

recommender_user_based_cross_sell

December 13, 2020

```
[1]: import pandas as pd
import numpy as np
import math
```

```
[50]: #o primeiro elemento é o id do usuário, o segundo é a lista de discos comprados
      ↪na transação
trans_id=[
      ↪
      ↪(0, [0,1]), (1, [3,4]), (1, [7]), (2, [3,4,6]), (6, [4,5]), (3, [4,5,8]), (4, [9]), (5, [7,8]), (5, [0]), (6,
      ↪
      ↪]
]
```

```
[51]: #associação entre ids de bandas e seus nomes
dic={0: 'metallica', 1: 'beatles', 2: 'stones', 3: 'black sabbath', 4: 'rush', 5: 'van_
      ↪
      ↪halen', 6: 'the who', 7: 'the police', 8: 'pink floyd', 9: 'led zeppelin'}
```

```
[52]: #Criação da matriz A
A=[[0]*10 for i in range(10)]
A
```

```
[52]: [[0, 0, 0, 0, 0, 0, 0, 0, 0, 0],
      [0, 0, 0, 0, 0, 0, 0, 0, 0, 0],
      [0, 0, 0, 0, 0, 0, 0, 0, 0, 0],
      [0, 0, 0, 0, 0, 0, 0, 0, 0, 0],
      [0, 0, 0, 0, 0, 0, 0, 0, 0, 0],
      [0, 0, 0, 0, 0, 0, 0, 0, 0, 0],
      [0, 0, 0, 0, 0, 0, 0, 0, 0, 0],
      [0, 0, 0, 0, 0, 0, 0, 0, 0, 0],
      [0, 0, 0, 0, 0, 0, 0, 0, 0, 0],
      [0, 0, 0, 0, 0, 0, 0, 0, 0, 0],
      [0, 0, 0, 0, 0, 0, 0, 0, 0, 0]]
```

```
[53]: #montagem da matriz A a partir das transações
for i in range(len(trans_id)):
    lin=trans_id[i][0]
    for j in range(len(trans_id[i][1])):
        A[lin][trans_id[i][1][j]]=1
A=np.array(A)
A
```

```
[53]: array([[1, 1, 0, 0, 0, 0, 0, 0, 0, 0],
            [0, 0, 0, 1, 1, 0, 0, 1, 0, 0],
            [0, 0, 0, 1, 1, 0, 1, 0, 0, 0],
            [0, 0, 0, 0, 1, 1, 0, 0, 1, 0],
            [0, 0, 0, 0, 0, 0, 0, 0, 0, 1],
            [1, 0, 0, 0, 0, 0, 0, 1, 1, 0],
            [1, 1, 0, 0, 1, 1, 0, 0, 1, 0],
            [0, 0, 0, 0, 1, 0, 0, 1, 0, 0],
            [1, 0, 0, 0, 0, 0, 0, 0, 0, 1],
            [0, 0, 0, 1, 0, 1, 1, 0, 0, 0]])
```

```
[54]: def sim(v1,v2):
        return np.inner(v1,v2)/(np.linalg.norm(v1)*np.linalg.norm(v2))
```

Gerar a Matriz de Similaridade WC

Obtenha a matriz de recomendações USER BASED

Gerar a função de recomendação

```
[55]: m,n=A.shape
WC=np.identity(m)
for i in range(m):
    for j in range(i+1,m):
        WC[i,j]=sim(A[i],A[j])
        WC[j,i]=WC[i,j]
WC
```

```
[55]: array([[1.          , 0.          , 0.          , 0.          , 0.          ,
            0.40824829, 0.63245553, 0.          , 0.5          , 0.          ],
            [0.          , 1.          , 0.66666667, 0.33333333, 0.          ,
            0.33333333, 0.25819889, 0.81649658, 0.          , 0.33333333],
            [0.          , 0.66666667, 1.          , 0.33333333, 0.          ,
            0.          , 0.25819889, 0.40824829, 0.          , 0.66666667],
            [0.          , 0.33333333, 0.33333333, 1.          , 0.          ,
            0.33333333, 0.77459667, 0.40824829, 0.          , 0.33333333],
            [0.          , 0.          , 0.          , 0.          , 1.          ,
            0.          , 0.          , 0.          , 0.70710678, 0.          ],
            [0.40824829, 0.33333333, 0.          , 0.33333333, 0.          ,
            1.          , 0.51639778, 0.40824829, 0.40824829, 0.          ],
            [0.63245553, 0.25819889, 0.25819889, 0.77459667, 0.          ,
            0.51639778, 1.          , 0.31622777, 0.31622777, 0.25819889],
            [0.          , 0.81649658, 0.40824829, 0.40824829, 0.          ,
            0.40824829, 0.31622777, 1.          , 0.          , 0.          ],
            [0.5          , 0.          , 0.          , 0.          , 0.70710678,
            0.40824829, 0.31622777, 0.          , 1.          , 0.          ],
            [0.          , 0.33333333, 0.66666667, 0.33333333, 0.          ,
            0.          , 0.25819889, 0.          , 0.          , 1.          ]])
```

```
[56]: #matriz de recomendação é só multiplicar WC por A (user based)
      REC=np.dot(WC,A)
      REC
```

```
[56]: array([[2.54070382, 1.63245553, 0.          , 0.          , 0.63245553,
            0.63245553, 0.          , 0.40824829, 1.04070382, 0.5          ],
            [0.59153222, 0.25819889, 0.          , 2.          , 3.07469547,
            0.92486556, 1.          , 2.14982991, 0.92486556, 0.          ],
            [0.25819889, 0.25819889, 0.          , 2.33333333, 2.66644718,
            1.25819889, 1.66666667, 1.07491496, 0.59153222, 0.          ],
            [1.10793    , 0.77459667, 0.          , 1.          , 2.84951163,
            2.10793    , 0.66666667, 1.07491496, 2.10793    , 0.          ],
            [0.70710678, 0.          , 0.          , 0.          , 0.          ,
            0.          , 0.          , 0.          , 0.          , 1.70710678],
            [2.33289436, 0.92464607, 0.          , 0.33333333, 1.59131274,
            0.84973111, 0.          , 1.74158162, 1.84973111, 0.40824829],
            [2.46508108, 1.63245553, 0.          , 0.77459667, 2.60722221,
            2.03279556, 0.51639778, 1.09082444, 2.29099445, 0.31622777],
            [0.72447606, 0.31622777, 0.          , 1.22474487, 2.94922093,
            0.72447606, 0.40824829, 2.22474487, 1.13272435, 0.          ],
            [2.22447606, 0.81622777, 0.          , 0.          , 0.31622777,
            0.31622777, 0.          , 0.40824829, 0.72447606, 1.70710678],
            [0.25819889, 0.25819889, 0.          , 2.          , 1.59153222,
            1.59153222, 1.66666667, 0.33333333, 0.59153222, 0.          ]])
```

```
[57]: def rec_user(id,REC,A,d):
      va=A[id]
      ra=REC[id]
      for i in range(len(va)):
          if va[i]==1:ra[i]=-1
      return d[np.argmax(ra)]
```

```
[58]: rec_user(0,REC,A,dic)
```

```
[58]: 'pink floyd'
```

```
[59]: for i in range(m):
      print('user ',i,' recomendação ',rec_user(i,REC,A,dic))
```

```
user 0  recomendação  pink floyd
user 1  recomendação  the who
user 2  recomendação  van halen
user 3  recomendação  metallica
user 4  recomendação  metallica
user 5  recomendação  rush
user 6  recomendação  the police
user 7  recomendação  black sabbath
```

```
user 8 recomendação beatles
user 9 recomendação rush
```

```
[60]: #instalando apyori
      # !pip install apyori
      from apyori import apriori
```

```
[62]: #parte 1: transforme a lista trans_id em
      ↪trans=[['metallica','beatles'],['stones','black sabbath'],.....]
      trans = []
      for i in trans_id:
          trans.append(i[1])
      trans
```

```
[62]: [[0, 1],
       [3, 4],
       [7],
       [3, 4, 6],
       [4, 5],
       [4, 5, 8],
       [9],
       [7, 8],
       [0],
       [8, 0, 1],
       [0, 9],
       [3],
       [5, 6],
       [4, 7]]
```

```
[78]: for i in range(len(trans)):
      for j in range(len(trans[i])):
          trans[i][j] = dic[trans[i][j]]
```

```
[80]: trans
```

```
[80]: [['metallica', 'beatles'],
       ['black sabbath', 'rush'],
       ['the police'],
       ['black sabbath', 'rush', 'the who'],
       ['rush', 'van halen'],
       ['rush', 'van halen', 'pink floyd'],
       ['led zeppelin'],
       ['the police', 'pink floyd'],
       ['metallica'],
       ['pink floyd', 'metallica', 'beatles'],
       ['metallica', 'led zeppelin'],
       ['black sabbath'],
```

```
['van halen', 'the who'],  
['rush', 'the police']]
```

```
[82]: #Parte 2) Rode apriori e identifique os 2 conjuntos com maior suporte  
resultado = list(apriori(trans))
```

```
[94]: sup_list = []  
set_list = []  
resultado[0][1], len(resultado)  
for i in range(len(resultado)):  
    sup_list.append(resultado[i][1])  
    set_list.append(resultado[i][0])
```

```
[109]: sup_list
```

```
[109]: [0.14285714285714285,  
0.21428571428571427,  
0.14285714285714285,  
0.2857142857142857,  
0.21428571428571427,  
0.35714285714285715,  
0.21428571428571427,  
0.14285714285714285,  
0.21428571428571427,  
0.14285714285714285,  
0.14285714285714285,  
0.14285714285714285]
```

```
[107]: set_list[3], sup_list[3]
```

```
[107]: (frozenset({'metallica'}), 0.2857142857142857)
```

```
[108]: set_list[5], sup_list[5]
```

```
[108]: (frozenset({'rush'}), 0.35714285714285715)
```

```
[138]: #Parte 3: faça sugestões de duplas com os dois itens de maior suporte (quem  
→ comprou a, também levou b)  
quant=2  
sug = []  
for r in resultado:  
    if len(r[0])==quant:  
        print(r[0])
```

```
frozenset({'metallica', 'beatles'})  
frozenset({'black sabbath', 'rush'})  
frozenset({'van halen', 'rush'})
```

[]: