```
In [1]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
In [2]: import pickle
```

### **Loading Dataset**

```
In [3]: book=pd.read_csv("Books.csv")

C:\Users\shaw3\AppData\Local\Temp\ipykernel_10152\3971472040.py:1: DtypeWarn
ing: Columns (3) have mixed types. Specify dtype option on import or set low
_memory=False.
    book=pd.read_csv("Books.csv")
In [4]: book
```

Out[4]:

|        | ISBN       | Book-Title  | Book-<br>Author            | Year-Of-<br>Publication | Publisher  |   |
|--------|------------|---|----------------------------|-------------------------|--|---|
| 0      | 0195153448 | Classical<br>Mythology  | Mark P. O.<br>Morford      | 2002                    | Oxford University<br>Press                             | h |
| 1      | 0002005018 | Clara<br>Callan   | Richard<br>Bruce<br>Wright | 2001                    | HarperFlamingo<br>Canada                               | h |
| 2      | 0060973129 | Decision in<br>Normandy                                       | Carlo<br>D'Este            | 1991                    | HarperPerennial  | h |
| 3      | 0374157065 | Flu: The<br>Story of<br>the Great<br>Influenza<br>Pandemic    | Gina Bari<br>Kolata        | 1999                    | Farrar Straus Giroux                                   | h |
| 4      | 0393045218 | The<br>Mummies<br>of Urumchi                                  | E. J. W.<br>Barber         | 1999                    | W. W. Norton &<br>Company                              | h |
| •••    |            |   |                            |                         |  |   |
| 271355 | 0440400988 | There's a<br>Bat in Bunk<br>Five                              | Paula<br>Danziger          | 1988                    | Random House<br>Childrens Pub (Mm)                     | h |
| 271356 | 0525447644 | From One<br>to One<br>Hundred                                 | Teri Sloat                 | 1991                    | Dutton Books   | h |
| 271357 | 006008667X | Lily Dale :<br>The True<br>Story of<br>the Town<br>that Ta    | Christine<br>Wicker        | 2004                    | HarperSanFrancisco                                     | h |
| 271358 | 0192126040 | Republic<br>(World's<br>Classics)                             | Plato                      | 1996                    | Oxford University<br>Press                             | h |
| 271359 | 0767409752 | A Guided<br>Tour of<br>Rene<br>Descartes'<br>Meditations<br>0 | Christopher<br>Biffle      | 2000                    | McGraw-Hill<br>Humanities/Social<br>Sciences/Languages | h |

271360 rows × 8 columns

| _   |     | _   | - |  |
|-----|-----|-----|---|--|
| 7.1 | 1 - | Ь,  |   |  |
|     |     | - ) | - |  |

|   | ISBN         | Book-Title   | Book-<br>Author            | Year-Of-<br>Publication | Publisher                    |                  |
|---|--------------|--|----------------------------|-------------------------|------------------------------|------------------|
| 0 | 0195153448   | Classical<br>Mythology                                     | Mark P.<br>O.<br>Morford   | 2002                    | Oxford<br>University Press   | http://images.am |
| 1 | . 0002005018 | Clara<br>Callan  | Richard<br>Bruce<br>Wright | 2001                    | HarperFlamingo<br>Canada     | http://images.am |
| 2 | 0060973129   | Decision in<br>Normandy                                    | Carlo<br>D'Este            | 1991                    | HarperPerennial              | http://images.ar |
| 3 | 0374157065   | Flu: The<br>Story of<br>the Great<br>Influenza<br>Pandemic | Gina<br>Bari<br>Kolata     | 1999                    | Farrar Straus<br>Giroux      | http://images.am |
| 4 | 0393045218   | The<br>Mummies<br>of Urumchi                               | E. J. W.<br>Barber         | 1999                    | W. W. Norton<br>&<br>Company | http://images.am |

### In [6]: book.describe()

#### Out[6]:

|      |     | ISBN       | Book-<br>Title    | Book-<br>Author    | Year-Of-<br>Publication | Publisher |                    |
|------|-----|------------|-------------------|--------------------|-------------------------|-----------|--------------------|
| cou  | ınt | 271360     | 271360            | 271359             | 271360                  | 271358    |                    |
| uniq | ue  | 271360     | 242135            | 102023             | 202                     | 16807     |                    |
| t    | ор  | 0195153448 | Selected<br>Poems | Agatha<br>Christie | 2002                    | Harlequin | http://images.amaz |
| fr   | eq  | 1          | 27                | 632                | 13903                   | 7535      |                    |

### In [7]: book.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 271360 entries, 0 to 271359

Data columns (total 8 columns):

| #      | Column              | Non-Null Count  | Dtype  |
|--------|---------------------|-----------------|--------|
|        |                     |                 |        |
| 0      | ISBN                | 271360 non-null | object |
| 1      | Book-Title          | 271360 non-null | object |
| 2      | Book-Author         | 271359 non-null | object |
| 3      | Year-Of-Publication | 271360 non-null | object |
| 4      | Publisher           | 271358 non-null | object |
| 5      | Image-URL-S         | 271360 non-null | object |
| 6      | Image-URL-M         | 271360 non-null | object |
| 7      | Image-URL-L         | 271357 non-null | object |
| 4+,,,, | os: object(0)       |                 |        |

dtypes: object(8)
memory usage: 16.6+ MB

In [8]: book.count()

```
Out[8]: ISBN
                                 271360
         Book-Title
                                 271360
                                 271359
         Book-Author
         Year-Of-Publication
                                 271360
         Publisher
                                 271358
         Image-URL-S
                                 271360
         Image-URL-M
                                 271360
         Image-URL-L
                                 271357
         dtype: int64
 In [9]: book.columns
 Out[9]: Index(['ISBN', 'Book-Title', 'Book-Author', 'Year-Of-Publication', 'Publish
         er',
                 'Image-URL-S', 'Image-URL-M', 'Image-URL-L'],
               dtype='object')
In [10]:
         book.shape
Out[10]: (271360, 8)
In [11]: print(f"Column types in book:\n{book.dtypes}")
        Column types in book:
        ISBN
                               object
        Book-Title
                               object
        Book-Author
                               object
        Year-Of-Publication
                               object
        Publisher
                               object
        Image-URL-S
                               object
        Image-URL-M
                               object
        Image-URL-L
                               object
        dtype: object
In [12]: user = pd.read csv('Users ok.csv')
In [13]: user
```

| Out[13]: |        | User-ID | Location                           | Age  |
|----------|--------|---------|------------------------------------|------|
|          | 0      | 1       | nyc, new york, usa                 | NaN  |
|          | 1      | 2       | stockton, california, usa          | 18.0 |
|          | 2      | 3       | moscow, yukon territory, russia    | NaN  |
|          | 3      | 4       | porto, v.n.gaia, portugal          | 17.0 |
|          | 4      | 5       | farnborough, hants, united kingdom | NaN  |
|          |        |         |                                    |      |
|          | 278853 | 278854  | portland, oregon, usa              | NaN  |
|          | 278854 | 278855  | tacoma, washington, united kingdom | 50.0 |
|          | 278855 | 278856  | brampton, ontario, canada          | NaN  |
|          | 278856 | 278857  | knoxville, tennessee, usa          | NaN  |
|          | 278857 | 278858  | dublin, n/a, ireland               | NaN  |

278858 rows  $\times$  3 columns

```
In [14]: user.head()
```

| Out[14]: |   | User-ID | Location                           | Age  |
|----------|---|---------|------------------------------------|------|
|          | 0 | 1       | nyc, new york, usa                 | NaN  |
|          | 1 | 2       | stockton, california, usa          | 18.0 |
|          | 2 | 3       | moscow, yukon territory, russia    | NaN  |
|          | 3 | 4       | porto, v.n.gaia, portugal          | 17.0 |
|          | 4 | 5       | farnborough, hants, united kingdom | NaN  |

```
In [15]: user.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 278858 entries, 0 to 278857
Data columns (total 3 columns):
    Column
              Non-Null Count
                               Dtype
- - -
              278858 non-null int64
 0
    User-ID
 1
    Location 278858 non-null object
    Age
              168096 non-null float64
dtypes: float64(1), int64(1), object(1)
memory usage: 6.4+ MB
```

```
In [16]: user.describe()
```

| Out[16]: |                  | User-ID      | Age           |  |  |
|----------|------------------|--------------|---------------|--|--|
|          | count            | 278858.00000 | 168096.000000 |  |  |
|          | mean             | 139429.50000 | 34.751434     |  |  |
|          | std              | 80499.51502  | 14.428097     |  |  |
|          | min              | 1.00000      | 0.000000      |  |  |
|          | 25%              | 69715.25000  | 24.000000     |  |  |
|          | 50%              | 139429.50000 | 32.000000     |  |  |
|          | <b>75</b> %      | 209143.75000 | 44.000000     |  |  |
|          | max              | 278858.00000 | 244.000000    |  |  |
|          |                  |              |               |  |  |
| In [17]: | [17]: user.shape |              |               |  |  |
| Out[17]: | ]: (278858, 3)   |              |               |  |  |

Out[19]: Index(['User-ID', 'Location', 'Age'], dtype='object')

# CHECK IF NULL VALUE PRESENT OR NOT

| Out[22]: |         | User-ID | ISBN        | <b>Book-Rating</b> |
|----------|---------|---------|-------------|--------------------|
|          | 0       | 276725  | 034545104X  | 0                  |
|          | 1       | 276726  | 0155061224  | 5                  |
|          | 2       | 276727  | 0446520802  | 0                  |
|          | 3       | 276729  | 052165615X  | 3                  |
|          | 4       | 276729  | 0521795028  | 6                  |
|          |         |         |             |                    |
|          | 1149775 | 276704  | 1563526298  | 9                  |
|          | 1149776 | 276706  | 0679447156  | 0                  |
|          | 1149777 | 276709  | 0515107662  | 10                 |
|          | 1149778 | 276721  | 0590442449  | 10                 |
|          | 1149779 | 276723  | 05162443314 | 8                  |

1149780 rows  $\times$  3 columns

```
In [23]: rating.head()
```

| Out[23]: |   | User-ID | ISBN       | <b>Book-Rating</b> |
|----------|---|---------|------------|--------------------|
|          | 0 | 276725  | 034545104X | 0                  |
|          | 1 | 276726  | 0155061224 | 5                  |
|          | 2 | 276727  | 0446520802 | 0                  |
|          | 3 | 276729  | 052165615X | 3                  |
|          | 4 | 276729  | 0521795028 | 6                  |

```
In [24]: rating.info()
```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 1149780 entries, 0 to 1149779
Data columns (total 3 columns):

# Column Non-Null Count Dtype

O User-ID 1149780 non-null int64

ISBN 1149780 non-null object

Book-Rating 1149780 non-null int64

dtypes: int64(2), object(1)
memory usage: 26.3+ MB

### In [25]: rating.describe()

```
Out[25]:
                      User-ID
                               Book-Rating
         count 1.149780e+06 1.149780e+06
         mean 1.403864e+05 2.866950e+00
           std 8.056228e+04 3.854184e+00
           min 2.000000e+00 0.000000e+00
          25% 7.034500e+04 0.000000e+00
          50% 1.410100e+05 0.000000e+00
          75% 2.110280e+05 7.000000e+00
           max 2.788540e+05 1.000000e+01
In [26]:
         rating.count()
Out[26]: User-ID
                        1149780
         ISBN
                        1149780
                        1149780
         Book-Rating
         dtype: int64
In [27]: rating columns
Out[27]: Index(['User-ID', 'ISBN', 'Book-Rating'], dtype='object')
In [28]: rating.shape
Out[28]: (1149780, 3)
In [29]:
         rating.isnull().sum()
Out[29]: User-ID
                        0
         ISBN
                        0
         Book-Rating
                        0
         dtype: int64
In [30]: user['Location'].value counts()
Out[30]: london, england, united kingdom
                                                          2506
         toronto, ontario, canada
                                                          2250
         sydney, new south wales, australia
                                                          1744
         melbourne, victoria, australia
                                                          1708
         portland, oregon, usa
                                                          1629
         gneisenaustr. 3, nordrhein-westfalen, germany
                                                             1
         -, bayern, germany
                                                             1
                                                             1
         bouchegouf, guelma, algeria
                                                             1
         indiana and philadelphia, pennsylvania, usa
                                                             1
         tacoma, washington, united kingdom
         Name: Location, Length: 57339, dtype: int64
In [31]: user[['City', 'State', 'Country']] = user['Location'].str.split(',', expand
```

## check duplicate columns

In [32]: new\_books = book.drop\_duplicates('Book-Title')

In [33]: new\_books

Out[33]:

| :  |        | ISBN       | Book-Title  | Book-<br>Author            | Year-Of-<br>Publication | Publisher  |   |
|----|--------|------------|---|----------------------------|-------------------------|--|---|
|    | 0      | 0195153448 | Classical<br>Mythology  | Mark P. O.<br>Morford      | 2002                    | Oxford University<br>Press                             | h |
|    | 1      | 0002005018 | Clara<br>Callan   | Richard<br>Bruce<br>Wright | 2001                    | HarperFlamingo<br>Canada                               | h |
|    | 2      | 0060973129 | Decision in<br>Normandy                                       | Carlo<br>D'Este            | 1991                    | HarperPerennial  | h |
|    | 3      | 0374157065 | Flu: The<br>Story of the<br>Great<br>Influenza<br>Pandemic    | Gina Bari<br>Kolata        | 1999                    | Farrar Straus Giroux                                   | h |
|    | 4      | 0393045218 | The<br>Mummies<br>of Urumchi                                  | E. J. W.<br>Barber         | 1999                    | W. W. Norton &<br>Company                              | h |
|    |        |            |   |                            |                         |  |   |
|    | 271354 | 0449906736 | Flashpoints:     Promise     and Peril in     a New     World | Robin<br>Wright            | 1993                    | Ballantine Books                                       | h |
|    | 271356 | 0525447644 | From One<br>to One<br>Hundred                                 | Teri Sloat                 | 1991                    | Dutton Books   | h |
|    | 271357 | 006008667X | Lily Dale :<br>The True<br>Story of the<br>Town that<br>Ta    | Christine<br>Wicker        | 2004                    | HarperSanFrancisco                                     | h |
|    | 271358 | 0192126040 | Republic<br>(World's<br>Classics)                             | Plato                      | 1996                    | Oxford University<br>Press                             | h |
| 27 | 271359 | 0767409752 | A Guided<br>Tour of<br>Rene<br>Descartes'<br>Meditations<br>o | Christopher<br>Biffle      | 2000                    | McGraw-Hill<br>Humanities/Social<br>Sciences/Languages | h |

```
In [34]:
          new books.shape
Out[34]: (242135, 8)
In [35]:
          ratings with name = rating.merge(new books, on='ISBN')
In [36]:
          ratings_with_name.head()
Out[36]:
                                   Book-
                                          Book-
                                                   Book-
                                                              Year-Of-
              User-
                            ISBN
                                                                       Publisher
                                            Title Author Publication
                 ID
                                  Rating
                                            Flesh
                                           Tones:
                                                     M. J.
                                                                        Ballantine
                                                                 2002
          0 276725 034545104X
                                                                                  http://im
                                                                           Books
                                               Α
                                                     Rose
                                           Novel
                                            Flesh
                                           Tones:
                                                     M. J.
                                                                        Ballantine
          1
                                                                 2002
               2313 034545104X
                                                                                   http://im
                                                     Rose
                                                                            Books
                                               Α
                                           Novel
                                            Flesh
                                           Tones:
                                                     M. J.
                                                                        Ballantine
          2
               6543 034545104X
                                        0
                                                                 2002
                                                                                   http://im
                                                                            Books
                                              Α
                                                     Rose
                                           Novel
                                            Flesh
                                           Tones:
                                                     M. J.
                                                                        Ballantine
          3
               8680 034545104X
                                        5
                                                                 2002
                                                                                   http://im
                                                     Rose
                                                                            Books
                                           Novel
                                            Flesh
                                           Tones:
                                                     M. J.
                                                                        Ballantine
          4
              10314 034545104X
                                                                 2002
                                                                                  http://im
                                               Α
                                                     Rose
                                                                           Books
                                           Novel
In [37]: ratings with name.info()
        <class 'pandas.core.frame.DataFrame'>
        Int64Index: 883079 entries, 0 to 883078
        Data columns (total 10 columns):
              Column
                                    Non-Null Count
                                                      Dtype
              -----
                                                      ----
         0
             User-ID
                                    883079 non-null
                                                      int64
         1
              ISBN
                                    883079 non-null
                                                      object
         2
              Book-Rating
                                    883079 non-null
                                                      int64
         3
              Book-Title
                                    883079 non-null
                                                      object
              Book-Author
                                    883078 non-null
                                                      object
         5
             Year-Of-Publication
                                    883079 non-null
                                                      object
         6
             Publisher
                                    883078 non-null
                                                      object
         7
              Image-URL-S
                                    883079 non-null
                                                      object
              Image-URL-M
                                    883079 non-null
                                                      object
              Image-URL-L
                                    883075 non-null
                                                      object
        dtypes: int64(2), object(8)
        memory usage: 74.1+ MB
In [38]: ratings with name.describe()
```

| Out[38]: |             | User-ID       | <b>Book-Rating</b> |
|----------|-------------|---------------|--------------------|
|          | count       | 883079.000000 | 883079.000000      |
|          | mean        | 140001.288996 | 2.832366           |
|          | std         | 80927.312913  | 3.850714           |
|          | min         | 2.000000      | 0.000000           |
|          | 25%         | 69697.000000  | 0.000000           |
|          | 50%         | 140069.000000 | 0.000000           |
|          | <b>75</b> % | 211351.000000 | 7.000000           |
|          | max         | 278854.000000 | 10.000000          |

In [39]: ratings\_with\_name.shape

Out[39]: (883079, 10)

In [40]: ratings\_with\_name.count

```
Out[40]: <bound method DataFrame.count of
                                                   User-ID
                                                                   ISBN
                                                                         Book-Rating
                   276725 034545104X
         0
                                                 0
         1
                     2313
                           034545104X
                                                  5
          2
                     6543 034545104X
                                                  0
                                                  5
          3
                     8680
                           034545104X
                                                  9
          4
                    10314 034545104X
                                                . . .
         883074
                   276688 0425150526
                                                 0
         883075
                   276688 0449907422
                                                  0
         883076
                   276690 0590907301
                                                 0
                                                 0
         883077
                   276704 0679752714
                                                  5
         883078
                   276704 0806917695
                                                          Book-Title
                                                                           Book-Author
          \
         0
                                                Flesh Tones: A Novel
                                                                            M. J. Rose
         1
                                                Flesh Tones: A Novel
                                                                            M. J. Rose
         2
                                                Flesh Tones: A Novel
                                                                            M. J. Rose
         3
                                                Flesh Tones: A Novel
                                                                            M. J. Rose
          4
                                                Flesh Tones: A Novel
                                                                            M. J. Rose
                                           Death Crosses the Border Janice Steinberg
         883074
         883075
                                 Jazz Funeral: A Skip Langdon Novel
                                                                           Julie Smith
         883076
                 Triplet Trouble and the Class Trip (Triplet Tr...
                                                                          Debbie Dadey
                 A Desert of Pure Feeling (Vintage Contemporaries)
         883077
                                                                        Judith Freeman
         883078 Perplexing Lateral Thinking Puzzles: Scholasti...
                                                                           Paul Sloane
                 Year-Of-Publication
                                                      Publisher \
         0
                                              Ballantine Books
                                2002
         1
                                              Ballantine Books
                                2002
         2
                                2002
                                              Ballantine Books
          3
                                2002
                                              Ballantine Books
          4
                                2002
                                              Ballantine Books
          . . .
                                 . . .
                                      Berkley Publishing Group
         883074
                                1995
         883075
                                1993
                                              Ballantine Books
         883076
                                1997
                                                          Apple
          883077
                                             Vintage Books USA
                                1997
          883078
                                1997
                                           Sterling Publishing
                                                         Image-URL-S \
         0
                  http://images.amazon.com/images/P/034545104X.0...
         1
                  http://images.amazon.com/images/P/034545104X.0...
         2
                  http://images.amazon.com/images/P/034545104X.0...
         3
                  http://images.amazon.com/images/P/034545104X.0...
          4
                  http://images.amazon.com/images/P/034545104X.0...
         883074
                 http://images.amazon.com/images/P/0425150526.0...
         883075
                 http://images.amazon.com/images/P/0449907422.0...
         883076
                 http://images.amazon.com/images/P/0590907301.0...
         883077
                  http://images.amazon.com/images/P/0679752714.0...
         883078
                 http://images.amazon.com/images/P/0806917695.0...
                                                         Image-URL-M \
         0
                  http://images.amazon.com/images/P/034545104X.0...
```

```
1
                  http://images.amazon.com/images/P/034545104X.0...
          2
                  http://images.amazon.com/images/P/034545104X.0...
          3
                  http://images.amazon.com/images/P/034545104X.0...
          4
                  http://images.amazon.com/images/P/034545104X.0...
          883074
                  http://images.amazon.com/images/P/0425150526.0...
          883075
                  http://images.amazon.com/images/P/0449907422.0...
          883076
                  http://images.amazon.com/images/P/0590907301.0...
                  http://images.amazon.com/images/P/0679752714.0...
          883077
          883078
                  http://images.amazon.com/images/P/0806917695.0...
                                                          Image-URL-L
          0
                  http://images.amazon.com/images/P/034545104X.0...
          1
                  http://images.amazon.com/images/P/034545104X.0...
          2
                  http://images.amazon.com/images/P/034545104X.0...
          3
                  http://images.amazon.com/images/P/034545104X.0...
          4
                  http://images.amazon.com/images/P/034545104X.0...
          . . .
                  http://images.amazon.com/images/P/0425150526.0...
          883074
          883075
                  http://images.amazon.com/images/P/0449907422.0...
                  http://images.amazon.com/images/P/0590907301.0...
          883076
                  http://images.amazon.com/images/P/0679752714.0...
          883077
                  http://images.amazon.com/images/P/0806917695.0...
          883078
          [883079 rows x 10 columns]>
In [41]:
          ratings with name.drop(['ISBN', 'Image-URL-S', 'Image-URL-M', 'Image-URL-L']
In [42]:
          ratings with name.head()
Out[42]:
               User-
                         Book-
                                                  Book-
                                                                Year-Of-
                                                                            Publisher
                                  Book-Title
                 ID
                        Rating
                                                Author
                                                             Publication
                                 Flesh Tones:
                                                                             Ballantine
             276725
                             0
                                               M. J. Rose
          0
                                                                   2002
                                     A Novel
                                                                                Books
                                 Flesh Tones:
                                                                             Ballantine
          1
               2313
                              5
                                                                   2002
                                               M. J. Rose
                                     A Novel
                                                                                Books
                                 Flesh Tones:
                                                                             Ballantine
          2
               6543
                             0
                                               M. J. Rose
                                                                   2002
                                     A Novel
                                                                                Books
                                 Flesh Tones:
                                                                             Ballantine
          3
               8680
                              5
                                                                   2002
                                               M. J. Rose
                                     A Novel
                                                                                Books
                                 Flesh Tones:
                                                                             Ballantine
          4
                              9
                                               M. J. Rose
              10314
                                                                   2002
                                     A Novel
                                                                                Books
         users ratings matrix = ratings with name.merge(user, on='User-ID')
In [43]:
         users ratings matrix.head()
```

In [44]:

| Out[44]: |   | User-<br>ID | Book-<br>Rating | Book-Title   | Book-<br>Author                  | Year-Of-<br>Publication | Publisher                 | Loca             |
|----------|---|-------------|-----------------|--|----------------------------------|-------------------------|---------------------------|------------------|
|          | 0 | 276725      | 0               | Flesh Tones:<br>A Novel                                      | M. J. Rose                       | 2002                    | Ballantine Books          | ty<br>texas,     |
|          | 1 | 2313        | 5               | Flesh Tones:<br>A Novel                                      | M. J. Rose                       | 2002                    | Ballantine Books          | cincini<br>ohio, |
|          | 2 | 2313        | 8               | In Cold Blood<br>(Vintage<br>International)                  | TRUMAN<br>CAPOTE                 | 1994                    | Vintage                   | cincini<br>ohio, |
|          | 3 | 2313        | 9               | Divine<br>Secrets of<br>the Ya-Ya<br>Sisterhood :<br>A Novel | Rebecca<br>Wells                 | 1996                    | HarperCollins             | cincini<br>ohio, |
|          | 4 | 2313        | 5               | The Mistress<br>of Spices                                    | Chitra<br>Banerjee<br>Divakaruni | 1998                    | Anchor<br>Books/Doubleday | cincini<br>ohio, |

In [45]: users\_ratings\_matrix.shape

Out[45]: (883079, 11)

In [46]: users\_ratings\_matrix.info()

<class 'pandas.core.frame.DataFrame'>
Int64Index: 883079 entries, 0 to 883078
Data columns (total 11 columns):

# Column Non-Null Count Dtype ----0 User-ID int64 883079 non-null 1 Book-Rating 883079 non-null int64 2 Book-Title 883079 non-null object 3 Book-Author 883078 non-null object Year-Of-Publication 883079 non-null object 5 Publisher 883078 non-null object 6 Location 883079 non-null object 7 Age 646933 non-null float64 8 883079 non-null City object 9 State 883079 non-null object 10 Country 883079 non-null object

dtypes: float64(1), int64(2), object(8)

memory usage: 80.8+ MB

In [47]: users\_ratings\_matrix.describe

```
Out[47]: <box/>bound method NDFrame.describe of User-ID Book-Rating \
                   276725
          1
                     2313
                                      5
          2
                                      8
                     2313
          3
                     2313
                                      9
                                      5
          4
                     2313
                                    . . .
          883074
                   276618
                                      5
                                      0
          883075
                   276647
          883076
                   276647
                                    10
                                     8
          883077
                   276660
                                      5
          883078
                   276672
                                                          Book-Title \
          0
                                                Flesh Tones: A Novel
          1
                                                Flesh Tones: A Novel
          2
                              In Cold Blood (Vintage International)
          3
                   Divine Secrets of the Ya-Ya Sisterhood : A Novel
          4
                                              The Mistress of Spices
          883074 Ludwig Marum: Briefe aus dem Konzentrationslag...
          883075 Christmas With Anne and Other Holiday Stories:...
                  Heaven (Coretta Scott King Author Award Winner)
          883076
          883077
                                            ROBOT RACE (MICRO ADV 6)
          883078
                                            Dry Rot And Daffodils/Ne
                                 Book-Author Year-Of-Publication \
          0
                                  M. J. Rose
                                                              2002
          1
                                  M. J. Rose
                                                              2002
          2
                               TRUMAN CAPOTE
                                                             1994
          3
                               Rebecca Wells
                                                             1996
          4
                  Chitra Banerjee Divakaruni
                                                             1998
                                                              . . .
          883074
                                Ludwig Marum
                                                              1984
          883075
                            L. M. Montgomery
                                                              2001
                              Angela Johnson
          883076
                                                             1998
                          David Antony Kroft
                                                              1985
          883077
          883078
                                 Mary MacKie
                                                              2000
                                                    Publisher \
          0
                                             Ballantine Books
          1
                                             Ballantine Books
          2
                                                      Vintage
          3
                                                HarperCollins
          4
                                       Anchor Books/Doubleday
                                                 C.F. Mù4ller
          883074
                                                     Starfire
          883075
          883076
                  Simon & amp; Schuster Children's Publishing
          883077
                                     HarperCollins Publishers
          883078
                                             Trafalgar Square
                                           Location
                                                      Age
                                                                        City
                                                                                   Stat
          е
            \
          0
                                 tyler, texas, usa
                                                      NaN
                                                                        tyler
                                                                                   texa
          S
```

```
1
                             cincinnati, ohio, usa 23.0
                                                                  cincinnati
                                                                                    ohi
          0
          2
                             cincinnati, ohio, usa 23.0
                                                                  cincinnati
                                                                                    ohi
          0
                             cincinnati, ohio, usa
          3
                                                     23.0
                                                                  cincinnati
                                                                                    ohi
          0
                             cincinnati, ohio, usa
          4
                                                     23.0
                                                                  cincinnati
                                                                                    ohi
          0
          883074
                      stuttgart, \n/a\"., germany"
                                                      NaN
                                                                   stuttgart
                                                                                 n/a
          \".
                  arlington heights, illinois, usa 13.0 arlington heights
          883075
                                                                               illinoi
          883076 arlington heights, illinois, usa 13.0 arlington heights
                                                                               illinoi
          883077
                         singapore, n/a, singapore
                                                     15.0
                                                                   singapore
                                                                                     n/
                    newport, gwent, united kingdom
          883078
                                                      NaN
                                                                     newport
                                                                                   gwen
                          Country
          0
                              usa
          1
                              usa
          2
                              usa
          3
                              usa
          4
                              usa
          883074
                         germany"
          883075
                              usa
          883076
                              usa
          883077
                        singapore
          883078
                   united kingdom
          [883079 rows x 11 columns]>
In [48]: users ratings matrix.isna().sum()
Out[48]:
         User-ID
                                      0
          Book-Rating
                                      0
          Book-Title
                                      0
          Book-Author
                                       1
                                      0
          Year-Of-Publication
          Publisher
                                      1
                                      0
          Location
                                 236146
          Age
          City
                                      0
          State
                                      0
                                      0
          Country
          dtype: int64
```

Top 50 Books based on Popularity

In [51]: ratings\_with\_books = rating.merge(book,on='ISBN')

ratings\_with\_books.shape

Out[51]: (1031136, 10)

In [52]: ratings\_with\_books

Out[52]:

|   |        | User-<br>ID | ISBN       | Book-<br>Rating | Book-Title  | Book-<br>Author    | Year-Of-<br>Publication |
|---|--------|-------------|------------|-----------------|---|--------------------|-------------------------|
|   | 0      | 276725      | 034545104X | 0               | Flesh Tones: A<br>Novel                                 | M. J.<br>Rose      | 2002                    |
|   | 1      | 2313        | 034545104X | 5               | Flesh Tones: A<br>Novel                                 | M. J.<br>Rose      | 2002                    |
|   | 2      | 6543        | 034545104X | 0               | Flesh Tones: A<br>Novel                                 | M. J.<br>Rose      | 2002                    |
|   | 3      | 8680        | 034545104X | 5               | Flesh Tones: A<br>Novel                                 | M. J.<br>Rose      | 2002                    |
|   | 4      | 10314       | 034545104X | 9               | Flesh Tones: A<br>Novel                                 | M. J.<br>Rose      | 2002                    |
|   | •••    |             |            |                 |   |                    |                         |
| 1 | 031131 | 276688      | 0517145553 | 0               | Mostly Harmless   | Douglas<br>Adams   | 1995                    |
| 1 | 031132 | 276688      | 1575660792 | 7               | Gray Matter   | Shirley<br>Kennett | 1996<br>C               |
| 1 | 031133 | 276690      | 0590907301 | 0               | Triplet Trouble<br>and the Class<br>Trip (Triplet Tr    | Debbie<br>Dadey    | 1997                    |
| 1 | 031134 | 276704      | 0679752714 | 0               | A Desert of Pure<br>Feeling (Vintage<br>Contemporaries) | Judith<br>Freeman  | 1997                    |
| 1 | 031135 | 276704      | 0806917695 | 5               | Perplexing<br>Lateral Thinking<br>Puzzles:<br>Scholasti | Paul<br>Sloane     | 1997                    |

1031136 rows × 10 columns

In [108... ratings\_with\_books.info()

```
<class 'pandas.core.frame.DataFrame'>
        Int64Index: 1031136 entries, 0 to 1031135
        Data columns (total 10 columns):
             Column
                                   Non-Null Count
                                                      Dtype
             -----
                                   -----
         - - -
                                                      ----
         0
             User-ID
                                   1031136 non-null int64
         1
             ISBN
                                   1031136 non-null object
         2
             Book-Rating
                                   1031136 non-null int64
         3
                                   1031136 non-null object
             Book-Title
         4
             Book-Author
                                   1031135 non-null object
             Year-Of-Publication 1031136 non-null object
         5
         6
             Publisher
                                   1031134 non-null object
         7
             Image-URL-S
                                   1031136 non-null object
         8
             Image-URL-M
                                   1031136 non-null object
                                   1031132 non-null object
         9
             Image-URL-L
        dtypes: int64(2), object(8)
        memory usage: 86.5+ MB
In [109...
         ratings with books.columns
Out[109... Index(['User-ID', 'ISBN', 'Book-Rating', 'Book-Title', 'Book-Author',
                 'Year-Of-Publication', 'Publisher', 'Image-URL-S', 'Image-URL-M',
                  'Image-URL-L'],
                dtype='object')
In [54]:
         num rating = ratings with name.groupby('Book-Title').count()['Book-Rating'].
          num rating.rename(columns={'Book-Rating':'num ratings'},inplace=True)
          num rating
                                                    Book-Title num_ratings
Out[54]:
                0
                      A Light in the Storm: The Civil War Diary of ...
                                                                           4
                1
                                          Always Have Popsicles
                                                                           1
                2
                               Apple Magic (The Collector's series)
                                                                           1
                3
                      Ask Lily (Young Women of Faith: Lily Series, ...
                                                                           1
                  Beyond IBM: Leadership Marketing and Finance ...
                                                                           1
                                                                          ...
                                                  Ã?Â?lpiraten.
                                                                           2
          241056
                                  Ã?Â?rger mit Produkt X. Roman.
          241057
                                                                           4
          241058
                                             Ã?Â?sterlich leben.
                                                                           1
          241059
                                           Ã?Â?stlich der Berge.
                                                                          3
          241060
                                              Ã?Â?thique en toc
                                                                          2
         241061 \text{ rows} \times 2 \text{ columns}
         avg_rating = ratings_with_name.groupby('Book-Title')['Book-Rating'].mean().r
In [55]:
          avg rating.rename(columns={'Book-Rating': 'avg rating'}, inplace=True)
          avg rating
```

| Out[55]: |        | Book-Title                                   | avg_rating |
|----------|--------|--|------------|
|          | 0      | A Light in the Storm: The Civil War Diary of | 2.250000   |
|          | 1      | Always Have Popsicles                        | 0.000000   |
|          | 2      | Apple Magic (The Collector's series)         | 0.000000   |
|          | 3      | Ask Lily (Young Women of Faith: Lily Series, | 8.000000   |
|          | 4      | Beyond IBM: Leadership Marketing and Finance | 0.000000   |
|          |        |  |            |
|          | 241056 | Ã?Â?lpiraten.                                | 0.000000   |
|          | 241057 | Ã?Â?rger mit Produkt X. Roman.               | 5.250000   |
|          | 241058 | Ã?Â?sterlich leben.                          | 7.000000   |
|          | 241059 | Ã?Â?stlich der Berge.                        | 2.666667   |
|          | 241060 | Ã?Â?thique en toc                            | 4.000000   |

241061 rows  $\times$  2 columns

```
In [57]: popular = num_rating.merge(avg_rating,on='Book-Title')
popular
```

| Out[57]: |        | Book-Title                                   | num_ratings | avg_rating |
|----------|--------|--|-------------|------------|
|          | 0      | A Light in the Storm: The Civil War Diary of | 4           | 2.250000   |
|          | 1      | Always Have Popsicles                        | 1           | 0.000000   |
|          | 2      | Apple Magic (The Collector's series)         | 1           | 0.000000   |
|          | 3      | Ask Lily (Young Women of Faith: Lily Series, | 1           | 8.000000   |
|          | 4      | Beyond IBM: Leadership Marketing and Finance | 1           | 0.000000   |
|          |        |  |             |            |
|          | 241056 | Ã?Â?lpiraten.                                | 2           | 0.000000   |
|          | 241057 | Ã?Â?rger mit Produkt X. Roman.               | 4           | 5.250000   |
|          | 241058 | Ã?Â?sterlich leben.                          | 1           | 7.000000   |
|          | 241059 | Ã?Â?stlich der Berge.                        | 3           | 2.666667   |
|          | 241060 | Ã?Â?thique en toc                            | 2           | 4.000000   |

241061 rows  $\times$  3 columns

```
In [58]: popular = popular[popular['num_ratings']>=250].sort_values('avg_rating',asce
In [59]: popular
```

|        | Book-Title  | num_ratings | avg_rating |
|--------|---|-------------|------------|
| 80421  | Harry Potter and the Order of the Phoenix (Boo      | 334         | 5.571856   |
| 191602 | The Hobbit : The Enchanting Prelude to The Lor      | 281         | 5.007117   |
| 219731 | To Kill a Mockingbird                               | 389         | 4.920308   |
| 80440  | Harry Potter and the Sorcerer's Stone (Harry P      | 571         | 4.900175   |
| 80409  | Harry Potter and the Chamber of Secrets (Book 2)    | 351         | 4.729345   |
| 183564 | The Da Vinci Code                                   | 883         | 4.652322   |
| 180547 | The Catcher in the Rye                              | 403         | 4.635236   |
| 187871 | The Five People You Meet in Heaven                  | 427         | 4.543326   |
| 187368 | The Fellowship of the Ring (The Lord of the Ri      | 257         | 4.505837   |
| 196316 | The Lovely Bones: A Novel                           | 1295        | 4.468726   |
| 144158 | Prodigal Summer: A Novel                            | 253         | 4.450593   |
| 223125 | Tuesdays with Morrie: An Old Man, a Young<br>Man,   | 391         | 4.406650   |
| 168711 | Stupid White Menand Other Sorry Excuses fo          | 283         | 4.356890   |
| 204377 | The Red Tent (Bestselling Backlist)                 | 723         | 4.334716   |
| 206492 | The Secret Life of Bees                             | 615         | 4.219512   |
| 74747  | Girl with a Pearl Earring                           | 526         | 4.218631   |
| 129373 | Nickel and Dimed: On (Not) Getting By in<br>America | 267         | 4.142322   |
| 8434   | ANGELA'S ASHES                                      | 269         | 4.115242   |
| 233360 | Where the Heart Is (Oprah's Book Club<br>(Paperba   | 585         | 4.105983   |
| 2281   | A Child Called \It\": One Child's Courage to S      | 262         | 4.091603   |
| 76340  | Good in Bed   | 470         | 4.040426   |
| 64928  | Fast Food Nation: The Dark Side of the All-<br>Ame  | 321         | 4.037383   |
| 105772 | Left Behind: A Novel of the Earth's Last Days       | 297         | 4.026936   |
| 12699  | American Gods                                       | 302         | 4.006623   |
| 5664   | A Prayer for Owen Meany                             | 412         | 3.781553   |
| 212060 | The Vampire Lestat (Vampire Chronicles, Book II)    | 301         | 3.777409   |

| 233841       White Oleander : A Novel (Oprah's Book Club)       356       3.772472         234730       Wicked: The Life and Times of the Wicked Witch       326       3.766871         219339       Timeline       407       3.761671         14391       Angels & Eamp; Demons       586       3.718430         21753       Bel Canto: A Novel       350       3.702857         118232       Me Talk Pretty One Day       340       3.691176         19779       Balzac and the Little Chinese Seamstress: A N       283       3.657246         134487       One for the Money (Stephanie Plum Novels (Pape       291       3.656357         38811       Confessions of a Shopaholic (Summer Display Op       350       3.634286         112927       Lucky: A Memoir       301       3.621262 |
|--|
| 234730       Witch       326       3.766873         219339       Timeline       407       3.761673         14391       Angels & Demons       586       3.718430         21753       Bel Canto: A Novel       350       3.702857         118232       Me Talk Pretty One Day       340       3.691176         19779       Balzac and the Little Chinese Seamstress: A N       283       3.657246         134487       One for the Money (Stephanie Plum Novels (Pape       291       3.656357         38811       Confessions of a Shopaholic (Summer Display Op       350       3.634286   |
| 14391       Angels & Demons       586       3.718430         21753       Bel Canto: A Novel       350       3.702857         118232       Me Talk Pretty One Day       340       3.691176         19779       Balzac and the Little Chinese Seamstress: A N       283       3.657246         134487       One for the Money (Stephanie Plum Novels (Pape       291       3.656357         38811       Confessions of a Shopaholic (Summer Display Op       350       3.634286  |
| 21753       Bel Canto: A Novel       350       3.702857         118232       Me Talk Pretty One Day       340       3.691176         19779       Balzac and the Little Chinese Seamstress: A N       283       3.657246         134487       One for the Money (Stephanie Plum Novels (Pape       291       3.656357         38811       Confessions of a Shopaholic (Summer Display Op       350       3.634286   |
| 118232       Me Talk Pretty One Day       340       3.691176         19779       Balzac and the Little Chinese Seamstress : A N       283       3.657246         134487       One for the Money (Stephanie Plum Novels (Pape       291       3.656357         38811       Confessions of a Shopaholic (Summer Display Op       350       3.634286  |
| 19779 Balzac and the Little Chinese Seamstress: A N 283 3.657244  134487 One for the Money (Stephanie Plum Novels (Pape 291 3.656357)  Confessions of a Shopaholic (Summer Display Op 350 3.634286)  |
| N 283 3.657242  134487 One for the Money (Stephanie Plum Novels (Pape 291 3.656357  Confessions of a Shopaholic (Summer Display Op 350 3.634286  |
| (Pape 291 3.030357<br>38811 Confessions of a Shopaholic (Summer Display Op 350 3.634286  |
| Op 350 3.034286  |
| <b>112927</b> Lucky : A Memoir 301 3.621262  |
|  |
| <b>148031</b> Red Dragon 365 3.619178  |
| <b>202540</b> The Poisonwood Bible: A Novel 494 3.609312   |
| <b>199227</b> The Nanny Diaries: A Novel 474 3.597046  |
| <b>202234</b> The Pilot's Wife : A Novel 568 3.593310  |
| <b>159293</b> She's Come Undone (Oprah's Book Club) 468 3.570513   |
| <b>93205</b> Interview with the Vampire 506 3.535573   |
| <b>818</b> 1st to Die: A Novel 391 3.498721  |
| She's Come Undone (Oprah's Book Club (Paperback)) 446 3.495516   |
| <b>223850</b> Two for the Dough 267 3.464419   |
| <b>60163</b> Empire Falls 321 3.454829   |
| <b>190736</b> The Handmaid's Tale 273 3.454212   |
| <b>74755</b> Girl, Interrupted 251 3.450199  |
| <b>52980</b> Divine Secrets of the Ya-Ya Sisterhood: A Novel 732 3.448087  |
| The Divine Secrets of the Ya-Ya Sisterhood: A 376 3.430851   |

In [70]: popularity\_df=num\_rating.merge(avg\_rating,on='Book-Title')
popularity\_df

| Out[70]: |        | Book-Title                                   | num_ratings | avg_rating |
|----------|--------|--|-------------|------------|
|          | 0      | A Light in the Storm: The Civil War Diary of | 4           | 2.250000   |
|          | 1      | Always Have Popsicles                        | 1           | 0.000000   |
|          | 2      | Apple Magic (The Collector's series)         | 1           | 0.000000   |
|          | 3      | Ask Lily (Young Women of Faith: Lily Series, | 1           | 8.000000   |
| 4        |        | Beyond IBM: Leadership Marketing and Finance | 1           | 0.000000   |
|          |        |  |             |            |
|          | 241056 | Ã?Â?lpiraten.                                | 2           | 0.000000   |
|          | 241057 | Ã?Â?rger mit Produkt X. Roman.               | 4           | 5.250000   |
| 24105    |        | Ã?Â?sterlich leben.                          | 1           | 7.000000   |
|          | 241059 | Ã?Â?stlich der Berge.                        | 3           | 2.666667   |
|          | 241060 | Ã?Â?thique en toc                            | 2           | 4.000000   |

241061 rows  $\times$  3 columns

```
In [72]: popularity_df=popularity_df[popularity_df['num_ratings']>=250].sort_values('
```

In [73]: popularity\_df

|        | Book-Title  | num_ratings | avg_rating |
|--------|---|-------------|------------|
| 233841 | White Oleander : A Novel (Oprah's Book Club)                      | 356         | 3.772472   |
| 234730 | Wicked: The Life and Times of the Wicked Witch                    | 326         | 3.766871   |
| 219339 | Timeline  | 407         | 3.761671   |
| 14391  | Angels & amp; Demons  | 586         | 3.718430   |
| 21753  | Bel Canto: A Novel  | 350         | 3.702857   |
| 118232 | Me Talk Pretty One Day  | 340         | 3.691176   |
| 19779  | Balzac and the Little Chinese Seamstress : A $${\rm N}_{\cdots}$$ | 283         | 3.657244   |
| 134487 | One for the Money (Stephanie Plum Novels (Pape                    | 291         | 3.656357   |
| 38811  | Confessions of a Shopaholic (Summer Display Op                    | 350         | 3.634286   |
| 112927 | Lucky : A Memoir  | 301         | 3.621262   |
| 148031 | Red Dragon  | 365         | 3.619178   |
| 202540 | The Poisonwood Bible: A Novel                                     | 494         | 3.609312   |
| 199227 | The Nanny Diaries: A Novel  | 474         | 3.597046   |
| 202234 | The Pilot's Wife : A Novel  | 568         | 3.593310   |
| 159293 | She's Come Undone (Oprah's Book Club)                             | 468         | 3.570513   |
| 93205  | Interview with the Vampire  | 506         | 3.535573   |
| 818    | 1st to Die: A Novel   | 391         | 3.498721   |
| 159292 | She's Come Undone (Oprah's Book Club<br>(Paperback))              | 446         | 3.495516   |
| 223850 | Two for the Dough   | 267         | 3.464419   |
| 60163  | Empire Falls  | 321         | 3.454829   |
| 190736 | The Handmaid's Tale   | 273         | 3.454212   |
| 74755  | Girl, Interrupted   | 251         | 3.450199   |
| 52980  | Divine Secrets of the Ya-Ya Sisterhood: A Novel                   | 732         | 3.448087   |
| 184931 | The Divine Secrets of the Ya-Ya Sisterhood: A                     | 376         | 3.430851   |
|        |   |             |            |

In [75]: popular\_df=popularity\_df.merge(book,on='Book-Title').drop\_duplicates('Book-Title')

In [76]: popular\_df

| $\sim$ |    |    | $\Gamma$ | $\overline{}$ | _ | 7 |  |
|--------|----|----|----------|---------------|---|---|--|
| 11     | 11 | Τ. |          | -/            | h |   |  |
| $\cup$ | u  | υ. |          | /             | v |   |  |
|        |    |    | -        |               |   | - |  |

|    |    | Book-Title   | Book-<br>Author       | Image-URL-M r                                  |
|----|----|--|-----------------------|--|
|    | 0  | Harry Potter<br>and the<br>Order of the<br>Phoenix<br>(Boo   | J. K.<br>Rowling      | http://images.amazon.com/images/P/043935806X.0 |
|    | 4  | The Hobbit :<br>The<br>Enchanting<br>Prelude to<br>The Lor   | J.R.R.<br>TOLKIEN     | http://images.amazon.com/images/P/0345339681.0 |
|    | 5  | To Kill a<br>Mockingbird                                     | Harper Lee            | http://images.amazon.com/images/P/0446310786.0 |
|    | 13 | Harry Potter<br>and the<br>Sorcerer's<br>Stone (Harry<br>P   | J. K.<br>Rowling      | http://images.amazon.com/images/P/059035342X.0 |
|    | 15 | Harry Potter<br>and the<br>Chamber of<br>Secrets<br>(Book 2) | J. K.<br>Rowling      | http://images.amazon.com/images/P/0439064872.0 |
| 18 | 18 | The Da Vinci<br>Code   | Dan Brown             | http://images.amazon.com/images/P/0385504209.0 |
|    | 24 | The Catcher in the Rye                                       | J.D.<br>Salinger      | http://images.amazon.com/images/P/0316769487.0 |
|    | 31 | The Five<br>People You<br>Meet in<br>Heaven                  | Mitch<br>Albom        | http://images.amazon.com/images/P/0786868716.0 |
|    | 33 | The<br>Fellowship<br>of the Ring<br>(The Lord of<br>the Ri   | J.R.R.<br>TOLKIEN     | http://images.amazon.com/images/P/0345339703.0 |
|    | 42 | The Lovely<br>Bones: A<br>Novel                              | Alice<br>Sebold       | http://images.amazon.com/images/P/0316666343.0 |
|    | 43 | Prodigal<br>Summer: A<br>Novel                               | Barbara<br>Kingsolver | http://images.amazon.com/images/P/0060959037.0 |
|    | 44 | Tuesdays<br>with Morrie:<br>An Old Man,<br>a Young<br>Man,   | MITCH<br>ALBOM        | http://images.amazon.com/images/P/0385484518.0 |
|    | 47 | Stupid<br>White Men<br>and Other                             | Michael<br>Moore      | http://images.amazon.com/images/P/0060392452.0 |

|    | Book-Title   | Book-<br>Author       | Image-URL-M r                                  |
|----|--|-----------------------|--|
|    | Sorry<br>Excuses fo  |                       |  |
| 48 | The Red<br>Tent<br>(Bestselling<br>Backlist)                 | Anita<br>Diamant      | http://images.amazon.com/images/P/0312195516.0 |
| 49 | The Secret<br>Life of Bees                                   | Sue Monk<br>Kidd      | http://images.amazon.com/images/P/0142001740.0 |
| 55 | Girl with a<br>Pearl<br>Earring                              | Tracy<br>Chevalier    | http://images.amazon.com/images/P/0452282152.0 |
| 56 | Nickel and<br>Dimed: On<br>(Not)<br>Getting By<br>in America | Barbara<br>Ehrenreich | http://images.amazon.com/images/P/0805063897.0 |
| 58 | ANGELA'S<br>ASHES  | Frank<br>McCourt      | http://images.amazon.com/images/P/0684874350.0 |
| 60 | Where the<br>Heart Is<br>(Oprah's<br>Book Club<br>(Paperba   | Billie Letts          | http://images.amazon.com/images/P/0446672211.0 |
| 61 | A Child<br>Called \lt\":<br>One Child's<br>Courage to<br>S   | Dave<br>Pelzer        | http://images.amazon.com/images/P/1558743669.0 |
| 63 | Good in Bed  | Jennifer<br>Weiner    | http://images.amazon.com/images/P/0743418174.0 |
| 65 | Fast Food<br>Nation: The<br>Dark Side of<br>the All-<br>Ame  | Eric<br>Schlosser     | http://images.amazon.com/images/P/0060938455.0 |
| 66 | Left Behind:<br>A Novel of<br>the Earth's<br>Last Days       | Tim<br>Lahaye         | http://images.amazon.com/images/P/0842329129.0 |
| 68 | American<br>Gods   | Neil<br>Gaiman        | http://images.amazon.com/images/P/0380789035.0 |
| 69 | A Prayer for<br>Owen<br>Meany                                | John Irving           | http://images.amazon.com/images/P/0345361792.0 |
| 71 | The Vampire<br>Lestat<br>(Vampire<br>Chronicles,<br>Book II) | ANNE RICE             | http://images.amazon.com/images/P/0345313860.0 |

|     | Book-Title   | Book-<br>Author       | Image-URL-M r                                  |
|-----|--|-----------------------|--|
| 72  | White<br>Oleander : A<br>Novel<br>(Oprah's<br>Book Club)   | Janet Fitch           | http://images.amazon.com/images/P/0316284955.0 |
| 73  | Wicked: The<br>Life and<br>Times of the<br>Wicked<br>Witch | Gregory<br>Maguire    | http://images.amazon.com/images/P/0060987103.0 |
| 74  | Timeline   | MICHAEL<br>CRICHTON   | http://images.amazon.com/images/P/0345417623.0 |
| 81  | Angels<br>&<br>Demons                                      | Dan Brown             | http://images.amazon.com/images/P/0671027360.0 |
| 86  | Bel Canto: A<br>Novel                                      | Ann<br>Patchett       | http://images.amazon.com/images/P/0060934417.0 |
| 87  | Me Talk<br>Pretty One<br>Day                               | David<br>Sedaris      | http://images.amazon.com/images/P/0316776963.0 |
| 91  | Balzac and<br>the Little<br>Chinese<br>Seamstress<br>: A N | DAI SIJIE             | http://images.amazon.com/images/P/0385722206.0 |
| 93  | One for the<br>Money<br>(Stephanie<br>Plum Novels<br>(Pape | Janet<br>Evanovich    | http://images.amazon.com/images/P/0061009059.0 |
| 94  | Confessions<br>of a<br>Shopaholic<br>(Summer<br>Display Op | SOPHIE<br>KINSELLA    | http://images.amazon.com/images/P/0385335482.0 |
| 95  | Lucky : A<br>Memoir  | Alice<br>Sebold       | http://images.amazon.com/images/P/0316096199.0 |
| 96  | Red Dragon   | Thomas<br>Harris      | http://images.amazon.com/images/P/0440206154.0 |
| 104 | The<br>Poisonwood<br>Bible: A<br>Novel                     | Barbara<br>Kingsolver | http://images.amazon.com/images/P/0060930535.0 |
| 105 | The Nanny<br>Diaries: A<br>Novel                           | Emma<br>McLaughlin    | http://images.amazon.com/images/P/0312278586.0 |

|     | Book-Title  | Book-<br>Author    | Image-URL-M                                    |
|-----|---|--------------------|--|
| 107 | The Pilot's<br>Wife : A<br>Novel                              | Anita<br>Shreve    | http://images.amazon.com/images/P/0316601950.0 |
| 108 | She's Come<br>Undone<br>(Oprah's<br>Book Club)                | Wally<br>Lamb      | http://images.amazon.com/images/P/0671021001.0 |
| 109 | Interview<br>with the<br>Vampire                              | Anne Rice          | http://images.amazon.com/images/P/0345337662.0 |
| 111 | 1st to Die: A<br>Novel  | James<br>Patterson | http://images.amazon.com/images/P/0446610038.0 |
| 113 | She's Come<br>Undone<br>(Oprah's<br>Book Club<br>(Paperback)) | Wally<br>Lamb      | http://images.amazon.com/images/P/0671003755.0 |
| 114 | Two for the<br>Dough  | Janet<br>Evanovich | http://images.amazon.com/images/P/0671001795.0 |
| 115 | Empire Falls  | Richard<br>Russo   | http://images.amazon.com/images/P/0375726403.0 |
| 118 | The<br>Handmaid's<br>Tale                                     | Margaret<br>Atwood | http://images.amazon.com/images/P/0449212602.0 |
| 122 | Girl,<br>Interrupted  | SUSANNA<br>KAYSEN  | http://images.amazon.com/images/P/0679746048.0 |
| 125 | Divine<br>Secrets of<br>the Ya-Ya<br>Sisterhood:<br>A Novel   | Rebecca<br>Wells   | http://images.amazon.com/images/P/0060928336.0 |
| 128 | The Divine<br>Secrets of<br>the Ya-Ya<br>Sisterhood:<br>A     | Rebecca<br>Wells   | http://images.amazon.com/images/P/0060502258.0 |
|     |   |                    |  |

In [107... popular\_df.info()

```
<class 'pandas.core.frame.DataFrame'>
        Int64Index: 50 entries, 0 to 128
        Data columns (total 5 columns):
                         Non-Null Count Dtype
            Column
        --- -----
                         -----
         0
            Book-Title
                         50 non-null
                                         object
            Book-Author 50 non-null
                                         object
         2
            Image-URL-M 50 non-null
                                         object
         3
            num ratings 50 non-null
                                         int64
        4
            avg rating 50 non-null
                                         float64
        dtypes: float64(1), int64(1), object(3)
        memory usage: 2.3+ KB
In [110... popular df.columns
Out[110... Index(['Book-Title', 'Book-Author', 'Image-URL-M', 'num ratings',
                'avg rating'],
               dtype='object')
In [80]: x=ratings with name.groupby('User-ID').count()['Book-Rating']>200
         educated users=x[x].index
In [81]: x
Out[81]: User-ID
         2
                   False
         8
                   False
         9
                   False
         10
                   False
         12
                   False
                   . . .
         278844
                   False
         278846
                   False
         278849
                   False
         278851
                   False
         278854
                   False
         Name: Book-Rating, Length: 83910, dtype: bool
In [83]: filtered ratings=ratings with name[ratings with name['User-ID'].isin(educate
In [84]: filtered ratings
```

| $\cap$ | 114 | [0/1  |   |
|--------|-----|-------|---|
| U      | U L | 1.041 | - |

|        | User-<br>ID | Book-<br>Rating | Book-Title   | Book-<br>Author                        | Year-Of-<br>Publication | Publisher                                  |  |  |
|--------|-------------|-----------------|--|--|-------------------------|--|--|--|
| 2      | 6543        | 0               | Flesh Tones:<br>A Novel                                    | M. J. Rose                             | 2002                    | Ballantine Books                           |  |  |
| 5      | 23768       | 0               | Flesh Tones:<br>A Novel                                    | M. J. Rose                             | 2002                    | Ballantine Books                           |  |  |
| 7      | 28523       | 0               | Flesh Tones:<br>A Novel                                    | M. J. Rose                             | 2002                    | Ballantine Books                           |  |  |
| 15     | 77940       | 0               | Flesh Tones:<br>A Novel                                    | M. J. Rose                             | 2002                    | Ballantine Books                           |  |  |
| 16     | 81977       | 0               | Flesh Tones:<br>A Novel                                    | M. J. Rose                             | 2002                    | Ballantine Books                           |  |  |
|        |             |                 |  |  |                         |  |  |  |
| 882841 | 275970      | 0               | The Millard Fuller   |  | 1994                    | Smyth &<br>Helwys<br>Publishing            |  |  |
| 882842 | 275970      | 0               | The Ordeal<br>of<br>Integration:<br>Progress and<br>Resent | Orlando<br>Patterson                   | 1998                    | Civitas Book<br>Publisher                  |  |  |
| 882843 | 275970      | 0               | Pushcart's<br>Complete<br>Rotten<br>Reviews<br>&<br>Rejec  | Bill<br>Henderson                      | 1998                    | Pushcart Press                             |  |  |
| 882844 | 275970      | 0               | There's a<br>Porcupine in<br>My<br>Outhouse:<br>Misadventu | Mike<br>Tougias                        | 2002                    | Capital Books<br>(VA)                      |  |  |
| 882845 | 275970      | 10              | Die Biene.   | Sybil GrÃ?<br>¤fin<br>SchÃ?<br>¶nfeldt | 1993                    | Bibliographisches<br>Institut,<br>Mannheim |  |  |

382064 rows × 6 columns

In [106... filtered\_ratings.info()

```
<class 'pandas.core.frame.DataFrame'>
        Int64Index: 382064 entries, 2 to 882845
        Data columns (total 6 columns):
            Column
                                 Non-Null Count
                                                  Dtype
        --- -----
                                 -----
                                                  ----
         0
            User-ID
                                 382064 non-null int64
         1
            Book-Rating
                                 382064 non-null int64
         2
            Book-Title
                                 382064 non-null object
         3
            Book-Author
                                 382064 non-null object
         4
           Year-Of-Publication 382064 non-null object
         5
            Publisher
                                 382063 non-null object
        dtypes: int64(2), object(4)
        memory usage: 20.4+ MB
In [111... filtered ratings.columns
Out[111... Index(['User-ID', 'Book-Rating', 'Book-Title', 'Book-Author',
                'Year-Of-Publication', 'Publisher'],
               dtype='object')
In [85]: y=filtered ratings.groupby('Book-Title').count()['Book-Rating']>=50
         famous books=y[y].index
In [86]: y
Out[86]: Book-Title
          A Light in the Storm: The Civil War Diary of Amelia Martin, Fenwick Islan
         d, Delaware, 1861 (Dear America)
                                           False
          Always Have Popsicles
         False
          Apple Magic (The Collector's series)
         False
          Beyond IBM: Leadership Marketing and Finance for the 1990s
         False
          Clifford Visita El Hospital (Clifford El Gran Perro Colorado)
         False
         �coute ma différence (Le Temps des femmes)
         Ã?Â?ber das Fernsehen.
         Ã?Â?ber die Pflicht zum Ungehorsam gegen den Staat.
         False
         Ã?Â?lpiraten.
         False
         Ä?Ä?stlich der Berge.
         False
         Name: Book-Rating, Length: 147674, dtype: bool
In [88]: final ratings=filtered ratings[filtered ratings['Book-Title'].isin(famous bd
In [89]: final ratings
```

| -  |     |   | - | -       | _      | - |   |
|----|-----|---|---|---------|--------|---|---|
| 11 | 1.1 | - |   | $\circ$ | ( )    |   |   |
|    |     |   | - | $\cap$  | $\neg$ | - | _ |

|        | User-<br>ID | Book-<br>Rating | Book-Title                                 | Book-<br>Author          | Year-Of-<br>Publication | Publisher                      |
|--------|-------------|-----------------|--|--------------------------|-------------------------|--------------------------------|
| 63     | 277427      | 0               | Lightning                                  | Dean R.<br>Koontz        | 1996                    | Berkley<br>Publishing<br>Group |
| 69     | 13552       | 10              | Lightning                                  | Dean R.<br>Koontz        | 1996                    | Berkley<br>Publishing<br>Group |
| 70     | 14521       | 0               | Lightning                                  | Dean R.<br>Koontz        | 1996                    | Berkley<br>Publishing<br>Group |
| 72     | 16795       | 8               | Lightning                                  | Dean R.<br>Koontz        | 1996                    | Berkley<br>Publishing<br>Group |
| 74     | 23768       | 0               | Lightning                                  | Dean R.<br>Koontz        | 1996                    | Berkley<br>Publishing<br>Group |
|        |             |                 |  |                          |                         |                                |
| 416891 | 246655      | 246655 0        | Deck the<br>Halls<br>(Holiday<br>Classics) | Mary<br>Higgins<br>Clark | 2002                    | Pocket                         |
| 416892 | 250184      | 0               | Deck the<br>Halls<br>(Holiday<br>Classics) | Mary<br>Higgins<br>Clark | 2002                    | Pocket                         |
| 416894 | 256407      | 0               | Deck the<br>Halls<br>(Holiday<br>Classics) | Mary<br>Higgins<br>Clark | 2002                    | Pocket                         |
| 416895 | 261829      | 0               | Deck the<br>Halls<br>(Holiday<br>Classics) | Mary<br>Higgins<br>Clark | 2002                    | Pocket                         |
| 416897 | 266226      | 0               | Deck the<br>Halls<br>(Holiday<br>Classics) | Mary<br>Higgins<br>Clark | 2002                    | Pocket                         |

26162 rows  $\times$  6 columns

```
<class 'pandas.core.frame.DataFrame'>
        Int64Index: 26162 entries, 63 to 416897
        Data columns (total 6 columns):
            Column
                                 Non-Null Count Dtype
        --- -----
                                 -----
            User-ID
                                 26162 non-null int64
         0
         1
             Book-Rating
                                 26162 non-null int64
                                 26162 non-null object
         2
            Book-Title
         3
            Book-Author
                                 26162 non-null object
            Year-Of-Publication 26162 non-null object
         4
         5
            Publisher
                                 26162 non-null object
        dtypes: int64(2), object(4)
        memory usage: 1.4+ MB
In [112... final ratings.columns
Out[112... Index(['User-ID', 'Book-Rating', 'Book-Title', 'Book-Author',
                'Year-Of-Publication', 'Publisher'],
               dtype='object')
In [90]: pt=final_ratings.pivot_table(index='Book-Title',columns='User-ID',values='Book-Title')
In [91]: pt
```

| Out[91]: | User-ID  | 254 | 2276 | 2766 | 2977 | 3363 | 4385 | 6251 | 6543 | 6575 | 7158 |
|----------|--|-----|------|------|------|------|------|------|------|------|------|
|          | Book-Title   |     |      |      |      |      |      |      |      |      |      |
|          | 1st to Die: A<br>Novel   | NaN | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  | 9.0  | NaN  | NaN  |
|          | 4 Blondes  | NaN | NaN  | NaN  | NaN  | NaN  | NaN  | 0.0  | NaN  | NaN  | NaN  |
|          | A Case of<br>Need  | NaN | NaN  | 0.0  | NaN  | NaN  | NaN  | 0.0  | NaN  | NaN  | NaN  |
|          | A Child Called<br>\It\": One<br>Child's<br>Courage to<br>Survive"                | NaN | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  |
|          | A<br>Heartbreaking<br>Work of<br>Staggering<br>Genius                            | NaN | NaN  | NaN  | 3.0  | NaN  | NaN  | 4.0  | 0.0  | 7.0  | NaN  |
|          |  |     |      |      |      |      |      |      |      |      |      |
|          | Year of<br>Wonders   | NaN | NaN  | NaN  | 7.0  | NaN  | NaN  | NaN  | 0.0  | 0.0  | NaN  |
|          | You Belong To<br>Me  | NaN | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  | 0.0  |
|          | Zen and the<br>Art of<br>Motorcycle<br>Maintenance:<br>An Inquiry<br>into Values | NaN | NaN  | NaN  | NaN  | 0.0  | NaN  | 0.0  | NaN  | NaN  | NaN  |
|          | Zoya   | NaN | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  |
|          | \O\" Is for<br>Outlaw"   | NaN | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  | NaN  |

342 rows  $\times$  665 columns

In [92]: pt.fillna(0,inplace=True)

In [93]: pt

| Out[93]: | User-ID  | 254 | 2276 | 2766 | 2977 | 3363 | 4385 | 6251 | 6543 | 6575 | 7158 |
|----------|--|-----|------|------|------|------|------|------|------|------|------|
|          | Book-Title   |     |      |      |      |      |      |      |      |      |      |
|          | 1st to Die: A<br>Novel   | 0.0 | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 9.0  | 0.0  | 0.0  |
|          | 4 Blondes  | 0.0 | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  |
|          | A Case of<br>Need  | 0.0 | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  |
|          | A Child Called<br>\lt\": One<br>Child's<br>Courage to<br>Survive"                | 0.0 | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  |
|          | A<br>Heartbreaking<br>Work of<br>Staggering<br>Genius                            | 0.0 | 0.0  | 0.0  | 3.0  | 0.0  | 0.0  | 4.0  | 0.0  | 7.0  | 0.0  |
|          |  |     |      |      |      |      |      |      |      |      |      |
|          | Year of<br>Wonders   | 0.0 | 0.0  | 0.0  | 7.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  |
|          | You Belong To<br>Me  | 0.0 | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  |
|          | Zen and the<br>Art of<br>Motorcycle<br>Maintenance:<br>An Inquiry<br>into Values | 0.0 | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  |
|          | Zoya   | 0.0 | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  |
|          | \O\" Is for<br>Outlaw"   | 0.0 | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  | 0.0  |

342 rows × 665 columns

In [95]: from sklearn.metrics.pairwise import cosine\_similarity

In [96]: similarity\_score=cosine\_similarity(pt)
 similarity\_score

```
Out[96]: array([[1. , 0. , 0.02085258, ..., 0.04702034, 0.14187761,
            0.21732542],
            [0. , 1.
                            , 0.14526454, ..., 0. , 0. , 0.
            0.
                   ],
            [0.02085258, 0.14526454, 1. , ..., 0. , 0. , 0.
            0.],
            [0.04702034, 0. , 0. , ..., 1. , 0.07499688,
            0.05053319],
                                     , ..., 0.07499688, 1.
            [0.14187761, 0. , 0.
            0.1757118 ],
                            , 0. , ..., 0.05053319, 0.1757118 ,
            [0.21732542, 0.
            1.
               ]])
```

In [99]: print(pt.index.tolist()) # This will give me a list of all book titles

['1st to Die: A Novel', '4 Blondes', 'A Case of Need', 'A Child Called \\It \\": One Child\'s Courage to Survive"', 'A Heartbreaking Work of Staggering Genius', 'A Is for Alibi (Kinsey Millhone Mysteries (Paperback))', 'A Painte d House', 'A Prayer for Owen Meany', 'A Thin Dark Line (Mysteries & Dark Line) or)', "A Thousand Acres (Ballantine Reader's Circle)", 'A Time to Kill', "A Virtuous Woman (Oprah's Book Club (Paperback))", 'A Walk to Remember', 'A Wr inkle In Time', 'A Wrinkle in Time', "ANGELA'S ASHES", 'Airframe', 'All Arou nd the Town', 'All I Really Need to Know', 'All That Remains (Kay Scarpetta Mysteries (Paperback))', 'All the Pretty Horses (The Border Trilogy, Vol 1)', 'Along Came a Spider (Alex Cross Novels)', 'American Gods', "Angela's A shes (MMP) : A Memoir", "Angela's Ashes: A Memoir", 'Angels & Demons', 'Animal Dreams', 'Anne Frank: The Diary of a Young Girl', 'Anne of Avonlea (Anne of Green Gables Novels (Paperback))', 'Anne of Green Gables (Anne of G reen Gables Novels (Paperback))', 'Artemis Fowl (Artemis Fowl, Book 1)', 'As hes to Ashes', 'At Home in Mitford (The Mitford Years)', 'Atonement : A Nove 'B Is for Burglar (Kinsey Millhone Mysteries (Paperback))', 'Back Road s', 'Balzac and the Little Chinese Seamstress : A Novel', 'Before I Say Good -Bye', 'Bel Canto: A Novel', 'Betrayal in Death', "Big Stone Gap: A Novel (B allantine Reader's Circle)", 'Black and Blue', 'Body of Evidence (Kay Scarpe tta Mysteries (Paperback))', 'Breath, Eyes, Memory', 'Breathing Lessons', 'B ridget Jones: The Edge of Reason', 'C Is for Corpse (Kinsey Millhone Mysteri es (Paperback))', "CAT'S EYE", 'Call of the Wild', 'Carolina Moon', 'Cat &am p; Mouse (Alex Cross Novels)', 'Cause of Death', "Charlotte's Web (Trophy Ne wbery)", 'Chicken Soup for the Soul (Chicken Soup for the Soul)', "Chicken S oup for the Woman's Soul (Chicken Soup for the Soul Series (Paper))", 'Circl e of Friends', 'Clear and Present Danger (Jack Ryan Novels)', 'Cold Mountain : A Novel', 'Confessions of a Shopaholic (Summer Display Opportunity)', 'Con fessions of an Ugly Stepsister : A Novel', 'Congo', 'Cruel & Drusual (Ka y Scarpetta Mysteries (Paperback))', 'D Is for Deadbeat (Kinsey Millhone Mys teries (Paperback))', 'Daisy Fay and the Miracle Man', 'Dance upon the Air (Three Sisters Island Trilogy)', 'Dances With Wolves', 'Dark Paradise', 'Daw n (Cutler)', 'Debt of Honor (Jack Ryan Novels)', 'Deception Point', 'Deck th e Halls (Holiday Classics)', 'Degree of Guilt', 'Disclosure', 'Divine Secret s of the Ya-Ya Sisterhood: A Novel', 'Dolores Claiborne', "Don't Sweat the S mall Stuff and It's All Small Stuff : Simple Ways to Keep the Little Things from Taking Over Your Life (Don't Sweat the Small Stuff Series)", 'Dragonfly in Amber', "Drowning Ruth (Oprah's Book Club)", 'Dying for Chocolate (Culina ry Mysteries (Paperback))', 'E Is for Evidence: A Kinsey Millhone Mystery (K insey Millhone Mysteries (Paperback))', 'Ellen Foster', 'Empire Falls', 'F I
s for Fugitive (Kinsey Millhone Mysteries (Paperback))', 'FORREST GUMP (Movi e Tie in)', 'Face the Fire (Three Sisters Island Trilogy)', 'Faking It', 'Fa ll On Your Knees (Oprah #45)', 'False Memory', 'Fast Food Nation: The Dark S ide of the All-American Meal', 'Fear Nothing', 'Final Target', 'Fine Thing s', 'Five Quarters of the Orange', 'Forever... : A Novel of Good and Evil, L ove and Hope', 'Four To Score (A Stephanie Plum Novel)', 'Fried Green Tomato es at the Whistle Stop Cafe', "From Potter's Field", "Full House (Janet Evan ovich's Full Series)", "Full Tilt (Janet Evanovich's Full Series)", 'G Is fo r Gumshoe (Kinsey Millhone Mysteries (Paperback))', 'Girl with a Pearl Earri ng', 'Girl, Interrupted', 'Good in Bed', 'Guilty as Sin', 'H Is for Homicide (Kinsey Milhone Mysteries (Paperback))', 'Hannibal', 'Hard Eight : A Stepha nie Plum Novel (A Stephanie Plum Novel)', 'Harry Potter and the Chamber of S ecrets (Book 2)', 'Harry Potter and the Goblet of Fire (Book 4)', 'Harry Pot ter and the Order of the Phoenix (Book 5)', 'Harry Potter and the Prisoner o f Azkaban (Book 3)', "Harry Potter and the Sorcerer's Stone (Harry Potter (P aperback))", 'Heart of the Sea (Irish Trilogy)', 'Hearts In Atlantis', 'Heav en and Earth (Three Sisters Island Trilogy)', 'Here on Earth', 'Hide & S

eek', 'Hideaway', 'High Five (A Stephanie Plum Novel)', 'Hot Six : A Stephan ie Plum Novel (A Stephanie Plum Novel)', 'House of Sand and Fog', 'How to Ma ke an American Quilt', 'I Is for Innocent', 'I Know This Much Is True', 'I K now Why the Caged Bird Sings', "I'll Be Seeing You", 'Icy Sparks', 'Inner Ha rbor (Quinn Brothers (Paperback))', 'Interview with the Vampire', 'Into the Wild', 'Invasion', 'Isle of Dogs', 'J Is for Judgment', 'Jack & Dogs', 'J Is for Judgment', 'Jack & Dogs', 'J Isle of Do ex Cross Novels)', 'Jemima J: A Novel About Ugly Ducklings and Swans', 'Jewe l', "Jewel (Oprah's Book Club)", 'Jewels of the Sun (Irish Trilogy)', 'Juras sic Park', 'K Is for Killer (Kinsey Millhone Mysteries (Paperback))', 'Key o f Knowledge (Key Trilogy (Paperback))', 'Key of Light (Key Trilogy (Paperbac k))', 'Key of Valor (Roberts, Nora. Key Trilogy, 3.)', 'Kiss the Girls', 'L Is for Lawless', "Lamb : The Gospel According to Biff, Christ's Childhood Pa l", "Left Behind: A Novel of the Earth's Last Days (Left Behind No. 1)", 'Le t Me Call You Sweetheart', 'Lightning', 'Like Water for Chocolate: A Novel i n Monthly Installments With Recipes, Romances and Home Remedies', 'Little Al tars Everywhere: A Novel', 'Lord of the Flies', 'Love in the Time of Cholera (Penguin Great Books of the 20th Century)', 'Loves Music, Loves to Dance', 'Lucky : A Memoir', 'M Is for Malice', 'Macgregor Grooms (Macgregors)', 'Me Talk Pretty One Day', 'Midnight in the Garden of Good and Evil: A Savannah S tory', 'Midwives: A Novel', 'Moonlight Becomes You', 'Morality for Beautiful Girls (No.1 Ladies Detective Agency)', 'Mystic River', 'N Is for Noose', 'Ne verwhere', 'Nickel and Dimed: On (Not) Getting By in America', 'Nicolae: The Rise of Antichrist (Left Behind No. 3)', 'Night', 'Night Sins', 'Night Whisp ers', 'On the Street Where You Live', 'One Door Away from Heaven', 'One for the Money (A Stephanie Plum Novel)', 'One for the Money (Stephanie Plum Nove ls (Paperback))', 'P Is for Peril', 'Patriot Games (Jack Ryan Novels)', 'Pay It Forward', 'Plainsong (Vintage Contemporaries)', 'Point of Origin', 'Polit ically Correct Bedtime Stories: Modern Tales for Our Life and Times', 'Postm ortem', 'Presumed Innocent', "Pretend You Don't See Her", 'Purity in Death', 'Red Dragon', 'Red Storm Rising', 'Remember Me', 'Rising Sun', "River's En d", 'River, Cross My Heart', 'Roses Are Red (Alex Cross Novels)', 'SHIPPING NEWS', 'Sanctuary', 'Saving Faith', 'Scarlett : The Sequel to Margaret Mitch ell\'s \\Gone With the Wind\\""', "Schindler's List", 'Sea Swept (Quinn Brot hers (Paperback))', 'Seabiscuit', 'Seabiscuit: An American Legend', 'Secret History', "She's Come Undone (Oprah's Book Club (Paperback))", "She's Come U ndone (Oprah's Book Club)", 'Shell Seekers', 'Shopaholic Takes Manhattan (Su mmer Display Opportunity)', 'Shopaholic Ties the Knot', 'Silence of the Lamb s', 'Skipping Christmas', "Songs in Ordinary Time (Oprah's Book Club (Paperb ack))", 'Sphere', 'Still Waters', 'Stupid White Men ...and Other Sorry Excus es for the State of the Nation!', 'Summer Pleasures', 'Tara Road', 'Tears of the Giraffe (No.1 Ladies Detective Agency)', 'Tears of the Moon (Irish Trilo gy)', 'Tell Me Lies (Tell Me Lies)', 'Tell No One', 'The Alienist', 'The Ang el of Darkness', 'The Bachelor (Warner Books Contemporary Romance)', 'The Ba d Beginning (A Series of Unfortunate Events, Book 1)', 'The Bad Place', 'The Beach House', 'The Bean Trees', 'The Body Farm', 'The Bonfire of the Vanitie s', "The Book of Ruth (Oprah's Book Club (Paperback))", 'The Bourne Identit y', 'The Bridges of Madison County', 'The Burden of Proof', 'The Cardinal of the Kremlin (Jack Ryan Novels)', 'The Catcher in the Rye', 'The Celestine Pr ophecy (Celestine Prophecy)', "The Clan of the Cave Bear (Earth's Children (Paperback))", "The Color of Water: A Black Man's Tribute to His White Mothe r", 'The Copper Beech', 'The Da Vinci Code', 'The Dark Half', 'The Divine Se crets of the Ya-Ya Sisterhood: A Novel', 'The Dogs of Babel (Today Show Book Club #12)', 'The Door to December', 'The English Patient', 'The Fellowship o f the Ring (The Lord of the Rings, Part 1)', 'The Five People You Meet in He aven', 'The Girl Who Loved Tom Gordon', "The Girls' Guide to Hunting and Fis hing", 'The Giver (21st Century Reference)', 'The Glass Lake', 'The God of S

mall Things', "The Handmaid's Tale", 'The Hobbit : The Enchanting Prelude to The Lord of the Rings', 'The Horse Whisperer', 'The Hot Zone', 'The Hours: A Novel', 'The House of the Spirits', "The Idiot Girls' Action Adventure Clu b", 'The Joy Luck Club', 'The King of Torts', 'The Last Precinct', 'The Last Time They Met : A Novel', 'The Loop', 'The Lost World', 'The Lottery Winner : Alvirah And Willy Stories', 'The Lovely Bones: A Novel', 'The Mists of Ava lon', 'The Mulberry Tree', 'The Mummy or Ramses the Damned', 'The Murder Boo k', 'The Nanny Diaries: A Novel', "The No. 1 Ladies' Detective Agency (Today Show Book Club #8)", 'The Notebook', 'The Pelican Brief', 'The Pillars of th e Earth', "The Pilot's Wife : A Novel", "The Plains of Passage (Earth's Chil dren (Paperback))", 'The Poisonwood Bible: A Novel', 'The Prince of Tides', 'The Queen of the Damned (Vampire Chronicles (Paperback))', 'The Rainmaker', 'The Rapture of Canaan', 'The Red Tent (Bestselling Backlist)', 'The Reef', 'The Rescue', 'The Return Journey', 'The Return of the King (The Lord of the Rings, Part 3)', 'The Robber Bride', 'The Runaway Jury', 'The Saving Graces: A Novel', 'The Secret Life of Bees', 'The Shipping News : A Novel', 'The Sim ple Truth', 'The Stone Diaries', 'The Street Lawyer', 'The Sum of All Fears (Jack Ryan Novels)', 'The Summerhouse', 'The Summons', 'The Surgeon', "The S weet Potato Queens' Book of Love", 'The Tale of the Body Thief (Vampire Chro nicles (Paperback))', 'The Tao of Pooh', 'The Testament', 'The Thorn Birds',
'The Tommyknockers', 'The Ugly Duckling', 'The Vampire Lestat (Vampire Chron icles, Book II)', 'The Weight of Water : A Novel Tag: Author of Resistance a nd Strange Fits of Passion', 'The Winner', 'The Witching Hour (Lives of the Mayfair Witches)', 'Three Junes', 'Three To Get Deadly : A Stephanie Plum No vel (A Stephanie Plum Novel)', 'Timeline', 'To Kill a Mockingbird', 'To the Nines: A Stephanie Plum Novel', "Tom Clancy's Op-Center (Tom Clancy's Op Cen ter (Paperback))", 'Touching Evil', 'Tribulation Force: The Continuing Drama of Those Left Behind (Left Behind No. 2)', 'Truly, Madly Manhattan', "Tuesda ys with Morrie: An Old Man, a Young Man, and Life's Greatest Lesson", 'Two f or the Dough', 'Under the Tuscan Sun', "Vinegar Hill (Oprah's Book Club (Pap erback))", 'Violets Are Blue', 'We Were the Mulvaneys', "We'll Meet Again", 'Welcome to Temptation', 'Welcome to the World, Baby Girl!', 'What Looks Lik e Crazy On An Ordinary Day', "What to Expect When You're Expecting (Revised Edition)", "Where the Heart Is (Oprah's Book Club (Paperback))", 'Where the Red Fern Grows', 'While I Was Gone', 'While My Pretty One Sleeps', 'Whirlwin d (Tyler, Book 1)', "White Oleander: A Novel (Oprah's Book Club)", 'Wicked: The Life and Times of the Wicked Witch of the West', 'Wild Animus', 'Without Remorse', 'Year of Wonders', 'You Belong To Me', 'Zen and the Art of Motorcy cle Maintenance: An Inquiry into Values', 'Zoya', '\\0\\" Is for Outlaw"']

```
In [97]: def recommend(book_name):
    index=np.where(pt.index==book_name)[0][0]
    similar_items=sorted(list(enumerate(similarity_score[index])),key=lambda
    for i in similar_items:
        book_title = pt.index[i[0]]
        print(book_title)

In [100... def recommend(book_name):
        try:
        index = pt.index.get_loc(book_name)
        except KeyError:
        print(f"Book '{book_name}' not found in the index.")
        return

similar_items = sorted(list(enumerate(similarity_score[index])), key=lam
```

```
for i in similar_items:
    book_title = pt.index[i[0]]
    print(book_title)

recommend('1984')
```

Book '1984' not found in the index.

```
def recommend(book_name):
    if book_name not in pt.index:
        print(f"Book '{book_name}' not found in the index.")
        return

index = np.where(pt.index == book_name)[0][0]
    similar_items = sorted(list(enumerate(similarity_score[index])), key=lam

for i in similar_items:
    book_title = pt.index[i[0]]
    print(book_title)

recommend('The Bad Place')
```

Hideaway The Tommyknockers Lightning The Dark Half We'll Meet Again

similarity\_score: This variable is expected to be a 2D array (like a matrix) that holds the similarity scores between books. Each row corresponds to a book, and the values in that row represent the similarity to other books

The recommend function suggests similar books based on a given title. It checks if the book exists, retrieves its index, calculates similarity scores from a matrix, and prints the titles of the top 5 most similar books, excluding the original book itself.

```
Empire Falls
Songs in Ordinary Time (Oprah's Book Club (Paperback))
The Stone Diaries
Ellen Foster

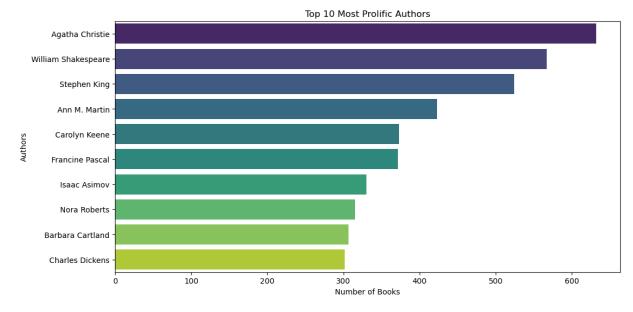
In [126... recommend('Three Junes')

Plainsong (Vintage Contemporaries)
Midnight in the Garden of Good and Evil: A Savannah Story
Seabiscuit: An American Legend
Cold Mountain : A Novel
Morality for Beautiful Girls (No.1 Ladies Detective Agency)
```

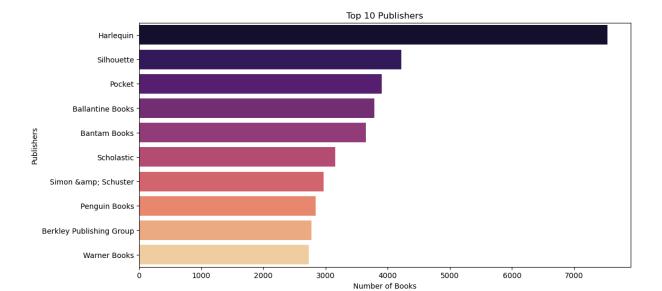
The Red Tent (Bestselling Backlist)

### Visualization 1: Most Prolific Authors

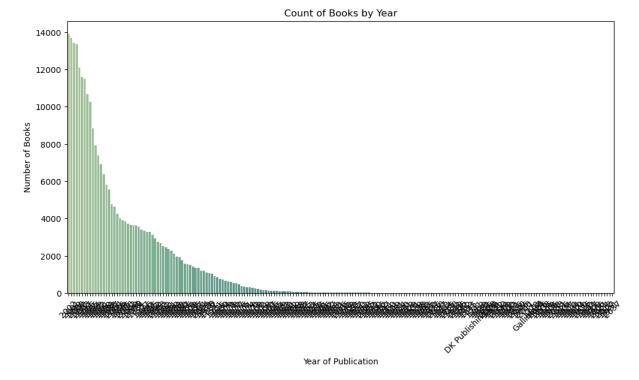
```
In [114...
plt.figure(figsize=(12, 6))
top_authors = book['Book-Author'].value_counts().head(10)
sns.barplot(x=top_authors.values, y=top_authors.index, palette='viridis')
plt.title('Top 10 Most Prolific Authors')
plt.xlabel('Number of Books')
plt.ylabel('Authors')
plt.show()
```



```
In [116... # Top Publishers
    plt.figure(figsize=(12, 6))
    top_publishers = book['Publisher'].value_counts().head(10)
    sns.barplot(x=top_publishers.values, y=top_publishers.index, palette='magma'
    plt.title('Top 10 Publishers')
    plt.xlabel('Number of Books')
    plt.ylabel('Publishers')
    plt.show()
```



```
In [118... # Count of Books by Year
plt.figure(figsize=(12, 6))
sns.countplot(data=book, x='Year-Of-Publication', palette='crest', order=book
plt.title('Count of Books by Year')
plt.xlabel('Year of Publication')
plt.ylabel('Number of Books')
plt.xticks(rotation=45)
plt.show()
```



```
In [ ]:
In [ ]:
```

```
In [119... import pickle
  pickle.dump(popular,open('popular.pkl','wb'))
In []:
In []:
```

This notebook was converted to PDF with convert.ploomber.io