#### **Goodreads Spoilers**

These datasets contain reviews from the Goodreads book review website, along with annotated "spoiler" information from each review. This dataset contains more than 1.3M book reviews about 25,475 books and 18,892 users.

```
In [28]: import pandas as pd
import json
import matplotlib.pyplot as plt
```

--> Fetching the JSON file & reading its data line-by-line and appending it into json\_list & finally sending it into a dataframe which in turn stores all data inside "df"

#### In [30]: df.head(100)

#### Out[30]:

	user_id	timestamp	review_sentences	rating	has_spoiler	bo
0	8842281e1d1347389f2ab93d60773d4d	2017-08- 30	[[0, This is a special book.], [0, It started	5	True	1824
1	8842281e1d1347389f2ab93d60773d4d	2017-03- 22	[[0, Recommended by Don Katz.], [0, Avail for	3	False	-
2	8842281e1d1347389f2ab93d60773d4d	2017-03- 20	[[0, A fun, fast paced science fiction thrille	3	True	286{
3	8842281e1d1347389f2ab93d60773d4d	2016-11- 09	[[0, Recommended reading to understand what is	0	False	2716
4	8842281e1d1347389f2ab93d60773d4d	2016-04- 25	[[0, I really enjoyed this book, and there is	4	True	2588
		•••			•••	
95	01ec1a320ffded6b2dd47833f2c8e4fb	2017-07- 23	[[0, 3.5 - 4 stars], [0, Beautiful and poignan	4	False	3527
96	01ec1a320ffded6b2dd47833f2c8e4fb	2017-09- 15	[[0, 4.5 - 5 Stars!], [0, "When life happened,	5	False	353₄
97	01ec1a320ffded6b2dd47833f2c8e4fb	2017-07- 01	[[0, 4.5 Captivating Stars!!], [0, "When truth	5	False	320
98	01ec1a320ffded6b2dd47833f2c8e4fb	2017-05- 30	[[0, Such a sweet and sexy story!], [0, Highly	4	False	3432
99	01ec1a320ffded6b2dd47833f2c8e4fb	2017-08- 13	[[0, "Now I know how much there is to be afrai	4	False	3477

100 rows × 7 columns

```
In [31]: df['review_sentences']
Out[31]: 0
                     [[0, This is a special book.], [0, It started ...
                     [[0, Recommended by Don Katz.], [0, Avail for ...
         2
                     [[0, A fun, fast paced science fiction thrille...
         3
                     [[0, Recommended reading to understand what is...
         4
                     [[0, I really enjoyed this book, and there is ...
                     [[0, Can't wait for Travis' POV], [0, Travis B...
         1378028
                     [[0, Had this on my to-read shelf forever.], [...
         1378029
                     [[0, The last book left me wanting for more.],...
         1378030
         1378031
                     [[0, Things are heating up in the second novel...
                     [[0, Before I even start this review, I must s...
         1378032
         Name: review_sentences, Length: 1378033, dtype: object
```

--> Removing 0 from review sentences & seperating two review sentences

```
In [32]: | df['first_sentence'] = df['review_sentences'].apply(lambda x: x[0] if
         df['second sentence'] = df['review sentences'].apply(lambda x: x[1] if
         df.drop('review_sentences', axis=1, inplace=True)
         print(df.head())
                                      user_id
                                                timestamp
                                                                    has_spoiler
                                                            rating
                                                                 5
            8842281e1d1347389f2ab93d60773d4d
                                               2017-08-30
                                                                           True
            8842281e1d1347389f2ab93d60773d4d
                                                2017-03-22
                                                                 3
                                                                           False
                                                                 3
            8842281e1d1347389f2ab93d60773d4d
                                                2017-03-20
                                                                           True
            8842281e1d1347389f2ab93d60773d4d
                                               2016-11-09
                                                                 0
                                                                           False
            8842281e1d1347389f2ab93d60773d4d
                                               2016-04-25
                                                                           True
             book id
                                               review id
            18245960
         0
                       dfdbb7b0eb5a7e4c26d59a937e2e5feb
         1
               16981
                       a5d2c3628987712d0e05c4f90798eb67
                       2ede853b14dc4583f96cf5d120af636f
            28684704
                       ced5675e55cd9d38a524743f5c40996e
            27161156
            25884323
                       332732725863131279a8e345b63ac33e
                                                 first_sentence \
                                  [0, This is a special book.]
         0
                                 [0, Recommended by Don Katz.]
         1
             [0, A fun, fast paced science fiction thriller.]
             [0, Recommended reading to understand what is ...
             [0, I really enjoyed this book, and there is a...
                                                second_sentence
             [0, It started slow for about the first third,...
             [0, Avail for free in December: http://www.aud...
         (http://www.aud...)
             [0, I read it in 2 nights and couldn't put it ...
         3
                 [0, http://www.npr.org/2016/11/09/5013826...]
         (http://www.npr.org/2016/11/09/5013826...])
            [0, It did drag on a little at the end so I kn...
         --> Removing Unnecessary columns timestamp & review id
In [33]: | df.drop(['review_id'], axis=1, inplace=True)
```

In [34]: df.head()

Out [34]:

	user_id	timestamp	rating	has_spoiler	book_id	first_sentence
0	8842281e1d1347389f2ab93d60773d4d	2017-08- 30	5	True	18245960	[0, This is a special book.
1	8842281e1d1347389f2ab93d60773d4d	2017-03- 22	3	False	16981	[0 Recommended by Don Katz.
2	8842281e1d1347389f2ab93d60773d4d	2017-03- 20	3	True	28684704	[0, A fun, fas paced science fiction thriller.
3	8842281e1d1347389f2ab93d60773d4d	2016-11- 09	0	False	27161156	[0 Recommended reading to understand what is
4	8842281e1d1347389f2ab93d60773d4d	2016-04- 25	4	True	25884323	[0, I really enjoyed this book, and there is a

#### --> dropping book\_id

In [35]: df.drop('book\_id', axis=1, inplace=True)

In [36]: df.head()

Out[36]:

	user_id	timestamp	rating	has_spoiler	first_sentence	
0	8842281e1d1347389f2ab93d60773d4d	2017-08- 30	5	True	[0, This is a special book.]	[0, It star
1	8842281e1d1347389f2ab93d60773d4d	2017-03- 22	3	False	[0, Recommended by Don Katz.]	
2	8842281e1d1347389f2ab93d60773d4d	2017-03- 20	3	True	[0, A fun, fast paced science fiction thriller.]	[0, I rea
3	8842281e1d1347389f2ab93d60773d4d	2016-11- 09	0	False	[0, Recommended reading to understand what is	http://ww
4	8842281e1d1347389f2ab93d60773d4d	2016-04- 25	4	True	[0, I really enjoyed this book, and there is a	[0, It

#### --> Setting has\_spoiler from "True" & "False" to 0 or 1

In [37]: df['has\_spoiler'] = df['has\_spoiler'].map({True: 1, False: 0})

#### In [38]: | df.head()

#### Out[38]:

	user_id	timestamp	rating	has_spoiler	first_sentence	
0	8842281e1d1347389f2ab93d60773d4d	2017-08- 30	5	1	[0, This is a special book.]	[0, It start
1	8842281e1d1347389f2ab93d60773d4d	2017-03- 22	3	0	[0, Recommended by Don Katz.]	
2	8842281e1d1347389f2ab93d60773d4d	2017-03- 20	3	1	[0, A fun, fast paced science fiction thriller.]	[0, I rea
3	8842281e1d1347389f2ab93d60773d4d	2016-11- 09	0	0	[0, Recommended reading to understand what is	http://ww
4	8842281e1d1347389f2ab93d60773d4d	2016-04- 25	4	1	[0, I really enjoyed this book, and there is a	[0, It

### --> Counting the number of users who gave spoilers in the review & who didn't gave spoilers in the review

In [39]: print("Users who gave No Spoiler in their Reviews", df[df['has\_spoiler
 print("Users who gave Spoiler in their Reviews", df[df['has\_spoiler']=

print("Users who	<pre>print("Users who gave Spoiler in their Reviews", df[df['has_spoiler']=</pre>						
timestamp rating has_spoiler first_sentence second_sentence	Spoiler in their Reviews user_id 1288406 1288406 1288406 1288406 1178249	1288406					
<pre>dtype: int64 Users who gave Sp timestamp rating has_spoiler first_sentence second_sentence dtype: int64</pre>	oiler in their Reviews user_id 89627 89627 89627 89627 89364	89627					

#### -- Total User Count is 1378033

- -- Total number of users who didn't gave spoilers are 1288406,
- -- Users who gave spoilers are 89627,

```
In [40]: | df.count()
Out[40]: user id
                             1378033
         timestamp
                             1378033
         rating
                             1378033
         has spoiler
                             1378033
         first sentence
                             1378033
         second sentence
                             1267613
         dtype: int64
In [41]: df.shape
Out[41]: (1378033, 6)
In [42]: print(f"Total number of users: {len(set(df['user_id']))}")
         Total number of users: 18892
```

--> Counting Number of users who have given a rating, Number of users who have given spoilers, Number of users who have not given spoilers & Number of users who left no reviews at all

```
In [43]: num_users_with_rating = len(set(df['user_id']))
    print(f"Number of users who have given a rating: {num_users_with_ratin

    num_users_with_spoilers = len(set(df[df['has_spoiler'] == 1]['user_id'
    num_users_without_spoilers = num_users_with_rating - num_users_with_sp
    print(f"Number of users who have given spoilers: {num_users_with_spoil
        print(f"Number of users who have not given spoilers: {num_users_withou
        num_users_with_no_reviews = len(set(df['user_id'])) - len(set(df.dropr
        print(f"Number of users who left no reviews at all: {num_users_with_no_reviews_with_no_reviews_at_all: {num_users_with_no_reviews_at_all: {num_users_wit
```

```
Number of users who have given a rating: 18892
Number of users who have given spoilers: 16040
Number of users who have not given spoilers: 2852
Number of users who left no reviews at all: 0
```

```
In [44]: | df['timestamp']
Out[44]: 0
                     2017-08-30
         1
                     2017-03-22
         2
                     2017-03-20
          3
                     2016-11-09
         4
                     2016-04-25
                         . . .
         1378028
                     2013-04-16
                     2012-12-28
         1378029
         1378030
                     2013-03-25
         1378031
                     2013-01-24
         1378032
                     2012-12-29
         Name: timestamp, Length: 1378033, dtype: object
```

#### --> Converting Timestamp to monthly & Yearly

```
In [45]: df['timestamp'] = pd.to_datetime(df['timestamp'])

# Create new 'yearly' column
df['yearly'] = df['timestamp'].dt.year

# Create new 'monthly' column
df['monthly'] = df['timestamp'].dt.to_period('M')
```

#### In [46]: print(df)

```
user id
                                             timestamp
                                                        rating
                                                                has_spo
iler
0
         8842281e1d1347389f2ab93d60773d4d 2017-08-30
                                                             5
1
1
         8842281e1d1347389f2ab93d60773d4d 2017-03-22
                                                             3
0
2
         8842281e1d1347389f2ab93d60773d4d 2017-03-20
                                                             3
1
3
         8842281e1d1347389f2ab93d60773d4d 2016-11-09
                                                             0
0
         8842281e1d1347389f2ab93d60773d4d 2016-04-25
4
                                                             4
1
. . .
         35cef391b171b4fca45771e508028212 2013-04-16
1378028
                                                             0
1378029
         35cef391b171b4fca45771e508028212 2012-12-28
                                                             0
         35cef391b171b4fca45771e508028212 2013-03-25
1378030
```

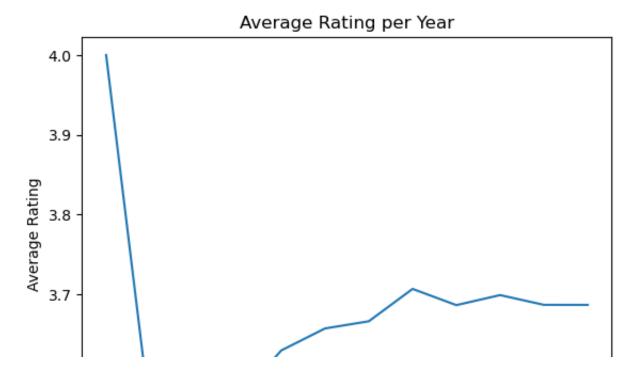
```
1378031
         35cef391b171b4fca45771e508028212 2013-01-24
                                                             4
         35cef391b171b4fca45771e508028212 2012-12-29
                                                             5
1378032
                                             first sentence \
0
                               [0, This is a special book.]
1
                              [0, Recommended by Don Katz.]
2
          [0, A fun, fast paced science fiction thriller.]
3
         [0, Recommended reading to understand what is ...
         [0, I really enjoyed this book, and there is a...
                            [0, Can't wait for Travis' POV]
1378028
1378029
                 [0. Had this on my to-read shelf forever.]
              [0, The last book left me wanting for more.]
1378030
         [0, Things are heating up in the second novel ...
1378031
         [0, Before I even start this review, I must sa...
1378032
                                            second_sentence yearly
onthly
         [0, It started slow for about the first third,...
                                                                2017
                                                                      2
017-08
         [0, Avail for free in December: http://www.aud...
(http://www.aud...)
                       2017
                              2017-03
         [0, I read it in 2 nights and couldn't put it ...
                                                                2017
017-03
             [0, http://www.npr.org/2016/11/09/5013826...]
(http://www.npr.org/2016/11/09/5013826...])
                                                2016 2016-11
         [0, It did drag on a little at the end so I kn...
                                                                     2
                                                                2016
016 - 04
                                 [0, Travis Before Abby...]
1378028
                                                                      2
                                                                2013
013-04
                       [0, Will update once I've finished.]
                                                                      2
1378029
                                                                2012
012 - 12
1378030
         [0, I need a happy ending on this one; my poor...
                                                                2013
013-03
1378031
         [0, Will is beginning to realize that a life w...
                                                                2013
013-01
1378032
         [0, Its heart wrenching in a way that makes yo...
                                                                2012
                                                                      2
012-12
```

[1378033 rows x 8 columns]

## --> Plotting a graph to find out Average Reting per year

```
In [47]: grouped_df = df.groupby('yearly').mean().reset_index()

# Plot line graph
plt.plot(grouped_df['yearly'], grouped_df['rating'])
plt.xlabel('Year')
plt.ylabel('Average Rating')
plt.title('Average Rating per Year')
plt.show()
```

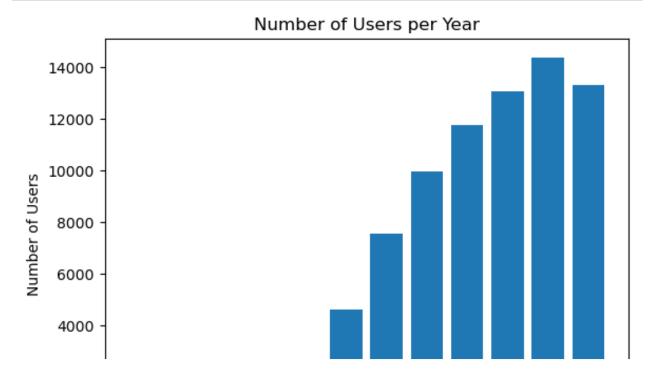


--> Result : We can See that the Average Rating has decreased drastically for the Goodread During Year 2006 to 2016. Average Rating can be said to be around = 3.5\*

# --> Plotting the graph for the number of users according to the year to find the popularity ratio for the Goodread

```
In [48]: grouped_df = df.groupby('yearly')['user_id'].nunique().reset_index()

# Plot bar graph
plt.bar(grouped_df['yearly'], grouped_df['user_id'])
plt.xlabel('Year')
plt.ylabel('Number of Users')
plt.title('Number of Users per Year')
plt.show()
```



--> Result :- Number of Users showed constant increase in the amount till Year 2016 but after that it showed slight decine for the upcoming year.

# --> Plotting the graph for the number of users with & without spoilers per Year

```
In [49]: grouped_df = df.groupby(['yearly', 'has_spoiler'])['user_id'].nunique(
         # Separate the two groups into two different data frames
         has spoiler = grouped_df[grouped_df['has_spoiler'] == 1]
         no spoiler = grouped df[grouped df['has spoiler'] == 0]
         # Merge the two data frames on 'yearly' column
         merged df = pd.merge(has spoiler, no spoiler, on='yearly')
         # Plot line graph
         plt.plot(merged_df['yearly'], merged_df['user_id_x'], label='Users wit
         plt.plot(merged_df['yearly'], merged_df['user_id_y'], label='Users wit
         plt.xlabel('Year')
         plt.ylabel('Number of Users')
         plt.title('Number of Users with and without Spoilers per Year')
         plt.legend()
         plt.show()
             10000
          Number of Users
              8000
              6000
              4000
              2000
                 0
                          2008
                                     2010
                                                2012
                                                           2014
                                                                      2016
```

--> Result :- Number of users with Spoilers showed quite a bit of increase till Year 2016 but for the upcoming year the Slope is going down which shows the decrease in the people who provided reviews with spoilers for the upcoming Year. Moreover, Users without spoilers showed rapid increase till year 2016 which now has dropped and decreased to around 13000 users (Before it was 14000) for the Upcoming Year.

Year

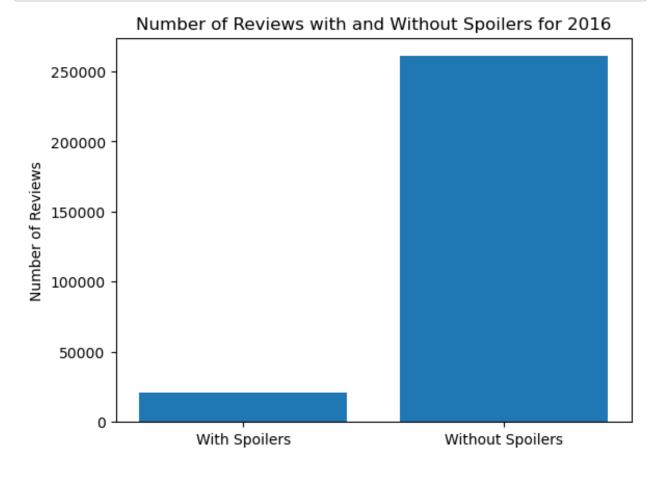
--> Finding which year had the highest reviews & among those how many were with spoilers & without spoilers

# In [50]: year\_with\_most\_reviews = df['yearly'].value\_counts().idxmax() # Get the number of reviews with and without spoilers for that year num\_reviews\_with\_spoilers = df[(df['yearly'] == year\_with\_most\_reviews num\_reviews\_without\_spoilers = df[(df['yearly'] == year\_with\_most\_revi # Print the results print(f"The year with the most reviews is {year\_with\_most\_reviews}") print(f"Number of reviews with spoilers: {num\_reviews\_with\_spoilers}") print(f"Number of reviews without spoilers: {num\_reviews\_without\_spoil

The year with the most reviews is 2016 Number of reviews with spoilers: 21068 Number of reviews without spoilers: 260867

#### --> Plotting the Bar for the reviews in 2016, with spoilers & without spoilers

```
In [51]: plt.bar(['With Spoilers', 'Without Spoilers'], [num_reviews_with_spoil
    plt.title(f"Number of Reviews with and Without Spoilers for {year_with
    plt.ylabel('Number of Reviews')
    plt.show()
```



--> Result :- The year with the highest review is 2016 & the bar chart shows that reviews without spoliers amounted more which are around 250000 while reviews with spoilers were around 25000

In [52]: df.head() Out [52]: user\_id timestamp rating has\_spoiler first\_sentence 2017-08-[0, This is a 5 0 8842281e1d1347389f2ab93d60773d4d [0. It start 30 special book.] ſO. 2017-03-8842281e1d1347389f2ab93d60773d4d 0 Recommended 22 by Don Katz.] [0, A fun, fast 2017-03-[0, I rea 2 8842281e1d1347389f2ab93d60773d4d paced science 3 20 fiction thriller.] [0, Recommended 2016-11-3 8842281e1d1347389f2ab93d60773d4d 0 0 reading to 09 http://ww understand what is ... [0, I really 2016-04enjoyed this [0, It 4 8842281e1d1347389f2ab93d60773d4d 25 book, and there is a ... In [53]: df.to\_csv('data.csv', index=False) In [54]: total\_ratings = df['rating'].count() print(f"Total number of ratings: {total ratings}") Total number of ratings: 1378033 In [ ]: