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Predictors of Surgical Site Infection after Hospital Discharge in Patients Undergoing Major Vascular Surgery

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Abstract

Objective—Surgical site infection (SSI) is one of the most common post-operative complications following vascular reconstruction, producing significant morbidity and hospital readmission. In contrast to SSI that develops while patients are still hospitalized, little is known about the cohort of patients that develop SSI following discharge. In this study, we explore the factors that lead to post-discharge SSI, investigate the differences between risk factors for in-hospital versus post-discharge SSI, and develop a scoring system to identify patients that might benefit from post-discharge monitoring of their wounds.

Methods—Patients who underwent major vascular surgery from 2005–2012 for aneurysm and lower extremity occlusive disease were identified from the American College of Surgeons National Surgical Quality Improvement Program Participant Use Files. Patients were categorized as having no SSI, in-hospital SSI, or SSI after hospital discharge. Predictors of post-discharge SSI were determined by multivariable logistic regression and internally validated by bootstrap resampling. Risk scores were assigned to all significant variables in the model. Summative risk scores were collapsed into quartile-based ordinal categories and defined as low-, low/moderate-, moderate/high-, and high-risk. Multivariable logistic regression was used to determine predictors of in-hospital SSI.

Results—Of the 49,817 patients who underwent major vascular surgery, 4,449 (8.9%) were diagnosed with SSI (2.1% in-hospital; 6.9% post-discharge). By multivariable analysis, factors

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significantly associated with increased odds of post-discharge SSI include female gender, obesity, diabetes, smoking, hypertension, coronary artery disease, critical limb ischemia, chronic obstructive pulmonary disease, dyspnea, neurological disease, prolonged operative time >4 hours, American Society of Anesthesiology classification IV or V, lower extremity revascularization or aortoiliac procedure, and groin anastomosis. The model exhibited moderate discrimination (bias-corrected c-statistic, 0.691) and excellent internal calibration. The post-discharge SSI rate was 2.1% for low-risk patients, 5.1% for low/moderate-risk patients, 7.8% for moderate/high risk patients, and 14% for high-risk patients. In a comparative analysis, comorbidities were the primary driver of post-discharge SSI whereas in-hospital factors (operative time, emergency case status) and complications predicted in-hospital SSI.

Conclusions—The majority of SSIs after major vascular surgery develop following hospital discharge. We have created a scoring system that can select a cohort of patients at high-risk for SSI following discharge. These patients can be targeted for transitional care efforts focused on early detection and treatment with the goal of reducing morbidity and preventing readmission secondary to SSI.

Introduction

Surgical site infection (SSI) is the most common nosocomial infection in surgical patients, accounts for 38% of post-operative complications,^{1,2} is the leading cause of unplanned and potentially preventable hospital readmission in surgical patients,^{3–5} and results in approximately 20,000 potentially preventable deaths each year.^{2,6–8} This complication translates into additional healthcare costs in the United States alone in excess of \$3 billion per year.^{6–8}

Recognition of the impact of SSI has led to the development of process measures to prevent SSI in the hospital. One major initiative, the Surgical Infection Prevention (SIP) Project, established SSI prevention measures (such as specified antibiotic schedules) which resulted in a 27% reduction in the incidence of SSI.^{9,10} These results were translated into the Surgical Care Improvement Project (SCIP), a nationwide effort with the goal of improving surgical care by reducing surgical complications including SSIs.^{10,11}

The foregoing models focus on SSI prevention and assume that wounds post-operatively are monitored directly by surgical and nursing staff during the index hospitalization. However, monitoring virtually ceases once a patient leaves the hospital because the “routine” follow-up visit is usually scheduled 2–3 weeks following hospital discharge.¹² This lack of monitoring is a concern, as the majority of patients do not have the experience or expertise to recognize early-stage wound infections.¹³ Thus, patients often return to the clinic or hospital with an advanced wound infection/complication that requires intensive treatment and, potentially, rehospitalization.¹¹

Risk factors for SSI occurring after hospital discharge have not been extensively studied.^{8,14–16} To address this gap, we differentiated SSIs that occur pre-versus post-discharge in patients undergoing major vascular procedures. We then determined predictors for post-discharge SSI. Finally, using predictors for post-discharge SSI, we created and internally validated a risk-prediction model to facilitate assignment of risk for post-discharge

SSI. Characterizing factors that determine which patients are at high-risk for developing SSI after hospital discharge has the potential to direct transitional care efforts towards the most susceptible patients which may allow early diagnosis and treatment, potentially precluding the need for readmission and reintervention.

Methods

Data acquisition and cohort selection

We analyzed data from 2005–2012 using the American College of Surgeons National Surgical Quality Improvement Program (ACS-NSQIP) Participant Use Files. The ACS-NSQIP provides outcomes data to participating hospitals for purposes of quality improvement. Data is collected by a trained surgical clinical reviewer on randomly assigned patients from the pre-operative period through 30-days post-operation. Details are recorded on patient demographics, comorbidities, operative variables, and postoperative outcomes by means of medical chart extraction, 30-day interviews and other processes. Clinical reviewer training for participating hospitals and data auditing confirms reliability. The use of NSQIP data does not require patient consent. Details of the database, data collection protocols and variable definitions are available online from the ACS-NSQIP website.¹⁷ The Health Services Institutional Review Board at the University of Wisconsin approved this study.

Using current procedural terminology codes we identified all patients who underwent open abdominal aortic aneurysm repair, open aortoiliac repair, and open lower extremity revascularization (codes available in Supplementary Table I, online only).

We defined SSI as a composite measure of four ACS-NSQIP variables: superficial SSI, deep SSI, organ-space SSI, and wound dehiscence/disruption. If a patient had multiple SSI diagnoses, the time to first diagnosis was used to determine whether the SSI occurred in-hospital or after hospital discharge. Patients were excluded from this analysis if they died prior to hospital discharge (2.9%).

Explanatory Variables

Primary exposure variables included NSQIP-provided patient demographics and comorbidities. Secondary exposure variables included perioperative characteristics and post-operative complications. Peripheral vascular disease is defined as a history of revascularization or amputation for atherosclerotic disease. We created composite variables as previously described¹⁸ for coronary artery disease (CAD) (angina, myocardial infarction, percutaneous coronary intervention or cardiac surgery) and neurological disease (cerebrovascular accident or stroke with or without neurological deficit, transient ischemic attack, hemiplegia, paraplegia, quadriplegia, CNS tumor, or impaired sensorium). Post-operative complications were classified as infectious (pneumonia, urinary tract infection), respiratory (reintubation, failure to wean from ventilator within 48 hours), renal (progressive renal insufficiency, acute renal failure), central nervous system (cerebral vascular accident, stroke with neurological deficit, coma > 24 hours, peripheral nerve injury), cardiac (cardiac arrest requiring CPR, myocardial infarction), DVT/PE (thrombophlebitis, deep vein thrombosis, pulmonary embolism), sepsis (sepsis, septic shock), transfusion for bleeding and

graft failure. Post-operative complications occurring after hospital discharge and/or after development of a SSI were excluded. We defined a prolonged length of stay (LOS) as a post-operative in-hospital stay \geq 2-weeks (i.e. the 90th percentile for postoperative LOS).

A subset of health history variables (i.e. history of surgically treated peripheral vascular disease, rest pain or gangrene, alcohol abuse) was missing in 21% of observations. Following methodology tested by Hamilton et al,¹⁹ and others,⁴ we created missing value indicators as part of the respective dummy variables. This method can be highly explanatory and also advantageous compared to statistical imputation, particularly if there is substantial variation in missing data amongst hospitals.¹⁹ These missing value indicators for respective variables were included in the multivariable analyses.

Outcome

We defined the primary outcome of interest as a SSI developing between hospital discharge and prior to 30-days post surgery. The secondary outcome of interest was SSI developing prior to hospital discharge. Patients with in-hospital SSI remained eligible for development of a post-discharge SSI.

Statistical analysis

First, we analyzed unadjusted associations of 30-day post-discharge SSI with primary and secondary exposures using chi-square testing. A multivariable logistic regression model with backward selection ($P > 3.15$ as exit criterion) was then used to evaluate variables associated with the risk of post-discharge SSI. During model fitting, we ensured inclusion of variables age, gender, race, body mass index (BMI), diabetes, smoking, and graft failure because of previously described association to SSI.^{14,18,20,21}

This “final” model is subject to overfitting, and therefore may overestimate its own predictive power.²² To correct for this, we generated 200 random bootstrap samples with replacement from the original data set.²³ Each bootstrapped sample had the same number of records as the original dataset. The same backward selection algorithm was used to fit the multivariable logistic regression model on each bootstrap sample. This model was “frozen” and then applied on the original data set.²⁴ The difference between the c-statistic generated from the two models was used to calculate the statistical optimism. The mean statistical optimism was then calculated using the 200 bootstrap samples and was used to adjust the final model c-statistic to produce a bias-corrected estimate of the model’s reliability. The fit of the model was assessed using the Hosmer and Lemeshow goodness-of-fit test.^{22,25} A value of $P < .05$ was considered significant.

Risk Prediction Score

From the final model we created a simplified scoring system based on the regression coefficients. To derive the score, the beta coefficient of each risk factor was divided by the absolute value of the lowest coefficient and then rounded to the nearest integer, a methodology that has been previously described.^{26,27} The summative risk score for a patient developing a post-discharge SSI is the total of all points for each individual risk factor. We then divided the cohort based on risk score quartiles and computed respective post-discharge

SSI risks by averaging the model-predicted risks for all patients in that quartile. The internal calibration of the scoring system was checked by comparing the predicted post-discharge SSI prevalence with the observed post-discharge SSI prevalence.

Secondary Analysis

To determine significant predictors of in-hospital SSI, the same backward selection multivariable logistic regression method described above was used; though for this model we excluded prolonged length of stay as a covariate.

Results

Patient Characteristics

The sample consisted of 49,817 patients who underwent major vascular surgery (open abdominal aortic aneurysm repair: n=8,866; open aortoiliac repair: n=13,248; open lower extremity revascularization: n=27,703). The majority of the patients were male (65%) and white (78%). The mean age was 67 years (standard deviation: 11 years). Vascular-related comorbidities were common, with many patients having hypertension (82%), CAD (29%), critical limb ischemia (34%), and peripheral vascular disease (42%). Almost half (46%) of patients were smokers. Many (62%) patients were overweight or obese.

Out of all patients analyzed, 4,449 (8.9%) were diagnosed with an SSI (2.1% prior to discharge; 6.9% after hospital discharge). Rates of SSI by procedure and timing are displayed in Table I. The distribution of the number of days from surgery to a diagnosis of SSI (either in-hospital SSI or post-discharge SSI) is displayed in Figure 1. Only 24 (0.1%) patients were diagnosed with both in-hospital and post-discharge SSI.

Comparative univariate analyses

The characteristics of patients who developed SSI after discharge are displayed in Supplementary Table II. Patients who developed SSI after discharge, relative to those who did not, were more likely female (43% vs. 35%, $p < .0001$), obese (43% vs. 26%, $p < .0001$), insulin dependent diabetic (26% vs. 16%, $p < .0001$), to smoke (49% vs. 46%, $p = .0077$) or to have a diagnosis of critical limb ischemia (45% vs. 34%, $p < .0001$). Furthermore, these patients underwent reoperation within 30-days of the initial procedure at more than 3 times the rate of patients without post-discharge SSI (39% vs. 12%, $p < .0001$).

Multivariable analysis

Adjusted odds ratios (OR) and 95% confidence intervals (CI) for SSI occurring after hospital discharge are summarized in Table II. Aortoiliac repair or lower extremity revascularization was associated with higher odds of post-operative SSI relative to open AAA repair (OR, 2.4; 95% CI, 1.9–2.9 and OR, 3.1; 95% CI, 2.5–3.8 respectively). Being obese was also strongly associated with higher odds of SSI after discharge (OR, 2.3; 95% CI, 2.1–2.5). Other chronic conditions that were associated with elevated odds of developing SSI after discharge included insulin dependent diabetes (OR, 1.3; 95% CI, 1.2–1.4), critical limb ischemia (OR, 1.2; 95% CI, 1.1–1.3) and hypertension (OR, 1.2; 95% CI, 1.1–1.4). Additional risks factors included female gender (OR, 1.4; 95% CI, 1.3–1.5), smoking (OR,

1.2; 95% CI, 1.1–1.3), groin anastomosis (OR, 1.2; 95% CI, 1.0–1.4) and operative time >6 hours (OR, 1.5; 95% CI, 1.4–1.7). Certain variables were associated with reduced odds of post-discharge SSI with the most protective, unsurprisingly, being a post-operative length of stay \leq 14 days (OR, 0.4; 95% CI, 0.3–0.5). Other patient characteristics that were protective include black race (OR, 0.8; 95% CI, 0.7–0.9) and totally dependent functional status (OR, 0.6; 95% CI, 0.4–0.9). Renal and sepsis complications were also protective (OR, 0.6; 95% CI, 0.4–0.9 and OR, 0.7; 95% CI, 0.5–0.9 respectively).

Bootstrap Analysis and Model Fit

The unadjusted c-statistic of the final model was 0.694 (95% CI: 0.682 – 0.706) (Figure 2). The adjusted c-statistic after bootstrap correction for model optimism was 0.691 (95% CI: 0.679 – 0.703). These similar values suggest there was only small bias due to overfitting and indicate fair predictive discrimination of the model. The Hosmer–Lemeshow goodness-of-fit test produced a χ^2 value of 4.636 (df=8, P-value=0.7957) indicating excellent model internal calibration.

Risk Prediction Model

Overall, scores of significant predictors for post-discharge SSI ranged from –9 for prolonged length of stay to 12 for patients undergoing an open lower extremity revascularization. Total risk scores were generated for patients by adding the score from individual risk factors (Table III). For example, a female (+4) who is obese (+9), hypertensive (+2), totally dependent at baseline (–6), and experienced a prolonged operative case (+5) has a total risk score of 14. These summated risk scores ranged from –20 to 45 with the majority of scores (>90%) between 0 and 30. The 30-day post-discharge SSI risk associated with the total risk score represents the average risk amongst all patients having the same total score (Figure 3). The median risk score was 21 with a corresponding predicted post-discharge SSI probability of 6.1%. The sensitivity of the model was approximately 90% for a predicted risk threshold of 4% or greater, and approximately 50% for a threshold of 9% or greater. Further sensitivity and specificity values at varying predictive risk thresholds are displayed in Table IV.

To simplify the risk scores, we collapsed all patients into 4 ordinal categories based upon quartiles defined as low (<16 points), low-moderate (16–20 points), moderate-high (21–25 points), and high-risk (>25 points) groups. The respective post-discharge SSI predicted probabilities for these groups were 2.1%, 5.1%, 7.8% and 14% respectively (Table V). There was excellent agreement between the predicted and observed post-discharge SSI rates by risk category ($R^2=0.99$) (Supplementary Figure 1, online only).

Secondary outcomes

Significant variables associated with SSI occurring in-hospital are displayed in Supplemental table III. Demographic variables associated with higher odds of in-hospital SSI include female gender (OR, 1.3; 95% CI, 1.2–1.5) and “other” race vs. white race (OR, 1.4; 95% CI, 1.2–1.7). Comorbid factors associated with the greatest odds include totally dependent functional status (OR, 2.3; 95% CI, 1.6–3.2) and obesity (OR, 1.7; 95% CI, 1.5–2.0). Perioperative characteristics including emergency case (OR, 1.7; 95% CI, 1.4–2.1) and

prolonged operative time (OR, 2.1; 95% CI, 1.8–2.6) were also associated with increased odds. Post-operative complications were associated with increased odds of in-hospital SSI, with the most significant being sepsis preceding SSI (OR, 3.7; 95% CI, 3.0–4.5) and respiratory complications (OR, 2.6; 95% CI, 2.1–3.2).

Mutual and Unique Risk Factors

Significant factors associated with both in-hospital and post-discharge SSI include aortoiliac surgery, female gender, obesity, critical limb ischemia, American Society of Anesthesiology (ASA) class IV/V, and prolonged operative time. Significant unique factors associated with in-hospital SSI include demographics and comorbid conditions: race, congestive heart failure, partially dependent functional status, dialysis, co-existing open or infected wound, and chronic steroid use; but also included perioperative characteristics and complications: emergency case status, ventilator-use prior to surgery, wound class, and respiratory, bleeding, graft-loss and sepsis complications. Significant unique factors associated with post-discharge SSI mainly include demographics and comorbid conditions: race, diabetes, smoking, hypertension, CAD, COPD, dyspnea, neurological disease, and lower extremity revascularization procedure. (Supplementary Table III, online only)

Discussion

By distinguishing between in-hospital versus post-discharge SSI, we define characteristics that may uniquely predispose vascular surgery patients to develop SSI after discharge. This distinction is essential because protocols to monitor and manage SSI occurring in the hospital must be different from those designed to monitor and manage SSI following discharge. As such, we determined which risk factors are significant in predicting post-discharge SSI and subsequently generated a simple and accurate scoring system that can assign a risk for post-discharge SSI. Furthermore, we have demonstrated that predictors of SSI occurring in-hospital indeed differ from those occurring after discharge for vascular surgery patients.

Historically, SSI is a well-known and common complication of patients undergoing vascular surgery with some studies citing wound complications in more than 30% of patients undergoing open vascular reconstruction.^{28,29} Using the ACS-NSQIP data, we found a SSI rate of 8.9% with approximately 77% of these having occurred after discharge from the hospital. It is important to note that in this analysis we have focused on patients undergoing open vascular reconstruction versus endovascular and have excluded patients treated with carotid endarterectomy (CEA) because the incidence of wound infection following CEA is very low.

In the current study, a multitude of factors ranging from those known prior to admission to those determined during the hospitalization were used in a multivariable logistic regression to identify variables associated with post-discharge SSI. Factors that were associated with higher odds of post-discharge SSI include female gender, procedure type (with operations involving the lower extremities and groin anastomosis at increased risk), obesity, diabetes, smoking, hypertension, critical limb ischemia, COPD, CAD, neurological disease, and ASA class IV/V. The majority of these risk factors have previously been described as significant

risk factors for SSI in vascular patients including female gender,^{29,30} obesity,^{28,31,32} diabetes,^{29,33} CAD,²⁹ smoking,²¹ COPD,^{18,29,34} prolonged operative time,^{18,34} and infrainguinal incisions.²⁹ However, none of the prior studies explicitly determined whether these factors were unique to patients that develop SSI following hospital discharge. The timing of the development of SSI has been previously examined in a broad population of surgical patients. In a population-based retrospective cohort study of over 600,000 patients undergoing various elective surgical procedures, Daneman and colleagues reported independent risk factors for post-discharge SSI including female gender, increased duration of surgery, diabetes and obesity.¹⁵ In a separate prospective cohort study of 1,506 patients undergoing general surgery procedures, Delgado-Rodríguez and colleagues found the greatest independent risk factor for post-discharge SSI to be elevated BMI.¹⁶ Our results reinforce the pronounced impact of obesity on development of SSI after discharge.

We were able to demonstrate differences in characteristics and independent predictors between patients developing SSI in-hospital versus after discharge.^{14–16} SSIs occurring after discharge are predominantly associated with a patient's comorbidity burden whereas those that develop in-hospital are largely associated with perioperative factors. Specifically, we found that SSI occurring after hospital discharge is more common for patients with comorbid conditions such as diabetes, smoking, hypertension, CAD, and COPD. Although risk factors for SSI occurring in-hospital also include select patient comorbidities, more dominant predictors are perioperative characteristics and complications such as emergency case status, wound class, and respiratory, bleeding and sepsis complications. These results suggest that patient comorbidity is the primary driver of infection and poor wound healing following discharge.

Proven transitional care interventions focused on wound surveillance are lacking; the majority of trialed transitional care models have only been tested or implemented for medical or combined medical/surgical patients.^{3,35–37} Moving forward, effective transitional care models will need to be customized for the surgical population, with an emphasis on wound monitoring. One established intervention that could be adapted is pre-discharge counseling followed post-discharge phone contact, which has been demonstrated by Kind et al³⁶ to decrease readmissions in a Veterans Affairs population by one-third. An alternative method that has been suggested by Fernandes-Taylor and colleagues is to have rapid in-person follow-up within the first week after surgery for a wound examination in order to detect SSI at an early stage.¹² And yet another alternative combines continuous contact with a patient along with early "virtual" follow-up by means of smartphone technology: patients take and transmit secured images of their wounds and symptom-related questions daily for clinician review.³⁸ The implementation of effective transitional care focused on wound management and monitoring holds promise to decrease the burden of severe SSI in vulnerable patients.

We developed a prediction model for risk of SSI after hospital discharge and a corresponding risk scoring system that we believe with further validation can be useful for clinicians and patients for a number of reasons. A scoring system will allow the identification of high-risk individuals using readily available patient information. Additionally, use of a scoring system can assist clinicians inform selected patients of their

risk for developing a wound infection and employ their assistance in wound care. Lastly, a scoring system can define for researchers the patient cohort at high-risk for wound infection allowing the design of patient specific protocols that might be effective in preventing this complication. Nevertheless, whereas our scoring system has been developed on one of the most representative and best-standardized surgical outcomes databases currently available for the U.S. population, we caution against any use in clinical practice until it can be validated through the use of external alternative data sources and independent analyses.

We found 5 factors associated with lower odds of developing post-discharge SSI. These findings were surprising and we can only speculate as why these factors are protective. There may be a selection effect among patients of black race as many African-American patients tend to undergo primary amputation without an antecedent attempt at revascularization;³⁹ this speculation is substantiated as the protective effect of race remained when examining only patients with lower extremity occlusive disease, but was not present when analyzing only AAA patients. Sepsis and renal complications were also protective for post-discharge SSI; these patients are usually under close surveillance after discharge and likely have early follow-up, decreasing the chance of wound infection. Patients who are totally dependent at baseline were protected from post-discharge SSI; these patients, once out of hospital, are also likely to have close follow-up or existing caretakers that can avert wound complications.

We explored the relationship of reoperation to the development of SSI and found that reoperation within 30-days after surgery occurred more than 3 times as often in patients developing SSI after discharge compared to those without post-discharge SSI. Unfortunately in the majority of the patient cohort we were not able to determine the timing of infection versus reoperation, except in 2012 (the final year of data used in our analysis) when this information is available. For patients from this year, the diagnosis of SSI preceded or was made on the same day as reoperation in 75% of patients. In only 25% of patients did the diagnosis of SSI follow reoperation. Thus, it appears that both factors may be in play: reoperation for any reason likely leads to the development of SSI as reopening, remanipulation and possible contamination of the wound certainly has the potential to increase the incidence of infection; and alternatively, reoperation might have been required to treat a wound infection. As NSQIP continues to collect details on “time-to” reoperation, future reanalysis may further enhance a predictive model.

The results of this analysis should be interpreted in the context of several limitations, particularly those related to the database. Even though NSQIP samples from a very large number of hospitals, participation in NSQIP is voluntary and thus may not be representative of outcomes for all U.S. hospitals. Geographic or site-specific information are unavailable; therefore, hospital-type and procedure-volume cannot be examined. Furthermore, certain variables are not captured by NSQIP (e.g. seroma or use of prophylactic antibiotics) and therefore may limit the predictive power of our model. Our identified risk factors for SSI after hospital discharge may not apply to all surgical procedures because we studied only major vascular procedures; these patients have been shown to have exceptionally high rates of SSI and are not representative of the overall surgical patient population.

In conclusion, our risk score prediction model is the first to use known factors at the time of discharge to predict SSI in patients undergoing major vascular surgery. Identifying those patients who require ongoing monitoring after discharge and ensuring that they receive appropriate transitional care may uniquely stem the burden of SSI in this high-risk population.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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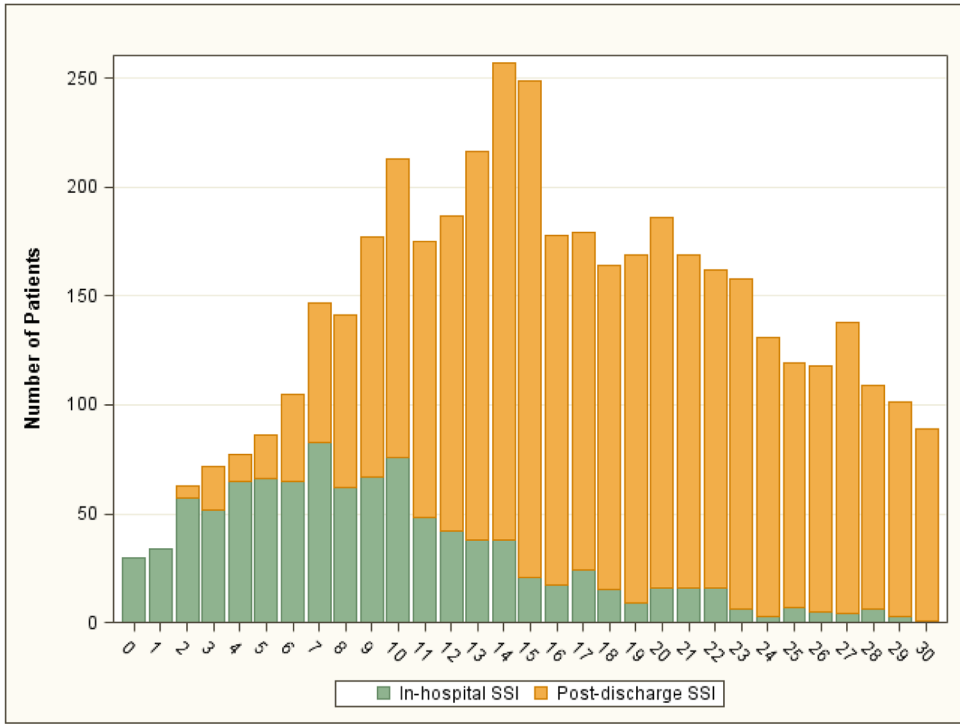


Figure 1. Distribution of the number of days from major vascular surgery procedure to diagnosis of SSI for all patients diagnosed with SSI
A diagnosis occurring while in-hospital is represented in green; a diagnosis occurring after hospital discharge is represented in yellow.
SSI, Surgical site infection

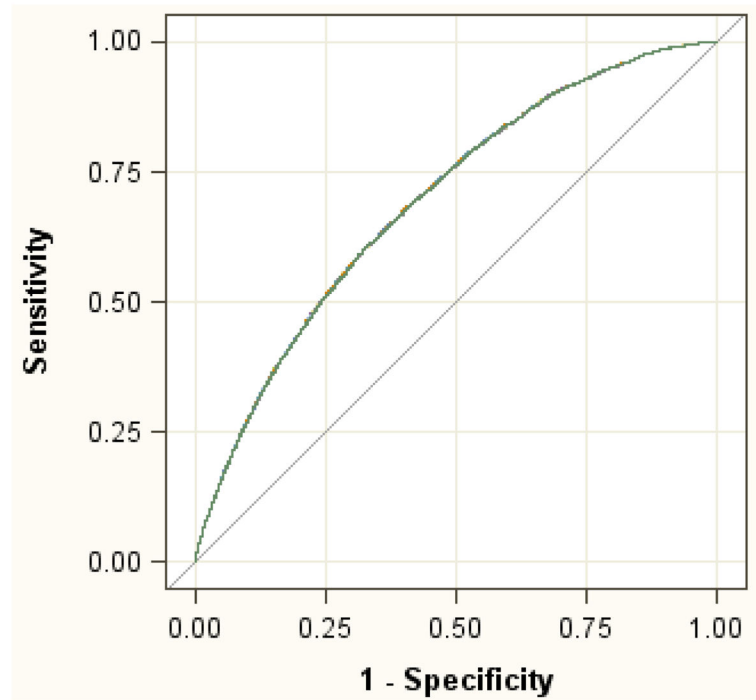


Figure 2.
The receiver operator curve (ROC) of the final model.

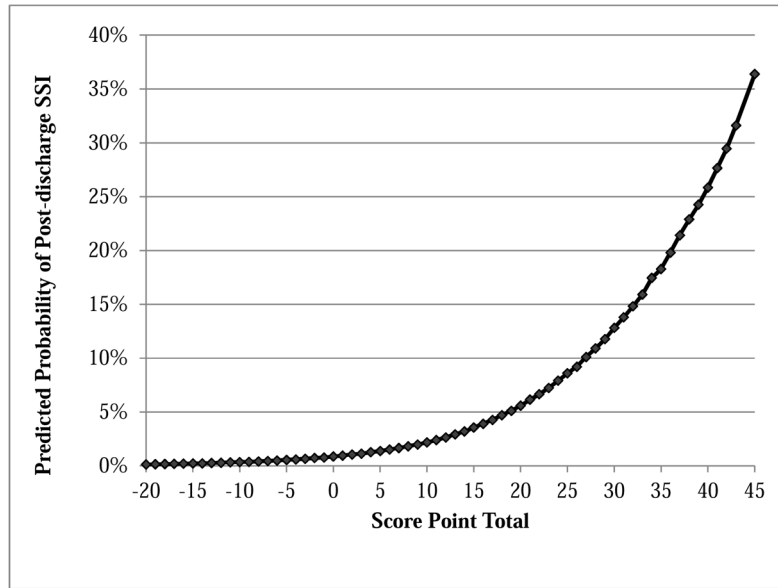


Figure 3. Predicted probability of post-discharge surgical site infection by total point score SSI, Surgical site infection

Table I

Rates of 30-day surgical site infection by operative procedure.

	Open AAA Repair (n=8,866)	Open Aortoiliac Repair (n=13,248)	Lower Extremity Revascularization (n=27,703)
In-Hospital SSI, n (%)	214 (2.4%)	314 (2.4%)	534 (1.9%)
Post-discharge SSI, n (%)	171 (1.9%)	820 (6.2%)	2420 (8.7%)
Overall SSI, n (%)	383 (4.3%)	1128 (8.5%)	2938 (11%)

AAA, Abdominal Aortic Aneurysm

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Table II

Results of multivariable logistic regression analysis for predictors of 30-day post-discharge surgical site infection.

Variables	OR	95% CI	P-value
<i>Demographics</i>			
Female gender	1.4	(1.3, 1.5)	<.0001
Age ≥ 65	0.9	(0.9, 1.0)	.0426
Race:			
White	Reference		
Black	0.8	(0.7, 0.9)	.0002
Other	0.9	(0.8,1.0)	.2041
<i>Comorbidities</i>			
BMI			
Normal	Reference		
Overweight	1.3	(1.2,1.5)	<.0001
Obese	2.3	(2.1, 2.5)	<.0001
Underweight	0.8	(0.7, 1.1)	.1323
Diabetes			
No Diabetes	Reference		
Non-insulin (PO)	1.2	(1.1, 1.3)	.0019
Insulin	1.3	(1.2, 1.4)	<.0001
Smoker	1.2	(1.1, 1.3)	<.0001
Hypertension	1.2	(1.1, 1.4)	.0002
Coronary Artery Disease	1.1	(1.0, 1.2)	.0307
Critical Limb Ischemia	1.2	(1.1, 1.3)	<.0001
Functional status			
Independent	Reference		
Partially dependent	1.1	(1.0, 1.2)	.0856
Totally dependent	0.5	(0.4, 0.8)	.0066
COPD	1.1	(1.1, 1.2)	.0327
Dyspnea			
None	Reference		
Moderate exertion	1.2	(1.1, 1.3)	.0004
At rest	1.2	(0.9, 1.6)	.1457
Neurological Disease	1.1	(1.0, 1.3)	.0088
Bleeding disorder	1.1	(1.0, 1.2)	.1389
Loss of weight	0.7	(0.5, 1.0)	.0627
<i>Perioperative Characteristics</i>			
Emergency Case	1.1	(1.0, 1.3)	.1055
Operation time			

Variables	OR	95% CI	P-value
<4 hours	Reference		
4–6 hours	1.4	(1.3, 1.5)	<.0001
>6 hours	1.5	(1.4, 1.7)	<.0001
Operative Procedure			
AAA	Reference		
Open Aortoiliac	2.4	(1.9, 2.9)	<.0001
Lower extremity revascularization	3.1	(2.5, 3.8)	<.0001
Groin anastomosis	1.2	(1.0, 1.4)	.0110
Graft			
None	Reference		
Vein	0.9	(0.7, 1.1)	.4533
Other than vein	0.8	(0.7, 1.0)	.0717
ASA class:			
I or II	Reference		
III	1.1	(0.9, 1.3)	.4209
IV or V	1.2	(1.0, 1.4)	.0411
Complications			
Renal	0.6	(0.4, 0.9)	.0270
Graft Loss	0.2	(0.0, 1.5)	.1242
Sepsis	0.7	(0.5, 0.9)	.0118
Other Adverse Outcomes			
Prolonged LOS (14-days)	0.4	(0.3, 0.5)	<.0001

The unadjusted area under the receiver operator curve (ROC) of the model (c-statistic) was 0.694 (95% CI: 0.682 – 0.706). The adjusted ROC of the model was 0.691 (95% CI: 0.679 – 0.703).

OR, odds ratio; CI, confidence interval; LOS, Length of Stay; ASA, American Society of Anesthesiologists.

Table III

Risk scores for 30-day post-discharge surgical site infection derived from the multivariate logistic regression final model. The scores were generated as described in the methods.

Variables	Points
Lower extremity revascularization	12
Aortoiliac procedure	9
Obese	9
Operative time >6 hours	5
Female gender	4
Overweight	3
Operative time 4–6 hours	3
Insulin dependent DM	3
Non-insulin dependent DM	2
Smoker	2
Hypertension	2
Critical Limb Ischemia	2
Dyspnea with moderate exertion	2
Groin anastomosis	2
ASA class IV or V	2
COPD	1
Coronary Artery Disease	1
Neurological Disease	1
Age ≥ 65 years	-1
Black race	-2
Sepsis complication	-4
Renal complication	-6
Totally dependent functional status	-6
Prolonged LOS (≥ 14-days)	-9

DM, Diabetes Mellitus; COPD, Chronic Obstructive Pulmonary Disorder; ASA, American Society of Anesthesiologists; LOS, Length of Stay.

Table IVSensitivity and specificity of final predictive model at varying predictive risk thresholds.^a

Predicted Risk	Sensitivity (%)	95% CI (%)	Specificity (%)	95% CI (%)
1%	99	99–100	3.5	3.4–3.7
2%	98	97–98	14	13–14
3%	95	94–95	21	21–22
4%	90	89–91	31	30–31
5%	82	81–84	42	41–42
6%	73	72–75	53	52–53
7%	64	63–66	62	62–63
8%	57	55–58	70	70–71
9%	49	47–51	76	76–77
10%	42	40–43	81	81–82
12%	30	29–32	88	88–89
15%	17	16–18	95	94–95
20%	5.5	4.9–6.5	99	98–99
25%	1.6	1.2–2.0	99	99–100
30%	0.5	0.2–0.7	100	99–100

^a Confidence intervals do not account for the uncertainty derived from development of the final model.*CI*, confidence interval

Table V

Risk score group classification with predicted and actual risk.

Risk category	Points	Predicted risk	Actual risk	Sensitivity	Specificity
Low	< 16	2.1%	2.1%	97%	14%
Low/Moderate	16 – 20	5.1%	5.2%	82%	43%
Moderate/High	21 – 25	7.8%	7.5%	58%	69%
High	> 25	14%	14%	21%	93%

Sensitivity and specificity percentages correspond to predicted risk thresholds.