

Clinical Risk Score for Prediction of Extended-Spectrum β -Lactamase–Producing *Enterobacteriaceae* in Bloodstream Isolates

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OBJECTIVE. To develop a risk score to predict probability of bloodstream infections (BSIs) due to extended-spectrum β -lactamase–producing *Enterobacteriaceae* (ESBLE).

DESIGN. Retrospective case-control study.

SETTING. Two large community hospitals.

PATIENTS. Hospitalized adults with *Enterobacteriaceae* BSI between January 1, 2010, and June 30, 2015.

METHODS. Multivariate logistic regression was used to identify independent risk factors for ESBLE BSI. Point allocation in extended-spectrum β -lactamase prediction score (ESBL-PS) was based on regression coefficients.

RESULTS. Among 910 patients with *Enterobacteriaceae* BSI, 42 (4.6%) had ESBLE bloodstream isolates. Most ESBLE BSIs were community onset (33 of 42; 79%), and 25 (60%) were due to *Escherichia coli*. Independent risk factors for ESBLE BSI and point allocation in ESBL-PS included outpatient procedures within 1 month (adjusted odds ratio [aOR], 8.7; 95% confidence interval [CI], 3.1–22.9; 1 point), prior infections or colonization with ESBLE within 12 months (aOR, 26.8; 95% CI, 7.0–108.2; 4 points), and number of prior courses of β -lactams and/or fluoroquinolones used within 3 months of BSI: 1 course (aOR, 6.3; 95% CI, 2.7–14.7; 1 point), ≥ 2 courses (aOR, 22.0; 95% CI, 8.6–57.1; 3 points). The area under the receiver operating characteristic curve for the ESBL-PS model was 0.86. Patients with ESBL-PSs of 0, 1, 3, and 4 had estimated probabilities of ESBLE BSI of 0.7%, 5%, 24%, and 44%, respectively. Using ESBL-PS ≥ 3 to indicate high risk provided a negative predictive value of 97%.

CONCLUSIONS. ESBL-PS estimated patient-specific risk of ESBLE BSI with high discrimination. Incorporation of ESBL-PS with acute severity of illness may improve adequacy of empirical antimicrobial therapy and reduce carbapenem utilization.

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Bloodstream infection (BSI) is the seventh leading cause of death in the United States, costing 75,000 lives annually; gram-negative bacilli account for ~50% of these cases.^{1,2} Extended-spectrum β -lactamase (ESBL) production is among the most clinically concerning antimicrobial resistance mechanisms of gram-negative bacilli.^{3,4}

The incidence of infections due to ESBL-producing *Enterobacteriaceae* (ESBLE) in the United States has increased recently in both community and tertiary-care hospitals.^{5,6} More recently, the site of acquisition for most ESBLE infections has been community-onset rather than nosocomial, making these infections less predictable.⁵

Carbapenems are considered the treatment of choice for BSI due to ESBLE.⁷ There is concern that the increase in incidence of ESBLE infections in the community may prompt an increase in carbapenem utilization, which may in turn contribute to further development of antimicrobial resistance and the spread of carbapenem-resistant *Enterobacteriaceae* (CRE).⁸

Stratification of patients based on predicted risk of ESBLE BSI provides a valuable tool for clinical providers to guide empirical antimicrobial therapy. Identification of patients at high risk of ESBLE BSI may improve adequacy of empirical antimicrobial therapy and, subsequently, patient outcomes.^{9,10} In addition, such stratification may spare patients with low risk

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of ESBL ESI from unnecessary carbapenems or other broad-spectrum agents.

In this case-control study, we aimed to develop a clinical score that predicts the risk of ESBL ESI using prior antibiotic exposure and other clinical variables that are available at the time of initial presentation.

METHODS

Settings

The study was conducted at Palmetto Health Richland and Baptist Hospitals in Columbia, South Carolina. The 2 hospitals provide care to local residents of Richland County and receive referrals from nearby counties. The Institutional Review Board at Palmetto Health approved the study and waived informed consent.

Definitions

The site of infection acquisition was classified as community-acquired, healthcare-associated or hospital-acquired as previously defined.¹¹ Outpatient procedures included both invasive procedures (bladder, colon, and prostate biopsies, etc.) and noninvasive procedures (colonoscopy, cystoscopy, duodenoscopy, etc.) within 30 days of index ESI.¹² Prior infections or colonization with ESBL was defined as documented growth of ESBL in any clinical culture site in both inpatient and ambulatory settings within 12 months prior to index ESI. Prior β -lactam and fluoroquinolone exposure was defined as receiving >24 hours of the respective class of antimicrobial agents within 3–90 days prior to collection of index blood culture. Multiple courses of antibiotics had to be at least 72 hours apart. Concurrent therapy with a β -lactam and a fluoroquinolone or sequential therapy with these agents within 72 hours was considered 1 course of antibiotics. β -lactams included penicillins, cephalosporins, carbapenems, monobactam, and β -lactam/ β -lactamase inhibitors. Receipt of prior antibiotics was ascertained from medication administration records from current and prior hospitalizations, clinical notes from current or prior visits (including emergency department, hospital admission, discharge summary, and consultation notes), and electronic prescriptions in medical records from prior visits to affiliated hospitals or ambulatory clinics.

Case Ascertainment

All adult patients with monomicrobial ESIs due to *Enterobacteriaceae* from January 1, 2010, to June 30, 2015, were identified through microbiology laboratory databases at Palmetto Health ($n = 1,102$). Recurrent episodes of ESI due to same or different *Enterobacteriaceae* during the study period were excluded ($n = 38$) to ensure that cases and controls were independent of each other, as assumed by the statistical hypothesis. Chromosomally mediated AmpC-producing

Enterobacteriaceae ($n = 153$), including *Enterobacter*, *Citrobacter*, *Serratia*, *Providencia* and *Morganella* spp., and CRE ($n = 1$) were also excluded due to potential overlap between risk factors for ESI due to these pathogens and ESBL.¹³ The remaining 910 unique patients with first episodes of ESI due to *Escherichia coli*, *Klebsiella* spp., *Proteus mirabilis*, and *Salmonella* spp. were included in the study. Screening for ESBL production using the disk diffusion method with cefotaxime/clavulanate combination disks was performed in bloodstream isolates that were determined to be nonsusceptible *in vitro* to any tested third-generation cephalosporin according to Clinical and Laboratory Standards Institute criteria. Surveillance for CRE was available at both hospitals. *In vitro* antimicrobial susceptibility testing for carbapenems was routinely performed on all *Enterobacteriaceae* bloodstream isolates throughout the study period. In addition, PCR for KPC gene was performed on all bloodstream isolates from October 1, 2014, until the end of the study.

Statistical Analysis

Logistic regression was used to identify risk factors for ESBL production among *Enterobacteriaceae* bloodstream isolates in this case-control study. Demographics and clinical variables were collected for patients with ESI due to ESBL (cases) and *Enterobacteriaceae* without ESBL production (controls). Prior antibiotic use was analyzed as a categorical variable: none, 1, or ≥ 2 courses of β -lactams and/or fluoroquinolones. Variables that were associated with ESBL in the univariate analysis with $P < .10$ were included in multivariate logistic regression. Risk factors were retained in the final model if they were independently associated with ESBL, with $P < .05$ in multivariate logistic regression using likelihood ratio test and individually if they were retained in $\geq 95\%$ of 200 bootstrap samples. Each bootstrap sample was derived by applying the same model entry and retention criteria.

The ESBL prediction score (ESBL-PS) was derived from the final model. Points were assigned for each independent risk factor and weighted approximately by the corresponding regression coefficients. Area under receiver operating characteristic curve (AUC) was used to quantify the discriminative ability of ESBL-PS; a value of 0.5 denoted random predictions and a value of 1.0 denoted perfect predictions.

In addition to bootstrap resampling, model calibration was examined to internally validate the model. Deciles of predicted risk of ESBL ESI were plotted from the ESBL-PS model by the actual fraction of patients who had ESI due to ESBL to visually assess calibration. The performance characteristics of the ESBL-PS as a binary classification test were examined. Sensitivity, specificity, positive predictive value (PPV) and negative predictive value (NPV) were calculated from the receiver operating characteristic curve for the best cutoff points.

JMP Pro version 12.0 (SAS Institute, Cary, NC) was used for statistical analyses. The level of significance for statistical testing was $P < .05$ (2-sided) unless otherwise specified.

RESULTS

Demographics, Clinical Characteristics, and Microbiology

During the study period, 910 patients with *Enterobacteriaceae* BSI were included in the study. Overall, their median age was 66 years, and 401 patients (44%) were men. *Escherichia coli* (n = 597; 66%) was the most common bloodstream isolate overall, followed by *K. pneumoniae* (n = 211; 23%), *P. mirabilis* (n = 78; 9%), *K. oxytoca* (n = 14; 2%), and *Salmonella* species (n = 10; 1%).

Among *Enterobacteriaceae* bloodstream isolates, 42 (4.6%) demonstrated ESBL production. *Escherichia coli* was also the most common ESBL (n = 25; 60%), followed by *K. pneumoniae* (n = 15; 36%) and *K. oxytoca* (2; 5%). Most ESBL BSIs were acquired outside the hospital (n = 33; 79%), including 12 community-acquired BSIs (29%) and 21 healthcare-associated BSIs (50%). The baseline demographics and clinical

characteristics of patients in the ESBL and control groups are shown in Table 1.

Risk Factors for BSI Due to ESBL

In univariate logistic regression, male sex, recent hospitalization, indwelling urinary catheters, recent outpatient procedures, prior infections or colonization with ESBL, and prior antibiotics were associated with ESBL. Notably, nosocomial acquisition was not associated with ESBL (Table 2).

After adjustments in the multivariate model, male sex (adjusted odds ratio [aOR], 1.6; 95% confidence intervals [CI], 0.8–3.4; *P* = .18), recent hospitalization (aOR, 1.0; 95% CI, 0.4–2.3; *P* = .98), and indwelling urinary catheters (aOR, 1.5; 95% CI, 0.6–3.5; *P* = .40) were not independently associated with ESBL BSI. Recent outpatient procedures, prior infections or colonization with ESBL, and prior exposure to antibiotics were independently associated with ESBL BSI (Table 3).

TABLE 1. Demographics and Clinical Characteristics of patients With Bloodstream Infections Due to *Enterobacteriaceae*

| Variable | ESBL, No. (%) (n = 42) | Non-ESBL, No. (%) (n = 868) |
|--|------------------------|-----------------------------|
| Age, y, median (IQR) | 65 (49–71) | 66 (55–78) |
| Male sex | 24 (57) | 377 (43) |
| Ethnicity | | |
| White | 20 (48) | 408 (47) |
| African American | 18 (43) | 434 (50) |
| Other | 4 (10) | 26 (3) |
| Diabetes mellitus | 15 (36) | 322 (37) |
| End-stage renal disease | 4 (10) | 72 (8) |
| Liver cirrhosis | 2 (5) | 42 (5) |
| Cancer | 10 (24) | 141 (16) |
| Immune compromised host | 4 (10) | 99 (11) |
| Hospital-acquired infection | 9 (21) | 160 (18) |
| Recent hospitalization ^a | 23 (55) | 248 (29) |
| Residence at skilled nursing facility | 10 (24) | 139 (16) |
| Indwelling urinary catheterization | 9 (21) | 87 (10) |
| Indwelling central venous catheter | 11 (26) | 142 (16) |
| Recent chemotherapy ^b | 3 (7) | 65 (7) |
| Recent outpatient procedure ^b | 7 (17) | 43 (5) |
| Prior infections/colonization with ESBL ^c | 9 (21) | 6 (1) |
| No. of prior courses of BL/FQ ^a | | |
| 0 | 14 (33) | 709 (82) |
| 1 | 13 (31) | 128 (15) |
| ≥2 | 15 (36) | 31 (4) |

NOTE. ESBL, extended-spectrum β-lactamase-producing *Enterobacteriaceae*; IQR, interquartile range; BL, β-lactams; FQ, fluoroquinolones.

Data shown as number (%) unless otherwise specified.

^aWithin 90 days of bloodstream infection.

^bWithin 30 days of bloodstream infection.

^cWithin 365 days of bloodstream infection.

Development and Internal Validation of ESBL Prediction Score

All 3 variables that were independently associated with ESBL BSI were retained in ≥95% of bootstrap samples and were

TABLE 2. Univariate Logistic Regression Results for Risk Factors of Bloodstream Infection Due to Extended-Spectrum β-Lactamase-Producing *Enterobacteriaceae* (ESBL)

| Variable | OR | (95% CI) | <i>P</i> Value |
|--|------|--------------|----------------|
| Age (per decade) | 0.9 | (0.8–1.1) | .19 |
| Male sex | 1.7 | (0.9–3.3) | .08 |
| White ethnicity | 1.0 | (0.6–1.9) | .94 |
| Diabetes mellitus | 0.9 | (0.5–1.8) | .86 |
| End-stage renal disease | 1.2 | (0.3–3.0) | .78 |
| Liver cirrhosis | 1.0 | (0.2–3.4) | .98 |
| Cancer | 1.6 | (0.7–3.2) | .22 |
| Immune compromised host | 0.8 | (0.2–2.1) | .70 |
| Hospital-acquired infection | 1.2 | (0.5–2.5) | .63 |
| Recent hospitalization ^a | 3.0 | (1.6–5.7) | <.001 |
| Residence at skilled nursing facility | 1.6 | (0.8–3.3) | .20 |
| Indwelling urinary catheterization | 2.5 | (1.1–5.1) | .03 |
| Indwelling central venous catheter | 1.8 | (0.9–4.0) | .12 |
| Recent chemotherapy ^b | 1.0 | (0.2–2.7) | .95 |
| Recent outpatient procedure ^b | 3.7 | (1.5–8.5) | .008 |
| Prior infections/colonization with ESBL ^c | 39.2 | (13.4–123.1) | <.001 |
| No. of prior courses of BL/FQ ^a | | | |
| 0 | 1.0 | (Reference) | |
| 1 | 5.1 | (2.3–11.3) | <.001 |
| ≥2 | 24.5 | (10.9–55.9) | <.001 |

NOTE. OR, odds ratio; CI, confidence interval; BL, β-lactams; FQ, fluoroquinolones.

^aWithin 90 days of bloodstream infection.

^bWithin 30 days of bloodstream infection.

^cWithin 365 days of bloodstream infection.

TABLE 3. Independent Risk Factors of Bloodstream Infection Due to Extended-Spectrum β -Lactamase-Producing Enterobacteriaceae (ESBLE) and Point Allocation in ESBL Prediction Score

| Variable | aOR | (95% CI) | P Value | Point Allocation |
|---|------|-------------|---------|------------------|
| Recent outpatient GI/GU procedure ^a | 8.6 | (3.0–22.5) | <.001 | 1 |
| No. of prior BL/FQ courses ^b | | | | |
| 0 | 1 | Reference | | 0 |
| 1 | 6.3 | (2.7–14.7) | <.001 | 1 |
| $\geq 2^c$ | 22.1 | (8.6–57.2) | <.001 | 3 |
| Prior infections/colonization with ESBLE ^d | 26.8 | (7.0–108.2) | <.001 | 4 |

NOTE. aOR: adjusted odds ratio; CI: confidence interval; GI: gastrointestinal; GU: genitourinary; BL: β -lactams; FQ: fluoroquinolones.

^aWithin 30 days of bloodstream infection.

^bWithin 3 to 90 days of bloodstream infection.

^cMultiple courses of antibiotics are given at least 3 days apart.

^dWithin 365 days of bloodstream infection.

included in the final model. The AUC for the final logistic regression model was 0.86. The ESBL prediction score (ESBL-PS) was developed by assigning points for each risk factor in the final model, weighted approximately by the corresponding regression coefficients (Table 3). The ESBL-PS is the cumulative number of points for each individual from their risk factors, and ranges from 0 to 8. The AUC for the ESBL-PS was 0.86 (Supplementary Figure 1). Model calibration was satisfactory; the observed outcomes were fairly close to the predictions (Supplementary Figure 2).

The ESBL-PS equips clinicians with a tool with which to predict the risk of ESBLE BSI (Figure 1). A higher score corresponds to an increased risk of ESBLE BSI. For example, patients with an ESBL-PS of 0 have <1% predicted probability of ESBLE BSI. The estimated risk increases to >20% and >50% in patients with ESBL-PSs of 3 and 5, respectively.

The performance characteristics of the ESBL-PS as a binary classification test for selected cutoff points are shown in Table 4. Using a cutoff score ≥ 3 to indicate high risk of ESBLE BSI provided the best performance in the statistical model with a NPV of 97%. A more conservative approach using a cutoff score ≥ 1 improved sensitivity and NPV to 88% and 99%, respectively, at the expense of specificity and PPV.

DISCUSSION

Independent Risk Factors for ESBLE BSI

The results of this study demonstrate that the risk of BSI due to ESBLE can be estimated with high discrimination based on prior antibiotic exposure, prior infections or colonization with ESBLE, and recent outpatient procedures.

The association between recent antibiotic use and ESBLE infections has been well established in previous studies.^{3,4,14–16}

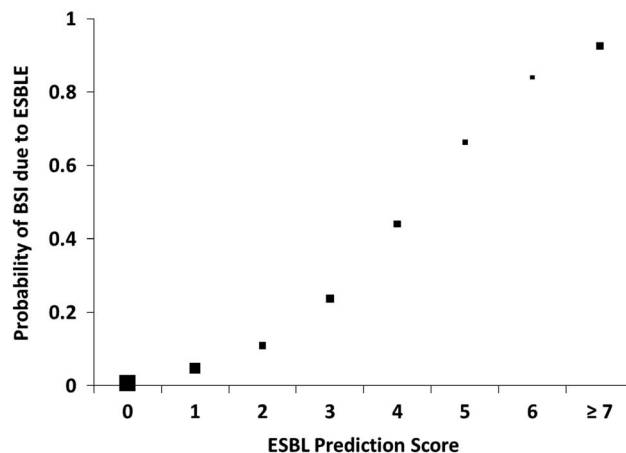


FIGURE 1. Estimated probability of bloodstream infection due to extended-spectrum β -lactamase *Enterobacteriaceae* (ESBLE) based on ESBL prediction score. Size of marker is approximately proportional to number of subjects with that particular score. BSI, bloodstream infection.

TABLE 4. Performance of Extended-Spectrum β -Lactamase (ESBL) Prediction Score as a Binary Classification Test

| ESBL-PS | Sensitivity, % | Specificity, % | PPV, % | NPV, % |
|------------|----------------|----------------|--------|--------|
| ≥ 1 | 88 | 77 | 16 | 99 |
| $\geq 3^a$ | 43 | 96 | 33 | 97 |

NOTE: ESBL-PS, ESBL prediction score; PPV, positive predictive value; NPV, negative predictive value.

^aUsing an ESBL-PS ≥ 3 to indicate high predicted risk of bloodstream infection due to ESBLE-producing *Enterobacteriaceae* provides the best performance in statistical model.

In the current study, we used a novel approach of categorizing this variable by the number of antibiotic courses received within the prior 90 days. This method improved model discrimination due to considerably higher risk of ESBLE BSI within a smaller proportion of patients who received multiple courses of antibiotics compared to those who received only 1 prior course. Identification of prior infections or colonization with ESBLE within the prior 12 months as the strongest risk factor for ESBLE BSI was consistent with the results of a large investigation in Netherlands.¹⁵ Recent outpatient genitourinary and gastrointestinal procedures have been associated with increased risk of acquisition of bacteria that harbor antimicrobial resistance.^{12,17,18} The increased risk of ESBLE BSI following these procedures calls for improvements in infection control practices in these settings.

Clinical Applications of ESBL-PS

The implementation of the ESBL-PS into workflow practices of healthcare providers is feasible due to the small number and accessibility of these variables. Some risk factors may be

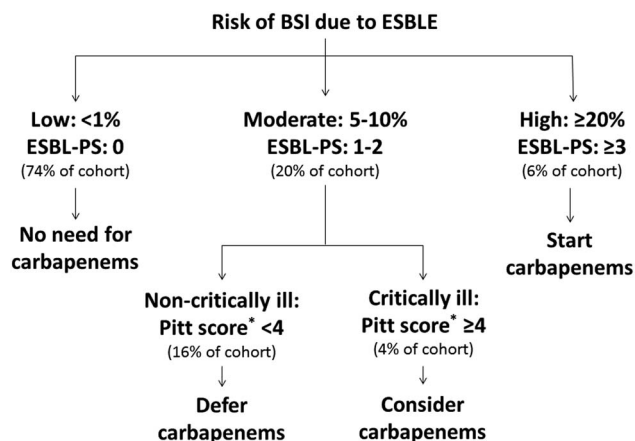


FIGURE 2. Proposed algorithm for application of extended-spectrum β -lactamase (ESBL) prediction score in management of bloodstream infections. BSI, bloodstream infection; ESBL-PS, extended-spectrum β -lactamase prediction score. * Patterson DL, et al. *Ann Intern Med* 2004;140:26–32.

displayed in real time in electronic medical records (ie, prior infections or colonization with ESBLE); other data (ie, prior antibiotics or outpatient procedures) may be collected in a patient interview or quickly obtained from the electronic medical record if the patient is unable to communicate.

Application of the ESBL-PS provides clinicians with opportunities to improve both empirical antimicrobial therapy and carbapenem utilization. The ESBL-PS categorizes patients based on predicted risk of ESBLE BSI into 3 risk groups: low, moderate, and high (Figure 2). Low-risk patients have no risk factors; moderate-risk patients are those with minor risk factors such as an outpatient procedure or 1 prior course of antibiotics; and high-risk patients are those with major risk factors such as prior infections or colonization with ESBLE or multiple courses of antibiotics. The decision to withhold carbapenem therapy was straightforward in nearly 75% of patients in the cohort who had low predicted probability of ESBLE BSI. Similarly, empirical carbapenem therapy appears to have been appropriate in the high-risk group, which represented 6% of the study cohort; however, prescription of carbapenems to the remaining 20% of patients in the moderate-risk group does not appear to have been a high-yield intervention. To improve the benefit-to-risk ratio of antimicrobial therapy, the stratification of the moderate-risk group further is suggested, according to the acute severity of illness using the Pitt bacteremia score¹⁹ or the predicted prognosis using the BSI mortality risk score (BSIMRS).^{20,21} Because survival benefit from adequate empirical antimicrobial therapy has been clearly demonstrated in critically ill patients (Pitt bacteremia score ≥ 4) and those with guarded prognosis at initial presentation (ie, BSIMRS ≥ 5),¹⁰ carbapenem therapy may be justified in those patients in the moderate-risk group. Application of the proposed algorithm

results in the exposure of only 10% of patients to carbapenems (which is nearly twice the overall incidence of ESBLE among bloodstream isolates in the current study) while providing adequate empirical therapy to $\sim 98\%$ of overall cohort and $>99\%$ of critically ill patients. It is reassuring that this improvement in the adequacy of empirical therapy will not result in an increase in overall carbapenem utilization, even in institutions with existing carbapenem restrictions (like the 2 hospitals included in this study). In the current cohort of 910 patients, 92 (10.1%) received empirical carbapenem therapy, including 9 of 42 (21.4%) in the ESBLE and 83 of 868 (9.6%) in the control group. Modification of institutional criteria for empirical carbapenem use according to the proposed algorithm is justified because it allows for earlier appropriate therapy in high-risk patients without an increase in overall carbapenem use.

Changing Epidemiology of ESBLE BSI

Since ESBLEs were first reported in 1983,²² prolonged hospitalization has been considered among the most important risk factors for harboring these organisms.^{3,4} However, ESBLEs have emerged as community-onset pathogens since the beginning of this century,^{23,24} and they have recently been reported with increasing frequency in community-onset infections in North America and Europe.^{5,6,25} The current study confirms that most ESBLE BSIs are acquired outside the hospital and that nosocomial acquisition is not a risk factor for ESBLE in this setting. We suspect that the widespread use of broad-spectrum antibiotics in the community (both orally and intravenously) and improvements in infection control practices in hospitals have shifted most ESBLE infections to the community-onset setting. In addition, *E. coli* has surpassed *Klebsiella* spp. to become the most common ESBLE.^{5,6} The ability of *E. coli*, particularly sequence type 131, to adapt to local environments and spread in the community poses serious challenges to the healthcare system.^{26,27} Moreover, the widespread dissemination of the CTX-M-15 genotype among *E. coli* sequence type 131 in the southeastern United States requires an urgent call to change antibiotic prescription practices in the community.^{28,29} Efforts to minimize unnecessary prescription of antibiotics, particularly β -lactams and fluoroquinolones, in outpatient settings should be emphasized.³⁰

The main strength of this study is the inclusion of patients from 2 community hospitals in addition to data from inpatient and outpatient procedure records, prior culture results, and antibiotic prescriptions from several affiliated hospitals, emergency rooms, urgent treatment centers, and outpatient clinics in the area.³¹ Despite the limitations of retrospective design, only 5 of 42 patients with ESBLE BSIs did not have identifiable risk factors. Of these 5 patients, 2 were temporary visitors with recent international travel and no documentation of prior culture results, antibiotic exposures, or procedures in medical records. Another 2 were transferred from nearby medical facilities with incomplete transfer records of

administered medications. Transfers from other healthcare facilities within the same country and receiving healthcare internationally have been associated with increased risk of harboring ESBL in prior studies,^{14,32} likely due to uncaptured prior antibiotic exposure, procedures, and culture results. Antimicrobial stewardship programs should explore educating healthcare providers regarding the value of inquiring about prior antibiotic use upon selection of empirical therapy for potentially life-threatening infections. Requesting records of medications, procedures, and prior culture results of patients transferred to tertiary care hospitals is equally important. Second, due to the relatively small number of ESBL BSI, the study may have lacked power to identify other minor risk factors with equal or less weight to outpatient procedures or 1 course of antibiotics. Third, the model was derived from 2 hospitals within the same healthcare system and geographical location. Data from multiple settings may provide external validity and generalizability. Finally, molecular testing was not performed on bloodstream isolates to identify CTX-M or other ESBL genotypes.

In the era of increasing antimicrobial resistance among community-onset bacterial isolates, efforts to improve utilization of currently available antibiotics and to prevent further induction of antimicrobial resistance are of vital importance. Prediction of ESBL based on patient-specific risk factors provides an alternative solution to the nonstratified use of carbapenems for the general fear of ESBL infections. The ESBL-PS allows healthcare providers to stratify patients based on estimated risk of BSI due to ESBL with high discrimination. Application of the ESBL-PS based on acute severity of illness may improve the adequacy of empirical antimicrobial therapy without increasing carbapenem utilization.

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SUPPLEMENTARY MATERIAL

To view supplementary material for this article, please visit <https://doi.org/10.1017/ice.2016.292>

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