Assessing Toronto's Shelter System: Availability, Utilization, and Urgent Capacity Needs*

Diana Shen

September 22, 2024

Providing access to safe and reliable shelters is a critical first step in helping individuals experiencing homelessness reintegrate into society. The City of Toronto has collaborated with local communities to build shelters to address this need. Using data from the 'Daily Shelter & Overnight Service Occupancy & Capacity' dataset from Toronto Open Data 2023, this paper investigates that the funded shelters have efficiently been used with high service user count and occupancy rate, particularly on emergency homelessness services. However, despite these efforts, the City of Toronto faces a shortage of long-term transitional shelters, which are essential for supporting individuals as they re-enter society. This may be because the cumbersome application process for transitional shelters has led to low demand, despite a significant number of homeless individuals still in need of such shelters.

1 1. Introduction

Toronto has the largest homeless population in Canada, with over 10,000 individuals experiencing homelessness each night. The causes of homelessness are varied and complex, including unemployment, family breakdown, domestic violence, mental health challenges, poor physical health, substance abuse, and physical, sexual, or emotional abuse, among other factors. (Victor (2023)) In May 2023, the Toronto City Council officially declared a state of emergency on homelessness, recognizing a crisis that has persisted for decades. The City of Toronto's Shelter, Support & Housing Administration works in collaboration with community agencies to provide housing and homelessness services through funding support and service coordination. (Jadidzadeh and Kneebone (2018)) As of October 2023, Toronto was home to approximately

^{*}Code and data are available at: https://github.com/DianaShen1224/Donaldson-Paper.git

10,700 individuals experiencing homelessness, with about 9,000 utilizing the shelter system and 1,700 living outdoors.

Given the scale of homelessness in Toronto, it is essential to assess how effectively the city's shelter system is addressing this need. Many individuals experiencing homelessness face barriers to accessing information and services, making the availability of shelters a critical indicator of the system's effectiveness. Therefore, our paper utilize data in 2023 from Support Services division's Shelter Management Information System (SMIS) to examine the effectiveness of Toronto's shelters. The paper uses shelter occupancy rates and service user counts as key availability indicators, exploring whether the government-funded shelters has been fully used to fill this knowledge gap.

To do this, the daily list of active overnight shelter and allied services from the Toronto Shelter and SMIS database was obtained from Toronto Open Data, as described in Section 2.1. Based on this dataset, it was found that shelters in GTA are highly concentrated, with about 78% located within the city, while North York has the second-highest concentration at only 9.9%. We find out that though shelters are highly available, but despite from Toronto downtown, other cities are still facing a shortage. Regarding shelter usage, mixed adult emergency shelters are the most frequently used, with a total of 1,071,686 counts in 2023. Usage drops dramatically in February and rises again in December. (Section 2.2) We find out that though shelters are highly available, but despite from Toronto downtown, other cities are still facing a shortage (for NY only 9.9%). The occupancy rate is consistently at 100% for both emergency and transitional shelters, which shows a high efficiently used results. As discussed in Section 3, this high occupancy rate highlights a new problem that existing shelters is not meeting the needs of the growing homeless population, underscoring the urgent need to expand shelter capacity. Additionally, it is evident that transitional shelters face significant shortages, which are critical for helping individuals re-enter society. With respect to the structure of this paper, Section 2 provides an overview of the data and results, while Section 3 includes a discussion of the findings; and Section A includes supplementary information.

2 Data

2.1 Overview

The data used in this paper came from the OpenData Toronto portal through the library opendatatoronto (Gelfand (2022)). The particular data set used to analyze the active overnight shelter and allied services in the Toronto Shelter in the City of Toronto is Daily Shelter & Overnight Service Occupancy & Capacity (Support Services (2024)). It provides daily updates on shelter and overnight service programs administered by TSSS, including program operator, location, classification, occupancy, and capacity. This data is refreshed daily and the particular data used in this paper is up-to-date as of December 31, 2023. In addition, this dataset is considered to be "open data" (Support Services (2024)) and can be utilized for a variety of

purposes as long as an attribution statement is attached (Section A.1) and the link to the City of Toronto's Open Data License is added ("Open Data License" (2024)).

There are 32 variables in the dataset. The full description and explanation of variables are shown in (Section A.4. The variables or measurements that are used in this analysis are "Service User Count", which refers to the count of the number of service users staying in an overnight program as of the occupancy time and date.; "Shelter programs" (named "program_model" in the original dataset), which indicates whether the shelter programs is either Emergency or Transitional (Emergency: A homeless shelter program that can be accessed by any individual or family experiencing homelessness with or without a referral. Transitional: A homeless shelter program that provides required, specialized programming and can be accessed by eligible individuals and families experiencing homelessness by referral only.); "shelter sectors" (named "sector" in the original dataset), which denotes ameans of categorizing homeless shelters based on the gender, age and household size of the service user group(s) served at the shelter location (Section A.4; "occupancy rate bed", which indicates the proportion of actual bed capacity that is occupied for the reporting date; "occupancy rate rooms", which indicates the proportion of actual room capacity that is occupied for the reporting date (detailed calculation rules in Section A.4).

The other dataset that involving shelters are Deaths of Shelter Residents, Daily Shelter Occupancy, Toronto Shelter System Flow, Fatal and non-fatal suspected opioid overdoses in the shelter system, could be identified following by searching City of Toronto's Open Data Catalogue Data. Since this paper focus on the effectiveness of shelters, not the people living in the shelter, these dataset were not used in this analysis. In addition the daily shelter occupancy is updated to Daily Shelter & Overnight Service Occupancy & Capacity since 2021, so this paper only use the latest version.

The data was cleaned and analyzied by using the open source statistical programming language R (Wickham et al. (2019a)). This paper use janitor (Firke (2023)) and tidyverse (Wickham et al. (2019b)) packages to simulate the dataset and generate tests for it. The opendatatoronto (Gelfand (2022)) and tidyverse (Wickham et al. (2019b)) packages were then applied in order to download the raw Toronto Public Health dataset. Next, the tidyverse package (Wickham et al. (2019b)) was used to clean the raw dataset and test the cleaned dataset. Then, the paper use ggplot2 (Wickham (2016)) to draw graphs from data, use modelsummary (Arel-Bundock (2022)) to generate the summary table.

2.2 Results

Table 1 illustrates the summary statistic of the categorical variables (not including ID and address variables). It shows that Toronto owns the majority of shelters, approximately 78%. The shelters are highly concentrated since the second high city North York takes only 9.9% of the shelters. The shelter sectors are approximately evenly distributed, with highest sector mixed adult (29.8%). The emergency program shelter programs comprised a majority

Table 1

		N	%
location_city	Etobicoke	1095	2.3
	North York	4808	9.9
	Scarborough	2915	6.0
	Toronto	37699	78.0
	Vaughan	365	0.8
	NA	1463	3.0
sector	Families	5019	10.4
	Men	12188	25.2
	Mixed Adult	14409	29.8
	Women	8654	17.9
	Youth	8075	16.7
program_model	Emergency	39306	81.3
	Transitional	9039	18.7
overnight_service_type	24-Hour Respite Site	2931	6.1
	24-Hour Women's Drop-in	643	1.3
	Alternative Space Protocol	209	0.4
	Isolation/Recovery Site	348	0.7
	Motel/Hotel Shelter	12189	25.2
	Shelter	31778	65.7
	Warming Centre	247	0.5
program_area	Base Program - Refugee	2555	5.3
	Base Shelter and Overnight Services System	32161	66.5
	COVID-19 Response	9982	20.6
	Temporary Refugee Response	2507	5.2
	Winter Programs	1140	2.4
capacity_type	Bed Based Capacity	32888	68.0
	Room Based Capacity	15457	32.0

Summary of Catogrical Variables in the dataset

Table 2

	Mean	SD	Min	Median	Max	Histogram
capacity_actual_bed	44.3	38.2	1.0	35.0	278.0	L
$capacity_funding_bed$	45.4	38.6	2.0	35.0	278.0	
$occupied_beds$	43.8	38.3	1.0	33.0	278.0	L
$unoccupied_beds$	0.5	1.6	0.0	0.0	46.0	
$unavailable_beds$	1.1	3.5	-1.0	0.0	105.0	L
capacity_actual_room	69.8	65.4	1.0	47.0	327.0	L
$capacity_funding_room$	73.6	66.7	1.0	52.0	334.0	L
$occupied_rooms$	69.3	65.3	1.0	47.0	327.0	L
$unoccupied_rooms$	0.4	1.9	-1.0	0.0	25.0	L
$unavailable_rooms$	4.9	10.4	0.0	1.0	91.0	L
$occupancy_rate_beds$	97.5	7.9	3.3	100.0	100.0	
occupancy_rate_rooms	99.1	3.5	25.0	100.0	100.9	
service_user_count	68.0	86.3	1.0	46.0	657.0	

Summary of Numerical Variables in the dataset

(81.3%). For the service type, shelter consists 65.5% of the total services, following by motel (25.2%) and 24-Hour Respite Site (6.1%). Regular shelter (Base Shelter and Overnight Services System) comprised the majority (66.5%), following by COVID-19 Response (20.6%). For the capacity type, bed based is more common (68.8%), while for room based is only 32%. Table 2 illustrates the summary statistic of the numerical variables (not including ID and address variables). It shows that the mean of actual bed in shelters is approximately 44, for funding bed is 45.5. Thus, the mean of unavailable beds are 1.1. For room based, it's 73 for funding rooms and 69 for actual rooms, and the unavailable rooms are 4.9. The occupancy rate for both rooms and beds are high (99.1% and 97.5%), thus for the unoccupied beds and rooms are low (0.5 and 0.4). The mean of service user count is approximately 68 counts per day.

Figure 1 shows the sum of the count of service users in each city for each shelter programs of homeless shelters. It indicates that the emergency program shelters in Toronto has the highest number of times used. In 2023, they have been used for 1,869,153 times (56.84% of total user counts). Following by the emergency program shelters in North York (615,366,18.71%). Only three cities has transitional program, which is Toronto (329,046), Etobicoke (5279) and Scarborough (13,427).

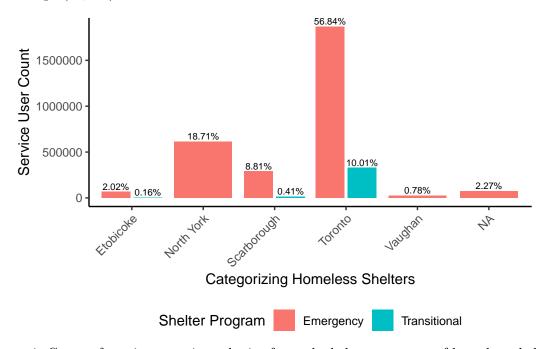


Figure 1: Count of service users in each city for each shelter programs of homeless shelters.

Figure 2 illustrates the number of shelters for each program sectors by different shelter programs. The highest is category is emergency Mixed Adult, 1071686 counts of users. Following by emergency Families (773818), emergency Men (632405), emergency Women (311085), emergency Youth (151759); transitional Families (108815), Mixed Adult (70805), Men (64191),

Women (38873), Youth (65068).

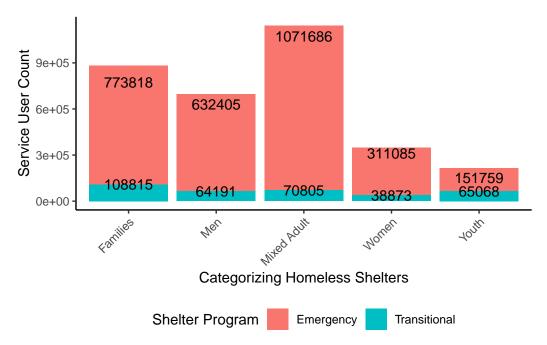


Figure 2: Service User Count for each category for each shelter program for homeless shelters.

In Figure 3, they show the trend of the count of service users by month. There are two noticeable changes from Jan to Dec in 2023. First is the dramatic drop in February and the second is the increase in December. From fig-line1-2, shows that there's the drop and increase changes in users of emergency program shelters, while for transitional programs, it's not obvious.

In Figure 4, it states that for every category of homeless shelters, the occupancy rate is heavily distributed at 100% for both bed and room-based. Obviously, for the bed-based, Youth has some occurrence of low occupancy rate (approximately 50%). Note that because the family sector doesn't contain bed-based, there's no family category in bed-based.

In Figure 5, the histogram states that for both emergency and transitional programs, the occupancy rate is mostly distributed at 100% for both bed and room-based.

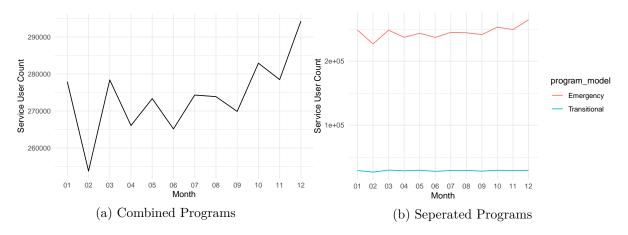


Figure 3: Count of service users in each city by month.

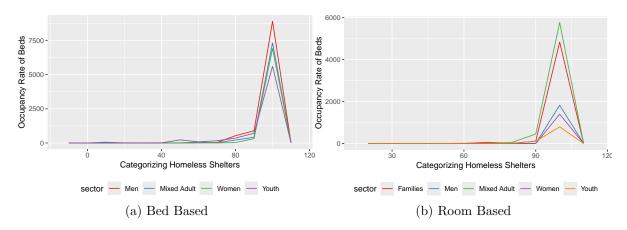


Figure 4: Distribution of occupancy rate in each city for each category of homeless shelters.

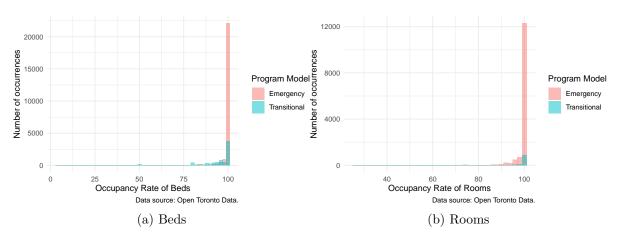


Figure 5: Distribution of occupancy rate in each Program Model.

3 Discussion

3.1 From User Service Count Aspect

Based on the dataset, it was found that shelters in the Greater Toronto Area (GTA) are highly concentrated, with approximately 78% located within the city of Toronto. In comparison, North York has the second-highest concentration at only 9.9%. However, as shown in Figure 1, North York shelters account for 18.71% of the total service user count, nearly double its proportion of shelters. This suggests that despite the high number of shelters in the GTA, areas outside of downtown Toronto, such as North York, are still facing a shortage of shelters and experiencing significant capacity pressure. Regarding shelter usage, mixed adult emergency shelters are the most frequently utilized, with a total of 1,071,686 service counts in 2023, followed by emergency Families (773818), emergency Men (632405), emergency Women (311085), emergency Youth (151759); transitional Families (108815), Mixed Adult (70805), Men (64191), Women (38873), Youth (65068). According to data from the City of Toronto((web5?)), approximately 10,700 individuals are experiencing homelessness, which suggests that each adult can stay in a shelter for around 100 nights, on average. Although we currently do not have specific data on the number of days individuals are allowed to stay in shelters, this estimate indicates that Toronto's shelters have enough capacity to temporarily accommodate the homeless population effectively. Usage dramatically drops in February and rises in December. Figure 3 shows that these fluctuations are primarily driven by changes in the number of users of emergency program shelters, as there is no significant variation in the transitional programs. The exact cause of this dramatic change is still unclear; it could be due to February having only 28 days, or there may have been specific events or circumstances in February and December that contributed to the shifts.

3.2 From the Occupancy Rate Aspect

The occupancy rate remains consistently high, close to 100%, across both shelter programs and shelter sectors, reflecting highly efficient utilization (Figure 4,Figure 5). However, a notable exception is the Youth bed-based shelters, which exhibit a small peak at around 50% occupancy. This indicates that, on certain nights, only half of the available beds in youth shelters are occupied. This discrepancy raises important questions: What accounts for the difference in occupancy rates between Youth and Adult shelters? Is it simply that the homeless population among youth is significantly smaller than among adults? Or could it be that youth face a larger information gap regarding shelter availability compared to adults? Understanding the cause of this difference is urgent, as homeless youth are particularly vulnerable, and it is crucial to ensure that they are adequately protected and housed in shelters.

3.3 Transitional

3.4 Weaknesses and next steps

Weaknesses and next steps should also be included.

A Appendix

A.1 Dataset and Graph Sketches

Sketches depicting both the desired dataset and the graphs generated in this analysis are available in the GitHub Repository.

A.2 Data Cleaning

The data cleaning process involved seperating dates into year, month and day for clarity and simplicity. The data doesn't filtered with the NA's value since every observation in the dataset contains at least one missing value in a variable. Removing these observations would result in the complete loss of data, making analysis impossible.

A.3 Attribution Statement

"Contains information licensed under the Open Government Licence- Toronto" ("Open Data License" (2024)).

A.4 variable description

Table 3: Shelter Data Columns and Descriptions

column	description
id	Unique row identifier for Open Data database
occupancy	Date of the record. This date refers to the evening of the overnight period
date	being reported. Data collected at 4:00 am the following morning.
organization	Unique ID to consistently identify organizations even if the organization name
id	changes
organization	Name of the organization providing the overnight service
name	
shelter id	Unique ID to consistently identify the shelter group even if the shelter group name changes
shelter	The shelter group to which the program belongs in the SMIS database
group	
location id	Unique ID to consistently identify locations even if the location name changes
location	The name of the location of the program
name	
location address	Street address of the location of the program

column	description
location	Postal Code of the location of the program
postal code	
location city	City of the location of the program
location	Province of the location of the program
province	
program id	Unique ID to consistently identify programs even if the program name changes
program	Name of the program
name	
sector	Means of categorizing shelters by gender, age, household size of service users
program	Classification of shelter programs as either Emergency or Transitional
model	
overnight	Identifies the type of overnight service being provided (Shelter, 24-Hour
service type	Respite, etc.)
program	Indicates whether the program is part of the base system or a temporary
area	response program
service user	Count of the number of service users staying overnight as of the occupancy
count	date
capacity	Whether the capacity is measured in rooms or beds
type	
capacity	Number of beds available for occupancy
actual bed	
capacity	Number of beds approved to provide
funding bed	
occupied	Number of beds occupied by a shelter user
beds	N
unoccupied beds	Number of available beds not occupied as of the occupancy date
unavailable	Number of hade unavailable due to maintenance repairs etc
beds	Number of beds unavailable due to maintenance, repairs, etc.
capacity	Number of rooms available for occupancy
actual room	rumber of fooms available for occupancy
capacity	Number of rooms approved to provide
funding	rumber of fooms approved to provide
room	
occupied	Number of rooms occupied by a shelter user
rooms	1. amount of rooms occupied of a shorter abor
unoccupied	Number of available rooms not occupied as of the occupancy date
rooms	2
unavailable	Number of rooms unavailable due to maintenance, repairs, etc.
rooms	The state of the s

column	description
occupancy rate beds	Proportion of actual bed capacity occupied
occupancy rate rooms	Proportion of actual room capacity occupied

Description of variables in the dataset

References

- Arel-Bundock, Vincent. 2022. "modelsummary: Data and Model Summaries in R." *Journal of Statistical Software* 103 (1): 1–23. https://doi.org/10.18637/jss.v103.i01.
- Data, Open Toronto. "Dataset Catalogue." https://open.toronto.ca/catalogue/.
- Firke, Sam. 2023. Janitor: Simple Tools for Examining and Cleaning Dirty Data. https://CRAN.R-project.org/package=janitor.
- Gelfand, Sharla. 2022. Opendatatoronto: Access the City of Toronto Open Data Portal. https://CRAN.R-project.org/package=opendatatoronto.
- Jadidzadeh, Ali, and Ron Kneebone. 2018. "Patterns and Intensity of Use of Homeless Shelters in Toronto." *University of Toronto Press Journals* 44 (4): 342–55. https://doi.org/10.3138/cpp.2018-013.
- "Open Data License." 2024. https://open.toronto.ca/open-data-license/.
- Support Services, Toronto Shelter &. 2024. "About Daily Shelter & Overnight Service Occupancy & Capacity." https://open.toronto.ca/dataset/daily-shelter-overnight-service-occupancy-capacity/.
- Victor, Fred. 2023. "Facts about Homelessness in Toronto." https://www.fredvictor.org/facts-about-homelessness-in-toronto/.
- Wickham, Hadley. 2016. *Ggplot2: Elegant Graphics for Data Analysis*. Springer-Verlag New York. https://ggplot2.tidyverse.org.
- Wickham, Hadley, Mara Averick, Jennifer Bryan, Winston Chang, Lucy D'Agostino McGowan, Romain François, Garrett Grolemund, et al. 2019b. "Welcome to the tidyverse." *Journal of Open Source Software* 4 (43): 1686. https://doi.org/10.21105/joss.01686.
- ———, et al. 2019a. "Welcome to the tidyverse." Journal of Open Source Software 4 (43): 1686. https://doi.org/10.21105/joss.01686.