# Twitter Sentiment Analysis for Bungie and Destiny 2

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SpringBoard Data Science Bootcamp

- What's Bungie / Destiny 2?
- Getting Data From Twitter
- Exploratory Data Analysis
- Machine Learning Analysis
- Conclusions

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## What's Bungie / Destiny 2?

- Bungie
  - Game Company
  - They're in Bellevue
- Destiny 2
  - Hit game by Bungie
  - Magic space ninjas with guns



#### Social Media Presence

- Official Twitter Accounts
  - @Bungie
  - @DestinyTheGame
- Lots of tweets
  - Announcements
  - Etc
- Use Twitter data
  - What do players think of recent updates to Destiny 2?
  - What do people think of Bungie?

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## Data Acquisition

- Twitter Standard Search API
  - Get tweets from the last 7 − 10 days
  - Not exhaustive (\$\$\$)
  - Search terms
- Searches (~10 days)
  - Tweets about Destiny 2 (21.4k)
  - Tweets about Bungie (24.7k)
  - @DestinyTheGame's tweets (46)
  - @Bungie's tweets (107)

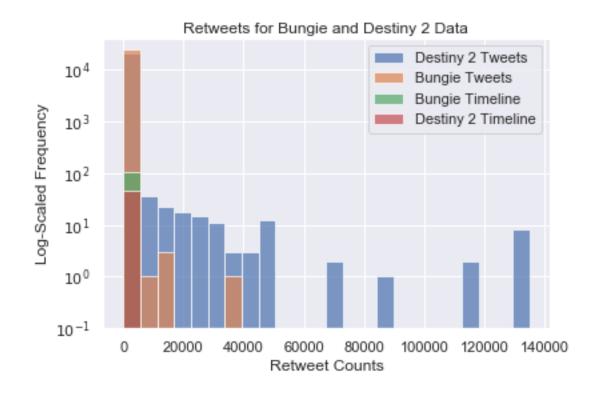
## Data Cleaning

- Missing / misaligned data
- Reduced columns
  - 320 to 50
- Kept the data as 4 DataFrames
  - Concatenate them when appropriate

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## How Do I Measure Engagement?

- Retweets
  - Official accounts don't get many compared to others



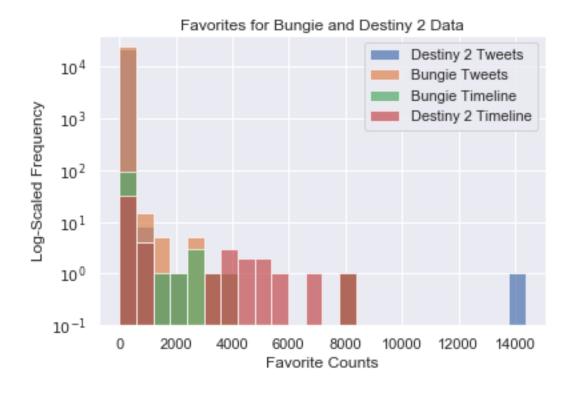
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#### Retweets

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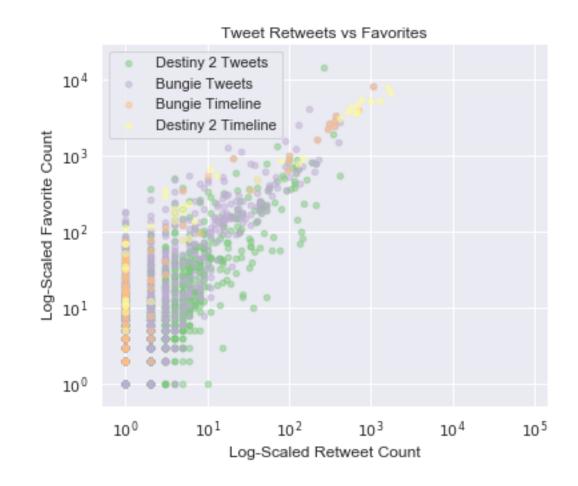
#### Favorites

 Official accounts do get at least as many as other accounts



### Do Favorites and Retweets Correlate?

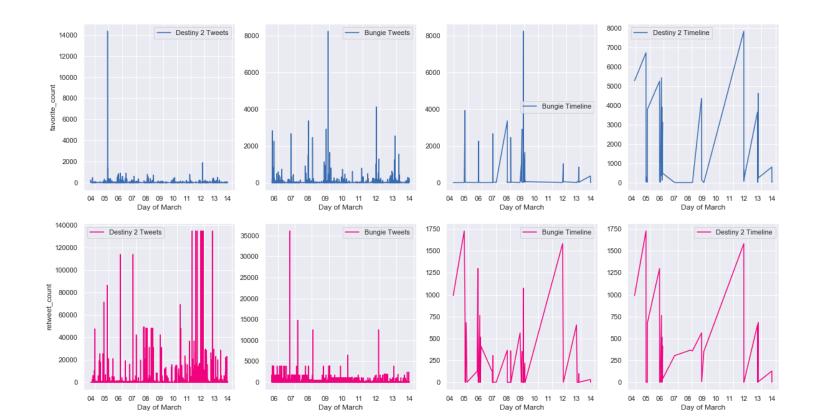
- Only if you log scale them both
  - Darn outliers
- Generally more retweets than favorites
  - CHECK THIS
  - DID I MIX UP AXES



## Time Correlations?

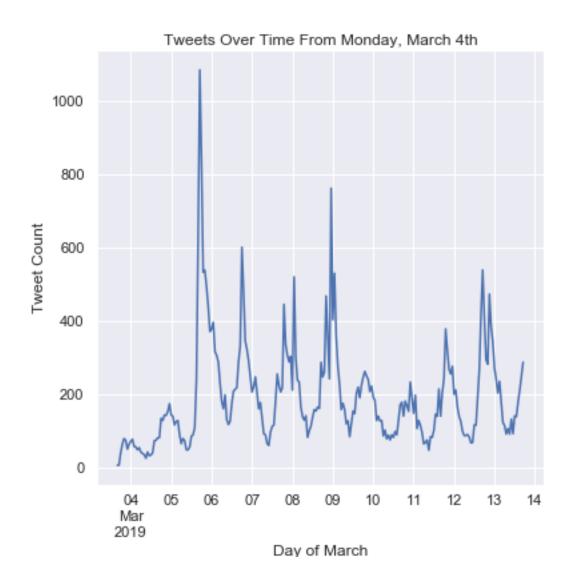
Only on the official accounts

Engagement Metrics Across All Datasets



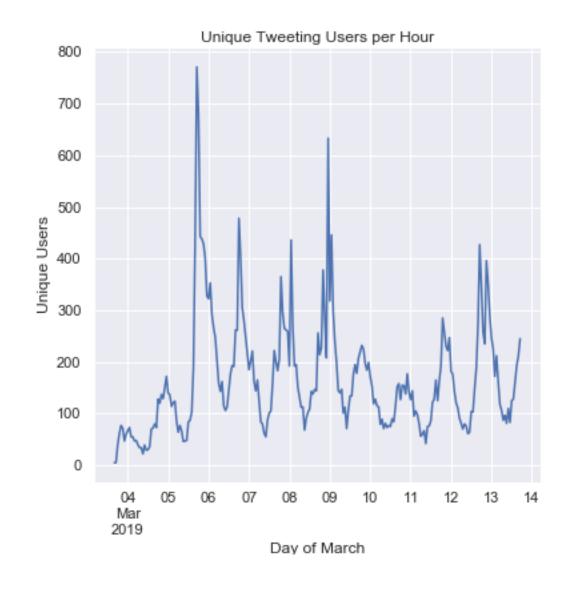
## Speaking of Time...

- When are these tweets posted?
  - March 3<sup>rd</sup> 13<sup>th</sup>
- Note:
  - The Destiny 2 tweets start on the 3<sup>rd</sup>
  - Bungie tweets start on the 5<sup>th</sup>
- Tweets posted in the evening, mostly on weekdays

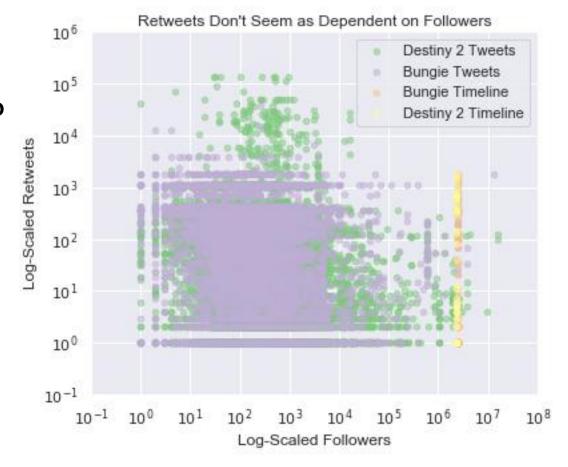


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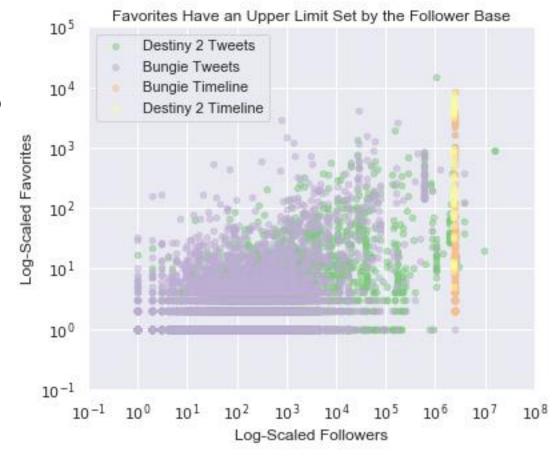
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- Unique users mirrors the same trend



- First Guess: Followers
- More people will see your tweets, and then interact with it?
  - Apparently not for retweets

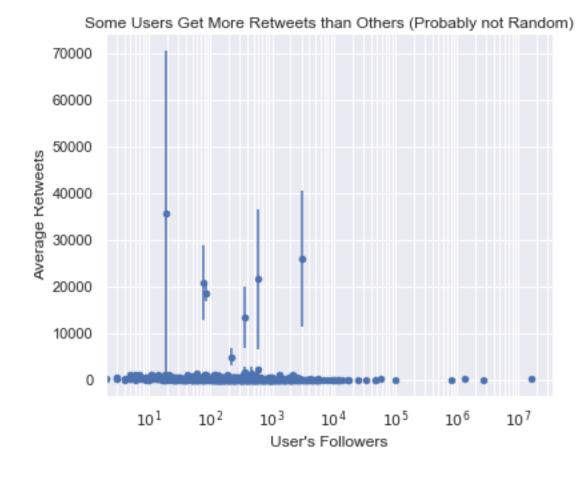


- First Guess: Followers
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  - Apparently not for retweets
  - Maybe for favorites
- These are single tweets
  - Aggregate over each user and check again



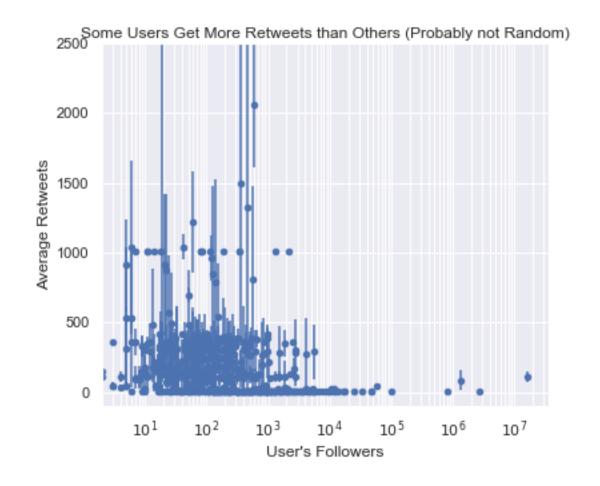
## Engagement per User

- See if this gets us better results
- Can do a z-test
  - Average retweets
  - Compare to the baseline of 0
- Error bars are the 95% confidence interval for average retweets
  - Some users definitely get more retweets



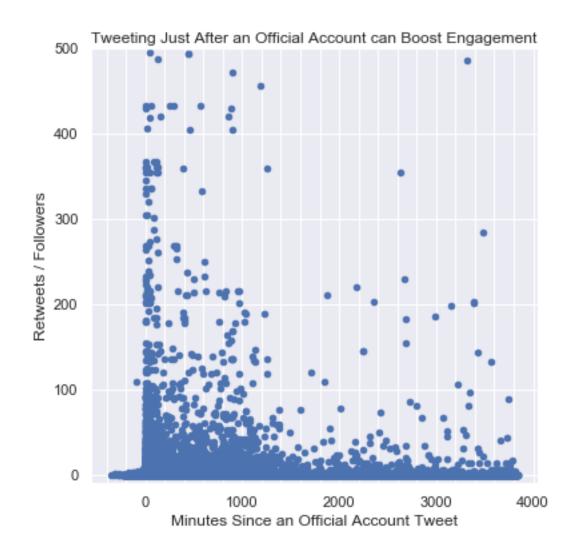
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  - Zooming in, more evidence

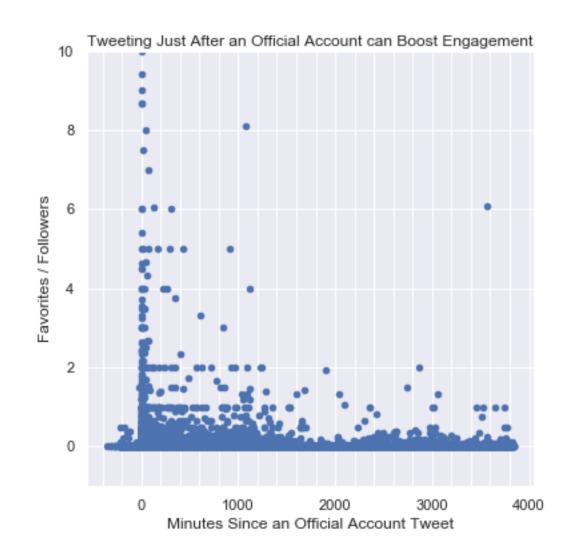


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