```
import pandas as pd
        movies = pd.read_csv(r'D:\Data Science with AI\Data Science With AI\14-july-arch
In [3]:
         movies.head()
Out[3]:
             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
                             Waiting to Exhale (1995)
                                                                         Comedy|Drama|Romance
                    4
                            Father of the Bride Part II
                    5
                                                                                        Comedy
          4
                                             (1995)
         movies.head(2)
In [4]:
Out[4]:
             movield
                                 title
                                                                            genres
          0
                       Toy Story (1995)
                                      Adventure|Animation|Children|Comedy|Fantasy
                    2
                                                         Adventure|Children|Fantasy
                        Jumanji (1995)
In [5]:
         ratings=pd.read_csv(r'D:\Data Science with AI\Data Science With AI\14-july-archi
In [6]:
         ratings
Out[6]:
                              movield
                      userId
                                       rating
                                                        timestamp
                  0
                                     2
                                                2005-04-02 23:53:47
                                           3.5
                  1
                                    29
                                                2005-04-02 23:31:16
                  2
                           1
                                    32
                                                2005-04-02 23:33:39
                  3
                                   47
                                                2005-04-02 23:32:07
                           1
                  4
                                    50
                                                2005-04-02 23:29:40
          20000258
                     138493
                                68954
                                                2009-11-13 15:42:00
          20000259
                     138493
                                                2009-12-03 18:31:48
                                69526
```

2009-12-07 18:10:57

2009-11-13 15:42:24

2009-10-17 20:25:36

20000263 rows × 4 columns

20000262 138493

138493

138493

69644

70286

71619

In [7]: ratings.show()

20000260

20000261

```
Traceback (most recent call last)
        AttributeError
        ~\AppData\Local\Temp\ipykernel_24696\2593860280.py in ?()
        ---> 1 ratings.show()
        ~\AppData\Roaming\Python\Python312\site-packages\pandas\core\generic.py in ?(sel
        f, name)
           6314
                             and name not in self._accessors
           6315
                             and self._info_axis._can_hold_identifiers_and_holds_name(nam
        e)
           6316
                        ):
           6317
                             return self[name]
        -> 6318
                         return object.__getattribute__(self, name)
        AttributeError: 'DataFrame' object has no attribute 'show'
 In [8]: ratings.shape
 Out[8]: (20000263, 4)
 In [9]: movies.shape
 Out[9]: (27278, 3)
In [10]:
         print(type(movies))
          print(type(ratings))
          print(type(tags))
        <class 'pandas.core.frame.DataFrame'>
        <class 'pandas.core.frame.DataFrame'>
        NameError
                                                   Traceback (most recent call last)
        Cell In[10], line 3
              1 print(type(movies))
              2 print(type(ratings))
        ---> 3 print(type(tags))
        NameError: name 'tags' is not defined
In [11]: | tags=pd.read_csv(r"D:\Data Science with AI\Data Science With AI\14-july-archive\
In [12]: tags.head()
Out[12]:
             userld movield
                                     tag
                                                 timestamp
          0
                       4141 Mark Waters 2009-04-24 18:19:40
                18
          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
                65
                        592
                                dark hero 2013-05-10 01:41:18
In [13]: tags
```

Out

[13]:		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 [14]: print(type(tags))
        <class 'pandas.core.frame.DataFrame'>
In [15]: tags.shape
Out[15]: (465564, 4)
In [16]: tags.columns
Out[16]: Index(['userId', 'movieId', 'tag', 'timestamp'], dtype='object')
In [17]:
         ratings.columns
Out[17]: Index(['userId', 'movieId', 'rating', 'timestamp'], dtype='object')
In [19]: movies.columns
Out[19]: Index(['movieId', 'title', 'genres'], dtype='object')
In [20]:
         del ratings['timestamp']
         del tags['timestamp']
In [21]: ratings.columns
Out[21]: Index(['userId', 'movieId', 'rating'], dtype='object')
In [22]: tags.columns
Out[22]: Index(['userId', 'movieId', 'tag'], dtype='object')
In [23]:
          tags.head()
```

```
Out[23]:
            userld 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 [24]: tags.iloc[0]
Out[24]: userId
                              18
          movieId
                            4141
                   Mark Waters
          tag
          Name: 0, dtype: object
In [25]: tags.iloc[2]
                            65
Out[25]: userId
          movieId
                           353
                    dark hero
          tag
          Name: 2, dtype: object
In [26]: row_0=tags.iloc[0]
In [27]: row_0
Out[27]: userId
                              18
          movieId
                            4141
                    Mark Waters
          tag
          Name: 0, dtype: object
In [28]: print(row_0)
        userId
                            18
        movieId
                          4141
                 Mark Waters
        tag
        Name: 0, dtype: object
In [29]: type(row_0)
Out[29]: pandas.core.series.Series
In [30]: row 0=index
        NameError
                                                  Traceback (most recent call last)
        Cell In[30], line 1
        ----> 1 row_0=index
        NameError: name 'index' is not defined
In [31]: row_0.index
Out[31]: Index(['userId', 'movieId', 'tag'], dtype='object')
```

```
In [32]:
          row 0
          userId
                               18
Out[32]:
          movieId
                             4141
                     Mark Waters
          tag
          Name: 0, dtype: object
         tags.head()
In [33]:
Out[33]:
             userld movield
                                      tag
          0
                 18
                        4141
                              Mark Waters
          1
                 65
                         208
                                dark hero
          2
                 65
                         353
                                dark hero
          3
                         521
                               noir thriller
                 65
          4
                 65
                         592
                                dark hero
In [34]: tags.columns
Out[34]: Index(['userId', 'movieId', 'tag'], dtype='object')
In [35]:
          row_0.index
Out[35]: Index(['userId', 'movieId', 'tag'], dtype='object')
In [36]: row_0[1]
        C:\Users\DELL\AppData\Local\Temp\ipykernel_24696\1082734514.py:1: FutureWarning:
        Series.__getitem__ treating keys as positions is deprecated. In a future version,
        integer keys will always be treated as labels (consistent with DataFrame behavio
        r). To access a value by position, use `ser.iloc[pos]`
          row_0[1]
Out[36]: 4141
          row_0.head()
In [37]:
Out[37]:
          userId
                               18
                             4141
          movieId
                      Mark Waters
          tag
          Name: 0, dtype: object
In [38]: tags.head()
Out[38]:
             userld
                    movield
                                      tag
          0
                 18
                        4141
                              Mark Waters
          1
                 65
                         208
                                dark hero
          2
                 65
                                dark hero
                         353
          3
                 65
                         521
                               noir thriller
                 65
                         592
          4
                                dark hero
```

```
In [39]:
         row_0[1]
        C:\Users\DELL\AppData\Local\Temp\ipykernel_24696\1082734514.py:1: FutureWarning:
        Series. __getitem__ treating keys as positions is deprecated. In a future version,
        integer keys will always be treated as labels (consistent with DataFrame behavio
        r). To access a value by position, use `ser.iloc[pos]`
          row_0[1]
Out[39]: 4141
In [40]: row_0[2]
        C:\Users\DELL\AppData\Local\Temp\ipykernel_24696\1293913282.py:1: FutureWarning:
        Series.__getitem__ treating keys as positions is deprecated. In a future version,
        integer keys will always be treated as labels (consistent with DataFrame behavio
        r). To access a value by position, use `ser.iloc[pos]`
         row_0[2]
Out[40]:
          'Mark Waters'
         row_0['userId']
In [42]:
Out[42]: 18
In [43]:
          'rating' in row_0
Out[43]:
          False
         row_0.name
In [44]:
Out[44]: 0
In [45]:
         row_0=row_0.rename('firstRow')
         row_0.name
Out[45]:
          'firstRow'
In [46]:
         tags.head()
Out[46]:
             userld 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 [47]: tags.head()
```

```
Out[47]:
             userld 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 [48]:
         tags.index
Out[48]: RangeIndex(start=0, stop=465564, step=1)
In [49]: tags.columns
          Index(['userId', 'movieId', 'tag'], dtype='object')
In [50]:
          tags.iloc[[0,11,500]]
Out[50]:
               userld movield
                                            tag
            0
                   18
                          4141
                                    Mark Waters
           11
                   65
                          1783
                                     noir thriller
          500
                  342
                         55908 entirely dialogue
In [51]:
          ratings['rating'].describe()
Out[51]: count
                    2.000026e+07
                    3.525529e+00
          mean
          std
                    1.051989e+00
                    5.000000e-01
          min
          25%
                    3.000000e+00
          50%
                    3.500000e+00
          75%
                    4.000000e+00
                    5.000000e+00
          Name: rating, dtype: float64
In [52]:
         ratings.describe()
```

```
Out[52]:
                      userId
                                  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 [53]:
         ratings.mean()
Out[53]: userId
                    69045.872583
         movieId
                     9041.567330
                         3.525529
         rating
         dtype: float64
In [54]:
         ratings['rating'].mean()
Out[54]: 3.5255285642993797
In [55]: ratings.mean()
Out[55]: userId
                    69045.872583
         movieId
                     9041.567330
                        3.525529
         rating
         dtype: float64
In [56]: ratings['rating'].min()
Out[56]: 0.5
In [57]:
         ratings.min()
Out[57]: userId
                    1.0
                    1.0
         movieId
         rating
                    0.5
         dtype: float64
In [58]:
         ratings['rating'].max()
Out[58]: 5.0
In [59]:
         ratings.max()
Out[59]: userId
                    138493.0
         movieId
                    131262.0
         rating
                         5.0
         dtype: float64
In [60]:
         ratings['rating'].std()
```

```
Out[60]: 1.051988919275684
In [61]: ratings.std()
Out[61]: userId
                    40038.626653
                    19789.477445
         movieId
         rating
                        1.051989
         dtype: float64
In [62]: ratings['rating'].mode()
Out[62]: 0 4.0
         Name: rating, dtype: float64
In [63]: rating.mode()
        NameError
                                                 Traceback (most recent call last)
        Cell In[63], line 1
        ----> 1 rating.mode()
       NameError: name 'rating' is not defined
In [64]: ratings.mode()
Out[64]:
            userld movield rating
         0 118205
                       296
                              4.0
In [65]:
         ratings.corr()
Out[65]:
                    userId
                            movield
                                       rating
           userId
                  1.000000
                           -0.000850
                                    0.001175
         movield -0.000850
                            1.000000
                                     0.002606
           rating
                  In [68]: filter1=ratings['rating']>10
         print(filter1)
         filter1.any()
                   False
        0
        1
                   False
        2
                   False
        3
                   False
        4
                   False
                   . . .
        20000258 False
        20000259 False
        20000260
                 False
                 False
        20000261
        20000262
                   False
       Name: rating, Length: 20000263, dtype: bool
Out[68]: False
```

```
In [70]: filter8=ratings['rating']>1
         print(filter8)
         filter8.any()
        0
                   True
                   True
        1
                   True
        3
                   True
                   True
        20000258
                   True
        20000259 True
        20000260 True
        20000261
                  True
        20000262
                   True
        Name: rating, Length: 20000263, dtype: bool
Out[70]: True
In [72]: filter2=ratings['rating']>0
         filter2.all()
```

## Out[72]: True

## **Data Cleaning: Handling Missing Data**

```
In [73]: movies.shape
Out[73]: (27278, 3)
In [74]: movies.index
Out[74]: RangeIndex(start=0, stop=27278, step=1)
In [75]: movies.columns
Out[75]: Index(['movieId', 'title', 'genres'], dtype='object')
In [76]: movies[0]
```

```
KeyError
                                                  Traceback (most recent call last)
        File ~\AppData\Roaming\Python\Python312\site-packages\pandas\core\indexes\base.p
        y:3812, in Index.get_loc(self, key)
          3811 try:
        -> 3812
                    return self._engine.get_loc(casted_key)
           3813 except KeyError as err:
        File pandas/_libs/index.pyx:167, in pandas._libs.index.IndexEngine.get_loc()
        File pandas/_libs/index.pyx:196, in pandas._libs.index.IndexEngine.get_loc()
        File pandas/_libs/hashtable_class_helper.pxi:7088, in pandas._libs.hashtable.PyOb
        jectHashTable.get_item()
        File pandas/_libs/hashtable_class_helper.pxi:7096, in pandas._libs.hashtable.PyOb
        jectHashTable.get_item()
        KeyError: 0
        The above exception was the direct cause of the following exception:
        KeyError
                                                  Traceback (most recent call last)
        Cell In[76], line 1
        ----> 1 movies[0]
        File ~\AppData\Roaming\Python\Python312\site-packages\pandas\core\frame.py:4107,
        in DataFrame. getitem (self, key)
           4105 if self.columns.nlevels > 1:
           4106
                    return self._getitem_multilevel(key)
        -> 4107 indexer = self.columns.get_loc(key)
           4108 if is_integer(indexer):
           4109
                    indexer = [indexer]
        File ~\AppData\Roaming\Python\Python312\site-packages\pandas\core\indexes\base.p
        y:3819, in Index.get_loc(self, key)
           3814
                   if isinstance(casted_key, slice) or (
           3815
                        isinstance(casted_key, abc.Iterable)
                        and any(isinstance(x, slice) for x in casted key)
           3816
           3817
           3818
                        raise InvalidIndexError(key)
        -> 3819
                    raise KeyError(key) from err
           3820 except TypeError:
                   # If we have a listlike key, _check_indexing_error will raise
           3821
                    # InvalidIndexError. Otherwise we fall through and re-raise
           3822
           3823
                   # the TypeError.
           3824
                    self._check_indexing_error(key)
        KeyError: 0
In [77]: movies['movieId'][0]
Out[77]: 1
In [78]: movies['title'][0]
Out[78]: 'Toy Story (1995)'
In [79]: movies.isnull().any().any()
```

```
Out[79]: False
In [80]:
         ratings.shape
Out[80]: (20000263, 3)
In [81]:
         ratings.isnull().any()
Out[81]:
         userId
                    False
         movieId
                    False
         rating
                    False
         dtype: bool
In [82]: ratings.isnull().any().any()
Out[82]: False
In [83]: tags.shape
Out[83]: (465564, 3)
In [84]: tags.isnull().any().any()
Out[84]: True
In [85]: tags=tags.dropna()
In [86]: tags.isnull().any().any()
Out[86]: False
In [87]: tags.shape
Out[87]: (465548, 3)
```

## **Data Visualization**

```
Out[128... array([[<Axes: title={'center': 'rating'}>]], dtype=object)
In [129...
           plt.show()
                                                  rating
         2
         1
In [130...
           ratings.boxplot(column='rating',figsize=(10,5))
Out[130...
           <Axes: >
           plt.show()
In [131...
```

## **Slicing Out Columns**

```
In [126... tags['tag'].head()
```

rating

```
Out[126...
                Mark Waters
           1
                    dark hero
           2
                     dark hero
           3
               noir thriller
                     dark hero
           Name: tag, dtype: object
           movies[['title','genres']].head()
In [132...
Out[132...
                                      title
                                                                              genres
           0
                            Toy Story (1995)
                                           Adventure|Animation|Children|Comedy|Fantasy
           1
                             Jumanji (1995)
                                                             Adventure|Children|Fantasy
           2
                   Grumpier Old Men (1995)
                                                                     Comedy|Romance
           3
                     Waiting to Exhale (1995)
                                                              Comedy|Drama|Romance
              Father of the Bride Part II (1995)
                                                                             Comedy
In [133...
           ratings[-10:]
Out[133...
                       userId movieId 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 [134...
           tag_counts[-10:]
Out[134...
           tag
           missing child
                                               1
           Ron Moore
                                               1
           Citizen Kane
                                               1
           mullet
                                               1
           biker gang
                                               1
           Paul Adelstein
                                               1
                                               1
           the wig
           killer fish
                                               1
           genetically modified monsters
                                               1
           topless scene
                                               1
           Name: count, dtype: int64
```

```
tag_counts[:10].plot(kind='bar',figsize=(10,5))
In [138...
Out[138...
                <Axes: xlabel='tag'>
In [139...
                plt.show()
              3500
              3000
             2500
             2000
              1500
              1000
               500
                                    based on a book
                                                atmospheric -
                                                                                                          twist ending
                                                                        action
                                                                                               BD-R
                                                                                                                      funny
                                                                                   surreal
                                                                                                                                  dystopia
                                                            comedy
                                                                             tag
```