WT-1: Anime Recommendations with Simple Linear Regression

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#1 Dataset Exploration:

1. Importing Libraries and Loading the Data

```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
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
```

Anime dataset and its first few rows.

```
url = 'anime.csv'
url2 = 'rating.csv'
anime df = pd.read csv(url)
rating df = pd.read csv(url2)
# Display the first few rows of each dataset
anime data head = anime df.head()
rating data head = rating df.head()
anime_data_head, rating_data_head
    anime id
                                           name \
0
       32281
                                 Kimi no Na wa.
              Fullmetal Alchemist: Brotherhood
1
        5114
2
       28977
                                       Gintama°
3
        9253
                                    Steins; Gate
        9969
                                  Gintama&#039:
                                                          type episodes
                                                  genre
```

```
rating \
                  Drama, Romance, School, Supernatural
                                                                       1
0
9.37
1 Action, Adventure, Drama, Fantasy, Magic, Mili...
                                                                      64
                                                             TV
2 Action, Comedy, Historical, Parody, Samurai, S...
                                                                      51
                                                             TV
9.25
3
                                       Sci-Fi, Thriller
                                                             TV
                                                                      24
9.17
4 Action, Comedy, Historical, Parody, Samurai, S...
                                                             TV
                                                                      51
9.16
    members
 0
     200630
 1
     793665
 2
     114262
 3
     673572
 4
     151266
            anime id rating
    user id
 0
                    20
                            - 1
          1
1
          1
                    24
                            - 1
 2
                    79
          1
                            - 1
 3
          1
                   226
                            - 1
                            -1)
 4
          1
                   241
```

2. Checking for Missing Values

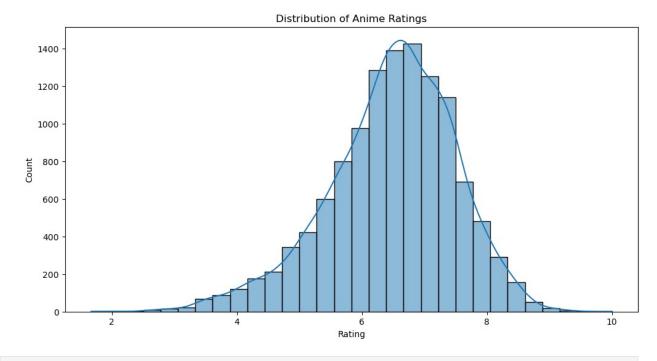
```
# Check for missing values in each column
missing values = anime df.isnull().sum()
missing values2 = rating df.isnull().sum()
print("Missing values per column:\n", missing values, missing values2)
Missing values per column:
anime id
              0
name
             62
genre
             25
type
episodes
              0
            230
rating
members
dtype: int64 user id
anime id
rating
dtype: int64
```

3. Dropping or Imputing Missing Values

```
# Drop rows where 'rating' is missing
anime_df = anime_df.dropna(subset=['rating'])
# Replace missing 'genre' values with 'Unknown'
anime_df['genre'] = anime_df['genre'].fillna('Unknown')
```

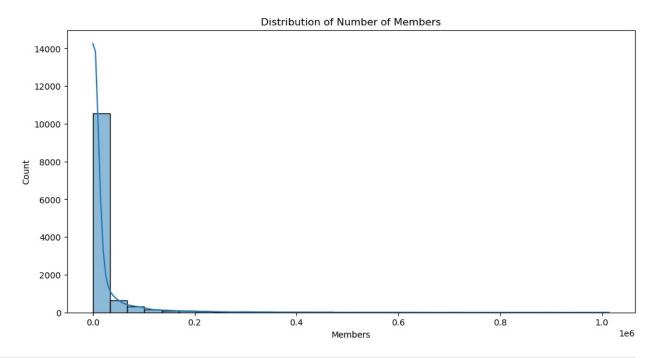
4. Visualizing the Distribution of rating and members

```
# Plot the distribution of 'rating'
plt.figure(figsize=(12, 6))
sns.histplot(anime_df['rating'], bins=30, kde=True)
plt.title('Distribution of Anime Ratings')
plt.xlabel('Rating')
plt.show()
```

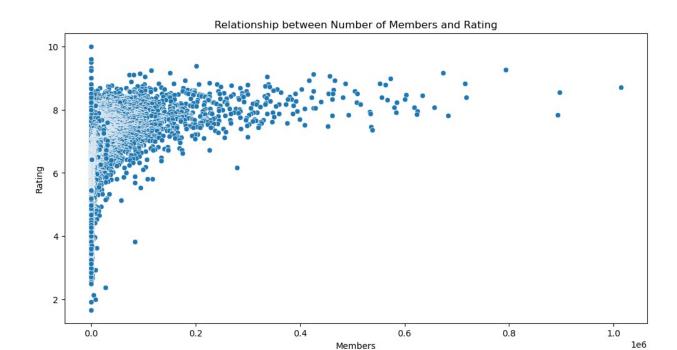


```
# Plot the distribution of 'members'
plt.figure(figsize=(12, 6))
sns.histplot(anime_df['members'], bins=30, kde=True)
plt.title('Distribution of Number of Members')
```

```
plt.xlabel('Members')
plt.show()
```



```
# Scatter plot to check relationship between 'rating' and 'members'
plt.figure(figsize=(12, 6))
sns.scatterplot(x='members', y='rating', data=anime_df)
plt.title('Relationship between Number of Members and Rating')
plt.xlabel('Members')
plt.ylabel('Rating')
plt.show()
```

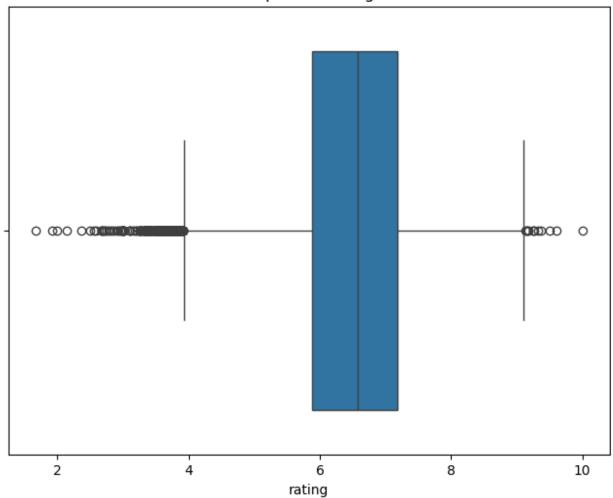


Members

5. Handling Outliers

```
# Boxplot for 'rating'
plt.figure(figsize=(8, 6))
sns.boxplot(x='rating', data=anime_df)
plt.title('Boxplot of Ratings')
plt.show()
```

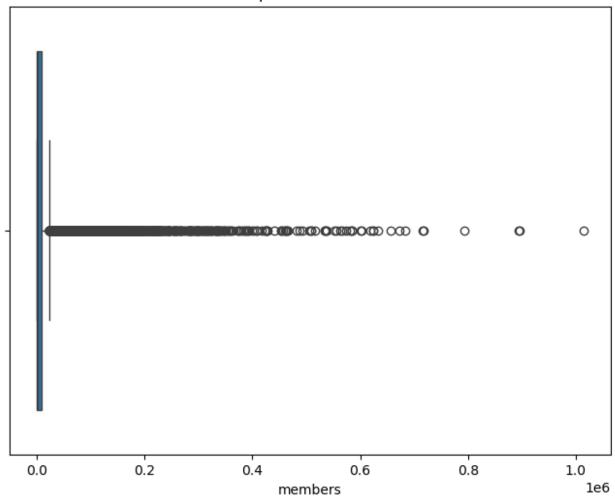
Boxplot of Ratings



```
# Boxplot for 'members'
plt.figure(figsize=(8, 6))
sns.boxplot(x='members', data=anime_df)
plt.title('Boxplot of Members')
plt.show()

# Cap the 'members' column at the 95th percentile
cap_value = anime_df['members'].quantile(0.95)
anime_df['members'] = anime_df['members'].apply(lambda x: min(x, cap_value))
```

Boxplot of Members



6. Encoding the genre Column and Creating New Features

2 3 4	28977 9253 9969							
						genre	type	episodes
	ting \			6 1 1	•			
0 9.3	37	υram	a, Romance,	School,	Super	natural	Movie	1
1 9.2	Action, A	Adventure	, Drama, Fa	antasy, M	agic,	Mili	TV	64
	Action, (Comedy, F	istorical,	Parody,	Samura	ni, S	TV	51
3				Sci	-Fi, T	hriller	TV	24
9.1 4		omedy. F	istorical,	Parody.	Samura	i. S	TV	51
9.		comeay, i	150011000,	Turouy,	Jamar c	.1, 3111		31
	members	genre d	ount Adve	enture	Cars	Shou	ınen S	lice of
Li	fe \	genre_e	oune nave	Sileure	curs	111 51100	anen 3	1100 01
0	94362.65		4	0	0		0	
0 1	94362.65		7	1	0		0	
0 2	94362.65		7	0	0		0	
0	94302.03		1	U	U		U	
3	94362.65		2	0	0		0	
0 4	94362.65		7	0	0		0	
0								
Var	Space Space Spanning		per Power	Supernat	ural	Thriller	Unkno	wn
0	0	0	Θ		0	0		0
0	0	0	Θ		0	A		0
0	0 0	U	U		U	0		0
0 2 0	0	0	0		0	0		0
3	0	0	0		0	0		0
0 4	0	Θ	0		0	۵		0
0	0 0	U	U		U	0		U
[5	rows v 0	Loolumno	1					

[5 rows x 91 columns]

7. Final Check of the Cleaned Data

```
# Final check for missing values
print(anime df.isnull().sum())
# Check the structure of the dataset
print(anime df.info())
anime id
                 0
name
                 0
                 0
genre
                 0
type
                 0
episodes
                . .
Supernatural
                 0
Thriller
                 0
Unknown
                 0
                 0
Vampire
                 0
Yaoi
Length: 91, dtype: int64
<class 'pandas.core.frame.DataFrame'>
Index: 12064 entries, 0 to 12293
Data columns (total 91 columns):
#
     Column
                      Non-Null Count
                                       Dtype
     -----
 0
     anime id
                      12064 non-null
                                       int64
 1
     name
                      12064 non-null
                                       object
 2
                      12064 non-null
                                       object
     genre
 3
                      12064 non-null
                                       object
     type
 4
                      12064 non-null
                                       object
     episodes
 5
     rating
                      12064 non-null
                                       float64
 6
     members
                      12064 non-null
                                       float64
 7
                      12064 non-null
     genre count
                                       int64
 8
      Adventure
                      12064 non-null
                                       int64
 9
      Cars
                      12064 non-null
                                       int64
 10
      Comedy
                      12064 non-null
                                       int64
 11
      Dementia
                      12064 non-null
                                       int64
 12
      Demons
                      12064 non-null
                                       int64
 13
      Drama
                      12064 non-null
                                       int64
 14
                      12064 non-null
                                       int64
      Ecchi
 15
      Fantasy
                      12064 non-null
                                       int64
 16
      Game
                      12064 non-null
                                       int64
 17
                      12064 non-null
      Harem
                                       int64
 18
      Hentai
                      12064 non-null
                                       int64
 19
                      12064 non-null
      Historical
                                       int64
 20
      Horror
                      12064 non-null
                                      int64
 21
      Josei
                      12064 non-null
                                       int64
 22
      Kids
                      12064 non-null
                                       int64
 23
      Magic
                      12064 non-null
                                       int64
 24
      Martial Arts
                      12064 non-null
                                       int64
```

```
25
                     12064 non-null
                                      int64
     Mecha
26
     Military
                     12064 non-null
                                      int64
27
     Music
                     12064 non-null
                                      int64
28
                     12064 non-null
                                      int64
     Mystery
29
     Parody
                     12064 non-null
                                      int64
30
     Police
                     12064 non-null
                                      int64
31
     Psychological
                     12064 non-null
                                      int64
32
                     12064 non-null
                                      int64
     Romance
33
     Samurai
                                      int64
                     12064 non-null
34
     School
                     12064 non-null
                                      int64
35
     Sci-Fi
                     12064 non-null
                                      int64
36
     Seinen
                     12064 non-null
                                      int64
37
                     12064 non-null
     Shoujo
                                      int64
38
     Shoujo Ai
                     12064 non-null
                                      int64
39
     Shounen
                     12064 non-null
                                      int64
40
                     12064 non-null
     Shounen Ai
                                      int64
41
     Slice of Life
                     12064 non-null
                                      int64
42
                     12064 non-null
     Space
                                      int64
43
     Sports
                     12064 non-null
                                      int64
44
     Super Power
                     12064 non-null
                                      int64
45
     Supernatural
                     12064 non-null
                                      int64
46
     Thriller
                     12064 non-null
                                      int64
47
                     12064 non-null
     Vampire
                                      int64
48
     Yaoi
                     12064 non-null
                                      int64
49
     Yuri
                     12064 non-null
                                      int64
50
    Action
                     12064 non-null
                                      int64
51
    Adventure
                     12064 non-null
                                      int64
52
                     12064 non-null
    Cars
                                      int64
53
    Comedy
                     12064 non-null
                                      int64
                                      int64
54
    Dementia
                     12064 non-null
55
    Demons
                     12064 non-null
                                      int64
56
    Drama
                     12064 non-null
                                      int64
57
                     12064 non-null
    Ecchi
                                      int64
58
    Fantasy
                     12064 non-null
                                      int64
                                      int64
59
                     12064 non-null
    Game
                     12064 non-null
60
    Harem
                                      int64
61
    Hentai
                     12064 non-null
                                      int64
                     12064 non-null
62
    Historical
                                      int64
63
    Horror
                     12064 non-null
                                      int64
64
    Josei
                     12064 non-null
                                      int64
65
    Kids
                     12064 non-null
                                      int64
66
                     12064 non-null
                                      int64
    Magic
    Martial Arts
                     12064 non-null
67
                                      int64
68
    Mecha
                     12064 non-null
                                      int64
69
                     12064 non-null
    Military
                                      int64
70
                     12064 non-null
                                      int64
    Music
71
    Mystery
                     12064 non-null
                                      int64
72
    Parody
                     12064 non-null
                                      int64
73
    Police
                     12064 non-null
                                      int64
```

```
74 Psychological
                    12064 non-null
                                    int64
    Romance
75
                    12064 non-null
                                    int64
76 Samurai
                    12064 non-null int64
77 School
                    12064 non-null int64
78 Sci-Fi
                    12064 non-null int64
79 Seinen
                    12064 non-null int64
80 Shoujo
                    12064 non-null int64
81 Shounen
                    12064 non-null int64
82 Slice of Life
                    12064 non-null int64
83 Space
                    12064 non-null int64
84 Sports
                    12064 non-null int64
85 Super Power
86 Supernatural
                    12064 non-null int64
                    12064 non-null int64
87 Thriller
                    12064 non-null int64
88 Unknown
                    12064 non-null int64
                    12064 non-null int64
89
   Vampire
90 Yaoi
                    12064 non-null int64
dtypes: float64(2), int64(85), object(4)
memory usage: 8.5+ MB
None
```

#2 Feature Engineering

1. Create a New Feature for Genre Count:

```
# Create a new feature that counts the number of genres for each anime
anime df['genre count'] = anime df['genre'].apply(lambda x:
len(x.split(',')))
# Display the updated DataFrame to verify
print(anime_df[['name', 'genre', 'genre_count']].head())
                     Kimi no Na wa.
1
   Fullmetal Alchemist: Brotherhood
2
                           Gintama°
3
                        Steins:Gate
4
                      Gintama'
                                               genre
                                                      genre count
                Drama, Romance, School, Supernatural
0
1 Action, Adventure, Drama, Fantasy, Magic, Mili...
                                                                7
2 Action, Comedy, Historical, Parody, Samurai, S...
                                                                7
```

```
Sci-Fi, Thriller 2
4 Action, Comedy, Historical, Parody, Samurai, S... 7
```

2. Log Transformation of the members Column:

```
# Apply log transformation to the 'members' column to reduce skewness
anime df['log members'] = anime df['members'].apply(lambda x:
np.log1p(x))
# Display the updated DataFrame to verify
print(anime df[['members', 'log members']].head())
    members
            log members
   94362.65
               11.454911
  94362.65
               11.454911
1
  94362.65
               11.454911
3 94362.65
               11.454911
4 94362.65
               11.454911
```

3. One-Hot Encoding the genre Column:

```
# One-hot encode the 'genre' column by splitting on commas
anime_genres = anime_df['genre'].str.get_dummies(sep=',')
# Concatenate the one-hot encoded genres back to the original
DataFrame
anime df = pd.concat([anime df, anime genres], axis=1)
# Display the updated DataFrame to verify
print(anime df.head())
   anime id
                                          name \
0
      32281
                               Kimi no Na wa.
1
       5114
            Fullmetal Alchemist: Brotherhood
2
                                     Gintama°
      28977
3
       9253
                                  Steins:Gate
       9969
                                Gintama&#039:
                                                genre type episodes
rating \
                Drama, Romance, School, Supernatural Movie
                                                                    1
9.37
1 Action, Adventure, Drama, Fantasy, Magic, Mili...
                                                          TV
                                                                   64
9.26
2 Action, Comedy, Historical, Parody, Samurai, S...
                                                          TV
                                                                   51
```

5				Sc	i-Fi, ⁻	Thriller	TV	24
.7								
Action 6	ı, Cor	nedy, H	Historica	l, Parody,	Samura	ai, S	TV	51
	ers (genre_d	count A	dventure	Cars	Shou	nen Slice	of
	65		4	0	0		0	
94362.	65		7	1	0		0	
94362.	65		7	0	Θ		0	
94362.	65		2	0	Θ		0	
94362.	65		7	0	0		0	
		rts Si	uper Powe	r Superna	tural	Thriller	Unknown	
0		0		0	0	0	0	
0		0		0	0	0	0	
0		0		Θ	0	Θ	0	
0		0		0	0	0	0	
		0		0	0	0	0	
	7 Action 6 member e \ 94362. 94362. 94362. 94362. Space pire 0 0 0 0 0	7 Action, Con 6 members 0 94362.65 94362.65 94362.65 94362.65 Space Spon pire Yaoi 0 0 0 0	7 Action, Comedy, I 6 members genre_0 94362.65 94362.65 94362.65 94362.65 Space Sports Sopire Yaoi 0 0 0 0 0 0 0 0	7 Action, Comedy, Historica 6 members genre_count A e \ 94362.65	Sc 7 Action, Comedy, Historical, Parody, 6 members genre_count Adventure e \ 94362.65	Sci-Fi, 7 Action, Comedy, Historical, Parody, Samura 6 members genre_count Adventure Cars e \ 94362.65	Sci-Fi, Thriller 7 Action, Comedy, Historical, Parody, Samurai, S 6 members genre_count Adventure Cars Should be \ 94362.65	Sci-Fi, Thriller TV 7 Action, Comedy, Historical, Parody, Samurai, S TV members genre_count Adventure Cars Shounen Slice e \ 94362.65 4 0 0 0 94362.65 7 1 0 0 94362.65 7 0 0 0 94362.65 2 0 0 0 Space Sports Super Power Supernatural Thriller Unknown pire Yaoi 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0

4. Final DataFrame Check:

None

```
print(anime_df.info())

<class 'pandas.core.frame.DataFrame'>
Index: 12064 entries, 0 to 12293
Columns: 175 entries, anime_id to Yaoi
dtypes: float64(3), int64(168), object(4)
memory usage: 16.2+ MB
```

#3 Simple Linear Regression

1. Regression Setup:

2. Train-Test Split:

3. Model Fitting:

4. Plotting the Regression Line:

After fitting the model, we'll visualize the relationship by plotting a regression line on top of a scatter plot.

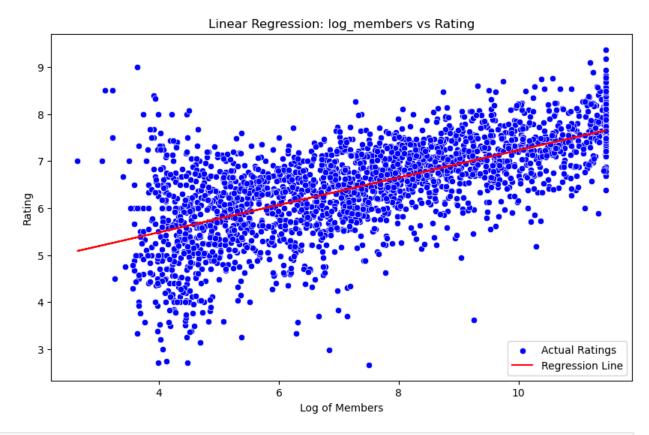
```
# Set up the independent (X) and dependent (Y) variables
X = anime df[['log members']]
y = anime_df['rating']
X train, X test, y train, y test = train test split(X, y,
test_size=0.2, random_state=42)
regressor = LinearRegression()
regressor.fit(X train, y train)
LinearRegression()
# Predict the ratings on the test set
y pred = regressor.predict(X test)
# Calculate the Mean Squared Error (MSE) to evaluate the model
mse = mean_squared_error(y_test, y_pred)
print(f'Mean Squared Error: {mse}')
# Get the regression coefficients (slope) and intercept
slope = regressor.coef_[0]
intercept = regressor.intercept
print(f'Regression Slope: {slope}')
print(f'Regression Intercept: {intercept}')
Mean Squared Error: 0.6014308621145235
Regression Slope: 0.2910252005335904
Regression Intercept: 4.321222394157205
```

5. Plot the Regression Line on a Scatter Plot:

```
# Plot the scatter plot of log_members vs rating
plt.figure(figsize=(10, 6))
sns.scatterplot(x=X_test['log_members'], y=y_test, color='blue',
label='Actual Ratings')

# Plot the regression line
plt.plot(X_test['log_members'], y_pred, color='red', label='Regression
Line')

# Add labels and title
plt.title('Linear Regression: log_members vs Rating')
plt.xlabel('Log of Members')
plt.ylabel('Rating')
plt.legend()
plt.show()
```



6. Interpreting the Results:

#4 Insights and Reporting

- 1. Impact of Feature Engineering:
- 2. Relationship Between Members and Rating:
- 3. Predictive Features:

#5 Conclusion:

#6 Next Steps and Improvements:

Thank You