# Rule Mining for Genres using Apriori

#### Loading functions and modules

```
In []: import pandas as pd
   import numpy as np
   from mlxtend.preprocessing import TransactionEncoder
   from mlxtend.frequent_patterns import apriori, association_rules
```

#### **Loading Data**

```
In [ ]: df = pd.read_csv("../data/final_0_80509.csv")
         df.head()
        C:\Users\user\AppData\Local\Temp\ipykernel_12092\1952620361.py:1: DtypeWarning: Columns (10,35) have mixed types. Specify dtype
        option on import or set low_memory=False.
          df = pd.read_csv("../data/final_0_80509.csv")
Out[]:
                                    Title Initial_Price Final_Price Discount_Percent Developers Publishers
             Index
                       AppID
                                                                                                                       Genres
                                                                                                                                    Categories ... Subtitle_
                                                                                                                                       ['Single-
                                                                                          ['Perpetual
                                                                                                      ['Perpetual
                                                                                                                      ['Casual',
                                 Galactic
                                                                                                                                 player', 'Multi-
          0
                  0
                       20200
                                                  NaN
                                                              NaN
                                                                                  NaN
                                                                                                  FX
                                                                                                              FX
                                                                                                                        'Indie',
                                 Bowling
                                                                                                                                 player', 'Steam
                                                                                                                       'Sports']
                                                                                           Creative']
                                                                                                       Creative']
                                                                                                                                        Achie...
                                                                                                                                       ['Single-
                                                                                                                                                       ['Englis
                                                                                                           ['Wild
                                                                                                                                 player', 'Steam
                                    Train
                                                                                             ['Rusty
                                                                                                                      ['Action',
          1
                                                  52.0
                                                               52.0
                                                                                   0.0
                      655370
                                                                                                                                                        'Italian
                                                                                           Moyher']
                                                                                                                        'Indie']
                                                                                                                                Achievements',
                                  Bandit
                                                                                                        Rooster']
                                                                                                                                         'Full ...
                                                                                                                      ['Action',
                                     Jolt
                                                                                           ['Campião
                                                                                                       ['Campião
                                                                                                                   'Adventure',
                                                                                                                                       ['Single-
          2
                  2 1732930
                                                 199.0
                                                              199.0
                                                                                   0.0
                                  Project
                                                                                            Games']
                                                                                                         Games']
                                                                                                                        'Indie',
                                                                                                                                        player']
                                                                                                                     'Strategy']
                                                                                                                                       ['Single-
                                                                                                                  ['Adventure',
                                                                                               ['Odd
                                                                                                           ['Odd
                                                                                                                                    player', 'Full
                  3 1355720 Henosis™
          3
                                                  NaN
                                                                                  NaN
                                                               NaN
                                                                                              Critter
                                                                                                          Critter
                                                                                                                       'Casual',
                                                                                                                                      controller
                                                                                                                        'Indie']
                                                                                            Games']
                                                                                                         Games']
                                                                                                                                      support']
                                     Two
                                                                                                                                       ['Single-
                                                                                                        ['Unusual ['Adventure',
                                                                                                                                                      ['English'
                                                                                           ['Unusual
                                                   0.0
                                                                0.0
                                                                                   0.0
                  4 1139950
                               Weeks in
                                                                                                                                 player', 'Steam
                                                                                            Games']
                                                                                                                        'Indie']
                                                                                                         Games']
                                                                                                                                Achievements']
                                Painland
         5 rows × 37 columns
```

## Looking at all genres

```
In [ ]: n = 80509
        dataset = []
        for genres in df["Genres"][:n]:
            if genres is not np.nan:
                dataset.append(eval(genres))
        dataset[:10]
Out[]: [['Casual', 'Indie', 'Sports'],
          ['Action', 'Indie'],
          ['Action', 'Adventure', 'Indie', 'Strategy'],
          ['Adventure', 'Casual', 'Indie'],
          ['Adventure', 'Indie'],
          ['Adventure',
           'Casual',
           'Free to Play',
           'Massively Multiplayer',
           'RPG',
           'Strategy'],
          ['Indie', 'Strategy'],
          ['Casual'],
          ['Adventure', 'RPG', 'Simulation', 'Strategy'],
          ['Action', 'Adventure', 'Indie']]
```

# Converting genres to asymmetric binary attributes

```
In [ ]: te = TransactionEncoder()
   te_ary = te.fit(dataset).transform(dataset)
```

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	360 Video	Accounting	Action	Adventure	Animation & Modeling	Audio Production	Casual	Design & Illustration	Documentary	Early Access	•••	Short	Simulation
0	False	False	False	False	False	False	True	False	False	False		False	False
1	False	False	True	False	False	False	False	False	False	False		False	False
2	False	False	True	True	False	False	False	False	False	False		False	False
3	False	False	False	True	False	False	True	False	False	False		False	False
4	False	False	False	True	False	False	False	False	False	False		False	False
•••													
75616	False	False	False	False	False	False	False	False	False	False		False	False
75617	False	False	True	False	False	False	True	False	False	False		False	True
75618	False	False	False	False	False	False	False	False	False	False		False	True
75619	False	False	False	True	False	False	False	False	False	False		False	False
75620	False	False	True	False	False	False	False	False	False	False		False	False

75621 rows × 33 columns

4

### Rule minning

#### min support 50%, confidence 75%

```
In []: frq_items = apriori(df2, min_support=0.2, use_colnames=True)
    rules = association_rules(frq_items, min_threshold = .4, metric="confidence")
    rules.sort_values(["support"],ascending=[False])
```

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]:		antecedents	consequents	antecedent support	consequent support	support	confidence	lift	leverage	conviction	zhangs_metric
	4	(Casual)	(Indie)	0.407109	0.688407	0.310165	0.761872	1.106718	0.029909	1.308514	0.162640
	5	(Indie)	(Casual)	0.688407	0.407109	0.310165	0.450555	1.106718	0.029909	1.079073	0.309467
	0	(Indie)	(Action)	0.688407	0.419540	0.310020	0.450344	1.073424	0.021206	1.056043	0.219522
	1	(Action)	(Indie)	0.419540	0.688407	0.310020	0.738952	1.073424	0.021206	1.193626	0.117840
	2	(Adventure)	(Indie)	0.383941	0.688407	0.290316	0.756148	1.098403	0.026009	1.277797	0.145420
	3	(Indie)	(Adventure)	0.688407	0.383941	0.290316	0.421722	1.098403	0.026009	1.065334	0.287514

## Conclusion of good rules

- 1. Casual <-> Indie . Most Casual games are made by an individual and vice versa
- 2. Even on basis of Action <-> Indie . Most Actions games are made by an individual and vice versa
- 3. And on basis of Adventure <-> Indie . Most Adventure games are made by an individual and vice versa