

# **Predictive factors for hospitalization of nonurgent patients in the emergency department**

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## Abstract

Nonurgent emergency department (ED) patients are a controversial issue in the era of ED overcrowding. However, a substantial number of post-ED hospitalizations were found, which prompted for investigation and strategy management. The objective of this study is to identify risk factors for predicting the subsequent hospitalization of nonurgent emergency patients. This was a retrospective study of a database of adult nontrauma ED visits in a medical center for a period of 12 months from January 2013 to December 2013. Patient triages as either Taiwan Triage and Acuity Scale (TTAS) level 4 or 5 were considered "nonurgent." Basic demographic data, primary and secondary diagnoses, clinical parameters including blood pressure, heart rate, body temperature, and chief complaint category in TTAS were analyzed to determine if correlation exists between potential predictors and hospitalization in nonurgent patients.

A total of 16,499 nonurgent patients were included for study. The overall hospitalization rate was 12.47 % (2058/16,499). In the multiple logistic regression model, patients with characteristics of males (odds ratio, OR = 1.37), age more than 65 years old (OR = 1.56), arrival by ambulance (OR = 2.40), heart rate more than 100/min (OR = 1.47), fever (OR = 2.73), and presented with skin swelling/redness (OR = 4.64) were predictors for hospitalization. The area under receiver-operator calibration curve (AUROC) for the prediction model was 0.70. Nonurgent patients might still be admitted for further care especially in male, the elderly, with more secondary diagnoses, abnormal vital signs, and presented with dermatologic complaints. Using the TTAS acuity level to identify patients for diversion away from the ED is unsafe and will lead to inappropriate refusal of care for many patients requiring hospital treatment.

Abbreviations: CTAS = Canadian Triage and Acuity Scale, ED = emergency department, TTAS = Taiwan Triage and Acuity Scale.

Keywords: emergency department, nonurgent, Taiwan Triage and Acuity Scale, triage, vital sign

#### Editor: Ashham Mansur.

C-JN and P-JL contributed equally to this article.

Funding/Support: This study was supported by a grant from the Taiwan Ministry of Health and Welfare (DOH-TD-M113-100004) and Ministry of Science and Technology, Taiwan (contract number MOST 103-2314-B-182A-019, NSC-101-2410-H-182-015, NSC-102-2410-H-182-010-MY2, NSC-103-2410-H-161-001 and NSC-104-2410-H-182-028-MY2) and the Healthy Aging Research Center of Chang Gung University (fund number EMRPD1B0351, EMRPD1C0301, EMRPD1D911, EMRPD1E1691, and EMRPD1F0301).

The authors report no conflicts of interest.

Supplemental Digital Content is available for this article.

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Medicine (2016) 95:26(e4053)

Received: 23 December 2015 / Received in final form: 12 May 2016 / Accepted: 2 June 2016

http://dx.doi.org/10.1097/MD.000000000004053

# 1. Introduction

Nonurgent visits are defined as patients with problems that are not likely life-threatening nor required immediate attention and the care can be safely delayed.<sup>[1,2]</sup> In this era of emergency department (ED) overcrowding, the management of nonurgent visits to the ED are a controversial issue in the literatures.<sup>[1–5]</sup> Taiwan has implemented a new 5 acuity triage system, Taiwan Triage and Acuity Scale (TTAS), in 2010. TTAS was modified from Canadian Triage and Acuity Scale (CTAS) and was shown to be a reliable system.<sup>[6,7]</sup> Patients with TTAS levels 1–3 need resuscitation, emergent, or urgent care requiring timely physician evaluation, whereas patients with TTAS levels 4 and 5 are with less urgent or nonurgent conditions for whom physician assessment can more safely be delayed. In our previous study, we found patients with TTAS levels 4 and 5 comprised about 30% of all ED patients.<sup>[6,7]</sup>

Nonurgent ED patients have negatively impacted on crowding, and unnecessary costs, whereas some authors have advocated diverting nonurgent patients away from to ED to help reduce delays and improve access for sicker patients.<sup>[8–13]</sup> In the absence of valid measures, most administrators still believe that less or nonurgent problems should be treated in alternate health care settings, such as outpatient clinics or family physician offices rather than overburdened EDs.<sup>[14–16]</sup> Indiscriminately redirecting patients, identified as nonurgent, to alternative care facilities is highly debated as it generates ethical and patient safety issues.<sup>[5,9,12,17]</sup> Previous studies have examined whether nonurgent ED patients can be safely deferred to alternate health care settings, and have identified unintended consequences of adverse outcomes in patients with unrecognized high risk conditions.<sup>[16,18–19]</sup>

A recent Canadian study identified a significant number of CTAS level 4 and 5 hospital admissions and concluded that using CTAS acuity as the lone criterion to redirect patients away from the ED is unsafe.<sup>[18]</sup> In our previous study, we also found that 10.1% of the low urgency (TTAS level 4 and 5) patients were admitted.<sup>[7]</sup> Recently Lin et al had showed that age more than 65 and arrival by ambulance may be predictors of admission in nonurgent patients in three Canadian EDs; however, factors associated with admission in nonurgent patients remained to be a multifactorial issue.<sup>[20]</sup> This study is to identify risk factors more comprehensively for predicting the subsequent hospitalization of nonurgent emergency patients.

## 2. Methods

This study is a retrospective database patient cohort analysis using the adult nontrauma ED visits in a medical center located in northern Taiwan during January 1-December 31, 2013. All ED patients triaged as TTAS level 4 or 5 were considered nonurgent and included in the study. To have a more comprehensive approach, this study has collected all variables available from the information system and electronic medical chart. The study variables include: age, sex, TTAS, chief complaint, triage level, vital signs taken at triage (including BP, heart rate, respiratory rate, and body temperature), primary diagnosis, and secondary diagnosis recorded by emergency physician at ED database using International Classification of Diseases (9th revision) Clinical Modification (ICD-9-CM) coding system at ED and final disposition. Variables of vital signs were further categorized as high/medium/low systolic blood pressure (SBP > 180 mmHg/  $111-180 \text{ mmHg} \le 110 \text{ mmHg}$ , <sup>[21]</sup> tachycardia (HR > 100 times/min), fever (BT  $\geq$  38C), and tachypnea (RR > 20 breaths/ min). The respiratory rates in our nonurgent population were all less than 20 breaths/min, and the O2 saturation were all above 94%, so the tachypnea category was excluded from the analysis. This study was approved by institutional ethics review board (#102–3459B) with a waiver of patient consent proviso.

Data are presented as mean  $\pm$  standard deviation (SD) for numerical variables and as frequency (%) for categorical variables. The two sample *t* test was used to compare the difference of numerical variables between the two study groups, whereas the  $\chi^2$  test was employed to compare categorical variables between groups. Univariate analysis was performed to screen the variables before multiple regression analysis. Multivariable logistic regression analysis was applied to determine factors associated with hospitalization. The significant factors associated with hospitalization were scored and summed up by multiplying their nearest integer of odds ratio (OR) with the original values. The performance of these factors to predict hospitalization was then calculated by the area under receiveroperator calibration curve (AUROC).

## 3. Results

A total of 16,499 nonurgent patients (Levels 4 and 5) were extracted from 79,455 adult ED nontrauma patients in an ED during January 01–December 31, 2013. The overall hospitalization rate of the nonurgent patients was 12.47 % (2058/16,499). All study variables were found to have a statistically significant association with hospitalization. Among the basic demographics

and presentation factors, the hospitalization rate of males (14.38%) and elderly (17.88%) were significantly higher than the other groups. Nonurgent patients who arrived at ED by ambulance (24.62%) also had a higher hospitalization rate. Reviewing the vital signs, those patients with higher heart rates, lower SBP, and fever were more likely to be admitted. Patients with skin swelling/redness (31.74%) or surgical complications (23.27%) had higher hospitalization rates. The top 10 reasons of adult nonurgent ED patients admitted to the hospital are listed in Table 1. These conditions accounted for over 80% of all admissions in our population. Disease of skin and subcutaneous tissue (27.39%) was the most common condition admitted followed by disease of circulatory system (24.92%); infectious and parasitic diseases (19.25%); disease of genitourinary system (13.05%); endocrine, nutritional and metabolic diseases (10.89%); disease of digestive system(9.90%); disease of musculoskeletal system and connective tissue(9.85%); poisoning and complications of surgical and medical care(8.18%); disease of respiratory systems(7.55%); and symptoms, signs, and illdefined conditions(6.34%). Patients with more number of secondary diagnoses had a higher likelihood of hospitalization (Table 1).

The top 10 secondary diagnoses of admitted nonurgent patients are listed in appendix A, http://links.lww.com/MD/B77. The most frequently seen secondary diagnosis was endocrine, nutritional and metabolic diseases (12.22%) followed by disease of genitourinary system (10.19%), disease of circulatory system (10.10%), disease of digestive system (9.96%), neoplasms (6.04%), disease of musculoskeletal system and connective tissue (4.33%), disease of respiratory system (0.99%), mental disorders (1.26%), disease of nervous system (0.99%), and disease of blood and blood-forming organs (0.99%).

In the multiple logistic regression model, patients with characteristics of males (OR=1.37; 95% confidence interval [CI]=1.24–1.51), age more than 65 years (OR=1.56; 95% CI=1.39–1.74), arriving between 08:00 and 16:00 (OR=1.53; 95% CI=1.32–1.77), arriving by ambulance (OR=2.40; 95% CI=1.78–3.23), heart rate more than 100/min (OR=1.47; 95% CI=1.31–1.65), fever (OR=2.73; 95% CI=2.06–3.60), more number of secondary diagnosis (OR=1.47; 95% CI=1.41–1.54), and presenting chief complaint as skin swelling/redness (OR=4.64; 95% CI=3.45–6.24) or surgical complications (OR=3.05; 95% CI=2.06–4.53) were associated with higher likelihood of hospitalization (Table 2). The AUROC of predictive hospitalization, which calculated by combining factors in multiple logistic regression model into a scoring index was found to be 0.70 (Fig. 1).

## 4. Discussion

This study has identified that a significant number of nonurgent ED patients (Levels 4 and 5) in a five-level acuity triage system, TTAS, are still being admitted to hospital. The results are consistent with several previous studies providing further evidence that diverting non-urgent patients away from the ED may lead to denial or delay of appropriate care.<sup>[11,13,16,18]</sup>

It is important to emphasize that TTAS, similar to CTAS was developed to support triage nurses prioritize emergency patients based on presenting acuity or risk.<sup>[22]</sup> Both triage system effectively discriminates high, intermediate, and low acuity patients, and ensure the most needed patients to receive prompt treatments.<sup>[7,22]</sup> The high discriminant ability of these triage systems also allowed for better streaming of patients, optimizing

# Table 1

### The comparison of study variables between hospitalized and nonhospitalized non-urgent ED patients.

| No         Yes         Total           Mean/N SD/%         Mean/N SD/%         Mean/N SD/%         Mean/N SD/%         P           Besic demographics and presentation         Grindr         5.005 (99.37)         99.3 (10.63)         8.398 (60.60)         All controls         <   |  | Hospita  | alization                             | Total                    | Р           |  |      |               |               |               |  |
|--|--|--|---------------------------------------|--------------------------|-------------|--|------|---------------|---------------|---------------|--|
| Mean/N 50%         Mean/N 50%         Mean/N 50%         Mean/N 50%         P           Basic demographics and presentation<br>Gender         7,505 (99.37)         993 (10.53)         8,306 (50.90)          <0.0001           Male         7,505 (99.37)         993 (10.53)         8,101 (194.910)          <0.0001           Age, y         47.52±18.73         54.41±18.28         8,101 (194.910)         <0.0001           <65         11.550 (190.01)         1.422 (10.99)         12,942 (78.44)         <0.0001           <65         2.921 (19.21)         636 (17.88)         3,557 (21.69)         <0.0001           0.000-06.00         6876 (61.52)         1154 (14.37)         900 (46.67)         <0.0001           16:00-00.00         6876 (61.52)         1154 (14.37)         900 (46.67)         <0.0001           Vist         1993 (12.28)         16.235 (86.40)         <0.0001          <0.0001           Vist         1997 (75.30)         65 (24.62)         264 (1.60)          <0.0001           Yes         1997 (75.30)         153 (11.46)         13.55 (19.06)          <0.0001           Yes         2.100 mms/min         2.125 (78.83)         14.121 (7)         13.84 (86.90)   |  | No   | Yes                                   |                          |             |  |      |               |               |               |  |
| Basic denographics and presentation         <.0.0001           Gender         7.555 (89.37)         B93 (10.43)         8.398 (50.40)         <.0.0001           Make         0.3980 (85.62)         1.656 (14.33)         8.1394 (51.43)         <.0.0001           Aper, y         47.52±18.73         54.41±18.28         43.38±18.81         <.0.0001           -c65         11.520 (89.01)         1.422 (10.99)         12.942 (78.44)         <.0.0001           265         2.921 (82.12)         G38 (17.88)         3.057 (21.66)         <.0.0001           0.002-06.00         2768 (91.32)         263 (8.68)         3.092 (18.36)         <.0.0001           0.002-06.00         2768 (91.52)         164 (4.77)         8.003 (46.67)         <.0.0001           0.002-06.00         4799 (82.22)         041 (11.78)         5440 (52.87)         <.0.0001           New shuburoe         199 (75.3)         163 (14.60)         <.0.0001         <.0.0001           View         199 (75.3)         163 (11.46)         1.3.64 (80.94)         <.0.0001           SPF group         2.010 (mex/min         1.316 (85.80)         199 (13.14)         1.515 (18.0)         <.0.0001           SPF group         2.010 (mex/min         2.016 (83.29)         7.767.63         3.145 (19.46)<  |  | Mean/N SD/%  | Mean/N SD/%                           | Mean/N SD/%              |             |  |      |               |               |               |  |
| Gender  <  | Basic demographics and presentation                                  |  |                                       |                          |             |  |      |               |               |               |  |
| $ \begin{array}{c c c c c c c c c c c c c c c c c c c $  | Gender   |  |                                       |                          | < 0.0001    |  |      |               |               |               |  |
|  | Female   | 7.505 (89.37)                                      | 893 (10.63)                           | 8.398 (50.90)            |             |  |      |               |               |               |  |
| Age yr $47.32\pm18.73$ $54.41\pm18.26$ $48.33\pm18.87$ < <th>&lt;<th>&lt;<th>&lt;<th>&lt;<th>&lt;<th></th></th></th></th></th></th>  | < <th>&lt;<th>&lt;<th>&lt;<th>&lt;<th></th></th></th></th></th>      | < <th>&lt;<th>&lt;<th>&lt;<th></th></th></th></th> | < <th>&lt;<th>&lt;<th></th></th></th> | < <th>&lt;<th></th></th> | < <th></th> |  | Male | 6.936 (85.62) | 1.165 (14.38) | 8.101 (49.10) |  |
| $ \begin{array}{c} \mbox{Age group, y} & \mbox{Close} & $               | Aae. v   | 47.52+18.73  | 54.41 + 18.28                         | 48.38 + 18.81            | < 0.0001    |  |      |               |               |               |  |
| ≥65         11,520 (80.01)         1.422 (10.94)         12,942 (78.44)           ≥65         2,921 (82.12)         636 (17.88)         3,557 (21.56)           00:00-06:00         2766 (91.32)         263 (8.68)         3092 (18.36)           00:00-06:00         6875 (86.63)         1154 (14.37)         8000 (44.67)           16:00-00:00         4799 (88.22)         641 (17.8)         5440 (22.97)           Anrial by ambulance          <0.0001  | Aae aroup, v   |  |                                       |                          | < 0.0001    |  |      |               |               |               |  |
| $\begin{array}{c} \geq 6 \\ \text{Time of tagy} & (2.921\ (22.12)\ (23.12\ (23.12\ (33.557\ (21.56)\ (20.0001\ (20.$ | <65  | 11.520 (89.01)                                     | 1.422 (10.99)                         | 12.942 (78.44)           |             |  |      |               |               |               |  |
| Time of day         Each (Each)         Each (Each)         Each (Each)         Each (Each)         Each (Each)         Counting (Each)         Countis (Each)         Co  | >65  | 2.921 (82.12)                                      | 636 (17.88)                           | 3.557 (21.56)            |             |  |      |               |               |               |  |
| 0000-6300         2766 (91.32)         228 (86.8)         9002 (18.30)           08:00-16:00         6876 (85.63)         1154 (14.37)         8030 (18.67)           16:00-00:00         4799 (86.22)         641 (11.78)         8030 (18.67)           No         14.242 (87.72)         1993 (12.28)         16.255 (98.40)           Yes         199 (75.38)         65 (24.62)         264 (16.0)           Wind signs   | Time of day  | )- (- )  |                                       |                          | < 0.0001    |  |      |               |               |               |  |
| BB00-16:00         6876 (65.62)         1154 (14.37)         B030 (48.67)           16:00-00:00         4799 (88.22)         641 (11.78)         5440 (52.97)           No         14.242 (87.72)         1993 (12.28)         16.235 (98.40)           Yes         199 (75.38)         65 (24.62)         264 (1.60)           Heat rate group           <0.0001  | 00:00-08:00  | 2766 (91.32)                                       | 263 (8.68)                            | 3092 (18.36)             |             |  |      |               |               |               |  |
| 16:00-00:00         4799 (88.22)         641 (11.76)         5440 (32.97)           Arrival by ambulance   <0.0001   | 08:00-16:00  | 6876 (85.63)                                       | 1154 (14.37)                          | 8030 (48.67)             |             |  |      |               |               |               |  |
| Arwal by ambulance   <         <         <         <         <         <         <         <         <         <         <         <         <         <         <         <   | 16:00-00:00  | 4799 (88.22)                                       | 641 (11.78)                           | 5440 (32.97)             |             |  |      |               |               |               |  |
| No         14.242 (87.72)         1993 (12.28)         16.235 (98.40)           Yes         199 (75.38)         65 (24.62)         264 (1.60)           Vila signs         -         -         -           Heat rate group         -         -         -           S100 times/min         2.618 (83.24)         527 (16.76)         3.145 (19.06)         0.0060           S8P group         -         0.0060         -         0.0060           S110 times/min         1.316 (86.86)         199 (13.14)         1.515 (9.18)         0.0060           S110 times/min         1.247 (78.73)         1.684 (12.17)         13.841 (83.69)         -         -           S100 times/min         12.176 (87.83)         1.684 (12.17)         13.841 (83.69)         -         -         -         0.00060           S100 times/min         14.194 (87.66)         1991 (12.14)         1.515 (9.792)         -         -         -         -         -         -         0.0001           No         14.194 (87.66)         1.961 (12.14)         1.143 (6.93)         -         -         -         -         -         -         -         -         -         -         -         -         -         -         -         <  | Arrival by ambulance   |  |                                       |                          | < 0.0001    |  |      |               |               |               |  |
| Yes         199 (75.38)         65 (24.62)         264 (1.60)           Vital signs  | No   | 14.242 (87.72)                                     | 1993 (12.28)                          | 16.235 (98.40)           |             |  |      |               |               |               |  |
| Vial signs   | Yes  | 199 (75.38)  | 65 (24.62)                            | 264 (1.60)               |             |  |      |               |               |               |  |
| Heat rate group         <0.0001 $\leq 100$ times/min         11,823 (88.54)         1,531 (11.46)         13,354 (80.94)           >100 times/min         2.618 (83.24)         527 (16.76)         3,145 (19.06)           SBP group         0.0060         \$110 mHg         1,316 (96.86)         199 (13.14)         1,515 (9.18)           >111-1E00 mHg         12,157 (87.83)         1,684 (12.17)         13,841 (83.89)         >           >180 mHg         968 (84.69)         175 (15.31)         1,143 (6.33)            Fewr (>28°C)         247 (71.80)         97 (28.20)         344 (2.08)         <0.0001  | Vital signs  | 100 (10100)  | 00 (2 1102)                           | 201 (1100)               |             |  |      |               |               |               |  |
| ≤100 times/min         11,823 (88.54)         1,531 (11.46)         13,354 (80.94)           >100 times/min         2,618 (83.24)         527 (16.76)         3,145 (19.06)           SBP group         0.0060           ≤110 mmHg         1,316 (86.86)         199 (13.14)         1,515 (9.18)           111-180 mmHg         12,157 (87.83)         1,684 (12.17)         13,484 (83.89)           >180 mmHg         968 (84.69)         175 (15.31)         1,143 (6.33)           Fewer (≥38°C)           <0.0001  | Heart rate group   |  |                                       |                          | < 0.0001    |  |      |               |               |               |  |
| >100 times/min         2,618 (83.24)         527 (16.76)         3,145 (19.06)           SBP group         0.0060           ≤110 mmHg         1,316 (66.86)         199 (13.14)         1,515 (9.18)           111-180 mmHg         12,157 (87.83)         1,684 (12.17)         13,841 (83.89)           >180 mmHg         968 (64.69)         175 (15.31)         1,143 (6.93)           Fewr (2387C)           <0.0001  | <100 times/min   | 11 823 (88 54)                                     | 1 531 (11 46)                         | 13 354 (80 94)           | (010001     |  |      |               |               |               |  |
| SBP group       110 mmHg       1,316 (86.86)       199 (13.14)       1,515 (9.18)         111 -180 mmHg       12,157 (87.83)       1,684 (12.17)       13,844 (83.89)         > 180 mmHg       287.67        <0.0001   | >100 times/min   | 2,618 (83,24)                                      | 527 (16.76)                           | 3,145 (19,06)            |             |  |      |               |               |               |  |
| $\begin{array}{c c c c c c c c c c c c c c c c c c c $   | SBP group  | 2,010 (00121)                                      | 027 (1011 0)                          | 0,110 (10100)            | 0 0060      |  |      |               |               |               |  |
| 110-180 milds       12,157 (80.7.83)       1,684 (12.17)       13,841 (83.89)         >110-180 milds       968 (84.69)       175 (15.31)       1,143 (633)         Fever (≥38°C)             No       14,194 (87.86)       1,961 (12.14)       16,155 (97.92)       <0.0001  | <110 mmHa  | 1,316 (86,86)                                      | 199 (13 14)                           | 1 515 (9 18)             | 0.0000      |  |      |               |               |               |  |
| $\begin{array}{c c c c c c c c c c c c c c c c c c c $   | 111–180 mmHa   | 12 157 (87 83)                                     | 1 684 (12 17)                         | 13 841 (83 89)           |             |  |      |               |               |               |  |
| Form (19)         Cost (11.6)         (11.6 (10.6))  | >180  mmHa   | 968 (84 69)  | 175 (15.31)                           | 1 143 (6 93)             |             |  |      |               |               |               |  |
| No         14,194 (87.86)         1,961 (12.14)         16,155 (97.92)           Yes         247 (71.80)         97 (28.20)         344 (2.08)           Chief complaint              Skin swelling/redness         871 (68.26)         405 (31.74)         1,276 (7.73)           Surgical complications         211 (76.73)         64 (23.27)         275 (1.67)           Fever/chills         324 (83.51)         64 (16.49)         388 (2.35)           Lower extremity pain         938 (66.06)         152 (13.94)         1,090 (6.61)           Abdominal pain         610 (86.89)         92 (13.11)         702 (4.25)           Joint swelling         213 (88.38)         28 (11.62)         241 (1.46)           Noncardiac chest pain         858 (88.64)         110 (11.36)         968 (5.87)           Dizziness         150 (89.29)         18 (10.71)         168 (1.02)           Nausea/vomiting         645 (89.34)         77 (10.66)         722 (4.38)           Hematuria         506 (89.98)         63 (10.11)         623 (3.78)           Others         9,061 (90.20)         985 (9.80)         104 (42.92)         658 (3.99)           Infectious and parasitic diseases (200-79)         1246 (72.61)         470 (27.39)   | Ever $(>38^{\circ}C)$  |  |                                       | 1,110 (0100)             | < 0.0001    |  |      |               |               |               |  |
| Yes       247 (71.80)       190 (28.20)       344 (2.08)         Chief complaint        <0.0001  | No   | 14 194 (87 86)                                     | 1 961 (12 14)                         | 16 155 (97 92)           | (010001     |  |      |               |               |               |  |
| Chief complaint         CIT (1180)         CIT (2180)         CI  | Yes  | 247 (71.80)  | 97 (28.20)                            | 344 (2.08)               |             |  |      |               |               |               |  |
| Skin swelling/redness         871 (68.26)         405 (31.74)         1,276 (7.73)           Surgical complications         211 (76.73)         64 (23.27)         275 (1.67)           Fever/chills         324 (83.51)         64 (16.49)         388 (2.35)           Lower extremity pain         938 (86.06)         152 (13.94)         1,090 (6.61)           Abdominal pain         610 (86.89)         92 (13.11)         702 (4.25)           Joint swelling         213 (88.38)         28 (11.62)         241 (1.46)           Noncardiac chest pain         858 (88.64)         110 (11.36)         968 (5.87)           Dizziness         150 (89.29)         18 (10.71)         168 (1.02)           Nausea/vorniting         645 (89.34)         77 (10.66)         722 (4.38)           Hematuria         560 (89.89)         63 (10.11)         623 (3.78)           Others         9,061 (90.20)         985 (9.80)         10,046 (60.89)           Primary diagnosis  | Chief complaint  | 2.17 (1.1665)                                      | 01 (20120)                            | 011 (2100)               | < 0.0001    |  |      |               |               |               |  |
| Surgical complications       211 (76.73)       64 (23.27)       275 (1.67)         Fever/chills       324 (83.51)       64 (23.27)       275 (1.67)         Lower extremity pain       938 (86.06)       152 (13.94)       1,090 (6.61)         Abdominal pain       610 (86.89)       92 (13.11)       702 (4.25)         Joint swelling       213 (83.36)       28 (11.62)       241 (1.46)         Noncardiac chest pain       858 (88.64)       110 (11.36)       968 (5.87)         Diziness       150 (89.29)       18 (10.71)       168 (1.02)         Nausea/vomiting       645 (89.34)       77 (10.66)       722 (4.38)         Hematuria       560 (89.89)       63 (10.11)       623 (3.78)         Others       9,061 (90.20)       985 (9.80)       10,046 (60.89)         Primary diagnosis             Diseases of skin and subcutaneous tissue (680–709)       1246 (72.61)       470 (27.39)       1716 (10.40)         Diseases of circulatory system (390–459)       124 (80.75)       51 (19.25)       265 (1.61)         Diseases of genitourinary system (580–629)       1785 (86.95)       268 (13.05)       2033 (12.44)         Endocrine, nutritional and metabolic diseases (240–279)       311 (89.11)       38 (10.89)       34  | Skin swelling/redness  | 871 (68.26)  | 405 (31.74)                           | 1,276 (7,73)             | <0.0001     |  |      |               |               |               |  |
| big/dd Grife       11       (16.4)       324 (83.51)       64 (16.49)       388 (2.35)         Lower extremity pain       938 (86.06)       152 (13.94)       1,090 (6.61)         Abdominal pain       610 (86.89)       92 (13.11)       702 (4.25)         Joint swelling       213 (88.38)       28 (11.62)       241 (1.46)         Noncardiac chest pain       858 (88.64)       110 (11.36)       968 (5.87)         Dizziness       150 (89.29)       18 (10.71)       168 (1.02)         Nausea/vomiting       645 (89.34)       77 (10.66)       722 (4.38)         Hematuria       560 (89.89)       63 (10.11)       623 (3.78)         Others       9,061 (90.20)       985 (9.80)       10,046 (60.89)         Primary diagnosis   | Surgical complications   | 211 (76 73)  | 64 (23 27)                            | 275 (1.67)               |             |  |      |               |               |               |  |
| Lower extremity pain938 (86.06)152 (13.94)1.090 (6.61)Abdominal pain610 (86.89)92 (13.11)702 (4.25)Joint swelling213 (88.38)28 (11.62)241 (1.46)Noncardiac chest pain858 (88.64)110 (11.36)968 (5.87)Dizziness150 (89.29)18 (10.71)168 (1.02)Nausea/vomiting645 (89.34)77 (10.66)722 (4.38)Hematuria560 (89.89)63 (10.11)623 (3.78)Others9,061 (90.20)985 (9.80)10,046 (60.89)Primary diagnosis $\sim$ $\sim$ $\sim$ Diseases of circulatory system (390–459)1246 (72.61)470 (27.39)1716 (10.40)Diseases of circulatory system (390–459)1246 (75.08)164 (24.92)658 (3.99)Infectious and parasitic diseases (001–139)214 (80.75)51 (19.25)265 (1.61)Diseases of genitourinary system (580–629)1785 (86.95)268 (13.05)2053 (12.44)Endocrine, nutritional and metabolic diseases (240–279)311 (89.11)38 (10.89)349 (2.12)Diseases of genitourinary system (520–579)2138 (90.10)235 (9.90)2373 (14.38)Diseases of respiratory system (460–519)1285 (92.45)105 (7.55)1390 (8.42)Poisoning and complications of surgical and medical care (960–999)1178 (91.82)105 (6.34)2367 (14.35)Diseases of respiratory system (460–519)1285 (92.45)105 (7.55)1390 (8.42)Symptoms, signs, and ill-defined conditions (780–799)2217 (93.66)150 (6.34)2367 (14.35)<   | Fever/chills   | 324 (83.51)  | 64 (16.49)                            | 388 (2.35)               |             |  |      |               |               |               |  |
| Abdominal pain       610 (86.8)       92 (13.11)       702 (4.25)         Joint swelling       213 (88.38)       28 (11.62)       241 (1.46)         Noncardiac chest pain       858 (88.64)       110 (11.36)       968 (5.87)         Dizziness       150 (89.29)       18 (10.71)       168 (1.02)         Nausea/vomiting       645 (89.34)       77 (10.66)       722 (4.38)         Hematuria       560 (89.89)       63 (10.11)       623 (3.78)         Others       9,061 (90.20)       985 (9.80)       10,046 (60.89)         Primary diagnosis   | Lower extremity pain   | 938 (86.06)  | 152 (13.94)                           | 1.090 (6.61)             |             |  |      |               |               |               |  |
| Joint swelling       213 (88.38)       28 (11.62)       241 (1.46)         Joint swelling       213 (88.38)       28 (11.62)       241 (1.46)         Noncardiac chest pain       858 (88.64)       110 (11.36)       968 (5.87)         Dizziness       150 (89.29)       18 (10.71)       168 (1.02)         Nausea/vomiting       645 (89.34)       77 (10.66)       722 (4.38)         Hematuria       560 (89.89)       63 (10.11)       623 (3.78)         Others       9,061 (90.20)       985 (9.80)       10.046 (60.89)         Primary diagnosis  | Abdominal pain   | 610 (86 89)  | 92 (13 11)                            | 702 (4 25)               |             |  |      |               |               |               |  |
| Noncardiac chest pain       858 (88.64)       110 (11.36)       968 (5.87)         Dizziness       150 (89.29)       18 (10.71)       168 (1.02)         Nausea/vomiting       645 (89.34)       77 (10.66)       722 (4.38)         Hematuria       560 (89.89)       63 (10.11)       623 (3.78)         Others       9,061 (90.20)       985 (9.80)       10,046 (60.89)         Primary diagnosis  | Joint swelling   | 213 (88.38)  | 28 (11.62)                            | 241 (1.46)               |             |  |      |               |               |               |  |
| Initial bill billInitial bill billInitial bill billInitial bill billDizziness150 (89.29)18 (10.71)168 (1.02)Nausea/vomiting645 (89.34)77 (10.66)722 (4.38)Hematuria560 (89.89)63 (10.11)623 (3.78)Others9,061 (90.20)985 (9.80)10,046 (60.89)Primary diagnosis $\sim$ $\sim$ $\sim$ Diseases of skin and subcutaneous tissue (680–709)1246 (72.61)470 (27.39)1716 (10.40)Diseases of circulatory system (390–459)494 (75.08)164 (24.92)658 (3.99)Infectious and parasitic diseases (001–139)214 (80.75)51 (19.25)265 (1.61)Diseases of genitourinary system (580–629)1785 (86.95)268 (13.05)2053 (12.44)Endocrine, nutritional and metabolic diseases (240–279)311 (89.11)38 (10.89)349 (2.12)Diseases of digestive system (520–579)2138 (90.10)235 (9.90)2373 (14.38)Diseases of musculoskeletal system and connective tissue (710–739)1282 (90.15)140 (9.85)1422 (8.62)Poisoning and complications of surgical and medical care (960–999)1178 (91.82)105 (8.18)1283 (7.78)Diseases of respiratory system (460–519)1285 (92.45)105 (7.55)1390 (8.42)Symptoms, signs, and ill-defined conditions (780–799)2217 (93.66)150 (6.34)2367 (14.35)Others*2291 (87.34)332 (12.66)2623 (15.90)Number of secondary diagnosis0.61+0.901.08+1.260.67+0.97<.0001   | Noncardiac chest pain  | 858 (88 64)  | 110 (11.36)                           | 968 (5.87)               |             |  |      |               |               |               |  |
| Nausea/vomiting645 (89.34)77 (10.66)722 (4.38)Hematuria560 (89.89)63 (10.11)623 (3.78)Others9,061 (90.20)985 (9.80)10,046 (60.89)Primary diagnosisDiseases of skin and subcutaneous tissue (680–709)1246 (72.61)470 (27.39)1716 (10.40)Diseases of circulatory system (390–459)494 (75.08)164 (24.92)658 (3.99)Infectious and parasitic diseases (001–139)214 (80.75)51 (19.25)265 (1.61)Diseases of genitourinary system (580–629)1785 (86.95)268 (13.05)2053 (12.44)Endocrine, nutritional and metabolic diseases (240–279)311 (89.11)38 (10.89)349 (2.12)Diseases of digestive system (520–579)2138 (90.10)235 (9.90)2373 (14.38)Diseases of nusculoskeletal system and connective tissue (710–739)1282 (90.15)140 (9.85)1422 (8.62)Poisoning and complications of surgical and medical care (960–999)1178 (91.82)105 (8.18)1283 (7.78)Diseases of respiratory system (460–519)2217 (93.66)150 (6.34)2367 (14.35)Symptoms, signs, and ill-defined conditions (780–799)2217 (93.66)150 (6.34)2367 (14.35)Others*2291 (87.34)332 (12.66)2623 (15.90)Number of secondary diagnosis0.61 + 0.901.08 + 1.260.67 + 0.97<0001   | Dizziness  | 150 (89.29)  | 18 (10.71)                            | 168 (1.02)               |             |  |      |               |               |               |  |
| Haddot straining       500 (89.8)       63 (10.11)       623 (3.78)         Hematuria       560 (89.89)       63 (10.11)       623 (3.78)         Others       9,061 (90.20)       985 (9.80)       10,046 (60.89)         Primary diagnosis   | Nausea/vomiting  | 645 (89.34)  | 77 (10.66)                            | 722 (4.38)               |             |  |      |               |               |               |  |
| Others       9,061 (90.20)       985 (9.80)       10,046 (60.89)         Primary diagnosis             Diseases of skin and subcutaneous tissue (680–709)       1246 (72.61)       470 (27.39)       1716 (10.40)         Diseases of circulatory system (390–459)       494 (75.08)       164 (24.92)       658 (3.99)         Infectious and parasitic diseases (001–139)       214 (80.75)       51 (19.25)       265 (1.61)         Diseases of genitourinary system (580–629)       1785 (86.95)       268 (13.05)       2053 (12.44)         Endocrine, nutritional and metabolic diseases (240–279)       311 (89.11)       38 (10.89)       349 (2.12)         Diseases of digestive system (520–579)       2138 (90.10)       235 (9.90)       2373 (14.38)         Diseases of musculoskeletal system and connective tissue (710–739)       1282 (90.15)       140 (9.85)       1422 (8.62)         Poisoning and complications of surgical and medical care (960–999)       1178 (91.82)       105 (8.18)       1283 (7.78)         Diseases of respiratory system (460–519)       1285 (92.45)       105 (7.55)       1390 (8.42)         Symptoms, signs, and ill-defined conditions (780–799)       2217 (93.66)       150 (6.34)       2367 (14.35)         Others*       2291 (87.34)       332 (12.66)       2623 (15.90) <td>Hematuria</td> <td>560 (89.89)</td> <td>63 (10.11)</td> <td>623 (3.78)</td> <td></td>   | Hematuria  | 560 (89.89)  | 63 (10.11)                            | 623 (3.78)               |             |  |      |               |               |               |  |
| Primary diagnosis <t< td=""><td>Others</td><td>9.061 (90.20)</td><td>985 (9.80)</td><td>10.046 (60.89)</td><td></td></t<>  | Others   | 9.061 (90.20)                                      | 985 (9.80)                            | 10.046 (60.89)           |             |  |      |               |               |               |  |
| Diseases of skin and subcutaneous tissue (680–709)       1246 (72.61)       470 (27.39)       1716 (10.40)         Diseases of circulatory system (390–459)       494 (75.08)       164 (24.92)       658 (3.99)         Infectious and parasitic diseases (001–139)       214 (80.75)       51 (19.25)       265 (1.61)         Diseases of genitourinary system (580–629)       1785 (86.95)       268 (13.05)       2053 (12.44)         Endocrine, nutritional and metabolic diseases (240–279)       311 (89.11)       38 (10.89)       349 (2.12)         Diseases of digestive system (520–579)       2138 (90.10)       235 (9.90)       2373 (14.38)         Diseases of musculoskeletal system and connective tissue (710–739)       1282 (90.15)       140 (9.85)       1422 (8.62)         Poisoning and complications of surgical and medical care (960–999)       1178 (91.82)       105 (8.18)       1283 (7.78)         Diseases of respiratory system (460–519)       1285 (92.45)       105 (7.55)       1390 (8.42)         Symptoms, signs, and ill-defined conditions (780–799)       2217 (93.66)       150 (6.34)       2367 (14.35)         Others*       2291 (87.34)       332 (12.66)       2623 (15.90)  | Primary diagnosis  | -,,  |                                       | ,,                       | < 0.0001    |  |      |               |               |               |  |
| Diseases of circulatory system (390-459)494 (75.08)164 (24.92)658 (3.99)Infectious and parasitic diseases (001-139)214 (80.75)51 (19.25)265 (1.61)Diseases of genitourinary system (580-629)1785 (86.95)268 (13.05)2053 (12.44)Endocrine, nutritional and metabolic diseases (240-279)311 (89.11)38 (10.89)349 (2.12)Diseases of digestive system (520-579)2138 (90.10)235 (9.90)2373 (14.38)Diseases of musculoskeletal system and connective tissue (710-739)1282 (90.15)140 (9.85)1422 (8.62)Poisoning and complications of surgical and medical care (960-999)1178 (91.82)105 (8.18)1283 (7.78)Diseases of respiratory system (460-519)1285 (92.45)105 (7.55)1390 (8.42)Symptoms, signs, and ill-defined conditions (780-799)2217 (93.66)150 (6.34)2367 (14.35)Others*2291 (87.34)332 (12.66)2623 (15.90)Number of secondary diagnosis0.61+0.901.08+1.260.67+0.97<.0001  | Diseases of skin and subcutaneous tissue (680–709)                   | 1246 (72.61)                                       | 470 (27.39)                           | 1716 (10.40)             | (010001     |  |      |               |               |               |  |
| Infectious and parasitic diseases (001–139)       101 (10.05)       101 (10.05)       101 (10.05)         Infectious and parasitic diseases (001–139)       214 (80.75)       51 (19.25)       265 (1.61)         Diseases of genitourinary system (580–629)       1785 (86.95)       268 (13.05)       2053 (12.44)         Endocrine, nutritional and metabolic diseases (240–279)       311 (89.11)       38 (10.89)       349 (2.12)         Diseases of digestive system (520–579)       2138 (90.10)       235 (9.90)       2373 (14.38)         Diseases of musculoskeletal system and connective tissue (710–739)       1282 (90.15)       140 (9.85)       1422 (8.62)         Poisoning and complications of surgical and medical care (960–999)       1178 (91.82)       105 (8.18)       1283 (7.78)         Diseases of respiratory system (460–519)       1285 (92.45)       105 (7.55)       1390 (8.42)         Symptoms, signs, and ill-defined conditions (780–799)       2217 (93.66)       150 (6.34)       2367 (14.35)         Others*       2291 (87.34)       332 (12.66)       2623 (15.90)          Number of secondary diagnosis       0.61+0.90       1.08+1.26       0.67+0.97       <.0001   | Diseases of circulatory system (390–459)                             | 494 (75.08)  | 164 (24.92)                           | 658 (3.99)               |             |  |      |               |               |               |  |
| Diseases of genitourinary system (580–629)       1785 (86.95)       268 (13.05)       2053 (12.44)         Endocrine, nutritional and metabolic diseases (240–279)       311 (89.11)       38 (10.89)       349 (2.12)         Diseases of digestive system (520–579)       2138 (90.10)       235 (9.90)       2373 (14.38)         Diseases of musculoskeletal system and connective tissue (710–739)       1282 (90.15)       140 (9.85)       1422 (8.62)         Poisoning and complications of surgical and medical care (960–999)       1178 (91.82)       105 (8.18)       1283 (7.78)         Diseases of respiratory system (460–519)       1285 (92.45)       105 (7.55)       1390 (8.42)         Symptoms, signs, and ill-defined conditions (780–799)       2217 (93.66)       150 (6.34)       2367 (14.35)         Others*       2291 (87.34)       332 (12.66)       2623 (15.90)       <.0001  | Infectious and parasitic diseases (001–139)                          | 214 (80.75)  | 51 (19.25)                            | 265 (1.61)               |             |  |      |               |               |               |  |
| Endocrine, nutritional and metabolic diseases (240–279)       311 (89.11)       38 (10.89)       349 (2.12)         Diseases of digestive system (520–579)       2138 (90.10)       235 (9.90)       2373 (14.38)         Diseases of musculoskeletal system and connective tissue (710–739)       1282 (90.15)       140 (9.85)       1422 (8.62)         Poisoning and complications of surgical and medical care (960–999)       1178 (91.82)       105 (8.18)       1283 (7.78)         Diseases of respiratory system (460–519)       1285 (92.45)       105 (7.55)       1390 (8.42)         Symptoms, signs, and ill-defined conditions (780–799)       2217 (93.66)       150 (6.34)       2367 (14.35)         Others*       2291 (87.34)       332 (12.66)       2623 (15.90)       <.0001   | Diseases of genitourinary system (580–629)                           | 1785 (86.95)                                       | 268 (13.05)                           | 2053 (12 44)             |             |  |      |               |               |               |  |
| Diseases of digestive system (520-579)       2138 (90.10)       235 (9.90)       2373 (14.38)         Diseases of digestive system and connective tissue (710-739)       1282 (90.15)       140 (9.85)       1422 (8.62)         Poisoning and complications of surgical and medical care (960-999)       1178 (91.82)       105 (8.18)       1283 (7.78)         Diseases of respiratory system (460-519)       1285 (92.45)       105 (7.55)       1390 (8.42)         Symptoms, signs, and ill-defined conditions (780-799)       2217 (93.66)       150 (6.34)       2367 (14.35)         Others*       2291 (87.34)       332 (12.66)       2623 (15.90)       <.0001   | Endocrine nutritional and metabolic diseases (240–279)               | 311 (89 11)  | 38 (10.89)                            | .349 (2.12)              |             |  |      |               |               |               |  |
| Diseases of nusculoskeletal system and connective tissue (710–739)       1282 (90.15)       140 (9.85)       1422 (8.62)         Poisoning and complications of surgical and medical care (960–999)       1178 (91.82)       105 (8.18)       1283 (7.78)         Diseases of respiratory system (460–519)       1285 (92.45)       105 (7.55)       1390 (8.42)         Symptoms, signs, and ill-defined conditions (780–799)       2217 (93.66)       150 (6.34)       2367 (14.35)         Others*       2291 (87.34)       332 (12.66)       2623 (15.90)         Number of secondary diagnosis       0.61+0.90       1.08+1.26       0.67+0.97       <.0001   | Diseases of directive system (520–579)                               | 21.38 (90.10)                                      | 235 (9.90)                            | 2373 (14.38)             |             |  |      |               |               |               |  |
| Poisoning and complications of surgical and medical care (960–999)       1178 (91.82)       105 (8.18)       1283 (7.78)         Diseases of respiratory system (460–519)       1285 (92.45)       105 (7.55)       1390 (8.42)         Symptoms, signs, and ill-defined conditions (780–799)       2217 (93.66)       150 (6.34)       2367 (14.35)         Others*       2291 (87.34)       332 (12.66)       2623 (15.90)         Number of secondary diagnosis       0.61+0.90       1.08+1.26       0.67+0.97       <.0001  | Diseases of musculoskeletal system and connective tissue $(710-739)$ | 1282 (90.15)                                       | 140 (9.85)                            | 1422 (8.62)              |             |  |      |               |               |               |  |
| Diseases of respiratory system (460–519)       1285 (92.45)       105 (7.55)       1390 (8.42)         Symptoms, signs, and ill-defined conditions (780–799)       2217 (93.66)       150 (6.34)       2367 (14.35)         Others*       2291 (87.34)       332 (12.66)       2623 (15.90)         Number of secondary diagnosis       0.61+0.90       1.08+1.26       0.67+0.97       <.0001   | Poisoning and complications of surgical and medical care (960–999)   | 1178 (91 82)                                       | 105 (8 18)                            | 1283 (7 78)              |             |  |      |               |               |               |  |
| Symptoms, signs, and ill-defined conditions (780–799)       2217 (93.66)       150 (6.34)       2367 (14.35)         Others*       2291 (87.34)       332 (12.66)       2623 (15.90)         Number of secondary diagnosis       0.61+0.90       1.08+1.26       0.67+0.97       <.0001  | Diseases of respiratory system (460–519)                             | 1285 (92 45)                                       | 105 (7 55)                            | 1390 (8.42)              |             |  |      |               |               |               |  |
| Others*     2291 (87.34)     332 (12.66)     2623 (15.90)       Number of secondary diagnosis     0.61+0.90     1.08+1.26     0.67+0.97     <.0001   | Symptoms, signs, and ill-defined conditions (780–799)                | 2217 (93.66)                                       | 150 (6.34)                            | 2367 (14 35)             |             |  |      |               |               |               |  |
| Number of secondary diagnosis $0.61 + 0.90$ $1.08 + 1.26$ $0.67 + 0.97$ <.0001   | Others   | 2291 (87 34)                                       | 332 (12 66)                           | 2623 (15.90)             |             |  |      |               |               |               |  |
|  | Number of secondary diagnosis  | $0.61 \pm 0.90$                                    | 1.08 + 1.26                           | $0.67 \pm 0.97$          | <.0001      |  |      |               |               |               |  |

\* Others include "Neoplasms (140-239)," "Disease of blood and blood-forming organs (280-289)," "Mental disorders (290-319)," "Diseases of nervous system (320-359)," and "V code."

patient, and provider resources placement, and to deliver the most appropriate care to the correspondent group of patient.<sup>[7,22]</sup> TTAS was not designed as a tool to triage nonurgent patient away from the ED.

Our study demonstrates that, male patients, older patients, patients with more secondary diagnoses, skin swelling/redness complaints, or with surgical complications, and patients with abnormal vital signs (tachycardia and fever) were more likely to be hospitalized. As TTAS was develop to prioritizes incoming patients at initial triage and identify the most seriously ill patients who cannot wait to be seen as TTAS 1, 2, or 3, patients with cutaneous problems might be initially assigned as nonurgent at triage. After examination by the physician, there might turn out to be severe skin infections that required intravenous antibiotics

#### Table 2

A multiple logistic regression model for hospitalization of nonurgent ED patients.

|                               | 95% CI for OR             |          |  |
|-------------------------------|---------------------------|----------|--|
|                               | Odds ratio (lower, upper) | Р        |  |
| Basic demographics            |                           |          |  |
| Gender                        |                           |          |  |
| Female                        | 1.00                      |          |  |
| Male                          | 1.37 (1.24, 1.51)         | < 0.0001 |  |
| Age group                     |                           |          |  |
| <65 years                     | 1.00                      |          |  |
| ≥65 years                     | 1.56 (1.39, 1.74)         | < 0.0001 |  |
| Time of day                   |                           |          |  |
| 00:00-08:00                   |                           |          |  |
| 08:00-16:00                   | 1.53 (1.32, 1.77)         | < 0.0001 |  |
| 16:00-00:00                   | 1.32 (1.13, 1.55)         | 0.0005   |  |
| Arrival by ambulance          |                           |          |  |
| No                            | 1.00                      |          |  |
| Yes                           | 2.40 (1.78, 3.23)         | < 0.0001 |  |
| Vital signs                   |                           |          |  |
| Heart rate group              |                           |          |  |
| ≤100 times/min                | 1.00                      |          |  |
| >100 times/min                | 1.47 (1.31, 1.65)         | < 0.0001 |  |
| SBP group                     |                           |          |  |
| $\leq$ 110 mmHg               | 1.14 (0.97, 1.35)         | 0.1177   |  |
| 111–180 mmHg                  | 1.00                      |          |  |
| >180 mmHg                     | 1.13 (0.94, 1.35)         | 0.1837   |  |
| Fever (≥38°C)                 |                           |          |  |
| No                            | 1.00                      |          |  |
| Yes                           | 2.73 (2.06, 3.60)         | < 0.0001 |  |
| Chief complaint               |                           |          |  |
| Hematuria                     | 1.00                      |          |  |
| Skin swelling/redness         | 4.64 (3.45, 6.24)         | < 0.0001 |  |
| Surgical complications        | 3.05 (2.06, 4.53)         | < 0.0001 |  |
| Fever/chills                  | 1.28 (0.85, 1.93)         | 0.2310   |  |
| Lower extremity pain          | 1.50 (1.09, 2.07)         | 0.0130   |  |
| Abdominal pain                | 1.52 (1.07, 2.16)         | 0.0205   |  |
| Joint swelling                | 1.22 (0.75, 1.98)         | 0.4320   |  |
| Dizziness                     | 1.07 (0.61, 1.89)         | 0.8078   |  |
| Noncardiac chest pain         | 1.25 (0.89, 1.74)         | 0.2037   |  |
| Nausea/vomiting               | 1.16 (0.81, 1.67)         | 0.4274   |  |
| Others                        | 1.01 (0.77, 1.33)         | 0.9467   |  |
| Number of secondary diagnosis | 1.47 (1.41, 1.54)         | < 0.0001 |  |

and required admission to hospital for treatment. On the other hand, patients with surgical complications would often return to ED early for evaluation if anything wrong happened. For example, a patient with vague abdominal pain (pain scale < 4) after laparotomy may be assigned as TTAS level 4, may later be proved to be mechanical ileus after serial examinations and then be admitted.

Older people are an increasing population in EDs in many countries.<sup>[23–27]</sup> They often present with atypical symptoms and signs and multiple comorbidities that complicate diagnosis and treatment.<sup>[25,27–29]</sup> Reports had shown that nonurgent elderly patients admitted to hospitals are characterized with very old age, male gender, low levels of education, widowhood, living alone, previous use of EDs or hospitals, and functional impairment.<sup>[30–32]</sup> In our series, elderly patients ( $\geq 65$  years) accounted for 21.56% of nonurgent group and 17.88% of them were hospitalized comparing to 10.99% of younger group. These results are comparable to a study that examined predictors for hospitalization in a CTAS nonurgent group.<sup>[32]</sup> The authors had advocated to adopt age more than 65 years as modifies in CTAS



Figure 1. The predictability of score combining factors derived from multiple logistic regression to hospitalization (AUROC=0.70).

in order to improve the discriminatory and predictive power to identify patients who require hospitalization.<sup>[32]</sup> In our studies, we also identified that elderly patients who arrived by ambulance had a higher admission rate, these findings were also comparable to previous studies.<sup>[20,33]</sup> Frailty may be an implication of such patient's manifestations. The characteristics of aging, comorbid status, and possible mobility problems (arriving by ambulance) among such patients are components of frailty.<sup>[34]</sup> It is suggested that applying frailty as a modifier in TTAS in order to reflect the severity and needs of ED interventions and the subsequent hospitalization care is appropriate in the future.

Our study showed that tachycardia (HR > 100) and fever of 38°C or more were associated with higher admission in nonurgent group. Although the TTAS hemodynamic criteria stated that, the patients could be assigned into level 3 if their vital signs were at the upper and lower ends of normals and were related to presenting complaint. However, based on our observation, patients with a slightly high body temperature (e.g., 38°C–39°C) or heart rate (e.g., 110 bpm) and no appearantly in distress conditions were assigned into nonurgent group. Our result stresses the importance of vital signs in predicting the subsequent hospitalization among nonurgent triaged patients. Triage nurses should be more concerned about the role of abnormal vital signs in the disease progression under different chief complaints. For instance, patients with a fever of 38°C or more under infectious etiologies could be adversely progressed over time, which can be considered upgraded.

This study has a number of limitations. First, the data were collected from a single medical center. Findings, such as admission rates and types of modifying features, may vary in regional or community ED settings. Second, cautiousness is suggested to generalize the results to trauma ED patients because we only collected nontrauma patients for the analyses in this study. Third, Taiwan has a universal national health insurance system allowing patients to access the health care facilities of their choosing. Different health care systems may pose diverse accessibility to the ED facilities. Forth, prospective validation of these findings is warranted.

## 5. Conclusion

Non-urgent patients might still be admitted for further care especially in male, the elderly, with more secondary diagnoses, abnormal vital signs, and presented with dermatologic complaints. Using the TTAS acuity level to identify patients for diversion away from the ED is unsafe and will lead to inappropriate refusal of care for many patients requiring hospital treatment.

## **Acknowledgments**

The authors thank Professor M. J. Bullard for his advice and help in editing the manuscript. Special thanks for the statistical support from the Healthy Aging Research Center at Chang Gung University, Taiwan.

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