# **Toronto Paramedic Services\***

A deeper look into what is driving high EMS demand in Toronto

Julia Lee

September 24, 2024

First sentence. Second sentence. Third sentence. Fourth sentence.

#### 1 Introduction

"In case of an emergency, please call 911." From building walls to road signs, this is a message that appears almost everywhere, and it instills the idea that no matter the circumstance, there will always be emergency services available to help. However, research shows that this is not the case. A report on Toronto's paramedic services highlights that there were no ambulances available to over 1,000 calls in 2023 Draaisma (2024). With drastically increasing wait times for those who required EMS (emergency medical services), it is crucial to understand why paramedic services are unable to keep up with a seemingly growing demand for EMS.

In response to this rising challenge, the report posits that in order to elevate the "efficiency and effectiveness" Draaisma (2024) of Toronto's paramedic services, further research on how to manage EMS demand is needed. Thus, this paper seeks to investigate the factors that seem to be driving EMS demand within Toronto. Using Paramedic Services Incident Data offered by Toronto Paramedic Services, the aim is to identify which types of emergencies (e.g. medical emergencies or vehicle accidents) strongly drive EMS demand. Knowing this can help inform effective strategies that allocate resources to these drivers for better EMS demand management.

With this, this paper first examines the total number of emergency calls made from 2017 to 2022 to better understand how EMS demand has changed over time. Then, it looks at EMS demand through five different incident types as outlined by Toronto Paramedic Services to determine any key drivers of the total EMS demand. As a result, ...

<sup>\*</sup>Code and data are available at: https://github.com/JuliaJLee/Toronto\_Paramedic\_Services.git

In what follows, the paper will define the data that was used within this analysis, provide a detailed account of the results, and put forth a meaningful reflection of the analysis along with its limitations and next steps.

#### 2 Data

Paramedic Services Incident Data (2017-2022) is provided by Toronto Paramedic Services (TorontoParamedicServices 2023). The records of when a paramedic was dispatched having received a call, they type of incident, the priority level of each incident, the number of paramedic units that arrived at the scene, and the general location of each incident are all updated by hand to the city of Toronto's Open Data portal (CityofToronto 2024).

To simulate, test, download, and clean the Paramedic Services Incident Data (2017-2022), the statistical programming language R was used (R Core Team 2023). Specific libraries that assisted the analysis include tidyverse (Wickham et al. 2019), dplyr (Wickham et al. 2023), opendatatoronto (Gelfand 2022), tinytex (Xie 2019), ggplot2 (Wickham 2016), and knitr (Xie 2015).

The Paramedic Services Incident Data is refreshed annually and contains information on every single incident paramedics have responded to since January 1st to December 31st in 2017 to 2022. For every day of each year, there are multiple records of incidents that have occurred. For every record, there is an ID number, the date and time when a paramedic unit was dispatched, the type of incident, the severity of the incident (priority), the number of paramedic units at the scene, and the general location of the incident. Table 1 below previews this information for recorded incidents in 2022.

Table 1: Paramedic Services Incident Data for 2022

| ID        | Dispatch Time          | Incident Type          | Priority | Units<br>Arrived | Location |
|-----------|------------------------|------------------------|----------|------------------|----------|
| 5,827,367 | 2022-04-27<br>22:15:02 | Emergency Transfer     | 1        | 2                | M6R      |
| 7,388,641 | 2022-01-01<br>00:00:15 | Medical                | 1        | 1                | M6A      |
| 7,388,642 | 2022-01-01<br>00:00:33 | Motor Vehicle Accident | 1        | 2                | M5E      |
| 7,388,644 | 2022-01-01<br>00:02:26 | Medical                | 1        | 2                | M4M      |
| 7,388,645 | 2022-01-01<br>00:03:46 | Medical                | 3        | 1                | M9W      |
| 7,388,647 | 2022-01-01<br>00:05:02 | Medical                | 5        | 1                | M1K      |

For this analysis, the variables of interest within this analysis are the different incident types that are recorded. This dataset lists five different incident types: medical emergencies, vehicle accidents, emergency transfers, fires, and airport standbys. These types refer to different circumstances under which individuals may call 911 for EMS.

## 3 Results

#### 3.1 EMS Demand from 2017 to 2022

Rows: 6 Columns: 8

-- Column specification ------

Delimiter: ","

dbl (8): Year, Medical\_Emergency\_Calls, Vehicle\_Accident\_Calls, Emergency\_Tr...

i Use `spec()` to retrieve the full column specification for this data.

i Specify the column types or set `show\_col\_types = FALSE` to quiet this message.

Warning: Using `size` aesthetic for lines was deprecated in ggplot2 3.4.0. i Please use `linewidth` instead.

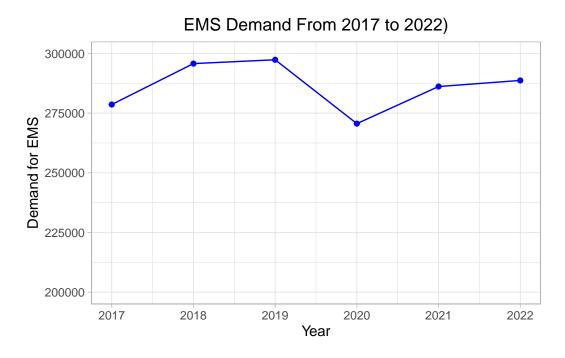


Figure 1: Total EMS Demand for Each Year between 2017 and 2022

# 4 Discussion

## 4.1 First discussion point

If my paper were 10 pages, then should be be at least 2.5 pages. The discussion is a chance to show off what you know and what you learnt from all this.

# 4.2 Second discussion point

# 4.3 Third discussion point

# 4.4 Weaknesses and next steps

Weaknesses and next steps should also be included.

## References

- CityofToronto. 2024. "City of Toronto's Open Data Portal." https://open.toronto.ca/.
- Draaisma, Muriel. 2024. "No Ambulances Available in Toronto 1,200 Times Last Year, Report Finds." https://www.cbc.ca/news/canada/toronto/ambulance-response-times-toronto-auditor-general-1.7249207.
- Gelfand, Sharla. 2022. "Opendatatoronto: Access the City of Toronto Open Data Portal." https://cran.r-project.org/web/packages/opendatatoronto/index.html.
- R Core Team. 2023. R: A Language and Environment for Statistical Computing. Vienna, Austria: R Foundation for Statistical Computing. https://www.R-project.org/.
- TorontoParamedicServices. 2023. "Paramedic Services Incident Data (2017-2022)." https://open.toronto.ca/dataset/paramedic-services-incident-data/.
- Wickham, Hadley. 2016. "Ggplot2: Elegant Graphics for Data Analysis." https://ggplot2. tidyverse.org.
- Wickham, Hadley, Mara Averick, Jennifer Bryan, Winston Chang, Lucy D'Agostino McGowan, Romain François, Garrett Grolemund, et al. 2019. "Welcome to the Tidyverse." *Journal of Open Source Software* 4 (43): 1686. https://doi.org/10.21105/joss.01686.
- Wickham, Hadley, Romain François, Lionel Henry, Kirill Müller, and Davis Vaughan. 2023. "Dplyr: A Grammar of Data Manipulation." https://cran.r-project.org/web/packages/dplyr/index.html.
- Xie, Yihui. 2015. Dynamic Documents with R and Knitr. 2nd ed. Boca Raton, Florida: Chapman; Hall/CRC. https://yihui.org/knitr/.
- ———. 2019. "TinyTeX: A Lightweight, Cross-Platform, and Easy-to-Maintain LaTeX Distribution Based on TeX Live." *TUGboat* 40 (1): 30–32. https://tug.org/TUGboat/Contents/contents40-1.html.