

The Healthy Ride program is operated by Pittsburgh Bike Share

The program is a 501@3 non-profit

Service began December 2012;

Raised capital of about \$1.6M in 2013

Rideshare system piloted in 2015 reaching up to 50 stations across the Pittsburgh area

Their mission is to provide "joyful, sustainable, and affordable mobility service to residence and visitors

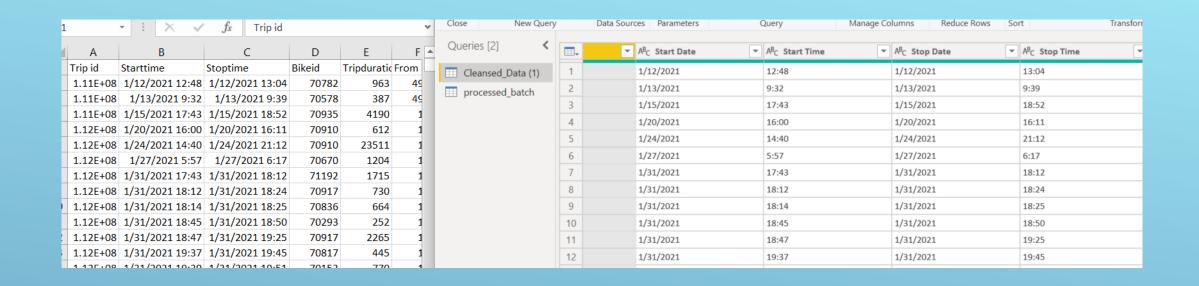
Cost is based on User Type: Customers (pay as you go) pay \$2 /30 min; Subscribers pay either \$12 per mo./unlimited 30 min ride or \$20 per mo./unlimited 60 min ride

#### **BRIEF HISTORY**

```
import pandas as pd
       1) pandas reading csv dataset
       df = pd.read_csv(r"C:/Users/
                                                                               'Healthy_Ride_Data.csv",header = 0)
       2) Calculated column Tripduration from seconds to Minutes
        3) New calculated 'Tripduration' column
       ▶ print(df.Tripduration)
                   16.050000
                    6.450000
                   69.833333
                   10.200000
                  391.850000
          14614
                   13.650000
                   16.666667
          14616
                   1.700000
          14617
                   11.533333
          14618
                  15.300000
          Name: Tripduration, Length: 14619, dtype: float64
       4) New dataframe assigned while removing rows with 'na' values
In [9]: ⋈ # splitting columns Starttime & Stoptime
          new df2=new df["Starttime"] str snlit(" " n=1 exnand = True)
```

# CLEANSING DATA (PYTHON)

Python script to read csv dataset and begin cleaning process of data

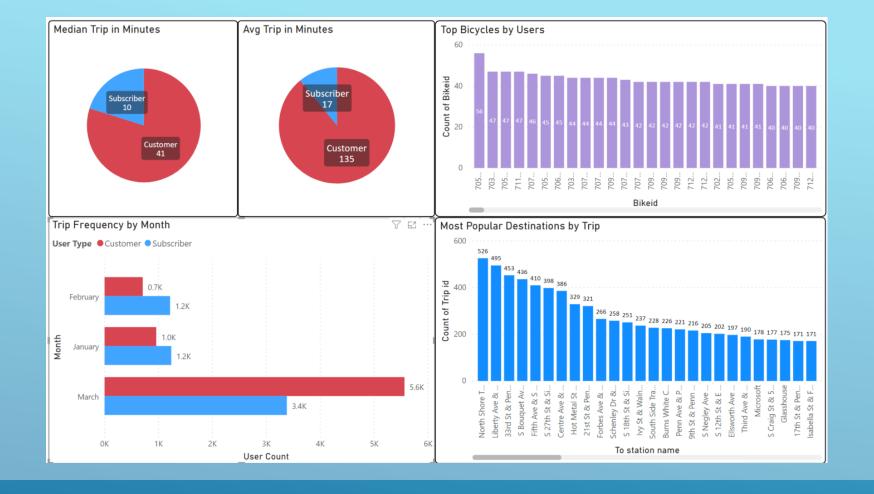


## DATA MANIPULATION (DAX & POWER QUERY)

Used Power Query and DAX for parsing cleansed data set columns:

Left is original csv dataset with columns B and C as date/time.

Right is cleansed data set with columns B and C parsed into individual date and time columns and data type for easier aggregation



Power BI Visualization:

Median Trip Duration in minutes

Avg Trip Duration in minutes

Trip Frequency by Month

Top Bicycles by Users

Most Popular Destination by Trip



Power BI Visualization:

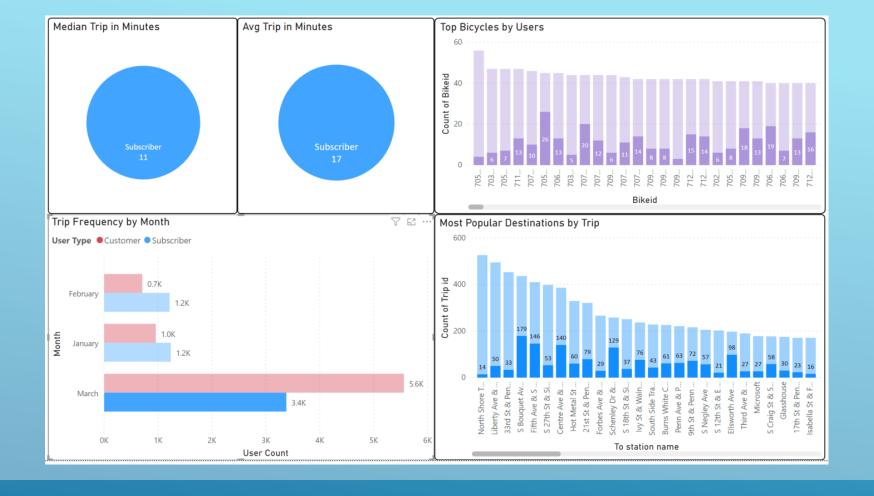
Median Trip Duration in minutes

Avg Trip Duration in minutes

Trip Frequency by Month

Top Bicycles by Users

Most Popular Destination by Trip



Power BI Visualization:
Median Trip Duration in minutes
Avg Trip Duration in minutes
Trip Frequency by Month
Top Bicycles by Users
Most Popular Destination by Trip

## SO WHY IS THIS IMPORTANT?



Customer Reviews	Classification	Numeric Value	Confidence
The bikes got us around, but not the best biking / rental experie	Positive	1	0.973
The bikes themselves though felt quite unstable to me. The ha	Negative	-1	0.585
At one station we accidentally tried to unlock a bike that was o	Negative	-1	0.943
Anyways - I appreciate the fact that there were / are bikes to re	Positive	1	0.641
Finally, saw a lot of stations that had 0 to a few bikes, but then	Negative	-1	0.618
I experienced a fairly carefree process in downloading the app,	Positive	1	0.621
The next bike app is 24 MB, so you may want to download it in a	Negative	-1	0.639
Once you enter the bike ID you wish to rent on your app, a code	Negative	-1	0.542
One beauty of the process is that you can return the bike to any	Negative	-1	0.424
The app is clunky, at least in it's Android version, but it does ma	Positive	1	0.749
The seats on the bikes are as adjustable, and the bikes are muc	Positive	1	0.997
Riding bikes is the best way to see the 'burg! This station based	Positive	1	0.979
Dear baby Jesus, I need the strength to take a breath and write	Negative	-1	0.542
I had friends in from out of town and thought this would be the	Negative	-1	n 996

## SENTIMENT ANALYSIS

Sentiment Analysis:

**Customer Reviews** 

Classification

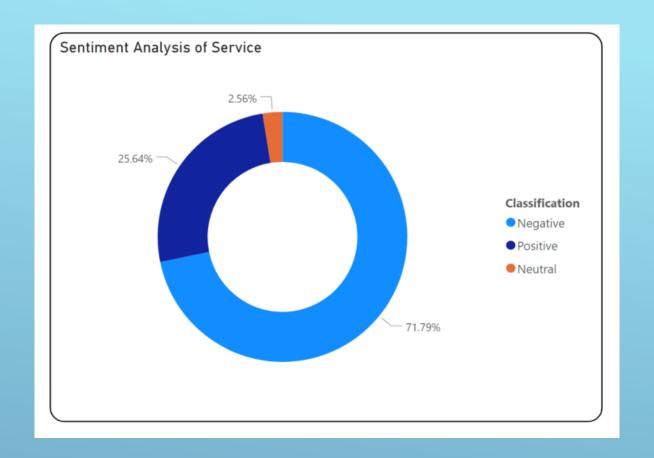
Numeric Value assigned to classification

Confidence of sentiment analysis model to review string

· Tr							
١.	Customer Reviews	Score	Scoring String	Negativity	Positivity	Uncovered T	Total Tokens
	The bikes got us around, but not the best biki	1.692	best (0.82) ok (0.31) pretty (0.56)	0	1.692	57	60
	The bikes themselves though felt quite unsta	-0.487	unstable (-0.38) share (0.31) worst (-0.79) like (0.38)	1.179	0.692	63	67
	At one station we accidentally tried to unlock $\dots$	-2	accidentally (-0.36) error (-0.44) broken (-0.54) broken (-0.54) broken (-0.54) cancel (-0.26) nice (0.46) cancelle	2.923	0.923	139	148
	Anyways - I appreciate the fact that there were	1.077	appreciate (0.44) good (0.49) liked (0.46) cool (0.33) better (0.49) stable (0.31) broken (-0.54) accidentally (-0.3	1.436	2.513	103	112
	Finally, saw a lot of stations that had 0 to a fe	-0.026	empty (-0.21) better (0.49) no (-0.31)	0.513	0.487	42	45
	I experienced a fairly carefree process in dow	0.846	carefree (0.44) credit (0.41)	0	0.846	20	22
	The next bike app is 24 MB, so you may want	0.487	want (0.08) credit (0.41)	0	0.487	33	35
	Once you enter the bike ID you wish to rent on	0.436	wish (0.44)	0	0.436	29	30
	One beauty of the process is that you can retu	0.846	beauty (0.72) helps (0.41) drop (-0.28)	0.282	1.128	28	31
	The app is clunky, at least in it's Android versi	0		0	0	23	23
	The seats on the bikes are as adjustable, an	0.462	easier (0.46)	0	0.462	19	20
	Riding bikes is the best way to see the 'burg!	1.513	best (0.82) share (0.31) recommend (0.38)	0	1.513	80	83
	Dear baby Jesus, I need the strength to take	2.641	dear (0.41) strength (0.56) amazing (0.72) friendly (0.56) ready (0.38)	0	2.641	78	83
	I had friends in from out of town and thought t	0.718	friends (0.54) perfect (0.69) opportunity (0.46) hard (-0.10) hard (-0.10) confused (-0.33) weird (-0.18) no (-0.31)	1.385	2.103	136	146
	We went to the kiosk on 10th and Penn and t	-0.333	good (0.49) number (0.08) bad (-0.64) broken (-0.54) well (0.28)	1.179	0.846	87	92
	We gloriously rode down the Penn Ave bike la	3.026		0.564	3.590	113	121
	So we called costumer service and proceede	0.179	broken (-0.54) great (0.79) convinced (0.44) leave (-0.05) sadly (-0.46)	1.051	1.231	72	77

Screenshot of sentiment analysis in rapid miner:

Shows how sentences are separated into individual strings and assigned numeric values. Strings are then tokenized



Sentiment Analysis Donut Graph:

2.56% Customers Have Neutral Sentiment

25.64% Customers have Positive Sentiment

71.79% Customers have Negative Sentiment

- Healthy Ride is a healthier option for all who partake
- Likely increases tourist revenue to the city since patrons can perform more self-guided tours
- Great alternative public transportation and walking especially since the onset of Covid-19
- Project would likely see improved customer reviews by fixing technical issues and provide more training to phone staff since most customer sentiments pertained to technical issues of application and dealing with customer service agents

#### CONCLUSION

## **Questions?**