```
In []: ## imdb
In [1]: import pandas as pd
In [57]: ratings=pd.read_csv(r"C:\Users\91630\Downloads\rating.csv")
In [58]: ratings
```

Out[58]:

	userId	movield	rating	timestamp
0	1	2	3.5	2005-04-02 23:53:47
1	1	29	3.5	2005-04-02 23:31:16
2	1	32	3.5	2005-04-02 23:33:39
3	1	47	3.5	2005-04-02 23:32:07
4	1	50	3.5	2005-04-02 23:29:40
•••				
20000258	138493	68954	4.5	2009-11-13 15:42:00
20000259	138493	69526	4.5	2009-12-03 18:31:48
20000260	138493	69644	3.0	2009-12-07 18:10:57
20000261	138493	70286	5.0	2009-11-13 15:42:24
20000262	138493	71619	2.5	2009-10-17 20:25:36

20000263 rows × 4 columns

```
In [85]: tags=pd.read_csv(r"C:\Users\91630\Downloads\tag.csv",sep=',')
```

In [87]: tags

	userId	movield	tag	timestamp
0	18	4141	Mark Waters	2009-04-24 18:19:40
1	65	208	dark hero	2013-05-10 01:41:18
2	65	353	dark hero	2013-05-10 01:41:19
3	65	521	noir thriller	2013-05-10 01:39:43
4	65	592	dark hero	2013-05-10 01:41:18
•••				
465559	138446	55999	dragged	2013-01-23 23:29:32
465560	138446	55999	Jason Bateman	2013-01-23 23:29:38
465561	138446	55999	quirky	2013-01-23 23:29:38
465562	138446	55999	sad	2013-01-23 23:29:32
465563	138472	923	rise to power	2007-11-02 21:12:47

465564 rows × 4 columns

In [91]: movies=pd.read_csv(r"C:\Users\91630\Downloads\movie.csv",sep=',')

In [93]: movies

Out[87]:

Out[93]: movield title genres 0 1 Toy Story (1995) Adventure|Animation|Children|Comedy|Fantasy 1 2 Jumanji (1995) Adventure|Children|Fantasy 2 3 Grumpier Old Men (1995) Comedy|Romance Comedy|Drama|Romance 3 Waiting to Exhale (1995) Father of the Bride Part II 5 4 Comedy (1995)Kein Bund für's Leben 27273 131254 Comedy (2007)Feuer, Eis & Dosenbier 27274 131256 Comedy (2002)27275 131258 The Pirates (2014) Adventure 27276 131260 Rentun Ruusu (2001) (no genres listed) 27277 131262 Innocence (2014) Adventure|Fantasy|Horror

27278 rows × 3 columns

In [83]: print(type(movies))

In [71]: print(type(ratings))

<class 'pandas.core.frame.DataFrame'>

In [73]: print(type(tags))

<class 'pandas.core.frame.DataFrame'>

In [75]: movies.head(20)

0 1 Toy Story (1995) Adventure Animation Children Comedy Fantasy 1 2 Jumanji (1995) Adventure Children Fantasy 2 3 Grumpier Old Men (1995) Comedy Romance 3 4 Waiting to Exhale (1995) Comedy Drama Romance 4 5 Father of the Bride Part II (1995) Comedy Drama Romance 5 6 Heat (1995) Action Crime Thriller 6 7 Sabrina (1995) Comedy Romance 7 8 Tom and Huck (1995) Adventure Children 8 9 Sudden Death (1995) Action Adventure Children 9 10 GoldenEye (1995) Action Adventure Thriller 10 11 12 Dracula: Dead and Loving It (1995) Comedy Drama Romance 11 12 Dracula: Dead and Loving It (1995) Adventure Animation Children 12 13 Balto (1995) Adventure Animation Children 13 14 Nixon (1995) Action Adventure Romance 15 16 Casino (1995) Drama Romance	•	genre	title	movield]:	Out[75	
2 3 Grumpier Old Men (1995) Comedy Romance 3 4 Waiting to Exhale (1995) Comedy Drama Romance 4 5 Father of the Bride Part II (1995) Comedy 5 6 Heat (1995) Action Crime Thriller 6 7 Sabrina (1995) Comedy Romance 7 8 Tom and Huck (1995) Adventure Children 8 9 Sudden Death (1995) Action Adventure Thriller 10 11 American President, The (1995) Comedy Drama Romance 11 12 Dracula: Dead and Loving It (1995) Comedy Horror 12 13 Balto (1995) Adventure Animation Children 13 14 Nixon (1995) Action Adventure Romance 15 16 Casino (1995) Action Adventure Romance 15 16 Casino (1995) Drama Romance 17 18 Four Rooms (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 19 Ace Ventura: When Nat	,	Adventure Animation Children Comedy Fantasy	Toy Story (1995)	1	0		
3 4 Waiting to Exhale (1995) Comedy Drama Romance 4 5 Father of the Bride Part II (1995) Comedy 5 6 Heat (1995) Action Crime Thriller 6 7 Sabrina (1995) Comedy Romance 7 8 Tom and Huck (1995) Adventure Children 8 9 Sudden Death (1995) Action Adventure Thriller 9 10 GoldenEye (1995) Action Adventure Thriller 10 11 American President, The (1995) Comedy Drama Romance 11 12 Dracula: Dead and Loving It (1995) Comedy Horror 12 13 Balto (1995) Adventure Animation Children 13 14 Nixon (1995) Action Adventure Romance 15 16 Casino (1995) Action Adventure Romance 15 16 Casino (1995) Drama Romance 16 17 Sense and Sensibility (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 19 Ace V	,	Adventure Children Fantasy	Jumanji (1995)	2	1		
4 5 Father of the Bride Part II (1995) Comedy 5 6 Heat (1995) Action Crime Thriller 6 7 Sabrina (1995) Comedy Romance 7 8 Tom and Huck (1995) Adventure Children 8 9 Sudden Death (1995) Action Adventure Thriller 9 10 GoldenEye (1995) Action Adventure Thriller 10 11 American President, The (1995) Comedy Drama Romance 11 12 Dracula: Dead and Loving It (1995) Comedy Horror 12 13 Balto (1995) Adventure Animation Children 13 14 Nixon (1995) Drama 14 15 Cutthroat Island (1995) Action Adventure Romance 15 16 Casino (1995) Crime Drama 16 17 Sense and Sensibility (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 40 Ace Ventura: When Nature Calls (1995) Comedy	ž	Comedy Romance	Grumpier Old Men (1995)	3	2		
4 5 (1995) Comedy 5 6 Heat (1995) Action Crime Thriller 6 7 Sabrina (1995) Comedy Romance 7 8 Tom and Huck (1995) Adventure Children 8 9 Sudden Death (1995) Action Adventure Thriller 10 11 American President, The (1995) Comedy Drama Romance 11 12 Dracula: Dead and Loving It (1995) Comedy Horror 12 13 Balto (1995) Adventure Animation Children 13 14 Nixon (1995) Action Adventure Romance 15 16 Casino (1995) Action Adventure Romance 15 16 Casino (1995) Drama Romance 17 18 Four Rooms (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 19 Ace Ventura: When Nature Calls (1995) Comedy	ž	Comedy Drama Romance	Waiting to Exhale (1995)	4	3		
6 7 Sabrina (1995) Comedy Romance 7 8 Tom and Huck (1995) Adventure Children 8 9 Sudden Death (1995) Action 9 10 GoldenEye (1995) Action Adventure Thriller 10 11 American President, The (1995) Comedy Drama Romance 11 12 Dracula: Dead and Loving It (1995) Comedy Horror 12 13 Balto (1995) Adventure Animation Children 13 14 Nixon (1995) Drama 14 15 Cutthroat Island (1995) Action Adventure Romance 15 16 Casino (1995) Crime Drama 16 17 Sense and Sensibility (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 19 Ace Ventura: When Nature Calls (1995) Comedy	′	Comedy		5	4		
7 8 Tom and Huck (1995) Adventure Children 8 9 Sudden Death (1995) Action 9 10 GoldenEye (1995) Action Adventure Thriller 10 11 American President, The (1995) Comedy Drama Romance 11 12 Dracula: Dead and Loving It (1995) Comedy Horror 12 13 Balto (1995) Adventure Animation Children 13 14 Nixon (1995) Drama 14 15 Cutthroat Island (1995) Action Adventure Romance 15 16 Casino (1995) Crime Drama 16 17 Sense and Sensibility (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 19 Ace Ventura: When Nature Calls (1995) Comedy	٢	Action Crime Thrille	Heat (1995)	6	5		
8 9 Sudden Death (1995) Action 9 10 GoldenEye (1995) Action Adventure Thriller 10 11 American President, The (1995) Comedy Drama Romance 11 12 Dracula: Dead and Loving It (1995) Comedy Horror 12 13 Balto (1995) Adventure Animation Children 13 14 Nixon (1995) Drama 14 15 Cutthroat Island (1995) Action Adventure Romance 15 16 Casino (1995) Crime Drama 16 17 Sense and Sensibility (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 19 Ace Ventura: When Nature Calls (1995) Comedy	ì	Comedy Romance	Sabrina (1995)	7	6		
9 10 GoldenEye (1995) Action Adventure Thriller 10 11 American President, The (1995) Comedy Drama Romance 11 12 Dracula: Dead and Loving It (1995) Comedy Horror 12 13 Balto (1995) Adventure Animation Children 13 14 Nixon (1995) Drama 14 15 Cutthroat Island (1995) Action Adventure Romance 15 16 Casino (1995) Crime Drama 16 17 Sense and Sensibility (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 19 Ace Ventura: When Nature Calls (1995) Comedy	1	Adventure Children	Tom and Huck (1995)	8	7		
10 11 American President, The (1995) Comedy Drama Romance 11 12 Dracula: Dead and Loving It (1995) Comedy Horror 12 13 Balto (1995) Adventure Animation Children 13 14 Nixon (1995) Drama 14 15 Cutthroat Island (1995) Action Adventure Romance 15 16 Casino (1995) Crime Drama 16 17 Sense and Sensibility (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 19 Ace Ventura: When Nature Calls (1995) Comedy	1	Action	Sudden Death (1995)	9	8		
10 11 (1995) Comedy Drama Romance 11 12 Dracula: Dead and Loving It (1995) Comedy Horror 12 13 Balto (1995) Adventure Animation Children 13 14 Nixon (1995) Drama 14 15 Cutthroat Island (1995) Action Adventure Romance 15 16 Casino (1995) Crime Drama 16 17 Sense and Sensibility (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 19 Ace Ventura: When Nature Calls (1995) Comedy	٢	Action Adventure Thrille	GoldenEye (1995)	10	9		
11 12 (1995) Comedy Horror 12 13 Balto (1995) Adventure Animation Children 13 14 Nixon (1995) Drama 14 15 Cutthroat Island (1995) Action Adventure Romance 15 16 Casino (1995) Crime Drama 16 17 Sense and Sensibility (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 19 Ace Ventura: When Nature Calls (1995) Comedy	ì	Comedy Drama Romance	•	11	10		
13 14 Nixon (1995) Drama 14 15 Cutthroat Island (1995) Action Adventure Romance 15 16 Casino (1995) Crime Drama 16 17 Sense and Sensibility (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 19 Ace Ventura: When Nature Calls (1995) Comedy	٢	Comedy Horro		12	11		
14 15 Cutthroat Island (1995) Action Adventure Romance 15 16 Casino (1995) Crime Drama 16 17 Sense and Sensibility (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 19 Ace Ventura: When Nature Calls (1995) Comedy	1	Adventure Animation Children	Balto (1995)	13	12		
15 16 Casino (1995) Crime Drama 16 17 Sense and Sensibility (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 19 Ace Ventura: When Nature Calls (1995) Comedy	ì	Drama	Nixon (1995)	14	13		
16 17 Sense and Sensibility (1995) Drama Romance 17 18 Four Rooms (1995) Comedy 18 19 Ace Ventura: When Nature Calls (1995) Comedy	ì	Action Adventure Romance	Cutthroat Island (1995)	15	14		
17 18 Four Rooms (1995) Comedy 18 19 Ace Ventura: When Nature Calls (1995) Comedy	ì	Crime Drama	Casino (1995)	16	15		
18 19 Ace Ventura: When Nature Comedy Calls (1995)	ž	Drama Romance	Sense and Sensibility (1995)	17	16		
Calls (1995)	,	Comedy	Four Rooms (1995)	18	17		
19 20 Money Train (1995) Action Comedy Crime Drama Thriller	,	Comedy		19	18		
		Action Comedy Crime Drama Thrille	Money Train (1995)	20	19		

In [77]: tags.head()

```
Out[77]:
              userld movield
                                       tag
                                                    timestamp
           0
                  18
                         4141 Mark Waters 2009-04-24 18:19:40
           1
                  65
                          208
                                  dark hero 2013-05-10 01:41:18
           2
                  65
                          353
                                  dark hero 2013-05-10 01:41:19
           3
                  65
                          521
                                 noir thriller 2013-05-10 01:39:43
           4
                  65
                          592
                                  dark hero 2013-05-10 01:41:18
 In [95]: rating.head()
 Out[95]:
              userId movieId rating
                                               timestamp
           0
                            2
                                  3.5 2005-04-02 23:53:47
           1
                           29
                                  3.5 2005-04-02 23:31:16
           2
                           32
                                  3.5 2005-04-02 23:33:39
           3
                                  3.5 2005-04-02 23:32:07
                            50
                                  3.5 2005-04-02 23:29:40
 In [97]: del ratings['timestamp']
           del tags['timestamp']
           data structures
In [100...
           row_0=tags.iloc[0]
           type(row_0)
Out[100...
           pandas.core.series.Series
In [102...
           print(row_0)
         userId
                               18
                             4141
         movieId
                     Mark Waters
         tag
         Name: 0, dtype: object
In [104...
          row_0.index
Out[104...
          Index(['userId', 'movieId', 'tag'], dtype='object')
In [106...
           row_0['userId']
Out[106...
           18
In [108...
           'rating' in row_0
Out[108...
           False
```

In [110...

row_0.name

```
In [112...
           row_0=row_0.rename('firstRow')
           row_0.name
Out[112...
           'firstRow'
           dataframes
In [115...
           tags.head()
Out[115...
              userld movield
                                       tag
           0
                  18
                         4141
                               Mark Waters
                                  dark hero
           1
                  65
                          208
                                  dark hero
           2
                  65
                          353
                                 noir thriller
           3
                  65
                          521
                                  dark hero
           4
                  65
                          592
In [117...
           tags.index
           RangeIndex(start=0, stop=465564, step=1)
Out[117...
In [119...
           tags.columns
           Index(['userId', 'movieId', 'tag'], dtype='object')
Out[119...
In [121...
           tags.iloc[[0,11,500]]
Out[121...
                 userld movield
                                             tag
             0
                    18
                            4141
                                      Mark Waters
                            1783
            11
                    65
                                       noir thriller
           500
                   342
                          55908 entirely dialogue
           Descriptive statistics
           ratings['rating'].describe()
In [124...
Out[124...
           count
                     2.000026e+07
                     3.525529e+00
           mean
           std
                     1.051989e+00
           min
                     5.000000e-01
           25%
                     3.000000e+00
           50%
                     3.500000e+00
```

4.000000e+00

5.000000e+00

Name: rating, dtype: float64

75%

max

Out[110...

```
ratings.describe()
In [126...
Out[126...
                       userld
                                   movield
                                                   rating
          count 2.000026e+07
                               2.000026e+07
                                            2.000026e+07
                6.904587e+04 9.041567e+03
                                            3.525529e+00
           mean
                 4.003863e+04 1.978948e+04 1.051989e+00
            min
                 1.000000e+00 1.000000e+00
                                            5.000000e-01
            25%
                 3.439500e+04 9.020000e+02 3.000000e+00
            50%
                6.914100e+04 2.167000e+03 3.500000e+00
            75%
                 1.036370e+05 4.770000e+03 4.000000e+00
            max 1.384930e+05 1.312620e+05
                                            5.000000e+00
          ratings['rating'].mean()
In [128...
Out[128...
          3.5255285642993797
In [130...
          ratings.mean()
                   69045.872583
Out[130...
          userId
          movieId
                     9041.567330
                          3.525529
          rating
          dtype: float64
          ratings['rating'].max()
In [132...
          5.0
Out[132...
In [134...
          ratings['rating'].std()
Out[134...
          1.051988919275684
In [136...
          ratings['rating'].mode()
Out[136...
          Name: rating, dtype: float64
          ratings.corr()
In [138...
Out[138...
                      userld
                              movield
                                         rating
                    1.000000
                             -0.000850
                                       0.001175
            userId
                   -0.000850
                             1.000000 0.002606
          movield
                    rating
In [142...
          filter1=ratings['rating']>10
          print(filter1)
          filter1.any()
```

```
0
                    False
        1
                    False
        2
                    False
                    False
                    False
                    . . .
        20000258 False
        20000259 False
        20000260 False
        20000261 False
        20000262 False
        Name: rating, Length: 20000263, dtype: bool
Out[142... False
In [144...
         filter2=ratings['rating']>0
         filter2.all()
Out[144... True
         data cleaning:handling missing data
In [151...
         movies.shape
Out[151...
         (27278, 3)
In [153...
         movies.isnull().any().any()
Out[153...
          False
```

. thats nice!no null values!

ratings.isnull().any().any()

tags.isnull().any().any()

tags.isnull().any().any()

tags=tags.dropna()

. we have some tags which are NULL.

ratings.shape

(20000263, 3)

False

True

False

tags.shape

(465564, 3)

In [156...

Out[156...

In [158...

Out[158...

In [160...

Out[160...

In [162...

Out[162...

In [165...

In [167...

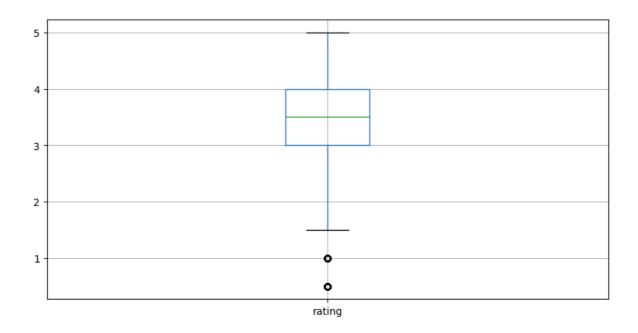
Out[167...

```
In [169... tags.shape
Out[169... (465548, 3)
```

. thats nice! No NULL values! Notice the njmber of lines have reduced.

data viisualization

```
In [209... ratings.boxplot(column='rating',figsize=(10,5))
    plt.show()
```

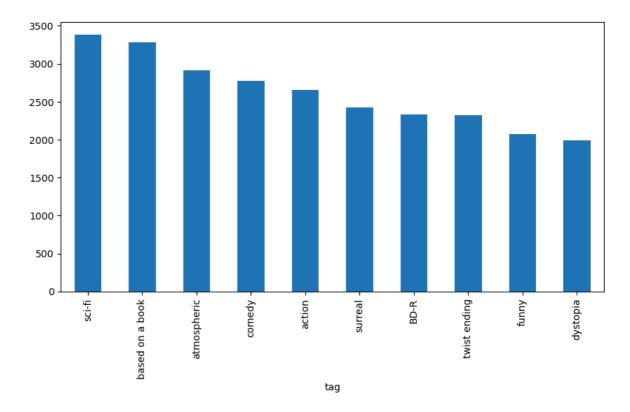


slicing out columns

```
In [214...
           tags['tag'].head()
Out[214...
                  Mark Waters
            1
                      dark hero
                      dark hero
            3 noir thriller
                      dark hero
            Name: tag, dtype: object
           movies[['title','genres']].head()
In [216...
Out[216...
                                       title
                                                                                 genres
            0
                             Toy Story (1995) Adventure|Animation|Children|Comedy|Fantasy
            1
                              Jumanji (1995)
                                                               Adventure|Children|Fantasy
                    Grumpier Old Men (1995)
            2
                                                                       Comedy|Romance
            3
                      Waiting to Exhale (1995)
                                                                Comedy|Drama|Romance
               Father of the Bride Part II (1995)
                                                                               Comedy
In [218...
           rating[-10:]
```

	userId	movield	rating	timestamp
20000253	138493	60816	4.5	2009-12-03 18:32:43
20000254	138493	61160	4.0	2009-11-16 16:55:37
20000255	138493	65682	4.5	2009-10-17 21:52:53
20000256	138493	66762	4.5	2009-10-17 18:50:08
20000257	138493	68319	4.5	2009-12-07 18:15:20
20000258	138493	68954	4.5	2009-11-13 15:42:00
20000259	138493	69526	4.5	2009-12-03 18:31:48
20000260	138493	69644	3.0	2009-12-07 18:10:57
20000261	138493	70286	5.0	2009-11-13 15:42:24
20000262	138493	71619	2.5	2009-10-17 20:25:36

```
In [220...
          tag_counts=tags['tag'].value_counts()
          tag_counts[-10:]
Out[220... tag
           missing child
                                              1
           Ron Moore
           Citizen Kane
                                              1
           mullet
                                              1
           biker gang
                                              1
           Paul Adelstein
                                              1
           the wig
                                             1
           \quad \hbox{killer fish} \quad
           genetically modified monsters
           topless scene
                                              1
           Name: count, dtype: int64
          tag_counts[:10].plot(kind='bar',figsize=(10,5))
In [228...
           plt.show()
```



In [230... is_highly_rated=ratings['rating']>=5.0
ratings[is_highly_rated][30:50]

0	F 2 2 0
UUT	230

	userId	movield	rating
239	3	50	5.0
242	3	175	5.0
244	3	223	5.0
245	3	260	5.0
246	3	316	5.0
247	3	318	5.0
248	3	329	5.0
252	3	457	5.0
253	3	480	5.0
254	3	490	5.0
256	3	541	5.0
258	3	593	5.0
263	3	858	5.0
264	3	904	5.0
267	3	924	5.0
268	3	953	5.0
271	3	1060	5.0
272	3	1073	5.0
275	3	1084	5.0
276	3	1089	5.0

In [232... is_action=movies['genres'].str.contains('Action')
 movies[is_action][5:15]

genres	title	movield	
Action Crime Thriller	Assassins (1995)	23	22
Action Crime Drama	Dead Presidents (1995)	42	41
Action Adventure Fantasy	Mortal Kombat (1995)	44	43
Action Drama Thriller	Guardian Angel (1994)	51	50
Action Sci-Fi Thriller	Lawnmower Man 2: Beyond Cyberspace (1996)	66	65
Action Comedy Horror Thriller	From Dusk Till Dawn (1996)	70	69
Action	Fair Game (1995)	71	70
Action Sci-Fi Thriller	Screamers (1995)	76	75
Action Crime Drama Thriller	Crossing Guard, The (1995)	78	77
Action Adventure Drama	White Squall (1996)	86	85

In [234...

movies[is_action].head(15)

Out[234...

	movield	title	genres
5	6	Heat (1995)	Action Crime Thriller
8	9	Sudden Death (1995)	Action
9	10	GoldenEye (1995)	Action Adventure Thriller
14	15	Cutthroat Island (1995)	Action Adventure Romance
19	20	Money Train (1995)	Action Comedy Crime Drama Thriller
22	23	Assassins (1995)	Action Crime Thriller
41	42	Dead Presidents (1995)	Action Crime Drama
43	44	Mortal Kombat (1995)	Action Adventure Fantasy
50	51	Guardian Angel (1994)	Action Drama Thriller
65	66	Lawnmower Man 2: Beyond Cyberspace (1996)	Action Sci-Fi Thriller
69	70	From Dusk Till Dawn (1996)	Action Comedy Horror Thriller
70	71	Fair Game (1995)	Action
75	76	Screamers (1995)	Action Sci-Fi Thriller
77	78	Crossing Guard, The (1995)	Action Crime Drama Thriller
85	86	White Squall (1996)	Action Adventure Drama

Group By snd Aggregate

```
Out[237...
                  movield
           rating
              0.5
                   239125
              1.0
                   680732
                   279252
              1.5
                 1430997
              2.0
              2.5
                   883398
              3.0 4291193
              3.5 2200156
              4.0 5561926
              4.5 1534824
                 2898660
              5.0
           average_rating=ratings[['movieId','rating']].groupby('movieId').mean()
In [243...
           average_rating.head()
Out[243...
                      rating
           movield
                 1 3.921240
                 2 3.211977
                 3 3.151040
                   2.861393
                 5 3.064592
          movie_count=ratings[['movieId','rating']].groupby('movieId').count()
In [245...
          movie_count.head()
Out[245...
                    rating
           movield
                    49695
                    22243
                    12735
                     2756
                 5 12161
          movie_count=ratings[['movieId','rating']].groupby('movieId').count()
In [249...
          movie_count.tail()
```

merge dataframes

In [252...

tags.head()

Out[252...

	userId	movield	tag
0	18	4141	Mark Waters
1	65	208	dark hero
2	65	353	dark hero
3	65	521	noir thriller
4	65	592	dark hero

In [254... movies.head()

Out[254...

	movield	title	genres
0	1	Toy Story (1995)	Adventure Animation Children Comedy Fantasy
1	2	Jumanji (1995)	Adventure Children Fantasy
2	3	Grumpier Old Men (1995)	Comedy Romance
3	4	Waiting to Exhale (1995)	Comedy Drama Romance
4	5	Father of the Bride Part II (1995)	Comedy

In [256...

t=movies.merge(tags,on='movieId',how='inner') t.head()

Jult [256	movi	eia	titie		genres	useri	a	tag
	0	1	Toy Story (1995)	Adventure Animation Child	lren Comedy Fantasy	164	4 Wa	tched
	1	1	Toy Story (1995)	Adventure Animation Child	lren Comedy Fantasy	174	I	nputer nation
	2	1	Toy Story (1995)	Adventure Animation Child	lren Comedy Fantasy	174	1 anir	Disney mated eature
	3	1	Toy Story (1995)	Adventure Animation Child	Iren Comedy Fantasy	174	1 anim	Pixar nation
	4	1	Toy Story (1995)	Adventure Animation Chilo	Iren Comedy Fantasy	174	star i	Leoni es not in this movie
	combine	agg	greagatio	n,merging,and filters to g	et useful analytics			
in [267		_rat	ings['us	.groupby('movieId',as serId']	_index= False).mean	()		
ut[267	movi	eld	rating)				
	0	1	3.921240)				
	1	2	3.211977	7				
	2	3	3.151040)				
	3	4	2.861393	3				
	4	5	3.064592	2				
n [269	box_offi			nerge(avg_ratings,on='r	novieId',how='inne	r')		
ut[269		mov	ield	title	ge	enres	rating	
	26739	131	1254 Ke	in Bund für's Leben (2007)	Cor	medy	4.0	
	26740	131	1256 Feu	er, Eis & Dosenbier (2002)	Cor	medy	4.0	
	26741	131	1258	The Pirates (2014)	Adve	nture	2.5	
	26742	131	1260	Rentun Ruusu (2001)	(no genres li	sted)	3.0	
	26743	131	1262	Innocence (2014)	Adventure Fantasy H	orror	4.0	
n [271				pox_office['rating'] >= Ly_rated][-5:]	= 4.0			

genres userId

tag

Out[256... movield

title

Out[271		movield	title	genres	rating
	26737	131250	No More School (2000)	Comedy	4.0
	26738	131252	Forklift Driver Klaus: The First Day on the Jo	Comedy Horror	4.0
	26739	131254	Kein Bund für's Leben (2007)	Comedy	4.0
	26740	131256	Feuer, Eis & Dosenbier (2002)	Comedy	4.0
	26743	131262	Innocence (2014)	Adventure Fantasy Horror	4.0
In [273	is_Adve	enture=box	_office['genres'].str.contains('	Adventure')	

box_office[is_Adventure][:5]

Out[273...

	movield	title	genres	rating
0	1	Toy Story (1995)	Adventure Animation Children Comedy Fantasy	3.921240
1	2	Jumanji (1995)	Adventure Children Fantasy	3.211977
7	8	Tom and Huck (1995)	Adventure Children	3.142049
9	10	GoldenEye (1995)	Action Adventure Thriller	3.430029
12	13	Balto (1995)	Adventure Animation Children	3.272416

In [275...

box_office[is_Adventure&is_highly_rated][-5:]

Out[275...

	movield	title	genres	rating
26611	130586	Itinerary of a Spoiled Child (1988)	Adventure Drama	4.5
26655	130996	The Beautiful Story (1992)	Adventure Drama Fantasy	5.0
26667	131050	Stargate SG-1 Children of the Gods - Final Cut	Adventure Sci-Fi Thriller	5.0
26736	131248	Brother Bear 2 (2006)	Adventure Animation Children Comedy Fantasy	4.0
26743	131262	Innocence (2014)	Adventure Fantasy Horror	4.0

vectorized string operations

In [278...

movies.head()

Out[278	movield		title	genres		
	0	1	Toy Story (1995)	Adventure Animation Children Comedy Fantasy		
	1	2	Jumanji (1995)	Adventure Children Fantasy		
	2	3	Grumpier Old Men (1995)	Comedy Romance		
	3	4	Waiting to Exhale (1995)	Comedy Drama Romance		
	4	5	Father of the Bride Part II (1995)	Comedy		

split 'genres' into multiple columns

In [281	<pre>movie_genres=movies['genres'].str.split('1',expand=True)</pre>							
In [283	movie_genres[:10]							
Out[283		0	1	2	3	4		
	0	Adventure Animation Chi	dren Comedy Fantasy	None	None	None		
	1	Adventure Chi	dren Fantasy	None	None	None		
	2	Comedy Romance	None	None	None	None		
	3	Comedy Drama Romance	None	None	None	None		
	4	Comedy	None	None	None	None		
	5	Action Crime Thri		er	None	None		
	6	Comedy Romance	None	None	None	None		
	7	Adventure Chi	dren	None	None	None		
	8	Action	None	None	None	None		
	9	Action Adventure Thri		er	None	None		

add a new column for comedy genre flag

```
In [288... movie_genres['isComedy']=movies['genres'].str.contains('Comedy')
In [290... movie_genres[:10]
```

	· ·	•	_	,		iscomedy
0	Adventure Animation Chi	dren Comedy Fantasy	None	None	None	True
1	Adventure Chi	dren Fantasy	None	None	None	False
2	Comedy Romance	None	None	None	None	True
3	Comedy Drama Romance	None	None	None	None	True
4	Comedy	None	None	None	None	True
5	Action Crime Thri		er	None	None	False
6	Comedy Romance	None	None	None	None	True
7	Adventure Chi	dren	None	None	None	False
8	Action	None	None	None	None	False

isComedy

False

er None None

Extract year from title e.g.(2007)

Action|Adventure|Thri

0

Out[290...

```
In [299...
           movies['year']=movies['title'].str.extract('.*\((.*)\).*',expand=True)
          <>:1: SyntaxWarning: invalid escape sequence '\('
         <>:1: SyntaxWarning: invalid escape sequence '\('
         C:\Users\91630\AppData\Local\Temp\ipykernel_19688\3287904146.py:1: SyntaxWarning:
         invalid escape sequence '\('
           movies['year']=movies['title'].str.extract('.*\((.*)\).*',expand=True)
In [302...
           movies.tail()
Out[302...
                   movield
                                                  title
                                                                        genres
                                                                                year
           27273
                    131254
                             Kein Bund für's Leben (2007)
                                                                                2007
                                                                       Comedy
           27274
                    131256
                            Feuer, Eis & Dosenbier (2002)
                                                                       Comedy
                                                                                2002
                                                                               2014
           27275
                    131258
                                      The Pirates (2014)
                                                                     Adventure
           27276
                    131260
                                    Rentun Ruusu (2001)
                                                               (no genres listed)
                                                                               2001
           27277
                    131262
                                       Innocence (2014) Adventure|Fantasy|Horror 2014
```

parsing Timestamps

```
In [309... tags.dtypes

Out[309... userId int64
    movieId int64
    tag object
    dtype: object

In [311... tags.head(5)
```

Out[311		userId	movield	tag
	0	18	4141	Mark Waters
	1	65	208	dark hero
	2	65	353	dark hero
	3	65	521	noir thriller
	4	65	592	dark hero

In [313... tags['parsed_time']=pd.to_datetime(tags['timestamp'],unit='s')

```
KeyError
                                         Traceback (most recent call last)
File ~\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3805, in Index.get
_loc(self, key)
  3804 try:
-> 3805
            return self._engine.get_loc(casted_key)
   3806 except KeyError as err:
File index.pyx:167, in pandas._libs.index.IndexEngine.get_loc()
File index.pyx:196, in pandas._libs.index.IndexEngine.get_loc()
File pandas\\_libs\\hashtable_class_helper.pxi:7081, in pandas._libs.hashtable.Py
ObjectHashTable.get_item()
File pandas\\_libs\\hashtable_class_helper.pxi:7089, in pandas._libs.hashtable.Py
ObjectHashTable.get_item()
KeyError: 'timestamp'
The above exception was the direct cause of the following exception:
KeyError
                                         Traceback (most recent call last)
Cell In[313], line 1
----> 1 tags['parsed_time']=pd.to_datetime(tags['timestamp'],unit='s')
File ~\anaconda3\Lib\site-packages\pandas\core\frame.py:4102, in DataFrame.__geti
tem__(self, key)
  4100 if self.columns.nlevels > 1:
  4101
           return self._getitem_multilevel(key)
-> 4102 indexer = self.columns.get_loc(key)
  4103 if is_integer(indexer):
   4104
            indexer = [indexer]
File ~\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3812, in Index.get
_loc(self, key)
  3807
          if isinstance(casted_key, slice) or (
  3808
               isinstance(casted_key, abc.Iterable)
               and any(isinstance(x, slice) for x in casted_key)
  3809
   3810
               raise InvalidIndexError(key)
  3811
-> 3812
          raise KeyError(key) from err
  3813 except TypeError:
          # If we have a listlike key, _check_indexing_error will raise
  3814
          # InvalidIndexError. Otherwise we fall through and re-raise
  3815
  3816
          # the TypeError.
   3817
          self._check_indexing_error(key)
KeyError: 'timestamp'
```

```
KeyError
                                                   Traceback (most recent call last)
         File ~\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3805, in Index.get
         _loc(self, key)
           3804 try:
         -> 3805
                     return self._engine.get_loc(casted_key)
            3806 except KeyError as err:
         File index.pyx:167, in pandas._libs.index.IndexEngine.get_loc()
         File index.pyx:196, in pandas._libs.index.IndexEngine.get_loc()
         File pandas\\_libs\\hashtable_class_helper.pxi:7081, in pandas._libs.hashtable.Py
         ObjectHashTable.get_item()
         File pandas\\_libs\\hashtable_class_helper.pxi:7089, in pandas._libs.hashtable.Py
         ObjectHashTable.get_item()
         KeyError: 'parsed_time'
         The above exception was the direct cause of the following exception:
         KeyError
                                                   Traceback (most recent call last)
         Cell In[317], line 1
         ----> 1 tags['parsed_time'].dtype
         File ~\anaconda3\Lib\site-packages\pandas\core\frame.py:4102, in DataFrame.__geti
         tem__(self, key)
           4100 if self.columns.nlevels > 1:
           4101
                     return self._getitem_multilevel(key)
         -> 4102 indexer = self.columns.get_loc(key)
           4103 if is_integer(indexer):
            4104
                     indexer = [indexer]
         File ~\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3812, in Index.get
         _loc(self, key)
            3807
                   if isinstance(casted_key, slice) or (
            3808
                         isinstance(casted_key, abc.Iterable)
                         and any(isinstance(x, slice) for x in casted_key)
           3809
            3810
                         raise InvalidIndexError(key)
           3811
         -> 3812
                   raise KeyError(key) from err
           3813 except TypeError:
                    # If we have a listlike key, _check_indexing_error will raise
            3814
                     # InvalidIndexError. Otherwise we fall through and re-raise
           3815
            3816
                   # the TypeError.
            3817
                     self._check_indexing_error(key)
        KeyError: 'parsed_time'
In [319...
         tags.head(2)
```

Out[319...

1

65

userIdmovieldtag0184141Mark Waters

208

dark hero

```
In [333...
greater_than_t=tags['parsed_time']>'2015-02-01'
selected_rows=tags[greater_than_t]
tags.shape,selected_rows.shape
```

```
KeyError
                                          Traceback (most recent call last)
File ~\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3805, in Index.get
_loc(self, key)
  3804 try:
-> 3805
            return self._engine.get_loc(casted_key)
   3806 except KeyError as err:
File index.pyx:167, in pandas._libs.index.IndexEngine.get_loc()
File index.pyx:196, in pandas._libs.index.IndexEngine.get_loc()
File pandas\\_libs\\hashtable_class_helper.pxi:7081, in pandas._libs.hashtable.Py
ObjectHashTable.get_item()
File pandas\\_libs\\hashtable_class_helper.pxi:7089, in pandas._libs.hashtable.Py
ObjectHashTable.get_item()
KeyError: 'parse_time'
The above exception was the direct cause of the following exception:
KeyError
                                          Traceback (most recent call last)
Cell In[333], line 1
----> 1 greater_than_t=tags['parse_time']>'2015-02-01'
      2 selected_rows=tags[greater_than_t]
      3 tags.shape,selected_rows.shape
File ~\anaconda3\Lib\site-packages\pandas\core\frame.py:4102, in DataFrame.__geti
tem__(self, key)
  4100 if self.columns.nlevels > 1:
           return self._getitem_multilevel(key)
-> 4102 indexer = self.columns.get loc(key)
  4103 if is_integer(indexer):
            indexer = [indexer]
  4104
File ~\anaconda3\Lib\site-packages\pandas\core\indexes\base.py:3812, in Index.get
_loc(self, key)
  3807
            if isinstance(casted key, slice) or (
                isinstance(casted_key, abc.Iterable)
   3808
   3809
                and any(isinstance(x, slice) for x in casted_key)
  3810
           ):
  3811
                raise InvalidIndexError(key)
-> 3812
          raise KeyError(key) from err
  3813 except TypeError:
  3814
          # If we have a listlike key, _check_indexing_error will raise
   3815
          # InvalidIndexError. Otherwise we fall through and re-raise
           # the TypeError.
   3816
  3817
          self._check_indexing_error(key)
KeyError: 'parse_time'
```

```
KeyError
                                                   Traceback (most recent call last)
         ~\AppData\Local\Temp\ipykernel_19688\3410031928.py in ?()
         ---> 1 tags.sort_values(by='parsed_time', ascending=True)[:10]
         ~\anaconda3\Lib\site-packages\pandas\core\frame.py in ?(self, by, axis, ascendin
         g, inplace, kind, na_position, ignore_index, key)
            7185
                         elif len(by):
            7186
            7187
                             \# len(by) == 1
            7188
         -> 7189
                             k = self._get_label_or_level_values(by[0], axis=axis)
            7190
            7191
                             # need to rewrap column in Series to apply key function
            7192
                             if key is not None:
         ~\anaconda3\Lib\site-packages\pandas\core\generic.py in ?(self, key, axis)
                             values = self.xs(key, axis=other_axes[0])._values
            1907
            1908
                         elif self._is_level_reference(key, axis=axis):
            1909
                             values = self.axes[axis].get_level_values(key)._values
            1910
                         else:
         -> 1911
                             raise KeyError(key)
            1912
            1913
                         # Check for duplicates
                         if values.ndim > 1:
            1914
         KeyError: 'parsed_time'
          average_rating = ratings[['movieId', 'rating']].groupby('movieId', as_index=False
In [337...
          average_rating.tail()
Out[337...
                 movield rating
          26739
                   131254
                             4.0
          26740
                   131256
                             4.0
          26741
                   131258
                             2.5
          26742
                   131260
                             3.0
          26743
                   131262
                             4.0
In [339...
          joined = movies.merge(average_rating, on='movieId', how='inner')
```

joined.head()
joined.corr()

```
ValueError
                                                 Traceback (most recent call last)
       Cell In[339], line 3
             1 joined = movies.merge(average_rating, on='movieId', how='inner')
             2 joined.head()
       ----> 3 joined.corr()
       File ~\anaconda3\Lib\site-packages\pandas\core\frame.py:11049, in DataFrame.corr
       (self, method, min_periods, numeric_only)
        11047 cols = data.columns
         11048 idx = cols.copy()
       > 11049 mat = data.to_numpy(dtype=float, na_value=np.nan, copy=False)
        11051 if method == "pearson":
                   correl = libalgos.nancorr(mat, minp=min_periods)
         11052
       File ~\anaconda3\Lib\site-packages\pandas\core\frame.py:1993, in DataFrame.to_num
       py(self, dtype, copy, na_value)
          1991 if dtype is not None:
         1992
                   dtype = np.dtype(dtype)
       -> 1993 result = self._mgr.as_array(dtype=dtype, copy=copy, na_value=na_value)
         1994 if result.dtype is not dtype:
          1995
                   result = np.asarray(result, dtype=dtype)
       File ~\anaconda3\Lib\site-packages\pandas\core\internals\managers.py:1694, in Blo
       ckManager.as_array(self, dtype, copy, na_value)
          1692
                      arr.flags.writeable = False
         1693 else:
       -> 1694
                 arr = self._interleave(dtype=dtype, na_value=na_value)
                   # The underlying data was copied within _interleave, so no need
         1695
         1696
                  # to further copy if copy=True or setting na_value
         1698 if na_value is lib.no_default:
       File ~\anaconda3\Lib\site-packages\pandas\core\internals\managers.py:1753, in Blo
       ckManager._interleave(self, dtype, na_value)
         1751
                 else:
         1752
                       arr = blk.get_values(dtype)
       -> 1753
                  result[rl.indexer] = arr
         1754
                   itemmask[rl.indexer] = 1
         1756 if not itemmask.all():
      ValueError: could not convert string to float: 'Toy Story (1995)'
In [ ]:
```