

GENERATION GIRL
HOLIDAY CLUB [YEAR]

FINAL PROJECT

1 Maret 2024





Outlines

Introduction

Objectives

EDA

Model Choices

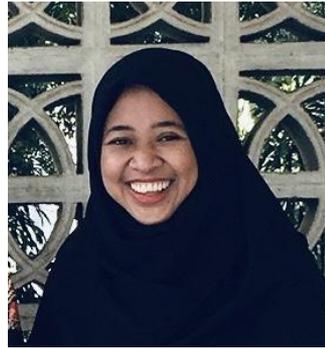
Best Model and Recommendation



Introduction



We Are



Ina



Ika



Objectives



Problem Statement and Objective

1. Untuk memahami pengalaman pengunjung Universal Studios di Florida, Jepang, dan Singapura menggunakan metode sentimen analisis
2. Untuk mengetahui apa saja hal yang perlu diperbaiki oleh Universal Studios dalam rangka meningkatkan kepuasan pengunjung yang nantinya diharapkan mampu meningkatkan keuntungan bisnis bagi Universal Studios

Steps

The screenshot shows a Google Colab notebook interface for a file named 'Final_Project.ipynb'. The browser address bar shows the URL: `colab.research.google.com/drive/1n0HeXRkpxeS3o3Fhx8gCnf6Jdpd3zhcd#scrollTo=`. The notebook has a dark theme and a menu bar with options: File, Edit, View, Insert, Runtime, Tools, Help, and [All changes saved](#). Below the menu bar, there are buttons for '+ Code' and '+ Text'. The main content area displays a table of contents with the following sections and hidden cell counts:

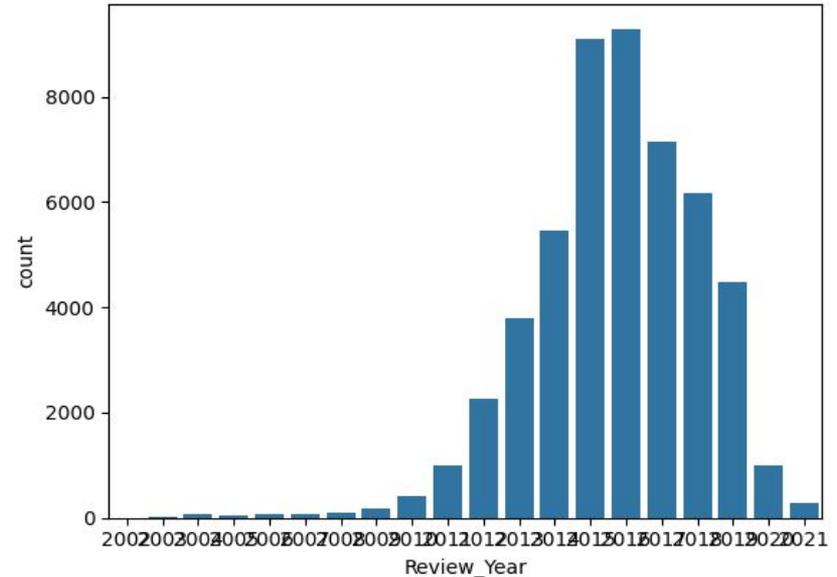
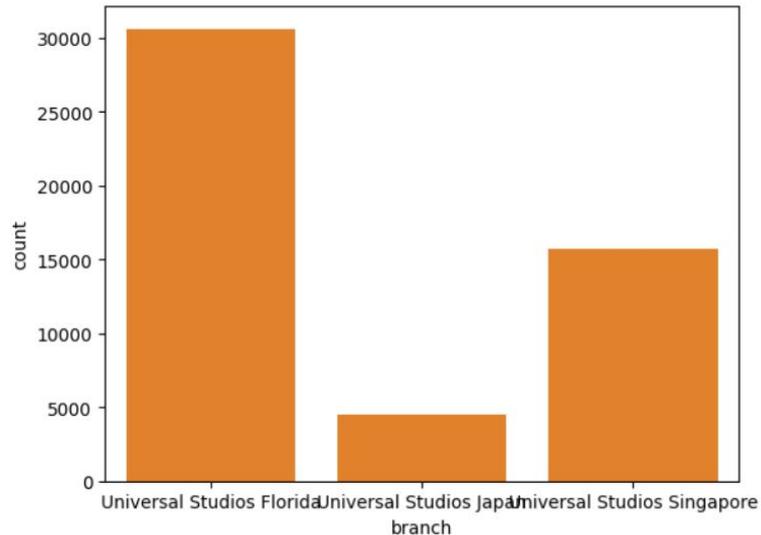
- > Dataset Overview and Preparation
 - [] ↵ 18 cells hidden
- > Exploratory Data Analysis
 - [] ↵ 10 cells hidden
- > Review Cleaning
 - ▶ ↵ 5 cells hidden
- > Sentiment Analysis
 - [] ↵ 11 cells hidden
- > Text Classification
 - [] ↵ 14 cells hidden
- > Model

At the bottom right of the notebook, there is a status indicator: `2s completed at 7:26`.

Data Overview

Dataset: <https://www.kaggle.com/dwiknrd/reviewuniversalstudio>

Terdapat sejumlah 50,904 TripAdvisor reviews Universal Studios dari 3 cabang berbeda, yaitu Florida, Jepang dan Singapura, dengan proporsi sebagai berikut:



Review terdiri atas beberapa kolom informasi, yaitu

reviewer	rating	written_date		title	review_text	branch
Kelly B	2.0	May 30, 2021	Universal is a complete Disaster - stick with ...	We went to Universal over Memorial Day weekend...	Universal Studios Florida	
Jon	1.0	May 30, 2021	Food is hard to get.	The food service is horrible. I'm not reviewin...	Universal Studios Florida	
Nerdy P	2.0	May 30, 2021	Disappointed	I booked this vacation mainly to ride Hagrid m...	Universal Studios Florida	
ran101278	4.0	May 29, 2021	My opinion	When a person tries the test seat for the ride...	Universal Studios Florida	
tammies20132015	5.0	May 28, 2021	The Bourne Stuntacular...MUST SEE	Ok, I can't stress enough to anyone and everyo...	Universal Studios Florida	

```
#perlu adanya konversi written_date dari object ke date/time standard  
df["written_date"]=pd.to_datetime(df["written_date"])
```



```
<class 'pandas.core.frame.DataFrame'  
Int64Index: 1500 entries, 0 to 35649  
Data columns (total 9 columns):  
#   Column          Non-Null Count  Dtype  
---  -  
0   reviewer        1500 non-null   object  
1   rating          1500 non-null   float64  
2   written_date    1500 non-null   datetime64[ns]  
3   title           1500 non-null   object  
4   review_text     1500 non-null   object  
5   branch          1500 non-null   object  
6   Review_Date    1500 non-null   datetime64[ns]  
7   Review_Month   1500 non-null   int64  
8   Review_Year    1500 non-null   int64  
dtypes: datetime64[ns](2), float64(1), int64(2), object(4)  
memory usage: 117.2+ KB
```

```
#untuk alasan simplifikasi, diambil 500 review pertama untuk tiap cabang  
N = 500  
df1 = df.groupby('branch', as_index=False).nth[:N]  
df1.info()
```

Tidak ada null value

Menghilangkan Review Berbahasa Selain Inggris

```
df['detect'] #masih ada baris kosong karena fungsi detect mengguna
```

```
[16] df1 = df[df['detect'] == 'en'] #buat kolom baru khusus untuk review  
df1['detect'] #panjang baris sudah 1500
```

```
df1.info() #sudah ada kolom baru detect untuk deteksi bahasa  
df1.head(5)
```

```
<class 'pandas.core.frame.DataFrame'  
Int64Index: 1500 entries, 0 to 35649  
Data columns (total 10 columns):  
#   Column          Non-Null Count  Dtype  
---  ---  
0   reviewer        1500 non-null   object  
1   rating          1500 non-null   float64  
2   written_date    1500 non-null   datetime64[ns]  
3   title           1500 non-null   object  
4   review_text     1500 non-null   object  
5   branch          1500 non-null   object  
6   Review_Date     1500 non-null   datetime64[ns]  
7   Review_Month    1500 non-null   int64  
8   Review_Year     1500 non-null   int64  
9   detect          1500 non-null   object  
dtypes: datetime64[ns](2), float64(1), int64(2), object(5)  
memory usage: 128.9+ KB
```

	reviewer	rating	written_date	title	review_text	branch	Review_Date	Review_Month	Review_Year	detect
0	Kelly B	2.0	2021-05-30	Universal is a complete Disaster - stick with ...	We went to Universal over Memorial Day weekend...	Universal Studios Florida	2021-05-30	5	2021	en
1	Jon	1.0	2021-05-30	Food is hard to get.	The food service is horrible. I'm not reviewin...	Universal Studios Florida	2021-05-30	5	2021	en
2	Nerdy P	2.0	2021-05-30	Disappointed	I booked this vacation mainly to ride Hagrid m...	Universal Studios Florida	2021-05-30	5	2021	en

Pengecekan Unique Values

```
▶ #check unique values  
df1.nunique(axis=0)
```

```
↳ reviewer      1474  
rating          5  
written_date    632  
title           1402  
review_text     1498  
branch          3  
Review_Date     632  
Review_Month    12  
Review_Year     3  
detect          1  
dtype: int64
```

insights dari unique values

1. reviewer <1500 kemungkinan ada reviewer yang sama
2. written date <1500 beberapa review ditulis pada tanggal yang sama
3. title <1500 kemungkinan ada beberapa yang menuliskan title yang sama
4. review_text 1498 berarti ada dua review yang sama (harus dihilangkan)
5. branch 3 sudah sesuai (Florida, Japan, Singapore)
6. detect 1 sudah sesuai (en)

Menghilangkan Duplicate Reviews

```
▶ #drop duplicate reviews
duplicate_values = df1['review_text'].duplicated()
df2 = df1.drop_duplicates(subset=['review_text'], keep='first')
df2.info() #df2 panjangnya sudah seragam 1498
#df2 adalah dataset final yang digunakan untuk EDA
```

```
↳ <class 'pandas.core.frame.DataFrame'>
Int64Index: 1498 entries, 0 to 35649
Data columns (total 10 columns):
#   Column          Non-Null Count  Dtype
---  -
0   reviewer        1498 non-null   object
1   rating           1498 non-null   float64
2   written_date     1498 non-null   datetime64[ns]
3   title            1498 non-null   object
4   review_text      1498 non-null   object
5   branch           1498 non-null   object
6   Review_Date      1498 non-null   datetime64[ns]
7   Review_Month     1498 non-null   int64
8   Review_Year      1498 non-null   int64
9   detect           1498 non-null   object
dtypes: datetime64[ns](2), float64(1), int64(2), object(5)
memory usage: 128.7+ KB
```

Jadi total baris data yang digunakan adalah 1498



EDA



Data Insights - Through Exploration

Rata-rata rating secara umum adalah 3.8

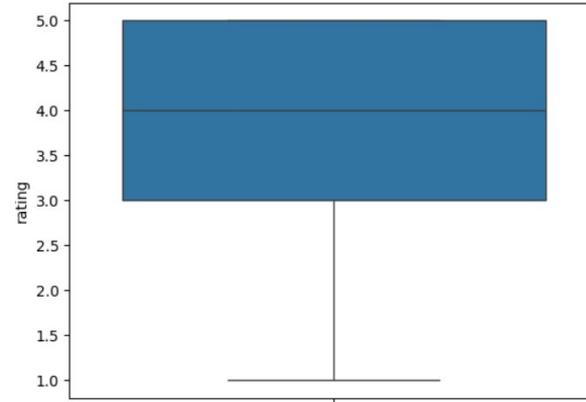
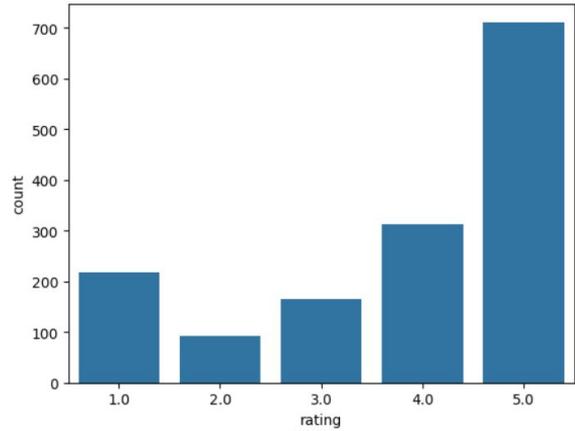
Rata-rata rating tiap cabang studio

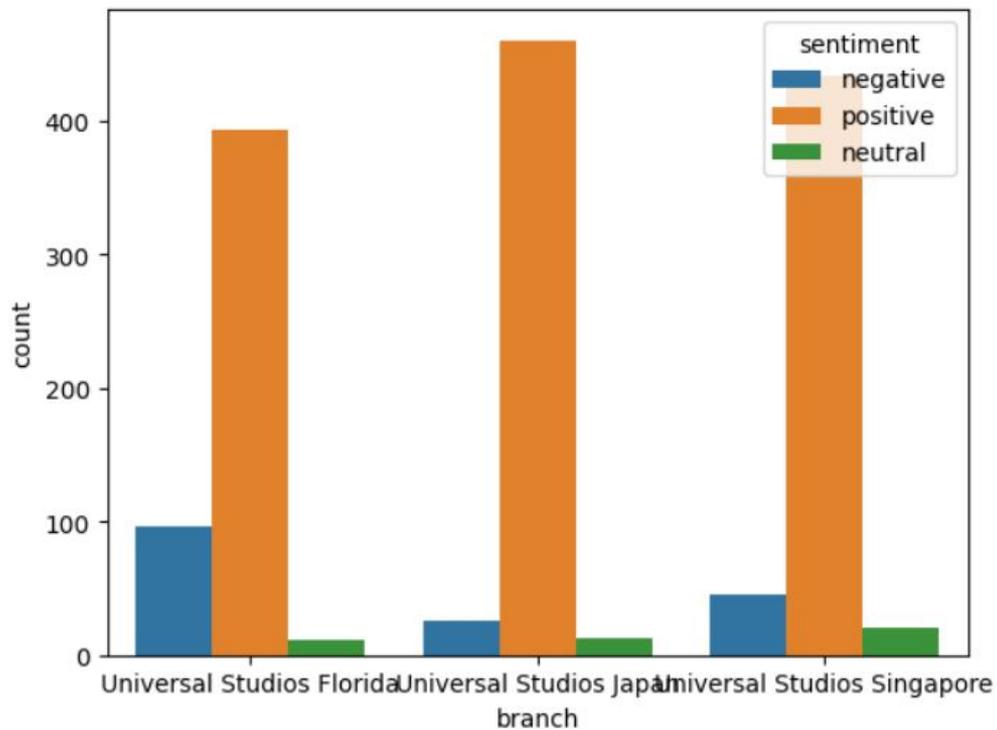
branch

Universal Studios Florida	3.348000
Universal Studios Japan	4.240481
Universal Studios Singapore	3.833667

Meski demikian, rating 5.0 merupakan rating yang paling sering muncul

Visualisasi boxplot juga menunjukkan data yang cenderung besar di nilai Q3 (rating yang besar)





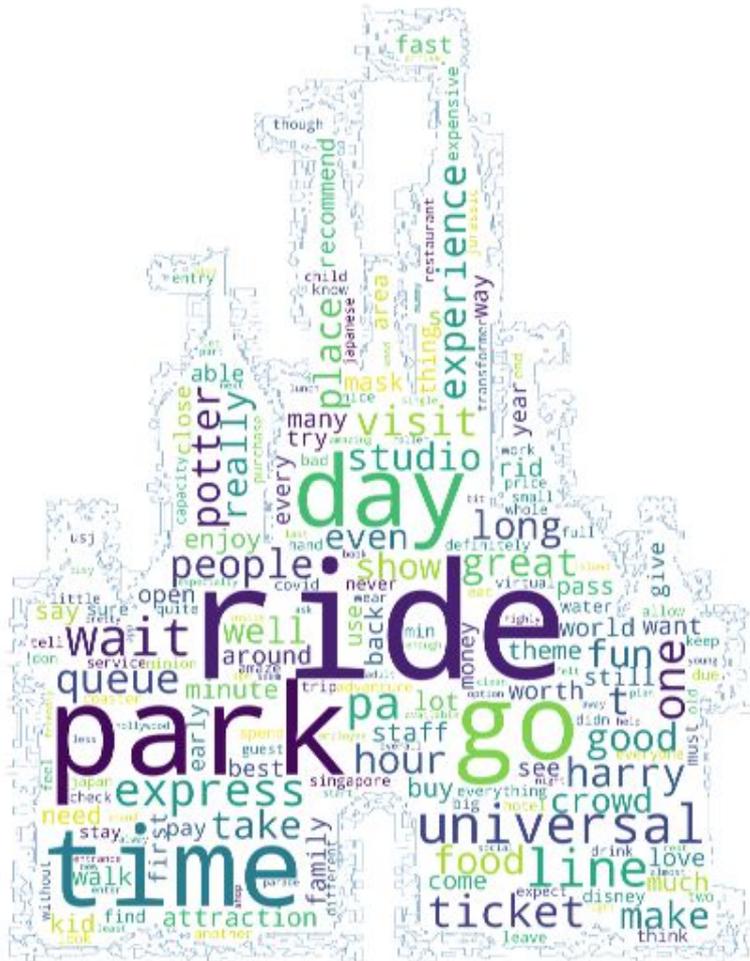
Hasil analisis sentimen juga menunjukkan >50% pengunjung memiliki pengalaman yang positif

Jika dilihat berdasarkan review per bulan pada tahun 2020, maka bulan Januari menjadi bulan dengan review positif dan negatif terbanyak secara bersamaan

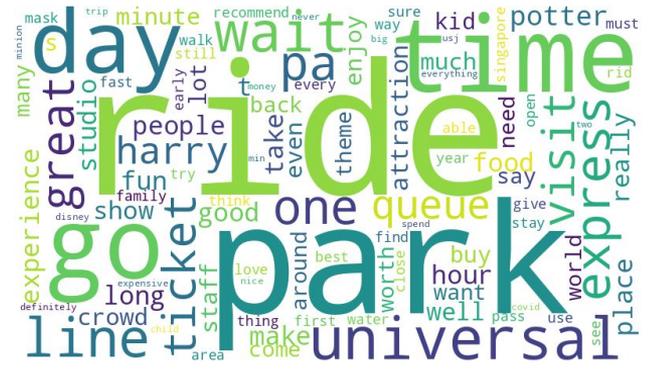
Hal ini kemungkinan dikarenakan pada bulan Januari merupakan musim puncak bersamaan dengan momen perayaan tahun baru.

```
3 Review_Year  Review_Month  sentiment  count
2020          1             positive    137
          2             positive     76
          12            positive     50
          10            positive     39
           7             positive     38
           8             positive     38
           3             positive     35
           9             positive     34
          11            positive     32
           6             positive     30
           5             positive     18
           4             positive     13
dtype: int64
```

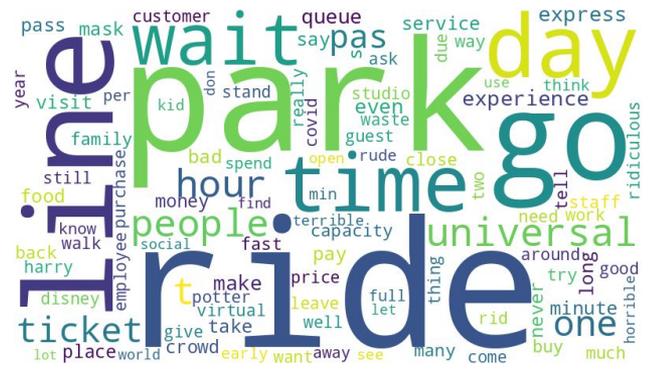
```
4 Review_Year  Review_Month  sentiment  count
2020          1             negative    12
          12            negative    10
          10            negative     8
           8             negative     5
           7             negative     4
          11            negative     4
           6             negative     3
           9             negative     2
           2             negative     1
           3             negative     1
           5             negative     1
dtype: int64
```



Positif: RIDE, PARK



Negatif: RIDE, PARK, LINE, WAIT, TIME



More Insights

Adanya sentimen positif dan negatif yang berimbang antara kata PARK dan RIDE

Sementara untuk sentimen negatif tampak ada kata LINE, WAIT, dan TIME yang kemungkinan menggambarkan adanya pengalaman kurang menyenangkan terkait antrian dan waktu tunggu

Perlu ada evaluasi lebih lanjut terhadap wahana permainan (RIDE) di Universal Studio untuk mengetahui apa yang dapat di improve dan sudah cukup baik menurut pengunjung terkait wahana permainan

Final_Project.ipynb ☆

Edit View Insert Runtime Tools Help [All changes saved](#)

de + Text

```
df2_2020_neg[df2_2020_neg['review_text'].str.contains('ride')]['review_text']
```

```
270 Worst park experience ever - info on website d...
298 Family of 5 (two adults, 8, 6 & 6) about $750 ...
305 Today my family and I spent the day there and ...
313 Waste of time! You pay for s full ticket and c...
328 We go to Universal from Ohio about 3 times a y...
330 The only thing I can think of is the song, "Ev...
342 We live in Central Florida and go to Universal...
352 Below is an email that i wrote to the guest se...
356 Don't bother unless you buy the express pass. ...
363 the park is taking great measures with covid b...
370 It has become a premium park with their additi...
391 Painful, irritating and troublesome service fr...
404 My wife and I went to Islands of Adventure and...
412 A few attendants ruined the overall experience...
413 Sorry to write that we had a disappointing day...
440 I've been to Universal Studios many times, but...
455 Had Fass Pass from the Hard Rock Hotel. These a...
461 Be forewarned, if you are a person size, as I ...
465 We didn't wait longer than 30 minutes to ride ...
466 We spent a fun filled day following UA's stric...
479 Staff is very unfriendly right now. I thought ...
30687 We were there at 8:30am and the lines were oka...
35184 They have booking system yet still cannot mana...
35187 My wife and I are senior citizens. On 10 Dece...
35191 Horrible experience. Crowded even though there...
35194 Most restaurants, food courts, drink stands ar...
35229 3 rides in 5 hours tells you everything. Obvio...
35236 I purchased 6 month passes in early Jan to cel...
35324 The price is overrated for the limited rides a...
35345 We purchased regular adult tickets at the main...
35377 So firstly, this was my first time to a Univer...
```



Model Choices



Model Description + Results

TF-IDF
Vectorizer

	precision	recall	f1-score	support
negative	0.20	0.19	0.20	21
neutral	0.17	0.20	0.18	5
positive	0.86	0.86	0.86	124
accuracy			0.75	150
macro avg	0.41	0.42	0.41	150
weighted avg	0.75	0.75	0.75	150

CountVectorizer

	precision	recall	f1-score	support
negative	0.23	0.43	0.30	21
neutral	0.07	0.20	0.11	5
positive	0.89	0.69	0.77	124
accuracy			0.63	150
macro avg	0.39	0.44	0.39	150
weighted avg	0.77	0.63	0.68	150

Skor presisi, recall dan F1-score lebih tinggi untuk sentimen positif dibandingkan sentimen negatif menunjukkan bahwa model lebih akurat dalam mengidentifikasi teks positif dibandingkan teks negatif.

Akurasi tergolong tinggi dan menunjukkan bahwa model cukup handal dalam memprediksi kategori teks



Best Model and Recommendation



Best Model + Insight

1. Tingkat akurasi pada TF-IDF sebesar 75% berarti bahwa model TF-IDF mampu memprediksi kategori teks dengan benar dalam 75% dari seluruh sampel data yang digunakan untuk pengujian dibanding dengan CountVectorizer.
2. TF-IDF lebih sensitif dalam memprediksi sentiment positive, menunjukkan tingkat error yang lebih rendah bila ada data baru.
3. Dari perbandingan dua model yang menggunakan metode ekstraksi fitur yang berbeda dapat diketahui bahwa presisi dan recall dari TF-IDF lebih baik dibanding count vectorizer. Ini bisa dilihat dari F1 Score pada Classification Report.

Q & A



Thank You!

