



# Political Ads and Social Media Response

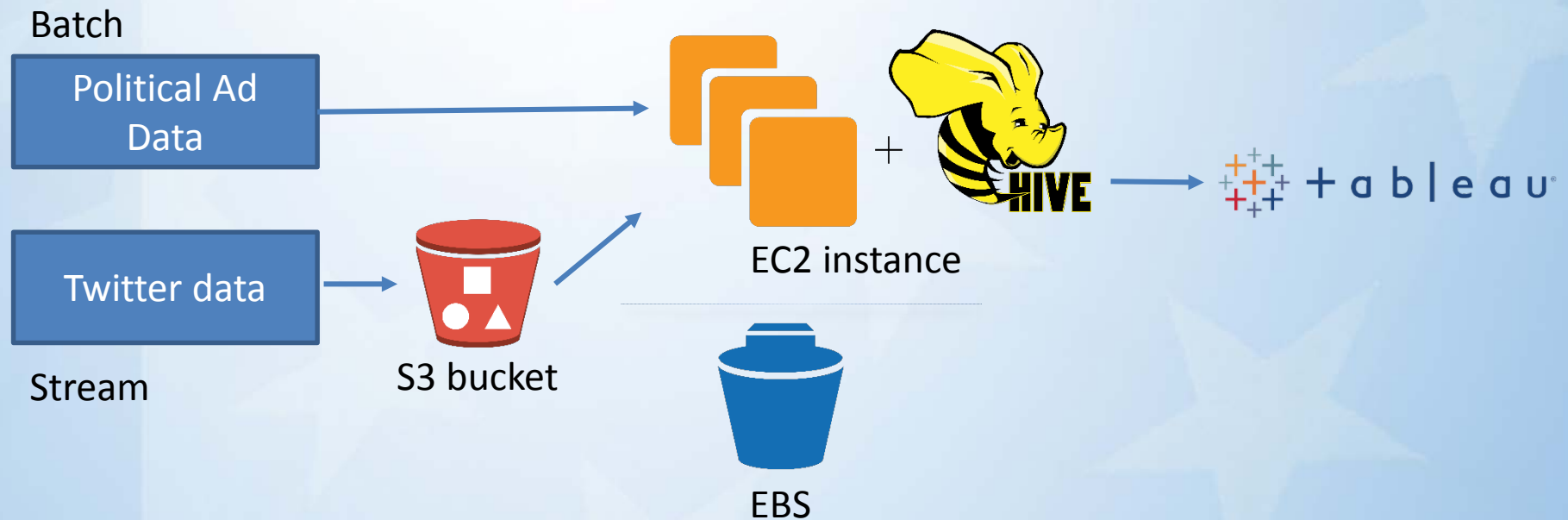
Jason Becker, Nalini Chandhi, Brian Schneider



# The Big Question

- Does TV advertising impact social media response about elections?
- Should political candidates continue to buy ad spots?
- Are some ads more effective at spurring Twitter activity than others?

# Architecture





# System Scale and Considerations

## Considerations:

- S3 - scalable and cost effective
- Hive - familiarity and easy connectivity to Tableau
- Tableau - custom geographies to draw DMAs

## Scale:

- S3 will scale automatically, we can delete aged data to save cost
- Can add more EC2 nodes to the cluster to handle large data volumes



# Challenges

- Twitter stream data volume
- Parsing nested JSON format of tweets
- Tweet location data mapping to DMA (Designated Market Area)
- Time attribution of tweets to political Ads





# Special Tech

- DMA name matching - *difflib.SequenceMatcher*
- Sentiment Analysis - *TextBlob:sentence.sentiment.polarity*
- Bot Detection - *BotOrNot by Truthy*
- Tableau polygons for DMAs

```
import botornot
import pandas as pd

twitter_app_auth = {
    'consumer_key': 'SwtSzHjTH7cUEH5MZLrturc',
    'consumer_secret': 'Df9GaO2Qp8DJSKEvYxM',
    'access_token': '799126415597715456-Yee',
    'access_token_secret': 'i4y5xyXevTKoRjL'
}

bon = botornot.BotOrNot(**twitter_app_auth)
```

```
#Sentiment analysis of each tweet for subjectivity and polarity
```

```
load_df['subjectivity'] = [max([x.subjectivity for x in TextBlob(y).sentences]) for y in load_df['text']]
```

```
load_df['polarity'] = [max([x.polarity for x in TextBlob(y).sentences]) for y in load_df['text']]
```

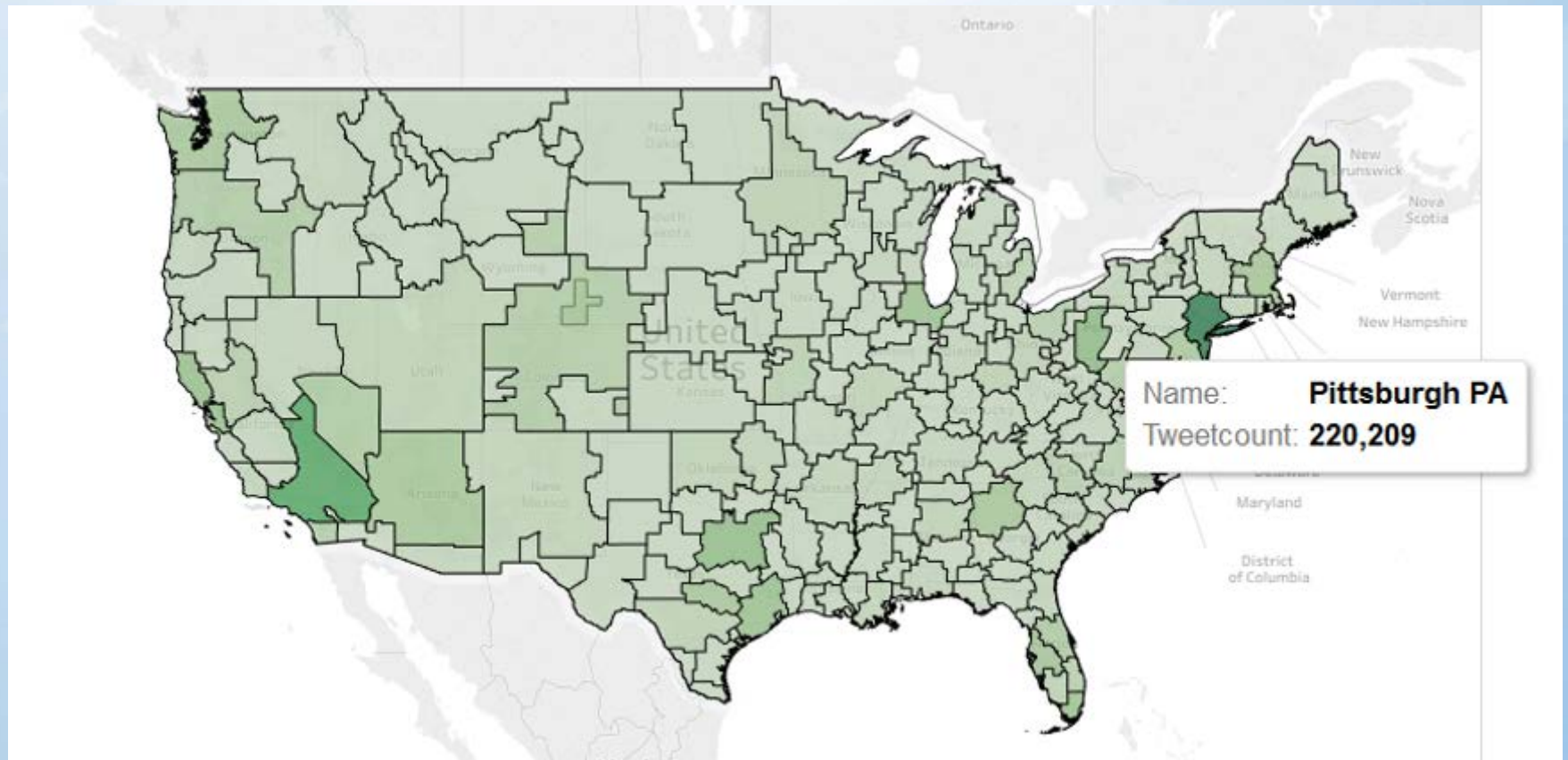
San Francisco-Oakland-San Jose, CA	San Francisco-Oakland-San Jose CA
Phoenix-Prescott, AZ	Phoenix (Prescott) AZ
Boston, MA/Manchester, NH	Boston MA (Manchester NH)
Cincinnati, OH	Cincinnati OH
Norfolk-Portsmouth-Newport News, VA	Norfolk-Portsmouth-Newport News VA
Norfolk-Portsmouth-Newport News, NC	Norfolk-Portsmouth-Newport News NC
Greenville-Spartanburg, SC/Asheville-Anderson, NC	Greenville-Spartanburg SC-Asheville NC-Anderson SC

# Data Analysis – Ads and Sentiment





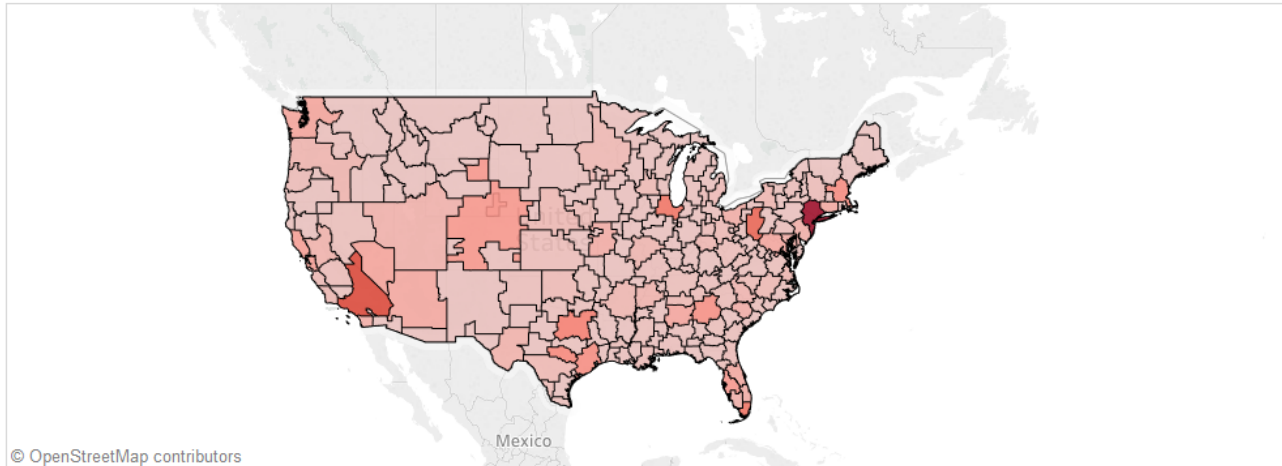
# Data Analysis – Markets and Tweets



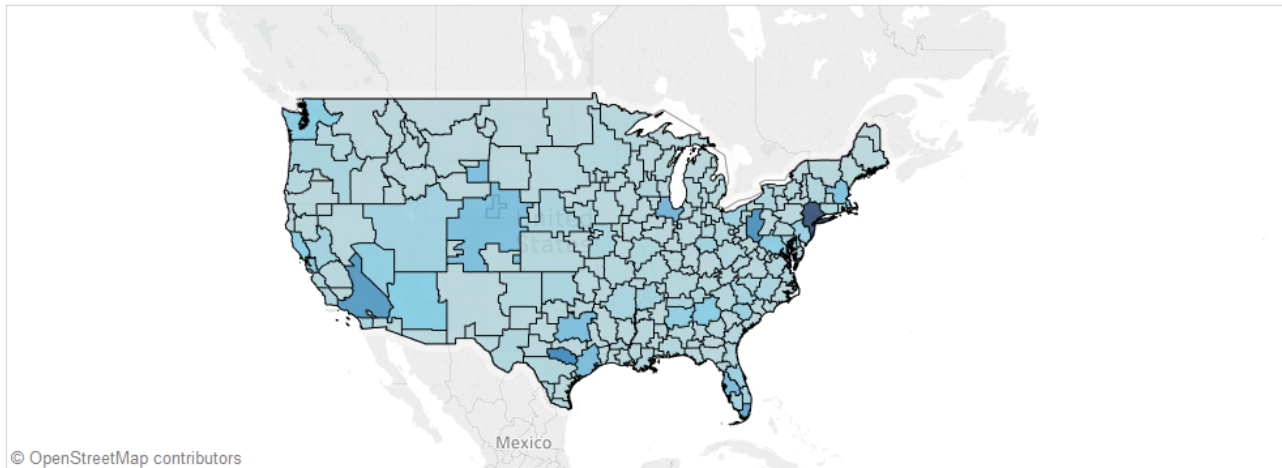


# Data Analysis – Candidates and Bots

Trump Bot Tweets- Markets

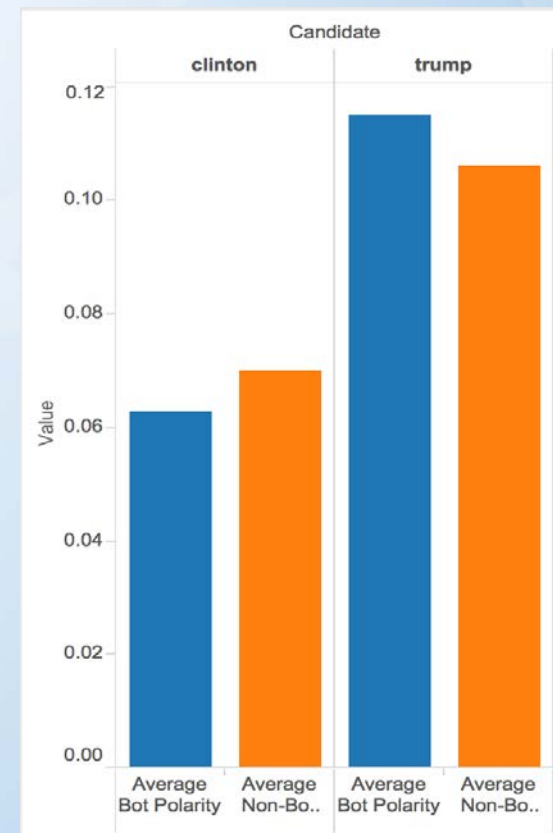
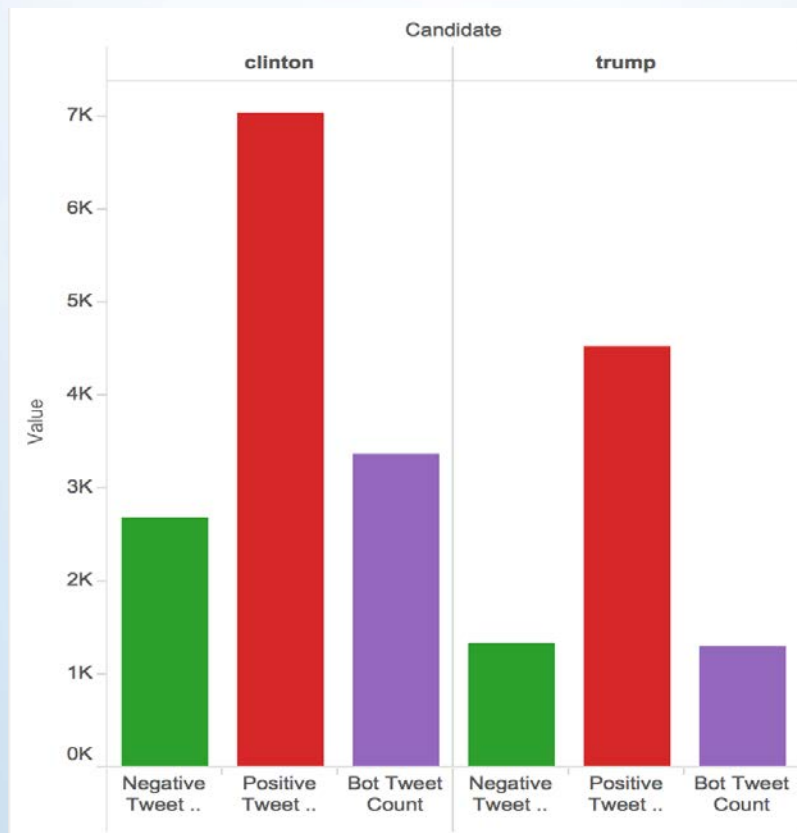


Hillary Bot Tweets - Markets



# Data Analysis – Bot Bias

Clinton mentioned heavily by bots -- negatively



# Data Analysis – Bot vs Non-Bot

## Bot vs Non-Bot sentiment Polarity





## Next Steps

- Collect other social media data like Facebook, blogs
- Customize the solution for other elections
- Improved Bot Detection
- Refined Sentiment Analysis