



Digital Signage Pilot Program Recommendations

Nate DiRenzo

Scope

- Clients:
 - [Outfront Media, MTA Construction & Development \(C&D\)](#)
- Key Deliverables:
 - Analysis of subway turnstile data from 2021 highlighting system-wide patterns, changes over time, and top stations by borough.
 - Interactive map with detailed 2020 NTA Census Data and Traffic by Subway Station
- Rationale
 - Leverage insights to inform rollout for digital signage pilot program.
 - Price ad space based on insights gained from combination of traffic & demographic data.

Methodology and Tools

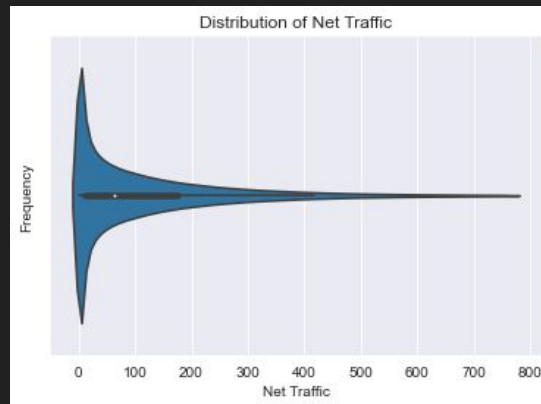
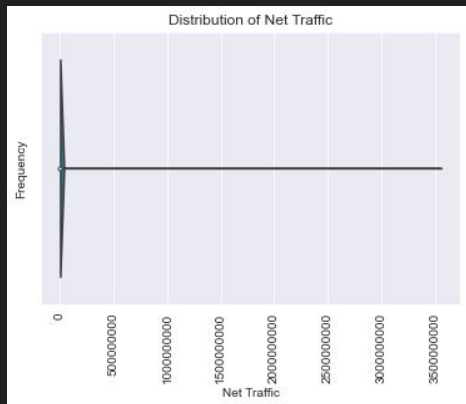
- Ingestion:
 - SQLite + SQLAlchemy
- Data Storage & Manipulation:
 - Pandas + Geopandas
 - Fuzzywuzzy
 - Numpy
- Visualization
 - Matplotlib
 - Seaborn
 - Leafmap
 - Geopandas

Data Sources

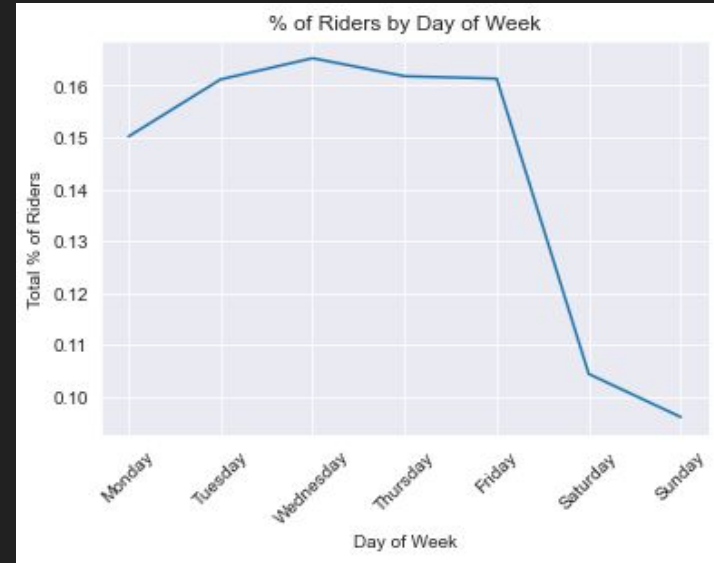
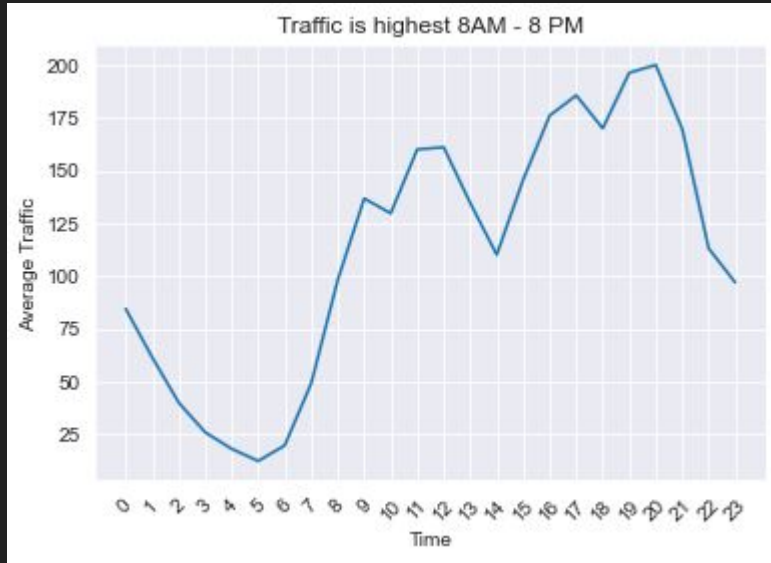
- [MTA Turnstile Data](#)
- [Station Geographic Information](#)
- [2020 NYC NTA Shapefiles](#)
- [NYC Demographic Information by NTA - 2019](#)

Understanding the Data

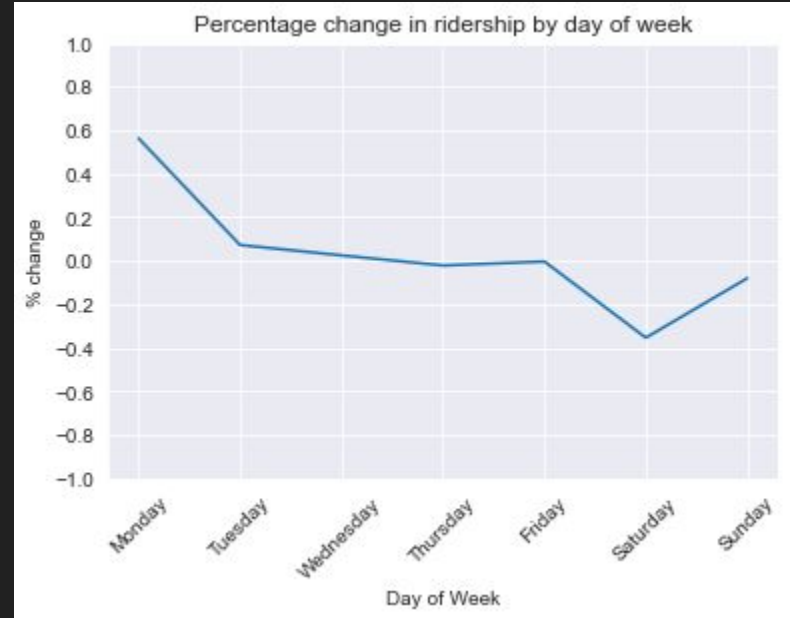
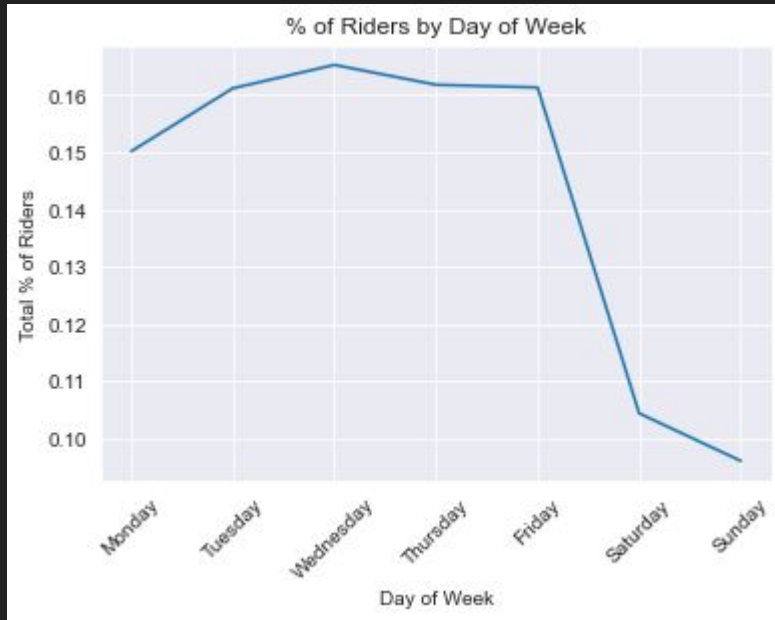
- Majority of observations below 100, with some (obviously erroneous) observations into the billions
- Reducing data to the 99th percentile eliminated the most egregious outliers.



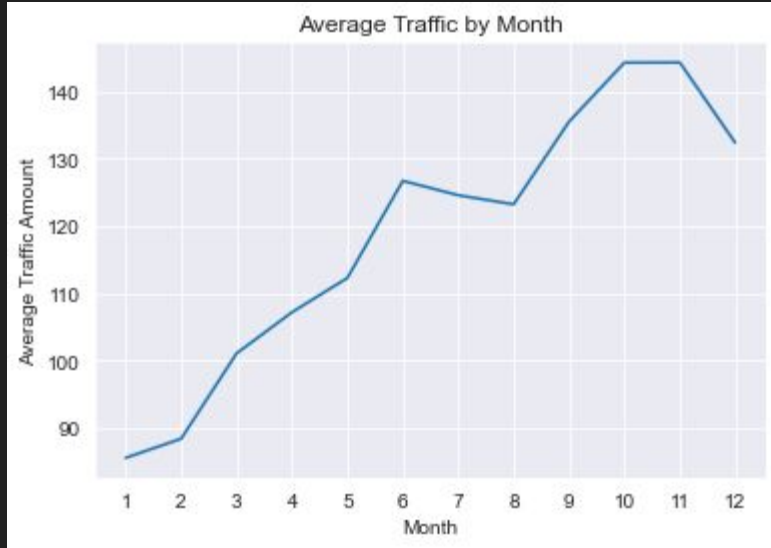
System-Level Insights



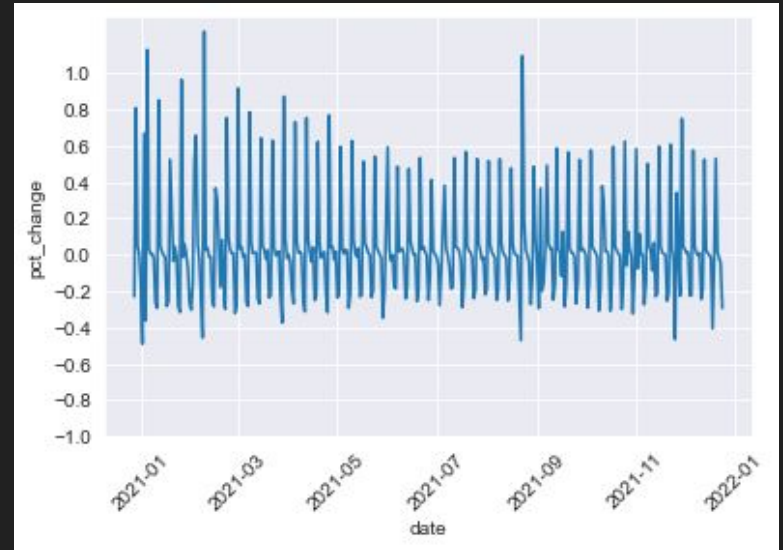
System-Level Insights



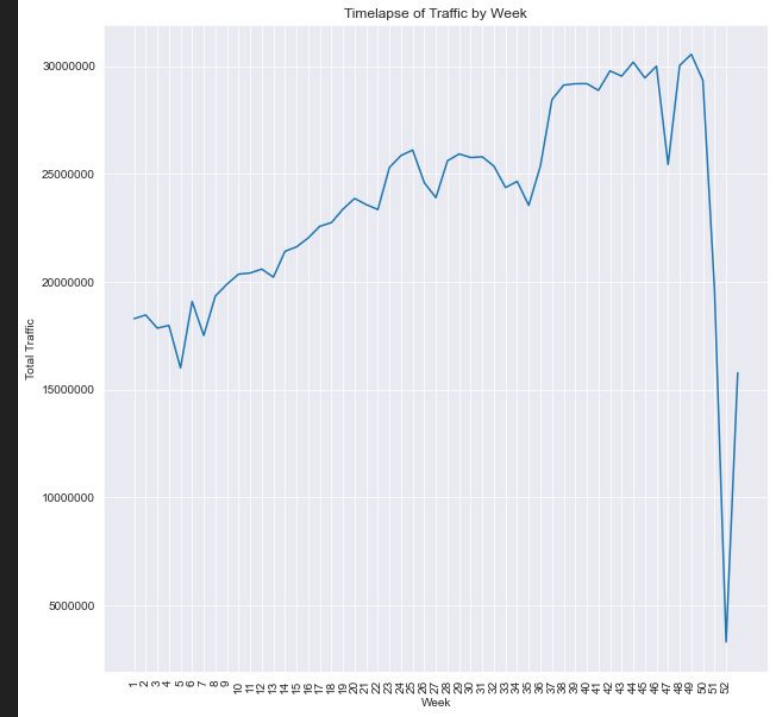
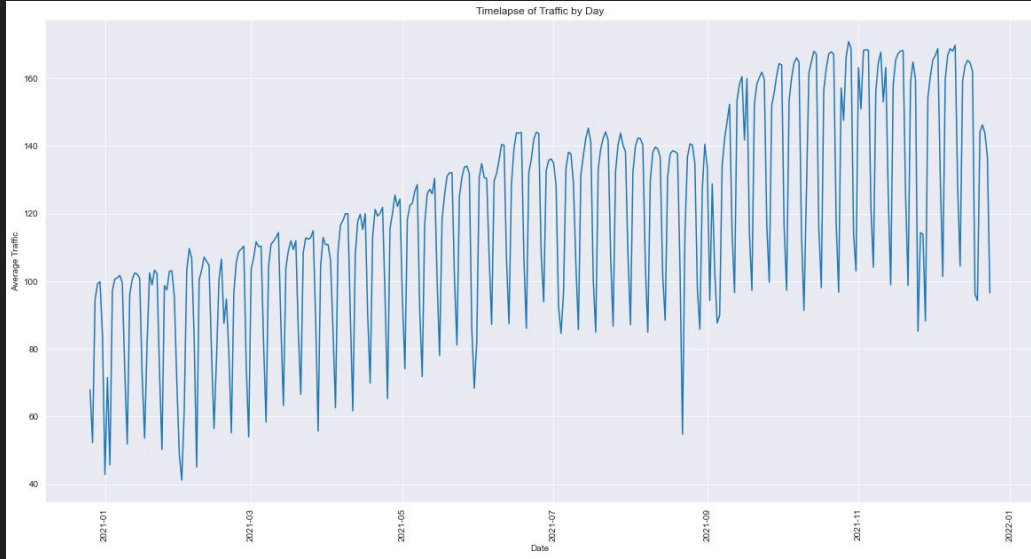
System-Level Insights



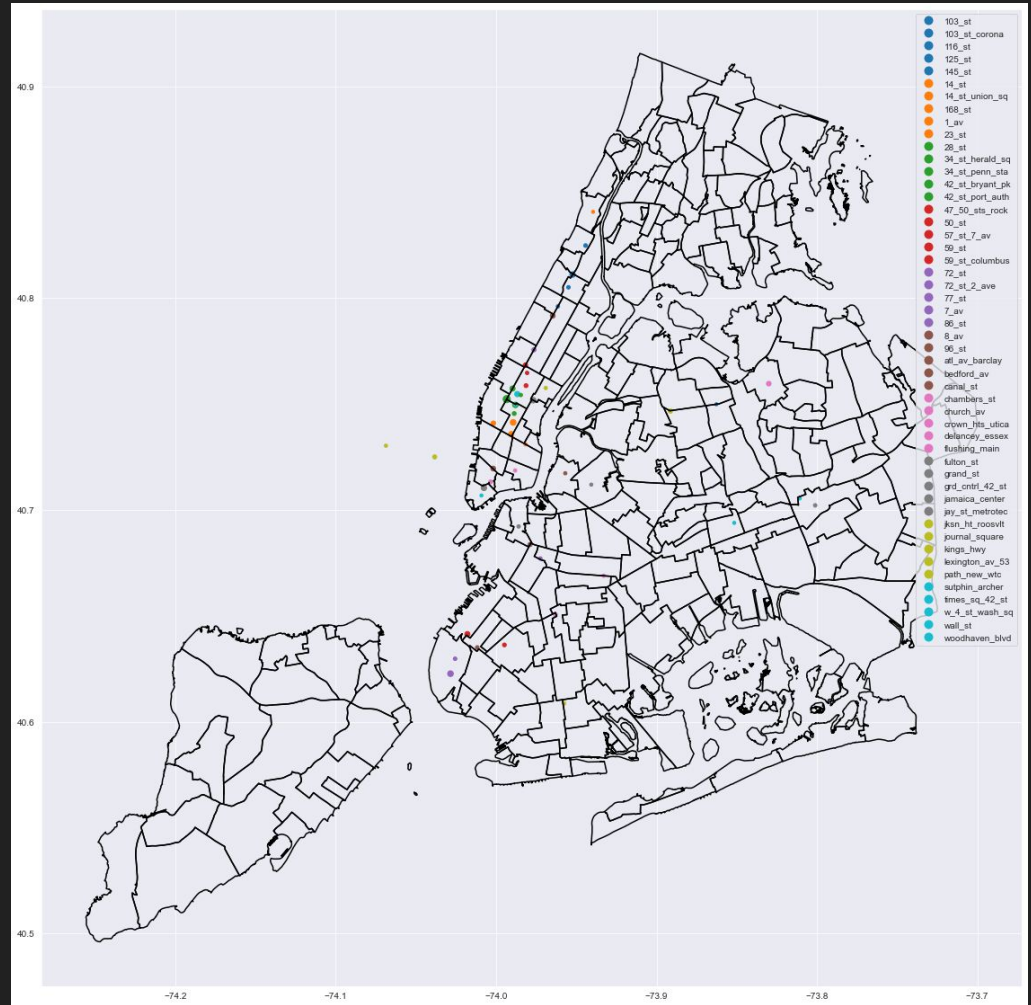
System-Level Insights



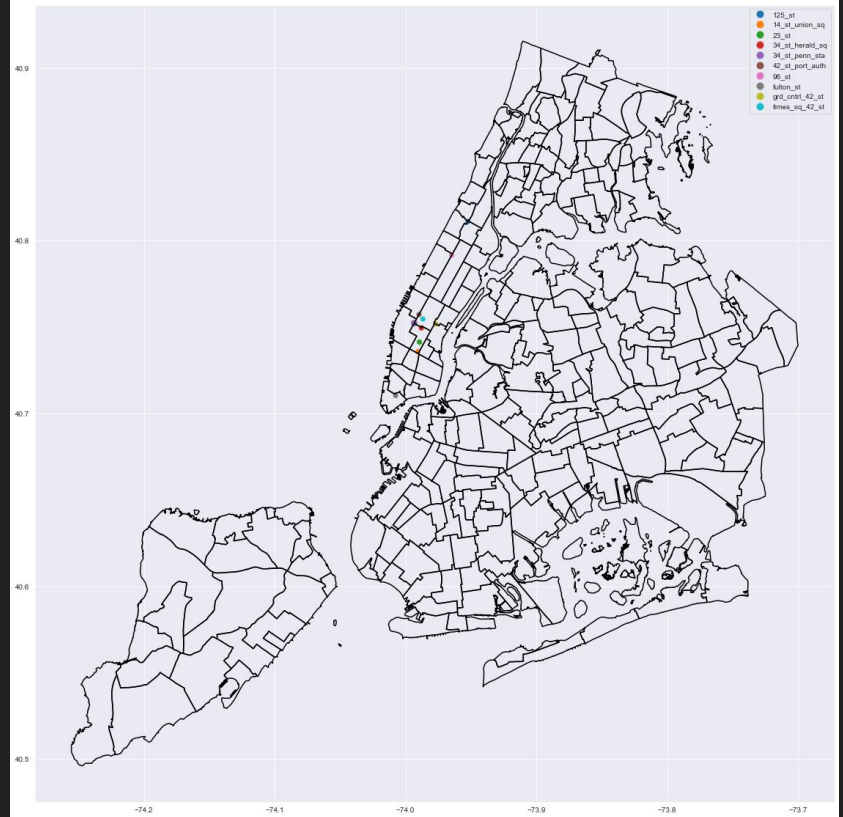
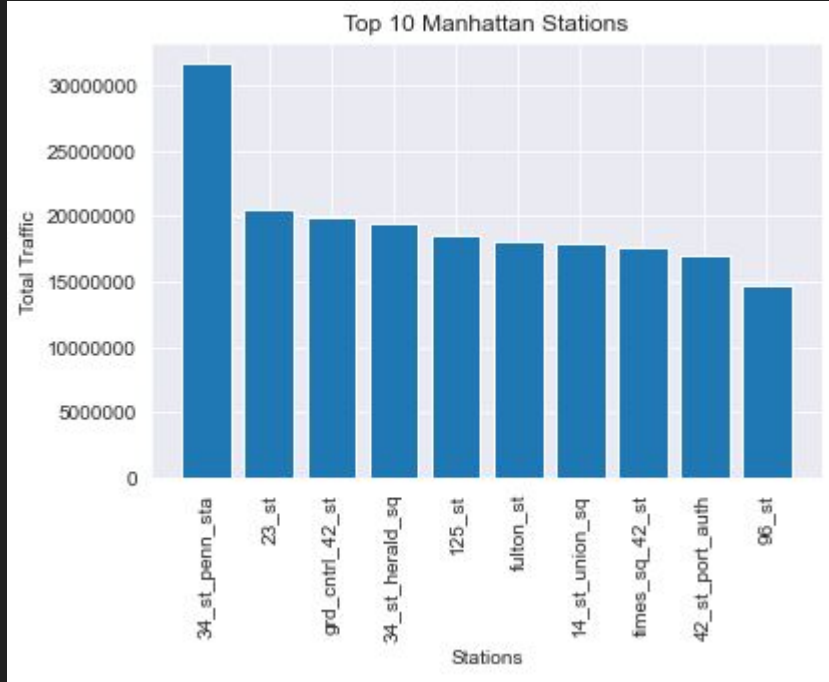
System-Level Insights



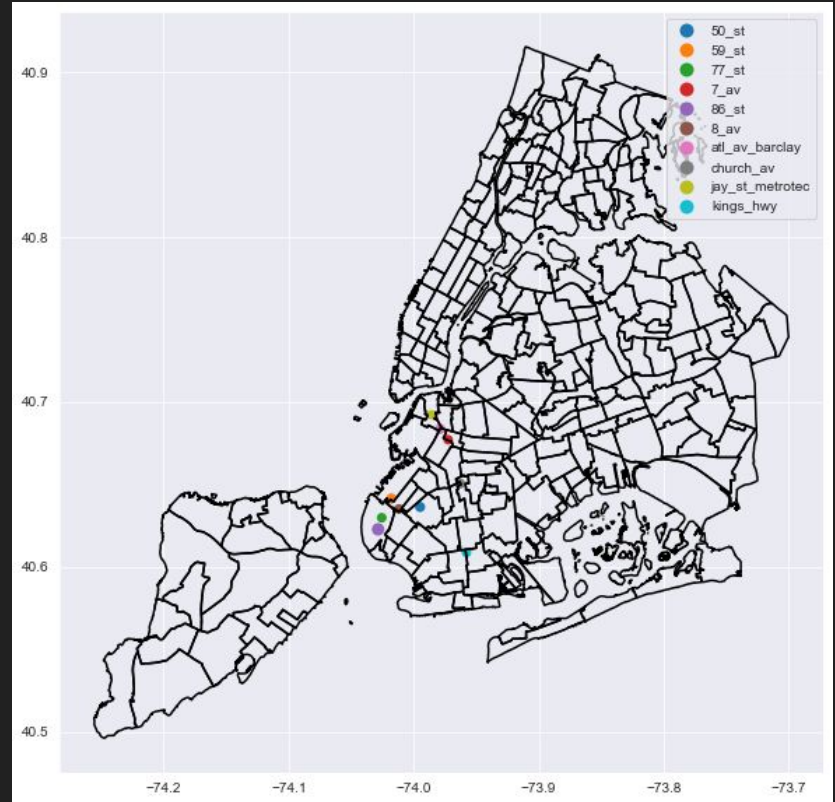
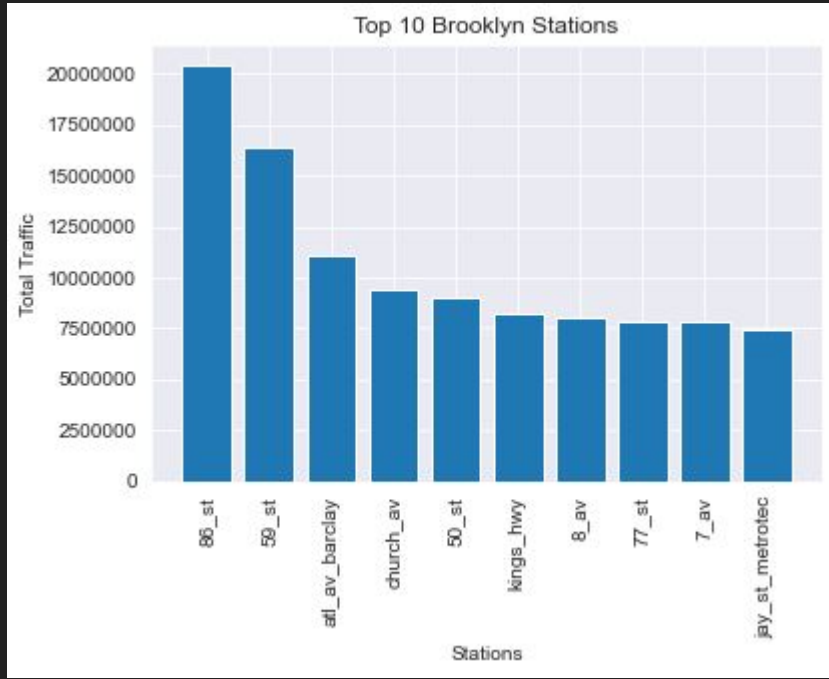
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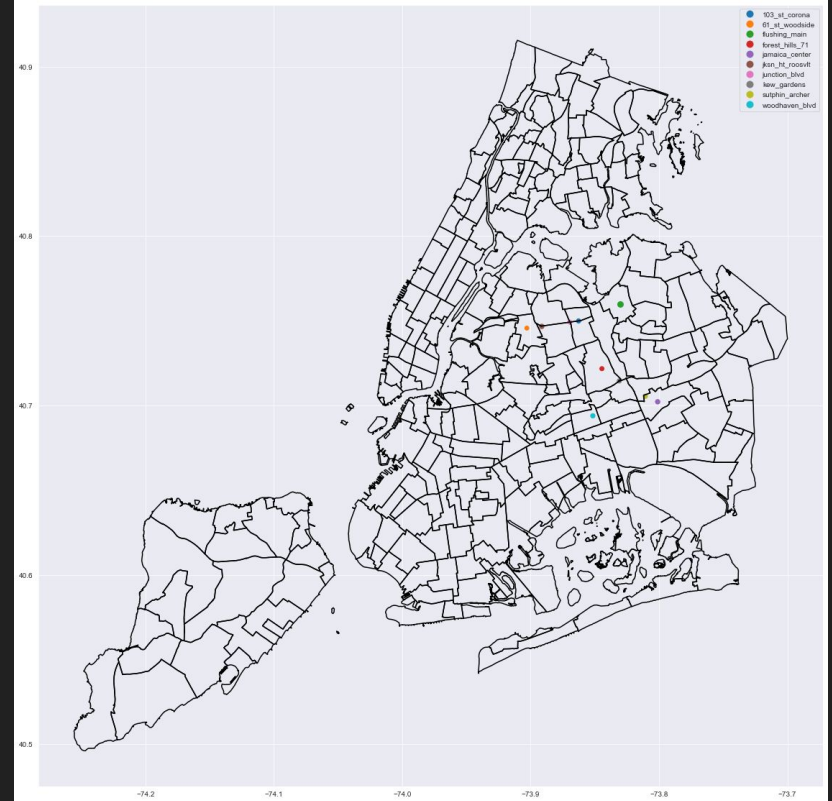
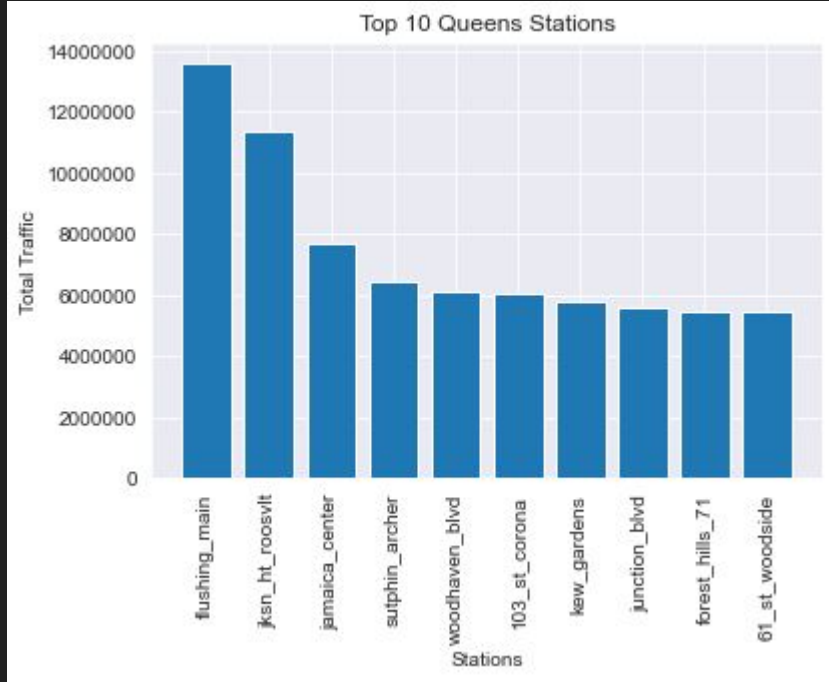
Borough-Level Insights - Manhattan



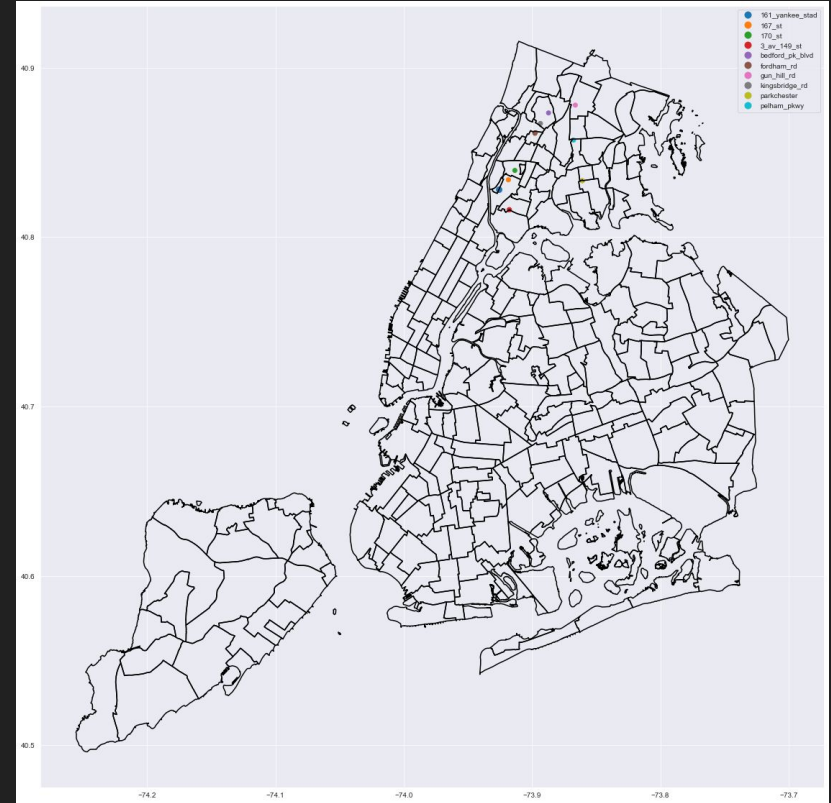
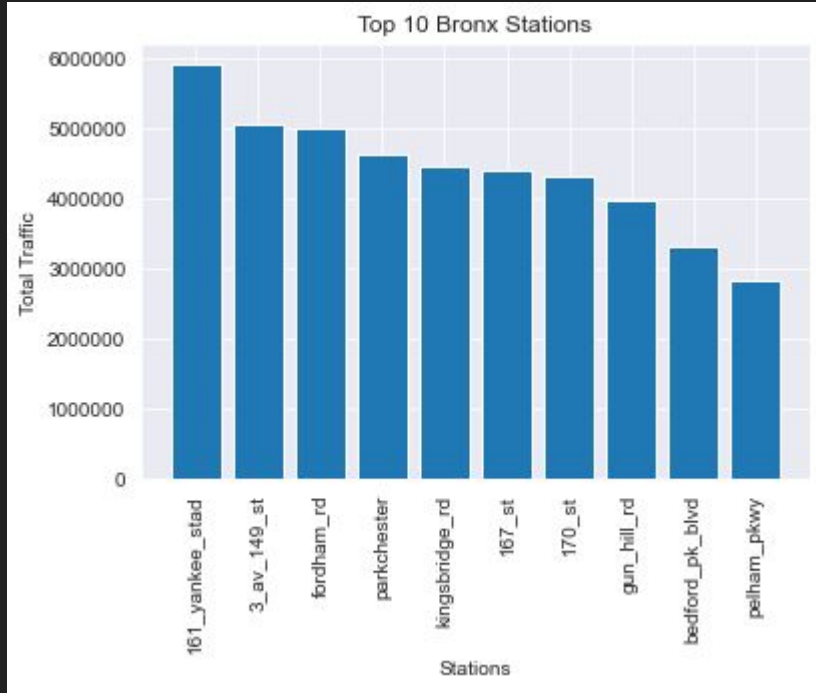
Borough-Level Insights - Brooklyn



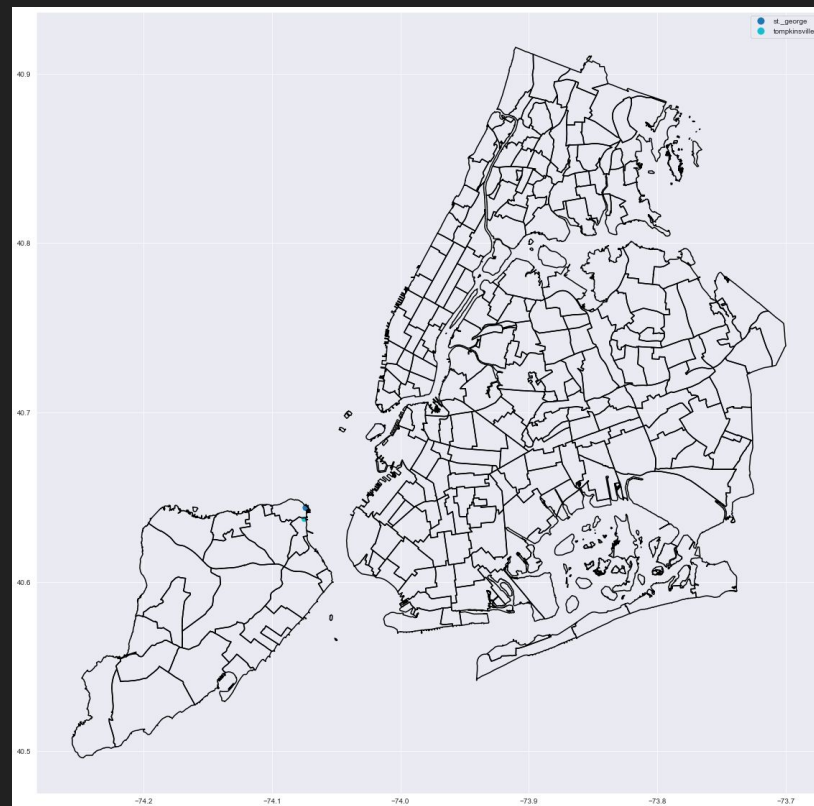
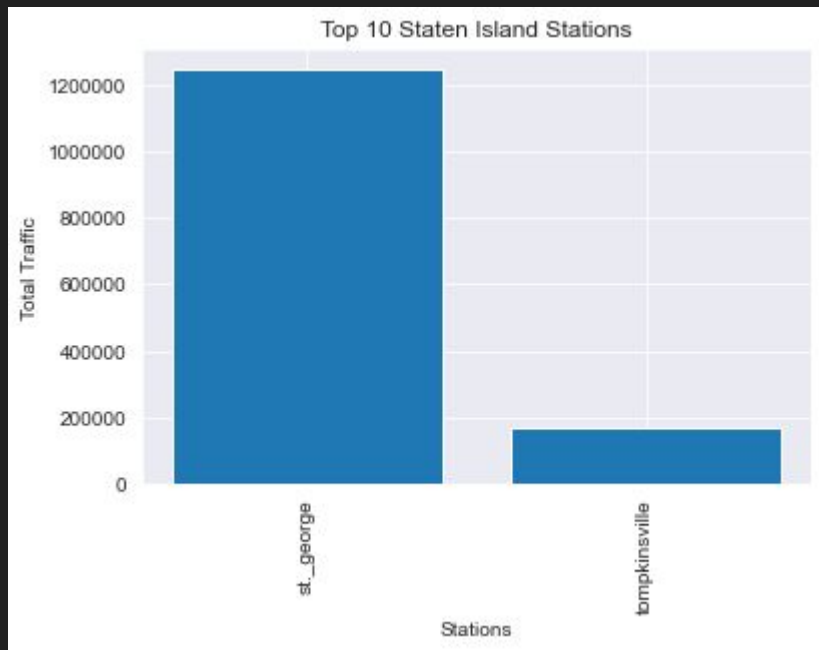
Borough-Level Insights - Queens



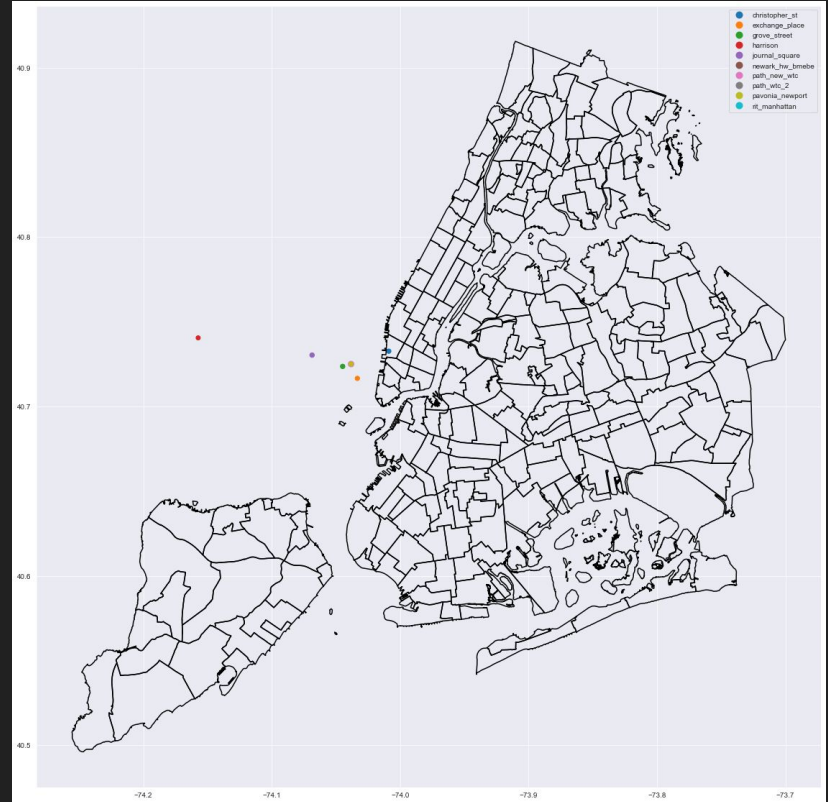
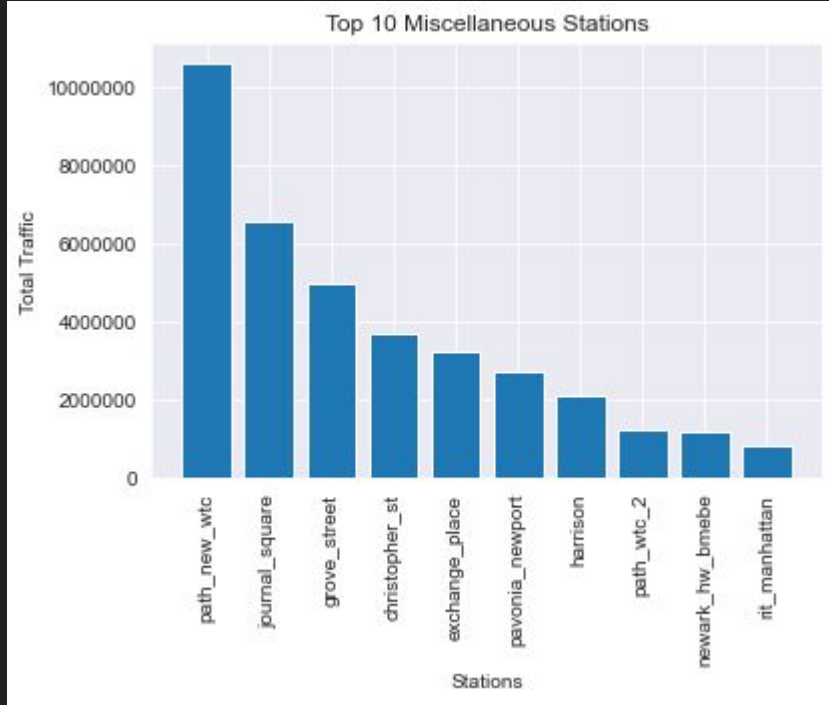
Borough-Level Insights - The Bronx



Borough-Level Insights - Staten Island



Insights - Miscellaneous Stations



Interactive Map

[LocalHost Link](#) (published with Voila!)

Conclusions

- A small number of stations account for a significant amount of system traffic.
- Traffic is highest 8-12, 4-8
- Weekdays account for ~85% of traffic. Weekend traffic always low.
- June - November have the highest traffic. August - October even moreso.
- Major holidays see major decreases in traffic (Thanksgiving, Christmas, New Year)
- Highest traffic stations are hubs with many lines/transfer points. Connections to commuter transportation accounting for a major portion of subway traffic.

Further Engagement

- Detailed Station-level analysis
- More granular cleaning of the dataset
- Streamlining Census Data & building out Interactive Map

Thank You!