

# Capstone Project

## Introduction \ Problem

It's hard to track down some food for takeout during the times of COVID restrictions. Some restaurants have closed down completely, some have outdoor dining, some are exclusively takeout. Which neighborhoods are surviving the lockdown the best? Which neighborhoods are going to need new restaurants to open once restrictions are gone, and will probably have better deals on leases?

## Target Audience

I've been interested in this information myself. I try to support the local places in my neighborhood so that the restaurants can survive this period of restrictions, and more employees can keep their jobs. There are many consumers in Seattle that feel and act in the same way in their own neighborhoods. Restaurateurs may look to capitalize on "restaurant deserts" once consumers can go back to full indoor dining.

## Datasets

I will be using a number of datasets for this project. I will use venue data from foursquare using their API. I will use a downloaded csv dataset from the city of Seattle that contains data from restaurants self reporting their opening hours, and the types of service that they offer. I will use data scraped from wikipedia to get a list of Seattle neighborhoods so that I can do some comparison neighborhoods.

<https://developer.foursquare.com/docs/api-reference/venues/search/#request>

<https://data-seattlecitygis.opendata.arcgis.com/datasets/restaurants-operating-during-covid19/data?showData=true>

[https://en.wikipedia.org/wiki/List\\_of\\_neighborhoods\\_in\\_Seattle](https://en.wikipedia.org/wiki/List_of_neighborhoods_in_Seattle)

## Methodology

My methodology was to get the datasets, do some data cleaning, do some exploratory analysis including visualizations, and then analyze the neighborhoods for additional findings on their services provided during COVID.

Results

Initial neighborhood data from wikipedia scrape.

```
req = requests.get("https://en.wikipedia.org/wiki/List_of_neighborhoods_in_Seattle")

soup = BeautifulSoup(req.content, 'lxml')

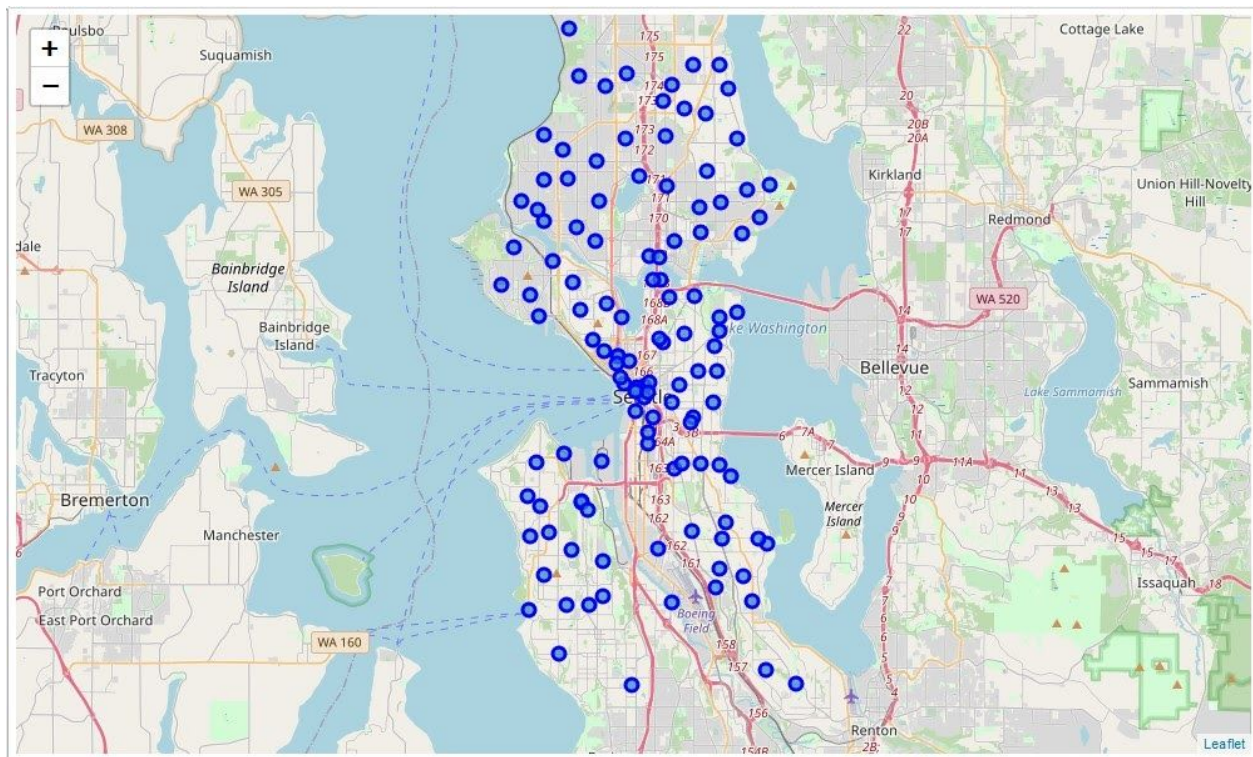
table = soup.find_all('table')[0]

df1 = pd.read_html(str(table))

hoods = pd.DataFrame(df1[0])
hoods.head()
```

|   | Unnamed: 0 | Neighborhood name        | Within larger district | Annexed[41]                  | Locator map | Street map | Image | Notes                                       |
|---|------------|--------------------------|------------------------|------------------------------|-------------|------------|-------|---|
| 0 | 1          | North Seattle            | Seattle                | Various                      | NaN         | NaN        | NaN   | North of the Lake Washington Ship Canal[42] |
| 1 | 2          | Broadview                | North Seattle[42]      | 1954[43]                     | NaN         | NaN        | NaN   | [44]  |
| 2 | 3          | Bitter Lake              | North Seattle[42]      | 1954[43]                     | NaN         | NaN        | NaN   | [45]  |
| 3 | 4          | North Beach / Blue Ridge | North Seattle[42]      | 1940,[43] 1954[43]           | NaN         | NaN        | NaN   | [46]  |
| 4 | 5          | Crown Hill               | North Seattle[42]      | 1907,[47] 1952,[43] 1954[43] | NaN         | NaN        | NaN   | [48]  |

I cleaned the data, added coordinates, and produced a folium map of Seattle neighborhoods.



Using the foursquare API, I produced a venue dataframe.

|   | Neighborhood | Neighborhood Latitude | Neighborhood Longitude | Venue                | Venue Latitude | Venue Longitude | Venue Category      |
|---|--------------|-----------------------|------------------------|----------------------|----------------|-----------------|---------------------|
| 0 | Bitter Lake  | 47.71868              | -122.3503              | Rain Cafe            | 47.724808      | -122.343854     | Café                |
| 3 | Crown Hill   | 47.69520              | -122.3741              | Dick's Drive-In      | 47.696500      | -122.371748     | Burger Joint        |
| 4 | Crown Hill   | 47.69520              | -122.3741              | Wild Mountain Cafe   | 47.690779      | -122.374559     | American Restaurant |
| 5 | Crown Hill   | 47.69520              | -122.3741              | Crown Hill Broiler   | 47.687647      | -122.377145     | Restaurant          |
| 7 | Northgate    | 47.71310              | -122.3193              | Boud's Pinehurst Pub | 47.715641      | -122.312633     | Bar                 |

Next was the city of Seattle restaurant COVID data. I downloaded the entire dataset. The set includes all of King county so there was some more cleaning to do.

```
cos_df = pd.read_csv('Restaurants_Operating_during_COVID19.csv')
```

```
cos_df.head()
```

|   | X           | Y         | objectid | globalid                             | business_name        | address_help_your_customer_find      | phone_number_to_place_an_order |                |
|---|-------------|-----------|----------|--------------------------------------|----------------------|--------------------------------------|--------------------------------|----------------|
| 0 | -122.318799 | 47.613362 | 3        | 12aba10d-7825-45cb-ac38-46b22e670698 | Bateau               | 1040 E Union St, Seattle, WA 98122   | 206-900-8699                   | https://www.f  |
| 1 | -122.314425 | 47.614776 | 4        | 4b271d79-3283-4e16-bd59-cfadca726051 | Nue                  | 1519 14th Ave                        | 206-257-0312                   | https://       |
| 2 | -122.328084 | 47.614436 | 5        | f4928649-888c-41be-9726-4eb86ae05a08 | Terra Plata          | 1501 Melrose Ave Seattle, WA 98122   | (206) 325-1501                 | http           |
| 3 | -122.326795 | 47.598599 | 6        | 0745b48d-87a3-4c4e-9910-24340784a738 | A+ Hong Kong Kitchen | 419 6th Ave S, Seattle, WA 98104     | 206-682-1267                   | http           |
| 4 | -122.321425 | 47.581182 | 7        | 0afb2fdb-9ef1-430a-8757-beafc610fd24 | Gourmondo            | 2415 Airport Way S. Seattle WA 98134 | 206-587-0190                   | https://cateri |

```
cos_df[cos_df['business_name'].str.contains("Random")]
```

|     | X           | Y         | objectid | globalid                             | business_name   | address_help_your_customer_find | phone_number_to_place_an_order | business_web           |
|-----|-------------|-----------|----------|--------------------------------------|-----------------|---------------------------------|--------------------------------|------------------------|
| 721 | -122.349791 | 47.615518 | 818      | 74138a75-dff3-428a-8c71-b44f2a6fd6f3 | Some Random Bar | 2604 1st Ave                    | 2067286621                     | http://somerandombar.c |

## Discussion

The city of Seattle set is compiled from restaurants self reporting, or answering the city's surveys. It's not going to be complete for obvious reasons, but the exercise, for me, was about merging the multiple datasets. Using foursquare data was a requirement for the project.

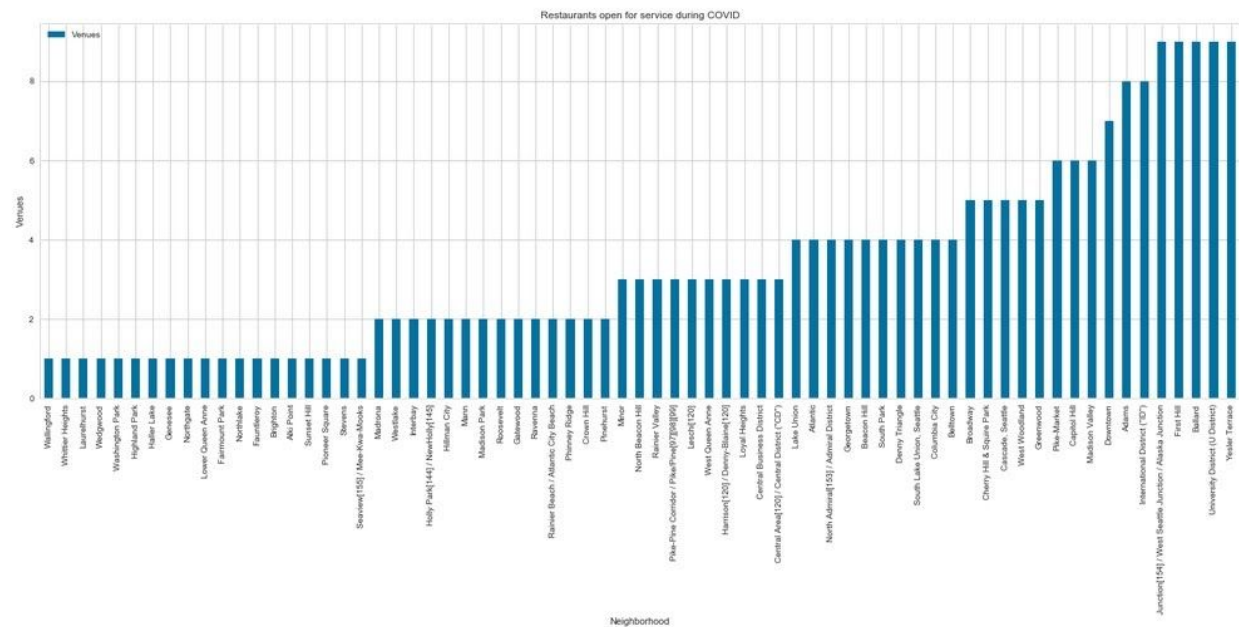
Here is the merged data for a larger dataset that includes more than burgers. It will be reduced to the info present in the city of Seattle dataset with an inner join.

```
print(merged_df.shape)
merged_df.head()
```

```
(187, 13)
```

|   | Neighborhood                 | Neighborhood Latitude | Neighborhood Longitude | Venue                           | Venue Latitude | Venue Longitude | Venue Category      | business_name                   | phone          | business_website  |
|---|------------------------------|-----------------------|------------------------|---------------------------------|----------------|-----------------|---------------------|---------------------------------|----------------|---|
| 0 | Crown Hill                   | 47.69520              | -122.37410             | Wild Mountain Cafe              | 47.690779      | -122.374559     | American Restaurant | Wild Mountain Cafe              | (206) 297-9453 | <a href="https://www.thewildmountaincafe.com/">https://www.thewildmountaincafe.com/</a>                           |
| 1 | Crown Hill                   | 47.69520              | -122.37410             | Papa John's Pizza               | 47.694423      | -122.375077     | Pizza Place         | Papa John's Pizza               | (206) 985-0000 | <a href="https://locations.papajohns.com/united-states/...">https://locations.papajohns.com/united-states/...</a> |
| 2 | Seaview[155] / Mee-Kwa-Mooks | 47.55217              | -122.39175             | Papa John's Pizza               | 47.554182      | -122.386628     | Pizza Place         | Papa John's Pizza               | (206) 985-0000 | <a href="https://locations.papajohns.com/united-states/...">https://locations.papajohns.com/united-states/...</a> |
| 3 | Fairmount Park               | 47.55341              | -122.38160             | Papa John's Pizza               | 47.554182      | -122.386628     | Pizza Place         | Papa John's Pizza               | (206) 985-0000 | <a href="https://locations.papajohns.com/united-states/...">https://locations.papajohns.com/united-states/...</a> |
| 4 | Greenwood                    | 47.69082              | -122.35529             | Flying Bike Cooperative Brewery | 47.692123      | -122.355175     | Brewery             | Flying Bike Cooperative Brewery | (206) 428-7709 | <a href="https://flyingbike.coop/">https://flyingbike.coop/</a>   |

With the merged dataset, I summarized the reported open venues by neighborhood.



## Conclusions

Using the self-reported data from the city, you can see that a number of neighborhoods have very few, or no restaurant service at all. The chart from the merged data set doesn't show all of the neighborhoods that were not found in the city data. An outer join on that merge would retain the original rows for the neighborhood dataframe.