	.core.frame.bacarrame >	•	CLASS
genres	title	novield	n
Adventure   Animation   Children   Comedy   Fantasy	Toy Story (1995)	1	0
Adventure   Children   Fantasy	Jumanji (1995)	2	1
Comedy Romance	Grumpier Old Men (1995)	3	2
Comedy Drama Romance	Waiting to Exhale (1995)	4	3
Comedy	Father of the Bride Part II (1995)	5	4
Action Crime Thriller	Heat (1995)	6	5
Comedy Romance	Sabrina (1995)	7	6
Adventure Children	Tom and Huck (1995)	8	7
Action	Sudden Death (1995)	9	8
Action Adventure Thriller	GoldenEye (1995)	10	9
Comedy Drama Romance	American President, The (1995)	11	10
Comedy Horror	Dracula: Dead and Loving It (1995)	12	11
Adventure Animation Children	Balto (1995)	13	12
Drama	Nixon (1995)	14	13
Action Adventure Romance	Cutthroat Island (1995)	15	14
Crime Drama	Casino (1995)	16	15
Drama Romance	Sense and Sensibility (1995)	17	16
Comedy	Four Rooms (1995)	18	17
Comedy	Ace Ventura: When Nature Calls (1995)	19	18
Action Comedy Crime Drama Thriller	Money Train (1995)	20	19

```
In [36]: print(movies.columns)
          print(ratings.columns)
          print(tags.columns)
        Index(['movieId', 'title', 'genres'], dtype='object')
        Index(['userId', 'movieId', 'rating'], dtype='object')
        Index(['userId', 'movieId', 'tag', 'timestamp'], dtype='object')
In [38]: tags.head()
Out[38]:
             userld movield
                                      tag
                                                   timestamp
          0
                 18
                        4141 Mark Waters 2009-04-24 18:19:40
                         208
          1
                 65
                                 dark hero 2013-05-10 01:41:18
          2
                 65
                         353
                                 dark hero 2013-05-10 01:41:19
                                noir thriller 2013-05-10 01:39:43
          3
                 65
                         521
          4
                 65
                         592
                                 dark hero 2013-05-10 01:41:18
In [29]: ratings.head()
Out[29]:
             userId movieId rating
                                             timestamp
          0
                  1
                           2
                                 3.5 2005-04-02 23:53:47
                          29
                                 3.5 2005-04-02 23:31:16
          2
                  1
                          32
                                 3.5 2005-04-02 23:33:39
          3
                          47
                                 3.5 2005-04-02 23:32:07
          4
                  1
                          50
                                 3.5 2005-04-02 23:29:40
In [52]:
         if 'timestamp' in ratings.columns:
              del ratings['timestamp']
          if 'timestamp' in tags.columns:
              del tags['timestamp']
```

### **DATA STRUCTURES**

```
In [55]: # SERIES
    row_0=tags.iloc[0]
    type(row_0)

Out[55]: pandas.core.series.Series
In [57]: print(row_0)
```

18

4141

userId

movieId

```
tag Mark Waters
Name: 0, dtype: object

In [59]: row_0.index

Out[59]: Index(['userId', 'movieId', 'tag'], dtype='object')

In [61]: row_0['userId']

Out[61]: 18

In [65]: 'rating' in row_0

Out[65]: False

In [67]: row_0.name

Out[67]: 0

In [71]: row_0=row_0.rename('firstRow')
    row_0.name

Out[71]: 'firstRow'
```

### **DATA FRAMES**

```
tags.head()
In [75]:
Out[75]:
             userld movield
                                     tag
          0
                18
                       4141 Mark Waters
                                dark hero
                65
                        208
          2
                65
                        353
                                dark hero
                65
                               noir thriller
                        521
          4
                65
                        592
                                dark hero
In [77]: tags.index
Out[77]: RangeIndex(start=0, stop=465564, step=1)
In [79]: tags.columns
Out[79]: Index(['userId', 'movieId', 'tag'], dtype='object')
In [89]: tags.iloc[[0,11,500]]
```

tag	movield	userId		ut[89]:
Mark Waters	4141	18	0	
noir thriller	1783	65	11	
entirely dialogue	55908	342	500	

### **DESCRIPTIVE STATISTICS**

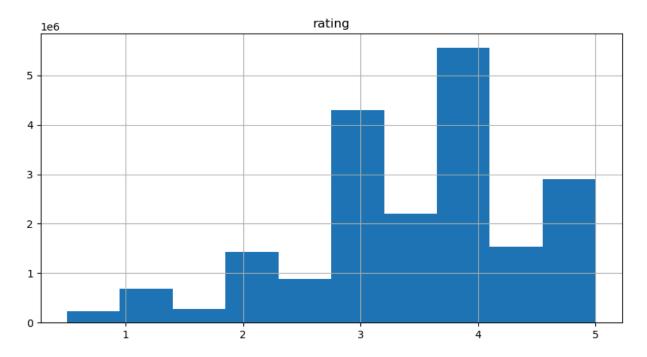
```
In [92]: ratings['rating'].describe()
                   2.000026e+07
Out[92]:
         count
          mean
                   3.525529e+00
          std
                   1.051989e+00
          min
                   5.000000e-01
          25%
                   3.000000e+00
          50%
                   3.500000e+00
          75%
                   4.000000e+00
                   5.000000e+00
          max
          Name: rating, dtype: float64
In [94]:
         ratings.describe()
Out[94]:
                       userld
                                   movield
                                                   rating
          count 2.000026e+07 2.000026e+07 2.000026e+07
          mean
                6.904587e+04 9.041567e+03
                                            3.525529e+00
            std
                4.003863e+04 1.978948e+04
                                            1.051989e+00
           min
                 1.000000e+00
                             1.000000e+00
                                             5.00000e-01
           25%
                3.439500e+04 9.020000e+02
                                            3.000000e+00
           50%
                6.914100e+04 2.167000e+03
                                            3.500000e+00
                1.036370e+05 4.770000e+03
                                            4.000000e+00
           max 1.384930e+05 1.312620e+05 5.000000e+00
         ratings['rating'].mean()
In [96]:
Out[96]:
          3.5255285642993797
In [98]:
         ratings.mean()
Out[98]:
         userId
                     69045.872583
          movieId
                      9041.567330
          rating
                         3.525529
          dtype: float64
```

```
In [100...
           ratings['rating'].min()
Out[100...
           0.5
In [102...
           ratings['rating'].max()
Out[102...
           5.0
           ratings['rating'].std()
In [104...
Out[104...
           1.051988919275684
           ratings['rating'].mode()
In [110...
Out[110...
                 4.0
           Name: rating, dtype: float64
           ratings.corr()
In [114...
Out[114...
                        userId
                                movield
                                            rating
             userId
                     1.000000
                               -0.000850 0.001175
                     -0.000850
                                1.000000 0.002606
           movield
             rating
                     0.001175
                                0.002606 1.000000
In [116...
           filter1=ratings['rating']>10
           print(filter1)
           filter1.any()
                      False
                      False
         1
         2
                       False
         3
                       False
         4
                      False
         20000258
                      False
         20000259
                      False
         20000260
                      False
         20000261
                      False
         20000262
                       False
         Name: rating, Length: 20000263, dtype: bool
Out[116... False
In [118...
           filter2=ratings['rating']>0
           filter2.all()
Out[118...
           True
```

# DATA-CLEANING: HANDLING MISSING DATA

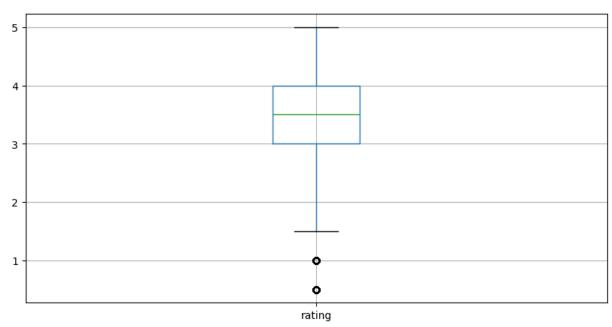
```
In [121...
           movies.shape
Out[121...
           (27278, 3)
In [123...
           movies.isnull().any().any()
Out[123...
           False
In [125...
           ratings.shape
Out[125...
            (20000263, 3)
In [127...
           ratings.isnull().any().any()
Out[127...
           False
In [129...
           tags.shape
Out[129...
           (465564, 3)
In [131...
           tags.isnull().any().any()
Out[131...
           True
In [133...
           tags= tags.dropna()
In [135...
           tags.isnull().any().any()
Out[135...
           False
In [137...
           tags.shape
Out[137...
           (465548, 3)
```

#### **DATA--VISUALIZATION**



In [151... ratings.boxplot(column='rating',figsize=(10,5))

Out[151... <Axes: >

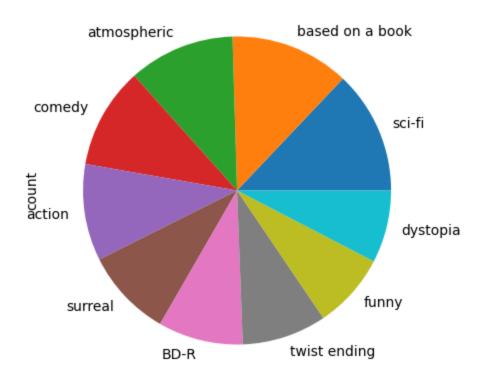


## **SLICING OUT COLUMNS**

In [154... tags['tag'].head()

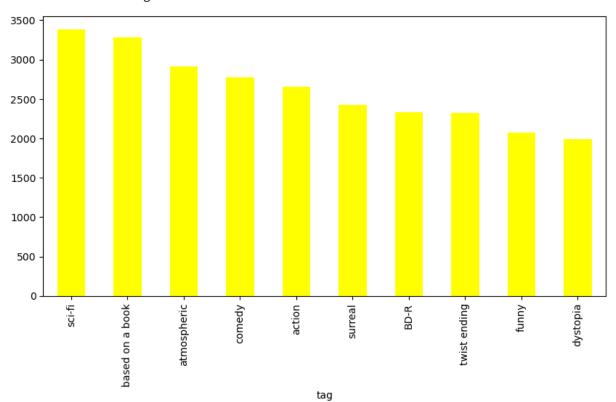
```
Out[154...
           0
                   Mark Waters
           1
                     dark hero
           2
                     dark hero
            3
                 noir thriller
                     dark hero
           Name: tag, dtype: object
           movies[['title','genres']].head()
In [156...
Out[156...
                                      title
                                                                               genres
           0
                            Toy Story (1995) Adventure|Animation|Children|Comedy|Fantasy
                                                              Adventure | Children | Fantasy
           1
                              Jumanji (1995)
           2
                    Grumpier Old Men (1995)
                                                                     Comedy|Romance
           3
                     Waiting to Exhale (1995)
                                                               Comedy|Drama|Romance
           4 Father of the Bride Part II (1995)
                                                                              Comedy
In [158...
           ratings[-10:]
Out[158...
                       userld movield rating
           20000253 138493
                                 60816
                                           4.5
           20000254 138493
                                 61160
                                            4.0
           20000255 138493
                                 65682
                                           4.5
           20000256 138493
                                 66762
                                           4.5
           20000257 138493
                                 68319
                                           4.5
           20000258 138493
                                 68954
                                           4.5
           20000259 138493
                                 69526
                                           4.5
           20000260 138493
                                 69644
                                            3.0
           20000261 138493
                                 70286
                                            5.0
           20000262 138493
                                 71619
                                            2.5
           tag_counts=tags['tag'].value_counts()
In [164...
           tag_counts[-10:]
```

```
Out[164...
          tag
          missing child
                                             1
           Ron Moore
                                             1
           Citizen Kane
                                             1
           mullet
                                             1
           biker gang
                                             1
           Paul Adelstein
                                             1
           the wig
                                             1
           killer fish
                                             1
           genetically modified monsters
                                             1
           topless scene
                                             1
           Name: count, dtype: int64
In [166...
          tag_counts = tags['tag'].value_counts()
          tag_counts[-10:]
Out[166...
          tag
          missing child
                                             1
           Ron Moore
                                             1
           Citizen Kane
                                             1
          mullet
                                             1
           biker gang
                                             1
           Paul Adelstein
                                             1
           the wig
                                             1
           killer fish
                                             1
           genetically modified monsters
                                             1
           topless scene
                                             1
           Name: count, dtype: int64
In [168...
          tag_counts[:10].plot(kind='pie',figsize=(10,5))
Out[168... <Axes: ylabel='count'>
```



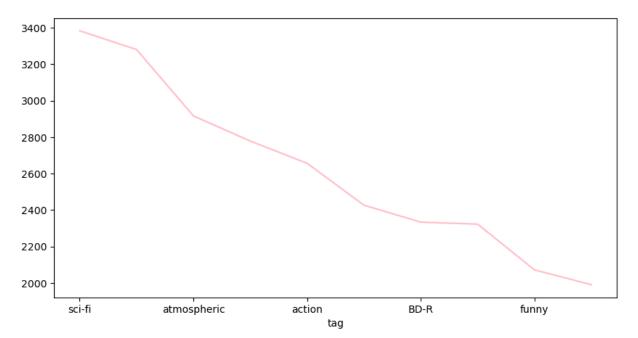
In [230... tag\_counts[:10].plot(kind='bar', figsize=(10,5),color='yellow')

Out[230... <Axes: xlabel='tag'>



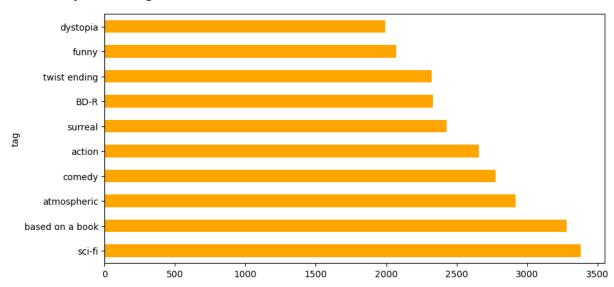
```
In [216... tag_counts[:10].plot(kind='line', figsize=(10,5),color='pink')
```

Out[216... <Axes: xlabel='tag'>



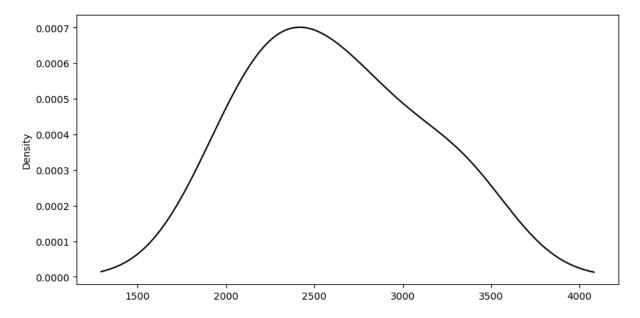
In [218... tag\_counts[:10].plot(kind='barh', figsize=(10,5),color='orange')

Out[218... <Axes: ylabel='tag'>



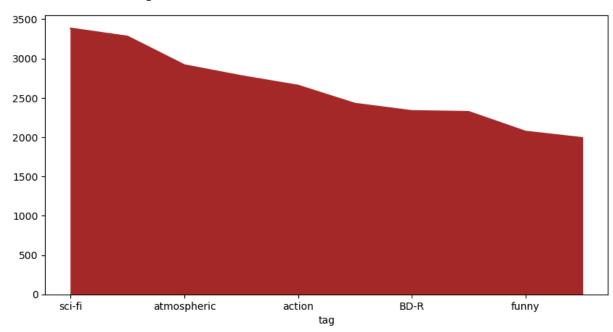
In [220... tag\_counts[:10].plot(kind='density', figsize=(10,5),color='black')

Out[220... <Axes: ylabel='Density'>



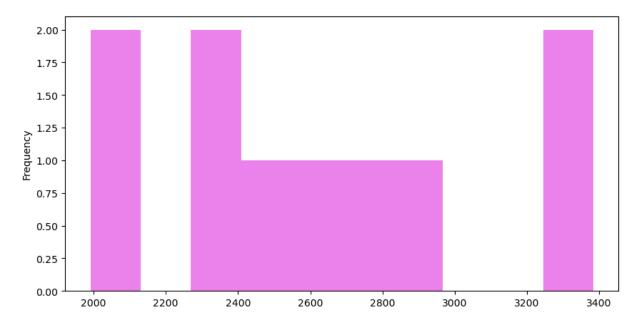
In [224... tag\_counts[:10].plot(kind='area', figsize=(10,5),color='brown')

Out[224... <Axes: xlabel='tag'>



In [226... tag\_counts[:10].plot(kind='hist', figsize=(10,5),color='violet')

Out[226... <Axes: ylabel='Frequency'>



In [ ]: