOL LED NIGHT LIGHT, PLAST...
                                                                                  1.000000
                                     support confidence
                consequent support
                                                                  lift leverage conviction
          199
                          0.765306 0.076531 1.00000 1.306667 0.017961
                                                                                          inf
                           0.765306 0.076531
          468
                                                  1.00000 1.306667 0.017961
                                                                                          inf
          471
                           0.765306 0.076531 1.00000 1.306667 0.017961
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                          0.765306 0.051020 1.00000 1.306667 0.011974
          952
                                                                                          inf
          962
                          0.765306 0.053571 1.00000 1.306667 0.012573
                                                                                          inf
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0.051020 0.051020 0.05102 1.000000 0.000000
0.05102 1.000000 0.000000
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          709
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          842
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      0.051020
      0.051020
      0.05102
      1.000000
      0.000000

      0.051020
      0.05102
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      0.000000

          1090
                                                                                          1.0
          1119
                                                                                          1.0
          1203
                           0.051020 0.051020
                                                    0.05102 1.000000 0.000000
                                                                                           1.0
          [1434 rows x 9 columns]
 In [*]: fre_items = apriori(basket_israel, min_support = 0.05, use_colnames = True)
          rules = association_rules(fre_items, metric = "lift", min_threshold = 1)
          rules = rules.sort_values(['confidence','lift'], ascending = [False,False])
          print(rules)
 In [*]: fre_items = apriori(basket_portugal , min_support = 0.05, use_colnames = True)
          rules = association_rules(fre_items, metric = "lift", min_threshold = 1)
          rules = rules.sort_values(['confidence','lift'], ascending = [False,False])
          print(rules)
```

```
In [*]: fre_items = apriori(basket_sweden , min_support = 0.05, use_colnames = True)
        rules = association_rules(fre_items, metric = "lift", min_threshold = 1)
        rules = rules.sort_values(['confidence','lift'], ascending = [False,False])
        print(rules)
```

```
In [*]: ### As you can see, there seems to be some hardware limitation of my syustem...
        ### But this is how the output would look like for the rest of the countries
```