## **Book Recommendation System with Machine Learning**

```
In [31]: import numpy as np
          import pandas as pd
          import seaborn as sns
          import matplotlib.pyplot as plt
          from sklearn.cluster import KMeans
          from sklearn import neighbors
          from sklearn.model selection import train test split
          from sklearn.preprocessing import MinMaxScaler
          import warnings
          warnings.filterwarnings('ignore')
          df = pd.read csv(r'D:\B00K\archive\books.csv',error bad lines = False)
          df.head()
        Skipping line 3350: expected 12 fields, saw 13
        Skipping line 4704: expected 12 fields, saw 13
        Skipping line 5879: expected 12 fields, saw 13
        Skipping line 8981: expected 12 fields, saw 13
                                                                              isbn13 language_code num_pages ratings_count text_re
                         title
                                   authors average_rating
                        Harry
                        Potter
                      and the
                                      J.K.
          0
                              Rowling/Mary
                                                    4.57 0439785960 9780439785969
                                                                                                           652
                                                                                                                      2095690
                        Half-
                                                                                               ena
                        Blood
                                 GrandPré
                       Prince
                     (Harry ...
                        Harry
                       Potter
                      and the
                                      J.K.
                  2 Order of Rowling/Mary
                                                     4 49 0439358078 9780439358071
                                                                                                            870
                                                                                                                      2153167
                                                                                                ena
                         the
                                 GrandPré
                      Phoenix
                       (Har...
                        Harry
                       Potter
                      and the
          2
                  4 Chamber
                               J.K. Rowling
                                                    4.42 0439554896 9780439554893
                                                                                                eng
                                                                                                           352
                                                                                                                        6333
                      Secrets
                      (Harry...
                        Harry
                       Potter
                      and the
                                      J.K.
          3
                              Rowling/Mary
                                                     4.56 043965548X 9780439655484
                                                                                                            435
                                                                                                                      2339585
                      Prisoner
                                                                                                eng
                                 GrandPré
                     Azkaban
                      (Harr...
                        Harry
                       Boxed
                                      J.K.
                         Set Rowling/Mary
                                                     4.78 0439682584 9780439682589
                                                                                                eng
                                                                                                           2690
                                                                                                                        41428
                     Books 1-
                                 GrandPré
                      5 (Harry
                      Potte...
```

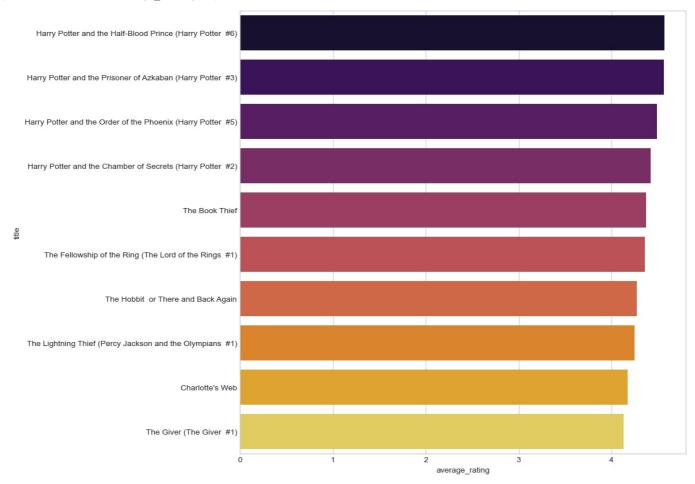
## **Data Exploration**

```
In [2]: df.isnull().sum()
Out[2]: bookID
                               0
        title
                               0
        authors
                               0
        average_rating
        isbn
                               0
        isbn13
        language_code
                               0
          num pages
        ratings_count
                               0
        text reviews count
                               0
        publication date
                               0
        publisher
        dtype: int64
In [3]: df.describe()
```

```
bookID average_rating
                                          isbn13
                                                    num_pages
                                                                ratings_count text_reviews_count
count 11123.000000
                                   1.112300e+04
                      11123.000000
                                                  11123.000000
                                                                 1.112300e+04
                                                                                    11123.000000
mean 21310.856963
                          3.934075 9.759880e+12
                                                    336.405556
                                                                1.794285e+04
                                                                                      542.048099
       13094.727252
                                    4.429758e+11
                                                                 1.124992e+05
                                                                                     2576.619589
  std
                          0.350485
                                                    241.152626
  min
           1.000000
                          0.000000
                                   8.987060e+09
                                                      0.000000
                                                                0.000000e+00
                                                                                        0.000000
 25%
       10277 500000
                          3 770000
                                    9 780345e+12
                                                    192 000000
                                                                 1 040000e+02
                                                                                        9 000000
 50%
       20287.000000
                          3.960000
                                   9.780582e+12
                                                    299.000000
                                                                7.450000e+02
                                                                                       47.000000
       32104.500000
                          4.140000
                                    9.780872e+12
                                                    416.000000
                                                                 5.000500e+03
                                                                                      238.000000
 75%
 max 45641.000000
                          5.000000 9.790008e+12
                                                   6576.000000
                                                                4.597666e+06
                                                                                    94265.000000
```

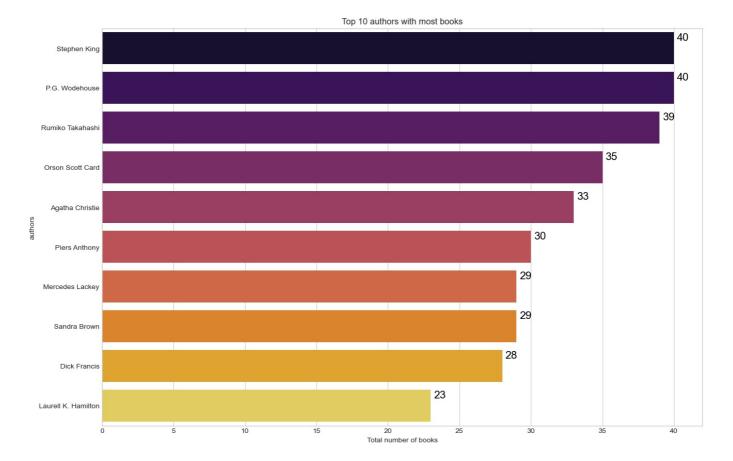
```
In [32]: top_ten = df[df['ratings_count'] > 10000000]
    top_ten.sort_values(by='average_rating', ascending=False)
    plt.style.use('seaborn-whitegrid')
    plt.figure(figsize=(10, 10))
    data = top_ten.sort_values(by='average_rating', ascending=False).head(10)
    sns.barplot(x="average_rating", y="title", data=data, palette='inferno')
```

Out[32]: <Axes: xlabel='average rating', ylabel='title'>



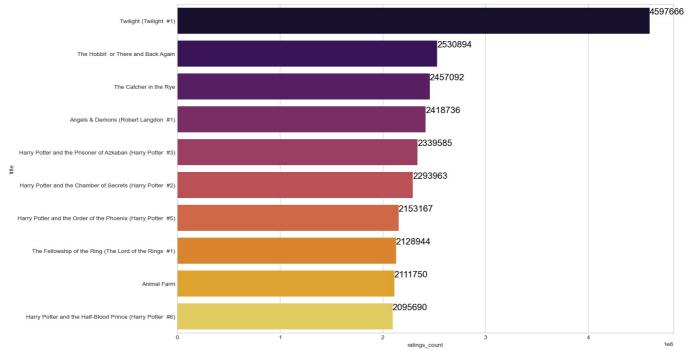
The results above show us the top 10 books in our data. We saw that the max score in our data was 5.0 but we don't see any books in the above result with a score of 5.0. Indeed, we have filtered these books according to the number of notes. We've made sure that all of the books we have in the above results have a decent rating.

```
In [8]: most_books = df.groupby('authors')['title'].count().reset_index().sort_values('title', ascending=False).head(10
    plt.figure(figsize=(15,10))
    ax = sns.barplot(x=most_books['title'], y=most_books.index, palette='inferno')
    ax.set_title("Top 10 authors with most books")
    ax.set_xlabel("Total number of books")
    totals = []
    for i in ax.patches:
        totals.append(i.get_width())
    total = sum(totals)
    for i in ax.patches:
        ax.text(i.get_width()+.2, i.get_y()+.2,str(round(i.get_width())), fontsize=15,color='black')
    plt.show()
```



from the above chart, Stephen King and P.G. Wodehouse have the most books in the data. Both authors have 40 books in our dataset followed by Rumiko Takahashi and Orson Scott Card.

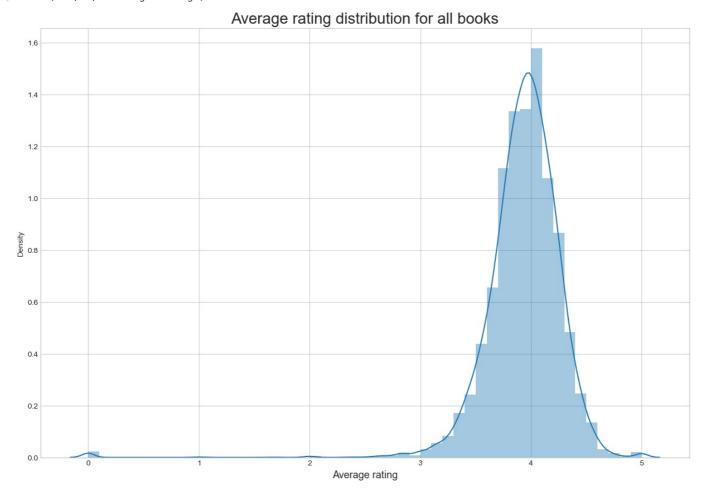
```
In [30]: most_rated = df.sort_values('ratings_count', ascending = False).head(10).set_index('title')
    plt.figure(figsize=(15,10))
    ax = sns.barplot(x=most_rated['ratings_count'], y=most_rated.index, palette = 'inferno')
    totals = []
    for i in ax.patches:
        totals.append(i.get_width())
    total = sum(totals)
    for i in ax.patches:
        ax.text(i.get_width()+.2, i.get_y()+.2,str(round(i.get_width())), fontsize=15,color='black')
    plt.show()
```



We can see that Twilight has been rated more times than any other book! Also, these ratings are all in the millions! So that means Twilight has been reviewed over 4 million times, followed by The Hobbit or There and Back Again and The Catcher in the Rye which has been reviewed over 2 million times.

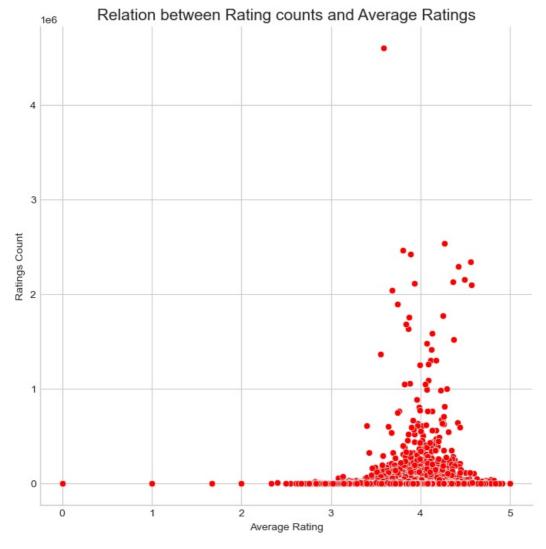
```
In [33]:
    df.average_rating = df.average_rating.astype(float)
    fig, ax = plt.subplots(figsize=[15,10])
    sns.distplot(df['average_rating'],ax=ax)
    ax.set_title('Average rating distribution for all books',fontsize=20)
    ax.set_xlabel('Average rating',fontsize=13)
```

Out[33]: Text(0.5, 0, 'Average rating')

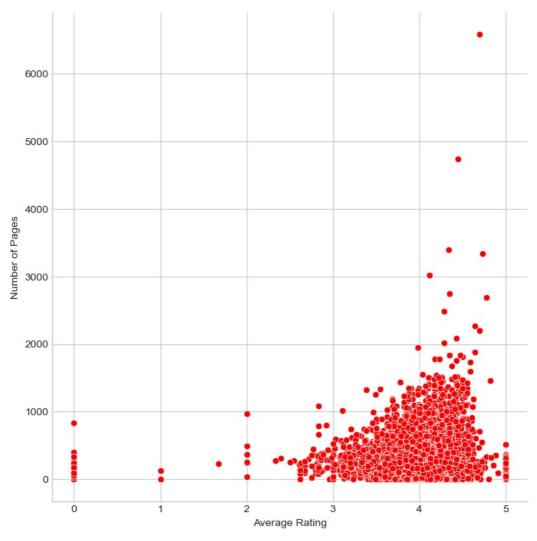


```
In [12]: ax = sns.relplot(data=df, x="average_rating", y="ratings_count", color = 'red', sizes=(100, 200), height=7, marl
plt.title("Relation between Rating counts and Average Ratings",fontsize = 15)
ax.set_axis_labels("Average Rating", "Ratings Count")
```

Out[12]: <seaborn.axisgrid.FacetGrid at 0x23d9a9ce810>



```
In [13]: plt.figure(figsize=(15,10))
    ax = sns.relplot(x="average_rating", y=" num_pages", data = df, color = 'red', sizes=(100, 200), height=7, mark(
    ax.set_axis_labels("Average Rating", "Number of Pages")
```



```
In [14]: df2 = df.copy()
```

## **Data Preparation**

```
In [15]: df2.loc[ (df2['average_rating'] >= 0) & (df2['average_rating'] <= 1), 'rating_between'] = "between 0 and 1"
    df2.loc[ (df2['average_rating'] > 1) & (df2['average_rating'] <= 2), 'rating_between'] = "between 1 and 2"
    df2.loc[ (df2['average_rating'] > 2) & (df2['average_rating'] <= 3), 'rating_between'] = "between 2 and 3"
    df2.loc[ (df2['average_rating'] > 3) & (df2['average_rating'] <= 4), 'rating_between'] = "between 3 and 4"
    df2.loc[ (df2['average_rating'] > 4) & (df2['average_rating'] <= 5), 'rating_between'] = "between 4 and 5"</pre>
In [29]: rating_df = pd.get_dummies(df2['rating_between'])
language_df = pd.get_dummies(df2['language_code'])
```

We are now going to concatenate these two data frames into one and name it as features. This DataFrame will be the functionality that we provide to the Book Recommendation System with Machine Learning.

It will contain the values of rating\_df and language\_df and will also have the values of average grade and number of grades

## **Book Recommendation System**

The algorithm will find the median for all and equalize it

```
In [26]: from sklearn.preprocessing import MinMaxScaler
    min_max_scaler = MinMaxScaler()
    features = min_max_scaler.fit_transform(features)
```

We have reduced the features and we now can use the KNN algorithm to build our Book Recommendation system with Machine Learning using Python

```
In [27]: model = neighbors.NearestNeighbors(n_neighbors=6, algorithm='ball_tree')
         model.fit(features)
         dist, idlist = model.kneighbors(features)
In [28]: def BookRecommender(book_name):
             book list name = []
             book_id = df2[df2['title'] == book_name].index
             book id = book id[0]
             for newid in idlist[book_id]:
                 book_list_name.append(df2.loc[newid].title)
             return book list name
         BookNames = BookRecommender('Harry Potter and the Half-Blood Prince (Harry Potter #6)')
         BookNames
Out[28]: ['Harry Potter and the Half-Blood Prince (Harry Potter #6)',
          'Harry Potter and the Order of the Phoenix (Harry Potter #5)',
          'The Fellowship of the Ring (The Lord of the Rings #1)'
          'Harry Potter and the Chamber of Secrets (Harry Potter #2)',
          'Harry Potter and the Prisoner of Azkaban (Harry Potter #3)',
          'The Lightning Thief (Percy Jackson and the Olympians #1)']
```

As we can see, our model shows a pretty decent result

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