

A photograph of a man with vibrant pink hair, wearing a dark suit and tie, smiling warmly at the camera. He is positioned on the left side of the image, which is divided by a large white diagonal line. The background behind him is a vibrant, multi-colored wall featuring vertical panels in yellow, blue, and red, along with some abstract patterns and small lights.

Ninja New Year

By. Natalie Cabayan

How did Ninja New Year do on Twitch?

Findings



**Drop in viewers from
5:30-6:30pm PCT
(8:30pm-9:30pm EST)**

People may have been leaving
their home for new years plans



**After 8:30pm our time
11:30pm in NY we see a
constant drop hour over
hour**



**We could have decreased
cost by having the stream
end at midnight.**

Was it a success?

Red Bull

Considering that gaming is a new audience for Red Bull, having 144K extra people see a Red Bull branded gamer is considered a success.

Ninja

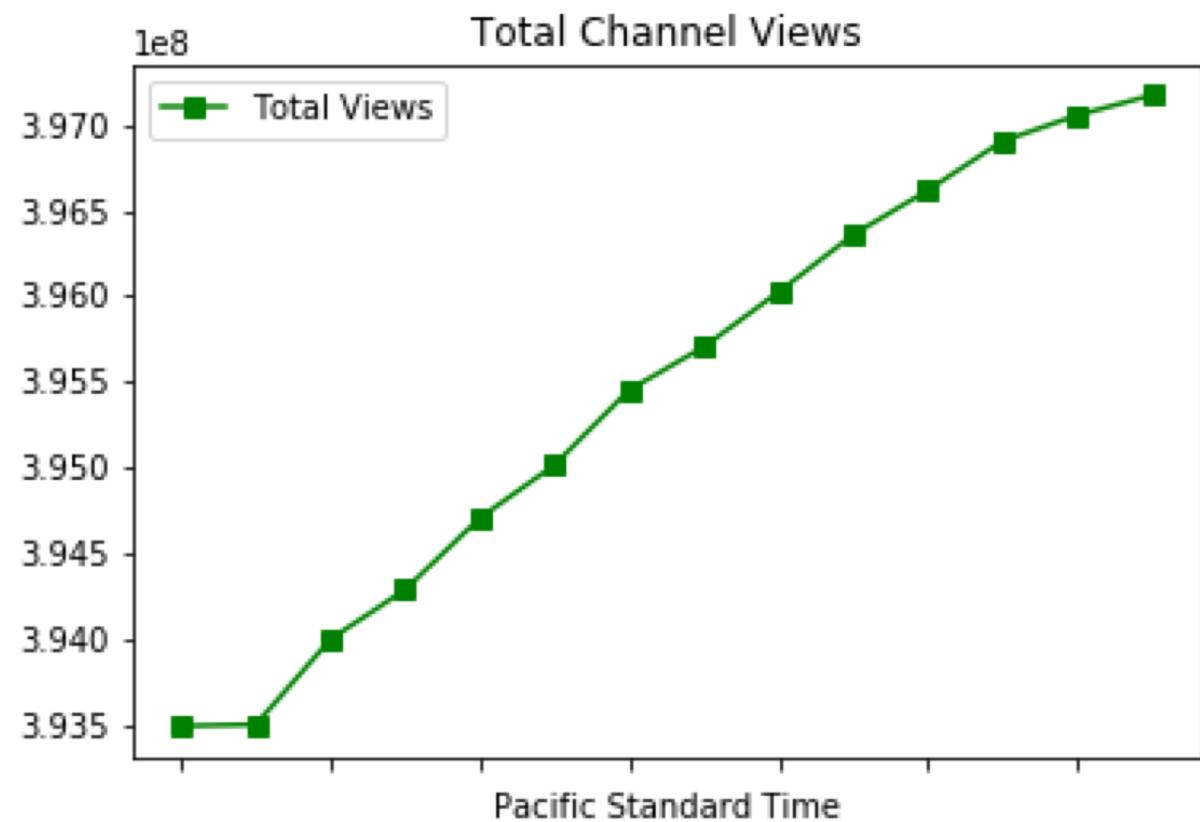
Considering Ninja grew his total channel viewership by .92%(3.67million) in just a couple of hours, it would also be considered a success as there was no cost associated with this project for him.

Connecting to the Twitch API

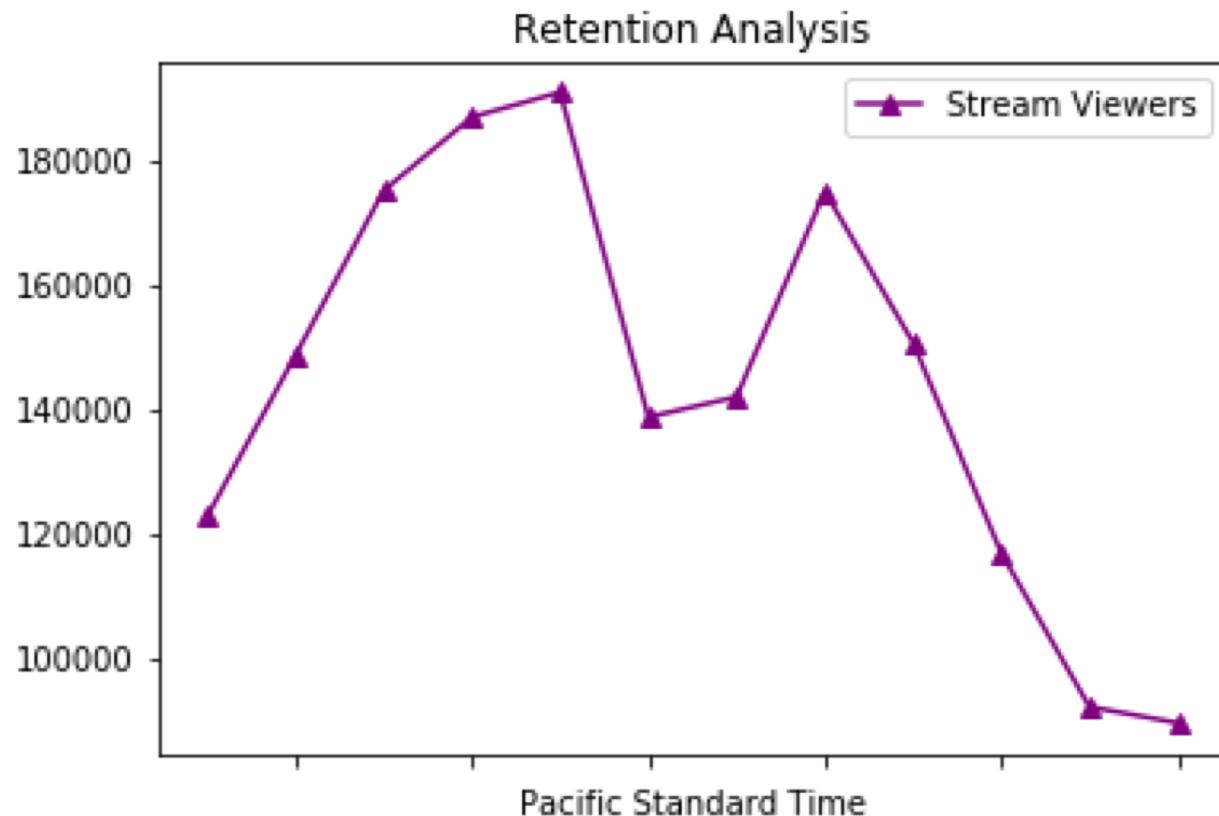
- Stream Data:
 - Total Channel Views
 - Stream Viewers

	Unnamed: 0	time	total_views	stream_viewers
0	0	12:23 PM	393500921	NaN
1	0	1:23 PM	393509466	122861.0
2	0	2:23 PM	394005259	148687.0
3	0	3:23 PM	394294748	175163.0
4	0	4:23 PM	394710151	186953.0
5	0	5:23 PM	395019218	190954.0
6	0	6:23 PM	395455032	138772.0
7	0	7:23 PM	395705528	142017.0
8	0	8:23 PM	396024213	175028.0
9	0	9:23 PM	396357748	150747.0
10	0	10:23 PM	396615944	116931.0
11	0	11:23 PM	396902582	92230.0
12	0	12:23 AM	397052498	89641.0
13	0	1:23 AM	397169436	NaN

Total Channel Views



Retention Analysis



```
ninja_twitch_pull.py *
```

```
25 import urllib
26 import simplejson as json
27
28 import pandas as pd          # allows use of data frame structure
29 import numpy as np
30 import datetime
31 import time                  # allows me to get current timestamp
32
33 from twitch import TwitchClient # Twitch API library
34
35 #####
36 # GET USER ID
37 #####
38 # Ninja's username is "Ninja".
39 # This section gets his numeric ID.
40
41 # You will need your client ID and OAuth.
42 # Use the link above to find the OAuth.
43
44 # Specify username.
45 user_name = "Ninja"
46
47 # Specify URL.
48 url = "https://api.twitch.tv/helix/users?login=" + user_name
49
50 # Create URL request.
51 channel_id = urllib.request.Request(url)
52
53 # Add client ID and OAuth to request.
54 channel_id.add_header("Client-ID", 's4tqt4ku0piu2e0yayw6k08l7851qo')
55 channel_id.add_header("Authorization", "OAuth " + "kheftmy6d7dbzecqkmu7e7b2fc92za")
56
57 # Get info from request.
58 response = urllib.request.urlopen(channel_id)
59 json_output = json.loads(response.read())
60
61 # Get user ID.
62 user_id = json_output['data'][0]['id']
```

```
# Create empty data frame.
results = pd.DataFrame(columns = ['time', 'total_views', 'stream_viewers'])

# Start loop
for i in range(14):

    # Print progress
    print('')
    print('Iteration:', i + 1)
    print('')

    # Get total views data

    # Create client.
    client = TwitchClient(client_id = 's4tqt4ku0piu2e0yayw6k08l7851qo')

    # Get channel.
    channel = client.channels.get_by_id(user_id)

    # Get livestream viewer data

    # Specify URL.
    stream_url = "https://api.twitch.tv/helixstreams?user_login=" + user_name

    # Create URL request.
    channel_id = urllib.request.Request(stream_url)

    # Add client ID and OAuth to request.
    channel_id.add_header("Client-ID", 's4tqt4ku0piu2e0yayw6k08l7851qo')
    channel_id.add_header("Authorization", "OAuth " + "kheftmy6d7dbzecqkmu7e7b2fc92za")

    # Get data.
    response = urllib.request.urlopen(channel_id)
    json_output = json.loads(response.read())

    # Create empty data frame.
    results = pd.DataFrame(columns = ['time', 'total_views', 'stream_viewers'])

    # Add new row to "results".
    results = results.append(to_add)
    del(to_add)

    # Export CSV
    results.to_csv("ninja_twitch_pull.csv")
```

```
# "json_output" will only have info if a live stream is going on!
if len(json_output['data']) == 0:
    stream_viewers = np.nan
else:
    stream_viewers = json_output['data'][0]['viewer_count']

# Generate new row to add to "results"
to_add = pd.DataFrame({'time': [datetime.datetime.now()],
                       'total_views': channel.views,
                       'stream_viewers': stream_viewers})

# Add new row to "results".
results = results.append(to_add)
del(to_add)

# Export CSV
results.to_csv("ninja_twitch_pull.csv")

# Wait before next loop iteration
#time.sleep(60 * 60)                                # Wait one hour
time.sleep(3600)
```

How did you connect to the API?

Existing Data

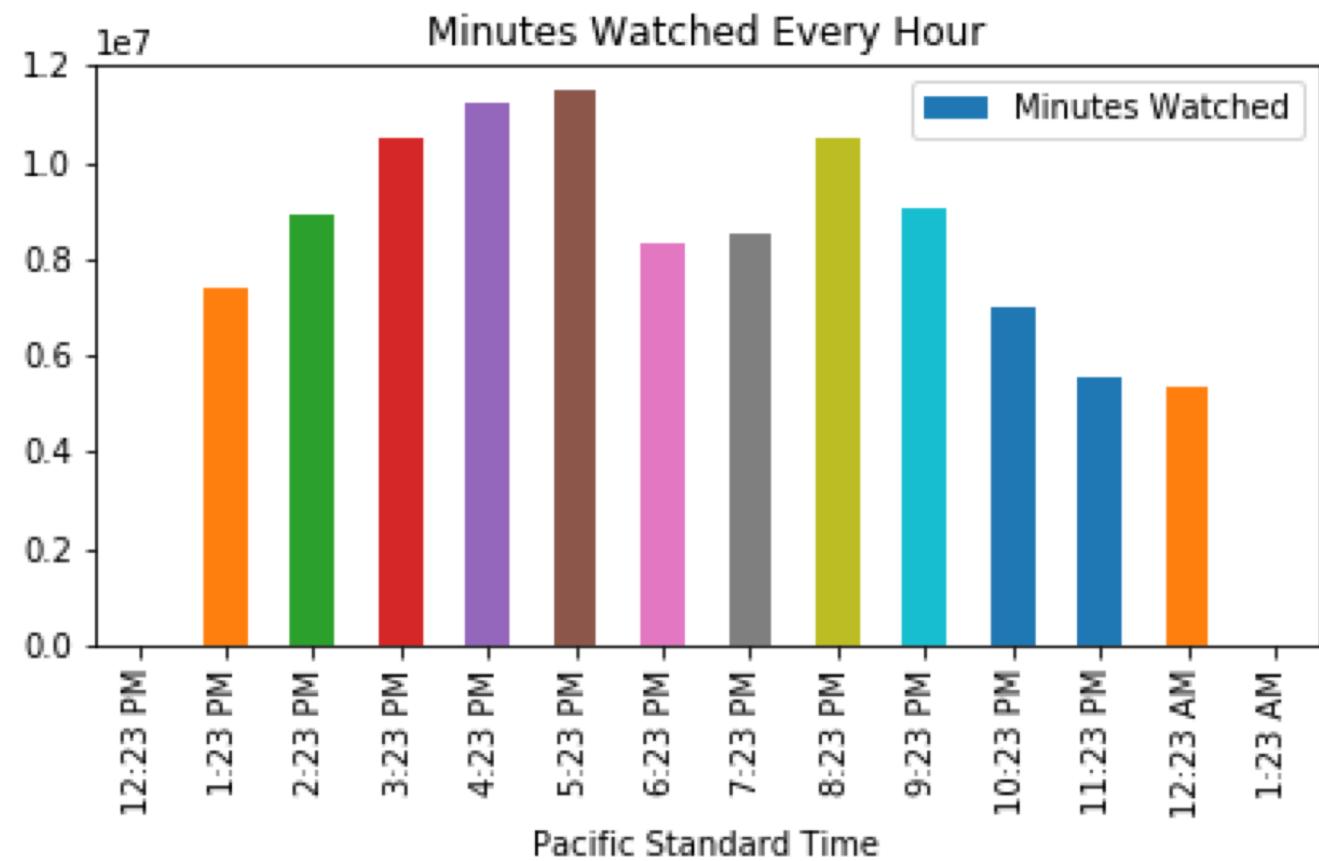


New Data

- Minutes Watched

	Pacific Standard Time	Total Views	Stream Viewers	Minutes Watched
0	12:23 PM	393500921	NaN	NaN
1	1:23 PM	393509466	122861.0	7371660.0
2	2:23 PM	394005259	148687.0	8921220.0
3	3:23 PM	394294748	175163.0	10509780.0
4	4:23 PM	394710151	186953.0	11217180.0
5	5:23 PM	395019218	190954.0	11457240.0
6	6:23 PM	395455032	138772.0	8326320.0
7	7:23 PM	395705528	142017.0	8521020.0
8	8:23 PM	396024213	175028.0	10501680.0
9	9:23 PM	396357748	150747.0	9044820.0
10	10:23 PM	396615944	116931.0	7015860.0
11	11:23 PM	396902582	92230.0	5533800.0
12	12:23 AM	397052498	89641.0	5378460.0
13	1:23 AM	397169436	NaN	NaN

Minutes Watched



Increase in Total Views	Total Minutes Watched	Least Amount of Viewers @ One Point	Most Amount of Viewers @ One Point	Average Amount of Viewers	
0	3,668,515.00	103,799,040.00	89,641.00	190,954.00	144,165.33

Summary Metrics

- Increase in Total Views on Channel: 3,668,515
- Total Minutes Watched : 103,799,040
- Least Viewers: 89,641
- Peak Viewers: 190,954
- Average Viewers: 144,165.33

How did you analyze the data on Jupyter Notebooks?

```
In [1]: #dependencies
```

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
```

```
In [2]: #bring in the csv and show what the file looks like
```

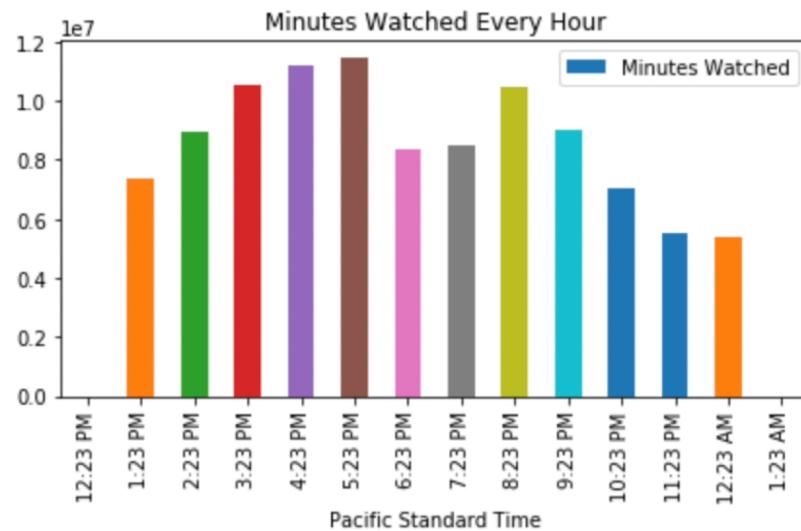
```
file_path = '/Users/ncabayan/Desktop/final_project_stuff/API_PULL/ninja_twitch_pull.csv'
file_path_df = pd.read_csv(file_path, encoding = 'UTF-8')
file_path_df
```

```
Out[2]:
```

	Unnamed: 0	time	total_views	stream_viewers
0	0	12:23 PM	393500921	NaN
1	0	1:23 PM	393509466	122861.0
2	0	2:23 PM	394005259	148687.0
3	0	3:23 PM	394294748	175163.0
4	0	4:23 PM	394710151	186953.0
5	0	5:23 PM	395019218	190954.0
6	0	6:23 PM	395455032	138772.0
7	0	7:23 PM	395705528	142017.0
8	0	8:23 PM	396024213	175028.0
9	0	9:23 PM	396357748	150747.0

Creating Content Analysis Graphs

```
In [22]: #graph that shows the change in minutes watched at every hourly ping  
#1:30to 5:30 pm our time saw a steady increase. This was 4:30 to 8:30pm when people were most likely at home preparing  
#for their new years plans.  
ninja_scrape.plot(kind = 'bar', x= 'Pacific Standard Time', y= 'Minutes Watched', grid = False, title = 'Minutes Watched'  
plt.tight_layout()  
plt.savefig('/Users/ncabayan/Desktop/final_project_stuff/Graphs/minutes_watched.png')  
plt.show()
```



How Did the Trivia Questions Perform?

Insights

People seem to only answer when they think they are correct.

Engagement rate was very low.
This could mean either:

Considering the amount of people to carryover from each question to the next, the questions weren't an efficient way to engage with the viewers.

The questions were too easy and in turn not engaging enough.

People didn't care about the prize. (Maybe bits aren't as popular as we thought.)

The trivia questions were not the best place to host a community forum.

Question 1: Total Votes	Question 1: Number of Questions Answered Correctly	Question 1: Number of Questions Answered Incorrectly	Question 1: Engagement Rate	Total Stream Viewers during Question 1
0	9569	8455	1114	6.44%

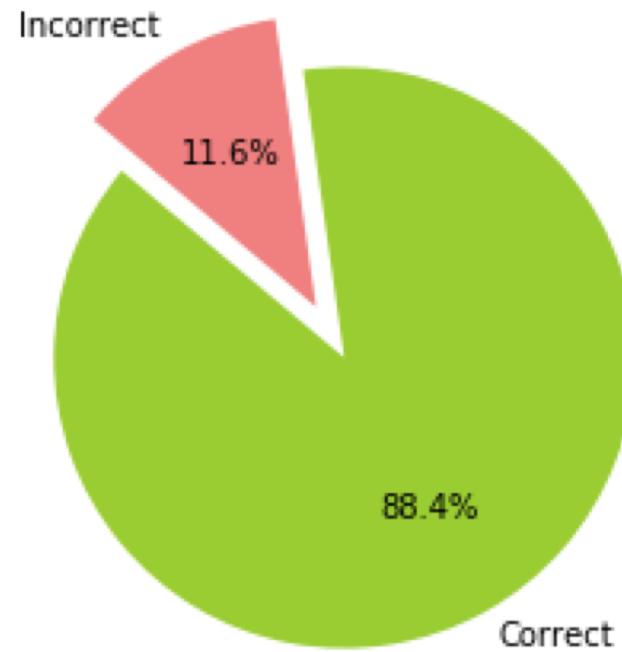
What was the first 'vehicle' introduced to Fortnite?

Twitch Trivia: Question 1

- **Total Votes: 9,569**
- **Number of Questions Answered Correctly: 8455**
- **Number of Questions Answered Incorrectly: 1114**
- **Engagement Rate: 6.44%**
- **Total Stream Viewers During Question: 148,687**

Question 1 Correct vs Incorrect

% Correct vs Incorrect - Question 1



Question 2: Total Votes	Question 2: Number of Questions Answered Correctly	Question 2: Number of Questions Answered Incorrectly	Question 2: Engagement Rate	Total Stream Viewers during Question 2
0	10381	9378	1003	5.55%

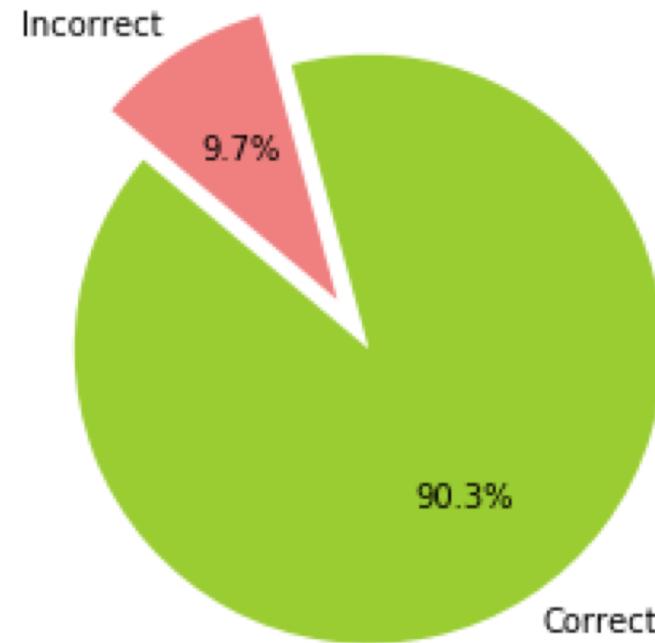
What dance did Ninja do to celebrate his first Battle Royale win?

Twitch Trivia: Question 2

- **Total Votes: 10,381**
- **Number of Questions Answered Correctly: 9,378**
- **Number of Questions Answered Incorrectly: 1,003**
- **Engagement Rate: 5.55%**
- **Total Stream Viewers During Question: 186,953**

Question 2
Correct
vs
Incorrect

% Correct vs Incorrect - Question 2



Question 3: Total Votes	Question 3: Number of Questions Answered Correctly	Question 3: Number of Questions Answered Incorrectly	Question 3: Engagement Rate	Total Stream Viewers during Question 3
0	4276	3578	698	2.44%

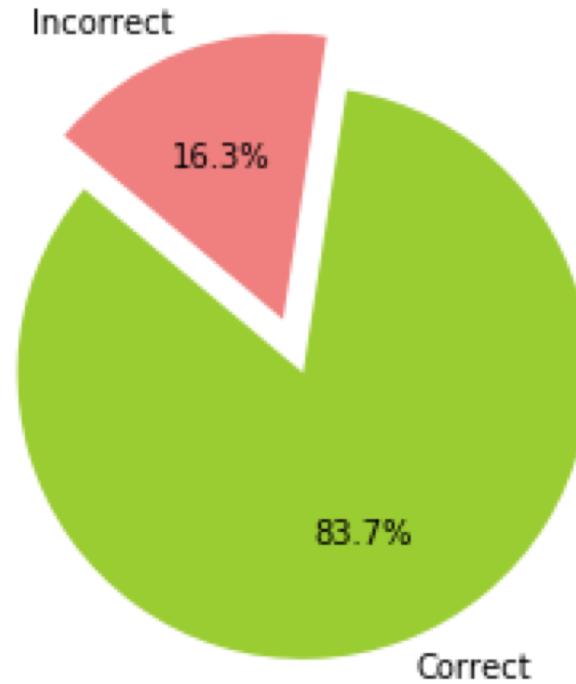
What are the three animal statues scattered across Fortnite?

Twitch Trivia: Question 3

- **Total Votes: 4,276**
- **Number of Questions Answered Correctly: 3,578**
- **Number of Questions Answered Incorrectly: 698**
- **Engagement Rate: 2.44%**
- **Total Stream Viewers During Question: 175,028**

Question 3
Correct
vs
Incorrect

% Correct vs Incorrect - Question 3



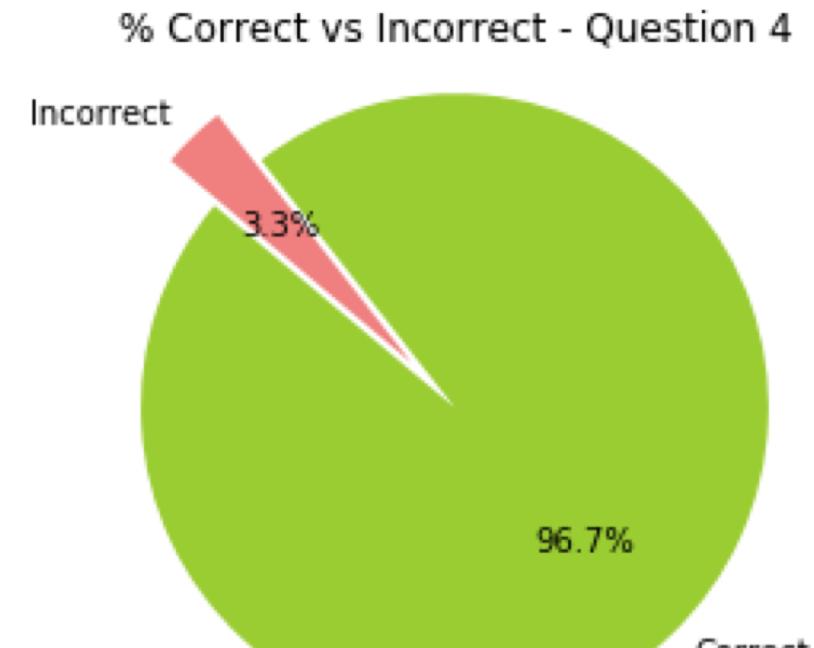
Question 4: Total Votes	Question 4: Number of Questions Answered Correctly	Question 4: Number of Questions Answered Incorrectly	Question 4: Engagement Rate	Total Stream Viewers during Question 4
0	3310	3200	110	3.69%

On March 14 2018 Ninja set a record for all time single player stream viewership while playing Fortnite with whom?

Twitch Trivia: Question 4

- **Total Votes: 3,310**
- **Number of Questions Answered Correctly: 3,200**
- **Number of Questions Answered Incorrectly: 110**
- **Engagement Rate: 3.69%**
- **Total Stream Viewers During Question: 89,641**

Question 4
Correct
vs
Incorrect



Number of people that participated in question 1 and then 2	Number of people that participated in question 2 and then 3	Number of people that participated in question 3 and then 4
0	2917	970

Trivia Questions Carryover

- Number of people that participated in question 1 & 2: 2,917
- Number of people that participated in question 2 & 3: 970
- Number of people that participated in question 3 & 4: 748

Trivia Questions Analysis Process

```
In [25]: #import question 1 csv
question1_csv = '/Users/ncabayan/Desktop/final_project_stuff/ninja_twitch_csv/question_1_twitch.csv'
question1_df = pd.read_csv(question1_csv, encoding = 'UTF-8')
question1_df.head()
```



Out[25]:

	What was the first 'vehicle' introduced to Fortnite?	Winner ID 1	Winner ID 2	VOTER ID 1	Voter ID 2
0	0. X-4 Stormwing	18366048.0	1.546294e+09	47862245	1546294341
1	1. All Terrante Kart	93088786.0	1.546294e+09	20985391	1546294296
2	2. Quadcrasher	146065234.0	1.546294e+09	114200165	1546294307
3	3. Shopping Cart	96318761.0	1.546294e+09	201592773	1546294299
4	12/31/18 16:11	162454656.0	1.546294e+09	198095313	1546294294

```
In [26]: question_1_vote_count = question1_df["Voter ID 2"].count()
question_1_vote_count
```

Out[26]: 9569

```
In [27]: question_1_winner_count = question1_df["Winner ID 1"].count()
question_1_winner_count
```

Out[27]: 8455

Things That Didn't Go So Well...



NIN 02:43:56

At the end of the day...

- **Difficulties:**
 - Getting Twitch trivia data
 - Figuring out what metrics I could pull from the two data sets that can be pulled for Twitch Stream Data
- **Things to do next time:**
 - Pull follower count from another API endpoint to see how net follower growth at the end of the stream
 - Analyze Twitch chat sentiment with NTLK 3.4

Any Questions?