The primary goal of this Machine Learning endeavor is to anticipate the rating of a book using a dataset extracted from the Goodreads website, an authentic community of readers.

Foreseeing the rating of a book can be framed as a regression challenge, given that it necessitates forecasting a continuous numerical value—specifically, the mean rating. As a result, employing a Supervised learning approach is apt, as it empowers us to forecast an uninterrupted output variable (the book's rating) grounded in one or more input variables (comprising titles, authors, page count, rating count, publishers, and more).

This examination will be segmented into three core segments:

- 1. Data Exploration
- 2. Data Visualization
- 3. Feature Engineering
- 4. Data Modeling
- 5. Conclusion

Project team's members:

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- · AGA Tangenssé Webana Julien
- ALIOU BA

Now, let's delve into the furnished dataset to glean further insights.

# Data Exploration

! pip install xgboost

```
! pip install keras
! pip install tensorflow
import pandas as pd
import seaborn as sns
from sklearn.model_selection import train_test_split
from sklearn.linear_model import LinearRegression
from sklearn.metrics import mean_squared_error
from sklearn.preprocessing import LabelEncoder
from sklearn.tree import DecisionTreeRegressor
from sklearn.metrics import mean_squared_error, r2_score
from sklearn.ensemble import RandomForestRegressor
import xgboost as xgb
     Requirement already satisfied: xgboost in c:\users\s.diallo\anaconda3\lib\site-packages (1.7.6)
     Requirement already satisfied: numpy in c:\users\s.diallo\anaconda3\lib\site-packages (from xgboost) (1.22.4)
     Requirement already satisfied: scipy in c:\users\s.diallo\anaconda3\lib\site-packages (from xgboost) (1.6.2)
     Requirement already satisfied: keras in c:\users\s.diallo\anaconda3\lib\site-packages (2.13.1)
     Requirement already satisfied: tensorflow in c:\users\s.diallo\anaconda3\lib\site-packages (2.13.0)
     Requirement already satisfied: tensorflow-intel==2.13.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow) (2.13.0)
     Requirement already satisfied: setuptools in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0->tensorfl
     Requirement already satisfied: gast<=0.4.0,>=0.2.1 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0-
     Requirement already satisfied: tensorflow-io-gcs-filesystem>=0.23.1 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorfl
     Requirement already satisfied: six>=1.12.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0->tensorf
     Requirement already satisfied: typing-extensions<4.6.0,>=3.6.6 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-in
     Requirement already satisfied: astunparse>=1.6.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0->t
     Requirement already satisfied: h5py>=2.9.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0->tensorf
     Requirement already satisfied: protobuf!=4.21.0,!=4.21.1,!=4.21.2,!=4.21.3,!=4.21.4,!=4.21.5,<5.0.0dev,>=3.20.3 in c:\users\s.diall
     Requirement already satisfied: opt-einsum>=2.3.2 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0->t
     Requirement already satisfied: keras<2.14,>=2.13.1 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0-
     Requirement already satisfied: wrapt>=1.11.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0->tenso
     Requirement already satisfied: tensorflow-estimator<2.14,>=2.13.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow
     Requirement already satisfied: numpy<=1.24.3,>=1.22 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0
     Requirement already satisfied: termcolor>=1.1.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0->te
     Requirement already satisfied: packaging in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0->tensorflo
     Requirement already satisfied: grpcio<2.0,>=1.24.3 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0-
     Requirement already satisfied: libclang>=13.0.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0->te
     Requirement already satisfied: tensorboard<2.14,>=2.13 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.1
     Requirement already satisfied: google-pasta>=0.1.1 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0-
     Requirement already satisfied: absl-py>=1.0.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0->tens
     Requirement already satisfied: flatbuffers>=23.1.21 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorflow-intel==2.13.0
     Requirement already satisfied: wheel<1.0,>=0.23.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from astunparse>=1.6.0->tensorf
     Requirement already satisfied: markdown>=2.6.8 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorboard<2.14,>=2.13->tens
     Requirement already satisfied: google-auth<3,>=1.6.3 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorboard<2.14,>=2.13
     Requirement already satisfied: werkzeug>=1.0.1 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorboard<2.14,>=2.13->tens
     Requirement already satisfied: google-auth-oauthlib<1.1,>=0.5 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorboard<2.
     Requirement already satisfied: requests<3,>=2.21.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorboard<2.14,>=2.13->
     Requirement already satisfied: tensorboard-data-server<0.8.0,>=0.7.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from tensorb
     Requirement already satisfied: rsa<5,>=3.1.4 in c:\users\s.diallo\anaconda3\lib\site-packages (from google-auth<3,>=1.6.3->tensorbo
     Requirement already satisfied: cachetools<6.0,>=2.0.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from google-auth<3,>=1.6.3-
     Requirement already satisfied: urllib3<2.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from google-auth<3,>=1.6.3->tensorboar
     Requirement already satisfied: pyasn1-modules>=0.2.1 in c:\users\s.diallo\anaconda3\lib\site-packages (from google-auth<3,>=1.6.3->
```

```
Requirement already satisfied: requests-oauthlib>=0.7.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from google-auth-oauthlib Requirement already satisfied: importlib-metadata>=4.4 in c:\users\s.diallo\anaconda3\lib\site-packages (from markdown>=2.6.8->tens Requirement already satisfied: zipp>=0.5 in c:\users\s.diallo\anaconda3\lib\site-packages (from importlib-metadata>=4.4->markdown>= Requirement already satisfied: pyasn1<0.6.0,>=0.4.6 in c:\users\s.diallo\anaconda3\lib\site-packages (from pyasn1-modules>=0.2.1->g Requirement already satisfied: idna<3,>=2.5 in c:\users\s.diallo\anaconda3\lib\site-packages (from requests<3,>=2.21.0->tensorboard Requirement already satisfied: certifi>=2017.4.17 in c:\users\s.diallo\anaconda3\lib\site-packages (from requests<3,>=2.21.0->tensor Requirement already satisfied: chardet<5,>=3.0.2 in c:\users\s.diallo\anaconda3\lib\site-packages (from requests<3,>=2.21.0->tensor Requirement already satisfied: oauthlib>=3.0.0 in c:\users\s.diallo\anaconda3\lib\site-packages (from requests-oauthlib>=0.7.0->goo Requirement already satisfied: pyparsing>=2.0.2 in c:\users\s.diallo\anaconda3\lib\site-packages (from packaging->tensorflow-intel=
```

pd\_df1 = pd.read\_csv(r"C:\Users\S.Diallo\Downloads\books.csv", error\_bad\_lines=False)
#pd\_df1 = pd.read\_csv(r"C:\Users\S.Diallo\Downloads\books.csv", sep = ';')
b'Skipping line 3350: expected 12 fields, saw 13\nSkipping line 4704: expected 12 fields, saw 13\nSkipping line 5879: expected 12 f

# DataFrame
pd\_df1

SELECT \* FROM `masterdata p`.`default`.`books`;'''

isbn13

isbn

bookID

title

pd_df:	<b>0</b> 1.head(10)	Harry Potter and the 1 Half- Blood	J.K. Rowling/	Mary ndPré	4.57 043978	978043978	5969
	bookID	title	authors	average_rating	isbn	isbn13	langı
	<b>0</b> 1	Harry Potter and the Half- Blood Prince (Harry	J.K. Rowling/Mary GrandPré	4.57	0439785960	9780439785969	
	1 2	Harry Potter and the Order of the Phoenix (Har	J.K. Rowling/Mary GrandPré	4.49	0439358078	9780439358071	
	<b>2</b> 4	Harry Potter and the Chamber of Secrets (Harry	J.K. Rowling	4.42	0439554896	9780439554893	
	<b>3</b> 5	Harry Potter and the Prisoner of Azkaban (Harr	J.K. Rowling/Mary GrandPré	4.56	043965548X	9780439655484	
	4 8	Harry Potter Boxed Set Books 1-5 (Harry Potte	J.K. Rowling/Mary GrandPré	4.78	0439682584	9780439682589	
	<b>5</b> 9	Unauthorized Harry Potter Book Seven News: "Ha	W. Frederick Zimmerman	3.74	0976540606	9780976540601	
	<b>6</b> 10	Harry Potter Collection (Harry Potter #1-6)	J.K. Rowling	4.73	0439827604	9780439827607	
	<b>7</b> 12	The Ultimate Hitchhiker's Guide: Five Complete	Douglas Adams	4.38	0517226952	9780517226957	
	<b>8</b> 13	The Ultimate Hitchhiker's Guide to the Galaxy	Douglas Adams	4.38	0345453743	9780345453747	
	9 14	The Hitchhiker's Guide to the Galaxy (Hitchhik	Douglas Adams	4.22	1400052920	9781400052929	
	1	ae iom	l				•

authors average\_rating

pd\_df1.tail(10)

		bookID	tit	le a	authors	averag	e_rating	isb	n	isbn13
	11113	45617	O Cavalo o So Rapaz ( Crónic de Nárr	eu As Lewis as Bay	C.S. /Pauline nes/Ana o Bastos		3.92	972233055	1 978972	2330558
	11114	45623	Crónic de Nárr	co As Lewis as Bay	C.S. /Pauline nes/Ana o Bastos		4.04	972232998	7 978972	2329989
	11115	45625	Caminhei Alvora	do ro Lewis da Bay da Falcão	C.S. /Pauline nes/Ana o Bastos		4.09	972233132	9 978972	2331326
	11116	45626	Crónic de Nárr	an As Lewis as Bay	C.S. /Pauline nes/Ana o Bastos		3.97	972233097	7 978972	2330978
	11117	45630	Whores f		Villiam T. /ollmann		3.69	014023157	9 978014	0231571
	11118	45631	Expelle from Ede A Willia Vollman Read	n: V m Vollma T. McCaffery nn	Villiam T. nn/Larry /Michael He		4.06	1560254410	6 978156	0254416
pd_df	1.descr	ibe()								
		b	ookID av	erage_rating	:	isbn13	num_pa	ages ratin	gs_count	text_r
	count	11123.0	00000	11123.000000	1.1123	800e+04	11123.000	0000 1.11	2300e+04	
	mean	21310.8	56963	3.934075	9.7598	80e+12	336.405	5556 1.79	4285e+04	
	std	13094.7	27252	0.350485	4.4297	758e+11	241.152	2626 1.12	4992e+05	
	min	1.00	00000	0.000000		60e+09	0.000		0000e+00	
	25%	10277.5		3.770000			192.000		0000e+02	
	50%	20287.0		3.960000			299.000		0000e+02	
	75%	32104.5		5,00000			416.000		0500e+03	
	4									•
print	(pd_df1	.columns	5)							
		'languag	ge_code', ation_dat	', 'authors' ' num_page e', 'publish	s', 'ra					
	-		_	ing and end mns.str.stri		mn names	5			
pd_df	1.info(									
	RangeIr Data co # Co	ndex: 111 olumns (t olumn	L23 entri	me.DataFrame es, 0 to 111 columns): Non-Null C	ount D	type 				
	1 ti	ookID itle		11123 non- 11123 non-	null o	-				
	3 av	ithors /erage_ra	ating	11123 non- 11123 non-	null f	loat64				
	5 is	sbn sbn13		11123 non- 11123 non-	null i	nt64				
		inguage_d im_pages	coae	11123 non- 11123 non-		bject nt64				

```
ratings_count
                              11123 non-null
          text_reviews_count 11123 non-null
      10
                             11123 non-null
         publication_date
                                              object
      11 publisher
                              11123 non-null
                                              object
     dtypes: float64(1), int64(5), object(6)
     memory usage: 1.0+ MB
# Null values verification
pd_df1.isnull().sum()
     bookID
     title
                           0
     authors
                           0
     average_rating
                           0
     isbn
     ishn13
                           0
     language_code
                           a
     num_pages
                           0
     ratings_count
     text_reviews_count
     publication_date
     publisher
                           0
     dtype: int64
```

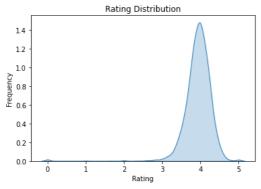
There are no NA values.

There are no duplicated values.

## Data Visualization

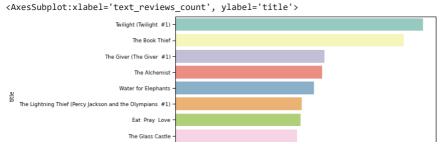
```
# Average ratings distribution
import seaborn as sns
sns.kdeplot(pd_df1['average_rating'], fill = True)
plt.title('Rating Distribution')
plt.xlabel('Rating')
plt.ylabel('Frequency')
```

Text(0, 0.5, 'Frequency')



This plot provide a visual representation of how the average ratings are distributed. The KDE (Kernel Density Estimation) plot helps us understand the shape and concentration of data points along the rating scale. The x-axis represents different rating values and the y-axis represents the frequency of those ratings.

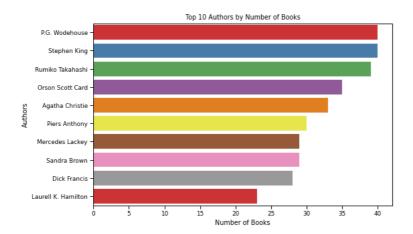
```
# Books with more written text reviews
most_reviews = pd_df1.sort_values('text_reviews_count', ascending = False).head(10).set_index('title')
plt.figure(figsize=(8,5))
sns.barplot(x=most_reviews['text_reviews_count'],y= most_reviews.index, palette='Set3')
```



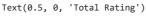
This plot gives us a quick overview of which books are generating the most text reviews, which could be an indicator of their popularity or engagement among readers. We visualize the top 10 books with the highest number of text reviews. Each bar in the plot represents a book, and its length indicates the number of text reviews that particular book has received. The longer the bar, the more text reviews the book has garnered.

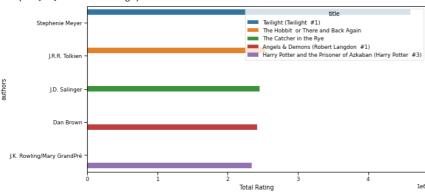
```
# Let's visualize the top 10 authors in our dataset based on the number of books they have authored.
import matplotlib.pyplot as plt
import seaborn as sns

plt.figure(figsize=(8, 5))
plot = sns.countplot(
    y="authors",
    data=pd_df1,
    order=pd_df1["authors"].value_counts().iloc[:10].index,
    palette="Set1"
)
plt.xlabel("Number of Books")
plt.ylabel("Authors")
plt.title("Top 10 Authors by Number of Books")
plt.show()
```



```
# Let's identify the authors whose books have received the highest ratings count.
plt.figure(figsize=(10, 5))
a = pd_df1.nlargest(5, ['ratings_count']).set_index('authors')
sns.barplot(x=a['ratings_count'], y=a.index, ci = None, hue = a['title'])
plt.xlabel('Total Rating')
```



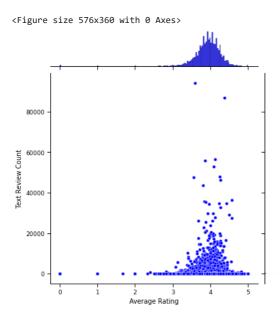


Here a meaningful plot that highlights the top authors based on the total ratings count for their books. With this visualization, we can better understand which authors have successfully captured readers' interest, as well as the specific books that have contributed significantly to their high ratings counts.

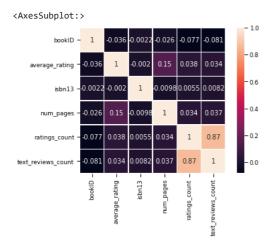
Overall, this plot provides a comprehensive overview of the authors who have achieved the highest levels of engagement and recognition from readers.

# Distribution between Rating and Text Reviews

```
plt.figure(figsize=(8,5))
pd_df1.dropna(0, inplace=True)
sns.set_context('paper')
ax = sns.jointplot(x="average_rating", y="text_reviews_count", kind="scatter", data=pd_df1[['text_reviews_count', 'average_rating']], col
ax.set_axis_labels("Average Rating", "Text Review Count")
plt.show()
```



sns.heatmap(data=pd\_df1.corr(),
linewidths=0.5, square=True,
linecolor="white", annot=True)



This insightful heatmap plot provide a visual representation of the correlations between different numerical variables in our dataset. We see a high correlation between the ratings\_count and the text\_reviews\_count around 87%.

```
# Let's take a look at the 10 top-rated books.
top_rated = pd_df1.sort_values(by="ratings_count", ascending = False).head(10)
top_rated_titles = pd.DataFrame(top_rated.title).join(pd.DataFrame(top_rated.ratings_count))
top_rated_titles
```

	title	ratings_count
10336	Twilight (Twilight #1)	4597666
1697	The Hobbit or There and Back Again	2530894
1462	The Catcher in the Rye	2457092
307	Angels & Demons (Robert Langdon #1)	2418736
3	Harry Potter and the Prisoner of Azkaban (Harr	2339585
4415	Harry Potter and the Chamber of Secrets (Harry	2293963
1	Harry Potter and the Order of the Phoenix (Har	2153167
23	The Fellowship of the Ring (The Lord of the Ri	2128944

# Feature Engineering

```
#Select the relevant columns for linear regression
selected_columns = ['authors', 'language_code', 'num_pages', 'ratings_count', 'text_reviews_count', 'average_rating', 'publication_date']
#Create a DataFrame with the selected columns from pd_df1
pd_df1_selected = pd_df1[selected_columns]
#Convert the 'publication_date' column to date format using various formats
pd_df1_selected['publication_date'] = pd.to_datetime(pd_df1_selected['publication_date'], errors='coerce', format='%m/%d/%Y')
pd_df1_selected['publication_month'] = pd_df1_selected['publication_date'].dt.month
pd_df1_selected['publication_day'] = pd_df1_selected['publication_date'].dt.day
pd_df1_selected['publication_year'] = pd_df1_selected['publication_date'].dt.year
#Display the updated DataFrame
print(pd_df1_selected)
     IIIIO WIIIIAM I. VOIIMANN/LANTY MCCATTENY/MICHAEL ME...
     11119
                                          William T. Vollmann
     11120
                                          William T. Vollmann
                                                                        eng
     11121
                                          William T. Vollmann
                                                                        eng
     11122
                                                   Mark Twain
                                                                        spa
           num_pages ratings_count text_reviews_count average_rating \
     0
                             2095690
                                                   27591
                  652
                                                                    4.57
                             2153167
     1
                  870
                                                   29221
                                                                    4.49
     2
                  352
                                6333
                                                     244
                                                                    4.42
     3
                  435
                             2339585
                                                   36325
                                                                    4.56
     4
                 2690
                               41428
                                                     164
                                                                    4.78
                  512
                                                                    4.06
     11118
     11119
                                 783
                                                      56
                                                                    4.08
                  635
     11120
                  415
                                 820
                                                      95
                                                                    3.96
     11121
                  434
                                 769
                                                     139
                                                                    3.72
     11122
                  272
                                                      12
                                 113
                                                                    3.91
           publication_date publication_month publication_day publication_year
     0
                 2006-09-16
                                           9.0
                                                           16.0
                                                                           2006.0
     1
                 2004-09-01
                                           9.0
                                                            1.0
                                                                           2004.0
     2
                 2003-11-01
                                          11.0
                                                            1.0
                                                                           2003.0
     3
                 2004-05-01
                                                            1.0
                                                                           2004.0
                                           5.0
                 2004-09-13
                                          9.0
                                                           13.0
                 2004-12-21
                                          12.0
                                                           21.0
                                                                           2004.0
     11118
                 1988-12-01
                                                                           1988.0
     11119
                                          12.0
                                                            1.0
                 1993-08-01
                                                                           1993.0
     11120
                                           8.0
                                                            1.0
                 2007-02-27
                                                                           2007.0
     11121
                                           2.0
                                                           27.0
     11122
                 2006-05-28
                                           5.0
                                                           28.0
                                                                           2006.0
     [11123 rows x 10 columns]
     <ipython-input-208-adfa2385ffde>:2: SettingWithCopyWarning:
     A value is trying to be set on a copy of a slice from a DataFrame.
     Try using .loc[row_indexer,col_indexer] = value instead
     See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-ver
      pd_df1_selected['publication_date'] = pd.to_datetime(pd_df1_selected['publication_date'], errors='coerce', format='%m/%d/%Y')
     <ipython-input-208-adfa2385ffde>:3: SettingWithCopyWarning:
     A value is trying to be set on a copy of a slice from a DataFrame.
```

```
See the caveats in the documentation: <a href="https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-ver_pd_df1_selected['publication_day'] = pd_df1_selected['publication_date'].dt.day
<a href="https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-ver_pd_df1_selected['publication_year'] = pd_df1_selected['publication_date'].dt.year

**Pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-ver_pd_df1_selected['publication_year'] = pd_df1_selected['publication_date'].dt.year
```

pd\_df1\_selected['publication\_month'] = pd\_df1\_selected['publication\_month'].fillna(0).astype(int)
pd\_df1\_selected['publication\_day'] = pd\_df1\_selected['publication\_day'].fillna(0).astype(int)
pd\_df1\_selected['publication\_year'] = pd\_df1\_selected['publication\_year'].fillna(0).astype(int)

<ipython-input-20-0da2699fcd8b>:1: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row\_indexer,col\_indexer] = value instead

See the caveats in the documentation: <a href="https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-versus">https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-versus</a> pd\_df1\_selected['publication\_month'] = pd\_df1\_selected['publication\_month'].fillna(0).astype(int)

<ipython-input-20-0da2699fcd8b>:2: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.

Try using .loc[row\_indexer,col\_indexer] = value instead

See the caveats in the documentation: <a href="https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-versus">https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-versus</a> pd\_df1\_selected['publication\_day'] = pd\_df1\_selected['publication\_day'].fillna(0).astype(int)

<ipython-input-20-0da2699fcd8b>:3: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.

Try using .loc[row\_indexer,col\_indexer] = value instead

See the caveats in the documentation: <a href="https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-versus">https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-versus</a> pd\_df1\_selected['publication\_year'].fillna(0).astype(int)

pd\_df1\_selected

	authors	language_code	num_pages	ratings_count	text_reviews_count
0	J.K. Rowling/Mary GrandPré	eng	652	2095690	27591
1	J.K. Rowling/Mary GrandPré	eng	870	2153167	29221
2	J.K. Rowling	eng	352	6333	244
3	J.K. Rowling/Mary GrandPré	eng	435	2339585	36325
4	J.K. Rowling/Mary GrandPré	eng	2690	41428	164
11118	William T. Vollmann/Larry McCaffery/Michael He	eng	512	156	20
11119	William T. Vollmann	eng	635	783	56
11120	William T. Vollmann	eng	415	820	95
11121	William T. Vollmann	eng	434	769	139
11122	Mark Twain	spa	272	113	12
11123 rd	ows × 10 columns				
4					<b>+</b>

pd\_df1\_selected.drop('publication\_date', axis=1, inplace=True)

 $\verb|C:\Users\S.Diallo\anaconda3| lib\site-packages\pandas\core\frame.py: 4308: Setting With Copy Warning: Copy War$ 

A value is trying to be set on a copy of a slice from a  $\mathsf{DataFrame}$ 

See the caveats in the documentation: <a href="https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-versus">https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-versus</a> return super().drop(

print(pd\_df1\_selected)

 $|\cdot|$ 

```
authors language_code \
                                   J.K. Rowling/Mary GrandPré
     0
                                                                         eng
                                   J.K. Rowling/Mary GrandPré
     1
                                                                         eng
     2
                                                  J.K. Rowling
                                                                         eng
                                   J.K. Rowling/Mary GrandPré
     3
                                                                         eng
     4
                                   J.K. Rowling/Mary GrandPré
                                                                         eng
     11118 William T. Vollmann/Larry McCaffery/Michael He...
                                                                         eng
     11119
                                           William T. Vollmann
                                                                         eng
     11120
                                           William T. Vollmann
                                                                         eng
     11121
                                           William T. Vollmann
                                                                         eng
                                                    Mark Twain
     11122
                                                                         spa
            num_pages ratings_count text_reviews_count average_rating \
     0
                             2095690
                                                    27591
                  652
                                                                     4.57
     1
                  870
                             2153167
                                                    29221
                                                                     4.49
     2
                  352
                                 6333
                                                      244
                                                                     4.42
     3
                  435
                             2339585
                                                    36325
                                                                     4.56
     4
                 2690
                               41428
                                                      164
                                                                     4.78
     11118
                  512
                                 156
                                                                     4.06
                                 783
                                                       56
                                                                     4.08
     11119
                  635
     11120
                  415
                                 820
                                                       95
                                                                     3.96
     11121
                  434
                                 769
                                                      139
                                                                     3.72
     11122
                  272
                                 113
                                                       12
                                                                     3.91
            publication_month publication_day publication_year
     0
                            9
                                            16
                                                             2006
     1
                            9
                                             1
                                                             2004
     2
                           11
                                              1
                                                             2003
     3
                            5
                                             1
                                                             2004
     4
                            9
                                             13
                                                             2004
                                                             2004
                                             21
     11118
                           12
     11119
                           12
                                                             1988
                                             1
                                                             1993
     11120
                            8
                                             1
                                                             2007
     11121
                            2
                                             27
     11122
                                             28
                                                             2006
     [11123 rows x 9 columns]
#Perform one-hot encoding for the 'language_code' column
pd_df1_encoded = pd.get_dummies(pd_df1_selected, columns=['language_code'], prefix_sep='')
print(pd_df1_encoded)
     11119
                      783
                                            56
                                                          4.08
                                                                                0
     11120
                      820
                                            95
                                                          3.96
                                                                                0
     11121
                                                          3.72
                      769
                                                                                a
                                           139
                      113
                                                                                a
     11122
                                            12
                                                          3.91
            language_codeara
                              language_codeen-CA language_codeen-GB
     0
                           0
                                                0
     1
                           0
                                                0
                                                                    0
     2
                                                                    0
     3
                           0
                                                0
                                                                    0
     4
                                                0
                                                                    0
                           0
     11118
                           0
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                                                                    0
     11119
                           а
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     11120
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     11121
                           0
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                                                                    0
     11122
                           0
                                                0
                                                                    0
            language_codeen-US ...
                                     language_codenl language_codenor
     0
                             0
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                             0
                                                    0
                                . . .
```

```
language_codeswe
                                language_codetur
                                                   language_codewel language_codezho
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                             0
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                             0
     11121
                             0
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                                                                   0
                                                                                       0
     11122
                                                                                       0
     [11123 rows x 32 columns]
print(pd_df1_encoded.columns)
```

pd\_df1\_encoded

#### authors num\_pages ratings\_count text\_reviews\_count average\_rating J.K. Rowling/Mary 4.57 GrandPré J.K. Rowling/Mary 4.49 GrandPré J.K. Rowling 4.42 J.K. Rowling/Mary 4.56 GrandPré J.K. Rowling/Mary 4.78 GrandPré William T. Vollmann/Larry 4 06 McCaffery/Michael He... William T. 4.08 Vollmann William T. 3.96 Vollmann William T. 3.72 Vollmann Mark Twain 3.91 11123 rows × 32 columns

'language\_codepor', 'language\_coderus', 'language\_codespa',

pd\_df1\_selected

	authors	language_code	num_pages	ratings_count	text_reviews_count
0	J.K. Rowling/Mary GrandPré	eng	652	2095690	27591
1	J.K. Rowling/Mary GrandPré	eng	870	2153167	29221
2	J.K. Rowling	eng	352	6333	244
3	J.K. Rowling/Mary GrandPré	eng	435	2339585	36325
4	J.K. Rowling/Mary GrandPré	eng	2690	41428	164
			•••		
11118	William T. Vollmann/Larry McCaffery/Michael He	eng	512	156	20
11119	William T. Vollmann	eng	635	783	56
11120	William T. Vollmann	eng	415	820	95
11121	William T. Vollmann	eng	434	769	139
11122	Mark Twain	spa	272	113	12
11123 rc	ows × 10 columns				
4					<b>)</b>

pd\_df1\_encoded

	num_pages	ratings_count	text_reviews_count	language_codeale	language_codea
0	0.099148	0.455816	0.292696	0	
1	0.132299	0.468317	0.309988	0	
2	0.053528	0.001377	0.002588	0	
3	0.066150	0.508864	0.385350	0	
4	0.409063	0.009011	0.001740	0	
11118	0.077859	0.000034	0.000212	0	
11119	0.096563	0.000170	0.000594	0	
11120	0.063108	0.000178	0.001008	0	
11121	0.065998	0.000167	0.001475	0	
11122	0.041363	0.000025	0.000127	0	
11123 rd	ows × 32 colu	mns			
4					<b>)</b>

print(pd\_df1\_encoded.columns)

from sklearn.preprocessing import LabelEncoder

```
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```

```
# Create a label encoder
label encoder = LabelEncoder()
# Function to encode non-numeric elements and leave numeric ones untouched
def encode_average_rating(value):
        return float(value) # If it's a number, return the value directly as a float
    except ValueError: # If conversion to float fails, it's a non-numeric string
        return label_encoder.fit_transform([value])[0]
# Apply the function to the 'average_rating' column to encode the values
pd_df1_encoded['average_rating_encoded'] = pd_df1_encoded['average_rating_encoded'].apply(encode_average_rating)
# Display the DataFrame with the encoded numeric values
print(pd_df1_encoded)
                                                  0
                                                                      0
     11119
                            0
     11120
                                                  0
                                                                      0
                            0
                                                 0
     11121
                                                                      0
                            0
     11122
                            0
                                                 0
                                                                       a
            language_codeen-US
                                 language_codeeng
                                                    language_codeenm
     0
                                                                     0
     1
                              0
                                                  1
                                                                     0
                                                                        . . .
     2
                              0
                                                 1
                                                                       . . .
     3
                              0
                                                 1
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     4
                              0
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                                                                        . . .
     11118
                              0
                                                                     0
                                                 1
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     11119
                              0
                                                 1
                                                                    0
                                                                        ...
     11120
                              0
                                                 1
                                                                    0
                                                                        . . .
     11121
                              a
                                                  1
                                                                    a
     11122
                              0
                                                  0
                                                                    0
                               language_coderus
                                                                     language_codesrp
            language_codepor
                                                  language_codespa
     0
     1
                            0
                                               0
                                                                  0
                                                                                     0
     2
                                               0
                                                                                     0
                            0
                                                                  0
     3
                                               0
                                                                  0
                                                                                     0
                            0
     4
                                               0
                                                                                     0
                            0
                                                                  0
     11118
                            a
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                                                                                     0
     11119
                            0
                                               0
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     11120
                            0
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     11121
     11122
                                                                                     0
            language_codeswe
                               language_codetur
                                                  language_codewel
                                                                     language_codezho
     0
                            0
                                               0
                                                                  0
     1
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                                                                                     0
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                                               a
                                                                  a
                                                                                     a
     3
                            а
                                               а
                                                                  a
                                                                                     0
     4
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     11118
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                                                                                     0
     11119
                            0
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     11120
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                                                                  0
     11121
                            0
                                                                  0
                                                                                     0
     11122
                            0
                                                                  0
                                                                                     0
            authors_encoded average_rating_encoded
     0
                    0.395601
     1
                    0.395601
                                                  4.49
     2
                    0.394998
                                                  4.42
     3
                    0.395601
                                                  4.56
     4
                    0.395601
                                                  4.78
     11118
                    0.987647
                                                  4.06
     11119
                    0.987496
                                                 4.08
                    0.987496
     11120
                                                  3.96
                    0.987496
                                                  3.72
     11121
                    0.620066
                                                  3.91
     11122
     [11123 rows x 32 columns]
pd_df1_encoded
```

		num_pages	ratings_count	text_reviews_count	language_codeale	language_codea
	0	0.099148	0.455816	0.292696	0	
	1	0.132299	0.468317	0.309988	0	
	2	0.053528	0.001377	0.002588	0	
	3	0.066150	0.508864	0.385350	0	
	4	0.409063	0.009011	0.001740	0	
1	1118	0.077859	0.000034	0.000212	0	
1	1119	0.096563	0.000170	0.000594	0	
1	1120	0.063108	0.000178	0.001008	0	

```
# Replace empty strings with null values (NaN)
pd_df1_encoded['num_pages'].replace('', pd.NA, inplace=True)
```

11120 11121 11122	0 0 0	0 0 0		0 0 0
	language_codeen-US	language codeeng	language codeenm	\
0	0	1	0	
1	0	1	0	
2	0	1	0	
3	0	1	0	
4	0	1	0	
	• • •			
11118	0	1	0	
11119	0	1	0	
11120	0	1	0	
11121	0	1	0	
11122	0	0	0	

	language_codepor	language_coderus	language_codespa	language_codesrp	\
0	0	0	0	0	
1	0	0	0	0	
2	0	0	0	0	
3	0	0	0	0	
4	0	0	0	0	
11118	0	0	0	0	
11119	0	0	0	0	
11120	0	0	0	0	
11121	0	0	0	0	
11122	0	0	1	0	

	language_codeswe	language_codetur	language_codewel	language_codezho	١
0	0	0	0	0	
1	0	0	0	0	
2	0	0	0	0	

<sup>#</sup> Convert the column to numeric type
pd\_df1\_encoded['num\_pages'] = pd.to\_numeric(pd\_df1\_encoded['num\_pages'], errors='coerce')

<sup>#</sup> Display the DataFrame with the 'num\_pages' column converted to numeric type print(pd\_df1\_encoded)

```
[11123 rows x 32 columns]
```

# Display the data types of columns in the pd\_df1\_encoded DataFrame print(pd\_df1\_encoded.dtypes)

```
num_pages
                           float64
                           float64
ratings_count
text reviews count
                           float64
language_codeale
                             uint8
language_codeara
                             uint8
language_codeen-CA
                             uint8
language_codeen-GB
                             uint8
language_codeen-US
                             uint8
language_codeeng
                             uint8
language_codeenm
                             uint8
language_codefre
                             uint8
language_codeger
                             uint8
language_codegla
language_codeglg
                             uint8
                             uint8
language_codegrc
                             uint8
language_codeita
                             uint8
language_codejpn
                             uint8
language_codelat
                             uint8
language_codemsa
                             uint8
language_codemul
                             uint8
language_codenl
                             uint8
language_codenor
                             uint8
language_codepor
                             uint8
language_coderus
                             uint8
language_codespa
                             uint8
language_codesrp
                             uint8
                             uint8
language_codeswe
language_codetur
                             uint8
language_codewel
                             uint8
language_codezho
                             uint8
authors_encoded
                           float64
average_rating_encoded
                           float64
dtype: object
```

from sklearn.preprocessing import MinMaxScaler

```
# Create a MinMaxScaler object
scaler = MinMaxScaler()
```

```
# Select columns to normalize
columns_to_normalize = ['num_pages', 'ratings_count', 'text_reviews_count', 'authors_encoded']
```

```
# Apply normalization to the selected columns
pd_df1_encoded[columns_to_normalize] = scaler.fit_transform(pd_df1_encoded[columns_to_normalize])
```

# Display the DataFrame with normalized columns print(pd\_df1\_encoded)

	num_pages	ratings_	count	text_review	s_count	language	_codea	ale	١
0	0.099148	0.4	55816		.292696			0	
1	0.132299	0.4	68317	0	.309988			0	
2	0.053528	0.0	01377	0	.002588			0	
3	0.066150	0.5	08864	0	.385350			0	
4	0.409063	0.0	09011	0	.001740			0	
• • •									
11118	0.077859	0.0	00034	0	.000212			0	
11119	0.096563		00170	0	.000594			0	
11120	0.063108		00178		.001008			0	
11121	0.065998		00167		.001475			0	
11122	0.041363	0.0	00025	0	.000127			0	
	_								
	language_c		anguag	ge_codeen-CA	Tanguag	ge_codeen-0			
0		0		0		0			
1		0		0		0			
2		0		0		0			
3		0		0		0			
4		0		0			0		
		• • •		•••		• •	•		
11118 11119		0		0			0		
		0		0			0		
11120		0		0			0		
11121	0		0			0			
11122		0		0			0		
	language c	odoon_US	langu	age codeeng	languag	ro codeenm		\	
0	Tanguage_C	0	Taligu	lage_codeelig	Tanguag	e_codeeiiii	• • •	\	
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     11118
                               0
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                                                  1
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     11119
                               0
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     11120
                               a
                                                  1
                                                                     0
                                                                        . . .
     11121
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                                                  1
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     11122
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                                                                     a
                                language_coderus
                                                  language_codespa
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     0
     1
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     11121
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     11122
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             language_codeswe
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                                                  language_codewel
                                                                      language_codezho
     0
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     1
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     2
                                                0
                                                                   0
                                                                                      0
                            0
                                                                                      0
     3
                            0
                                                0
                                                                   0
correlation_matrix = pd_df1_encoded.corr()
correlation_with_target = correlation_matrix['average_rating_encoded'].sort_values(ascending=False)
print(correlation_with_target)
     average_rating_encoded
                                 1.000000
                                 0.150477
     num_pages
     language_codejpn
                                 0.061528
     language_codezho
                                 0.052910
                                 0.038224
     {\tt ratings\_count}
                                 0.033663
     text_reviews_count
     language_codewel
                                 0.028839
     language_codemul
                                 0.022690
     authors_encoded
                                 0.021078
     language_codelat
                                 0.019649
     language_codegla
                                 0.014500
                                 0.013147
     language_codetur
     language_coderus
                                 0.012280
                                 0.012239
     {\tt language\_codefre}
     language_codeale
                                 0.011524
                                 0.008709
     language_codeita
                                 0.006654
     language_codenl
     language_codeen-CA
                                 0.006562
     language_codemsa
                                 0.004760
     language_codeger
                                 0.004333
     language_codepor
                                 0.000935
     language_codeeng
                                -0.000079
     language_codespa
                                -0.001922
     language_codeenm
                                -0.002847
     language_codeen-GB
                                -0.004262
                                -0.009039
     language_codenor
                                -0.010391
     language_codeara
     language_codeglg
                                -0.015532
     language_codeswe
                                -0.018331
     language_codegrc
                                -0.020361
                                -0.021091
     language_codeen-US
                                -0.106439
     language_codesrp
     Name: average_rating_encoded, dtype: float64
# Display the elements of the target variable 'average_rating_encoded'
print(pd_df1_encoded['average_rating_encoded'])
     0
               4.57
     1
               4.49
     2
               4.42
               4.56
     3
     4
               4.78
               4.06
     11118
     11119
               4.08
     11120
               3.96
     11121
               3.72
     11122
               3.91
     Name: average_rating_encoded, Length: 11123, dtype: float64
```

```
print(pd_df1_encoded)
print(pd_df1_encoded.columns)
print(pd_df1_encoded['language_codeeng'])
       11118
                                         0
                                                                    0
                                                                                               0
                                                                                                                           0
       11119
                                         0
                                                                    0
                                                                                                0
                                                                                                                           0
       11120
                                         0
                                                                    0
                                                                                                0
                                                                                                                           0
       11121
                                                                    0
                                                                                                                           0
                                         0
                                                                                                0
       11122
                                         0
                                                                    0
                                                                                                1
                                                                                                                           0
                  language_codeswe
                                             language_codetur
                                                                        language_codewel
                                                                                                   language_codezho
       0
       1
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                                                                    0
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                                                                                                                           0
       2
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        4
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       11120
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       11121
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       11122
                                         0
                                                                                                0
                                                                                                                           0
                  authors_encoded average_rating_encoded
       0
                             0.395601
       1
                             0.395601
       2
                             0.394998
                             0.395601
                                                                        4.56
       3
                             0.395601
       4
                                                                        4.78
                                                                        4.06
       11118
                             0.987647
       11119
                             0.987496
                                                                        4.08
       11120
                             0.987496
                                                                        3.96
        11121
                             0.987496
                                                                        3.72
       11122
                             0.620066
                                                                        3.91
        [11123 rows x 32 columns]
        Index(['num_pages', 'ratings_count', 'text_reviews_count', 'language_codeale',
                  ['num_pages', 'ratings_count', 'text_reviews_count', 'language_c'
'language_codeara', 'language_codeen-CA', 'language_codeen-GB',
'language_codeen-US', 'language_codeeng', 'language_codeenm',
'language_codefre', 'language_codegre', 'language_codegla',
'language_codeglg', 'language_codegre', 'language_codeita',
'language_codejpn', 'language_codelat', 'language_codemsa',
'language_codemul', 'language_codenl', 'language_codenor',
'language_codepor', 'language_coderus', 'language_codespa',
'language_codesrp', 'language_codeswe', 'language_codetur',
'language_codewel', 'language_codezho', 'authors_encoded',
'average_rating_encoded'].
                'average_rating_encoded'],
dtype='object')
       0
                     1
       1
                     1
       2
                     1
       3
                     1
       4
                     1
       11118
                     1
       11119
                     1
       11120
                     1
       11121
                     1
       11122
       Name: language_codeeng, Length: 11123, dtype: uint8
# Display the data types of columns in the DataFrame pd df1 encoded
print(pd_df1_encoded.dtypes)
                                               float64
       num_pages
       ratings_count
                                               float64
        text reviews count
                                               float64
                                                  uint8
       language_codeale
        language_codeara
                                                  uint8
        language_codeen-CA
                                                  uint8
        {\tt language\_codeen\text{-}GB}
                                                  uint8
        language_codeen-US
                                                  uint8
        language_codeeng
                                                  uint8
        language_codeenm
                                                  uint8
        language_codefre
                                                  uint8
        language_codeger
                                                  uint8
        language_codegla
                                                  uint8
        language_codeglg
                                                  uint8
        language_codegrc
                                                  uint8
        language_codeita
                                                  uint8
        language_codejpn
                                                  uint8
```

uint8

uint8

uint8

 ${\tt language\_codelat}$ 

language\_codemsa

language\_codemul

language\_codenl

```
language_codenor
                            uint8
language_codepor
                            uint8
language_coderus
                            uint8
language_codespa
                            uint8
language_codesrp
                            uint8
                            uint8
language_codeswe
language_codetur
                            uint8
language_codewel
                            uint8
language_codezho
                            uint8
authors_encoded
                          float64
average_rating_encoded
                          float64
dtype: object
```

# Display the content of the 'num\_pages' column in the DataFrame pd\_df1\_encoded print(pd\_df1\_encoded['num\_pages'])

```
0
         0.099148
         0.132299
1
         0.053528
2
3
         0.066150
4
         0.409063
         0.077859
11118
         0.096563
11119
11120
         0.063108
11121
         0.065998
11122
         0.041363
Name: num_pages, Length: 11123, dtype: float64
```

0

# → Data Modeling

```
# Split the data into independent variables (X) and the target variable (y)
X = pd_df1_encoded.drop('average_rating_encoded', axis=1) # Independent variables
y = pd_df1_encoded['average_rating_encoded'] # Target variable
print(X)
      11119
                                0
                                                        0
                                                                                0
                                                                                0
      11121
                                0
                                                        0
                                                                                0
      11122
                                0
                                                        0
                                                                                0
              {\tt language\_codeen-US} \quad {\tt language\_codeeng} \quad {\tt language\_codeenm}
      0
                                  a
                                                                              a
      1
                                   a
                                                        1
                                                                              a
      2
                                   a
                                                        1
                                                                              a
      3
                                   0
                                                        1
                                                                              0
                                                                                 . . .
      4
                                   0
                                                        1
                                                                              0
                                                                                 . . .
      11119
                                                        1
                                                                                 . . .
      11120
                                                                              0
                                   0
                                                        1
                                                                                 . . .
      11121
                                   0
                                                        1
                                                                             0
     11122
                                   0
                                                        0
                                                                              0
              {\tt language\_codenor} \quad {\tt language\_codepor} \quad {\tt language\_coderus} \quad {\tt language\_codespa}
      0
                                0
                                                      0
                                                                           0
      1
                                0
                                                      0
                                                                           0
                                                                                                 0
      2
                                                                           0
                                                                                                 0
```

```
language_codezno authors_encoded
     0
                                     0.395601
     1
                           0
                                     0.395601
     2
                                     0.394998
                                     0.395601
     3
                           0
     4
                           0
                                     0.395601
                                     0.987647
     11118
                           0
                                     0.987496
     11119
                           0
                                     0.987496
     11120
                           a
                                     0.987496
     11121
                           0
     11122
                           0
                                     0.620066
     [11123 rows x 31 columns]
y = pd_df1_encoded['average_rating_encoded']
print(y)
     a
              4.57
     1
              4.49
     2
              4.42
     3
              4.56
     4
              4.78
     11118
              4.06
              4.08
     11119
     11120
              3.96
     11121
              3.72
     11122
              3.91
     Name: average_rating_encoded, Length: 11123, dtype: float64
# Split the data into training and testing sets
X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.2, random_state=42)
# Instead of this (might trigger the warning):
# pd_df1_encoded['num_pages'].replace('', pd.NA, inplace=True)
# Use .loc to modify the DataFrame directly:
pd_df1_encoded.loc[pd_df1_encoded['num_pages'] == '', 'num_pages'] = pd.NA
X_train.fillna(X_train.mean(), inplace=True)
y_train.fillna(y_train.mean(), inplace=True)
import numpy as np
from sklearn.metrics import mean_squared_error
# Create the linear regression model
model = LinearRegression()
# Train the model on the training data
model.fit(X_train, y_train)
# Make predictions on the test data
y_pred = model.predict(X_test)
# Calculate the mean squared error
mse = mean_squared_error(y_test, y_pred)
# Calculate the root mean squared error (RMSE)
rmse = np.sqrt(mse)
# Print the RMSE
print("Root Mean Squared Error:", rmse)
     Root Mean Squared Error: 30877019095.418633
import numpy as np
from sklearn.metrics import mean_squared_error
# Create the decision tree model
tree_model = DecisionTreeRegressor(random_state=42)
# Train the model on the training data
tree_model.fit(X_train, y_train)
# Make predictions on the test data
y_pred_tree = tree_model.predict(X_test)
```

```
# Calculate the mean squared error
mse_tree = mean_squared_error(y_test, y_pred_tree)
# Calculate the root mean squared error (RMSE)
rmse_tree = np.sqrt(mse_tree)
# Print the RMSE
print("Root Mean Squared Error for Decision Tree:", rmse_tree)
     Root Mean Squared Error for Decision Tree: 0.5086307240849162
import numpy as np
from sklearn.metrics import mean_squared_error
# Create the random forest model
random_forest_model = RandomForestRegressor(n_estimators=100, random_state=42)
# Train the random forest model on the training data
random_forest_model.fit(X_train, y_train)
# Make predictions on the test data
y_pred_rf = random_forest_model.predict(X_test)
# Calculate the mean squared error
mse_rf = mean_squared_error(y_test, y_pred_rf)
# Calculate the root mean squared error (RMSE)
rmse rf = np.sqrt(mse rf)
# Print the RMSE
print("Root Mean Squared Error for Random Forest:", rmse_rf)
     Root Mean Squared Error for Random Forest: 0.34318014997365454
import numpy as np
from sklearn.metrics import mean_squared_error
# Create the XGBoost model
xgb_model = xgb.XGBRegressor(n_estimators=100, random_state=42)
# Train the XGBoost model on the training data
xgb_model.fit(X_train, y_train)
# Make predictions on the test data
y_pred_xgb = xgb_model.predict(X_test)
# Calculate the mean squared error
mse_xgb = mean_squared_error(y_test, y_pred_xgb)
# Calculate the root mean squared error (RMSE)
rmse_xgb = np.sqrt(mse_xgb)
# Print the RMSE
print("Root Mean Squared Error for XGBoost:", rmse_xgb)
```

Root Mean Squared Error for XGBoost: 0.3436460500308098

## → Conclusion

In wrapping up our Book Ratings Prediction project and summarizing the insights we've gathered, we find ourselves favoring the Random Forest and XGBoost models due to their lower RMSE values. These models have shown promise in accurately predicting book ratings, marking a notable stride in our analytical journey. As we conclude this endeavor, we stand poised to leverage these insights for informed decision-making and further advancements in the realm of book rating predictions.