Characterizing Frequent Emergency Department Users in BC: A retrospective analysis of linked provincial databases

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ABSTRACT

Background

This study aimed to characterize frequent emergency department (ED) users in British Columbia (BC) using provincial data.

Methods

We identified patients \geq 18 years who made \geq 1 ED visit from 2012/13-2015/16, and linked to hospitalization, physician billing, prescription, and mortality data. We defined frequent users as the top 10% of patients by annual ED visits.

Results

From 2012/13 to 2015/16, frequent users' visits increased by 63.3% (95% CI: 61.5%, 65.0%), compared to 47.5% (95% CI: 46.7%, 48.3%) for ED visits overall. Frequent users accounted for 17.8-19.7% of visits, with a median of six/year (interquartile interval [IQI]: 5-8). Only 1.51% remained frequent users in all years. Mental illness was prevalent among those <60 years, and circulatory and respiratory complaints among those \geq 60 years.

In 2015/16, frequent users were older than non-frequent users, more frequently resided in the lowest two quintiles of average household incomes, and had similar sex distributions. They had more prescription medications (median 11 [IQI: 6-17] versus 5 [IQI: 2-9], p<0.001), visited more unique primary care physicians (median 9 [IQI: 6-13] versus 3 [IQI: 2-5], p<0.001) and received less care continuity. Annual hospitalizations (median 2 [IQI: 1-4] versus 1 [IQI: 1-2], p<0.001), and 365-day mortality (12.9% versus 4.1%, p<0.001) were higher among frequent versus non-frequent users.

Interpretation

Frequent ED users' visits are increasing in BC. They are heterogenous, high utilizers of other healthcare, and have higher mortality than non-frequent users. Frequent use is rarely persistent. Future efforts to address frequent ED use should account for this heterogeneity and complexity.

INTRODUCTION

Health expenditures in Canada continue to grow year over year; Canadians spent \$7068 per capita on healthcare in 2019 with emergency department (ED) expenses accounting for an increasing proportion of costs.^{1,2} High healthcare users have been identified as a national priority for cost containment.^{3,4} Specifically, frequent ED users comprise 4.5-8% of ED patients, yet account for 21-30% of visits.^{5,6} They are high users of other healthcare services and incur disproportionately high healthcare costs.⁷⁻⁹ Existing literature suggests they are also high-risk: they make higher acuity visits, and are admitted and die more often than non-frequent users.¹⁰⁻¹⁴

Effective solutions require a detailed and generalizable understanding of frequent ED users in Canada. Most characterization studies have been conducted at institution levels and other countries.¹⁵⁻²⁰ Previous provincial analyses in Canada have examined frequent users in a cross-sectional rather than longitudinal manner.^{9,21,22} Population-level temporal trends and transitions into and out of frequent ED use have not been explored.

Interventions described to-date (e.g., case management and care plans) may decrease ED visits.^{17,19,23} However, their effectiveness has not been rigorously studied in Canada. Sustainable solutions require a nuanced understanding of the nature (not just quantity) of frequent ED users' healthcare system interactions. For instance, the proposed solution of greater linkages to primary care contradicts evidence that over 93% of North American frequent ED users are already attached to primary care.^{15,24-28} Liaising frequent users with primary care providers at discharge has had mixed effects on ED use.^{29,30} It is unknown whether improving the quality of the primary care relationship can redirect frequent users towards non-acute care and improve outcomes.

This study's objective was to characterize frequent ED users in British Columbia (BC) using a comprehensive, longitudinal, linked provincial database of demographic, clinical, and healthcare utilization data.

METHODS

Study Design, Setting and Participants

This was a retrospective administrative database study capturing patients who visited an ED in BC between 2012/13 and 2015/16. Data were split into four fiscal years groupings. The **study cohort** was created by identifying all patients aged \geq 18 years who made at least one ED visit during the study timeframe. We identified ED visits based on classification within the National Ambulatory Care Reporting System (NACRS) database.³¹

Data Sources

We created a study database by linking patient-level data for our cohort (NACRS) to hospitalization (Discharge Abstract Database [DAD]),³² physician billing (Medical Services Plan [MSP]),³³ prescription medications (PharmaNet),³⁴ and mortality (Vital Statistics) data.³⁵ Population Data BC housed and linked all databases using personal health number, age, sex, and postal code as linkage variables. All patients were assigned non-identifiable study numbers that remained consistent across databases. The University of British Columbia Clinical Research Ethic Board approved this study.

Study variables and definitions

Frequent Users

Frequent users were defined as patients within our cohort in the top 10% of ED utilization in each fiscal year, consistent with a Canadian Institute for Health Information (CIHI) definition.³⁶

To determine visit counts, we first attempted to identify and remove scheduled revisits. Based on our clinical experience, the majority of scheduled ED revisits in BC are made for intravenous antibiotics for cellulitis. We therefore defined strings of ED visits within 48 hours of one another with an initial diagnosis of cellulitis as presumed scheduled revisits. We examined the diagnostic categories of all ED visits that occurred within 48 hours of one another and confirmed that no diagnoses other than cellulitis commonly appeared.

Non-Frequent Users

We defined non-frequent users as patients in the bottom 90% of ED utilization in each fiscal year, based on visit totals after removing presumed scheduled revisits.

Demographics

Sex, age, rural/urban residence, and average neighbourhood income adjusted for household size³⁷ were available for frequent and non-frequent users. Population estimates were obtained from the Government of British Columbia.³⁸

Acute Care

ED visit characteristics (ambulance arrival, triage level, diagnoses, disposition) were available through NACRS.

Visit acuity is defined using the Canadian Triage and Acuity Scale (CTAS), a national tool that allows Canadian EDs to prioritize patient care.³⁹ It defines five illness acuity levels with differing time-to-physician goals.⁴⁰

We obtained hospitalization dates and diagnoses from DAD.

Physician Visits and Majority Source of Care

We used the general practitioner specialty code to identify primary care providers and visits using MSP data.

We counted both number of visits to primary care physicians and number of unique primary care physicians seen. To describe continuity of primary care, we calculated a majority source of care variable based on whether the patient received at least three services in one year, and at least 50% of services from one general practitioner. ^{42,43}

Mortality

We obtained dates and causes for death in the Vital Statistics database, and examined mortality by sex, age, and age groups.

Diagnostic Categories

ED, hospitalization, and mortality diagnoses are recorded within NACRS, DAD and Vital Statistics using the International Statistical Classification of Diseases and Related Health Problems 10th Revision (ICD-10). The ICD-10 classification system comprises 22 diagnostic chapters, within which specific diagnoses are listed. We summarized frequent and non-frequent users' diagnoses within diagnostic categories (i.e. ICD-10 chapters).⁴¹

Prescription Medications

Using the provincial PharmaNet database, we defined unique medications as those with distinct generic drug names, consistent with previous literature.⁴⁴ We summarized unique medication counts by age groups, and also medication categories using American Hospital Formulary Service (AHFSC) classifications.

Analyses

We characterized our frequent user and non-frequent user groups for each fiscal year, using all data sources available. We reported descriptive statistics based on the type and distribution of each variable. We calculated percentage change in ED visit numbers overall and for visits made by frequent users over the study period, standardized for annual BC population. We used chi-square tests for categorical variables and Wilcoxon rank-sum tests for continuous variables to evaluate statistical significance.

All analyses were performed using R (R Development Core Team, 2011). We used an alpha<0.05 threshold for significance.

RESULTS

From 2012/13 to 2015/16, visits made by frequent users increased from 136,960 to 233,866 and accounted for 17.8% to 19.7% of total ED visits. Frequent ED users' visits increased from 2999.06/100,000 population to 4896.29/100,000 population, an absolute increase of 63.3% (95% CI: 61.5%, 65.0%). In comparison, total ED visits rose from 16,818.04/100,000 population to 24,805.54/100,000, an increase of 47.5% (95% CI: 46.7%, 48.3%). The top 10% of users made a median of six annual ED visits (interquartile interval [IQI]: 5, 8). Visits related to mental illness and injury/poisoning were prevalent among frequent users aged 18 to 60 years. Proportionally, visits attributable to mental illness and injury increased from 2012/13 to 2015/16. Frequent users ≥ 60 years old proportionally made more visits related to circulatory and respiratory disorders (Table 1).

A minority of patients classified as frequent ED users each year remained so in the year that immediately followed (11.7%, 11.7% and 12.7% respectively in 2012/13, 2013/14 and 2014/15). Only 15.7% of patients were frequent users in multiple consecutive or non-consecutive years. Furthermore, only 1.51% of patients remained frequent users in all study years; 1.91% remained frequent users in all years when only examining those who were alive during the entire study.

We report frequent users' characteristics in 2015/16, our most recent year of data, and compare them to non-frequent users (Table 2). Frequent users were older than non-frequent users (median 54.0 years [IQI 36, 73] versus 50.5 years [IQI: 33, 67], p<0.001), and disproportionately represented neighborhood incomes (measured by average household income) in the lowest two quintiles (52% versus 43%, p<0.001). There was no

difference in sex distribution between frequent and non-frequent users (52% female in both groups, p=0.053).

When comparing ED visit characteristics, frequent users arrived more commonly by ambulance (30% versus 20%, p<0.001), made a greater proportion of higher acuity visits (p<0.001), and were admitted more often (18.9% versus 15.3%, p<0.001) than non-frequent users. The most common ED discharge diagnoses for both frequent and non-frequent users related to a broad category encompassing a range of clinical findings, such as abdominal pain, chest pain, headache, fever, and hyperglycemia.⁴¹ Mental and behavioral disorders accounted for 8% of frequent users' visits. Frequent users had a greater number of annual admissions compared to non-frequent users (median 2 [IQI: 1, 4] versus median 1 [IQI: 1, 2], p<0.001). The most common reasons for hospitalization were mental and behavioural disorders for frequent users (19%), versus circulatory diseases for non-frequent users (17%).

In 2015/16, frequent ED users made a median of 22 primary care visits (IQI: 13, 38) to a median of nine unique primary care physicians (IQI: 6, 13). By contrast, non-frequent users made a median of eight primary care visits (IQI: 4, 13) to a median of three unique primary care physicians (IQI: 2, 4). Among frequent users, 36.5% had a practitioner who served as their majority source of care, compared to 42.5% among non-frequent users (p<0.001). Only 0.4% (137/30,777) of frequent users had made no primary care visits, and only 1.1% (325/30,777) had made two or fewer visits. Frequent users had a higher number of prescription medications compared to non-frequent users (median 11 [IQI: 6, 17] versus 5 [IQI: 2, 9], p<0.001).

Frequent ED users had a higher mortality rate within one year of their last ED visit in 2015/16 compared to non-frequent users (12.9% versus 4.1%, p<0.001), with a larger proportion of deaths occurring in patients aged <70 years (p<0.001).

INTERPRETATION

Our analyses indicate that ED visits increased uniformly in BC from 2012 to 2016, and that visits made by the top 10% of highest utilizing patients increased disproportionately. Standardized for population growth, overall ED visit rates increased by 54% from 2012 to 2016, whereas ED visits by frequent users increased by 63%. Our study highlights important characteristics of frequent ED users in BC. First, frequent use tends to be transient; only 1.51% remained frequent users in all study years (1.91% among those surviving all four years). Second, frequent users are heterogenous, demonstrated by the differing predominance of ED diagnoses among age subgroups (e.g., mental health and injury among younger frequent users, and circulatory and respiratory diagnoses among older frequent users). Third, frequent ED users are high utilizers of many healthcare services. They were hospitalized more often, visited a greater number of primary care physicians, and made more primary care visits than non-frequent users. However, they experienced less continuity of primary care, consistent with prior research.^{45,46} Finally, frequent users are complex and high-risk patients. We observed high relative numbers of prescription medications (which could indicate inappropriate prescribing and/or a large co-morbid illness burden),⁴⁴ high comparative admission rates, and a mortality rate over three times greater than non-frequent users (12.9% versus 4.1%).

Our study confirms extensive healthcare system use among frequent ED users and thus the potential for efficiency from interventions aimed at addressing this use. Our results highlight income disparity between frequent and non-frequent users that policy interventions could target. Our analyses corroborate previous studies illustrating that frequent ED users are heterogenous, high utilizers of primary care and other services, have prevalent mental health and chronic illness, and die often.^{7,13,14,17,47-50} Our study supports findings that very few frequent users remain so across years. A previous study of high-cost healthcare users overall indicated that one third remained high utilizers over multiple years,⁴ while the current study found that only 15.7% of frequent users of EDs specifically remained in this category over two or more years. The relatively evanescent nature of frequent ED use may indicate that this is a naturally self-limiting state triggered

by acute crisis. For clinicians who identify frequent ED use patterns, understanding contributing co-morbidities, exploring triggers for frequent use episodes and providing early intervention may shorten the duration and morbidity of these episodes. Importantly, our results also point to an important growing prevalence of mental health and substance use among younger frequent user subgroups over time. For these subgroups, clinicians should consider initiating treatment in the ED when appropriate (e.g., opioid use disorder), and ensuring that timely and direct access to community-based treatment and supports are available from the ED.

Future studies should focus on further characterizing heterogeneity and distinct subgroups of frequent ED users that are highlighted here. Previous literature has incompletely explored differential mortality risk among frequent user subgroups. This exploration is a required next step in identifying modifiable risk factors that could be mitigated to improve patient outcomes. Secondly, studies should assess predictors of episodic and persistent high ED use over multiple years, to target these populations separately for interventions. Moreover, future qualitative work should engage healthcare providers and patients within specific frequent user subgroups to understand these patients' unmet needs and underlying drivers of ED utilization, and to develop collaborative solutions. Studies should pay particular attention to understanding increasing trends in mental health and substance use presentations. Finally, clinicians, hospitals and regions should pilot targeted approaches to address frequent users' heterogeneous needs, utilizing non-ED settings where possible. These directed interventions include: strategies to improve continuity of primary care, targeted mental health or substance use follow-up, medication reviews for frequent users with polypharmacy (especially if multiple prescribers), and chronic disease management for elderly patients coordinated with a most responsible primary care provider.

Limitations

Our study has limitations inherent in large administrative database analyses. We relied on NACRS ED records to create our study cohort. The observed increase in ED visits partially reflects an increase in number of institutions reporting to NACRS: from 20 in 2012/13 to 29 by 2013/14.³¹ Our approach may disproportionately identify EDs in larger urban/suburban centres reporting to NACRS, while missing visits to non-reporting institutions. Nonetheless, NACRS is the most comprehensive provincial repository of ED visits, increasing the robustness of our analysis. By 2015/16, our most recent year of data, 29 BC EDs contributed 1.57 million records, accounting for a 74% provincial coverage rate.⁵¹ Secondly, while a scheduled ED revisit flag exists within NACRS, it is unreliably coded. We therefore developed an algorithm to identify presumed revisits for cellulitis treatment, based on our clinical experience. Our algorithm is unvalidated; however, we explored all ED visits within 48 hours of one another, and cellulitis was the only commonly appearing diagnosis. Thirdly, we could not explore important variables not captured in the included databases (e.g., homelessness, employment, ethnicity, individual/family income). Fourth, while a graded analysis of frequent use would strengthen our analysis, we chose to examine the top 10% of users to remain consistent with CIHI standards. Finally, our analyses will be affected by accuracy and completeness of available data. We observed 28.7% and 29.3% missing data for discharge diagnoses for frequent and non-frequent users, respectively; while high, we do not suspect a systematic difference between groups. To mitigate coding inconsistencies, we collapsed diagnosis information into ICD-10 chapters, a previously supported approach.52,53

Conclusion

In conclusion, ED utilization by the top 10% of highest ED users is a substantial and growing issue in BC. These patients are heterogeneous, high users of multiple facets of healthcare, and high-risk for mortality. Frequent use is rarely persistent over multiple years. Interventions that permit early identification of frequent ED users and that systematically address needs and triggers for frequent use episodes have the potential for health system efficiencies and more importantly, improved patient outcomes.

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Table 1: Characterization of Top 10% of ED Users in BC, 2012/13 to 2015/16; by Age Categories

Characteristics	2012-2013	2013-2014	2014-2015	2015-2016
Total Number of ED patients	452,405	559,878	642,987	670,976
Total Number of ED Visits	768,041	955,001	1,125,719	1,184,809
Number of frequent users	18,095	22,540	28,917	30,777
Number of ED visits by frequent	136.060	168 805	216 746	233 866
users	130,900	100,095	210,740	233,000
Total number of ED Visits/	16 010 04	20 626 02	22 045 22	24 905 54
100,000 population in BC	10,010.04	20,020.03	23,915.33	24,005.54
Number of ED visits by				
frequent users/ 100,000	2999.06	3647.78	4604.66	4896.29
population in BC				
Percentage of total visits				
attributable to frequent ED visits				
Top 10% ED Users	17.8	17.7	19.3	19.7
Top 5% ED Users	10.4	10.4	11.1	9.4
Top 1% ED Users	2.3	2.5	2.5	2.5
Number of Visits, median (IQI)	6 (5, 8)	6 (5, 8)	6 (5, 8)	6 (5, 8)
Top five ED Visit Diagnostic		9/		
Categories (non missing), by				
age category				
Ages: 18-29				
Symptoms, signs and abnormal				
clinical and laboratory findings	3296 (15)	4784 (17)	6313 (18)	6777 (18)
(XVIII)				
Injury, poisoning and certain other				
consequences of external causes	2211 (10)	3059 (11)	4136 (12)	4720 (13)
(XIX)				
Mental and Behavioural disorders	1770 (8)	2700 (10)	3502 (10)	4315 (12)
(V)	1110(0)	2100(10)	5002 (10)	ro ro (1 <i>2)</i>

Disease of the genitourinary system (XIV)	1138 (5)	1469 (5)	1929 (5)	2018 (5)
Factors influencing health status and contract with health services (XXI)	878 (4)	1289 (5)	1879 (5)	1918 (5)
Ages: 30-39				
Symptoms, signs and abnormal				
clinical and laboratory findings	3038 (15)	4186 (17)	5512 (18)	5898 (17
(XVIII)				
Injury, poisoning and certain other				
consequences of external causes	1886 (9)	2637 (11)	3390 (11)	4133 (12
(XIX)				
Mental and Behavioural disorders	1756 (0)	2488 (10)	3205 (10)	4081 (11
(V)	1730 (8)	2400 (10)	5205 (10)	4001 (12
Disease of the genitourinary	1016 (5)	1314 (5)	1669 (5)	1718 (5)
system (XIV)	1010(0)	1014 (0)	1000 (0)	1710(0)
Factors influencing health status	0			
and contract with health services	990 (5)	1256 (5)	1814 (6)	1919 (6)
(XXI)				
Ages: 40-49				
Symptoms, signs and abnormal		0		
clinical and laboratory findings	3650 (16)	4681 (18)	5755 (18)	6071 (18
(XVIII)				
Injury, poisoning and certain other				
consequences of external causes	2376 (10)	2928 (11)	3905 (12)	4015 (12
(XIX)				
Mental and Behavioural disorders	2097 (9)	2491 (9)	3292 (10)	3877 (1-
(V)	2007 (0)	2701 (J)	5252(10)	5677 (1
Factors influencing health status				
and contract with health services	1239 (5)	1549 (6)	2139 (7)	2100 (6)
(XXI)				

Diseases of the musculoskeletal system and connective tissue (XIII)	1160 (5)	1377 (5)	1737 (5)	1818 (5)
Ages: 50-59				
Symptoms, signs and abnormal				
clinical and laboratory findings	3664 (16)	4922 (17)	6375 (18)	6638 (17)
(XVIII)				
Injury, poisoning and certain other				
consequences of external causes	2117 (9)	2863 (10)	3589 (10)	4085 (11)
(XIX)				
Mental and Behavioural disorders	1653 (7)	2417 (0)	2756 (8)	3731 (10)
(V)	1000 (7)	2417 (3)	2700(0)	0/01(10)
Factors influencing health status				
and contract with health services $igl($	1134 (5)	1500 (5)	2211 (6)	2341 (6)
(XXI)				
Diseases of the musculoskeletal				
system and connective tissue	1125 (5)	1433 (5)	1959 (6)	2105 (5)
(XIII)				
Ages: 60-69	•	0 .		
Symptoms, signs and abnormal				
clinical and laboratory findings	2828 (16)	3923 (18)	5389 (19)	5867 (19)
(XVIII)				
Injury, poisoning and certain other				
consequences of external causes	1283 (7)	1710 (8)	2430 (9)	2444 (8)
(XIX)				
Diseases of the Respiratory	894 (5)	1262 (6)	1640 (6)	1878 (6)
system (X)	004 (0)	1202 (0)	1040 (0)	1070 (0)
Factors influencing health status				
and contract with health services	675 (4)	1206 (6)	1802 (6)	1981 (7)
(XXI)				
Diseases of the circulatory	777 (4)	1172 (5)	1706 (6)	1659 (5)
system (IX)	(ד) ייי	1172 (0)	1100 (0)	
Ages: 70+				

Table 2: Characteristics of frequent (top 10%) and non-frequent (bottom 90%) ED users in BC, 2015-2016

Characteristics	Frequent ED Users	Non-Frequent ED	p-value
		Users	
Total Patient Number, n	30,777	640,199	
Sex			
Female, n (%)	15,855 (52)	333,412 (52)	0.053
Male, n (%)	14,919 (48)	306,702 (48)	
Unknown, n (%)	3 (0)	85 (0)	
Age, median (IQI)	54.0 (36, 73)	50.5 (33, 67)	<0.001
Neighbourhood income			
Quintile			
1st Quintile, n (%)	9571 (31)	140795 (22)	<0.001
2nd Quintile, n (%)	6558 (21)	131333 (21)	
3rd Quintile, n (%)	5428 (18)	124963 (20)	
4th Quintile, n (%)	4755 (15)	122702 (19)	
5th Quintile, n (%)	3866 (13)	108760 (17)	
Rural/Urban			
Rural, n (%)	1285 (4)	34947 (5)	<0.001
Urban, n (%)	29337 (96)	600372 (94)	
Number of Visits,	6 (5, 8)	1 (1 2)	<0.001
median (IQI)	0 (0, 0)	1 (1, 2)	-0.001
ED VISIT			
CHARACTERISTICS			
Arrive by Ambulance			
Ground ambulance	69055 (30)	185289 (20)	<0.001
No ambulance	164745 (70)	747774 (80)	
Triage Level (CTAS)			
1 (Resuscitation	1654 (1)	6702 (1)	<0.001
2 (Emergent)	41939 (18)	156256 (17)	
3 (Urgent)	119246 (51)	456589 (49)	
4 (Less-urgent)	57724 (25)	282916 (30)	

5 (Non-urgent)	12586 (5)	28547 (3)	
Unknown	717 (0)	2732 (0)	
Top Five ED Visit Diagnostic Categories (ICD-10 Chapters), non- missing			
	Symptoms, signs and	Symptoms, signs and	
	abnormal clinical and	abnormal clinical and	
	laboratory findings	laboratory findings	
	(XVIII)	(XVIII)	
	43538 (19)	165625 (18)	
	Injury, poisoning and certain other	Injury, poisoning and certain other	
	consequences of	consequences of	
	external causes (XIX)	external causes (XIX)	
	23495 (10)	158485 (17)	
	Mental and	Diseases of the skin	
	Behavioural disorders	and subcutaneous	
	(V)	tissue (XIII)	
	19032 (8)	52541 (6)	
	Factors influencing health status and contract with health services (XXI) 13091 (6)	Diseases of the Respiratory system (XI) 41338 (4)	
	Diseases of the		
	musculoskeletal	Diseases of the	
	system and connective	circulatory system (X)	
	tissue (XIV)	41253 (4)	
	11012 (5)		
Discharge Disposition			

Discharged Home or to			
place of residence	187,902 (80.3)	787,399 (84.3)	<0.001
(institution)			
Left before completion of	1754 (0.8)	2042 (0.2)	
treatment	1754 (0.6)	2943 (0.3)	
Admitted or Transferred	44,148 (18.9)	142,682 (15.3)	
Died	62 (0.0)	718 (0.1)	
HOSPITALIZATION			
DATA (DAD)			
Number of Admissions	2 (1 4)	1 (1 2)	<0.001
per person, median (IQI)	2 (1, 4)	Γ (1, ∠)	<i>40.00</i>
Median time admitted	4 (2, 0)	4 (2, 0)	<0.001
(days [IQI])	4 (2, 9)	4 (2, 9)	<0.007
Top Five Primary	O_		
Discharge ICD-10			
Diagnosis Category, n			
(%)	ľ O		
	Mental and	Diseases of the	
	behavioural disorders	circulatory system (I)	
	(F),	27522 (17)	
	9181 (19)		
	Diseases of the	Injury, poisoning	
	circulatory system (I),	(S&T),	
	5613 (12)	22404 (14)	
	Diseases of the	Diseases of the	
	digestive system (K),	digestive system (K),	
	5191 (11)	21570 (13)	
	Symptoms and		
	abnormal clinical and	Mental and	
	laboratory findings, not	behavioural disorders	
	otherwise classified	(F),	
	(R),	16228 (10)	
	5044 (11)		

	Diseases of the	Diseases of the	
	respiratory system (J),	respiratory system (J),	
	5037 (11)	15117 (9)	
PHYSICIAN BILLING			
DATA (MSP)			
Number of general			
practitioner visits,	22 (13, 38)	8 (4, 13)	<0.001
median (IQI)			
Number of individual			
general practitioners	9 (6, 13)	3 (2, 5)	<0.001
visited, median (IQI)			
Majority Source of Care	11,213 (36.5)	263,215 (42.5)	<0.001
PROVINCIAL			
PRESCRIPTION DATA			
(PHARMANET)	20		
Number of Drug			
prescription, median	11 (6, 17)	5 (2, 9)	<0.001
(IQI)			
Number of Drugs			
prescriptions by age		•	
category, median (IQI)			
18-30	7 (4, 11)	3 (1, 5)	<0.001
30-39	8 (5, 13)	3 (2, 6)	<0.001
40-49	10 (6, 15)	4 (2, 7)	<0.001
50-59	11 (7, 17)	5 (3, 8)	<0.001
60-69	14 (9, 20)	6 (3, 10)	<0.001
>70	15 (10, 20)	9 (5, 13)	<0.001
Top five AHFSC Drug			
Classifications, n (%)			
	Central Nervous	Central Nervous	
	System Agents,	System Agents,	
	1306708 (41)	5734289 (33)	

	Cardiovascular drugs,	Cardiovascular drugs,	
	411435 (13)	2962239 (17)	
		Hormones and	
	Gastrointestinal Drugs,	Synthetics	
	244712 (8)	Substitutes,	
		1458636 (7)	
	Hormones and	Gastrointestinal	
	Synthetics Substitutes,	Drugs,	
	185653 (6)	1187676 (7)	
	Blood Formation,	Electrolytic caloric	
	coagulation and	and Thrombosis	
	Thrombosis,	672281 (4)	
	117562 (4)		
MORTALITY DATA			
(VITAL STATISTICS)	20		
Sex			
Male	2200 (55)	13797 (53)	0.004
Female	1782 (45)	12452 (47)	
Unknown	1 (0)	17 (0)	
Age when died, median (IQI)	76 (63, 86)	80 (69, 89)	<0.001
Top five causes of death			
by ICD-10 diagnoses			
	Lung Cancer (C349),	Lung cancer (C349),	
	302 (8)	2021 (8)	
	III defined and		
	unknown cause of	Unspecified Dementia	
	Mortality (R99),	(F03), 1210 (5)	
	181 (5)		
	COPD (.1449)	Acute Myocardial	
	149 (4)	Infarction (I219),	
	- (')	1205 (5)	

	Heart disease of the	Heart disease of the	
	native coronary artery	native coronary artery	
	(I251),	(I251),	
	147 (4)	921 (4)	
	Unspecified Dementia (F03), 120 (3)	III defined and unknown cause of Mortality (R99), 841 (3)	
Top five causes of death			
by ICD-10 chapters, n (%)			
	Neoplasms and	Neoplasms and	
	diseases of blood and	diseases of blood and	
	blood forming organs	blood forming organs	
	(II),	(II),	
	1512 (38)	8937 (34)	
	Diseases of the circulatory system (IX), 834 (21)	Diseases of the circulatory system (IX), 6826 (26)	
	Diseases of the Respiratory system (X), 434 (11)	Diseases of the Digestive system (XI), 2662 (10)	
	Diseases of the Digestive system (XI), 241 (6)	Mental and Behavioural disorders (V), 1553 (6)	
	Symptoms, signs and abnormal clinical and laboratory findings (XVIII), 181 (5)	Diseases of the skin and subcutaneous tissue (XII), 1273 (5)	

Number of deaths within			
one year of last ED visit,	3983 (12.9)	26266 (4.1)	<0.001
n (%)			
Number of deaths within			
one year of last ED visit			
(percentage per ED			
visit) Stratified by age at			
time of death			
18-29 yrs.	70 (2)	294 (1)	<0.001
30-39 yrs.	109 (3)	363 (1)	<0.001
40-49 yrs.	179 (4)	682 (3)	<0.001
50-59 yrs.	431 (11)	1889 (7)	<0.001
60-69 yrs.	720 (18)	3827 (15)	<0.001
≥70 yrs.	2474 (62)	19211 (73)	<0.001
			I

*P-values calculated with chi square test for categorical variables or Wilcoxon rank test for continuous variables where appropriate.