Ex 1: Store data

Cho dữ liệu store data trong tập tin store_data.

Yêu cầu: Áp dụng thuật toán ECLAT để tính toán mức độ kết hợp giữa các item

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    Chuẩn hóa dữ liệu
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- 2. Áp dụng ECLAT, Tìm kết quả
- 3. Cho biết 10 nhóm có độ kết hợp cao nhất
- 4. Tìm kiếm thông tin từ kết quả: trong thông tin kết quả có 'milk' không? Nếu có thì 'milk' kết hợp với item nào?"

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In [1]: # from google.colab import drive
        # drive.mount("/content/gdrive", force_remount=True)
In [2]: # %cd '/content/gdrive/My Drive/LDS6_MachineLearning/practice_2023/Chapter12_ECLAT/'
In [3]: import sys
        from collections import defaultdict
        import random
In [4]: import pandas as pd
        from mlxtend.preprocessing import TransactionEncoder
        from mlxtend.frequent_patterns import apriori
In [5]: # source code from: http://codegist.net/snippet/python/eclatpy_evertheylen_python
        def tidlists(transactions):
            tl = defaultdict(set)
            for tid, t in enumerate(transactions):
                for item in t:
                    tl[item].add(tid)
            return list(tl.items())
        class IntersectAll:
            def __and__(self, other):
                return other
        IntersectAll = IntersectAll()
In [6]: def eclat(items, minsup=0, minlen=1):
            frequent_itemsets = {(): IntersectAll}
            def recurse(items, prefix):
                while len(items) > 0:
                     item, item_tidlist = items.pop()
                     1 = prefix + (item,) # L is the (ordered) tuple of items we are looking for
                     new_tidlist = frequent_itemsets[prefix] & item_tidlist
                     if len(new_tidlist) >= minsup: # add frequent_itemsets to the new frequent_itemsets
                         frequent_itemsets[1] = new_tidlist
                     # define the new L-conditional database
                     new_items = []
                     for new_item, _item_tidlist in items:
                         new_item_tidlist = _item_tidlist & item_tidlist
                         if len(new_item_tidlist) >= minsup:
                             new_items.append((new_item, new_item_tidlist))
                     # recurse, with L as prefix
                     recurse(new_items, 1)
            recurse(items.copy(), ())
            return {k: len(v) for k, v in frequent_itemsets.items() if len(k) >= minlen}
In [7]: # Load dữ Liệu
        store_data = pd.read_csv('store_data.csv', header= None)
In [8]: # store_data.info()
        store_data.head()
In [9]:
Out[9]:
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             water
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In [10]: records = []
         for i in range(0, store_data.shape[0]):
             records.append([str(store_data.values[i,j])
                             for j in range(0, store_data.shape[1])])
In [11]: records[0]
Out[11]: ['shrimp',
           'almonds',
           'avocado',
           'vegetables mix',
           'green grapes',
           'whole weat flour',
           'yams',
           'cottage cheese',
           'energy drink',
           'tomato juice',
           'low fat yogurt',
           'green tea',
           'honey',
           'salad',
           'mineral water',
           'salmon',
           'antioxydant juice',
           'frozen smoothie',
           'spinach',
           'olive oil']
In [12]: tl = tidlists(records)
         t1[0][0]
Out[12]: 'shrimp'
In [13]: len(tl)
Out[13]: 121
In [14]: for i in range(len(tl)-1):
             if tl[i][0] == 'nan':
                 print(i)
                 del tl[i]
         23
In [15]: result = eclat(tl, minsup=60, minlen=3)
In [16]: # get 10 first elements
         list(result.items())[:10]
Out[16]: [(('ground beef', 'chocolate', 'spaghetti'), 69),
          (('ground beef', 'chocolate', 'mineral water'), 82),
           (('ground beef', 'spaghetti', 'frozen vegetables'), 65),
           (('ground beef', 'spaghetti', 'milk'), 73),
           (('ground beef', 'spaghetti', 'eggs'), 67),
          (('ground beef', 'spaghetti', 'mineral water'), 128),
           (('ground beef', 'frozen vegetables', 'mineral water'), 69),
           (('ground beef', 'milk', 'mineral water'), 83),
           (('ground beef', 'eggs', 'mineral water'), 76),
           (('pancakes', 'chocolate', 'mineral water'), 70)]
In [17]: type(result)
Out[17]: dict
         sorted_d = sorted((value, key) for (key, value) in result.items())
          sorted_d[:10]
Out[18]: [(60, ('chocolate', 'frozen vegetables', 'milk')),
           (60, ('chocolate', 'spaghetti', 'french fries')),
           (60, ('spaghetti', 'french fries', 'eggs')),
           (62, ('chocolate', 'olive oil', 'mineral water')),
           (62, ('french fries', 'milk', 'mineral water')),
           (62, ('spaghetti', 'frozen vegetables', 'milk')),
           (62, ('spaghetti', 'mineral water', 'green tea')),
           (63, ('chocolate', 'french fries', 'eggs')),
           (64, ('chocolate', 'french fries', 'mineral water')),
           (64, ('milk', 'olive oil', 'mineral water'))]
In [19]: sorted_d[len(sorted_d)-10:]
Out[19]: [(83, ('ground beef', 'milk', 'mineral water')),
           (86, ('pancakes', 'spaghetti', 'mineral water')),
           (90, ('spaghetti', 'frozen vegetables', 'mineral water')),
           (98, ('milk', 'eggs', 'mineral water')),
           (101, ('chocolate', 'eggs', 'mineral water')),
           (105, ('chocolate', 'milk', 'mineral water')),
           (107, ('spaghetti', 'eggs', 'mineral water')),
           (118, ('spaghetti', 'milk', 'mineral water')),
           (119, ('chocolate', 'spaghetti', 'mineral water')),
           (128, ('ground beef', 'spaghetti', 'mineral water'))]
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In [20]: # Truc quan hoa ket qua theo result vua tim ra ???
In [21]: # "Có Milk không? nó kết hợp với item nào?"
         for k, v in result.items():
             if "milk" in k:
                 print(k, ":", v)
         ('ground beef', 'spaghetti', 'milk') : 73
          ('ground beef', 'milk', 'mineral water') : 83
          ('chocolate', 'spaghetti', 'milk') : 82
          ('chocolate', 'frozen vegetables', 'milk') : 60
          ('chocolate', 'milk', 'eggs') : 69
          ('chocolate', 'milk', 'mineral water') : 105
          ('spaghetti', 'frozen vegetables', 'milk') : 62
          ('spaghetti', 'milk', 'eggs') : 67
          ('spaghetti', 'milk', 'mineral water') : 118
          ('frozen vegetables', 'milk', 'mineral water') : 83
          ('soup', 'milk', 'mineral water') : 64
          ('french fries', 'milk', 'mineral water') : 62
          ('milk', 'eggs', 'mineral water') : 98
         ('milk', 'olive oil', 'mineral water') : 64
In [22]: # 10 san pham ma cua hang ban nhieu nhat/it nhat (theo tl) ???
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