

Methods Overview

- 1. Influenza Season Subsets
 - a. Visualizing the sum of cases for each season at the county-level
- 2. Interactive Map Case Total
 - a. Outcomes/Questions how much does population affect this picture?
- 3. Add population data to the subsets
- 4. Calculate the prevalence rates per 10,000 people
 - a. Add as a new column in subsets
- 5. Interactive Map Prevalence Rates

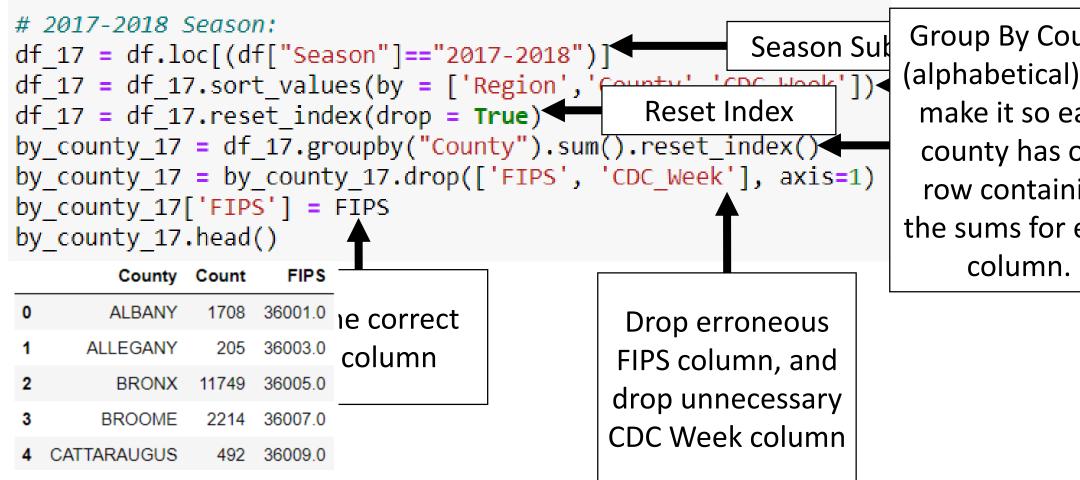
Methods for Seasonal Subsets

1. Sorted data frame by "Season" (2009-2010, 2010-2011, ..., 2019-2020)



Methods for Seasonal Subsets

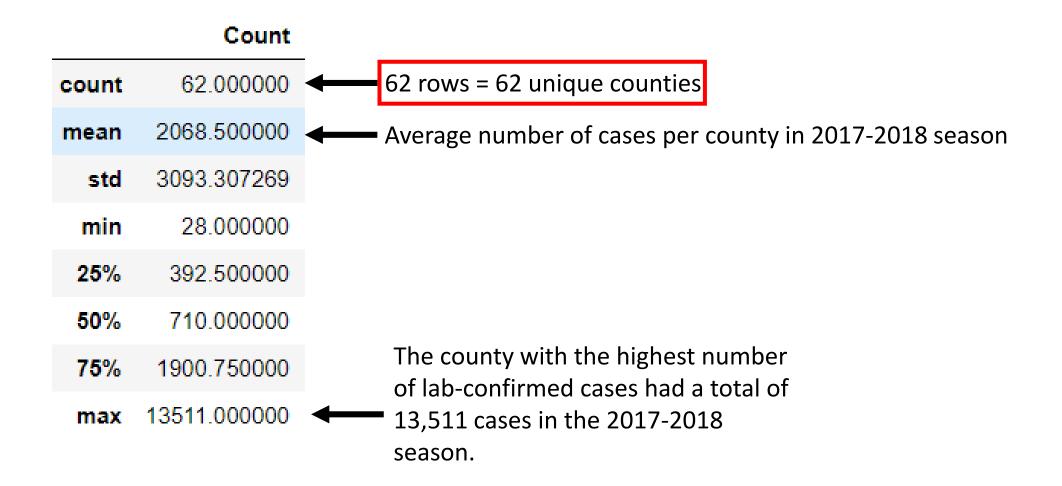
2. For each season:



Group By County (alphabetical) and make it so each county has one row containing the sums for each

Methods for Seasonal Subsets

For each season: by_county_17.describe()



Methods – Interactive Map

- Tools used (Python/Jupyter Notebook):
 - Plotly Express
 - Mapbox Choropleth Maps
 - Urlopen and json to load a GeoJSON file to make the map foundation

```
# Import packages
import pandas as pd
import numpy as np
import json
import plotly.express as px
from urllib.request import urlopen
```

with urlopen('https://raw.githubusercontent.com/plotly/datasets/master/geojson-counties-fips.json') as response:
 counties = json.load(response)

- Two main input types:
 - GeoJSON-formatted geometry information (has all county information in the US)
 - List of values indexed by feature identifier

Methods – Making the Map

```
fig_17 = px.choropleth_mapbox(by_county_17,
                              geojson=counties,
                              locations='FIPS',
                              color='Count',
                              hover name = "County",
                              color_continuous_scale="Blues",
                              range color=(0, 8000),
                              mapbox style="carto-positron",
                              zoom=5.5, center = {"lat": 43.2994, "lon": -74.2179},
                              opacity=0.9,
                              labels={'Count':'Total Count'}
fig_17.update_layout(margin={"r":0,"t":0,"l":0,"b":0})
fig 17.show()
```

Methods - Making the Map df_17 = df_17.reset_index(drop = True) by_county_17 = df_17.groupby("County")

```
fig_17 = px.choropleth_mapbox(by_county_17,
                                                         by county 17['FIPS'] = FIPS
                               geojson=counties,
                                                         County Subset
                               locations='FIPS',
                               color='Count',
                               hover name = "County",
                               color continuous scale="Blues",
                               range color=(0, 8000),
                              mapbox style="carto-positron",
                               zoom=5.5, center = {"lat": 43.2994, "lon": -74.2179},
                              opacity=0.9,
                              labels={'Count':'Total Count'}
fig_17.update_layout(margin={"r":0,"t":0,"l":0,"b":0})
fig 17.show()
```

Methods – Making the Map

```
fig_17 = px.choropleth_mapbox(by_county_17, ________ 2017-2018 Influenza Season Subset
                             geojson=counties, ← County-level GeoJSON map
                             locations='FIPS', Locations identified by their FIPS code
                             color='Count', Color by count (darker = higher count)
                             hover name = "County",
                             color continuous scale="Blues",
                             range color=(0, 8000),
                             mapbox style="carto-positron",
                             zoom=5.5, center = {"lat": 43.2994, "lon": -74.2179}, NYS Coordinates
                             opacity=0.9,
                             labels={'Count':'Total Count'}
fig_17.update_layout(margin={"r":0,"t":0,"l":0,"b":0})
fig 17.show()
```

Methods – Making the Map

2017-2018 Influenza Season Density Map

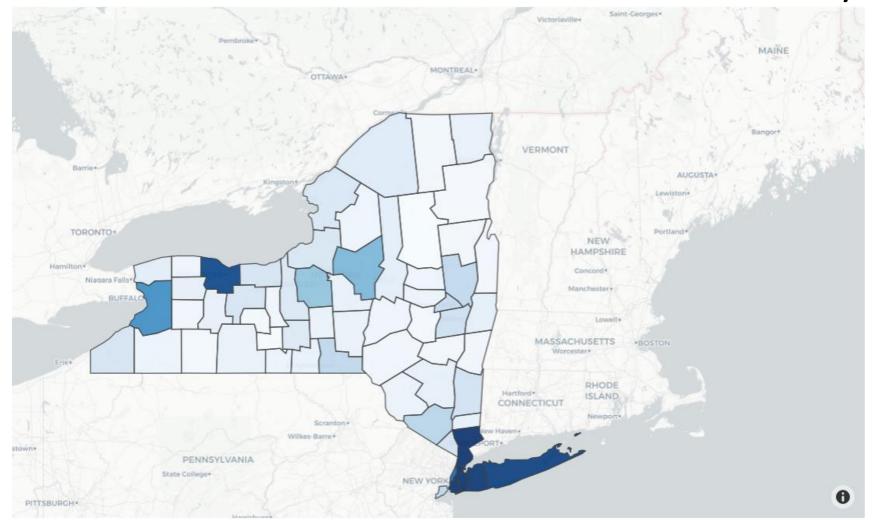




Figure 1. Density map of the sum of all confirmed influenza cases from the 2017-2018 influenza season. The legend on the right indicates that the darker the color, the higher the total count will be (8,000+ = darkest). However, four of the counties surpassed this count (which can be seen in fig. 3).

Model Details

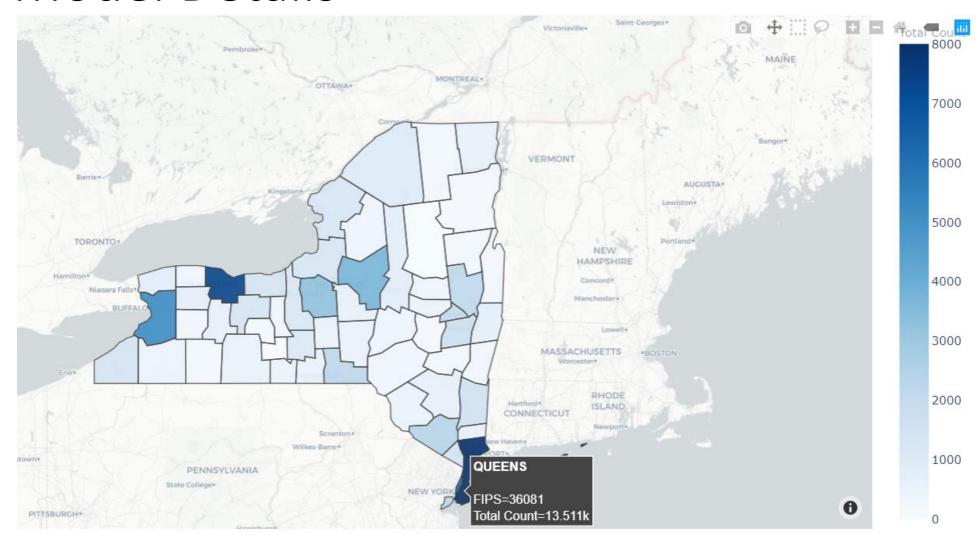


Figure 2. Density map of the sum of all confirmed influenza cases from the 2017-2018 influenza season. This figure shows one of the interactive features of this map (the hover over information). Users can also zoom in, out, and drag the cursor to navigate the map.

2017-2018 Influenza Season Density Map

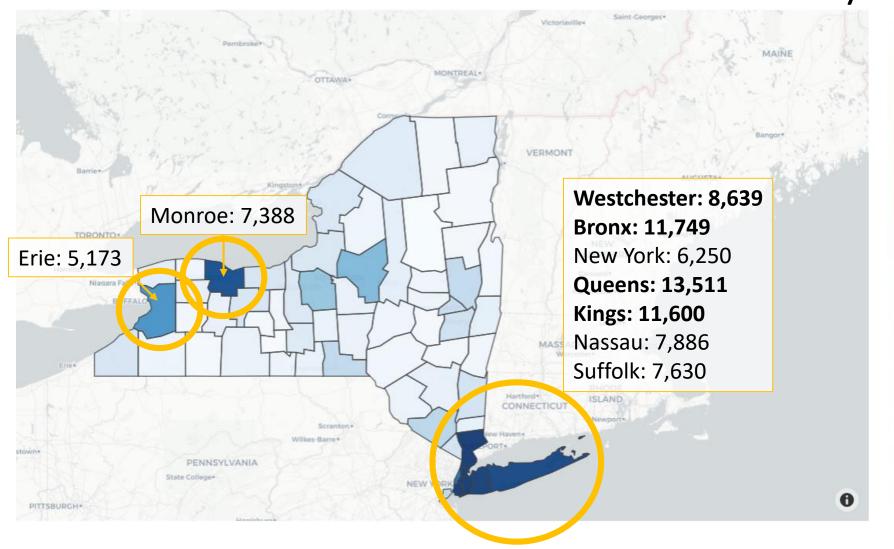




Figure 3. Density map of the sum of all confirmed influenza cases from the 2017-2018 influenza figure This season. outlines some of the counties that had the highest sum of confirmed influenza cases (as well as their number of confirmed cases).

- Data Source: https://data.ny.gov/Government-Finance/Annual-Population-Estimates-for-New-York-State-and/krt9-ym2k
- 1. Read in data (pandas) and prepare it (rename columns, check for null/missing data, etc.)

```
cols = ["FIPS Code", "Geography", "Year", "Population"]
pop = pd.read_csv(path+"pop_estimates.csv", usecols=cols)
pop=pop.rename(columns = {'Geography': 'County'})
pop.head()
```

- 2. Make two population subsets:
 - a. One for the 2009-2010 season (for the decade of 2000)
 - b. One for the remaining seasons (2010-2019)
 - a. Used 2011 data arbitrarily (population estimates are relatively consistent)

```
pop_county_11 = pop.loc[(pop["Year"]==2011)]
pop_county_11 = pop_county_11.sort_values(by = ['County'])
pop_county_11 = pop_county_11.reset_index(drop = True)
pop_county_11.head()
```

- 2. Make two population subsets:
 - a. One for the 2009-2010 season (for the decade of 2000)
 - b. One for the remaining seasons (2010-2019)
 - a. Used 2011 data arbitrarily (population estimates are relatively consistent)

	FIPS Code	County	Year	Population
0	36001	Albany County	2011	304596
1	36003	Allegany County	2011	48800
2	36005	Bronx County	2011	1397335
3	36007	Broome County	2011	199363
4	36009	Cattaraugus County	2011	79815

3. Remove the extra "New York State" row from the population dataset

```
# Drop the row with NYS
pop_county_11 = pop_county_11.drop(31, axis=0)
pop_county_11 = pop_county_11.reset_index(drop=True)
# Double check that NYS is what was removed
pop_county_11.County.unique()
```

'New York County', 'Niagara County', 'Oneida County',

```
# Check number of unique values after dropping 31st row
pop_county_11.nunique()

FIPS Code 62
County 62
Year 1
Population 62
dtype: int64
```

4. Make the Population column to add to the subsets

```
population_11 = pop_county_11["Population"]
```

5. Add population column to subsets

```
population = population_11
# 2017-2018
sum_county_17["Population"] = population
#sum_county_17.head()
#sum_county_17.describe()
```

6. Define the function to calculate prevalence rate of confirmed influenza cases (10,000 people)

$$Prevalence \ Rate = \left(\frac{10,000xCount}{Population}\right)$$

```
def CalcPrevalenceNumerator(df):
    numerator=[]
    for index, row in df.iterrows():
        numerator.append(row.Count*10000)
    return numerator
def CalcPrevalenceRate(df):
    rate=||
    for index, row in df.iterrows():
        rate.append(row.x/row.Population)
    return rate
```

$$Rate = \left(\frac{10,000xCount}{Population}\right)$$

	County	Count	FIPS	Population
0	ALBANY	1708	36001.0	304596
1	ALLEGANY	205	36003.0	48800
2	BRONX	11749	36005.0	1397335
3	BROOME	2214	36007.0	199363
4	CATTARAUGUS	492	36009.0	79815

```
def CalcPrevalenceNumerator(df):
    numerator=[]
    for index, row in df.iterrows():
        numerator.append(row.Count*10000)
    return numerator
def CalcPrevalenceRate(df):
    rate=||
    for index, row in df.iterrows():
        rate.append(row.x/row.Population)
    return rate
```

$$Rate = \left(\frac{10,000xCount}{Population}\right)$$

	County	Count	FIPS	Population
0	ALBANY	1708	36001.0	304596
1	ALLEGANY	205	36003.0	48800
2	BRONX	11749	36005.0	1397335
3	BROOME	2214	36007.0	199363
4	CATTARAUGUS	492	36009.0	79815

7. Apply calculations to subsets

```
# Save calculation/values/list as variable x
x = CalcPrevalenceNumerator(sum_county_17)

# Add the values as a column with the respective counties
sum_county_17['x'] = x

# See what this looks like
sum_county_17.head(2)
```

	County	Count	FIPS	Population	x	"Numerator" value (10,000xCount)
0	ALBANY	1708	36001.0	304596	17080000	
1	ALLEGANY	205	36003.0	48800	2050000	

8. Make new column containing the respective prevalence rates ("Rate")

```
# Save calculated values as 'rate'
rate = CalcPrevalenceRate(sum_county_17)

# Add new column containing these values
sum_county_17['Rate'] = rate

# Drop column 'x'
sum_county_17 = sum_county_17.drop(['x'], axis=1)

# See the new dataframe containing our new column!
sum_county_17.head()
```

	County	Count	FIPS	Population	Rate	Prevalence Rate
0	ALBANY	1708	36001.0	304596	56.074275	
1	ALLEGANY	205	36003.0	48800	42.008197	

Interactive Map – Prevalence Rates

• Same code as before – small changes:

```
County Count
                                                                                  FIPS Population
                                                                                                 Rate
fig_17 = px.choropleth_mapbox(sum_county_17,
                                                                      ALBANY
                                                                             1708 36001.0
                                                                                         304596
                                                                                              56.074275
                                 geojson=counties,
                                                                    ALLEGANY
                                                                             205 36003.0
                                                                                              42.008197
                                                                                         48800
                                 locations='FIPS',
                                 color='Rate',
                                 hover name = "County",
                                 color continuous scale="Blues",
                                 range color=(0, 110),
                                 mapbox style="carto-positron",
                                 zoom=5.5, center = {"lat": 43.2994, "lon": -74.2179},
                                 opacity=0.9,
                                 labels={'Rate':'Prevalence Rate per 10,000 people'}
fig 17.update layout(margin={"r":0,"t":0,"l":0,"b":0})
fig 17.show()
```

Rate

Interactive Map – Prevalence Rates

Same code as before – small changes:

```
fig_17 = px.choropleth_mapbox(sum_county_17,
                                                                            56.074275
                               geojson=counties,
                                                                            42.008197
                               locations='FIPS',
                               color='Rate',
                                                                            84.081484
                               hover name = "County",
                                                                           111.053706
                               color continuous scale="Blues",
                                                                            61.642548
                               range color=(0, 110),
                               mapbox_style="carto-positron",
                               zoom=5.5, center = {"lat": 43.2994, "lon": -74.2179},
                               opacity=0.9,
                               labels={'Rate':'Prevalence Rate per 10,000 people'}
fig_17.update_layout(margin={"r":0,"t":0,"l":0,"b":0})
fig 17.show()
```

Rate

62.000000

79.004159

33.347805

count

mean

std

Interactive Map – Prevalence Rates

• Same code as before – small changes:

```
fig_17 = px.choropleth_mapbox(sum_county_17,
                                                                                     27.697822
                                                                               min
                               geojson=counties,
                               locations='FIPS',
                                                                               25%
                                                                                     52.446979
                               color='Rate',
                                                                               50%
                                                                                     66.988705
                               hover name = "County",
                                                                               75%
                                                                                    106.561754
                               color continuous scale="Blues",
                                                                                    159.893774
                               range color=(0, 110), ◀
                                                                               max
                               mapbox style="carto-positron",
                               zoom=5.5, center = {"lat": 43.2994, "lon": -74.2179},
                               opacity=0.9,
                               labels={'Rate':'Prevalence Rate per 10,000 people'}
fig 17.update layout(margin={"r":0,"t":0,"l":0,"b":0})
fig 17.show()
```

Prevalence Rates 2017-2018

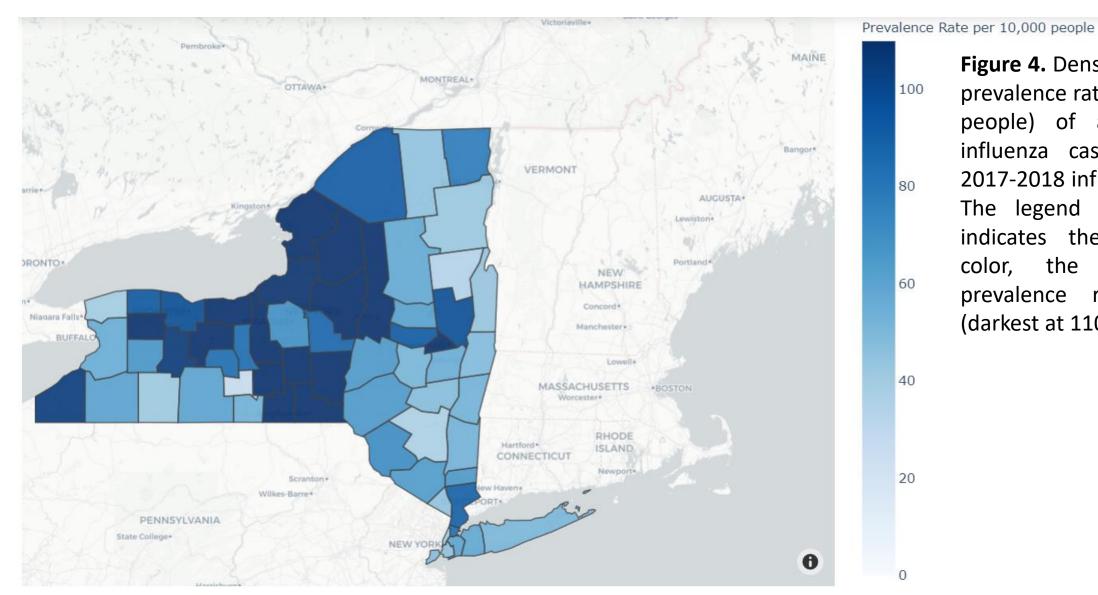


Figure 4. Density map of the prevalence rates (per 10,000 people) of all confirmed influenza cases from the 2017-2018 influenza season. The legend on the right indicates the darker the color, the higher the prevalence rate will be (darkest at 110).

Prevalence Rates 2017-2018

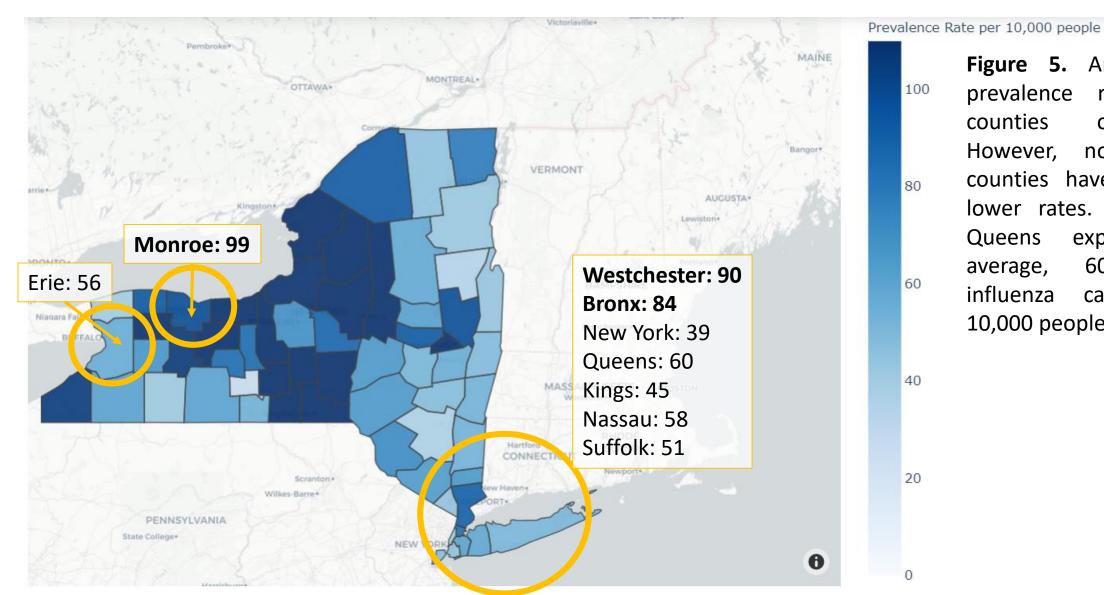


Figure 5. An outline of prevalence rates in the of interest. counties these However, now counties have a relatively lower rates. For example, Queens experiences confirmed 60 average, influenza out of cases 10,000 people.

Prevalence Rates 2017-2018

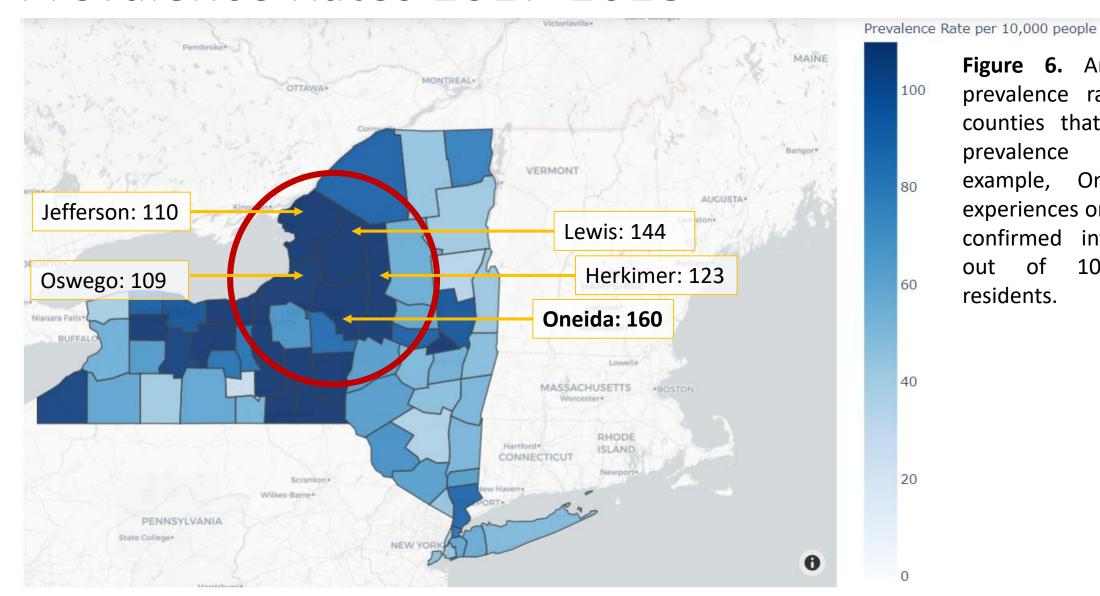


Figure 6. An outline of prevalence rates in some counties that have higher prevalence rates. For example, Oneida county experiences on average, 160 confirmed influenza cases out of 10,000 county residents.

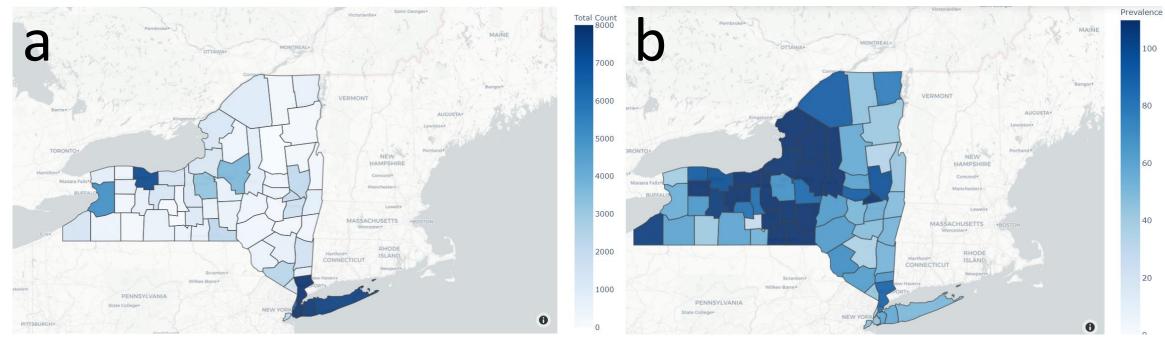


Figure 7. Side by side comparison of the two density maps from the 2017-2018 influenza season. The density map illustrating the total count of confirmed cases (a) is quite different from the map illustrating the prevalence rate of confirmed influenza cases per 10,000 people (b).

Conclusion

- Exploratory Data Analysis and Interactive Map Outcome:
 - Revealed that normalization of confirmed influenza cases with respect to population provides a different perspective that is important for identifying high risk counties
- Questions I would like to address:
 - Is there a trend across all seasons in the prevalence rate per county?
 - What are some potential factors that affect the prevalence rate in counties?

