



Twitter US Airline Sentiment Analysis

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MGSC 410

Appendix:

Information of the Dataset

- Twitter data was scraped from February of 2015 and contributors were asked to first classify positive, negative, and neutral tweets, followed by categorizing negative reasons (such as "late flight" or "rude service").
- Dataset will help pinpoint each airlines biggest complain and develop strategies to mitigate the complaints
- **Worked on the dataset on "Excel"**

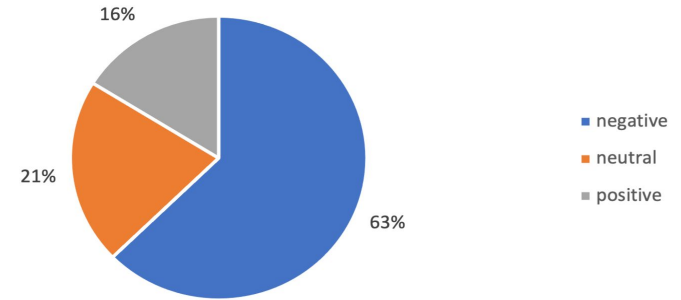
Data Cleaning

- Removed tweet_id, airline_sentiment_gold, negative_reason_gold, tweet_cord, tweet_created
- Deleting NULL/Blank variables throughout the dataset

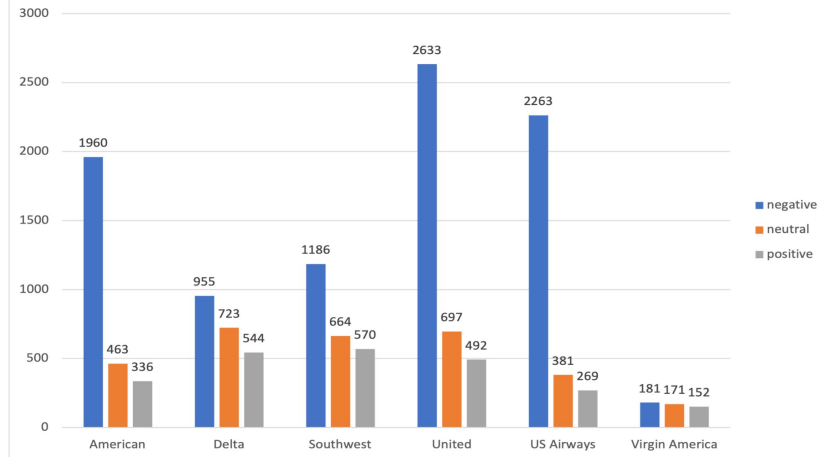
Insight Report: Findings

- **63%** (9178 out of 14640) of all sentiments were negative
 - **21%** (3099 out of 14640) of all sentiments were neutral
 - **16%** (2363 out of 14640) of all sentiments were positive
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- American Airlines, United, and US Airways suffered with the largest amount of negative sentiments in proportion to their total sentiments per airline.
 - American (71% of all sentiments)
 - United (69% of all sentiments)
 - US Airways (78% of all sentiments)

Percentage of Positive, Neutral, and Negative Sentiment across all Airlines



Number of Positive, Neutral, and Negative Sentiments per Airline



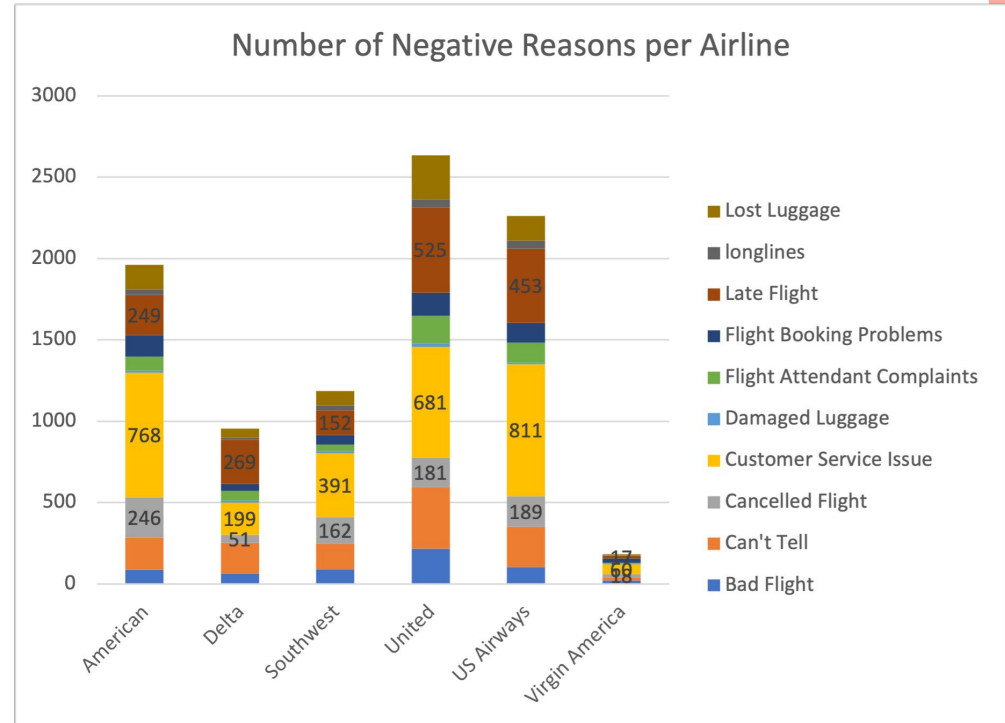
Insight Report: Findings

- 31.7% (2910 of 9178) of all negative sentiments revolve around **Customer Service Issues**
 - 39% (768 of 1960) of American Airlines negative sentiments come from **Customer Service Issues**
 - 36% (811 of 2263) of US Airways negative sentiments come from **Customer Service Issues**
 - 33% (391 of 1186) of Southwest negative sentiments come from **Customer Service Issues**

| Count of negativereason | Column Labels | | | | | | |
|-------------------------------|---------------|------------|-------------|-------------|-------------|----------------|-------------|
| Row Labels | American | Delta | Southwest | United | US Airways | Virgin America | Grand Total |
| Bad Flight | 87 | 64 | 90 | 216 | 104 | 19 | 580 |
| Can't Tell | 198 | 186 | 159 | 379 | 246 | 22 | 1190 |
| Cancelled Flight | 246 | 51 | 162 | 181 | 189 | 18 | 847 |
| Customer Service Issue | 768 | 199 | 391 | 681 | 811 | 60 | 2910 |
| Damaged Luggage | 12 | 11 | 14 | 22 | 11 | 4 | 74 |
| Flight Attendant Complaints | 87 | 60 | 38 | 168 | 123 | 5 | 481 |
| Flight Booking Problems | 130 | 44 | 61 | 144 | 122 | 28 | 529 |
| Late Flight | 249 | 269 | 152 | 525 | 453 | 17 | 1665 |
| longlines | 34 | 14 | 29 | 48 | 50 | 3 | 178 |
| Lost Luggage | 149 | 57 | 90 | 269 | 154 | 5 | 724 |
| Grand Total | 1960 | 955 | 1186 | 2633 | 2263 | 181 | 9178 |

Insight Report: Findings

- Ranking second in highest number of negative reasons is **Late Flight** and **Cancelled Flight**
- Customer Service Issues stem from a Late Flights and Cancelled Flights which could explain why Customer Services Issues rank the highest



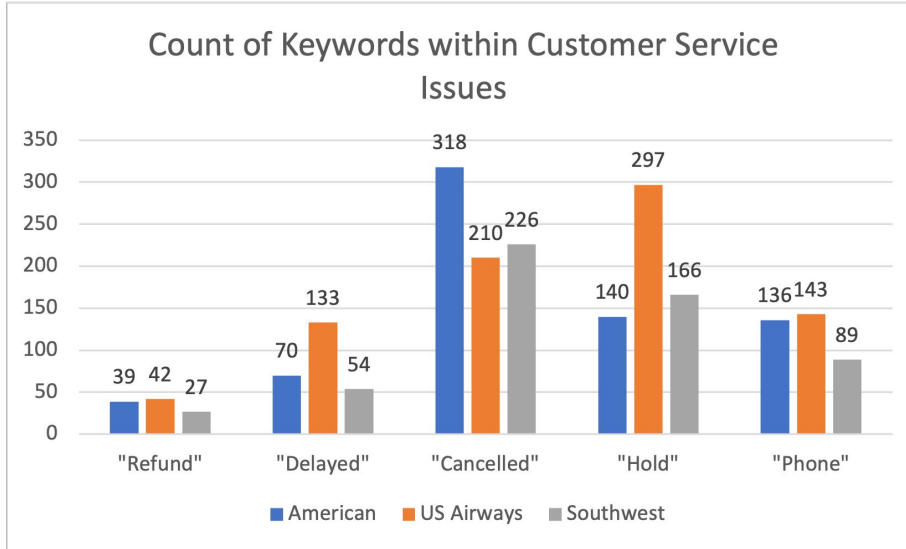
Insight Report: Analysis

Question: How much of Customer Service Issues overlap with the 2 other top negative reasons per Airline?

- Observed that many of the tweets revolving **Customer Service Issues** contained key words pertaining to phone calls not being answered or left on hold. Among these tweets, some mentioned the other top 2 negative reasons being **Late Flights** and **Cancelled Flights**
- From this observation, the overlap between customer service issues and late/cancelled flights would be noticed to see which issue is a more pressing issue that causes more negative responses

| | "Refund" | "Delayed" | "Cancelled" | "Hold" | "Phone" |
|------------|----------|-----------|-------------|--------|---------|
| American | 39 | 70 | 318 | 140 | 136 |
| US Airways | 42 | 133 | 210 | 297 | 143 |
| Southwest | 27 | 54 | 226 | 166 | 89 |

Insight Report: Analysis



- 41% of American Airlines Customer Service Issues stemmed from "Cancelled Flights"
- 37% of US Airways Customer Service Issues stemmed from "Hold"
- 58% of Southwest Customer Service Issues stemmed from "Cancelled Flights"

Insight Report: Analysis

- Since the dataset will help pinpoint each airlines biggest complain and develop strategies to mitigate the complaints, the data shows in which aspect the 3 airlines (American, US Airways, Southwest) that ranked highest in negative sentiments towards customer service issues should focus on to mitigate the number of negative sentiments
 - Both American Airlines and Southwest should put more effort in overall customer service satisfaction when it comes to cancelled flights
 - US Airways should improve their customer service by putting customers on shorter hold while on the phone
- Because several of the negative reasons for negative sentiments fall under the same “umbrella” as Customer Service Issues, focusing on the issues ranked from the keywords will help reduce issues in multiple aspects at the same time
 - This would also apply for the other 3 airlines that weren't mentioned

Action Steps

1. Cleaned the dataset through deleting unwanted columns and rows
2. Created multiple pivot tables highlighting each airline's sentiments and their reasons
3. Created charts to visualize my data
4. Developed an in-depth question I was interested in solving after analyzing my initial findings
5. Wrote an analysis according to the data and charts to come up with a possible solution for airlines to mitigate negative sentiments