



# Factors Influencing Hospital Admission of Non-critically Ill Patients Presenting to the Emergency Department: a Cross-sectional Study

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**BACKGROUND:** Little is known about the factors that influence physicians' admission decisions, especially among lower acuity patients. For the purpose of our study, *non-medical* refers to all of the factors—other than the patient's clinical condition—that could potentially influence admission decisions.

**OBJECTIVE:** To describe the influence of non-medical factors on physicians' decisions to admit non-critically ill patients presenting to the ED.

**DESIGN:** Cross-sectional study of hospital admissions at a single academic medical center.

**PARTICIPANTS:** Non-critically ill adult patients admitted to the hospital ( $n=297$ ) and the admitting emergency medicine physicians ( $n=34$ ).

**MAIN MEASURES:** A patient survey assessed non-medical factors, including primary care access and utilization. A physician survey assessed clinical and non-medical factors influencing the decision to admit. Based on physician responses, admissions were characterized as "strongly acuity-driven," "moderately acuity-driven," or "weakly acuity-driven." Among these admission types, we compared length of stay, cost, and readmission within 30 days to the hospital or ED.

**KEY RESULTS:** Based on the admitting physician's assessment, we categorized the motivation for admission as strongly acuity-driven in 185 (62 %) admissions, moderately acuity-driven in 92 (31 %), and weakly acuity-driven in 20 (7 %). Per the physician surveys, 51 % of hospitalizations were strongly or moderately influenced by one or more non-medical factors, including lack of information about baseline conditions (23 %); inadequate access to outpatient specialty care (14 %); need for a diagnostic testing or procedure (12 %); a recent ED visit (11 %); and inadequate access to primary care (10 %). Compared with strongly-acuity driven admissions, admissions that were moderately or weakly acuity-driven were shorter and less costly but were associated with similar rates of ED (35 %) and hospital (27 %) readmission.

**CONCLUSIONS:** Non-medical factors are influential in the admission decisions for many patients presenting to

the emergency department. Moderately and weakly acuity-driven admissions may represent a feasible target for alternative care pathways.

**KEY WORDS:** non-medical factors; hospital admission decision; access to care; care transitions; decision making; emergency medicine; health care delivery; medical decision making; severity of illness; socioeconomic factors; utilization.

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## INTRODUCTION

Hospitalizations comprise the largest component of health care expenditures<sup>1</sup> and are increasingly determined by emergency medicine (EM) physicians.<sup>2</sup> An understanding of the factors contributing to admission decisions is critical to efforts to reduce hospitalizations.

While clinical condition and acuity primarily influence the likelihood of admission,<sup>3</sup> non-medical factors may also contribute.<sup>4–13</sup> For the purpose of our study, *non-medical* refers to all factors, other than a patient's clinical condition, that potentially influence admission decisions. In retrospective studies, non-medical factors associated with hospital admission include both patient-level (e.g., income,<sup>4,5</sup> insurance status,<sup>6,7</sup> homelessness,<sup>8,9</sup> spouse's health status,<sup>10</sup> health literacy<sup>11</sup>) and system-level features (e.g., access to care,<sup>12,13</sup> provider continuity<sup>14</sup>). But the role that these non-medical factors play in admission decisions is not well established.

Prior studies have documented variability in hospital admission decisions that is not explained by objective measures of illness severity.<sup>15</sup> Even among high acuity patients, a qualitative study of disposition decision-making identified patient behavior, social situation, diagnostic uncertainty, and resource limitations as contributing factors.<sup>16</sup> Two previous studies have prospectively surveyed admitting physicians: one from 1976 found that patient-level and health system-level non-medical factors contributed to 21 % of admissions<sup>17</sup>; a 1994 study in a pediatric population found they contributed to 28 % of admissions.<sup>18</sup>

We hypothesized that non-medical factors play an important role in admission decisions and are more likely to influence lower acuity admissions. Through physician

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interviews, we sought to identify the range of non-medical factors implicated in disposition decisions. We then conducted a prospective study to describe a population of non-critically ill adult patients admitted from the emergency department (ED) and to assess the influence of medical and non-medical factors on those admission decisions.

## METHODS

**Study Design and Setting.** We conducted a cross-sectional study of hospital admissions in the ED of an urban academic medical center in the northeast USA between February and April 2011. During the study period, care coordinators were employed in the ED primarily to determine Observation or Inpatient status. The study was approved by the Institutional Review Board at Yale University School of Medicine.

**Participants. Physicians:** All EM attending physicians staffing the ED during the study period participated ( $n=34$ ). **Patients:** Adult patients presenting to the ED were eligible for enrollment at the time an attending physician decided to admit them. Patient exclusion criteria included inability to speak English or Spanish, age <18 years, altered mental status, chief complaint of trauma, and Emergency Severity Index (ESI) of 1. The ESI is a measure of acuity assigned by a triage nurse prior to physician evaluation, with a range of 1 (high) to 5 (low). Patients with an ESI of 1 are often admitted,<sup>19,20</sup> but comprise only 2 % of admissions from the ED in our study. We excluded them for logistical reasons (low likelihood that they could complete the patient survey given their trauma or critical illness) and in order to target the patient population for which non-medical factors may influence admission decisions. We enrolled patients during 101 4-h blocks from 7 a.m.–11 p.m., 7 days a week. We used an online random number generator to assign the 4-h blocks and attempted to enroll a consecutive sample of admitted patients within each block. We aimed to enroll 330 patients in order to have 80 % power to detect a 10 % difference between groups, assuming proportions of 0.2–0.3 for the influence of any non-medical factor, based on the prior studies. Two-sided alpha was set at 0.05. All participants, physicians and patients, gave written informed consent.

**Study Protocol and Measures.** We administered paper-based patient and physician surveys at the time of admission. We also obtained administrative data for each admission, including ESI, primary discharge ICD-9 code, observation status, actual direct cost, payer, length of stay, hospital or ED readmission within 30 days of discharge,

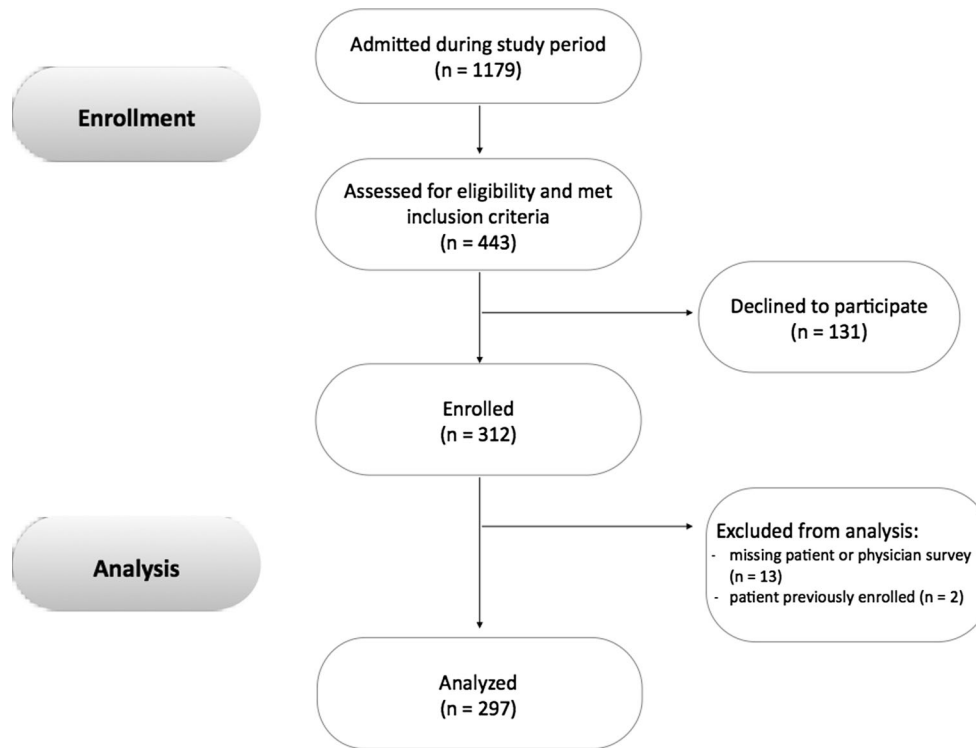
and number of hospital or ED admissions in the 12 months preceding enrollment.

**Physician Survey.** We developed the physician survey using qualitative survey generation methods. We conducted semi-structured interviews with four EM attendings individually to elicit the factors they consider when making hospital admission decisions. No new ideas emerged during the fourth interview. We used these results to develop a preliminary survey, which we piloted individually with five other EM attendings, using a retrospective probing technique.<sup>21</sup> We iteratively modified the survey based on the results of each interview. The final version asked the physician to determine the degree of influence that each of 16 factors had on her decision to admit a specific patient. Response options include: strong, moderate, weak, and none. We also asked whether a care coordinator was involved. The physician survey is displayed in Appendix 1.

**Patient Survey.** In order to characterize the patient population, we created a patient survey comprised of validated and adapted measures. Validated measures included the Patient Health Questionnaire-2 (PHQ-2)<sup>22</sup> to screen for depression as well as the Rapid Estimate of Adult Literacy in Medicine-Short Form (REALM-SF)<sup>23,24</sup> and Short Assessment of Health Literacy for Spanish Adults (SAHLSA-50)<sup>25</sup> to assess health literacy in English and Spanish, respectively. Individual items were adapted from the Medical Outcomes Study 36-Item Short-Form Health Survey (MOS-SF-36)<sup>26</sup> to measure health-related quality of life and from the National Health Interview Survey<sup>27</sup> to examine primary care access. We also asked about demographic information; measures of social support, including relationship status and living situation; self-reported health care utilization in the preceding year; and perceived primary care access, including whether the patient has a usual source of care and a primary care provider. Prior to data collection, we piloted the survey for length and clarity with patients in the ED.

**Outcome Measures.** The main outcomes of interest are the proportions of hospital admission decisions strongly or moderately influenced by acuity or by one or more non-medical factors, as determined by the EM physician.

We categorized admissions as “strongly acuity-driven,” “moderately acuity-driven,” or “weakly acuity-driven” based on the first item on the physician survey (influence of “acuity of condition”). We arrived at the threshold for categorization based on the semi-structured interviews and provider survey pilot. Physicians identified Strong, Moderate, Weak, and None as clinically significant response options. A theme common to several interviews was that even when non-medical factors are influential, the influence of clinical acuity is paramount. Hence, “strongly acuity-driven” admissions are based on the



**Figure 1 Patient enrollment.** The ED admitted 4,411 patients from 5 February 2011 to 8 April 2011 (63 days). Based on simple proportions, we estimate that 1,179 patients were admitted during our recruitment blocks [ $4411 \times (101^*4)/(63^*24)$  h]. Of these, 443 (38 %) were assessed for eligibility and approached for enrollment. (Note that 1,179 is likely an underestimate and 38 % a corresponding overestimate given that we did not enroll patients between 11 p.m. and 7 a.m., when admission rates are lower.)

physicians' response of Strong for the influence of "acuity of condition;" "moderately acuity-driven" reflects a response of Moderate; "weakly acuity-driven" corresponds to responses of Weak or None.

We used survey and administrative data to characterize the admissions stratified by acuity, comparing strongly acuity-driven admissions with the moderately and weakly acuity-driven admissions. We chose these groups for comparison given the expectation of a relatively small number of weakly acuity-driven admissions in our sample. During the physician survey development, physicians noted that they would rarely select Weak or None for the influence of acuity given that medical necessity needs to be demonstrated for reimbursement purposes.

**Data Analysis.** We scanned the survey forms, converted them into a Microsoft Excel file using Cardiff Teleform version 10 software, and used IBM SPSS versions 20 and 21 (SPSS, Chicago, IL) for analysis. We used *t* tests to compare continuous variables and chi-square tests to compare categorical variables between strongly acuity-driven and moderately/weakly acuity-driven admissions. Non-normally distributed data are described with medians and interquartile ranges and compared with the Mann-Whitney-Wilcoxon test. All tests were two-sided, and alpha was set at 0.05. We used a Kentall's tau-b test to examine the correlation between the degrees to which acuity and non-medical factors influenced admission.

## RESULTS

The ED admitted approximately 1,179 patients during our recruitment blocks. Of these, 443 (38 %) were assessed for eligibility and approached for enrollment. Of the remaining 62 %, we estimate that 2 % were excluded for ESI of 1; an unknown number were excluded for inability to speak English or Spanish or altered mental status; and an unknown number were missed, either because of a shift change (excluded if the attending responsible for the admission decision was not present), high volume leading patients to get transferred to an inpatient bed before being approached for enrollment, or the patient undergoing a procedure or diagnostic test that prevented enrollment.

Of the 443 eligible patients approached during the enrollment blocks, 312 (70.5 %) agreed to participate in the study. We excluded 13 patients because of missing survey data (missing the provider survey, patient survey, or both). An additional two patients had already been enrolled, leaving a final sample size of 297, as displayed in Figure 1. Patient characteristics are shown in the first column of Tables 1 and 2. Missing data are noted in each row. There were no missing data from the physician survey. Physicians responded Yes for involvement of a care coordinator in 11 admissions; for all 11, they responded No to the follow-up question of whether their involvement affected disposition.

Table 1 Patient demographic characteristics (patient survey data except where noted)

	All Admissions (n=297)	Moderately/ weakly acuity-driven admissions (n=112)	Strongly acuity-driven admissions (n=185)	p value
Age in years, mean (SD)	56 (17)	53 (18)	57 (17)	0.09
Female, n (%)	146 (49)	55 (49)	91 (49)	0.99
Race and ethnicity, n (%)				0.26
White, non-Hispanic	174 (59)	60 (54)	114 (62)	
Black/African-American	71 (24)	30 (29)	41 (22)	
Hispanic	40 (13)	16 (14)	24 (13)	
Other	12 (4)	6 (3)	6 (3)	
Primary language used in healthcare setting, n (%)				0.14
English	287 (97)	106 (95)	181 (98)	
Spanish	10 (3)	6 (5)	4 (2)	
Education, n (%)				0.77
Did not graduate high school	56 (19)	22 (20)	34 (18)	
High school graduate/ GED	154 (52)	62 (55)	92 (50)	
College graduate	87 (29)	28 (25)	59 (32)	
Employment Status, n (%)				0.75
Unemployed/retired	189 (64)	70 (63)	119 (64)	
Employed part time	28 (9)	13 (12)	15 (8)	
Employed full time	79 (26)	29 (25)	50 (32)	
Payer ( <i>administrative data</i> ), n (%)				0.53
Uninsured/self-pay	4 (1)	2 (2)	2 (1)	
Medicaid	83 (28)	36 (32)	47 (25)	
Medicare	117 (39)	43 (38)	74 (40)	
Privately insured	93 (31)	31 (28)	62 (34)	
Relationship status, n (%) (n=294, 3 missing)				0.28
Married or living with a partner	142 (48)	53 (47)	89 (48)	
Widowed, divorced, separated, or never married	152 (51)	59 (53)	93 (50)	
Living situation (n=290, 7 missing)				0.87
With family or friends	210 (71)	80 (71)	130 (70)	
With roommates	12 (4)	4 (4)	8 (4)	
Alone	67 (23)	26 (23)	41 (22)	
Homeless	8	2	6	
	3 %	2 %	3 %	

**Primary Outcome: Influence of Acuity and Non-medical Factors on Hospital Admission Decisions (Physician Survey Data).** Clinical acuity strongly or moderately influenced 93 % of admissions. According to the admitting physician, 185 admissions were strongly motivated by acuity; 92 were moderately influenced; 19 were weakly influenced; and 1 was not influenced at all by acuity (Table 3). Based on the admitting physician's assessment of the patient's clinical acuity and need for inpatient care, we categorized 185 admissions (62 %) as "strongly acuity-driven," 92 (31 %) as "moderately acuity-driven," and 20 (7 %) as "weakly-acuity driven." The degrees of influence of acuity and non-medical factors were inversely correlated by a factor of  $-0.31$  ( $p < 0.001$ ).

Fifty-one percent of the admissions were strongly or moderately influenced by one or more of the non-medical factors identified on the physician survey (Tables 3 and 4). Patient-level non-medical factors that influenced physicians' decisions to admit are shown in Table 4 and included a recent ED visit (11 %), low likelihood of patient adherence to a discharge plan (9 %), the patient's living situation and social support (6 %), and problems with transportation if discharged (6 %). Perceived system-level non-medical factors that influenced admission decisions included lack of information about the patient's baseline condition (23 %), inadequate access to outpatient specialty care (14 %), a patient's need for a diagnostic testing or procedure that cannot be easily obtained as an

outpatient (12 %), inadequate access to primary care (10 %), and a patient's need for increased nursing care despite existing home or facility-based nursing care (8 %).

### Secondary Outcome: Characterization of Admissions Stratified by the Influence of Acuity (Patient Survey, Physician Survey, and Administrative Data)

ESI was higher for the strongly acuity driven admissions (Table 2), although the difference is likely clinically insignificant.<sup>18,19</sup> There were no differences between strongly acuity-driven admissions and moderately/weakly acuity-driven admissions in demographic variables, primary care access, provider continuity, or health literacy (Tables 1 and 2). With regard to health care utilization in the year preceding enrollment, frequencies of ambulatory care and inpatient admission did not differ between the strongly acuity-driven and moderately/weakly acuity-driven admissions (Table 2), but patients with moderately or weakly acuity-driven admissions were more likely to use the ED ( $p = 0.02$ ).

Seventy-one percent of moderately/weakly acuity-driven admissions were strongly or moderately influenced by one or more of the non-medical factors identified on the provider survey (Table 4). Factors that were disproportionately associated with moderately/weakly acuity-driven admissions

**Table 2 Patient health characteristics (patient survey data except where noted)**

	All admissions (n=297)	Moderately/ weakly acuity-driven admissions (n=112)	Strongly acuity-driven admissions (n=185)	p value
Previous medical attention for chief complaint, n (%)				0.18
None	95 (32)	40 (36)	55 (30)	
ED only	43 (15)	19 (17)	24 (13)	
Office/clinic only	83 (28)	32 (29)	51 (28)	
Both ED and office/clinic	76 (26)	21 (19)	55 (30)	
PHQ2 screen positive, n (%)	97 (33)	44 (39)	53 (29)	0.06
Inadequate health literacy, n (%)	111 (38)	49 (44)	62 (34)	0.09
Health-related quality of life: number of days in last month unable to perform usual activities, n (%)				0.71
0	108 (36)	39 (35)	69 (37)	
1 to 3	46 (16)	18 (16)	28 (15)	
4 to 9	28 (9)	10 (9)	18 (10)	
10 to 15	24 (8)	6 (5)	18 (10)	
>15	91 (31)	39 (35)	52 (28)	
Usual source of care, n (%) (n=290, 7 missing)				0.41
Doctor's office or clinic	195 (66)	70 (63)	125 (68)	
Emergency department	44 (15)	16 (14)	28 (15)	
Other place	5 (2)	2 (2)	3 (2)	
None	46 (16)	19 (17)	27 (15)	
Primary care provider, yes, n (%)	250 (85)	93 (83)	157 (85)	0.6
Primary care utilization in the year preceding enrollment, n (%)				0.76
0-1 visit/year	43 (14)	13 (12)	30 (16)	
2-9 visits/year	139 (47)	52 (46)	87 (47)	
>9 visits/year	113 (38)	46 (15)	67 (36)	
Unsure	2 (1)	1 (1)	1 (1)	
ED utilization* in the year preceding enrollment (administrative data), n (%)				0.02
0-1 visit/year	234 (79)	78 (70)	156 (84)	
2-9 visits/year	57 (19)	29 (26)	28 (15)	
>9 visits/year	6 (2)	5 (4)	1 (1)	
Inpatient utilization in the year preceding enrollment (administrative data), n (%)				0.34
None	164 (55)	66 (59)	98 (53)	
Low (1 hospitalization/year)	72 (24)	23 (21)	49 (26)	
Moderate (2-3 hospitalizations/year)	33 (11)	9 (8)	24 (13)	
High (>3 hospitalizations/year)	28 (9)	14 (13)	14 (8)	
ESI score (administrative data), mean (SD) (5 missing: n=292, 109, 183)	2.43 (0.5)	2.52 (0.5)	2.38 (0.5)	0.017

\*Includes ED visits at Yale New Haven Hospital only and does not include ED visits leading to admission, which are captured by the Inpatient utilization values

included, among others, lack of information about the patient's baseline condition and inadequate access to primary and specialty care.

The strongly acuity-driven and moderately/weakly acuity-driven admissions differed in length of stay and cost (Table 5), with an average difference of 1.9 days and 1798 dollars (Table 5). Observation status and readmission to the ED or hospital within 30 days of discharge did not significantly

differ. Nonspecific chest pain was the most common principal diagnosis for all admissions.

## DISCUSSION

To our knowledge, this is the only recent study to prospectively survey physicians about the factors influencing hospital

**Table 3 The influence of acuity and non-medical factors on each admission: distribution of responses from the physician survey. Responses for the first item "Acuity of condition" are represented in rows. Columns represent responses for non-medical factors (i.e., all factors except for Acuity). Admissions in the Strong column had "Strong" selected for at least one non-medical factor. Admissions in the Moderate column had "Moderate" but not "Strong" selected for at least one non-medical factor. The far-right column identifies the admissions characterized as "Strongly acuity-driven" (n=185), "Moderately acuity-driven" (n=92), and "Weakly acuity-driven" (n=20)**

	Degree of influence	Factors other than acuity of condition, at least one				Total n, (%)
		Strong	Moderate	Weak	None	
Acuity of condition	Strong	38	33	19	95	185 (62)
	Moderate	30	32	18	12	92 (31)
	Weak	5	12	1	1	19 (6)
	None	1	0	0	0	1 (0.3)
	Total n, (%)	74 (25)	77 (26)	38 (13)	108 (36)	297

Table 4 Medical and non-medical factors influencing admission\* (physician survey data)

Factor	All admissions (n=297)	Moderately/ weakly acuity-driven admissions (n=112)	Strongly acuity-driven admissions (n=185)	p value
n (%)				
Acuity of condition	277 (93)	–	–	–
Lack of information about baseline condition	70 (23)	34 (30)	36 (20)	<b>0.03</b>
Recent ED visit	34 (11)	18 (16)	16 (9)	<b>0.05</b>
Language barrier	0 (0)	0 (0)	0 (0)	–
Lack of availability of imaging	13 (4)	7 (6)	6 (3)	0.22
Lack of availability of other testing or procedure	35 (12)	18 (16)	17 (9)	0.07
Inadequate primary care access	29 (10)	19 (17)	10 (5)	<b>0.001</b>
Inadequate specialty care access	43 (14)	27 (24)	16 (9)	<b>&lt;0.001</b>
Need for coordination of hospice or long-term care placement	4 (1)	4 (4)	0 (0)	<b>0.01</b>
Need for increased level of nursing care	24 (8)	13 (11)	11 (6)	0.08
Low likelihood of patient adherence	28 (9)	16 (14)	12 (7)	<b>0.03</b>
Psychiatric condition	6 (2)	5 (4)	1 (1)	<b>0.02</b>
Inadequate insurance or financial considerations	3 (1)	2 (2)	1 (1)	0.30
Living situation or lack of social support	17 (6)	12 (11)	5 (3)	<b>0.004</b>
Transportation concerns	10 (3)	7 (6)	3 (2)	<b>0.03</b>
Compassion for situation	10 (3)	8 (7)	2 (1)	<b>0.005</b>
<b>Any non-medical factor</b>	<b>151 (51)</b>	<b>80 (71)</b>	<b>71 (38)</b>	<b>&lt;0.001</b>

\*Factors identified on provider survey as having strong or moderate influence on the admission decision

admission of adult patients. Among our sample of non-critically ill patients admitted from the ED, we found that non-medical factors were considered in approximately half of admission decisions and may have been the primary driver in 7 % of the admissions. As health care systems are increasingly incentivized to reduce hospitalizations, mitigating the influence of non-medical factors may be an important target. Health system factors seem to have greater influence than patient non-medical factors on admission decisions, which is encouraging given the feasibility of system-based interventions.

Several non-medical factors identified by physicians reflect the role of diagnostic uncertainty in disposition decisions. These include the lack of information about the baseline condition, need for diagnostic testing, and recent ED visitation. A shared electronic medical record could enable EM physicians to better assess a patient's baseline condition and improve communication between ambulatory and emergency providers, similar to benefits seen in inpatient and ambulatory settings.<sup>28,29</sup> Enhancing EM physicians' abilities to link discharged patients to timely outpatient primary and specialty care appointments, diagnostic testing, and procedures may increase physicians' thresholds for admission.

Protocol-based approaches to outpatient management of patients at risk for serious illness may also reduce admissions by decreasing perceived clinical and medico-legal risk of ED

discharge. These alternative care pathways require clinical decision tools to assess risk; evidence-based diagnostic and treatment protocols to minimize variability in care; outpatient follow-up that is reliably available on an urgent schedule; efficient communications among patients and providers; support for shared decision-making with patients; and quality-based financial incentives to encourage their development and utilization as an alternative to admission.<sup>30</sup> Decision rules currently utilized by EM physicians, such as the TIMI score<sup>31</sup> for chest pain and the ABCD2 score<sup>32</sup> for TIA, may lead to the admission of clinically stable patients because of a low or intermediate risk of serious illness. It is unclear whether these patients would be captured by the "strongly acuity-driven" or "moderately acuity-driven" admission groups in our study, but many could likely be managed in an alternative environment if evidence-based protocols for urgent outpatient testing were established.<sup>30</sup>

Other ED-based approaches to facilitate outpatient management of lower-acuity patients require further study but include subspecialty consultation;<sup>33</sup> involvement of clinical educators for the management of chronic disease; and care coordination and case management involving nurses and social workers,<sup>34</sup> multi-disciplinary outreach,<sup>35</sup> and home care.<sup>36,37</sup> When compared with strongly acuity-driven admissions, moderately/weakly acuity-driven admissions were associated with similar rates of ED and hospital readmission, suggesting that they may

Table 5 Characteristics of hospitalizations (administrative data)

	All admissions (n=297)	Moderately/ weakly acuity-driven admissions (n=112)	Strongly acuity-driven admissions (n=185)	p value
Observation status, n (%)	41 (14)	19 (17)	22 (12)	0.67
Length of stay, days, median (IQR)	2 (4)	2.8 (3.1)	4.7 (7.9)	<b>0.016</b>
Cost, \$ (mean, SD)	4,673 (7,361)	3,552 (5,366)	5,350 (8,281)	<b>0.04</b>
30-day ED readmission, n (%)	105 (35)	41 (37)	64 (35)	0.73
30-day hospital readmission, n (%)	79 (27)	35 (31)	44 (24)	0.16

also be an important target for inpatient discharge care coordination. Data regarding the effectiveness of pre- and post-discharge interventions have been mixed, but targeting these lower acuity admissions may be more cost-effective than interventions addressing long-term outpatient disease management.<sup>38–45</sup>

Primary care access and ED utilization patterns have been examined in multiple studies looking at risk for admission, with varying results.<sup>4,6,12,13,46–48</sup> In our study, self-reported ambulatory care did not differ between the patients with strongly acuity-driven and moderately/weakly acuity-driven admissions. However, a physician's perception that patients lacked access to primary or specialty care played a role in the decisions to admit the lower acuity patients. This may reflect the expectation that even if patients have a primary provider, getting a timely appointment after ED discharge is not guaranteed.<sup>49</sup> Our finding that a recent ED visit influenced 16 % of moderately/weakly acuity-driven admissions may indicate physicians' concerns that ED re-visitation is a predictor of adverse events or may represent outpatient treatment failure. Both might be mitigated by care coordination, which has been shown to be effective in reducing readmissions in patients discharged from the ED.<sup>50,51</sup>

The strengths of our data include high participation rates (100 % of physicians and 70.5 % of eligible patients); use of validated instruments when available; and iterative development of a physician survey. This study overcomes the limitations of retrospective studies by collecting primary patient data and examining physician decision-making at the time of admission rather than relying on ICD-9 codes and disease severity scores, which give little insight into the acuity of the patient's illness at the time of admission.<sup>52</sup>

## LIMITATIONS

Our results should be interpreted with caution given that this was a single site study, and admitting practices may vary between hospitals depending on patient population, available resources, and care coordination interventions. The generalizability of our results is further limited by the relatively short study period and the risk of a potentially biased sample, which we cannot assess given the limited information collected on patients outside our sample. In addition, for convenience, we did not include admissions between 11 p.m. and 7 a.m., which may be more or less likely to be influenced by non-medical factors. That said, the purpose of our study was not to identify the exact proportion of admissions influenced by non-medical factors, but rather to characterize a subset of hospitalizations influenced by these factors to see whether they differ in potentially modifiable patient- or system-level features. We do not mean to imply that the proportions and individual factors included in our results are necessarily generalizable to other sites or time periods.

The non-medical factors included on the physician survey were based on limited qualitative data. No new factors emerged during the final interviews used to generate the survey. However, only 71 % of moderately/weakly acuity-driven admissions were influenced by an identified non-medical factor, which suggests that other contributing factors may not have been captured by our survey. We did not describe the variance among physicians' responses given the relatively large number of physicians and factors. While we attempted to use validated measures for the patient survey, in many cases we only selected individual questions from a validated scale in order to limit the survey time for patients. Finally, there is the potential for type II error when comparing the admissions stratified by acuity.

## CONCLUSIONS

In summary, our study demonstrates that many factors other than clinical acuity may influence admission decisions. Approximately half of our sample of admissions from the ED were influenced by non-medical factors and as many as 7 % may have been primarily non-medical. These admissions may be a feasible target for alternative care pathways. Further studies are warranted to determine whether targeting modifiable non-medical factors would affect disposition decision-making in the ED.

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**Conflict of Interest:** The authors declare that they do not have a conflict of interest.

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