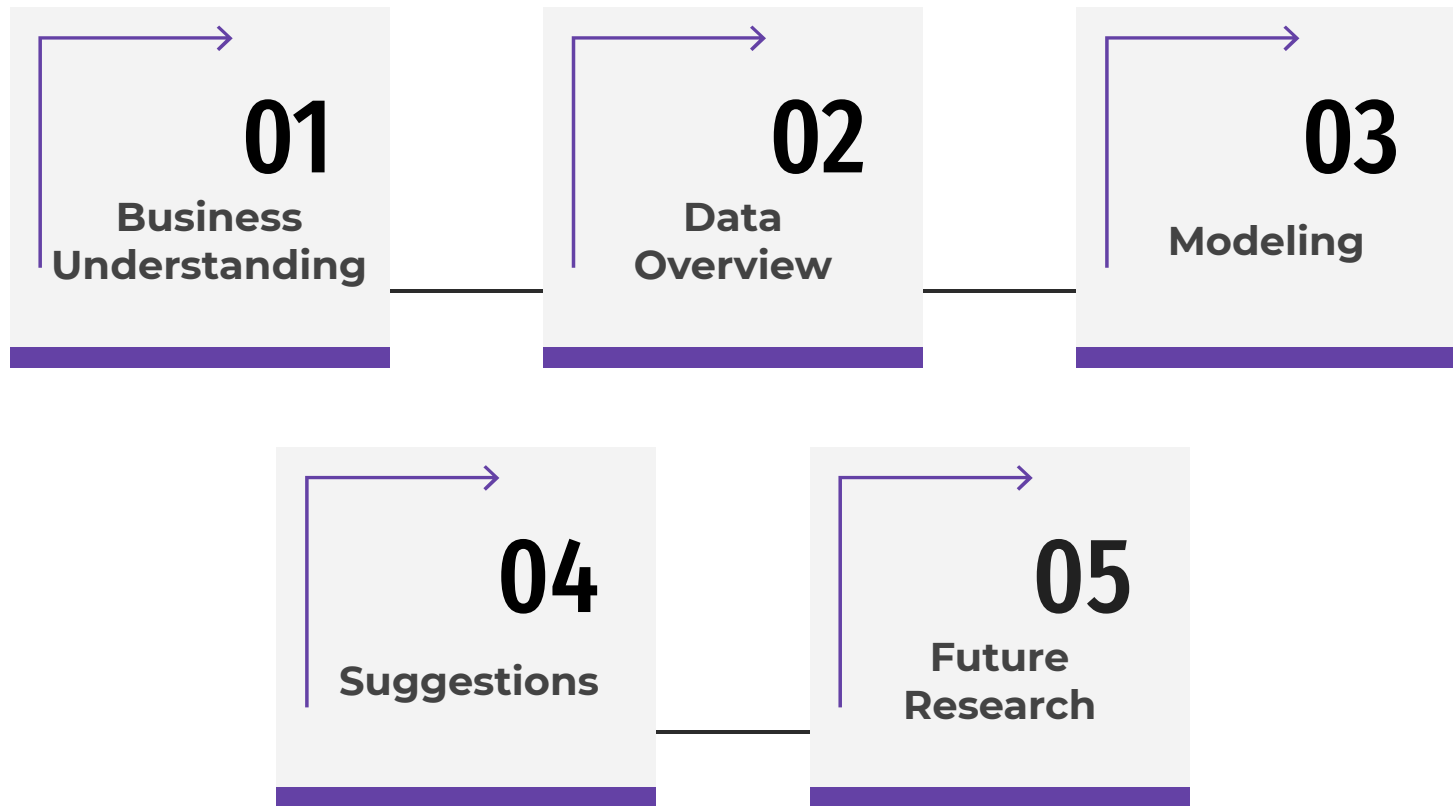


# **Twitch Streams: Detecting Hate**



By: Kelsey Lane

# Agenda



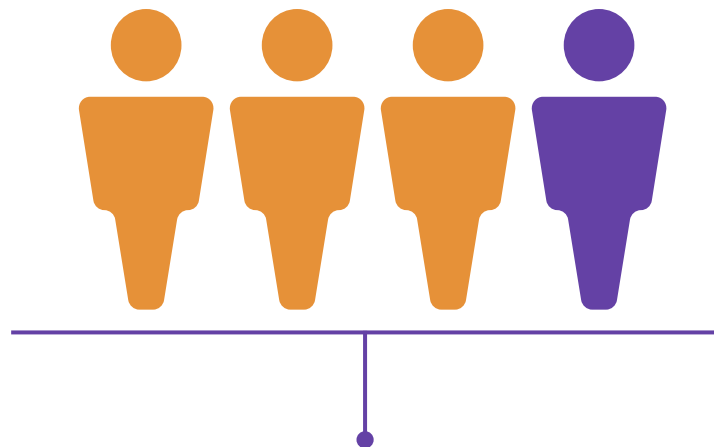
01

# Business Understanding



1 in 10 users  
reported  
they've been  
bullied or felt  
unsafe while  
streaming

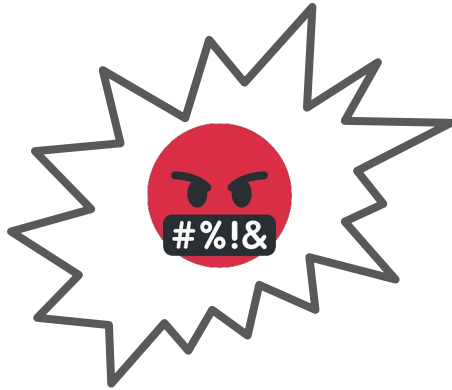




3 out of 4 users think Twitch is not effective in addressing bullying



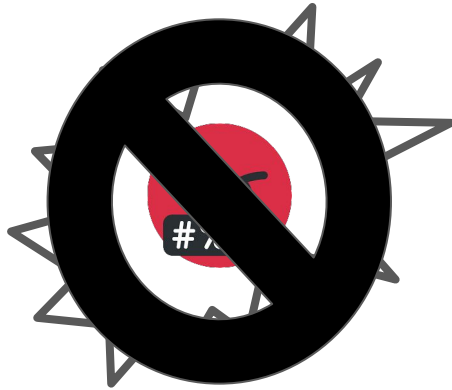
# So What Can We Do?



Business



# So What Can We Do?



Business



02

# Data Overview



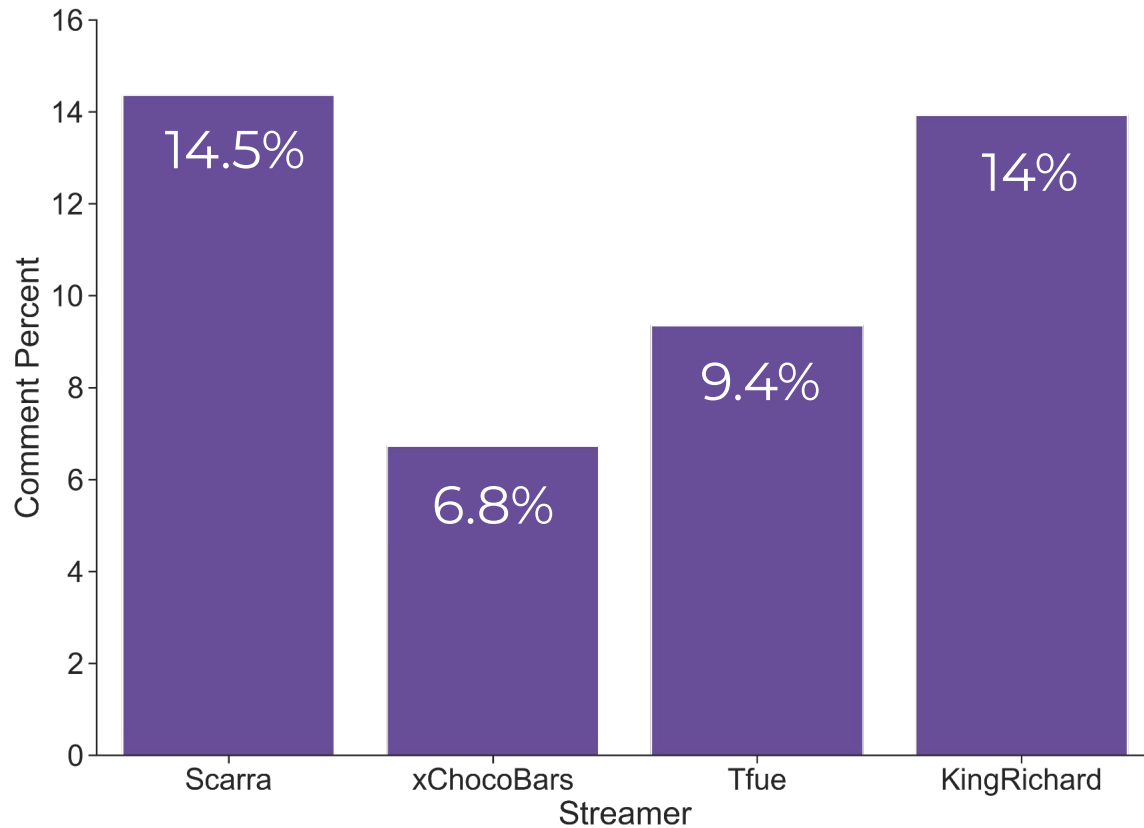


# Data

- Twitch livestream chats
  - May - June 2018
  - 4 streamers
  - 9 total streams
- 102,700 total



# Percent Negative Comments By Streamer



**Data**



think got U 101 hate hard dont  
chat. rip K one now i damn people bad ass banned  
go ban time stream make guy f game damage  
shit w t f game stop fuck  
trash



03

# Modeling



# Sentiment Analysis

- Identify negative chats
  - Find frequent words
- 76% Recall





04

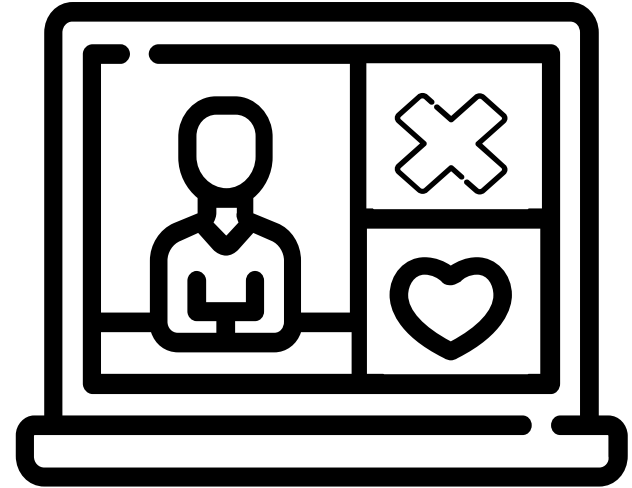
# Suggestions

| GAMESCOM 2017       |  |
|---------------------|--|
| Stage Show Schedule |  |
| 10:00               | Good Morning Gamescom, brought to you by Intel |
| 10:15               | Square Enix                                    |
| 10:30               | Shadow of War                                  |
| 10:45               | Total War: Warhammer II                        |
| 11:00               | Totally Accurate Battle Simulator              |
| 11:15               | Sackboy  |
| 11:30               | FIFA 18  |
| 12:45               | FIFA 18 on Nintendo Switch                     |
| 13:00               | Towed For Speed                                |
| 13:15               | The Sims                                       |
| 13:30               | Star Wars Battlefront II                       |
| 13:45               | Star Wars Battlefront II                       |
| 14:00               | PES 2018                                       |
| 14:15               | Microsoft                                      |



# Suggestions

- Flag hate chats
- Mark frequent offenders
- Build stronger filter
  - Focus on misspellings





05

# Future Research



twitch

Partner Lounge





# Future Research

- Model specific categories
- Other languages
- Better labels





kelsklane




[kelsklane@gmail.com](mailto:kelsklane@gmail.com)

# Thank you!


# Questions?

# Appendix

# Methods

- Keep uppercase + stopwords
  - Tweet Tokenizer + Lemmatize
  - Count Vectorizer
- 
- A decorative gray arc is located in the bottom right corner of the slide.

# Engineered Features

- Time of day
  - Ratio capital letters
  - Offset
  - Total comments per user
  - Any emotes
- 
- A decorative gray arc is located in the bottom right corner of the slide.

# Chat Examples

## **Positive/Neutral:**

- Congrats king! Big fan!

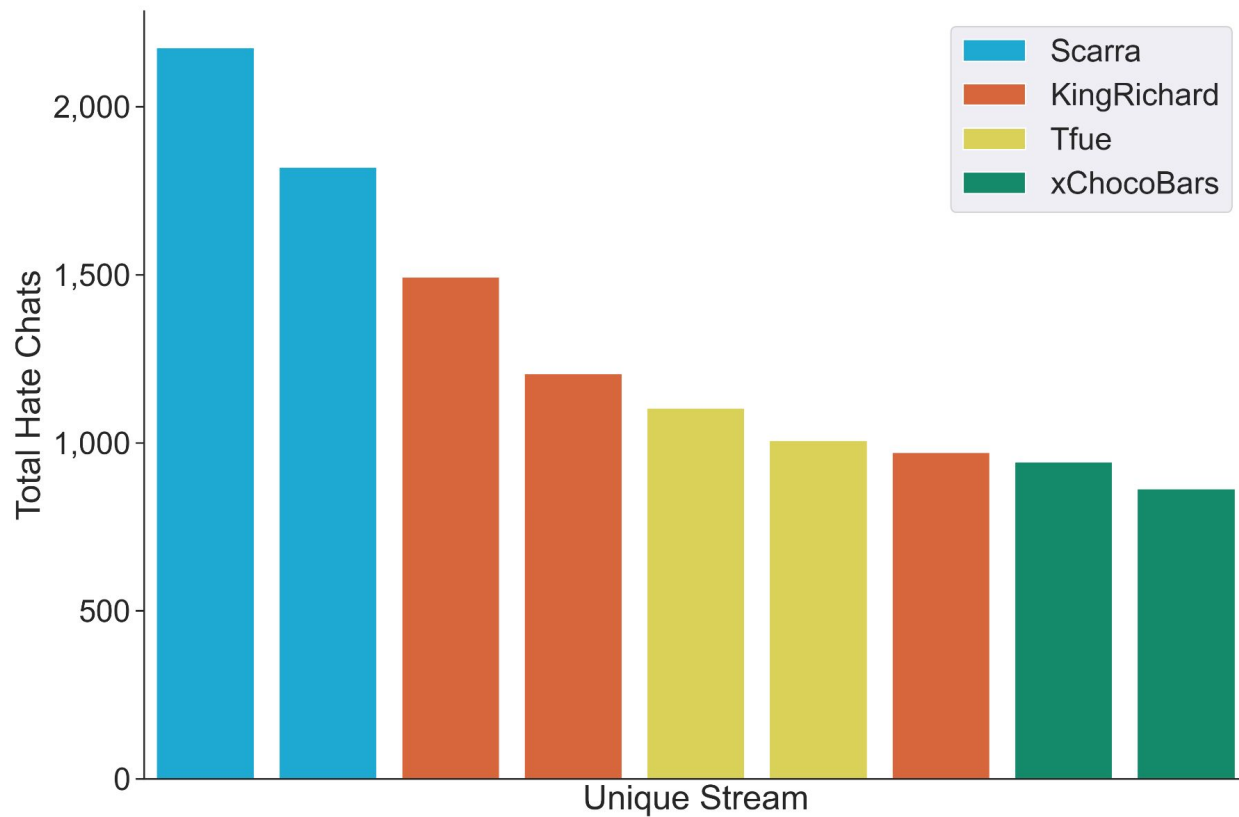
## **Hate:**

- i'm better than this trash man

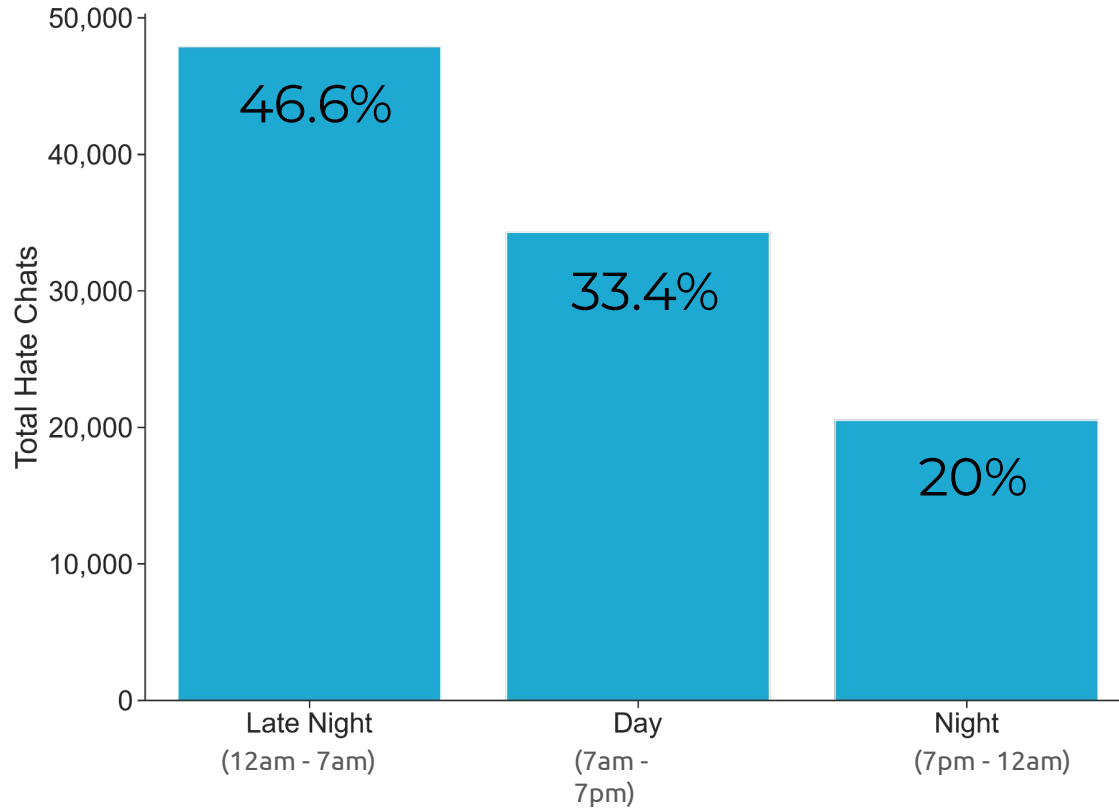
## **Negative, non-hate:**

- i wanna sub but i'm broke FailFish

# Number of Hate Comments For Each Stream



# Number of Hate Comments By Time of Day

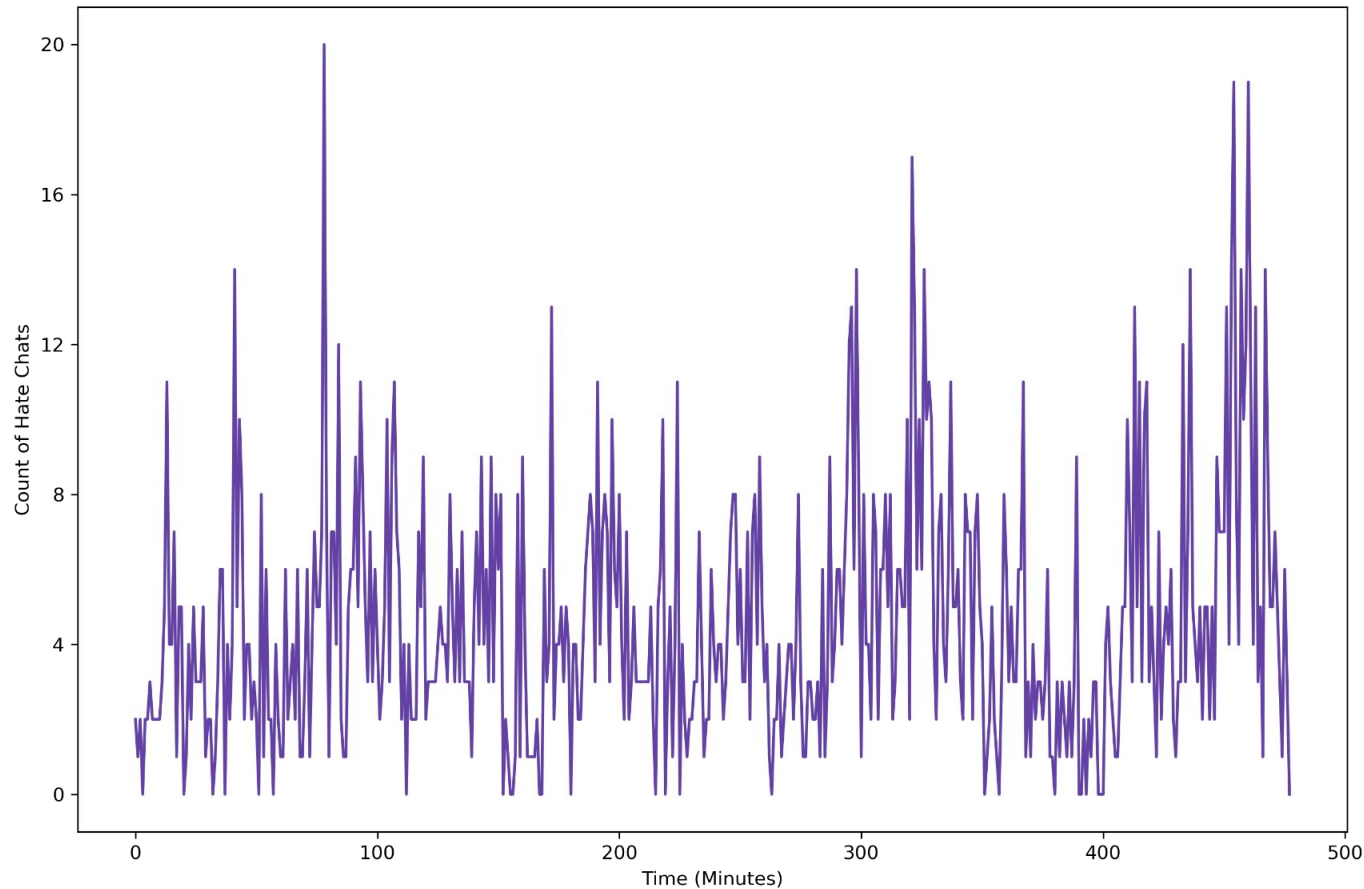


Data

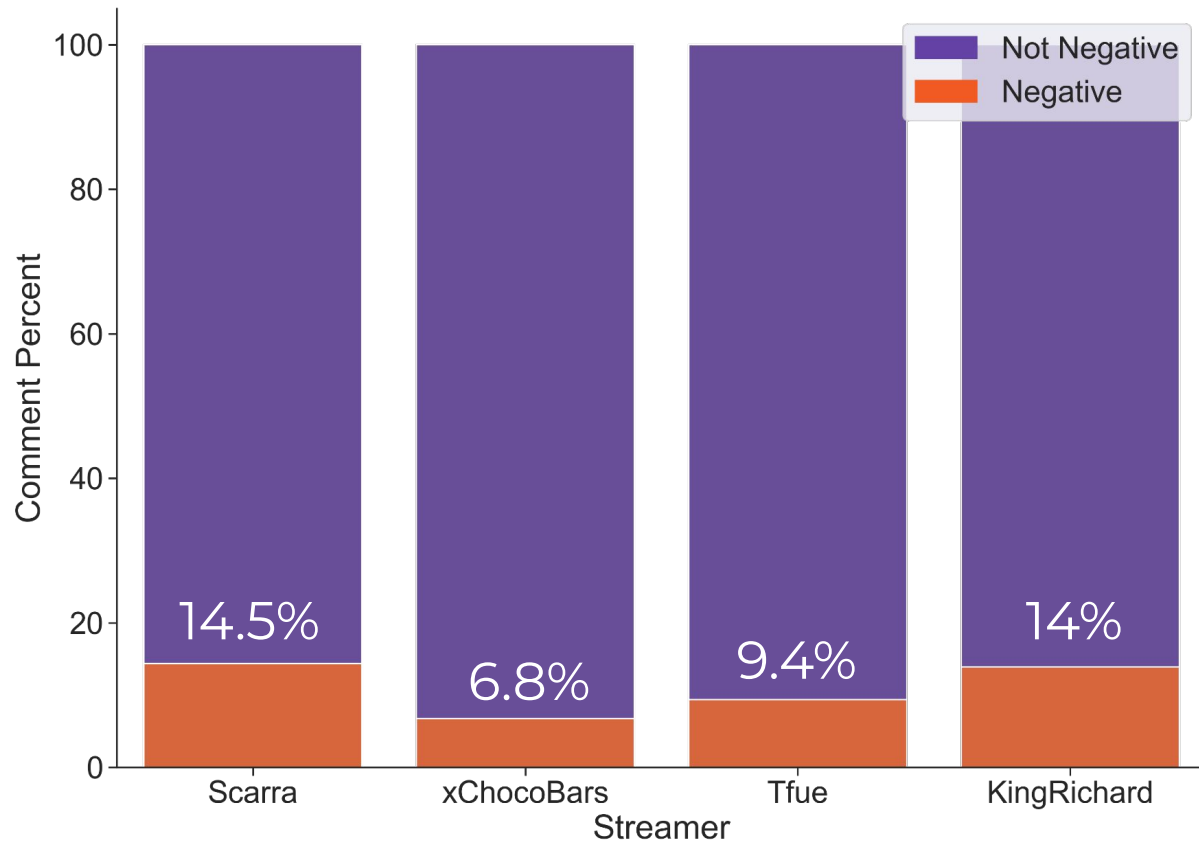




# Number of Hate Comments Over Time For One Stream



# Percent Negative Comments By Streamer



Data



# Credits:

Image:

<https://www.polygon.com/22700564/twitch-hate-raids-safety-feature-streaming>

Survey:

<https://blog.streamelements.com/streamelements-analysis-on-twitch-bullying-c3f2b2240318>