```
In [13]: import numpy as np
import pandas as pd
```

In [15]: rating = pd.read_csv(r'C:\Users\kavya\Downloads\archive\rating.csv')

In [16]: rating

Out[16]:

	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 [17]: taggings = pd.read_csv(r'C:\Users\kavya\Downloads\archive\tag.csv')
```

In [18]: taggings

Out[18]:		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

[19]:	<pre>movie = pd.read_csv(r'C:\Users\kavya\Downloads\archive\movie.csv')</pre>				
[20]:	movie				
t[20]:		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	
	•••				
	27273	131254	Kein Bund für's Leben (2007)	Comedy	
	27274	131256	Feuer, Eis & Dosenbier (2002)	Comedy	
	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 [21]: rating.head()

Out[21]:		userId	movield	rating	tin	nestamp
	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
In [22]:	ta	ggings.	head()			
Out[22]:		userId	movield		tag	timesta

Out[22]:		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
	1	65	502	dark hero	2013-05-10 01-41-18

In [23]: movie.head()

Out[23]:		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 [24]: movie.columns
```

Out[24]: Index(['movieId', 'title', 'genres'], dtype='object')

In [25]: taggings.columns

Out[25]: Index(['userId', 'movieId', 'tag', 'timestamp'], dtype='object')

In [26]: rating.columns

Out[26]: Index(['userId', 'movieId', 'rating', 'timestamp'], dtype='object')

In [27]: del taggings['timestamp']

In [28]: taggings.columns

Out[28]: Index(['userId', 'movieId', 'tag'], dtype='object')

```
In [29]: del rating ['timestamp']
In [30]: rating.columns
Out[30]: Index(['userId', 'movieId', 'rating'], dtype='object')
In [31]: row_0 = taggings.iloc[0]
type(row_0)
Out[31]: pandas.core.series.Series
```

datastructures

dataframes

```
In [37]: taggings.head()
Out[37]:
             userld movield
                                       tag
          0
                 18
                        4141
                              Mark Waters
          1
                 65
                         208
                                 dark hero
          2
                 65
                         353
                                 dark hero
          3
                 65
                         521
                                noir thriller
                 65
                         592
                                 dark hero
In [38]: taggings.index
Out[38]: RangeIndex(start=0, stop=465564, step=1)
In [39]: taggings.columns
```

Out[39]: Index(['userId', 'movieId', 'tag'], dtype='object')

```
taggings.iloc[[0,11,500]]
In [40]:
Out[40]:
                userld
                        movield
                                              tag
             0
                    18
                            4141
                                      Mark Waters
            11
                    65
                            1783
                                        noir thriller
           500
                   342
                           55908
                                  entirely dialogue
In [41]:
          rating.iloc[[2,67,599]]
Out[41]:
                userId movieId rating
             2
                     1
                              32
                                      3.5
                            1997
                                      3.5
            67
                     7
           599
                            1097
                                     4.0
In [42]:
          movie.iloc[[3,5,100]]
Out[42]:
                                            title
                movield
                                                                   genres
                          Waiting to Exhale (1995) Comedy|Drama|Romance
             3
                       6
                                      Heat (1995)
                                                       Action|Crime|Thriller
           100
                     102
                                Mr. Wrong (1996)
                                                                  Comedy
```

descriptive statistics

```
In [44]:
         rating['rating'].describe()
Out[44]:
          count
                   2.000026e+07
                   3.525529e+00
          mean
          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
         rating.describe()
In [45]:
```

```
Out[45]:
                      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 5.000000e-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
In [46]:
         rating.mean()
Out[46]:
         userId
                   69045.872583
         movieId
                     9041.567330
                        3.525529
         rating
         dtype: float64
In [47]:
         rating.min()
                    1.0
Out[47]:
         userId
                    1.0
         movieId
         rating
                    0.5
         dtype: float64
In [48]:
         rating.max()
Out[48]: userId
                    138493.0
         movieId
                    131262.0
         rating
                         5.0
         dtype: float64
In [49]:
         rating.std()
Out[49]: userId
                    40038.626653
         movieId
                    19789.477445
         rating
                        1.051989
         dtype: float64
In [50]: rating.mode()
Out[50]:
             userld movield rating
         0 118205
                        296
                                4.0
In [51]: rating.corr()
```

```
Out[51]:
                       userId
                                movield
                                           rating
            userId
                    1.000000
                              -0.000850 0.001175
          movield
                   -0.000850
                               1.000000
                                         0.002606
            rating
                     0.001175
                               0.002606
                                        1.000000
In [52]:
         filter1 = rating['rating']>10
          print(filter1)
          filter1.any()
         0
                      False
         1
                      False
         2
                      False
         3
                      False
         4
                      False
                      . . .
         20000258
                   False
         20000259
                   False
         20000260
                     False
         20000261
                     False
         20000262
                    False
        Name: rating, Length: 20000263, dtype: bool
Out[52]: False
In [53]: filter2 = rating['rating'] >0
          filter2.all()
Out[53]: True
          movie.head()
In [66]:
Out[66]:
                                              title
                                                                                       genres
              movield
          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
                            Father of the Bride Part II
                    5
          4
                                                                                      Comedy
                                            (1995)
In [67]: movie.tail()
```

Out[67]:		movield	title	genres
	27273	131254	Kein Bund für's Leben (2007)	Comedy
	27274	131256	Feuer, Eis & Dosenbier (2002)	Comedy
	27275	131258	The Pirates (2014)	Adventure
	27276	131260	Rentun Ruusu (2001)	(no genres listed)
	27277	131262	Innocence (2014)	Adventure Fantasy Horror

In [56]: movie.describe()

Out[56]:

	movield
count	27278.000000
mean	59855.480570
std	44429.314697
min	1.000000
25%	6931.250000
50%	68068.000000
75 %	100293.250000
max	131262.000000

In [57]: movie.mode()

Out[57]:

	movield	title	genres
0	1	20,000 Leagues Under the Sea (1997)	Drama
1	2	Aladdin (1992)	NaN
2	3	Beneath (2013)	NaN
3	4	Blackout (2007)	NaN
4	5	Casanova (2005)	NaN
•••			
27273	131254	NaN	NaN
27274	131256	NaN	NaN
27275	131258	NaN	NaN
27276	131260	NaN	NaN
27277	131262	NaN	NaN

27278 rows × 3 columns

In [58]:

movie.min()

```
Out[58]: movieId
          title
                     #chicagoGirl: The Social Network Takes on a Di...
          genres
                                                     (no genres listed)
          dtype: object
In [59]: movie.max()
Out[59]: movieId
                          131262
                     貞子3D (2012)
          title
          genres
                         Western
          dtype: object
In [60]: movie.info()
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 27278 entries, 0 to 27277
        Data columns (total 3 columns):
            Column
                     Non-Null Count Dtype
            movieId 27278 non-null int64
             title
                      27278 non-null object
             genres 27278 non-null object
        dtypes: int64(1), object(2)
        memory usage: 639.5+ KB
In [61]: taggings.head()
Out[61]:
             userld movield
                                    tag
          0
                18
                       4141 Mark Waters
                65
                        208
                               dark hero
          2
                65
                        353
                               dark hero
                              noir thriller
                65
                        592
                               dark hero
         taggings.tail()
In [62]:
Out[62]:
                  userld movield
                                            tag
          465559 138446
                            55999
                                        dragged
          465560 138446
                            55999 Jason Bateman
          465561 138446
                                          quirky
                            55999
          465562 138446
                            55999
                                            sad
          465563 138472
                              923
                                    rise to power
```

data cleaning: handling missing data

In [64]: movie.shape

```
Out[64]: (27278, 3)
```

In [114... movie.isnull()

Out[114...

In [122...

	movield	title	genres
0	False	False	False
1	False	False	False
2	False	False	False
3	False	False	False
4	False	False	False
•••			
27273	False	False	False
27274	False	False	False
27275	False	False	False
27276	False	False	False
27277	False	False	False

27278 rows × 3 columns

rating.isnull()

```
In [116... movie.isnull().any().any()
Out[116... False
In [120... rating.shape
Out[120... (20000263, 3)
```

Out[122...

	userId	movield	rating
0	False	False	False
1	False	False	False
2	False	False	False
3	False	False	False
4	False	False	False
•••			
20000258	False	False	False
20000259	False	False	False
20000260	False	False	False
20000261	False	False	False
20000262	False	False	False

20000263 rows × 3 columns

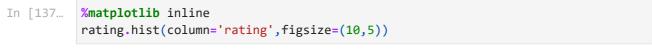
```
In [124...
           rating.isnull().any().any()
Out[124...
           False
In [126...
           taggings.shape
Out[126...
           (465564, 3)
In [128...
           taggings.isnull().any().any()
Out[128...
           True
In [130...
           taggings=taggings.dropna()
In [132...
           taggings
```

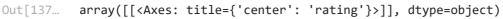
Out[132...

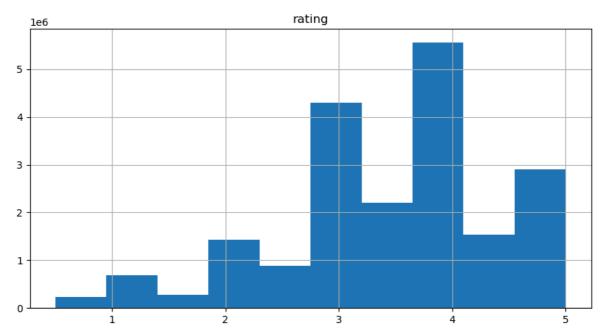
	userId	movield	tag
0	18	4141	Mark Waters
1	65	208	dark hero
2	65	353	dark hero
3	65	521	noir thriller
4	65	592	dark hero
•••			
465559	138446	55999	dragged
465560	138446	55999	Jason Bateman
465561	138446	55999	quirky
465562	138446	55999	sad
465563	138472	923	rise to power

465548 rows × 3 columns

data visualization

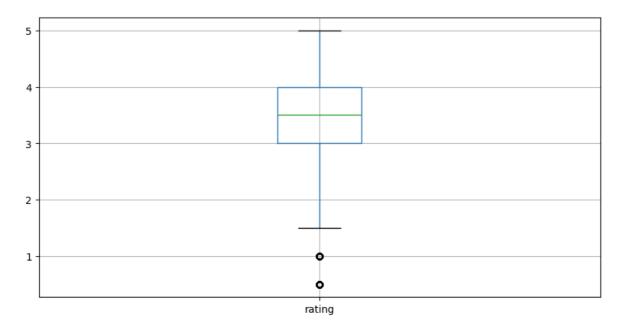






```
In [139... rating.boxplot(column='rating',figsize=(10,5))
```

Out[139... <Axes: >



slicing out columns

In [152	<pre>rating['rating'].head()</pre>				
Out[152	0 1 2 3 4 Na	3.5 3.5 3.5 3.5 3.5 mme: rating, dtype: float64			
In [156	<pre>movie[['title','genres']].head()</pre>				
Out[156		title	genres		
	0	Toy Story (1995)	Adventure Animation Children Comedy Fantasy		
	1	Jumanji (1995)	Adventure Children Fantasy		
	2	Grumpier Old Men (1995)	Comedy Romance		
		Grumpier Old Men (1993)	Conledy Normance		
	3	Waiting to Exhale (1995)	Comedy Drama Romance		
		•			

$\cap \dots + \mid$	[1[0
Uu L	TD0"

	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