

Covid Rates in Toronto's Historic Neighbourhoods

Emily Moffat and Nick Chan



Background

- Before June 14, 2022, there were 1,314,447 confirmed cases of COVID-19 in Ontario, with 13,351 recorded deaths
- 66.5% of individuals older than 6 months of received their last dose a COVID-19 vaccine prior to the end of 2023



City of Toronto. (November 2023). *COVID-19 Clinic Sign* [Image]. City of Toronto.
<https://nowtoronto.com/wp-content/uploads/2023/11/Untitled-design-78-2048x1044.webp>



Goals

- Analyze how the accessibility of vaccination clinics correlates with COVID-19 infection rates.
- Evaluate the spatial distribution of COVID-19 infections in relation to the proximity of vaccination centers.





Literature

Distance to trauma centres among gunshot wound victims: identifying trauma 'deserts' and 'oases' in Detroit

 Giovanni M Circo
Correspondence to Dr Giovanni M C

COVID-19 death rates in urban and rural areas : United States, 2020

10/25/2022

By Curtin, Sally C. ; Heron, Melonie

<https://dx.doi.org/10.15620/cdc:121523> 

Series: NCHS data brief ; no. 447

 Available access | Other | First published online August 14, 2008

Parolees' Physical Closeness to Social Services: A Study of California Parolees

[John R. Hipp](#), [Jesse Jannetta](#), [...], and [Susan Turner](#)  [View all authors and affiliations](#)

[Volume 57, Issue 1](#) | <https://doi-org.myaccess.library.utoronto.ca/10.1177/0011128708322856>

RESEARCH REPORTS

Disparities in COVID-19 Mortality Rates: Implications for Rural Health Policy and Preparedness

Grome, Heather N. MD, MPH; Raman, Rameela PhD; Katz, Benjamin D. MPH; Fill, Mary-Margaret MD, MPH; Jones, Timothy F. MD; Schaffner, William MD; Dunn, John DVM, PhD

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Journal of Public Health Management and Practice 28(5):p 478-485, September/October 2022. | DOI: 10.1097/PHH.0000000000001507

RESEARCH ARTICLE | COVID-19

[HEALTH AFFAIRS](#) > [VOL. 42, NO. 2](#): BEHAVIORAL HEALTH, NURSING HOME WORKFORCE & MORE

Community Health, Health Care Access, And COVID-19 Booster Uptake In Massachusetts

[Adam Gaffney](#), [Steffie Woolhandler](#), [Jacob Bor](#), [Danny McCormick](#), and [David U. Himmelstein](#)



Packages Used in Analysis

```
In [1]: ▶ import os
import numpy as np

#for creating plots
import textwrap
import matplotlib.pyplot as plt

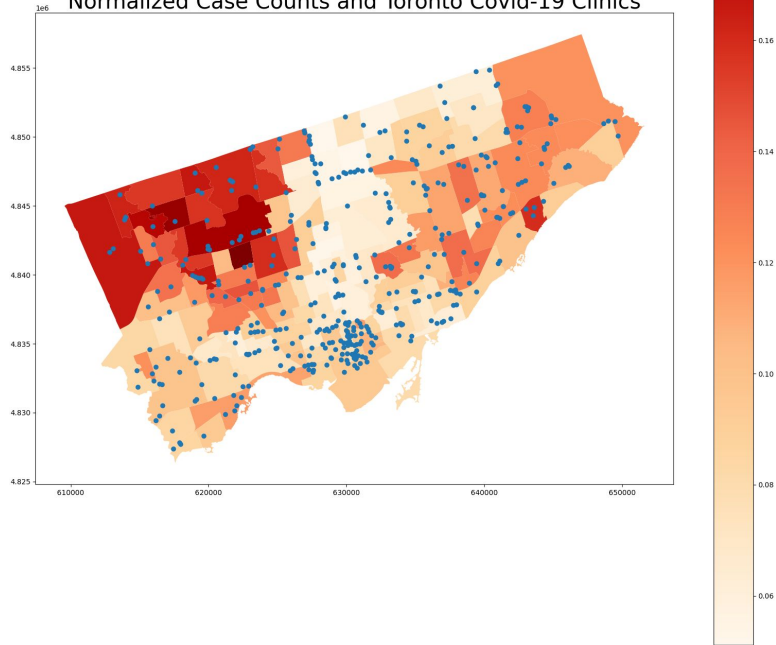
#geospatial analysis
import geopandas as gpd
import shapely.geometry

#statistical analysis
from libpysal.weights import Queen
from esda.moran import Moran
from esda.moran import Moran_Local
from esda.getisord import G_Local
from splot.esda import moran_scatterplot, plot_local_autocorrelation
from splot.esda import lisa_cluster
```

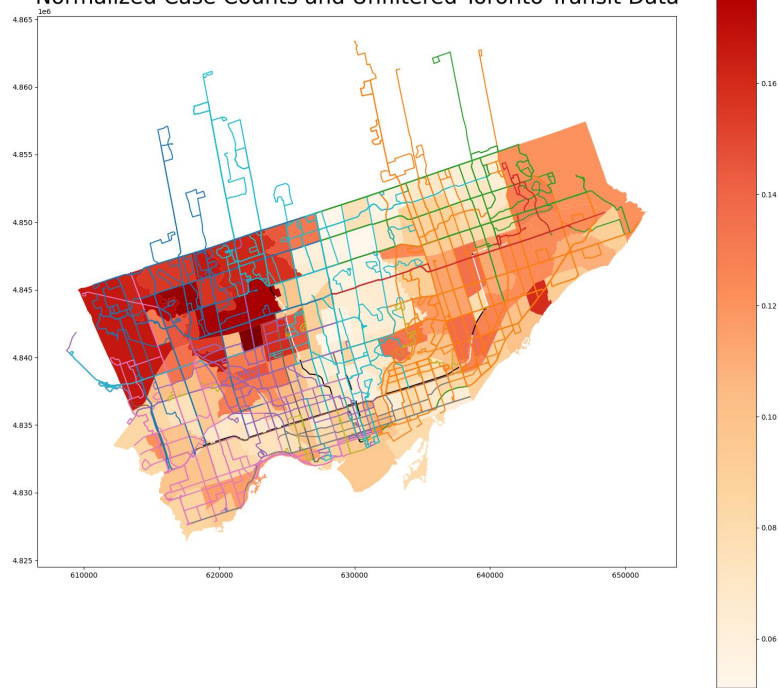


Plotted Data

Normalized Case Counts and Toronto Covid-19 Clinics



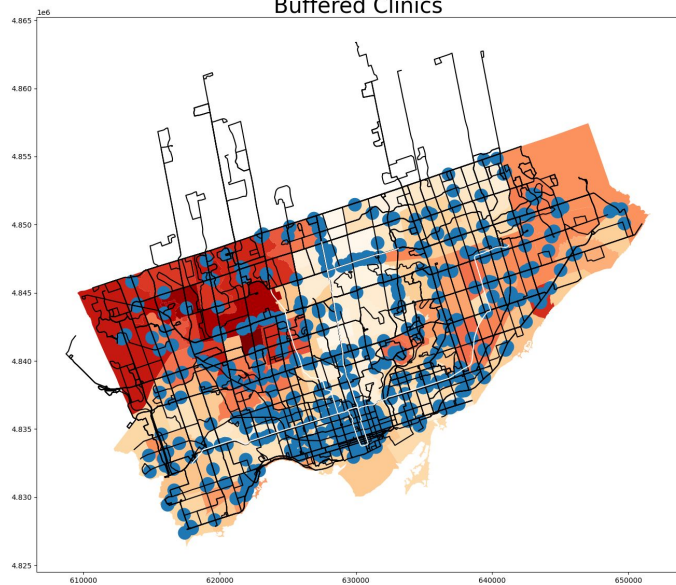
Normalized Case Counts and Unfiltered Toronto Transit Data



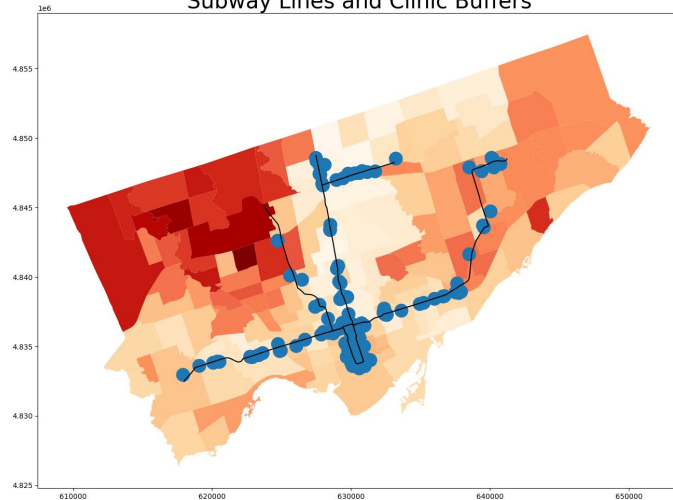


Buffer maps

Normalized Case Counts Overlaid with
Unfiltered Public Transit Data and
Buffered Clinics

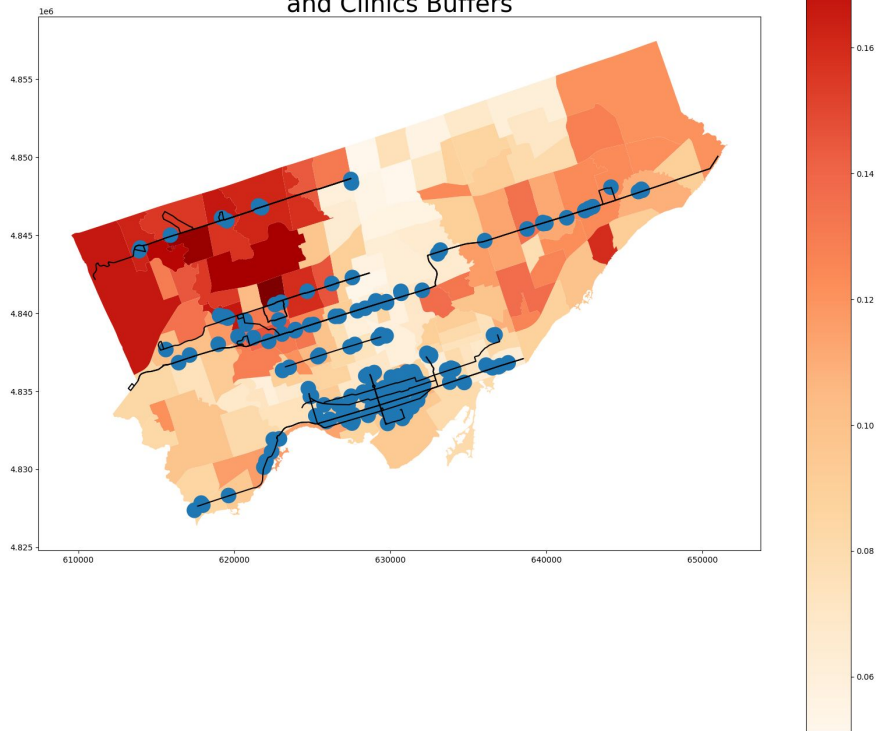


Normalized Case Counts Overlaid with
Subway Lines and Clinic Buffers

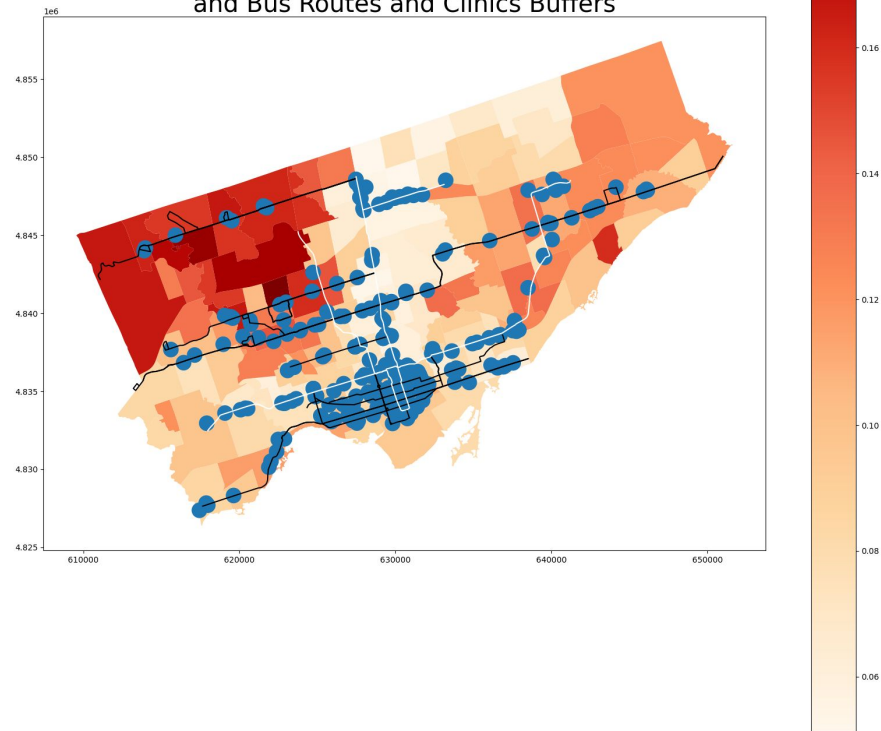


Data Processing

Normalized Case Counts Overlaid with
Highest Traffic Streetcar and Bus Routes
and Clinics Buffers

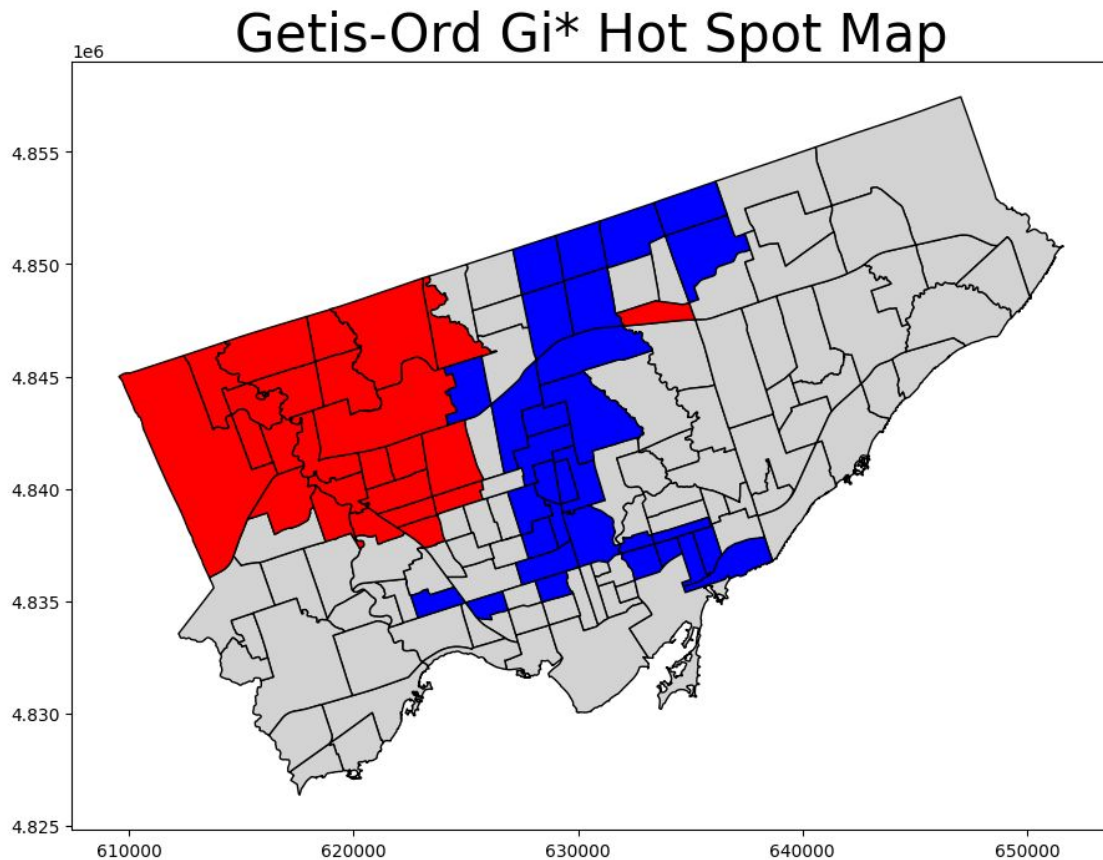


Normalized Case Counts Overlaid with
Subway data, Highest Traffic Streetcar
and Bus Routes and Clinics Buffers



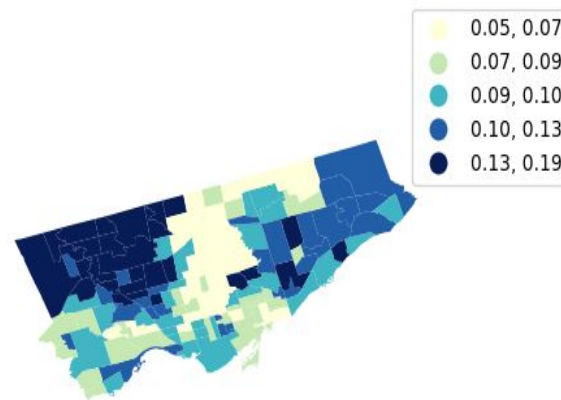
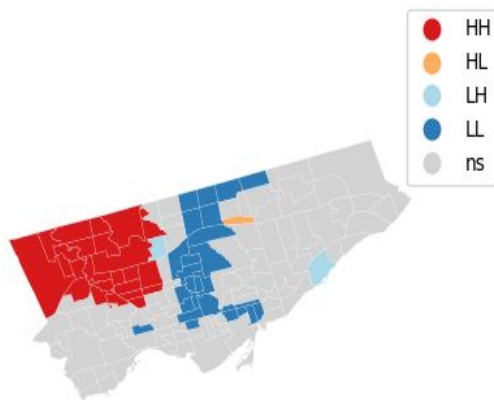
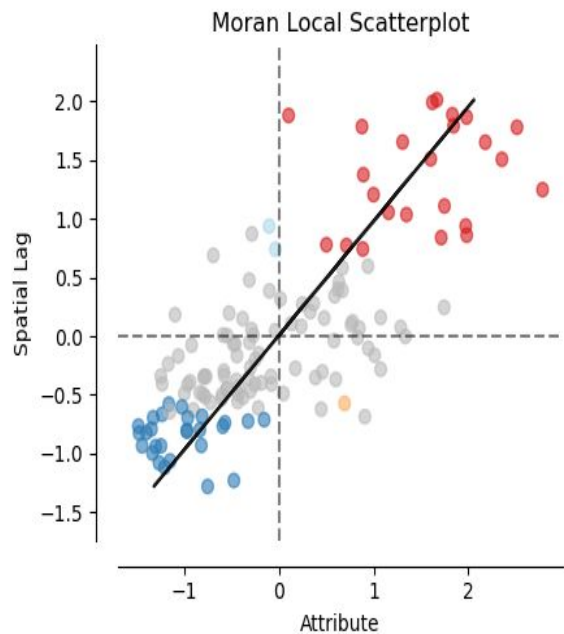


Getis-Ord G_i^* Hot Spot Map



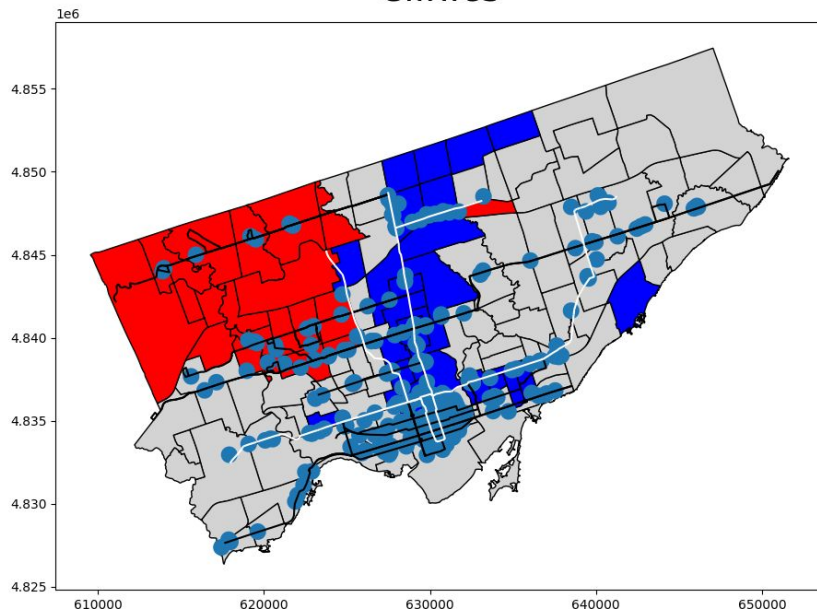


Morans



Analysis

Getis-Ord Gi* Hot Spots Overlaid with
Transit Routes and Accessible Covid-19
Clinics

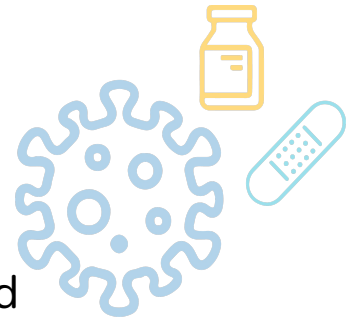


Observations

- High levels of infection correlate with low amounts of Covid-19 vaccination clinics
- Low levels of infection correlate with high amounts of Covid-19 clinics that are easily accessible



Conclusion



- **Clinic Accessibility and Infections:** Correlation was noted between accessible vaccination clinics and COVID-19 rates. More infections correlate with fewer accessible clinics; fewer infections correlate with more accessible clinics.
- **Correlation Caution:** Noted correlation, not necessarily causation. To strengthen findings, further details on travel time, vaccination frequency, and transport modes to clinics would be necessary
- **Improving Analysis:** To solidify conclusions, studying travel time, vaccination frequency, and transport modes concerning COVID-19 infections is crucial for a more complete understanding.

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