

EDX_Mid_term_project

February 18, 2023

0.1 Para conocer versiones de Python y Seaborn

```
[1]: #from platform import python_version
      #print(python_version())

      #import seaborn as sns
      #print(sns.__version__)
```

1 LIBRERIAS Y COMMAND PROMPT

```
[2]: import numpy as np
      import pandas as pd
      import regex as re
      import matplotlib.pyplot as plt
      import seaborn as sns
```

```
[3]: %cd C:\Users\Tole
      ↪01\Desktop\Micromaster_Data_Science\Week-4-Pandas\movielens\ml-25m
```

C:\Users\Tole 01\Desktop\Micromaster_Data_Science\Week-4-Pandas\movielens\ml-25m

```
[4]: !ls -a
```

```
.
..
README.txt
genome-scores.csv
genome-tags.csv
links.csv
movies.csv
ratings.csv
tags.csv
```

2 DATA EXPLORATION

2.1 MOVIES DATA

```
[5]: movies = pd.read_csv('movies.csv')
ratings = pd.read_csv('ratings.csv')
```

```
[6]: movies.size
```

```
[6]: 187269
```

```
[7]: ratings.head(5)
```

```
[7]:   userId  movieId  rating  timestamp
0      1      296     5.0   1147880044
1      1      306     3.5   1147868817
2      1      307     5.0   1147868828
3      1      665     5.0   1147878820
4      1      899     3.5   1147868510
```

```
[8]: movies.head(2)
```

```
[8]:   movieId      title      genres
0      1  Toy Story (1995)  Adventure|Animation|Children|Comedy|Fantasy
1      2   Jumanji (1995)      Adventure|Children|Fantasy
```

```
[9]: movies.genres.value_counts()
```

```
[9]: Drama                                9056
Comedy                                5674
(no genres listed)                     5062
Documentary                           4731
Comedy|Drama                           2386
...
Action|Adventure|Crime|Fantasy          1
Drama|Film-Noir|Musical|Thriller         1
Action|Drama|Horror|Mystery              1
Adventure|Comedy|Sci-Fi|Thriller|War     1
Comedy|Horror|Mystery|Sci-Fi|Western     1
Name: genres, Length: 1639, dtype: int64
```

```
[10]: # Eliminate the movies without genres
movies_with_genre = movies[~movies.genres.str.contains('([]?[Nn]o [Gg]enres_|
↳[Ll]isted[)]?')]

# Create an array of lists that contains different genres
movies_with_genre['Genre_list'] = movies_with_genre.genres.apply(lambda x: x.
↳split('|') if re.compile('([)]').findall(x) else x.split())
```

```
# Count the number of genres according to each list
movies_with_genre['Genre_list_count'] = movies_with_genre.Genre_list.
    ↪ apply(lambda x: len(x) if isinstance(x, list) else len(x))
movies_with_genre
```

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\2338301558.py:5:
 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-versus-a-copy

```
movies_with_genre['Genre_list'] = movies_with_genre.genres.apply(lambda x:
x.split('|') if re.compile('[|]').findall(x) else x.split())
```

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\2338301558.py:8:
 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-versus-a-copy

```
movies_with_genre['Genre_list_count'] =
movies_with_genre.Genre_list.apply(lambda x: len(x) if isinstance(x, list) else
len(x))
```

```
[10]:
```

	movieId	title \	genres \
0	1	Toy Story (1995)	Adventure Animation Children Comedy Fantasy
1	2	Jumanji (1995)	Adventure Children Fantasy
2	3	Grumpier Old Men (1995)	Comedy Romance
3	4	Waiting to Exhale (1995)	Comedy Drama Romance
4	5	Father of the Bride Part II (1995)	Comedy
...
62417	209155	Santosh Subramaniam (2008)	Action Comedy Romance
62418	209157	We (2018)	
62419	209159	Window of the Soul (2001)	
62420	209163	Bad Poems (2018)	
62422	209171	Women of Devil's Island (1962)	

62418	Drama
62419	Documentary
62420	Comedy Drama
62422	Action Adventure Drama

	Genre_list	Genre_list_count
0	[Adventure, Animation, Children, Comedy, Fantasy]	5
1	[Adventure, Children, Fantasy]	3
2	[Comedy, Romance]	2
3	[Comedy, Drama, Romance]	3
4	[Comedy]	1
...
62417	[Action, Comedy, Romance]	3
62418	[Drama]	1
62419	[Documentary]	1
62420	[Comedy, Drama]	2
62422	[Action, Adventure, Drama]	3

[57361 rows x 5 columns]

```
[11]: # Print the number of items inside of the lists
print(f' These numbers represent the number of genres per movie_
↳ {movies_with_genre.Genre_list_count.unique()}')

# Count the number of genres per genre's number
movies_with_genre[['Genre_list_count', 'Genre_list']].
↳ groupby('Genre_list_count').count()
```

These numbers represent the number of genres per movie [5 3 2 1 4 6 7 8 10]

```
[11]: Genre_list
Genre_list_count
1          25569
2          18326
3           9852
4           2784
5            680
6            123
7             24
8              2
10             1
```

```
[12]: # Total number of categories for genres
print(f' There are {len(movies_with_genre.genres.unique())} combination of_
↳ genres according to the data')

# The 50 most counted genre's categories (including mixed categories)
```

```

the_most_counted_genres = movies_with_genre[['genres', 'Genre_list']].
    ↳groupby('genres').count().sort_values(by='Genre_list', ascending=False).
    ↳reset_index()
the_most_counted_genres.head(50)

```

There are 1638 combination of genres according to the data

```

[12]:

```

	genres	Genre_list
0	Drama	9056
1	Comedy	5674
2	Documentary	4731
3	Comedy Drama	2386
4	Drama Romance	2126
5	Horror	1661
6	Comedy Romance	1577
7	Comedy Drama Romance	1044
8	Drama Thriller	933
9	Thriller	919
10	Crime Drama	903
11	Horror Thriller	851
12	Animation	729
13	Drama War	653
14	Action	562
15	Western	560
16	Action Drama	536
17	Crime Drama Thriller	502
18	Action Thriller	445
19	Comedy Horror	374
20	Sci-Fi	374
21	Action Comedy	357
22	Horror Sci-Fi	337
23	Children Drama	287
24	Animation Children	284
25	Comedy Crime	280
26	Romance	278
27	Children Comedy	268
28	Action Crime Thriller	261
29	Action Crime Drama	254
30	Action Drama Thriller	245
31	Adventure	243
32	Crime Thriller	242
33	Horror Mystery Thriller	236
34	Crime	218
35	Adventure Drama	213
36	Drama Horror Thriller	213
37	Drama Mystery Thriller	207
38	Action Sci-Fi	205

39	Animation Comedy	204
40	Action Adventure	200
41	Drama Horror	197
42	Drama Mystery	194
43	Mystery Thriller	192
44	Animation Children Comedy	182
45	Action Crime Drama Thriller	168
46	Action Crime	167
47	Children	167
48	Drama Sci-Fi	163
49	Action Drama War	162

```
[13]: # Filtering by 1 genre
unique_genres = movies_with_genre[movies_with_genre.Genre_list_count == 1]

# Counting the genres
counting_unique_genres = unique_genres[['genres', 'Genre_list_count']].
    ↳groupby('genres').count().sort_values(by='Genre_list_count',
    ↳ascending=False).reset_index()
counting_unique_genres.head(20)
```

```
[13]:
```

	genres	Genre_list_count
0	Drama	9056
1	Comedy	5674
2	Documentary	4731
3	Horror	1661
4	Thriller	919
5	Animation	729
6	Action	562
7	Western	560
8	Sci-Fi	374
9	Romance	278
10	Adventure	243
11	Crime	218
12	Children	167
13	Mystery	130
14	Fantasy	99
15	War	89
16	Musical	65
17	Film-Noir	13
18	IMAX	1

```
[14]: movies_with_genre['Year'] = movies_with_genre.title.str.extract(r'((?
    ↳<=\s[()]\d{4}(?=\)))')
movies_with_genre.dropna(inplace=True)
movies_with_genre['Year'] = movies_with_genre.Year.apply(lambda x: int(x))
```

```
movies_with_genre.sort_values(by='Year')
```

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1445183274.py: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: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

```
movies_with_genre['Year'] =  
movies_with_genre.title.str.extract(r'((?<=\s[()]\d{4}(?=\s)))')
```

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1445183274.py:2:

SettingWithCopyWarning:

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

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

```
movies_with_genre.dropna(inplace=True)
```

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1445183274.py: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: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

```
movies_with_genre['Year'] = movies_with_genre.Year.apply(lambda x: int(x))
```

```
[14]:
```

	movieId	title \	genres \
35536	148054	Passage de Venus (1874)	
59938	202045	Athlete Swinging a Pick (1880)	
35534	148050	Traffic Crossing Leeds Bridge (1888)	
48528	176849	Roundhay Garden Scene (1888)	
35530	148042	Accordion Player (1888)	
...	
61642	206451	Bad Education (2019)	
61097	204966	Luce (2019)	
59335	200630	Missing Link (2019)	
61627	206403	Vita & Virginia (2019)	
60845	204294	The Great Hack (2019)	
35536			Documentary
59938			Documentary
35534			Documentary
48528			Documentary
35530			Documentary
...			...

61642	Comedy Drama
61097	Drama
59335	Adventure Animation Children Comedy Fantasy
61627	Drama Romance
60845	Documentary

	Genre_list	Genre_list_count	\
35536	[Documentary]	1	
59938	[Documentary]	1	
35534	[Documentary]	1	
48528	[Documentary]	1	
35530	[Documentary]	1	
...	
61642	[Comedy, Drama]	2	
61097	[Drama]	1	
59335	[Adventure, Animation, Children, Comedy, Fantasy]	5	
61627	[Drama, Romance]	2	
60845	[Documentary]	1	

	Year
35536	1874
59938	1880
35534	1888
48528	1888
35530	1888
...	...
61642	2019
61097	2019
59335	2019
61627	2019
60845	2019

[57214 rows x 6 columns]

```
[15]: # PELICULAS SIN FECHA
#movies_with_genre[~movies_with_genre.title.str.contains('\(\d{4}\)'),
↪regex=True)]

# POR SI QUIERO CHECAR GRUPOS DE CAPTURA ANORMALES
#movies_with_genre.title.isnull().any()
#movies_with_genre[movies_with_genre.title.str.contains('[-]\d{2,4}',
↪regex=True)].title.apply(lambda x: print(x))
#movies_with_genre[movies_with_genre.title.str.contains('\d{2,4}-',
↪regex=True)].title.apply(lambda x: print(x))
```


2.2 RATINGS DATA

```
[16]: ratings['Time'] = pd.to_datetime(ratings.timestamp, unit='s')
ratings
```

```
[16]:
```

	userId	movieId	rating	timestamp	Time
0	1	296	5.0	1147880044	2006-05-17 15:34:04
1	1	306	3.5	1147868817	2006-05-17 12:26:57
2	1	307	5.0	1147868828	2006-05-17 12:27:08
3	1	665	5.0	1147878820	2006-05-17 15:13:40
4	1	899	3.5	1147868510	2006-05-17 12:21:50
...
25000090	162541	50872	4.5	1240953372	2009-04-28 21:16:12
25000091	162541	55768	2.5	1240951998	2009-04-28 20:53:18
25000092	162541	56176	2.0	1240950697	2009-04-28 20:31:37
25000093	162541	58559	4.0	1240953434	2009-04-28 21:17:14
25000094	162541	63876	5.0	1240952515	2009-04-28 21:01:55

[25000095 rows x 5 columns]

```
[17]: ratings.sort_values(by='movieId')
```

```
[17]:
```

	userId	movieId	rating	timestamp	Time
2001185	13334	1	5.0	832023973	1996-05-13 21:46:13
10627899	69000	1	4.0	1564248795	2019-07-27 17:33:15
4075778	26803	1	3.5	1106468113	2005-01-23 08:15:13
19245863	124893	1	3.5	1173048946	2007-03-04 22:55:46
21816622	141835	1	3.5	1558539488	2019-05-22 15:38:08
...
18457961	119571	209157	1.5	1574280748	2019-11-20 20:12:28
17864443	115835	209159	3.0	1574280985	2019-11-20 20:16:25
1036618	6964	209163	4.5	1574284913	2019-11-20 21:21:53
18457962	119571	209169	3.0	1574291826	2019-11-20 23:17:06
18457963	119571	209171	3.0	1574291937	2019-11-20 23:18:57

[25000095 rows x 5 columns]

```
[18]: # ratings statistics using movieId as index
ratings_statistics = ratings[['movieId', 'rating']].groupby('movieId').describe()
```

```
[19]: # Drop the file of 'rating' and reset the index
new_ratings_statistics = ratings_statistics.droplevel(0, axis=1).reset_index()
```

2.3 MERGE OF DF

```
[20]: merged_df = movies_with_genre.merge(new_ratings_statistics, on='movieId',  
    ↪how='inner')  
merged_df.shape
```

```
[20]: (54350, 14)
```

```
[21]: merged_df[merged_df['count'] > 50]
```

```
[21]:
```

	movieId	title \
0	1	Toy Story (1995)
1	2	Jumanji (1995)
2	3	Grumpier Old Men (1995)
3	4	Waiting to Exhale (1995)
4	5	Father of the Bride Part II (1995)
...
53227	205076	Downton Abbey (2019)
53327	205383	El Camino: A Breaking Bad Movie (2019)
53343	205425	Dave Chappelle: Sticks & Stones (2019)
53698	206499	Between Two Ferns: The Movie (2019)
54075	207830	Terminator: Dark Fate (2019)

	genres \
0	Adventure Animation Children Comedy Fantasy
1	Adventure Children Fantasy
2	Comedy Romance
3	Comedy Drama Romance
4	Comedy
...	...
53227	Drama
53327	Crime Drama Thriller
53343	Comedy
53698	Comedy
54075	Action Sci-Fi

	Genre_list	Genre_list_count \
0	[Adventure, Animation, Children, Comedy, Fantasy]	5
1	[Adventure, Children, Fantasy]	3
2	[Comedy, Romance]	2
3	[Comedy, Drama, Romance]	3
4	[Comedy]	1
...
53227	[Drama]	1
53327	[Crime, Drama, Thriller]	3
53343	[Comedy]	1
53698	[Comedy]	1
54075	[Action, Sci-Fi]	2

	Year	count	mean	std	min	25%	50%	75%	max
0	1995	57309.0	3.893708	0.921552	0.5	3.5	4.0	4.5	5.0
1	1995	24228.0	3.251527	0.959851	0.5	3.0	3.0	4.0	5.0
2	1995	11804.0	3.142028	1.008443	0.5	3.0	3.0	4.0	5.0
3	1995	2523.0	2.853547	1.108531	0.5	2.0	3.0	4.0	5.0
4	1995	11714.0	3.058434	0.996611	0.5	2.5	3.0	4.0	5.0
...
53227	2019	53.0	3.216981	0.968293	0.5	2.5	3.5	4.0	5.0
53327	2019	252.0	3.642857	0.762302	0.5	3.5	3.5	4.0	5.0
53343	2019	69.0	3.543478	1.184269	0.5	3.0	4.0	4.0	5.0
53698	2019	90.0	3.055556	0.955306	0.5	2.5	3.0	3.5	5.0
54075	2019	55.0	3.372727	0.794764	0.5	3.0	3.5	4.0	5.0

[13040 rows x 14 columns]

```
[22]: Genre_categorization = pd.DataFrame(columns = ['movieId', 'title', 'genres', '
    ↳ 'Genre_list', 'Genre_list_count', 'Year',
        'count', 'mean', 'std', 'min', '25%', '50%', '75%', 'max'])
sizeOf_movies_per_genre = {}

for i in range(len(counting_unique_genres.genres)):
    df_to_append = merged_df[merged_df.genres.str.
    ↳ contains(counting_unique_genres.genres.loc[i])]
    df_to_append['category'] = counting_unique_genres.genres.loc[i]
    Genre_categorization = pd.concat([Genre_categorization, df_to_append], axis=
    ↳ 0)
    print(f'The genre {counting_unique_genres.genres.loc[i]} has a size of
    ↳ {df_to_append.size}')
    sizeOf_movies_per_genre[counting_unique_genres.genres.loc[i]] =
    ↳ df_to_append.size
```

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1279252646.py:7:

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-versus-a-copy

```
df_to_append['category'] = counting_unique_genres.genres.loc[i]
```

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1279252646.py:7:

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```

df_to_append['category'] = counting_unique_genres.genres.loc[i]

The genre Drama has a size of 366345
The genre Comedy has a size of 240420
The genre Documentary has a size of 81240
The genre Horror has a size of 85920
The genre Thriller has a size of 124635
The genre Animation has a size of 43635
The genre Action has a size of 103545
The genre Western has a size of 17340

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1279252646.py:7:
SettingWithCopyWarning:
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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-versus-a-copy
df_to_append['category'] = counting_unique_genres.genres.loc[i]
C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1279252646.py:7:
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-versus-a-copy
df_to_append['category'] = counting_unique_genres.genres.loc[i]
C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1279252646.py:7:
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-versus-a-copy
df_to_append['category'] = counting_unique_genres.genres.loc[i]
C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1279252646.py:7:
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: 

13


```

```
docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
df_to_append['category'] = counting_unique_genres.genres.loc[i]
C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1279252646.py:7:
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-versus-a-copy
df_to_append['category'] = counting_unique_genres.genres.loc[i]
C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1279252646.py:7:
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-versus-a-copy
df_to_append['category'] = counting_unique_genres.genres.loc[i]
```

```
The genre Sci-Fi has a size of 52350
The genre Romance has a size of 109425
The genre Adventure has a size of 57900
The genre Crime has a size of 75285
The genre Children has a size of 42930
The genre Mystery has a size of 41670
The genre Fantasy has a size of 39900
The genre War has a size of 26550
The genre Musical has a size of 15240
The genre Film-Noir has a size of 5235
The genre IMAX has a size of 2925
```

```
C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1279252646.py:7:
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-versus-a-copy
df_to_append['category'] = counting_unique_genres.genres.loc[i]
C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1279252646.py:7:
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-versus-a-copy
df_to_append['category'] = counting_unique_genres.genres.loc[i]
C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1279252646.py:7:
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-versus-a-copy

```
df_to_append['category'] = counting_unique_genres.genres.loc[i]
C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1279252646.py:7:
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-versus-a-copy

```
df_to_append['category'] = counting_unique_genres.genres.loc[i]
```

```
[23]: # The size of each Genre
df_sizeOf_movies_per_genre = pd.DataFrame.from_dict(sizeOf_movies_per_genre,
orient='index').sort_values(by = 0, ascending= False).reset_index()
df_sizeOf_movies_per_genre.rename(columns={'index': "Genre", 0: "Size"})
```

```
[23]:
```

	Genre	Size
0	Drama	366345
1	Comedy	240420
2	Thriller	124635
3	Romance	109425
4	Action	103545
5	Horror	85920
6	Documentary	81240
7	Crime	75285
8	Adventure	57900
9	Sci-Fi	52350
10	Animation	43635
11	Children	42930
12	Mystery	41670
13	Fantasy	39900
14	War	26550
15	Western	17340
16	Musical	15240
17	Film-Noir	5235
18	IMAX	2925

```
[24]: Genre_categorization
```

```
[24]:
```

	movieId	title \
3	4	Waiting to Exhale (1995)
10	11	American President, The (1995)
13	14	Nixon (1995)
15	16	Casino (1995)

16	17	Sense and Sensibility (1995)
...
22580	116253	IMAX: Coral Reef Adventure (2003)
22672	116529	Stalingrad (2013)
22936	117442	The Monkey King (2014)
24478	122886	Star Wars: Episode VII - The Force Awakens (2015)
26360	129395	Into the Deep (1994)

	genres \
3	Comedy Drama Romance
10	Comedy Drama Romance
13	Drama
15	Crime Drama
16	Drama Romance
...	...
22580	Children Documentary IMAX
22672	Action Drama War IMAX
22936	Action Adventure Children IMAX
24478	Action Adventure Fantasy Sci-Fi IMAX
26360	Documentary IMAX

	Genre_list	Genre_list_count	Year	\
3	[Comedy, Drama, Romance]	3	1995	
10	[Comedy, Drama, Romance]	3	1995	
13	[Drama]	1	1995	
15	[Crime, Drama]	2	1995	
16	[Drama, Romance]	2	1995	
...	
22580	[Children, Documentary, IMAX]	3	2003	
22672	[Action, Drama, War, IMAX]	4	2013	
22936	[Action, Adventure, Children, IMAX]	4	2014	
24478	[Action, Adventure, Fantasy, Sci-Fi, IMAX]	5	2015	
26360	[Documentary, IMAX]	2	1994	

	count	mean	std	min	25%	50%	75%	max	category
3	2523.0	2.853547	1.108531	0.5	2.00	3.0	4.000	5.0	Drama
10	17042.0	3.657171	0.904895	0.5	3.00	4.0	4.000	5.0	Drama
13	5509.0	3.423489	0.940158	0.5	3.00	3.0	4.000	5.0	Drama
15	18404.0	3.823707	0.860329	0.5	3.00	4.0	4.500	5.0	Drama
16	19729.0	3.948806	0.965527	0.5	3.00	4.0	5.000	5.0	Drama
...
22580	3.0	3.500000	0.866025	2.5	3.25	4.0	4.000	4.0	IMAX
22672	56.0	2.616071	1.220995	0.5	1.50	3.0	3.500	5.0	IMAX
22936	26.0	2.711538	0.907448	1.0	2.00	2.5	3.375	5.0	IMAX
24478	12678.0	3.739115	1.039125	0.5	3.00	4.0	4.500	5.0	IMAX
26360	3.0	3.333333	0.577350	3.0	3.00	3.0	3.500	4.0	IMAX

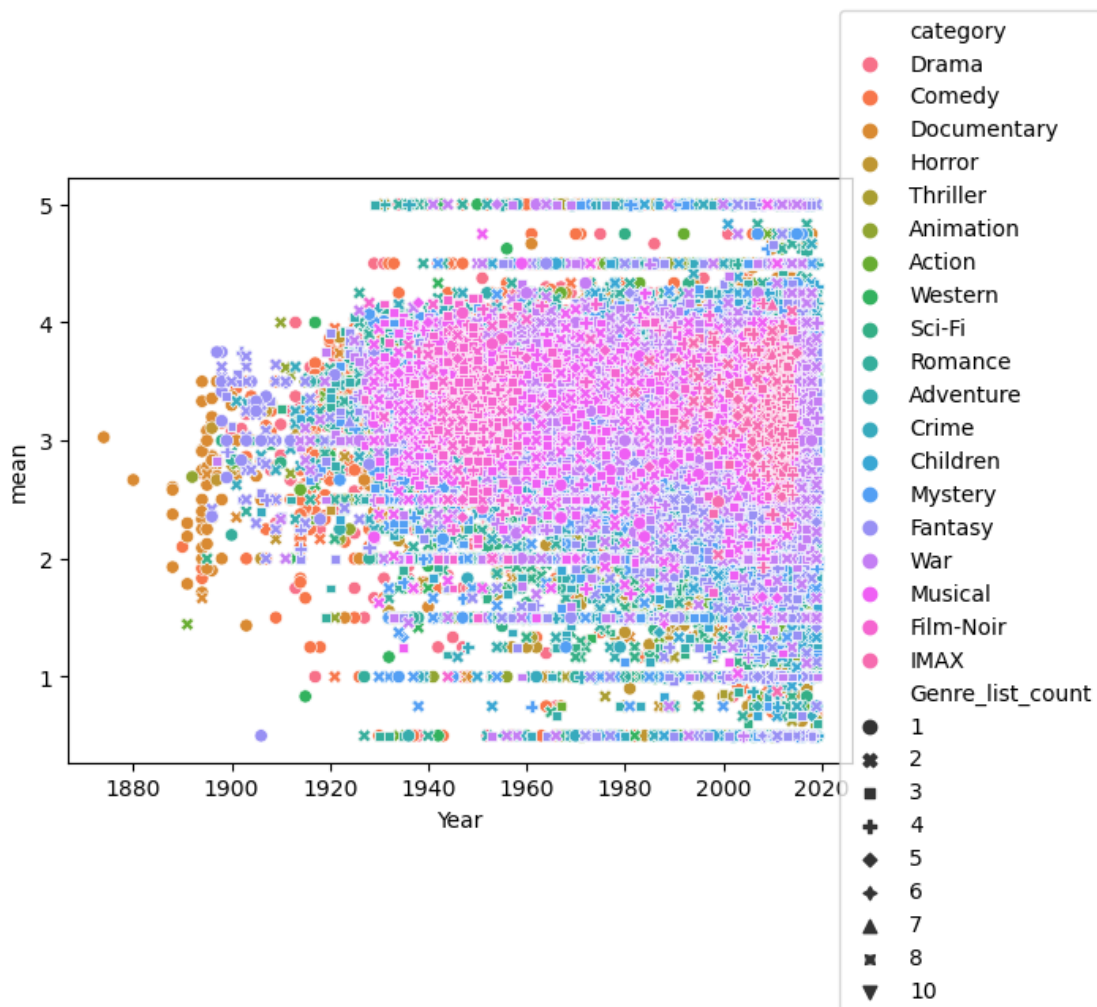
[102166 rows x 15 columns]

3 DATA VISUALIZATION

3.1 Tests

```
[25]: #markers = {'Lunch':'D', 'Dinner':'s'}  
sns.scatterplot(data=Genre_categorization,y='mean', x='Year', hue='category',  
               style='Genre_list_count') #, size='size', markers=markers)  
plt.legend(loc='center', bbox_to_anchor=(1.15,0.43))
```

[25]: <matplotlib.legend.Legend at 0x2420cd2f700>



```
[26]: movies1900_2020 = Genre_categorization[(Genre_categorization['Year'] > 1900) &  
        (Genre_categorization['count'] > 400)].sort_values(by='Year', ascending=True)
```

```
movies1900_2020
```

```
[26]:      movieId      title \
9840      32898  Trip to the Moon, A (Voyage dans la lune, Le) ...
9840      32898  Trip to the Moon, A (Voyage dans la lune, Le) ...
9840      32898  Trip to the Moon, A (Voyage dans la lune, Le) ...
9840      32898  Trip to the Moon, A (Voyage dans la lune, Le) ...
6940       7065      Birth of a Nation, The (1915)
...
52117  201773      Spider-Man: Far from Home (2019)
52071  201646      Midsommar (2019)
52344  202439      Parasite (2019)
50201  196889      Glass (2019)
52071  201646      Midsommar (2019)

      genres \
9840      Action|Adventure|Fantasy|Sci-Fi
9840      Action|Adventure|Fantasy|Sci-Fi
9840      Action|Adventure|Fantasy|Sci-Fi
9840      Action|Adventure|Fantasy|Sci-Fi
6940      Drama|War
...
52117      Action|Adventure|Sci-Fi
52071      Drama|Horror|Mystery
52344      Comedy|Drama
50201  Drama|Horror|Mystery|Sci-Fi|Thriller
52071      Drama|Horror|Mystery

      Genre_list  Genre_list_count  Year \
9840      [Action, Adventure, Fantasy, Sci-Fi]      4  1902
9840      [Action, Adventure, Fantasy, Sci-Fi]      4  1902
9840      [Action, Adventure, Fantasy, Sci-Fi]      4  1902
9840      [Action, Adventure, Fantasy, Sci-Fi]      4  1902
6940      [Drama, War]      2  1915
...
52117      [Action, Adventure, Sci-Fi]      3  2019
52071      [Drama, Horror, Mystery]      3  2019
52344      [Comedy, Drama]      2  2019
50201  [Drama, Horror, Mystery, Sci-Fi, Thriller]      5  2019
52071      [Drama, Horror, Mystery]      3  2019

      count      mean      std  min  25%  50%  75%  max  category
9840      723.0  3.746888  0.939795  0.5  3.0  4.0  4.5  5.0      Action
9840      723.0  3.746888  0.939795  0.5  3.0  4.0  4.5  5.0      Fantasy
9840      723.0  3.746888  0.939795  0.5  3.0  4.0  4.5  5.0  Adventure
9840      723.0  3.746888  0.939795  0.5  3.0  4.0  4.5  5.0      Sci-Fi
6940      420.0  3.105952  1.271155  0.5  2.5  3.5  4.0  5.0      War
```

```

...      ...      ...      ...      ...      ...      ...      ...
52117  1134.0  3.712522  0.897079  0.5  3.0  4.0  4.5  5.0  Adventure
52071   413.0  3.734867  0.996618  0.5  3.5  4.0  4.5  5.0    Horror
52344   496.0  4.209677  0.743583  0.5  4.0  4.5  5.0  5.0    Comedy
50201   588.0  3.268707  0.925269  0.5  3.0  3.5  4.0  5.0    Sci-Fi
52071   413.0  3.734867  0.996618  0.5  3.5  4.0  4.5  5.0    Drama

```

[14440 rows x 15 columns]

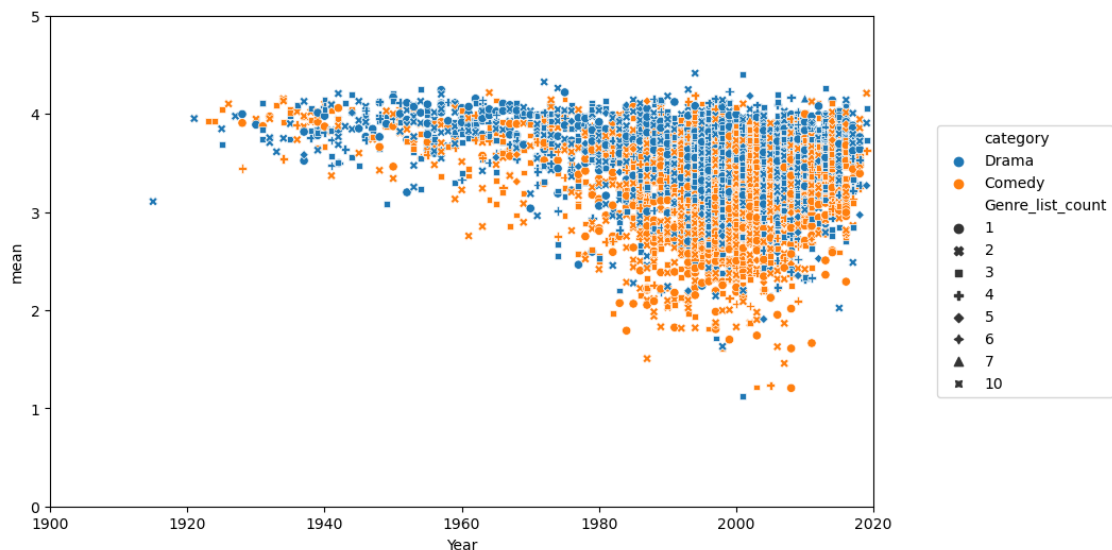
```
[27]: movies1900_2020.Year.isnull().any()
```

[27]: False

```

[28]: new_Data = movies1900_2020[(movies1900_2020.category.str.
    ↳contains('Drama|Comedy', regex=True))]
sns.scatterplot(data=new_Data, y=new_Data['mean'], x=new_Data['Year'],
    ↳hue='category', style='Genre_list_count')
plt.legend(loc='right', bbox_to_anchor=(1.30,0.5))
plt.ylim(0, 5)
plt.xlim(1900, 2020)
plt.gcf().set_size_inches(10, 6)

```



```

[29]: movie60s_70s = movies1900_2020[(movies1900_2020.Year > 1960) & (movies1900_2020.
    ↳Year < 1970)]
movie70s_80s = movies1900_2020[(movies1900_2020.Year > 1970) & (movies1900_2020.
    ↳Year < 1980)]
movie80s_90s = movies1900_2020[(movies1900_2020.Year > 1980) & (movies1900_2020.
    ↳Year < 1990)]

```

```

movie90s_2000s = movies1900_2020[(movies1900_2020.Year > 1990) &
    ↪(movies1900_2020.Year < 2000)]
movies2000_2010 = movies1900_2020[(movies1900_2020.Year > 2000) &
    ↪(movies1900_2020.Year < 2010)]
movies2010_2020 = movies1900_2020[(movies1900_2020.Year > 2010) &
    ↪(movies1900_2020.Year < 2020)]

```

```

[30]: ratigns_vs_year = sns.scatterplot(data=movie60s_70s, y='mean', x='Year',
    ↪hue='category', style='Genre_list_count')
plt.legend(loc='right', bbox_to_anchor=(1.30,0.5))
plt.ylim(0, 5)
plt.gcf().set_size_inches(10, 6)

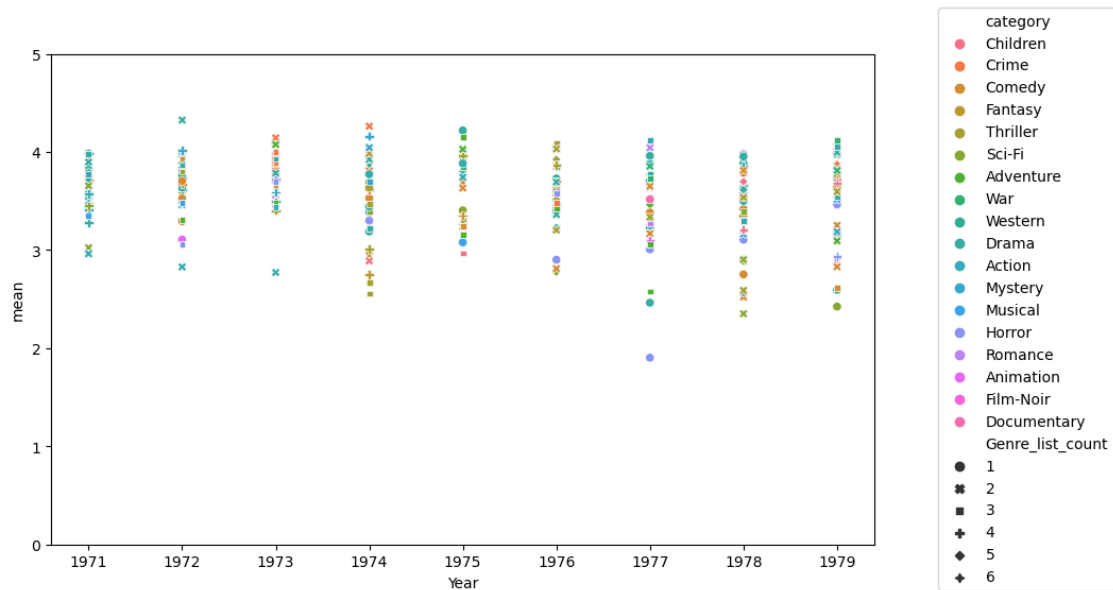
```



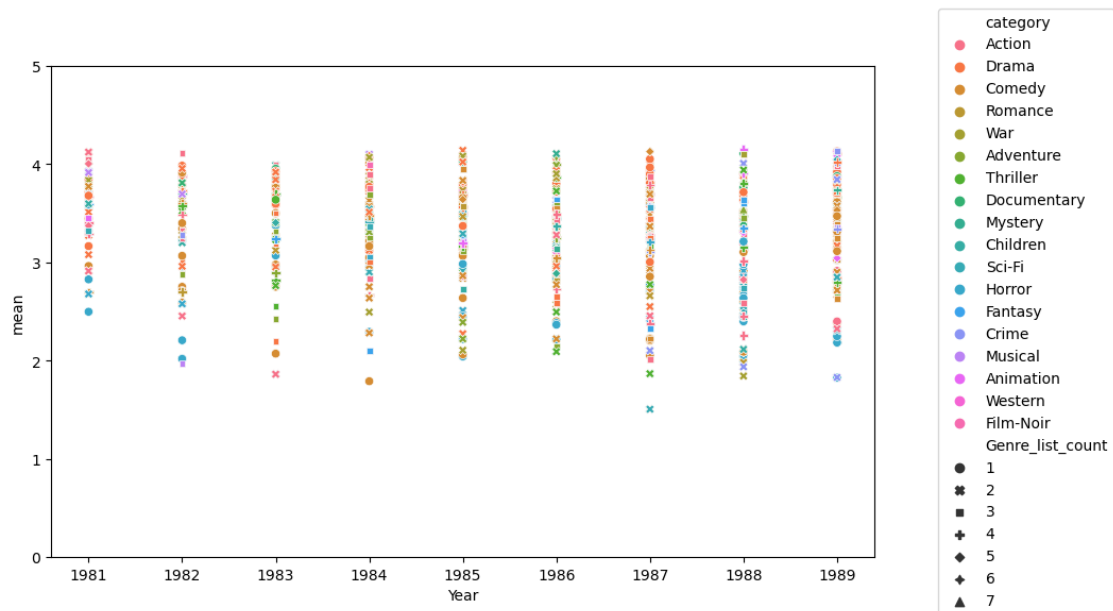
```

[31]: ratigns_vs_year = sns.scatterplot(data=movie70s_80s, y='mean', x='Year',
    ↪hue='category', style='Genre_list_count')
plt.legend(loc='right', bbox_to_anchor=(1.30,0.5))
plt.ylim(0, 5)
plt.gcf().set_size_inches(10, 6)

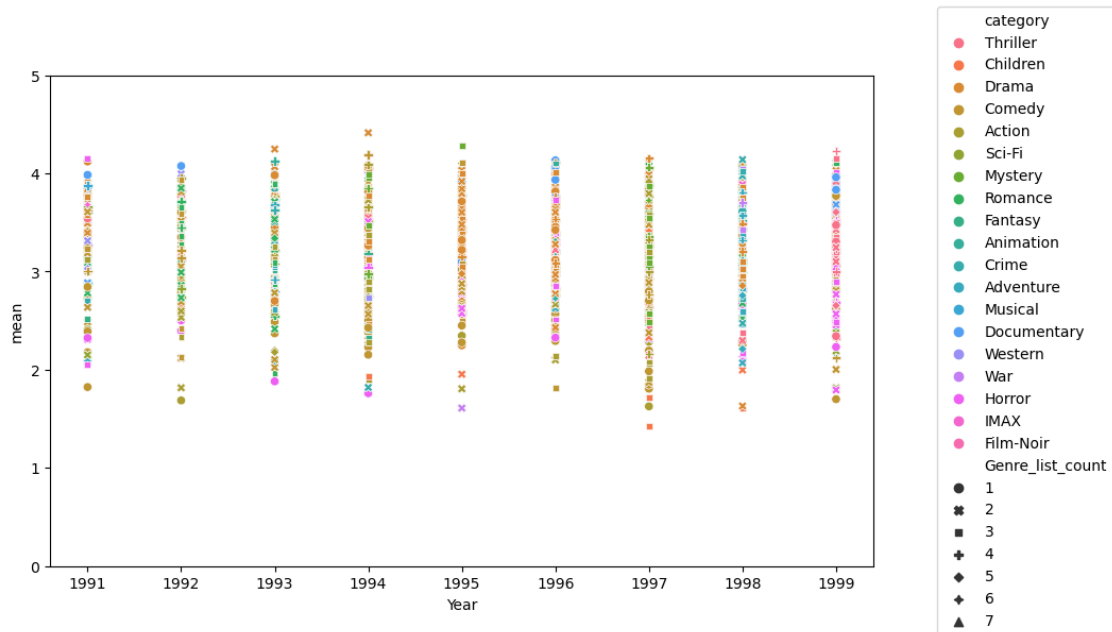
```



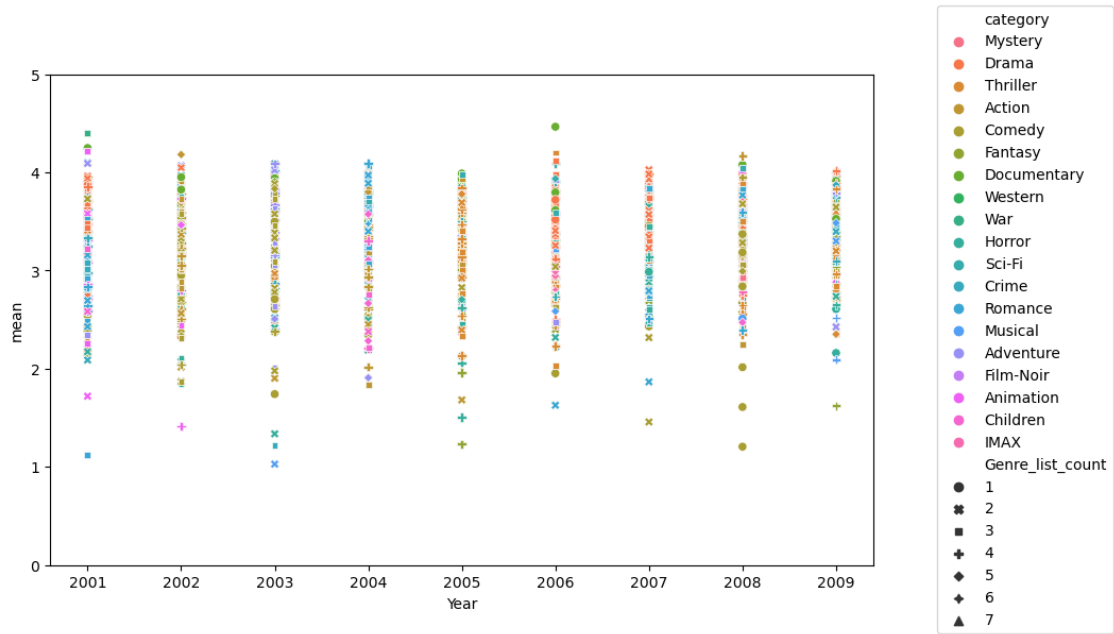
```
[32]: ratigns_vs_year = sns.scatterplot(data=movie80s_90s, y='mean', x='Year',
    ↪ hue='category', style='Genre_list_count')
plt.legend(loc='right', bbox_to_anchor=(1.30,0.5))
plt.ylim(0, 5)
plt.gcf().set_size_inches(10, 6)
```



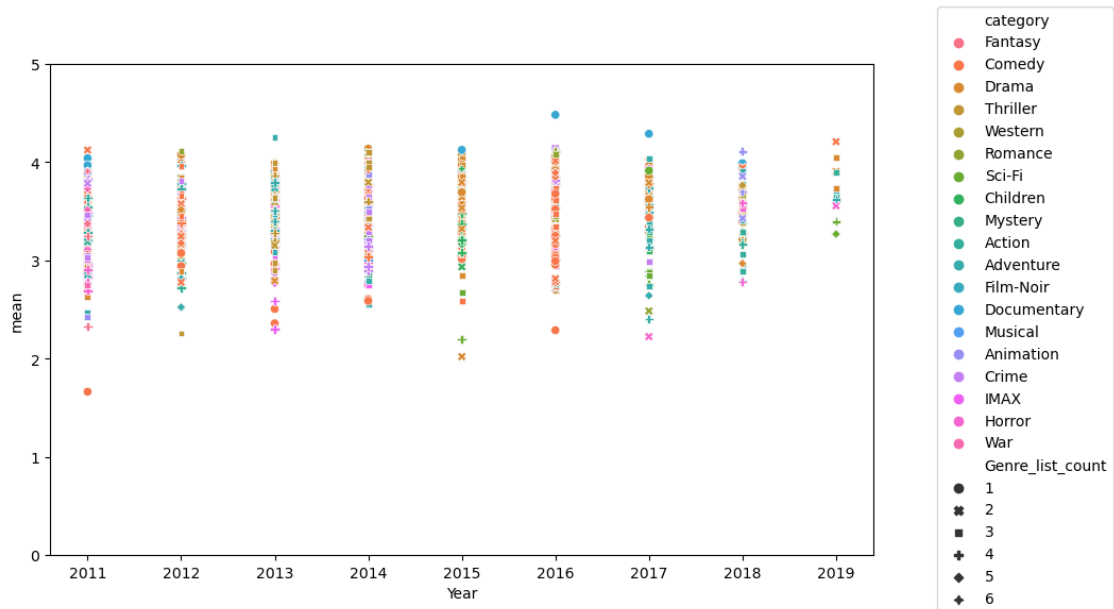
```
[33]: ratings_vs_year = sns.scatterplot(data=movie90s_2000s, y='mean', x='Year',
    ↪ hue='category', style='Genre_list_count')
plt.legend(loc='right', bbox_to_anchor=(1.30,0.5))
plt.ylim(0, 5)
plt.gcf().set_size_inches(10, 6)
```



```
[34]: ratings_vs_year = sns.scatterplot(data=movies2000_2010, y='mean', x='Year',
    ↪ hue='category', style='Genre_list_count')
plt.legend(loc='right', bbox_to_anchor=(1.30,0.5))
plt.ylim(0, 5)
plt.gcf().set_size_inches(10, 6)
```



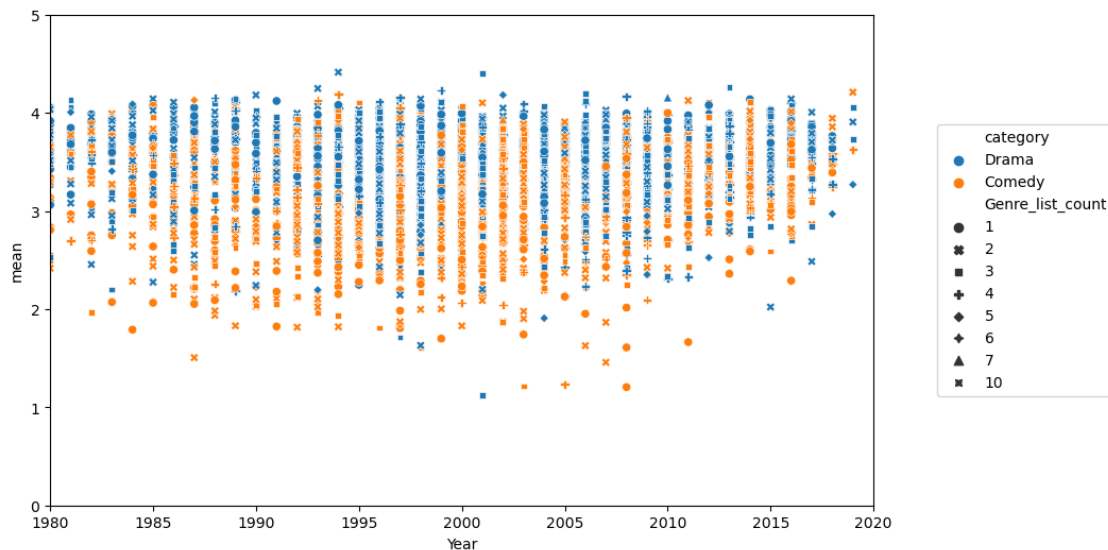
```
[35]: ratings_vs_year = sns.scatterplot(data=movies2010_2020, y='mean', x='Year',
    hue='category', style='Genre_list_count')
plt.legend(loc='right', bbox_to_anchor=(1.30,0.5))
plt.ylim(0, 5)
plt.gcf().set_size_inches(10, 6)
```



```
[36]: wr = movies1900_2020[(movies1900_2020.category.str.contains('(Drama)|(Comedy)',
↪regex=True))]
ratigns_vs_year = sns.scatterplot(data= wr, y='mean', x='Year', hue='category',
↪style='Genre_list_count')
#ratigns_vs_year.set_xticklabels(wr.Year,rotation=90)
plt.legend(loc='right', bbox_to_anchor=(1.30,0.5))
plt.ylim(0, 5)
plt.xlim(1980, 2020)
plt.gcf().set_size_inches(10, 6)
```

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\83050857.py:1: UserWarning:
This pattern is interpreted as a regular expression, and has match groups. To
actually get the groups, use str.extract.

```
wr =
movies1900_2020[(movies1900_2020.category.str.contains('(Drama)|(Comedy)',
regex=True))]
```



3.2 COMEDY VS DRAMA

```
[37]: # The size of each Genre
df_sizeOf_movies_per_genre = pd.DataFrame.from_dict(sizeOf_movies_per_genre,
↪orient='index').sort_values(by = 0, ascending= False).reset_index()
df_sizeOf_movies_per_genre.rename(columns={'index': "Genre", 0: "Size"})
```

```
[37]:      Genre      Size
0      Drama  366345
1      Comedy  240420
2      Thriller 124635
```


3	Romance	109425
4	Action	103545
5	Horror	85920
6	Documentary	81240
7	Crime	75285
8	Adventure	57900
9	Sci-Fi	52350
10	Animation	43635
11	Children	42930
12	Mystery	41670
13	Fantasy	39900
14	War	26550
15	Western	17340
16	Musical	15240
17	Film-Noir	5235
18	IMAX	2925

```
[38]: # Average annual ratings for each genre
dfDrama_comedy = movies1900_2020[movies1900_2020.category.str.
    ↳contains('Drama|Comedy', regex=True)]
gb = dfDrama_comedy[['category', 'Year', 'mean']].groupby(['category', 'Year']).
    ↳mean() #/Thriller/Romance/Action/Mystery
gb
```

```
[38]:
```

		mean
category	Year	
Comedy	1921	3.951719
	1923	3.922566
	1924	3.922689
	1925	4.045802
	1926	4.101534
...	...	
Drama	2015	3.534172
	2016	3.606468
	2017	3.561372
	2018	3.578684
	2019	3.834026

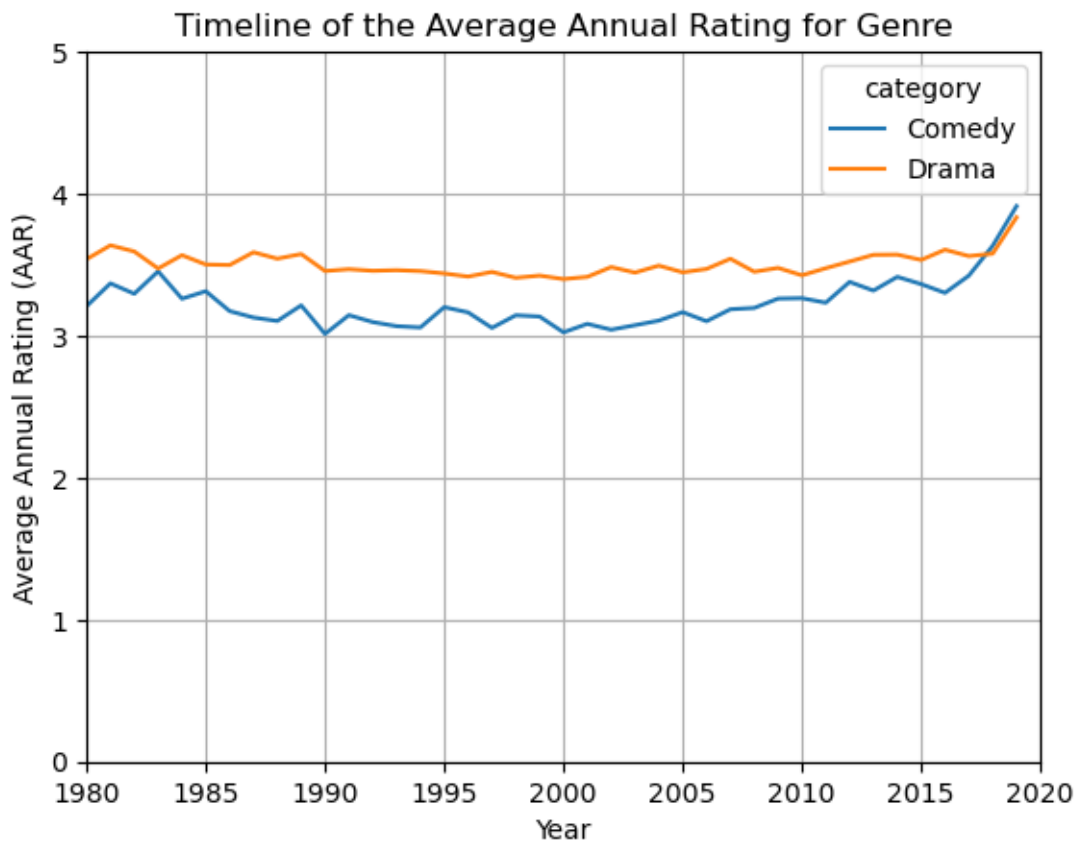
[189 rows x 1 columns]

```
[39]: sns.lineplot(data=gb ,x='Year', y='mean', hue='category')

plt.title('Timeline of the Average Annual Rating for Genre')
plt.ylabel('Average Annual Rating (AAR)')
plt.xlabel('Year')

plt.ylim(0, 5)
```

```
plt.xlim(1980, 2020)
plt.grid(True)
```



```
[40]: rt = movies1900_2020[(movies1900_2020.category.str.contains('Drama|Comedy')) &
    ↪(movies1900_2020.Year > 2010)]
rt.rename(columns={'category':'Category'}, inplace=True)
sns.violinplot(data=rt ,x=rt['Year'], y=rt['mean'], hue='Category', dodge=True,
    ↪split=True)

plt.title('Distribution of Average Annual Rating for Each Genre')
plt.ylabel('Average Annual Rating (AAR)')
plt.xlabel('Year')

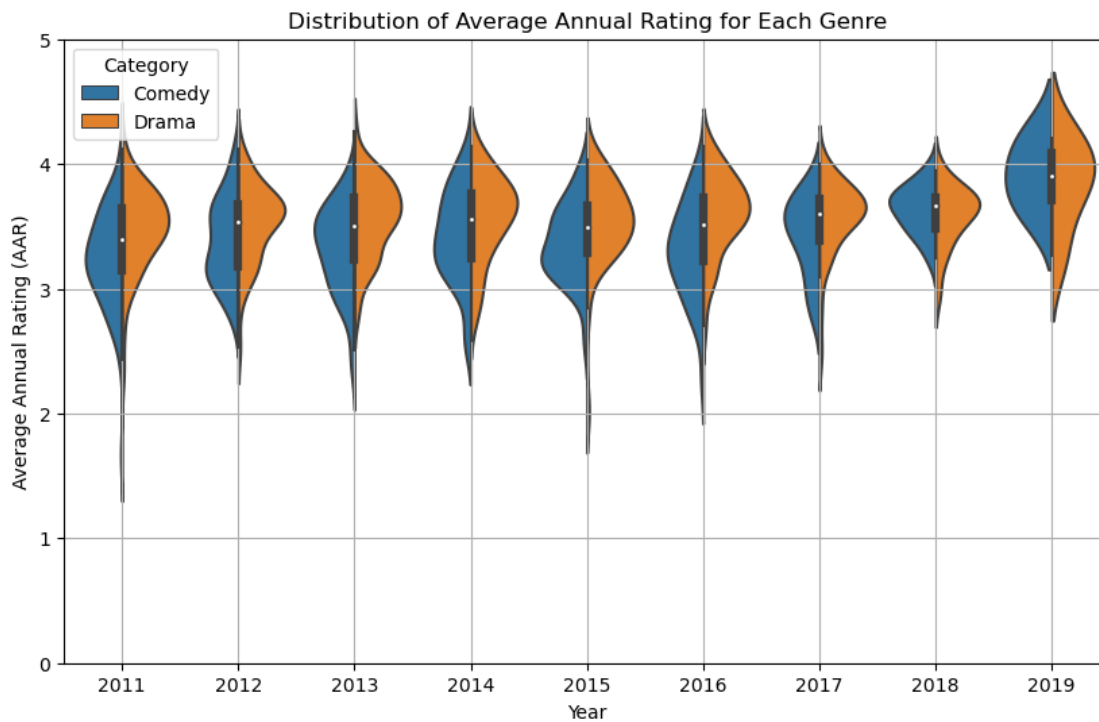
plt.grid(True)
plt.ylim(0, 5)
plt.gcf().set_size_inches(10, 6)
plt.show()
```

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\3176037671.py:2:
SettingWithCopyWarning:

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

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

```
rt.rename(columns={'category':'Category'}, inplace=True)
```



```
[41]: rt2 = movies1900_2020[(movies1900_2020.category.str.contains('Drama|Comedy')) &
    ↳ (movies1900_2020.Year > 2014) & (movies1900_2020.Genre_list_count < 5)]
rt2.rename(columns={"mean": "Average Annual Rating (AAR)", "Genre_list_count":
    ↳ "Number of Genres Per Category", 'category':'Category'}, inplace=True)

sns.catplot(data=rt2 ,x='Year', y='Average Annual Rating (AAR)',
    ↳ hue='Category', col='Number of Genres Per Category',kind="violin",split=True,
    ↳ col_wrap=2).fig.suptitle('Distribution of Average Annual Rating
    ↳ According to the last years',
                                y=1.02)

plt.yticks(np.arange(0, 5.5, step=0.5))
plt.ylabel('Average Annual Rating')
plt.xlabel('Year')
```

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1401646764.py:2:

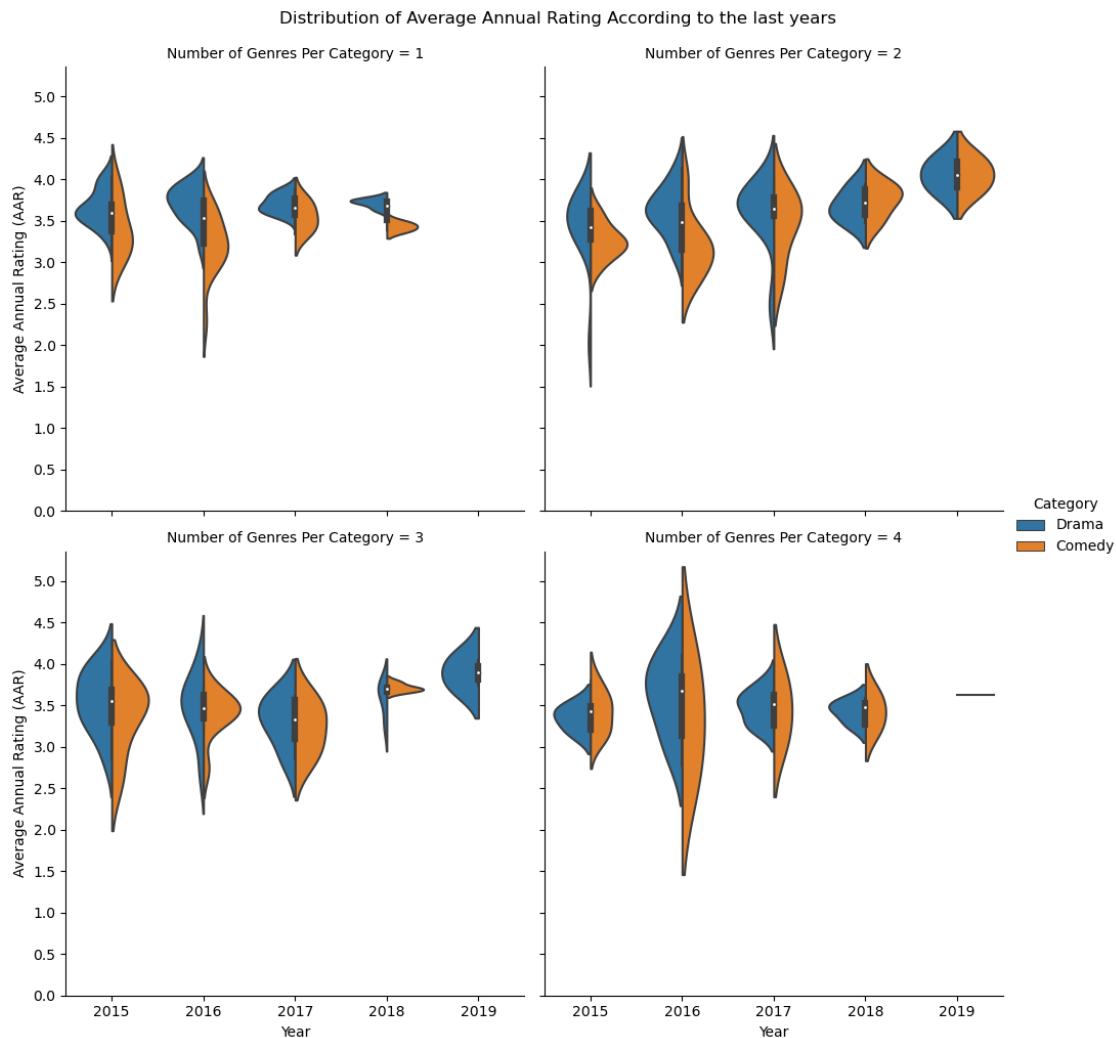
SettingWithCopyWarning:

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

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

```
rt2.rename(columns={"mean": "Average Annual Rating (AAR)", "Genre_list_count":  
"Number of Genres Per Category", 'category': 'Category'}, inplace=True)
```

```
[41]: Text(0.5, 28.999999999999986, 'Year')
```



```
[42]: rt2 = movies1900_2020[(movies1900_2020.category.str.contains('Drama|Comedy')) &
    ↪(movies1900_2020.Year > 2014) & (movies1900_2020.Genre_list_count < 5)]
rt2.rename(columns={"mean": "Average Annual Rating (AAR)", "Genre_list_count":
    ↪"Number of Genres Per Category", 'category': 'Category'}, inplace=True)
```

```

sns.catplot(data=rt2 ,x='Year', y='Average Annual Rating (AAR)',
    hue='Category', col='Number of Genres Per Category',kind="box",
    col_wrap=2,sharey=True, sharex=False,
    margin_titles=False).fig.suptitle('Distribution of Average Annual
    Rating According to the last years',
    y=1.02)
plt.yticks(np.arange(0, 5.5, step=0.5))

```

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\976092545.py:2:

SettingWithCopyWarning:

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

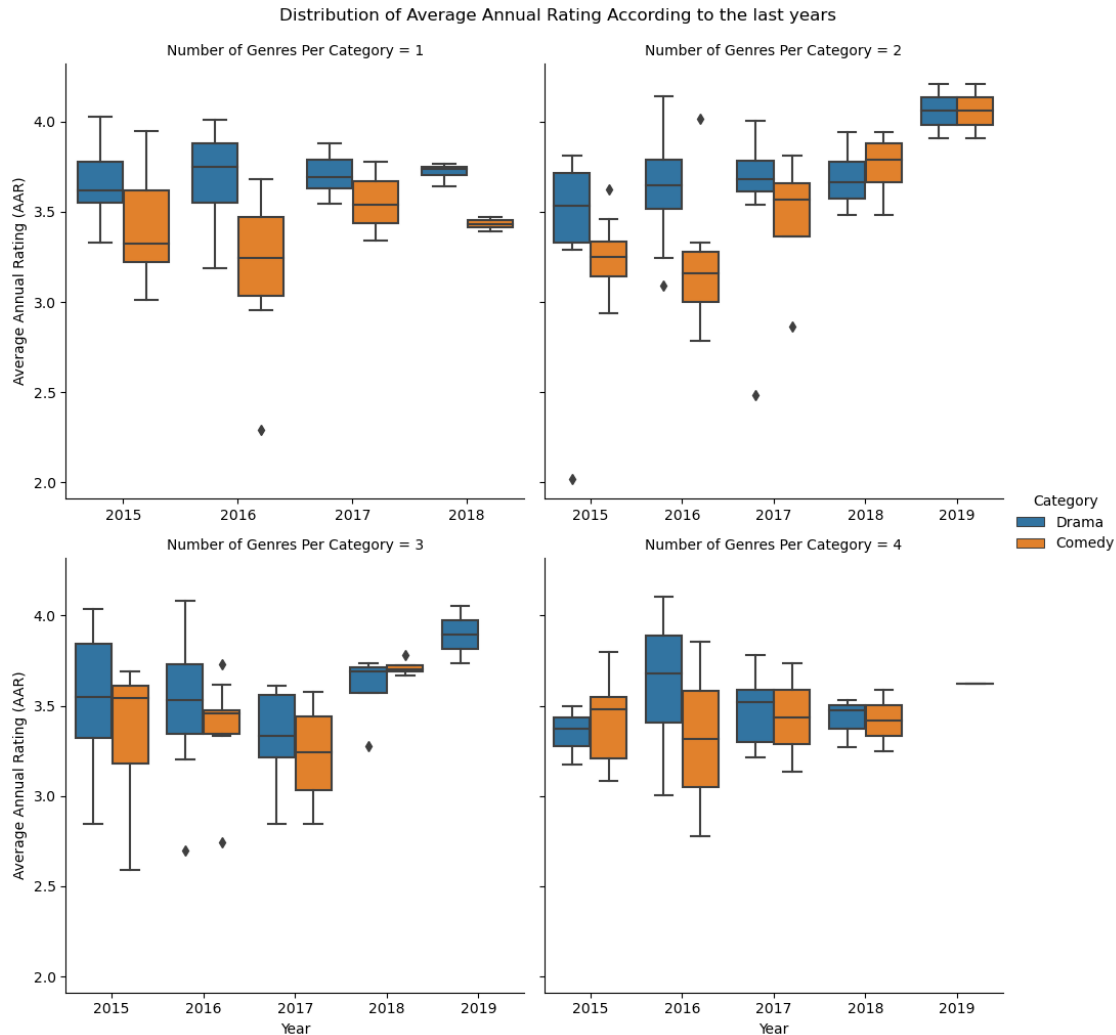
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

```

rt2.rename(columns={"mean": "Average Annual Rating (AAR)", "Genre_list_count":
"Number of Genres Per Category", 'category':'Category'}, inplace=True)

```

[42]: Text(0.5, 1.02, 'Distribution of Average Annual Rating According to the last years')



```
[43]: rt3 = movies1900_2020[(movies1900_2020.category.str.contains('Drama|Comedy')) &
    ↪(movies1900_2020.Year > 1900)]
x = rt3[['Year', 'count', 'mean', 'category']]

count_comedy = x[(x.category.str.contains('Comedy')) & (x.Year > 2010)].count()
print(f'The number of movies is {count_comedy[0]}')
x[(x.category == 'Comedy') & (x.Year > 2010)].corr()
```

The number of movies is 276

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\2254048448.py:6:
FutureWarning: The default value of numeric_only in DataFrame.corr is deprecated. In a future version, it will default to False. Select only valid columns or specify the value of numeric_only to silence this warning.
x[(x.category == 'Comedy') & (x.Year > 2010)].corr()

```
[43]:
```

	count	mean
count	1.000000	0.390094
mean	0.390094	1.000000

```
[44]: count_drama = x[(x.category == 'Drama') & (x.Year > 2010)].count()
print(f' The number of movies is {count_drama[0]}')
x[(x.category == 'Drama') & (x.Year > 2010)].corr()
```

The number of movies is 357

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\1085182608.py:3:
FutureWarning: The default value of numeric_only in DataFrame.corr is deprecated. In a future version, it will default to False. Select only valid columns or specify the value of numeric_only to silence this warning.
x[(x.category == 'Drama') & (x.Year > 2010)].corr()

```
[44]:
```

	count	mean
count	1.000000	0.348325
mean	0.348325	1.000000

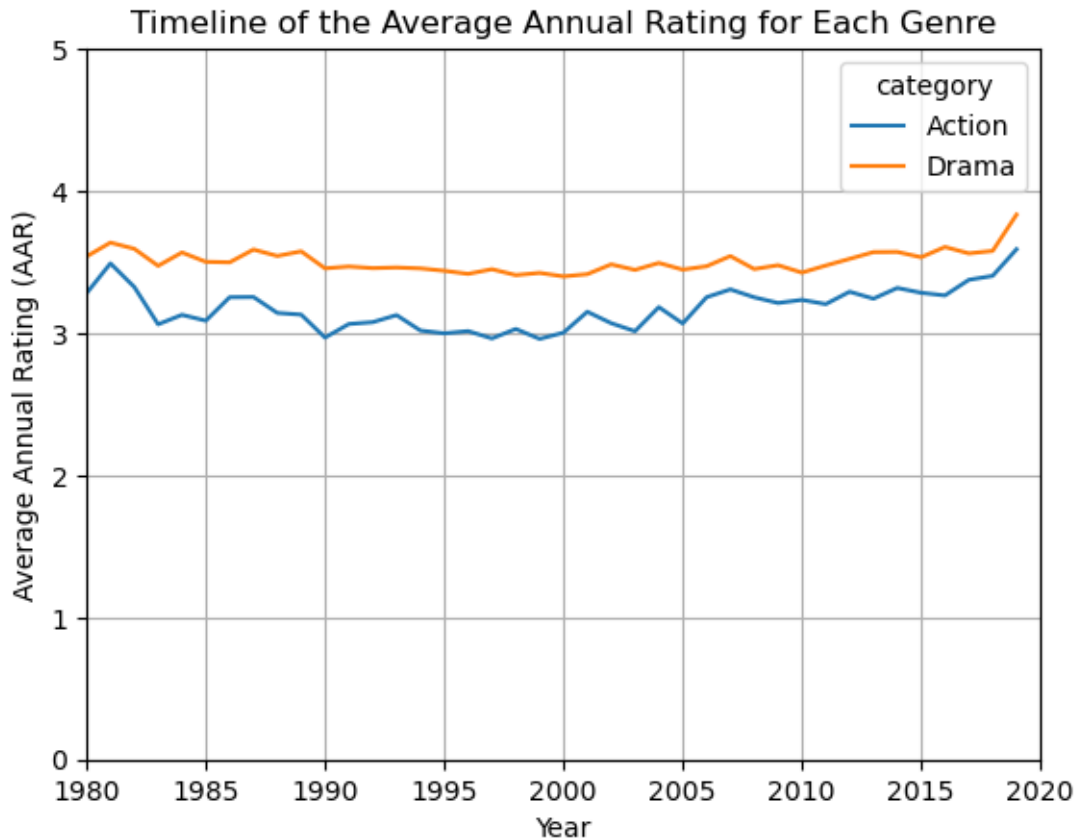
3.3 2nd Question

```
[45]: dfDrama_comedy = movies1900_2020[movies1900_2020.category.str.
    ↳contains('Drama|Action', regex=True)]
gb = dfDrama_comedy[['category', 'Year', 'mean']].groupby(['category', 'Year']).
    ↳mean() #/Thriller/Romance/Action/Mystery
gb

sns.lineplot(data=gb, x='Year', y='mean', hue='category')
#plt.legend(loc='right', bbox_to_anchor=(1.40, 0.5))

plt.title('Timeline of the Average Annual Rating for Each Genre')
plt.ylabel('Average Annual Rating (AAR)')
plt.xlabel('Year')

plt.ylim(0, 5)
plt.xlim(1980, 2020)
plt.grid(True)
```



```
[46]: rt4 = movies1900_2020[(movies1900_2020.category.str.contains('Drama|Action')) &
    ↳ (movies1900_2020.Year > 2014) & (movies1900_2020.Genre_list_count < 5)]
rt4.rename(columns={"mean": "Average Annual Rating (AAR)", "Genre_list_count":
    ↳ "Number of Genres Per Category", 'category': 'Category'}, inplace=True)

sns.catplot(data=rt4 ,x='Year', y='Average Annual Rating (AAR)',
    ↳ hue='Category', col='Number of Genres Per Category',kind="box",
    ↳ col_wrap=2,sharey=True, sharex=False,
    ↳ margin_titles=False).fig.suptitle('Distribution of Average Annual
    ↳ Rating According to the Last Years',
    y=1.02)

#plt.yticks(np.arange(0, 5.5, step=0.5))
```

C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\2901116101.py:2:

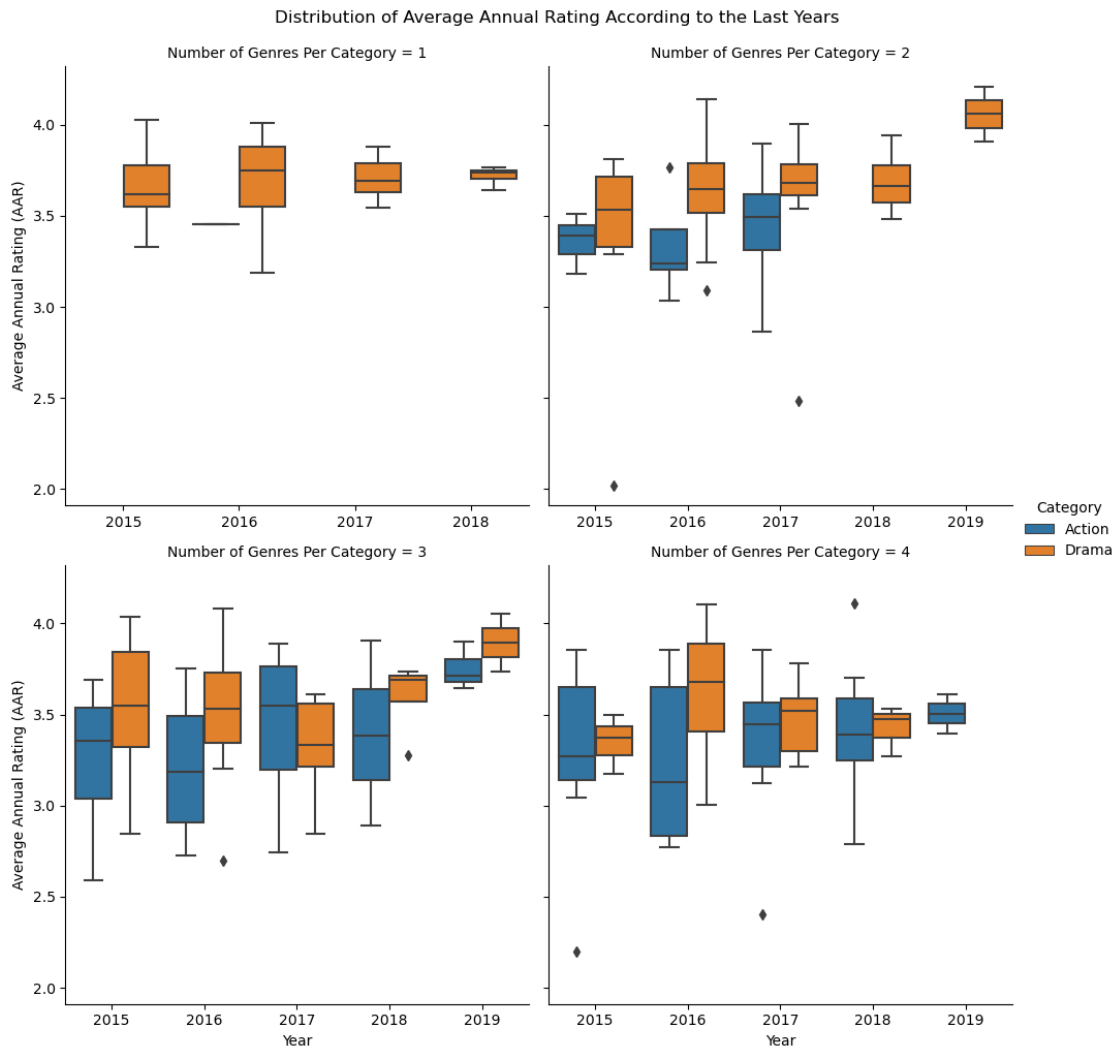
SettingWithCopyWarning:

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

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy


```
rt4.rename(columns={"mean": "Average Annual Rating (AAR)", "Genre_list_count":
"Number of Genres Per Category", 'category': 'Category'}, inplace=True)
```

[46]: Text(0.5, 1.02, 'Distribution of Average Annual Rating According to the Last Years')



```
[47]: rt5 = movies1900_2020[(movies1900_2020.category.str.contains('Drama|Comedy')) &
↳ (movies1900_2020.Year > 1900)]
x = rt3[['Year', 'count', 'mean', 'category']]

count_comedy = x[(x.category.str.contains('Action')) & (x.Year > 2010)].count()
print(f'The number of movies is {count_comedy[0]}')
x[(x.category == 'Comedy') & (x.Year > 2010)].corr()
```

The number of movies is 0

```
C:\Users\Tole 01\AppData\Local\Temp\ipykernel_23692\2206678727.py:6:
FutureWarning: The default value of numeric_only in DataFrame.corr is
deprecated. In a future version, it will default to False. Select only valid
columns or specify the value of numeric_only to silence this warning.
  x[(x.category == 'Comedy') & (x.Year > 2010)].corr()
```

```
[47]:
```

	count	mean
count	1.000000	0.390094
mean	0.390094	1.000000

```
[ ]:
```