High Number of Shootings and Homicides but Fewer Police Stations Around in Toronto Neighbourhoods*

An analysis of police presence across Toronto neighbourhoods in relation to homicide and shooting cases (2018-2023)

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Despite optimism in 2023 about gun violence continuing to decrease annually in Toronto, there was a sudden increase in gun violence at the beginning of 2024. This paper looks at patterns of where shootings and homicides occurred across all Toronto neighbourhoods alongside the location of police stations from 2018 to 2023. The results showed that the six neighbourhoods with the highest cases of shootings and homicides had below-average household income and smaller populations and there are fewer police stations around neighbourhoods with high numbers of shootings and homicides. These findings can inform where future police facilities can be built to ensure the safety of Toronto neighbourhoods, but further investigation is needed on how adding police facilities can impact crime cases in surrounding neighbourhoods over time.

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^{*}Code and data are available at: https://github.com/moonsdust/toronto-homicides-shootings.

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1 Introduction

As a response to the increase in gun violence in 2024 by 74% from 2023, the Toronto Police Services announced on June 27 2024, at a press conference that they will increase their presence in areas impacted by high levels of gun violence (Fanfair 2024). This concern was expressed because, in a CBC article published in December 2023, they mentioned that there was a decrease in gun violence from 2019 to 2023 across Toronto (Balintec 2023). Deputy Chief Rob Johnson in the same conference also raised concerns about the increasing number of youth being perpetrators of gun violence (Freeman 2024). This raises the following questions: Which Toronto neighbourhoods are most impacted by shootings and homicides from 2018 to 2023? Where are police stations located relative to the shootings and homicides across Toronto? According to Statistics Canada, the most frequently used method to commit homicides is through shooting and in our analysis, we chose to analyze homicides alongside shootings (Statistics Canada 2024).

In this paper, we analyzed data provided by Toronto Police Services and City Planning to investigate patterns where shootings and homicides take place and where police stations are located relative to where the crimes occur. Currently, there is news coverage about increasing police visibility in areas with high gun violence but it is not known if the location of police stations in Toronto does impact the number of shootings and homicides that have taken

place. In our findings, our data showed that neighbourhoods with below-average household incomes and smaller populations have one of the highest numbers of shootings and homicides. Alongside this, we found that police stations were commonly not located in clusters of neighbourhoods with high numbers of shootings and homicides. These findings can inform police divisions of neighbourhoods to be more present at based on how many cases has occurred in a neighbourhood and figure out where to develop future police facilities.

For the rest of the paper, the data section Section 2 will describe the datasets used and how they were retrieved, our variables of interest used in our graphs and tables, and briefly about any variables that were constructed and the data cleaning process. The results section Section 3 will describe and show graphs and tables created based on our datasets and the discussion section Section 4 will provide an overview of what we did in our results, explain the meaning of our results and the implications it has on the real world, and provide potential areas of improvements of the paper and suggestions of future works.

2 Data

2.1 Methodology

The three datasets used by the paper were simulated, retrieved, cleaned, analyzed, and tested using the R programming language (R Core Team 2024), tidyverse (Wickham et al. 2019), opendatatoronto (Gelfand 2022), knitr (Xie 2014), janitor (Firke 2023), dplyr (Wickham et al. 2023), ggplot2 (Wickham 2016), GeoJSON (Cooley 2022), and sf (Pebesma and Bivand 2023).

2.2 Data Source and Measurements

The data used for the analysis comes from the "cleaned_crime_data" and "cleaned_police_location" datasets. The datasets was constructed by calling the opendatatoronto package (Gelfand 2022), which accesses and download data from the City of Toronto's Open Data Portal. The latest versions of the datasets was scraped on September 24, 2024 at 10:28 pm EDT. We also removed duplicate observations from the original dataset that comes from reading in GeoJSON files for the datasets. Other datasets we considered scraping includes the "Neighbourhoods" dataset to obtain neighbourhood boundaries for the maps but further testing showed that these boundaries were provided by the "cleaned_crime_data" dataset.

2.2.1 Neighbourhood Crime Rates Dataset

The "cleaned_crime_data" dataset was retrieved from the "Neighbourhood Crime Rates" dataset and the last time the dataset was updated on the Open Data Portal was on January

11, 2024. This dataset comprised of crime data by neighbourhood that included the number of cases of assault, robbery, homicide, shootings, auto theft, break and enter, and theft over. The original dataset was published by the Toronto Police Services collected from 2014 to 2023, inclusive and is updated annually. For the cleaned dataset, we decided to filter for homicides and shootings and focus on the cases from 2018 to 2023, inclusive. The 2023 population projection in the dataset was provided by Environics Analytics where they only included the number of residents in the neighbourhood (Toronto Police Services 2024).

Each observation in the dataset represent one of Toronto's 158 neighbourhoods and its shootings and homicides from the years 2018 to 2023, inclusive that was recorded by the Toronto Police Services as crimes occur in Toronto. The original dataset is updated annually by the Toronto Police Services in January of the following year. There are 1896 unique observations in total in the dataset.

Looking at Table 1, year represents the year the number of homicides and shootings takes place in the neighbourhood and num_of_cases and homicide_or_shooting were constructed based on the columns representing homicide and shootings in the original dataset. homicide_or_shooting indicates what the current crime in the neighbourhood the observation is describing and the num_of_cases indicates the number of cases for the crime indicated by homicide_or_shooting. hood_id is a number between 1 to 174 that represents the ID for the neighbourhood with some neighbourhoods having more than 1 ID. The neighbourhood column contains the name of the neighbourhood.

Not shown in Table 1, the geometry column contains points to create the neighbourhood area the shooting or homicide takes place in and population_2023 represents the population projection for 2023 obtained from Environics Analytics. Other variables constructed from this dataset that is not shown includes num cases total, population of toronto, num cases total per neigh per crime, num cases total per neigh per crime prop, num_cases_total_per_neigh, num_cases_total_per_neigh_prop, prop_of_toronto_pop_in_neigh, yearly_num_cases_total, and yearly_num_cases_total_prop. num_cases_total is the total number of shootings and homicides from 2018 to 2023 while population of toronto is the population of Toronto in 2023 obtained from summing up the population 2023 column. num cases total per neigh per crime represents the number of cases for either homicides or shootings in a particular neighbourhood while num cases total per neigh per crime prop is the proportion of num cases total per neigh per crime in relation to num cases total. num cases total per neigh represents the number of cases total for each neighbourhood with num cases total per neigh prop representing the proportion of num_cases_total_per_neigh in relation to num_cases_total.prop_of_toronto_pop_in_neigh is the population of the neighbourhood in relation to the population of Toronto in 2023. yearly_num_cases_total represents the total number of cases for each crime yearly across ALL neighbourhood per year and yearly num cases total prop is the proportion of yearly num cases total in relation to num cases total.

Table 1: Preview of dataset on crime rates across Toronto neighbourhoods from 2018 to 2023 provided by Toronto Police Services

year	num_of_cases	hood_id	homicide_or_shooting	neighbourhood
2018	0	174	homicide	South Eglinton-Davisville
2019	1	174	homicide	South Eglinton-Davisville
2020	1	174	homicide	South Eglinton-Davisville
2021	1	174	homicide	South Eglinton-Davisville
2022	0	174	homicide	South Eglinton-Davisville
2023	0	174	homicide	South Eglinton-Davisville

2.2.2 Police Facility Locations Dataset

The "cleaned_police_location" dataset was obtained from the "Police Facility Locations" dataset on the Open Data Portal. The last time the dataset was updated on January 20, 2023 and is updated as new locations are added. Each observation in the dataset represents a police facility in Toronto and its respective geographical point that is recorded by Toronto Police Services as new locations open. There are 26 unique observations in the dataset and contains two variables of interest facility and geometry. As seen in Table 2, facility represents the name of the police location while geometry represents a geographical point of the location on a map.

Table 2: Preview of dataset on police facility locations provided by Toronto Police Services

facility	geometry
11 Division	POINT (-79.46083 43.67108)
12 Division	POINT (-79.48688 43.69458)
13 Division	POINT (-79.43668 43.69833)
14 Division	POINT (-79.42598 43.65131)
22 Division	POINT (-79.52918 43.64311)
23 Division	POINT (-79.58352 43.74387)

2.3 Variables of Interest

Our variables of interest from the "cleaned_crime_data" dataset are num_of_cases, homicide_or_shooting, hood_id, neighbourhood, and geometry. The variables constructed based on the dataset that are variables of interest includes num_cases_total, num_cases_total_per_neigh_per_crime, num_cases_total_per_neigh_per_crime_prop, num_cases_total_per_neigh, num_cases_total_per_neigh_prop, prop_of_toronto_pop_in_neigh,

yearly_num_cases_total, and yearly_num_cases_total_prop. The variables of interest from the "cleaned_police_location" dataset includes facility and geometry.

3 Results

3.1 Number of Homicides and Shootings in Toronto from 2018 to 2023 in Toronto

Looking at Table 3 and Figure 1, we can see that the number of shootings across all Toronto neighbourhoods increased from 427 cases in 2018 to 492 cases in 2019. In 2020, the number of shootings decreased to 462 and it decreased the following years for 2021 with 409 shootings, for 2022 with 380 shootings, and for 2023 with 342 shootings. For homicides, there were 98 cases in 2018, 79 cases in 2019, and 71 cases in 2020. There was an increase in homicides in 2021 to 85 cases and decreases in homicides in 2022 and 2023 to 71 and 72 cases, respectively.

Table 3: Number of Homicide and Shooting Cases in Toronto from 2018 to 2023

Year	Type of crime	Total number of cases yearly	Proportion of cases yearly
2018	shooting	427	0.14
2018	homicide	98	0.03
2019	shooting	492	0.16
2019	homicide	79	0.03
2020	shooting	462	0.15
2020	homicide	71	0.02
2021	shooting	409	0.14
2021	homicide	85	0.03
2022	shooting	380	0.13
2022	homicide	71	0.02
2023	shooting	342	0.11
2023	homicide	72	0.02

Across all Toronto neighbourhoods, Table 4 shows that the mean total number of shootings is about 419 cases from 2018 to 2023 across all neighbourhoods yearly. The median total number of shootings is about 418 cases from 2018 to 2023 across all neighbourhoods yearly. Table 5 shows that the mean number of homicides annually across all Toronto neighbourhoods from 2018 to 2023 is 79 while the median is 76 cases.

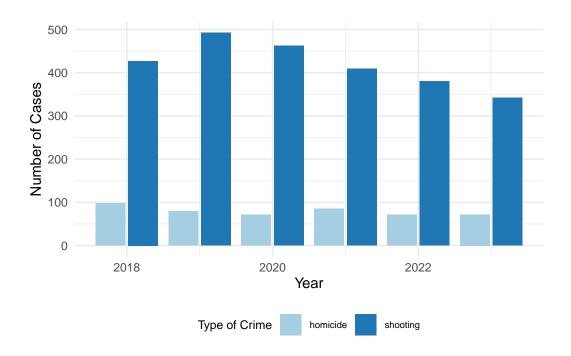


Figure 1: Number of Homicide and Shooting Cases in Toronto from 2018 to 2023

Table 4: Minimum, quartiles, median, and maximum of the number of shootings in Toronto from 2018 to 2023

Total number of cases
Min. :342.0
1st Qu.:387.2
Median :418.0
Mean :418.7
3rd Qu.:453.2
Max. :492.0

Table 5: Minimum, quartiles, median, and maximum of the number of homicides in Toronto from 2018 to 2023

Total number of cases	S
Min. :71.00	
1st Qu.:71.25	
Median: 75.50	
Mean: 79.33	

Table 5: Minimum, quartiles, median, and maximum of the number of homicides in Toronto from 2018 to 2023

	Total	number of case	s
3rd Qu.:83.50 Max. :98.00	•		_

3.2 Six Toronto Neighbourhoods with the Highest Cases of Homicides and Shootings from 2018 to 2023

Table 6 shows that Glenfield-Jane Heights has the highest number of shootings from 2018 to 2023 with 133 cases (4% of all shootings and homicides from 2018 to 2023) out of the 6 Toronto neighbourhoods with the highest number of shootings. Following this, Mount Olive-Silverstone-Jamestown has the second highest number of shootings with 82 cases (3% of all shootings and homicides from 2018 to 2023). For the rest in descending order, Black Creek has 69 cases (2% of all shootings and homicides), York University Heights has 59 cases (2% of all shootings and homicides), and Golfdale-Cedarbrae-Woburn has 54 cases (2% of all shootings and homicides).

Table 7 indicates that Moss Park has the highest number of homicides from 2018 to 2023 with 20 cases (1% of all shootings and homicides). Mount Olive-Silverstone-Jamestown is not only in second for the highest number of shootings but also for homicides with 15 cases from 2018 to 2023 (1% of all shootings and homicides). For the other four neighbourhoods, Avondale has 13 cases (< 1 of all shootings and homicides), Glenfield-Jane Heights and York University Heights both have 11 cases (< 1 of all shootings and homicides), and Eglinton East has 10 cases (< 1 of all shootings and homicides).

For both Table 6 and Table 7, the proportion of people living in each of the 12 neighbourhoods are < 1.

Table 6: Six Toronto Neighbourhoods with the Highest Cases of Shootings from 2018 to 2023

	F	Proportion of		Proportion of
	Neighbourhood	Population	Total number of	cases $(2018 to$
Neighbourhood	ID	(2023)	cases $(2018 \text{ to } 2023)$	2023)
Glenfield-Jane	25	0	133	0.04
Heights				
Mount	2	0	82	0.03
Olive-Silverstone-				
Jamestown				
Black Creek	24	0	69	0.02

Table 6: Six Toronto Neighbourhoods with the Highest Cases of Shootings from 2018 to 2023

	P	Proportion of		Proportion of
	Neighbourhood	Population	Total number of	cases (2018 to
Neighbourhood	ID	(2023)	cases $(2018 \text{ to } 2023)$	2023)
York University Heights	27	0	59	0.02
Yorkdale-Glen Park	31	0	58	0.02
Golfdale- Cedarbrae- Woburn	141	0	54	0.02

Table 7: Six Toronto Neighbourhoods with the Highest Cases of Homicides from 2018 to 2023

	P	Proportion of		Proportion of
	Neighbourhood	Population	Total number of	cases (2018 to
Neighbourhood	ID	(2023)	cases $(2018 \text{ to } 2023)$	2023)
Moss Park	73	0	20	0.01
Mount	2	0	15	0.01
Olive-Silverstone-				
Jamestown				
Avondale	153	0	13	0.00
Glenfield-Jane	25	0	11	0.00
Heights				
York University	27	0	11	0.00
Heights				
Eglinton East	138	0	10	0.00

Based on Table 8 and Figure 2, Glenfield-Jane Heights is the neighbourhood with the highest number of homicides and shootings from 2018 to 2023 with 144 cases (5% of all shootings and homicides). Mount Olive-Silverstone-Jamestown has the second highest number of cases with 97 cases (3% of all shootings and homicides). For the rest of four neighbourhoods, Black Creek has 77 cases (3% of shootings and homicides), York University Heights has 70 cases (2% of shootings and homicides), Yorkdale-Glen Park has 64 cases (2% of shootings and homicides). For all neighbourhoods, the proportion of the people living in each of the neighbourhood is < 1.

Table 8: Six Toronto Neighbourhoods with the Highest Cases of Homicides and Shootings Combined from 2018 to 2023

	F	roportion of		Proportion of
	Neighbourhood	Population	Total number of	cases $(2018 to$
Neighbourhood	ID	(2023)	cases $(2018 \text{ to } 2023)$	2023)
Glenfield-Jane	25	0	144	0.05
Heights				
Mount	2	0	97	0.03
Olive-Silverstone-				
Jamestown				
Black Creek	24	0	77	0.03
York University	27	0	70	0.02
Heights				
Yorkdale-Glen	31	0	64	0.02
Park				
West	1	0	60	0.02
Humber-Clairville				

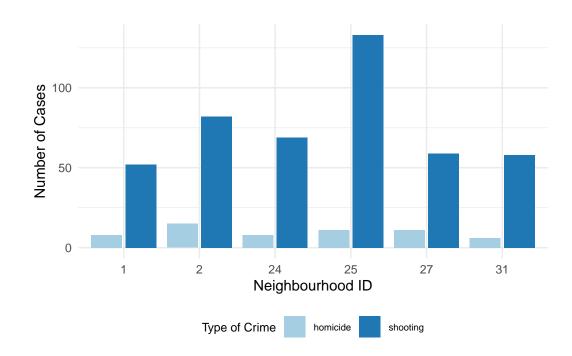


Figure 2: Six Toronto Neighbourhoods with the Highest Cases of Homicides and Shootings from 2018 to 2023

3.3 Police Facility Locations in relation to the Number of Homicides and Shootings from 2018 to 2023 across Toronto Neighbourhoods

Figure 3 shows that there are a greater density of police locations closer to the downtown area of Toronto. We can see that neighbourhood 73 also known as Moss Park, which had the number of cases of homicides according to Table 7 has a police location situated along its border. Mount Olive-Silverstone-Jamestown (neighbourhood 2) has a police station located in the neighbourhood. However with other neighbourhoods with a high number of homicides such as West Humber-Clairville (1), Avondale (153), Glenfield-Jane Heights (25), York University Heights (27), and Eglinton East (138) has no police facilities in their neighbourhoods. Figure 3 also shows that neighbourhoods in eastern, southern, and northwest Toronto have clusters with high numbers of homicides.

Number of homicides across Toronto neighbourhoods (2018 to 2023)

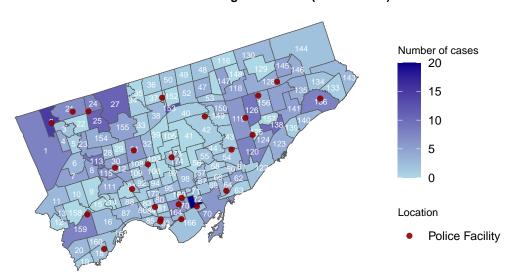


Figure 3: Location of police facilities in relation to the number of homicides across Toronto neighbourhoods from 2018 to 2023.

Based on Figure 4, the neighbourhood with the highest number of shootings, Glenfield-Jane Heights (25) has no police facility located in the neighbourhood. However, Mount Olive-Silverstone-Jamestown (2) and Black Creek (24) have police facilities located in their neighbourhoods. For the other three neighbourhoods, York University Heights (27) and Golfdale-Cedarbrae-Woburn (141) have no police facilities located in the neighbourhood while Yorkdale-Glen Park (31) does. The neighbourhoods with the most number of shootings appears to be located in eastern and northern Toronto but there are fewer police stations located there compared to southern Toronto.

Number of shootings across Toronto neighbourhoods (2018 to 2023)

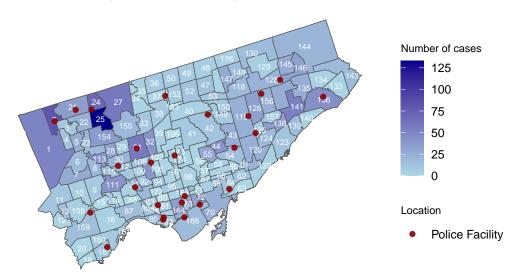


Figure 4: Location of police facilities in relation to the number of shootings across Toronto neighbourhoods from 2018 to 2023.

4 Discussion

In Section 3, we focused on cases from 2018 to 2023 and looked at the number of homicides and shootings yearly and the six Toronto neighbourhoods that had the highest number of homicides and shootings using tables and graphs. Finally, we mapped where police facilities are located in Toronto alongside the number of homicides and shootings for each neighbourhood. We saw that the yearly number of shootings was consistent with reports (Balintec 2023) indicating that gun violence was decreasing prior to 2024.

4.1 Neighbourhoods with below average household incomes and smaller populations have the highest number of shootings and homicides

School of Cities (2021) states that the average household income after-tax in 2020 for Toronto neighbourhoods is \$96000. Using our result Table 8 and further research from City of Toronto (2021) indicates that the six neighbourhoods with the highest number of shootings and homicides have below average household incomes after tax. Glenfield-Jane Heights, the neighbourhood with the highest number of cases, have an average after-tax household income in 2020 with \$76300 (City of Toronto 2021). Mount Olive-Silverstone-Jamestown has an average household income of \$78200 while Black Creek has an average household income of \$68300 (City

of Toronto 2021). For the rest of the neighbourhoods, residents in York University Heights make an average household income of \$77400 after tax while it is \$81800 for Yorkdale-Glen Park residents and \$92300 for West Humber-Clairville (City of Toronto 2021). From Table 8, we also found that all neighbourhoods with high number of shootings and homicides have population sizes that made up less than 1% of Toronto's total population.

4.2 Police stations commonly not found in neighbourhoods with high number of shootings and homicides

Figure 3 and Figure 4 showed that neighbourhoods with high number of shootings or homicides commonly did not have a police station located in them. However, there are some neighbourhoods with police stations located in the neighbourhood but still had a high number of cases. This indicates that having police stations located in the neighbourhood does not necessarily mean there is less crime cases in the specific neighbourhood. Although we found that clusters of neighbourhoods with higher number of cases had fewer police stations relative to the size of the cluster. In a study done by the National Bureau of Economic Research, they found that having more police presence in city can decrease the number of high-level crimes like homicides but this means more low-level crime arrests and traffic stops, which can hurt neighbourhoods with larger populations of marginalized individuals (Singh 2023).

4.3 Areas of improvement

We faced several limitations while conducting our analysis. The datasets might not be completely accurate as human errors can occur when an entry is entered in the datasets. In the "Neighbourhood Crime Rates" dataset, the population is an approximation of the residents living in a neighbourhood at a certain point of time and does not consider commuters in the neighbourhoods. Also, the "Neighbourhood Crime Rates" dataset does not indicate if the shooting and/or homicide occurred along the borders of neighbourhoods and so the neighbourhood the case happened at is approximated. In the dataset we obtained on Toronto police facilities, it does not have information about which years each police facility were opened. This limited our analysis of police presence in relation to neighbourhood shootings and homicides.

4.4 Next steps

Results from our analysis can be used to inform decisions on where police divisions could increase their presence. Further investigations can look into how the appearance of police facilities impact the cases of shootings and/or homicides the neighbourhoods it is around over time. Another investigation can also look into the demographics of the neighbourhoods with high number of shootings and homicides.

A Appendix

A.1 Acknowledgments

We would like the acknowledge Alexander (2023) for some R code that was used to produce the tables and graphs.

A.2 Note on Reproducing

To reproduce the results in the paper, first run the scripts found in the scripts folder of the GitHub repository corresponding to the paper starting with the script, 00-install_packages.R to install the necessary packages.

A.3 Code styling

Code written in the scripts was checked and styled with lintr (Hester et al. 2024) and styler (Müller and Walthert 2024).

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