Title: Patient and non-patient factors associated with short internal medicine hospital admissions

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Abstract

Background: Short hospital admissions may represent targets for interventions to avert unnecessary admissions or expedite inpatient care. We examined physician and situational factors associated with short internal medicine hospital admissions.

Methods: This was a multicentre cross-sectional study between April 1, 2012 and March 31, 2015 at 5 teaching hospitals in Toronto, Ontario. We included all internal medicine admissions through the emergency department (n=56,055). We examined physician (years of practice, sex), situational (time and day of admission, physician workload), and patient (age, sex, comorbidity level, ambulance transport to hospital, recent admission, and the laboratory-based acute physiology score) predictors of short admission to hospital, which was defined as patients discharged home alive in two possible time windows: less than 24 or less than 72 hours.

Results: Patients discharged in less than 24 hours and less than 72 hours accounted for 7.6% and 31.6% of admissions, respectively. After controlling for patient factors, patients of women physicians were less likely to have admissions lasting less than 24 hours (adjusted Odds Ratio 0.81, 95%CI:0.75-0.88) or 72 hours (aOR 0.82, 95%CI:0.79-0.86). Patients admitted at night or on a weekday were significantly more likely to have admissions lasting less than 24 hours (night: aOR 2.65, 95%CI:2.36-2.98, weekday: aOR 1.24 95%CI: 1.15-1.34) or less than 72 hours (night: aOR 1.26, 95%CI: 1.19-1.33, weekday: aOR 1.06 95%CI: 1.01-1.10).

Interpretation: Short internal medicine admissions are common and associated with physician and situational factors in addition to patient factors, suggesting some admissions could be avoided or made more efficient.

Introduction

Given the high costs of hospital care, there is significant interest in averting unnecessary hospital admissions and reducing length-of-stay. Interventions designed to either avoid(1) or reduce the length of hospital admissions have included hospital-athome(2), short stay or observation units(3–7), and rapid access clinics.(8) Patients with short hospital length-of-stay may be candidates for these models of expedited and streamlined care.

Patient age, illness severity, level of comorbidity, and functional status have all been associated with longer hospital length-of-stay.(9–15) However, less is known about the situational or physician factors and resource use associated with short medical admissions. This information may highlight opportunities to improve care. To inform the design of interventions that target patients with potentially avoidable or brief hospital admissions, we examined the patient, physician, and situational characteristics associated with short hospital admissions to internal medicine wards. In addition, we described the use of hospital resources by patients with short admissions.

Methods

Design, Setting, and Participants

This was a multicentre cross-sectional study involving 5 academic hospitals in Toronto, Ontario, who were participating in the General Medicine Inpatient Initiative (GEMINI).(16) All Ontario residents have access to publicly funded essential hospital services. The participating hospitals cater to a diverse urban population, and range in size from 433 to 1,325 acute inpatient beds. General internal medicine (GIM) patients

accounted for 39% of emergency department (ED)admissions to hospital and 24% of hospital bed-days.(16)

We included all patients admitted to the GIM service through the ED and discharged between April 1, 2012 and March 31, 2015. The GIM services operate on a hospitalist model, are staffed predominantly by internists, and include clinical teaching units, non-teaching hospitalist services, and one family medicine inpatient unit.(16) We excluded patients who were missing provincial health insurance numbers (n=646, 1.1%), because these were needed to ascertain previous healthcare usage. We also excluded patients who were missing data on the sex of the most responsible physician (n=1,524, 2.6%) or ambulance transport to hospital (n=3, <0.01%).

Data Sources

Data for GEMINI were collected from administrative sources and hospital information systems and linked at the individual patient level, as has previously been described.(16) Patient demographics and clinical characteristics were collected from hospital administrative databases as reported to the Canadian Institute for Health Information (CIHI).(17) Laboratory and radiology results, blood transfusions, and inhospital medications were extracted from hospital information systems. Laboratory data were cleaned by removing non-numeric values.

Each hospital admission was attributed to a single 'most responsible physician' as per the CIHI Discharge Abstract Database, defined as the physician who is "responsible for the care and treatment of the patient for the majority of the visit to the health care

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facility".(17) Physician characteristics were collected from the College of Physicians and Surgeons of Ontario publicly-available physician information database.(18)

Outcomes and Measures

The main outcome was discharge home alive after a short hospital admission. There is no universally-accepted definition of what constitutes a short hospital admission. Short stay units are designed to monitor patients for the first 24(3) to 72 hours.(9,12) Therefore, we conducted two parallel analyses to compare longer hospitalizations to those lasting a) less than 24 hours, and b) less than 72 hours. Patients who died in hospital, left hospital against medical advice, or were transferred to another acute inpatient, rehabilitation, or palliative care facility were categorized along with longer admissions.

We examined patient, physician, and situational factors associated with short admission. Patient characteristics included: age, sex, Charlson comorbidity score,(19) the Laboratory-based Acute Physiology Score (LAPS, a measure of illness severity),(20,21) ambulance transport, admission to a short stay unit (which was available at two participating hospitals), admission to GIM at a study site in the 30 previous days, and fiscal year of admission. Physician characteristics included years since medical school graduation and sex. Situational factors included the day of admission categorized as weekend or weekday, time of admission categorized as 'day' (8:00 to 16:59:59), 'evening' (17:00 to 24:00), or 'night' (00:00:01 to 7:59:59), and the volume of admissions to GIM in the previous 12 hours. This 12-hour time window was pre-specified as a measure of the workload of the admitting GIM physicians in the ED.

We categorized each admission into a clinical condition based on their principal discharge diagnosis using the Clinical Classifications Software (CCS) tool,(22) which aggregates ICD-10 diagnoses into 285 mutually exclusive clinically-relevant categories. We report the number of admissions in which at least one of the following was used: order for intravenous medication, radiograph, computed tomography (CT) scan, ultrasound scan, magnetic resonance imaging (MRI) scan, red blood cell transfusion, endoscopy procedure, or bronchoscopy procedure. We also report the mean time spent in the ED and the proportion of patients admitted to the intensive care unit.

Statistical Analysis

We first compared patient characteristics among those discharged home alive in less than 24 hours, 24-72 hours, and all other admissions using chi-square and Kruskall-Wallis tests for categorical and continuous variables, respectively. Second, we performed two multilevel logistic regression analyses, accounting for the nested structure of our data: patients nested within physicians nested within hospitals. In the first analysis, short admissions were defined as having a length-of-stay less than 24 hours and compared with all others. In the second analysis, short admissions were defined as having a hospital length-of-stay less than 72 hours. To explore whether patient characteristics might contribute to differences in short admissions related to situational factors, we compared patient characteristics among short admissions at different times of day or on the weekend using chi-square and Kruskall-Wallis tests. Third, we report the 15 most common discharge diagnoses for patients discharged home alive in less than 24 hours, 24 to 72 hours, and all other admissions. Finally, we report the hospital resources used by patients with admissions of different durations. All analyses were performed using 'R' version 3.3.2.

Results

The final study sample included 56,055 admissions. Overall, 10,360 admissions (18.5%) resulted in transfer to another inpatient, rehabilitation, or palliative care facility, 3,264 admissions (5.8%) ended with death in hospital, and 1,253 admissions (2.2%) ended with patients leaving against medical advice. Patients were discharged home alive within 24 hours in 4,245 admissions (7.6%) and between 24 to 72 hours in 13,442 admissions (24.0%). The overall median length of stay was 4.4 days (interquartile range 2.25-8.54).

Patient Characteristics Associated with Short Admission

Patients with shorter admissions were significantly younger, had lower comorbidity, were less likely to arrive by ambulance, had a lower average LAPS, and were less likely to have a recent prior admission (Table 1). In multi-level regression models, increasing age, higher Charlson comorbidity index, transport via ambulance, recent admission, and higher LAPS were all associated with a significantly lower likelihood of short admission, when defined as either less than 24 hours or less than 72 hours (Table 2).

Physician Characteristics Associated with Short Admission

The number of years since physician graduation was not significantly associated with the likelihood of short admission under either definition (Table 2). Patients of women physicians were significantly less likely to have short admissions lasting either

Situational Factors Associated with Short Admission

Short admissions lasting less than either 24 or 72 hours, were more likely for patients admitted in the evening or night (Table 2). Short admissions were significantly more likely for patients admitted on a weekday, although this effect was stronger for admissions lasting less than 24 hours (aOR 1.26, 95% CI 1.17-1.36) than for admissions lasting less than 72 hours (aOR 1.05, 95% CI: 1.01-1.10). There was no significant association between short admissions and the number of patients admitted to GIM in the previous 12 hours (Table 2).

Compared to patients with short admissions who were admitted in the day-time, patients admitted in the evening or at night were older (p<0.001) but were not consistently different in comorbidity level or illness severity (Tables S1 and S2). Patients with admissions lasting less than 72 hours who were admitted on the weekend had more severe illness than those admitted on weekdays, indicated by greater rates of ambulance transport (43.4% vs 40.0%, p<0.001) and greater LAPS (mean 16.04 vs 15.35, p<0.004), but these differences were not seen among admissions lasting less than 24 hours (Tables S3 and S4).

Common Discharge Diagnoses

The most common discharge diagnoses differed somewhat among admissions of different durations (Table 3). Non-specific chest pain, syncope, adverse effects of medical drugs, and alcohol-related disorders were among the 15 most common causes

of admissions lasting less than 24 or less than 72 hours but not longer admissions. Epilepsy and vertigo were among the most common causes of admissions lasting less than 24 hours. No single diagnosis represented more than 4.1% of admissions lasting less than 24 hours, 6.5% of admissions lasting between 24 and 72 hours, or 5.7% of all other admissions.

Resource Use in Short Admissions

Patients with hospital admissions lasting less than 24 hours and 24-72 hours spent on average 14.8 hours (SD 6.6) and 15.7 hours (SD 9.0) in the ED, respectively (Table 4). Among patients with admissions lasting less than 24 hours and 24-72 hours, intravenous medications were ordered for 65.7% and 79.8%, respectively, and CT scans were performed for 36.8% and 39.1%, respectively. Among patients with admission lasting less than 72 hours, 1925 (10.9%) did not receive any intravenous medication, CT scans, magnetic resonance imaging, ultrasound, endoscopy, bronchoscopy or intensive care.

Interpretation

This large multicentre study found that short admissions to GIM were common and were associated with both patient and non-patient factors. We found that 31.6% of admissions in GIM lasted less than 72 hours and 7.6% lasted less than 24 hours. After controlling for other factors, short admissions were more common for patients admitted overnight or on weekdays and for patients cared for by men physicians. We also identified discharge diagnoses that were more common among short admissions and described their hospital resource usage. Our finding that physician and situational

factors are associated with short admissions highlights opportunities to further streamline care.

Several interventions have been directed toward patients with short length-ofstay(1) such as short stay or observation units,(3–7) hospital-at-home,(2) or rapidaccess clinics.(8) Our findings offer insights for the design and delivery of these interventions for medical patients. First, we identified the most prevalent conditions affecting patients with short length of stay in GIM. It may be difficult to organize programs around individual diseases, because no single condition comprised more than 6.5% of short admissions. However, certain conditions were more common among short admissions: chest pain, syncope, alcohol-related disorders, and adverse drug effects. Second, intravenous medication and radiologic and endoscopic investigations were important in the care of short stay patients. Providing expedited access to these treatments and investigations may be an important component of short stay interventions. Third, patients were more likely to have a short stay when they were admitted in the evening or at night. Thus, accessing short stay interventions should ideally be possible outside of typical working hours.

Short admissions may represent avoidable hospitalizations or efficient hospitalizations that would otherwise have been longer. This may explain why short admissions were more common in the evening and overnight but less common on the weekend. After-hours admissions at participating hospitals are performed by in-house residents, who typically review cases with staff physicians before discharging patients. Residents may prefer not to "disturb" their staff physician and elect to review the case the next morning rather than discharge a patient overnight. It may also be difficult to

coordinate aspects of a patient's discharge overnight, resulting in a brief but potentially avoidable admission. On the weekend, it may be difficult to coordinate patient discharges or patients may experience delays in receiving tests or procedures.(23,24) Further, covering physicians on the weekend may be less likely to discharge a patient with whom they are less familiar. Short admissions may be less likely on weekends because patients who would otherwise be discharged remain in hospital. Whereas, short admissions may be more likely on weeknights as patients who would otherwise be discharged home are admitted overnight in the ED. Short admissions in the evening, at night, or on weekends, did not occur for patients with lower comorbidity or less severe illness as might be expected if admissions were primarily due to logistical factors. Nevertheless, our findings are consistent with a body of literature suggesting differential access to care and patient outcomes at night and on weekends compared with weekdays(23–26) and we identify an interesting difference between nights and weekends.

Patients of women physicians were less likely to have short admissions even after controlling for years of physician practice and numerous patient factors such as age, comorbidities, and illness severity. The validity of the comparison between men and women physicians is strengthened in this cohort because all patients were admitted non-electively through the ED and thus physician assignment occurred through a pseudo-random process, mitigating selection effects similar to other observational studies.(27) Although patient outcomes may differ between hospitalists and non-hospitalists,(28) all physicians in our sample were hospitalists and almost all physicians were internists. Thus, sex-related differences were not likely to be due to differences in

specialty or patient case mix. Recent analyses suggest that patients of women physicians may have better outcomes than men physicians.(27) In the absence of analyses regarding mortality and readmissions rates, we cannot comment on the possible relationship between shorter length of stay and quality of care. Further research should seek to understand whether women physicians are more likely to discharge patients directly from the ED without hospital admission or less likely to discharge patients quickly from hospital, and whether such decisions contribute to differences in patient outcomes.

There are several important limitations to our study. First, we only included GIM patients, not all medical admissions. We chose to focus on GIM because it is a large inpatient service in our hospitals and our objective was to understand models of care. Second, we included five teaching hospitals, and thus our results may not be generalizable to non-teaching sites where models of care and staffing differ. Although our study was conducted in a Canadian context, the median length-of-stay (4.4 days) was similar to studies in Europe and the USA,(29,30) supporting the generalizability of our findings. Third, we were unable to collect data about patient living situation, caregiver support, functional status, or socioeconomic status, which likely have important effects on hospital length-of-stay. Fourth, care in GIM is often delivered in teams and multiple physicians may care for individual patients. Misattribution may occur when assigning patients to a single most responsible physician. However, error resulting from this misclassification would be non-differential between physicians and unlikely to affect our results. Moreover, handovers are less likely for patients with

shorter admissions. Finally, we did not collect data on patients who were seen by the GIM service in the ED but not admitted to hospital.

In conclusion, short hospital admissions to GIM are common. They occur more frequently when patients are admitted in the evening or overnight and when physicians are men. Interventions to streamline care for these patients and avert hospital admissions may be more effective if they are accessible outside of typical working hours and provide access to intravenous medication and radiological and endoscopic interventions.

Table 1. Patient characteristics associated with duration of admission to GIM

Table 2. Multi-level regression models of patient, physician, and situational characteristics associated with short admissions to GIM.

Table 3. Fifteen most common discharge diagnoses among admissions to GIM with different durations.

Table 4. Resource use among GIM admissions of varying duration.

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	< 24 hours	24-72 hours	All Others	p-value
Patient Characteristic	N = 4245	N = 13442	N= 38368	
Age – median (IQR)	63 (45, 78)	67 (50, 81)	74 (59, 84)	<0.001
Female – n (%)	2155 (50.8)	6722 (50.0)	19026 (49.6)	0.288
Charlson Comorbidity Index – n (%)				<0.001
0	1846 (43.5)	4666 (34.7)	8809 (23.0)	
1	962 (22.7)	3061 (22.8)	7737 (20.2)	
2	557 (13.1)	2210 (16.4)	6785 (17.7)	
3+	880 (20.7)	3505 (26.1)	15037 (39.2)	
Transported via Ambulance – n (%)	1531 (36.1)	5700 (42.4)	21533 (56.1)	<0.001
Admitted in prior 30 days* – n (%)	372 (8.8)	1283 (9.5)	5315 (13.9)	<0.001
LAPS - mean (sd)	13.0 (12.4)	16.3 (13.9)	21.4 (17.1)	<0.001
Admitted on Weekend – n (%)	929 (21.9)	3516 (26.2)	10152 (26.5)	<0.001
Time of Admission – n (%)				<0.001
Day	398 (9.4)	2832 (21.1)	8398 (21.9)	
Evening	1795 (42.3)	5156 (38.4)	14828 (38.6)	
Night	2052 (48.3)	5454 (40.6)	15142 (39.5)	

Table 1. Patient characteristics associated with duration of admission to GIM

Table 1 Legend: Hospital admissions were categorized as patients discharged home alive in less than 24 hours, 24 to 72 hours, and all other admissions. The day of admission was categorized as weekend (Saturday or Sunday) or weekday. The time of admission was categorized as 'day' (8:00 to 16:59:59), 'evening' (17:00 to 24:00), or 'night' (00:00:01 to 7:59:59). *Admitted to GIM at a study site in prior 30 days. Statistical significance for differences across length-of-stay categories was calculated using chi-square analysis for categorical variables and Kruskall-Wallis test for continuous variables. LAPS: Laboratory-based acute physiology score.

Table 2. Multi-level regression models of patient, physician, and situational characteristics associated with short admissions to GIM.

	Model A: <2	Model A: <24 hours		ours
	Adjusted Odds		Adjusted Odds Ratio	
Characteristics	Ratio (95% CI)	p-value	(95% CI)	p.value
Patient Characteristics				
Age	0.99 (0.99, 0.99)	<0.001	0.99 (0.99, 0.99)	<0.001
Female Sex (Patient)	0.96 (0.90, 1.02)	0.167	0.97 (0.94, 1.01)	0.126
CCI Score 0	1.97 (1.79, 2.16)	<0.001	1.75 (1.66, 1.84)	<0.001
CCI Score 1	1.63 (1.47, 1.79)	<0.001	1.54 (1.46, 1.62)	<0.001
CCI Score 2	1.20 (1.08, 1.34)	0.001	1.29 (1.21, 1.36)	<0.001
Not Transported via Ambulance	1.44 (1.34, 1.54)	<0.001	1.47 (1.41, 1.53)	<0.001
Admitted in prior 30 days*	0.84 (0.75, 0.94)	0.003	0.77 (0.73, 0.82)	<0.001
LAPS	0.97 (0.97, 0.98)	<0.001	0.98 (0.98, 0.98)	<0.001
Physician Characteristics				
Physician Sex Female	0.80 (0.74, 0.86)	<0.001	0.82 (0.79, 0.86)	<0.001
Years Since Graduation	1.00 (1.00, 1.00)	0.776	1.00 (1.00, 1.00)	0.186
Situational Factors				
Admitted Weekday	1.26 (1.17, 1.36)	<0.001	1.05 (1.01, 1.10)	0.022
Admitted Evening	2.61 (2.33, 2.92)	<0.001	1.23 (1.17, 1.30)	<0.001
Admitted Night	2.73 (2.44, 3.07)	<0.001	1.29 (1.22, 1.37)	<0.001
GIM Admissions in Past 12 hours	1.05 (0.99, 1.12)	0.111	1.02 (0.98, 1.05)	0.401
Admitted to Short Stay Unit	1.56 (1.39, 1.74)	<0.001	2.35 (2.17, 2.54)	<0.001
Fiscal Year of Admission	1.09 (1.05, 1.14)	<0.001	1.05 (1.03, 1.08)	<0.001

Table 2 Legend: Adjusted odds ratios were derived from multi-level logistic regression models. Three-level models were fit, with patients nested within physicians nested within hospitals. Patient and situational characteristics were specified as level one, physician characteristics were specified as level two, and admitting hospital was specified as a fixed-effect level three variable. For variables with more than 2 categories, the reference categories were: CCI score 3 (high comorbidity) and admission in the day-time (vs evening and night). *Admitted to GIM at a study site in prior 30 days. CCI Score: Charlson Comorbidity Index score. GIM: General Internal Medicine. LAPS: Laboratory-based acute physiology score.

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Table 3. Fifteen most common discharge diagnoses among admissions to GIM with different durations.

6 7	<24 Hours		24-72 Hours		All Others	
, 8	Diagnosis	N (%)	Diagnosis	N (%)	Diagnosis	N (%)
9	Nonspecific chest pain	167 (4.1)	Pneumonia	811 (6.5)	CHF	2251 (5.7)
10	Intestinal infection	163 (4.0)	COPD	731 (5.8)	Pneumonia	2028 (5.1)
11	COPD	153 (3.8)	Urinary tract infections	676 (5.4)	Urinary tract infections	1823 (4.6)
12	Pneumonia	150 (3.7)	Gastrointestinal hemorrhage	598 (4.8)	COPD	1740 (4.4)
14	Syncope	124 (3.1)	CHF	580 (4.6)	Delirium, dementia, cognitive disorders	1444 (3.7)
16	Urinary tract infections	123 (3.0)	Fluid and electrolyte disorders	445 (3.5)	Gastrointestinal hemorrhage	1170 (3.0)
19	Fluid and electrolyte disorders	112 (2.8)	Intestinal infection	445 (3.5)	Septicemia	1016 (2.6)
20 21	Gastrointestinal hemorrhage	111 (2.7)	Syncope	376 (3.0)	Acute cerebrovascular disease	996 (2.5)
22 23	DM with complications	111 (2.7)	DM with complications	332 (2.6)	Fluid and electrolyte disorders	854 (2.2)
24 25	CHF	101 (2.5)	Skin and subcutaneous tissue infections	257 (2.0)	DM with complications	833 (2.1)
26 27	Adverse effects of medical drugs	100 (2.5)	Alcohol-related disorders	255 (2.0)	Intestinal infection	822 (2.1)
28	Epilepsy; convulsions	100 (2.5)	Nonspecific chest pain	238 (1.9)	Acute renal failure	806 (2.0)
29 30	Alcohol-related disorders	99 (2.4)	Influenza	233 (1.9)	Skin and subcutaneous tissue infections	793 (2.0)
31	Dizziness or vertigo	92 (2.3)	Adverse effects of medical drugs	222 (1.8)	Other connective tissue disease	780 (2.0)
33	Other lower respiratory disease	90 (2.2)	Pancreatic disorders	222 (1.8)	Aspiration pneumonitis	767 (1.9)

 Table 3 Legend: Grey shading: Diagnosis among the top 15 across all categories. Green shading: Diagnosis among top 15 in admissions <24 and 24-72 hours only. Blue (<24 hours), purple (24-72 hours), and red shading (all others): Diagnosis among 15 most common in each respective category only. Hospital admissions were categorized as patients discharged home alive in less than 24 hours, 24 to 72 hours, and all other admissions. The 15 most common discharge diagnoses were identified by the Clinical Classifications Software categorization of ICD-10 codes. COPD: Chronic obstructive pulmonary disease and bronchiectasis; DM: Diabetes mellitus; CHF: Congestive heart failure.

4			gaaratom	
5	Resource	<24 hours	24-72 hours	All Others
6	1.0300100	N = 4245	N = 13442	N = 38368
/ 8	Time in Emergency Department – mean hours (SD)	14.8 (6.6)	15.7 (9.0)	16.4 (9.9)
9	Intravenous Medication* – n (%)	2788 (65.7)	10722 (79.8)	33022 (86.1)
10	Radiography* – n (%)	2803 (66.0)	10013 (74.5)	33260 (86.7)
11	Computed tomography* – n (%)	1561 (36.8)	5254 (39.1)	21772 (56.7)
12	Ultrasonography* – n (%)	418 (9.8)	2363 (17.6)	12110 (31.6)
14	Magnetic Resonance Imaging* – n (%)	144 (3.4)	842 (6.3)	4983 (13.0)
15	Red Blood Cell transfusion* – n (%)	86 (2.0)	593 (4.4)	4522 (11.8)
16	Endoscopy* – n (%)	92 (2.2)	1053 (7.8)	4037 (10.5)
1/	Bronchoscopy* – n (%)	1 (0.0)	39 (0.3)	965 (2.5)
19	Intensive Care Unit admission – n (%)	18 (0.4)	101 (0.8)	2509 (6.5)
20	No advanced interventions [†] – n (%)	779 (18.4)	1146 (8.5)	1347 (3.5)
21				

Table 4. Resource use among GIM admissions of varying duration.

Table 4 Legend: *Number of admissions that used at least one of this test or treatment. [†]Number of admissions in which none of the following tests or treatments were used: intravenous medication, computed tomography, ultrasonography, magnetic resonance imaging, endoscopy, bronchoscopy or intensive care unit.

Supplementary Tables

"Patient, physician, and situational factors associated with short hospital admissions in General Internal Medicine"

Table S1. Baseline characteristics among patients discharged home alive within 24 hours of admission, categorized by time of admission.

Table S2. Baseline characteristics among patients discharged home alive within 72 hours of admission, categorized by time of admission.

Table S3. Baseline characteristics among patients discharged home alive within 24 hours of admission, categorized by weekend versus weekday admission.

Table S4. Baseline characteristics among patients discharged home alive within 72 hours of admission, categorized by weekend versus weekday admission.

Patient Characteristic	Admitted in Day (N=398)	Admitted in Evening (N=1795)	Admitted in Night (N=2052)	p-value
Age – median (IQR)	56 (36, 74)	63 (47, 78)	63 (45, 79)	<0.001
Female – n (%)	203 (51.0)	894 (49.8)	1058 (51.6)	0.552
Charlson Comorbidity Index – n (%)				0.041
0	198 (49.7)	748 (41.7)	900 (43.9)	
1	81 (20.4)	397 (22.1)	484 (23.6)	
2	44 (11.1)	249 (13.9)	264 (12.9)	
3+	75 (18.8)	401 (22.3)	404 (19.7)	
Transported via Ambulance – n (%)	142 (35.7)	650 (36.2)	739 (36.0)	0.978
Admitted in prior 30 days* – n (%)	48 (12.1)	170 (9.5)	154 (7.5)	0.005
LAPS - mean (sd)	12.9 (12.0)	13.0 (12.2)	13.0 (12.7)	0.984

Table S1. Baseline characteristics among patients discharged home alive within 24 hours of admission, categorized by time of admission.

Table S1 Legend: The time of admission was categorized as 'day' (8:00 to 16:59:59), 'evening' (17:00 to 24:00), or 'night' (00:00:01 to 7:59:59). *Admitted to GIM at a study site in prior 30 days. Statistical significance for differences across categories was calculated using chi-square analysis for categorical variables and Kruskall-Wallis test for continuous variables. LAPS: Laboratory-based acute physiology score.

	Admitted in	Admitted in	Admitted in	
Patient Characteristic	Day	Evening	Night	p-value
	(N=3230)	(N=6951)	(N=7506)	
	64.00 [47.00,	67.00 [51.00,	66.00 [49.00,	
Age – median (IQR)	80.00]	81.00]	80.00]	<0.001
Female – n (%)	1536 (47.6)	3553 (51.1)	3788 (50.5)	0.003
Charlson Comorbidity Index – n (%)				0.249
0	1243 (38.5)	2518 (36.2)	2751 (36.7)	
1	734 (22.7)	1564 (22.5)	1725 (23.0)	
2	496 (15.4)	1092 (15.7)	1179 (15.7)	
3+	757 (23.4)	1777 (25.6)	1851 (24.7)	
Transported via Ambulance – n (%)	1488 (46.1)	2683 (38.6)	3060 (40.8)	<0.001
Admitted in prior 30 days* – n (%)	334 (10.3)	656 (9.4)	665 (8.9)	0.052
LAPS - mean (sd)	15.6 (13.5)	15.5 (13.7)	15.5 (13.6)	0.89

Table S2. Baseline characteristics among patients discharged home alive within 72 hours of admission, categorized by time of admission.

Table S2 Legend: The time of admission was categorized as 'day' (8:00 to 16:59:59), 'evening' (17:00 to 24:00), or 'night' (00:00:01 to 7:59:59). *Admitted to GIM at a study site in prior 30 days. Statistical significance for differences across categories was calculated using chi-square analysis for categorical variables and Kruskall-Wallis test for continuous variables. LAPS: Laboratory-based acute physiology score.

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	Admitted on Weekday	Admitted on Weekend	p-value
Patient Characteristic	(N=3316)	(N=929)	
Age – median (IQR)	63 (46, 79)	61 (44, 77)	0.138
Female – n (%)	1705 (51.4)	450 (48.4)	0.117
Charlson Comorbidity Index – n (%)			0.887
0	1436 (43.3)	410 (44.1)	
1	760 (22.9)	202 (21.7)	
2	436 (13.1)	121 (13.0)	
3+	684 (20.6)	196 (21.1)	
Transported via Ambulance – n (%)	1196 (36.1)	335 (36.1)	1
Admitted in prior 30 days* – n (%)	273 (8.2)	99 (10.7)	0.025
LAPS - mean (sd)	12.8 (12.2)	13.4 (13.0)	0.19

Table S3. Baseline characteristics among patients discharged home alive within 24 hours of admission, categorized by weekend versus weekday admission.

Table S3 Legend: The day of admission was categorized as 'weekday' (Monday to Friday) or 'weekend' (Saturday and Sunday). *Admitted to GIM at a study site in prior 30 days. Statistical significance for differences across categories was calculated using chi-square analysis for categorical variables and Kruskall-Wallis test for continuous variables. LAPS: Laboratory-based acute physiology score.

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Patient Characteristic	Admitted on Weekday (N=13,242)	Admitted on Weekend (N=4,445)	p-value
Age – median (IQR)	66 (49, 80)	67 (49, 81)	0.21
Female – n (%)	6703 (50.6)	2174 (48.9)	0.05
Charlson Comorbidity Index – n (%)			0.642
0	4877 (36.8)	1635 (36.8)	
1	2998 (22.6)	1025 (23.1)	
2	2056 (15.5)	711 (16.0)	
3+	3311 (25.0)	1074 (24.2)	
Transported via Ambulance – n (%)	5303 (40.0)	1928 (43.4)	<0.001
Admitted in prior 30 days* – n (%)	1222 (9.2)	433 (9.7)	0.324
LAPS - mean (sd)	15.4 (13.6)	16.0 (13.6)	0.004

Table S4. Baseline characteristics among patients discharged home alive within 72 hours of admission, categorized by weekend versus weekday admission.

Table S4 Legend: The day of admission was categorized as 'weekday' (Monday to Friday) or 'weekend' (Saturday and Sunday). *Admitted to GIM at a study site in prior 30 days. Statistical significance for differences across categories was calculated using chi-square analysis for categorical variables and Kruskall-Wallis test for continuous variables. LAPS: Laboratory-based acute physiology score.

DRD statement – checklist of items, extended from the STROBE statement, that should be reported in observational stuce offected health data.

3 4 5 6 7	Item No.	STROBE items	Location in manuscript where items are reported	RECORD items	Location manuscr where ite reported
bstract	t				
10 11 12 13 14	1	(a) Indicate the study's design with a commonly used term in the title or the abstract (b) Provide in the abstract an informative and balanced		RECORD 1.1: The type of data used should be specified in the title or abstract. When possible, the name of the databases used should be included.	Abstract
15 16 17 18 19 20 21		summary of what was done and what was found		RECORD 1.2: If applicable, the geographic region and timeframe within which the study took place should be reported in the title or abstract.	
22 23 24 25 26				RECORD 1.3: If linkage between databases was conducted for the study, this should be clearly stated in the title or abstract.	
01127	r				1
d 28 29 30	2	Explain the scientific background and rationale for the investigation being reported	0		Introduct
32 33 34	3	State specific objectives, including any prespecified hypotheses	2	•	Introduct
35					
gn ³⁶ 37 38 39	4	Present key elements of study design early in the paper			Methods Design, S Participar
40 41 42 43 44	5	Describe the setting, locations, and relevant dates, including periods of recruitment, exposure, follow-up, and data collection			Methods Design, S Participar
45 46 47 48 49 50 51 52 53 54 55 56 57 58 59					

S 1	6	(a) Cohort study - Give the	RECORD 6.1: The methods of study	Methods
2		eligibility criteria, and the	population selection (such as codes or	Design, S
3		sources and methods of selection	algorithms used to identify subjects)	Participa
4		of participants. Describe	should be listed in detail. If this is not	
5		methods of follow-up	possible, an explanation should be	
6		<i>Case-control study</i> - Give the	provided.	
7		eligibility criteria, and the		
8		sources and methods of case	RECORD 6.2: Any validation studies	
9		ascertainment and control	of the codes or algorithms used to	
10		selection. Give the rationale for	select the population should be	
12		the choice of cases and controls	referenced. If validation was conducted	
13		<i>Cross-sectional study</i> - Give the	for this study and not published	
14		eligibility criteria and the	elsewhere detailed methods and results	
15		sources and methods of selection	should be provided	
16		of participants	should be provided.	
17		of participants	RECORD 6.3. If the study involved	
18		(b) Cohort study For matched	linkage of detabases, consider use of a	
19		(b) Conori study - Foi matched	flaw diagram on other graphical dignlaw	
20		studies, give matching criteria	now diagram of other graphical display	
21		and number of exposed and	to demonstrate the data linkage	
22		unexposed	process, including the number of	
23		Case-control study - For	individuals with linked data at each	
25		matched studies, give matching	stage.	
26		criteria and the number of		
27		controls per case		
28	7	Clearly define all outcomes,	RECORD 7.1: A complete list of codes	Methods
29		exposures, predictors, potential	and algorithms used to classify	Outcome
30		confounders, and effect	exposures, outcomes, confounders, and	Measures
31		modifiers. Give diagnostic	effect modifiers should be provided. If	
32		criteria, if applicable.	these cannot be reported, an	
33 34			explanation should be provided.	
es#5	8	For each variable of interest.		Methods
nß6	_	give sources of data and details		Sources
37		of methods of assessment		
38		(measurement)		
39		Describe comparability of		
40		assessment methods if there is		
41		more than one group		
42	0	Describe any offerts to address		Statistica
43	7	Describe any enoris to address		Statistica
45				
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		potential sources of bias		Analysis
1	10	Explain how the study size was		Methods
2		arrived at		Design, S
4				Participa
e 5	11	Explain how quantitative		Methods
6		variables were handled in the		Outcome
7		analyses If applicable describe		Measures
8		which groupings were chosen		Wiedbure
9		and why		
10	10	(a) Describe all statistical		Mathada
11	12	(a) Describe all statistical		Methods Statistics
12		methods, including those used to		Statistica
13		control for confounding		Analysis
14		(b) Describe any methods used		
16		to examine subgroups and		
17		interactions		
18		(c) Explain how missing data		
19		were addressed		
20		(d) <i>Cohort study</i> - If applicable,		
21		explain how loss to follow-up		
22		was addressed		
23		<i>Case-control study</i> - If		
24		applicable, explain how		
25 26		matching of cases and controls		
20 27		was addressed		
27		Cross-sectional study - If		
29		annlicable describe analytical		
30		methods taking account of		
31		methods taking account of		
32		(a) Describe and strategy		
33		(e) Describe any sensitivity		
34		analyses		
and			RECORD 12.1: Authors should	Methods
ethøds			describe the extent to which the	Sources
38			investigators had access to the database	
39			population used to create the study	
40			population.	
41				
42			RECORD 12.2: Authors should	
43			provide information on the data	
44			I ▲	
45				
46				

			cleaning methods used in the study.	
1			RECORD 12.3: State whether the	Methods
2			study included person-level.	Sources
S ⊿			institutional-level or other data linkage	~ ~ ~ ~ ~ ~ ~ ~ ~ ~ ~ ~ ~ ~ ~ ~ ~ ~ ~ ~
+ 5			across two or more databases. The	
6			methods of linkage and methods of	
7			linkage quality evaluation should be	
8			mixage quality evaluation should be	
9			provided.	
10	10			D L
5 11	13	(a) Report the numbers of	RECORD 13.1: Describe in detail the	Results
12		individuals at each stage of the	selection of the persons included in the	
13		study (<i>e.g.</i> , numbers potentially	study (<i>i.e.</i> , study population selection)	
14		eligible, examined for eligibility,	including filtering based on data	
15		confirmed eligible, included in	quality, data availability and linkage.	
10 17		the study, completing follow-up,	The selection of included persons can	
17		and analysed)	be described in the text and/or by	
10		(b) Give reasons for non-	means of the study flow diagram	
20		participation at each stage		
21		(c) Consider use of a flow		
22		diagram		
23	14	(a) Cive characteristics of study		Dogulta
24	14	(a) Give characteristics of study		Results
25		participants (<i>e.g.</i> , demographic,		
26		clinical, social) and information		
27		on exposures and potential		
28		confounders		
29		(b) Indicate the number of		
30 21		participants with missing data		
37		for each variable of interest		
33		(c) Cohort study - summarise		
34		follow-up time (<i>e.g.</i> , average and	•	
35		total amount)		
atã ⁶	15	<i>Cohort study</i> - Report numbers	7/	Results
37	-	of outcome events or summary		
38		measures over time		
39		Case-control study - Report		
40		numbers in each exposure		
41				
42		category, or summary measures		
45		or exposure		
44 45				

1		Cross-sectional study - Report		
1		numbers of outcome events or		
2		summary measures		
3	16	(a) Give unadjusted estimates		Regults
54	10	(a) Give unaujusted estimates		Results
5		and, if applicable, confounder-		
6		adjusted estimates and their		
7		precision (e.g., 95% confidence		
8		interval). Make clear which		
9		confounders were adjusted for		
10		and why they were included		
11		and why they were included		
12		(b) Report category boundaries		
13		when continuous variables were		
14		categorized		
15		(c) If relevant consider		
16		translating astimates of relative		
17		vials into a has hat a vials for a		
18		risk into absolute risk for a		
19		meaningful time period		
′S @\$	17	Report other analyses done—		Results
21		e g analyses of subgroups and		
22		interactions and sensitivity		
23				
-24		analyses		
25				
26	18	Summarise key results with		Interpreta
27		reference to study objectives		-
28	19	Discuss limitations of the study	RECORD 19 1. Discuss the	Internrets
29	17	bisedss initiations of the study,	implications of using data that wore not	merpreu
30		taking into account sources of	implications of using data that were not	
31		potential bias or imprecision.	created or collected to answer the	
32		Discuss both direction and	specific research question(s). Include	
33		magnitude of any potential bias	discussion of misclassification bias,	
34		0 51	unmeasured confounding missing	
35			data and changing aligibility over	
36			data, and changing englotinty over	
50 27			time, as they pertain to the study being	
20			reported.	
on o	20	Give a cautious overall		Interpreta
39		interpretation of results		1
40		considering objectives		
41		limitationa multiplicity of		
42		limitations, multiplicity of		
43		analyses, results from similar		
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1		studies, and other relevant			
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oilįty	21	Discuss the generalisability			Interpreta
4		(external validity) of the study			_
5		results			
rfnatio	n		•		
7 8 9 10 11 12	22	Give the source of funding and the role of the funders for the present study and, if applicable, for the original study on which the present article is based			Title Pag
ylðf w ¹⁴ 15 16 ng 7 18				RECORD 22.1: Authors should provide information on how to access any supplemental information such as the study protocol, raw data, or programming code.	N/A
19		•			

Benchimol EI, Smeeth L, Guttmann A, Harron K, Moher D, Petersen I, Sørensen HT, von Elm E, Langan SM, the RECORD
 The REporting of studies Conducted using Observational Routinely-collected health Data (RECORD) Statement. *PLoS Medi* 22

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