



Derivation and validation of a 90-day unplanned hospital readmission score in older patients discharged from a geriatric ward

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Key summary points

Aim To derive and validate a 90-day unplanned hospital readmission (UHR) score based on information readily available to non-hospital based care providers.

Findings Independent risk factors for 90-day UHR were: use of mobility aids, presence of dementia syndrome, history of recent hospitalisation, and discharge to domiciliary home. In the development cohort and in the validation cohort, the 90-day UHR rate increased significantly across risk groups.

Message The findings should enable targeted multidisciplinary interventions in order to limit UHR.

Abstract

Purpose To derive and validate a 90-day unplanned hospital readmission (UHR) score based on information available to non-hospital based care providers.

Methods Retrospective longitudinal study with cross-validation method. Participants were older adults (≥ 65 years) admitted to a geriatric short-stay department in a general hospital in France. Patients were split into a derivation cohort and a validation cohort. We recorded demographic information, medical history, and concurrent clinical characteristics. The main outcome was 90-day UHR. Data obtained from hospital discharge letters were used in a logistic regression model to construct a predictive score, and to identify risk groups for 90-day UHR.

Results In total, 750 and 250 aged adults were included in both the derivation and the validation cohorts. Mean age was 87.2 ± 5.2 years, most were women (68.1%). Independent risk factors for 90-day UHR were: use of mobility aids ($p = .02$), presence of dementia syndrome ($p = .02$), history of recent hospitalisation ($p = .03$), and discharge to domiciliary home ($p = .005$). From these four risk factors, three groups were determined: low-risk group (score < 4), medium-risk group (score between 4 and 6), and high-risk group (score ≥ 6). In the derivation cohort the 90-day UHR rates increased significantly across risk groups (14%, 22%, and 30%, respectively). The 90-day UHR score had the same discriminant power in the derivation cohort (c -statistic = 0.63) as in the validation cohort (c -statistic = 0.63).

Conclusions This score makes it possible to identify aged adults at risk of 90-day UHR and to target multidisciplinary interventions to limit UHR for patients discharged from a Geriatric Short-Stay Unit.

Keywords Unplanned hospital readmission · Aged adults · Risk factors · Cross-validation

Introduction

Unplanned hospital readmission (UHR) is frequent [1]. Risk factors for UHR vary according to the population studied or the time of re-admission considered [2]. In the population aged 65 years and over, the most frequent factors associated with UHR after a hospitalisation in medical or surgical ward are race/ethnicity [3, 4], socio-economic status [3, 5, 6], marital status [4, 6], old age [2, 7, 8], admission in the previous 2 years [7], male sex [9, 10], presence of comorbidity [11], and history of neurological disorder [12]. Meta-analysis failed to identify the most important associated factors except for age [2]. Older people seem to be

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re-admitted particularly often [1], and some of these UHR appear to be avoidable [13]. Limiting avoidable UHR is a major public health issue [14], since UHR are a significant cause of health-care costs [10, 14–16], and are associated with poor outcomes [8, 14]. Some countries have experimented programs to reduce UHR based on collaboration between hospital-based and community care [17, 18]. The first step is to identify people at risk for UHR. General practitioners (GPs) are key players in identifying older people at risk of readmission. However, to do this, they need a simple and easy-to-use tool based on quickly accessible information. The aim of this study was to derive and validate a 90-day unplanned hospital readmission score based on information readily available to GPs.

Methods

Study design and population

This was a retrospective cohort study, including patients aged 65 years or older, admitted to the geriatric short-stay department of the Hospital of Valenciennes (France), from 1 January to 31 December 2019. The geriatric short-stay services in France welcome poly pathological aged patients at high risk of loss of functional autonomy (presence of frailty criteria, presence of cognitive disorders...). Patients are assessed and cared for by a multidisciplinary team trained in geriatrics, and benefit from an individualized medical and social evaluation, as well as a psychological and motor assessment. Rehabilitation sessions are set up according to the patient's needs. The average length of stay is about 10 days. Patients who died during their hospital stay, and those who were readmitted on a scheduled basis, were excluded from the study.

The cohort was randomly divided into two samples: 75% of the population served to derive the prediction model (derivation cohort), and 25% were used to validate it (validation cohort).

Variables studied

The following demographic characteristics were collected from the hospital discharge letter: age, sex, place of residence, living alone or not, children (yes/no), and presence of a caregiver. Concurrent clinical characteristics were noted, and included cognitive status (dementia, delirium), physical status (walking difficulties, dependence for activities of daily living), nutritional status, comorbidities, and polypharmacy (≥ 5 drugs/day). The aids used were recorded (home care nursing service, life assistant, mobility aids). The history of hospitalisation in the three months preceding the index hospitalisation, as well as the destination at discharge from hospital were also noted (domiciliary home, sheltered living, or nursing home).

Ethics aspects

The study was performed in accordance of the Declaration of Helsinki and French law relating to biomedical research involving human subjects. It was approved by the ethics committee of the General Hospital of Valenciennes (under the number 2021/001).

Statistical analyses

The main outcome was 90-day UHR. It was defined as the first episode of unplanned readmission occurring within the 90 days following hospital discharge.

Descriptive analysis of patients' characteristics was performed. Quantitative variables are described as mean \pm standard deviation ($m \pm SD$), and categorical variables as number and percentage (n , %). Bivariable relationships between each risk factor and 90-day unplanned hospital readmission in the derivation cohort were assessed using logistic regression. For multivariable analysis, a logistic regression model was built using stepwise selection. Results are presented as odds ratios (OR) and 95% Confidence Interval (CI).

A 90-Day UHR score was constructed. Point values were assigned to each risk factor according to the odds ratio in the final model. The point values were equal to the corresponding odds ratios, rounded to the nearest integer. According to number of risk factors present for each patient, three risk groups were defined.

Bootstrap analysis was performed to calculate the c-statistic (representing the area under the Receiver Operating Characteristic (ROC) curves) to assess the accuracy of the UHR score. Replication on 500 different samples drawn with replacement was performed using the bootstrap method.

Statistical analyses were performed using SAS software release 9.4, (SAS Institute, Inc., Cary, NC). Tests were considered as significant for p -values less than 0.05.

Results

In total, 1000 patients were included (750 in the derivation cohort, and 250 in the validation cohort). Over two-thirds were women (68.1%), and mean age was 87.2 ± 5.2 years (87.5 ± 4.9 years in the derivation cohort, vs 87.1 ± 5.3 years in the validation cohort). Other characteristics for the derivation and validation cohorts are described in Table 1.

The independent predictive factors for 90-day UHR identified in the derivation cohort were (Table 2): use of mobility aids ($p=0.02$), presence of a dementia syndrome ($p=0.02$), history of hospitalisation within the preceding three months ($p=0.03$), and the fact of being discharged to domiciliary home or sheltered living ($p=0.005$). None of the reasons of hospitalisation taken was significantly associated to 90-day UHR.

Table 1 Characteristics of patients in the derivation ($n = 750$) and validation ($n = 250$) cohorts

Characteristics	Derivation cohort N (%)	Validation cohort N (%)	p
Age 85 years and over	505 (67.3)	182 (72.8)	.11
Female sex	508 (67.7)	173 (69.2)	.67
Place of residence			.39
Domiciliary home	610 (81.3)	197 (78.8)	
Sheltered living	29 (3.9)	9 (3.6)	
Nursing home	111 (14.8)	44 (17.6)	
Living alone: yes	351 (47.1)	117 (47.0)	.99
Existence of children: yes	474 (75.2)	167 (78.4)	.35
Presence of a caregiver: yes	662 (88.9)	226 (90.4)	.50
Aids implemented			
Life assistant	474 (63.7)	157 (63.6)	.97
Home care nursing service	389 (52.4)	129 (51.8)	.88
Mobility aids	445 (59.9)	151 (61.9)	.58
Medical history			
Acute myocardial infarction	157 (20.9)	56 (22.4)	.62
Congestive heart disease	164 (21.9)	51 (20.4)	.62
Cerebrovascular disease	252 (33.6)	93 (37.2)	.30
Chronic pulmonary disease	152 (20.3)	44 (17.6)	.36
Diabetes	200 (26.7)	62 (24.8)	.56
Moderate or severe renal disease	125 (16.7)	42 (16.8)	.96
Solid tumour, lymphoma, myeloma	140 (18.7)	35 (14.0)	.09
Concurrent clinical characteristics			
Delirium syndrome	91 (12.1)	31 (12.4)	.91
Dementia syndrome	509 (69.0)	179 (73.7)	.17
Dependence in ADLs	619 (82.6)	206 (82.4)	.93
Malnutrition	421 (59.7)	150 (63.3)	.33
Walking difficulties	549 (73.4)	191 (76.7)	.30
Number of comorbidities ≥ 3	264 (35.2)	83 (33.2)	.57
Polypharmacy (≥ 5 drugs/day)	553 (73.7)	179 (71.6)	.51
Psychotropic drug use	429 (57.3)	151 (60.9)	.32
Hospitalisation in the previous 3 months	190 (25.3)	67 (26.8)	.65
Discharged to home (domiciliary or sheltered)	472 (62.9)	160 (64.0)	.76
90-day UHR	171 (22.8)	59 (23.6)	.79

Missing data: Living alone (DC=4; VC=1); Existence of children (DC=120; VC=37); Presence of a caregiver (DC=5; VC=0); Home care nursing service (DC=7; VC=1); Life assistant (DC=6; VC=3); Technical aids (DC=7; VC=6); Dependence for the ADL (DC=1; VC=0); Walking difficulties (DC=2; VC=1); Denutrition (DC=45; VC=13); Psychotropic drug use (DC=1; VC=2)

ADL: activity of daily living, DC derivation cohort, VC validation cohort, UHR unplanned hospital readmission

Table 2 Predictive Factors for 90-day unplanned hospital readmission in the derivation cohort: bivariable and multivariable analyses

Characteristics	Bivariable analysis			Multivariable analysis		
	OR	95% CI	<i>p</i>	OR	95% CI	<i>p</i>
Age: 85 years and over	0.90	0.62–1.29	.56			
Female sex	1.07	0.74–1.53	.73			
Place of residence: nursing home	0.92	0.57–1.50	.75			
Living alone: yes	0.96	0.68–1.35	.80			
Existence of children: yes	0.91	0.59–1.38	.65			
Presence of a caregiver: yes	1.52	0.83–2.77	.17			
Aids implemented						
Life assistant	1.18	0.83–1.70	.36			
Home care nursing service	1.38	0.98–1.95	.07			
Mobility aids	1.67	1.16–2.41	.006	1.60	1.09–2.36	.02
Medical history						
Acute myocardial infarction	1.21	0.80–1.81	.37			
Congestive heart disease	1.07	0.71–1.61	.73			
Cerebrovascular disease	1.24	0.87–1.78	.23			
Chronic pulmonary disease	0.88	0.57–1.36	.57			
Diabetes	1.47	1.02–2.13	.04			
Moderate or severe renal disease	1.33	0.86–2.06	.20			
Solid tumour, lymphoma, myeloma	0.82	0.52–1.29	.38			
Concurrent clinical characteristics						
Delirium syndrome	1.09	0.65–1.82	.74			
Dementia syndrome	1.80	1.20–2.71	.005	1.67	1.09–2.55	.02
Dependence in ADLs	1.66	1.01–2.74	.04			
Malnutrition	1.01	0.71–1.44	.96			
Walking difficulties	1.54	1.02–2.33	.04			
Number of comorbidities ≥ 3	1.29	0.91–1.83	.16			
Polypharmacy (≥ 5 drugs/day)	1.04	0.70–1.53	.86			
Psychotropic drug use	0.91	0.65–1.29	.60			
Hospitalisation within the preceding 3 months	1.50	1.03–2.19	.03	1.54	1.04–2.27	.03
Discharged to domiciliary home or sheltered living	1.42	1.00–2.04	.05	1.75	1.19–2.57	.005

OR odds ratio, CI confidence interval, ADL activities of daily living

Point values were determined for each of the four risk factors, and summed for each patient (Table 3). Three risk groups were determined according to number of risk factors: low-risk group (0 or 1 risk factor), medium-risk group (2 risk factors), and high-risk group (3 or 4 risk factors).

In the derivation cohort, the 90-day UHR rate increased significantly ($p=0.0003$) across risk groups. Similar results were observed in the validation cohort ($p=0.03$). The 90-day UHR score had the same discriminant power in the derivation cohort (c -statistic=0.63) as in the validation cohort (c -statistic=0.63).

Discussion

In our study, 90-day UHR occurred in 23% of cases, which is in line with rates described in the literature for the aged population [1]. The factors significantly associated with 90-day UHR were: presence of dementia syndrome, use of mobility aids, hospitalisation within the preceding three months, and being discharged to domiciliary home. Dementia or a history of neurological disorders has previously been reported by other authors as being associated with early or late UHR after surgery [8, 13, 15, 19]. Some studies have suggested that patients with dementia have an increased rate of frailty

Table 3 Derivation and Validation of the 90-day unplanned hospital readmission score

Risk factors	Allocation of point values			
	OR ^a (95% CI ^b)		Point values	
Use of mobility aids	1.60 (1.09–2.36)		2	
Presence of dementia syndrome	1.67 (1.09–2.55)		2	
Hospitalisation within the preceding 3 months	1.54 (1.04–2.27)		2	
Discharged to domiciliary home or sheltered living	1.74 (1.19–2.57)		2	
Validation of the 90-day unplanned hospital readmission score				
	Derivation cohort (N = 750)		Validation cohort (N = 250)	
	Number of UHR/total	% (95% CI ^b)	Number of UHR/total	% (95% CI ^b)
Low-risk group: less than 4 points	28/200	14 (9–19)	7/54	13 (6–25)
Medium-risk group 2: 4 points	60/270	22 (18–28)	23/104	22 (15–31)
High-risk group 3: 6 points or over	83/280	30 (25–35)	29/92	31 (23–42)
Overall groups	171/750	23 (20–26)	59/250	24 (18–29)
ROC curve area ^c (95% CI)	0.633 (0.631–0.635)		0.633 (0.629–0.636)	

The point values were equal to the corresponding odds ratios, rounded to the nearest integer

UHR unplanned hospital readmission

^aadjusted odds ratio from the final model

^b95% confidence interval

^cROC curves were bootstrapped and are reported for overall score

and urgent hospitalization [20–22]. It is possible that patients with cognitive or neurological disorders are more likely to decompensate for a chronic condition or represent an acute condition following an initial acute event. Several authors have observed that two or more admissions during the previous year was associated with 6-month UHR [7, 23]. In our study, hospitalisation within the preceding three months was found to be a significant risk factor for UHR. This observation could reflect the absence of intervention to correct the risk of readmission, and the difficulty in identifying patients at risk. Heins et al. showed that patients with multiple comorbidities, and with high care needs, do not necessarily have the same profile as patients who tend to have UHR [24]. There is thus a compelling need to develop tools to help screen for aged patients who are at high risk of UHR, with a view to implementing concrete preventive actions. “Several scores exist in the literature [25–27]. Their discriminating performances are poor [25]. Some authors suggest that frailty scores could be used to identify older subjects at risk for re-hospitalisation [28]. General practitioners need a rapid screening tool that allows them to schedule specific management for at-risk patients based on available resources”. In their systematic review of interventions aimed at preventing UHR, Coffey et al. showed that the successful interventions pre- and post-discharge for preventing UHR were those leveraging integrated systems between hospital-based and community care, with multidisciplinary service

provision, individualization of services, and specialist follow-up [18]. Identifying patients at risk of UHR before, or at the time of discharge from hospital therefore seems essential to initiating appropriate services in a timely manner to help avoid future re-admissions in this population. In our study, we found that being discharged to domiciliary home was associated with a higher risk of UHR. This seems logical, since people discharged to a rehabilitation centre or nursing home are closely monitored and medically supervised, thus limiting the risk of UHR. UHR is increasingly being used as an indicator of the quality of care [29]. However, it would be wrong to consider all UHR as avoidable. In a study of post-surgical readmissions, Jencks et al. observed that 70.5% of patients readmitted within 30 days after surgical discharge were rehospitalized for a medical condition [16]. However, the authors surmised that some of these readmissions could likely be replaced by outpatient care or scheduled hospitalisation [16]. Indeed, UHRs are longer [16], more costly [16], and associated with poor outcome [8, 14]. Graves et al. showed that a comprehensive intervention among older adults (> 65 years) with at least one risk factor for readmission was cost-effective, and improved health outcomes (quality-adjusted life years) [30]. There is evidence that interventions of this type are beneficial, suggesting that they should be promoted and implemented. Mathew et al. performed a systematic review and meta-analysis of factors associated with readmissions in older adults following fragility fractures [2].

Age was the only factor for which pooling of data across studies was possible, and age was shown to be significantly associated with re-presentation to the emergency department both within 30 days (OR 1.27; 95% CI 1.14–1.43) and beyond 30 days (OR 1.23; 95% CI 1.01–1.50) [2]. In our study, advanced age was not associated with an increased risk of UHR. However, the population of our study was composed solely of patients initially admitted to a short-stay unit for medical reasons. The clinical profile of the patients was therefore likely different, with a higher mean age and a higher level of frailty in our population.

Our work has several strengths. Most studies focus on readmissions after surgical discharge. This is the first score to predict 90-day UHR in a population aged 65 years or more, and the score was successfully cross-validated in a validation cohort. Its accuracy is similar to those developed by other authors [1]. The score uses information that is easy to collect from the hospital discharge letter. This makes it relevant and helpful for GPs, but also useful for other front-line practitioners outside the hospital setting. The identification of older persons at high risk of rehospitalisation would make it possible to implement targeted interventions to reduce the risk. Our study also has some limitations. All the patients included were initially admitted to a geriatric short-stay unit, and therefore, the study population comprises patients who are frail, polymedicated, with low autonomy. Nevertheless, comorbidities, autonomy and polypharmacy were not found to be associated with the risk of UHR. Second, the data required to calculate the UHR score are given in the hospital discharge report. In France, geriatrics units systematically perform multidimensional, comprehensive geriatric assessment, and specifically report, for example, the presence of cognitive disorders or walking aids. This information may therefore be absent from discharge reports issued by other hospital wards. Nevertheless, the score components remain simple to collect by asking the patient or entourage if not mentioned in the hospital communication. This score was constructed on the basis of data from before the COVID-19 epidemic. Therefore, we cannot generalize its metrological properties in an epidemic situation.

In summary, we developed and validated a score to identify older adults at high risk of 90-day UHR after a stay in a short-stay geriatrics ward for medical reasons. Identifying patients at risk of UHR should help to guide the selection and implementation of comprehensive multidisciplinary and individualized services to limit UHR and improve quality of life in these older adults.

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Authors' contributions All authors contributed to the study conception and design. Material preparation, data collection and analysis were performed by LG, and MD. The first draft of the manuscript was written by LG, and MD, and all authors commented on previous versions of the manuscript. All authors read and approved the final manuscript.

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Declarations

Conflict of interest The authors declare no competing interest directly or indirectly related to this work.

Ethical approval The study was performed in accordance with the Declaration of Helsinki and current French legislation relating to biomedical research involving human subjects. It was approved by the ethics committee of the General Hospital of Valenciennes (under the number 2021/001).

Informed consent No participant objected to participate to the study.

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