trends

May 3, 2024

```
[2]: import pandas as pd
     import numpy as np
[3]: tr = pd.read_csv("purchased_entries_clean.csv")
     print(tr.shape)
     print(tr.info())
    (4614853, 6)
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 4614853 entries, 0 to 4614852
    Data columns (total 6 columns):
         Column
                        Dtype
         _____
     0
         event time
                        object
     1
         event_type
                        object
                        float64
         category_id
         category_code
                        object
         brand
                        object
     5
         price
                        float64
    dtypes: float64(2), object(4)
    memory usage: 211.3+ MB
    None
[4]: tr
[4]:
                             event_time event_type
                                                     category_id \
              2019-10-01 00:02:14+00:00
                                          purchase 2.053014e+18
     0
     1
              2019-10-01 00:04:37+00:00
                                          purchase
                                                    2.053014e+18
     2
              2019-10-01 00:07:07+00:00
                                          purchase
                                                    2.053014e+18
     3
              2019-10-01 00:09:26+00:00
                                          purchase
                                                    2.053014e+18
     4
              2019-10-01 00:09:54+00:00
                                          purchase
                                                    2.053014e+18
     4614848 2020-03-19 08:54:20+00:00
                                          purchase 2.232732e+18
     4614849
              2020-03-19 08:54:21+00:00
                                          purchase
                                                    2.232732e+18
     4614850 2020-03-19 08:54:21+00:00
                                          purchase
                                                    2.232732e+18
     4614851 2020-03-19 08:54:21+00:00
                                          purchase
                                                    2.232732e+18
     4614852
                               2020-03-
                                               NaN
                                                              NaN
```

```
category_code
                                                brand
                                                        price
     0
                     electronics.smartphone
                                              samsung
                                                       130.76
     1
                     electronics.smartphone
                                                apple
                                                       642.69
     2
                 furniture.bathroom.toilet
                                              santeri
                                                        54.42
     3
                                                       189.91
               electronics.audio.headphone
                                                apple
     4
                                                       161.98
               electronics.audio.headphone
                                                apple
     4614848
                   construction.tools.light
                                                apple
                                                       962.02
     4614849
                   construction.tools.light
                                                       169.46
                                              samsung
              appliances.personal.massager
     4614850
                                                   lg
                                                       448.40
     4614851
                   construction.tools.light
                                              samsung
                                                       144.70
     4614852
                                         NaN
                                                  NaN
                                                          NaN
     [4614853 rows x 6 columns]
[5]: tr[tr.duplicated(subset = 'event_time')]
[5]:
                              event_time event_type
                                                       category_id \
     22
                                            purchase
              2019-10-01 02:23:05+00:00
                                                      2.053014e+18
     34
              2019-10-01 02:26:05+00:00
                                            purchase
                                                      2.053014e+18
     59
              2019-10-01 02:31:46+00:00
                                            purchase
                                                      2.053014e+18
     67
              2019-10-01 02:33:01+00:00
                                            purchase
                                                      2.053014e+18
     76
              2019-10-01 02:34:23+00:00
                                            purchase
                                                      2.053014e+18
     4614840
              2020-03-19 08:53:59+00:00
                                                      2.053014e+18
                                            purchase
     4614843
              2020-03-19 08:54:04+00:00
                                            purchase
                                                      2.232732e+18
     4614846
              2020-03-19 08:54:17+00:00
                                            purchase
                                                      2.232732e+18
     4614850
              2020-03-19 08:54:21+00:00
                                            purchase
                                                      2.232732e+18
     4614851
              2020-03-19 08:54:21+00:00
                                            purchase
                                                      2.232732e+18
                              category_code
                                                brand
                                                        price
     22
               electronics.audio.headphone
                                                  jbl
                                                        20.57
     34
                     electronics.smartphone
                                              samsung
                                                       197.43
     59
                     electronics.smartphone
                                              samsung
                                                       286.86
     67
                         electronics.tablet
                                                wacom
                                                        78.51
     76
                 appliances.kitchen.washer
                                                   lg
                                                       308.65
     4614840
               electronics.audio.headphone
                                                       463.31
                                                 asus
     4614843
                              sport.bicycle
                                               xiaomi
                                                        24.97
     4614846
                      furniture.bedroom.bed
                                                       282.89
                                                   sv
     4614850
              appliances.personal.massager
                                                   lg
                                                       448.40
     4614851
                   construction.tools.light
                                              samsung
                                                       144.70
     [1083759 rows x 6 columns]
[6]: tr[tr['event_time'] == '2019-10-01 02:23:05+00:00']
```

```
category_id \
[6]:
                        event_time event_type
         2019-10-01 02:23:05+00:00
     21
                                      purchase
                                                2.053014e+18
         2019-10-01 02:23:05+00:00
                                      purchase
                                                2.053014e+18
                       category code
                                        brand
                                                price
     21
              electronics.smartphone
                                       huawei
                                               111.82
     22
         electronics.audio.headphone
                                          jbl
                                                20.57
[7]: new_tr = tr[tr.duplicated('event_time', keep=False)]
     new tr
[7]:
                              event_time event_type
                                                       category_id \
              2019-10-01 02:23:05+00:00
                                                     2.053014e+18
     21
                                           purchase
     22
              2019-10-01 02:23:05+00:00
                                           purchase
                                                      2.053014e+18
     33
              2019-10-01 02:26:05+00:00
                                           purchase
                                                      2.053014e+18
              2019-10-01 02:26:05+00:00
     34
                                           purchase
                                                      2.053014e+18
     58
              2019-10-01 02:31:46+00:00
                                           purchase
                                                      2.053014e+18
     4614845 2020-03-19 08:54:17+00:00
                                           purchase
                                                     2.232732e+18
     4614846 2020-03-19 08:54:17+00:00
                                           purchase
                                                      2.232732e+18
     4614849 2020-03-19 08:54:21+00:00
                                           purchase
                                                      2.232732e+18
     4614850
              2020-03-19 08:54:21+00:00
                                           purchase
                                                      2.232732e+18
     4614851 2020-03-19 08:54:21+00:00
                                           purchase
                                                      2.232732e+18
                              category_code
                                               brand
                                                         price
     21
                    electronics.smartphone
                                              huawei
                                                        111.82
     22
               electronics.audio.headphone
                                                         20.57
                                                  jbl
     33
               electronics.audio.headphone
                                              ritmix
                                                          0.88
     34
                    electronics.smartphone
                                                        197.43
                                             samsung
     58
                    electronics.smartphone
                                               apple
                                                       1634.51
                                               apple
     4614845
                  construction.tools.light
                                                      1376.05
     4614846
                     furniture.bedroom.bed
                                                   sv
                                                        282.89
     4614849
                  construction.tools.light
                                             samsung
                                                        169.46
     4614850
              appliances.personal.massager
                                                        448.40
                                                  lg
     4614851
                  construction.tools.light
                                                        144.70
                                             samsung
     [1888851 rows x 6 columns]
[8]: trr = new_tr[['event_time','category_code']]
[9]: grouped = trr.groupby('event_time', as_index=False).agg(list)
     grouped
[9]:
                             event_time
     0
             2019-10-01 02:23:05+00:00
     1
             2019-10-01 02:26:05+00:00
```

```
3
              2019-10-01 02:33:01+00:00
      4
              2019-10-01 02:34:23+00:00
      805087
              2020-03-19 08:53:44+00:00
      805088 2020-03-19 08:53:59+00:00
      805089 2020-03-19 08:54:04+00:00
      805090 2020-03-19 08:54:17+00:00
      805091 2020-03-19 08:54:21+00:00
                                                   category_code
      0
              [electronics.smartphone, electronics.audio.hea...
      1
              [electronics.audio.headphone, electronics.smar...
      2
               [electronics.smartphone, electronics.smartphone]
      3
                      [electronics.video.tv, electronics.tablet]
      4
              [electronics.smartphone, appliances.kitchen.wa...
      805087
              [construction.tools.light, construction.tools...
              [construction.tools.light, electronics.audio.h...
      805088
      805089
                       [construction.tools.light, sport.bicycle]
              [construction.tools.light, furniture.bedroom.bed]
      805090
      805091
              [construction.tools.light, appliances.personal...
      [805092 rows x 2 columns]
[10]: l = grouped['category_code'].tolist()
[11]: from mlxtend.preprocessing import TransactionEncoder
      te = TransactionEncoder()
      te_ary = te.fit(1).transform(1)
      df = pd.DataFrame(te_ary, columns=te.columns_)
[11]:
              accessories.bag accessories.umbrella accessories.wallet \
                        False
                                               False
                                                                    False
      1
                        False
                                               False
                                                                    False
      2
                        False
                                               False
                                                                    False
      3
                        False
                                               False
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      4
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      805087
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      805089
                        False
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                                                                    False
      805090
                        False
                                               False
                                                                    False
      805091
                                               False
                                                                    False
                        False
```

2

2019-10-01 02:31:46+00:00

```
apparel.belt
                       apparel.costume
                                         apparel.dress
                                                         apparel.glove \
0
                                                                  False
                False
                                  False
                                                  False
                                                                  False
1
                False
                                  False
                                                  False
2
                                                                  False
                False
                                  False
                                                  False
3
                False
                                  False
                                                  False
                                                                  False
4
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                                  False
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805087
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805090
                False
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                                                  False
                                                                  False
805091
                False
                                  False
                                                  False
                                                                  False
        apparel.jacket
                         apparel.jeans
                                         apparel.jumper ...
                                                              kids.swing \
0
                  False
                                                   False ...
                                                                   False
                                  False
1
                  False
                                  False
                                                   False ...
                                                                   False
2
                  False
                                  False
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3
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805089
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805090
                  False
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                                                   False ...
                                                                   False
805091
                  False
                                  False
                                                   False ...
                                                                   False
        kids.toys medicine.tools.tonometer
                                                sport.bicycle sport.diving \
0
            False
                                        False
                                                        False
                                                                        False
1
            False
                                        False
                                                        False
                                                                        False
2
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3
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805090
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                                                                       False
805091
            False
                                        False
                                                        False
                                                                        False
        sport.ski
                    sport.snowboard
                                     sport.tennis
                                                     sport.trainer \
0
            False
                               False
                                              False
                                                              False
                                              False
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1
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3
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4
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805087
            False
                               False
                                              False
                                                              False
```

805088 805089 805090 805091	False False False False	False False False False	False False False False	False False False False
	stationery.cartrig	e		
0	False			
1	False			
2	False			
3	False			
4	False			
•••	•••			
805087	Fals	e		
805088	Fals	е		
805089	Fals	e		
805090	Fals	е		

False

[805092 rows x 136 columns]

805091

```
[13]: from mlxtend.frequent_patterns import fpgrowth fpgrowth(df, min_support=0.1, use_colnames=True)
```

```
[13]: support itemsets
0 0.186892 (electronics.smartphone)
1 0.614512 (construction.tools.light)
```

No itemset is bought together frequently according to fpgrowth, except for electronics.smartphone as one group, and construction.tools.light as a separate group.

[]: