The challenge of achieving 1% operative mortality for coronary artery bypass grafting: A multi-institution Society of Thoracic Surgeons Database analysis

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Objectives: Cardiothoracic surgical leadership recently challenged the surgical community to achieve an operative mortality rate of 1.0% for the performance of isolated coronary artery bypass grafting (CABG). The possibility of achieving this goal remains unknown due to the increasing number of high-risk patients being referred for CABG. The purpose of our study was to identify a patient population in which this operative mortality goal is achievable relative to the estimated operative risk.

Methods: Patient records from a multi-institution (17 centers) Society of Thoracic Surgeons (STS) database for primary, isolated CABG operations (2001-2012) were analyzed. Multiple logistic regression modeling with spline functions for calculated STS predicted risk of mortality (PROM) was used to rigorously assess the relationship between estimated patient risk and operative mortality, adjusted for operative year and surgeon volume.

Results: A total of 34,416 patients (average patient age, 63.9 ± 10.7 years; 27% [n = 9190] women) incurred an operative mortality rate of 1.87%. Median STS predicted risk of mortality was 1.06% (interquartile range, 0.60%-2.13%) and median surgeon CABG volume was 544 (interquartile range, 303-930) operations over the study period. After risk adjustment for the confounding influence of surgeon volume and operative year, the association between STS PROM and operative mortality was highly significant ($P < .0001$). More importantly, the adjusted spline function revealed that an STS PROM threshold value of 1.27% correlated with a 1.0% probability of death, accounting for 57.3% (n = 19,720) of the total study population. Further, the STS PROM demonstrated a limited predictive capacity for operative mortality for STS PROM > 25% as observed to expected mortality began to diverge.

Conclusions: Achieving the goal of 1.0% operative mortality for primary, isolated CABG is feasible in appropriately selected patients in the modern surgical era. However, this goal may be achieved in only 60% of CABG patients without other improvements in processes of care. Calculated STS PROM can be used to strongly identify patients with estimated mortality risk < 1.27% to achieve this goal, but it appears limited in its predictive capacity for those patients with estimated risk > 25.0%. These data provide a foundation for further study to determine if 1.0% mortality for CABG is achievable nationwide. (J Thorac Cardiovasc Surg 2014;148:2686-96)

See related commentary on pages 2697-8.

Surgical myocardial revascularization with coronary artery bypass grafting (CABG) remains 1 of the most common operations performed in the United States.¹ Over the past few

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decades, the use of CABG for first-line treatment of coronary artery disease has declined as percutaneous coronary intervention (PCI) technology has advanced.² Reduced mortality rates following performance of PCI over CABG as demonstrated in the SYNTAX trial and other series has become central to the argument by many proponents for PCI for coronary disease amenable to both percutaneous and surgical revascularization despite improved long-term outcomes favoring CABG.³ Current estimates of mortality following PCI have been reported at 1%, whereas those for the performance of isolated CABG are approximately 2%.^{1,3} As a result, the surgical community was recently challenged by leadership in the field of cardiothoracic surgery to achieve a 1% mortality rate or less for the performance of isolated CABG operations within the next 3 to 5 years.⁴ Although ambitious, achieving this goal would not only significantly influence the debate regarding choice for PCI versus CABG but would also provide for higher-quality care for hundreds of thousands of US patients annually.

Abbreviations and Acronyms

CABG	= coronary artery bypass grafting
PCI	= percutaneous coronary intervention
PROM	= predictive risk of mortality
RCS	= restricted cubic spline
STS	= Society of Thoracic Surgeons
VCSQI	= Virginia Cardiac Surgery Quality Initiative

The Society for Thoracic Surgeons (STS) maintains a nationwide database of adult cardiac surgeries performed in the United States. Representing the largest clinical database of its kind, the STS National Cardiac Database provides clinicians and researchers the ability to assess risk-adjusted outcomes for several different cardiac operations, including isolated CABG. Furthermore, the STS has developed various risk models for cardiac operations that allow for the prediction of an expected outcome for a patient based on a given set of risk factors.^{5,6} Perhaps the most commonly used STS risk model is that which estimates the predicted risk of mortality (PROM) for individual patients. Adjusting for the prevalence of 30 different demographic, clinical, and operative present-on-admission factors, the STS PROM can be calculated for an individual patient to determine that patient's expected mortality risk.⁷ The use of the STS PROM has been validated and widely accepted by the US cardiothoracic surgery community as a reliable preoperative metric to evaluate patient risk.^{5,8,9} Thus, STS PROM scores should be able to identify patients with expected mortality rates $\leq 1\%$.

The Virginia Cardiac Surgery Quality Initiative (VCSQI) is a voluntary group of 17 different cardiac surgery centers, both academic and private, within the Commonwealth of Virginia. This group holds quarterly meetings to exchange and compare de-identified patient information in an effort to improve cardiac surgical care, quality, and costs. The primary objective of the organization is to identify quality improvement opportunities in cases where high cost, resource intensive, or frequently occurring preventable outcomes might occur. Collectively, the VCSQI centers perform approximately 99% of the cardiac surgeries performed in the Commonwealth, and each center individually contributes patient data to the STS National Cardiac Database.

The purpose of our study was to determine if the challenge to achieve a $\leq 1\%$ operative mortality rate for primary, isolated CABG operations is feasible in the modern surgical area, to identify in which patient populations this mortality goal is achievable relative to estimated operative risk, and to identify patient- and operation-related risk factors that contribute most to mortality among patients where goal mortality was deemed not achievable to discern if certain patients should not be receiving surgical myocardial revascularization.

METHODS

This investigation was exempt from formal institutional review board review at each participating center because it represents a secondary analysis of the VCSQI data registry with the absence of Health Insurance Portability and Accountability Act patient identifiers and because the data is collected for quality analysis and purposes other than research.

Patients and Data Acquisition

De-identified patient-level data were obtained from the VCSQI database for the study period January 1, 2001, through June 30, 2012. All records included patients undergoing primary, isolated CABG operations (STS procedure type "CAB Only" and incidence type "First Cardiovascular Surgery"). All CABG procedures represent standard surgical approaches to surgical myocardial revascularization with and without the use of cardiopulmonary bypass support. Patient preoperative risk was assessed by prevalence of patient comorbid disease, extent of coronary artery disease, operative status, and individually calculated STS PROM score.

Measured Outcomes

The primary outcomes of interest was the risk-adjusted association between the probability of death (operative mortality) and STS PROM score to identify in which patients a predicted probability of death $< 1\%$ could be achieved. Secondary outcomes included estimated risk-adjusted associations between CABG mortality and established patient risk factors used to calculate the STS PROM score as well as several process of care measures endorsed by the STS and National Quality Forum. Operative mortality was defined as all patient deaths occurring during hospitalization as well as those within 30 days of the date of surgery despite discharge status. Standard STS clinical definitions for all analyzed variables were used.¹⁰

Statistical Analysis

Descriptive statistics. All statistical analyses were designed to test the null hypothesis that operative mortality following primary, isolated CABG would not be significantly associated with calculated STS PROM score. Study outcomes and data comparisons were established a priori before data collection. Categorical variables are expressed as standard group percentages, whereas continuous variables are expressed as either mean $\pm$ standard deviation or median (25th, 75th percentile) depending on overall variable distribution. Descriptive, univariate statistics included either Pearson χ^2 or Fisher exact test for categorical variables and either independent sample single factor analysis of variance for comparisons of normally distributed data or the Wilcoxon rank sum test for nonnormally distributed data comparisons. Calculated test statistics were used to derive all 2-tailed *P* values with standard statistical significance set to $\alpha < 0.05$.

Estimated mortality risk and surgeon volume measurement. STS PROM was analyzed as a continuous function, using restricted cubic spline (RCS) smoothing transformations to account for both linear and nonlinear associations with operative mortality. RCS functions are beneficial because they use all data points to estimate the shape of the relationship between an exposure (STS PROM) and an outcome (operative mortality). The use of RCS transformations, therefore, provides a more robust method to determine if nonlinear relationships exist between a continuous variable and a dependent outcome. Use of RCS forces the tails of a function to be linear, which simplifies the representation. In these analyses, an RCS function was developed for both STS PROM and individual surgeon volume using a total of three knots placed at the 5th, 50th, and 95th percentiles of the distribution of both STS PROM and surgeon volume to define the tails of each function.

Hierarchical regression models. Hierarchical multiple regression models were used to estimate confounder-adjusted associations between calculated STS PROM score and the probability of operative mortality for patients undergoing primary, isolated CABG operations. In

addition, similar models were used to estimate the relative predictive capacity of established patient- and operation-level risk factors on the probability of death among 2 different study cohorts based on an identified threshold value for STS PROM at which the probability of death is <1% to identify which factors appear to influence mortality the greatest in those where goal mortality is deemed achievable.

Hierarchical multiple regression models were used to account for potentially overdispersed variance estimates associated with correlated events within hospitals. Use of such multilevel models has been shown to avoid overestimation of the statistical significance of association between modeled covariates, such as STS PROM or surgeon volume, compared with the use of conventional statistical modeling technique. Clustering at the hospital level was considered in the hierarchical structure of each logistic regression model to account for the potential confounding influence of differences in individual hospitals (eg, differences in hospital volume). Model covariates were selected a priori and were considered potential confounders for the influence of STS PROM on patient death. Performed models for the association between estimated patient risk and the dependent outcome of operative mortality were adjusted for the potential confounding influence of individual surgeon experience on patient outcomes by inclusion of surgeon operative volume during the study period as well as the influence of baseline changes in practice over the study period by inclusion of operative year. Confounder-adjusted measures of association are reported with a 95% confidence interval for all regression models.

Model parameter significance. The statistical significance of the association between STS PROM and operative mortality was measured using 2 different tests. The overall statistical significance of the relationship between STS PROM and mortality was measured using the nested model log-likelihood test, which compares the total log-likelihood obtained by the model to that obtained by an otherwise identical model, excluding the STS PROM measure. The difference in model log-likelihood yields a test statistic with a χ^2 distribution with degrees of freedom equal to the number of parameters associated with the volume measure. The statistical significance of each STS PROM measure term in the models and terms for all other model factors for each of the fixed effects included in the models was assessed using the factors model effect size or likelihood ratio (Wald statistic). The likelihood ratio obtained for each modeled factor was used to determine the relative predictive strength of each factor on mortality risk. Relative differences in the overall contribution of each factor to the prediction of mortality in each study cohort was assessed by plotting the likelihood ratios.

Model performance. Model performance was assessed using the *C* statistic and the Nagelkerke Pseudo R^2 statistic. The *C* statistic is equivalent to the area under the receiver operating characteristic curve for models with a dichotomous response variable, and it provides an estimate of the model's ability to discriminate between observed instances of death and survival. A value of 0.5 indicates that the model provides predictive discrimination equal to chance, whereas a value of 1.0 indicates perfect discrimination between dependent outcomes. The Nagelkerke Pseudo R^2 statistic is a log-likelihood ratio χ^2 based measure that is analogous to the R^2 statistic in ordinary multiple regression. The Nagelkerke Pseudo R^2 statistic theoretically changes from 0 for models that provide no predictive information to 1 for models that predict perfectly. Model calibration was assessed using the Hosmer-Lemeshow χ^2 test statistic. All statistical analyses were conducted using R statistical software, version 2.12.1 (R Foundation for Statistical Computing, Vienna, Austria).

RESULTS

Patient Characteristics and Operative Features for Primary, Isolated CABG

Table 1 displays descriptive statistics and frequencies for select patient risk factors used to derive the STS PROM score for isolated CABG operations. For the entire patient cohort, operative mortality following primary, isolated

TABLE 1. Frequency of select patient risk factors used to estimate Society of Thoracic Surgeons predicted risk of mortality (STS PROM)

Variable	Result	%
Operative mortality	666	1.9
Median STS PROM, %	1.1 (0.6, 2.1)	
Surgeon volume	544 (303, 930)	
Age, y	63.9 $\pm$ 12.2	
Gender		
Male	25,226	73.3
Female	9190	26.7
Weight, kg	86 (75, 99)	
Height, cm	173 (165, 180)	
Diabetes	13,540	39.3
Dialysis	831	2.4
Chronic lung disease		
Mild	3416	9.9
Moderate	1788	5.2
Severe	863	2.5
Immunosuppression	685	2.0
Peripheral vascular disease	4934	14.3
Cerebrovascular disease	4616	13.4
Cerebrovascular accident	1920	5.6
Myocardial infarction	7576	22.0
Heart failure	4071	11.8
New York Heart Association functional class		
I	1622	4.7
II	5961	17.3
III	9665	28.1
IV	3873	11.3
Atrial fibrillation	1385	4.0
Number of diseased vessels		
One	1407	4.1
Two	26,782	77.8
Three	6155	17.9
Ejection fraction, %	55 (45, 60)	
Status		
Elective	13,921	40.4
Urgent	19,288	56.0
Emergent	1207	3.5

Values are given as n, median (25th, 75th percentile), mean $\pm$ standard deviation. STS PROM, Society of Thoracic Surgeons predicted risk of mortality.

CABG operations was 1.9% and overall median STS PROM was 1.1%. Overall median individual surgeon volume over the entire study period was 544 operations, with the highest volume surgeons (95th percentile) performing a median of 1434 isolated CABG operations. Similar distributions in overall cardiac surgical volumes were apparent for individual surgeons, suggesting that isolated CABG volumes correlated with overall surgeon volume during this study period. Average patient age was 63.9 years, and the large majority of patients (73%) were men. Diabetes was the most prevalent comorbid disease, occurring in 39% of patients. With respect to preoperative cardiac status, a majority of patients presented with New York Heart Association functional class II or III, underwent myocardial

FIGURE 1. Histograms displaying the distribution of Society of Thoracic Surgeons predicted risk of mortality (STS PROM). A, Overall STS PROM distribution. B, STS PROM 0% to 10%. C, STS PROM 10% to 25%. D, STS PROM 25% to 50%.

revascularization for 2-vessel coronary artery disease, and underwent operations in either an elective or urgent setting.

Adjusted Relationship Between Probability of Death and Estimated Mortality Risk

To identify a potential patient population in whom a 1% CABG mortality rate may be achievable, the relationship between observed mortality and estimated mortality risk using the STS PROM score was explored. Figure 1 displays the overall distribution of STS PROM scores for the entire patient population (Figure 1, A), those with scores ranging from 0% to 10% (Figure 1, B), those with scores ranging from 10% to 25% (Figure 1, C), and those with scores >25% (Figure 1, D). As expected, STS PROM scores were nonnormally distributed with a prominent right ward skew in the distribution of scores. Considering these findings, operative mortality was modeled as a function of STS PROM with RCS transformations as both linear and nonlinear terms, adjusted for the confounding influence of

individual surgeon volume (with RCS transformations) and operative year (Table 2). As a result, the association between STS PROM and operative mortality was highly significant ($P < .0001$) (Figure 2, A). More importantly, the adjusted spline function revealed that an STS PROM threshold value of 1.27% correlated with a 1.0% probability of death (Figure 2, B), which accounted for 57% ($n = 19,720$) of the total study population. Further examination of this relationship revealed that the STS PROM demonstrated a limited predictive capacity for operative mortality for STS PROM > 25% because the relationship between expected mortality and the probability of death began to diverge with widening confidence intervals.

The statistical performance of this regression model achieved adequate discrimination with a C statistic = 0.81. The model explained 16% of the variance in operative mortality as reflected by a Nagelkerke Pseudo R^2 value of 0.16. Model calibration was adequate across deciles of observed risk as reflected by Hosmer-Lemeshow $P < .05$.

TABLE 2. Multivariable logistic regression results for operative mortality modeled as a function of Society of Thoracic Surgeons predicted risk of mortality (STS PROM) (with restricted cubic splines), surgeon operative volume (with restricted cubic splines), and operative year.* Ranked by covariate likelihood ratio (Wald χ^2 test statistic)

Covariate	Likelihood ratio (Wald χ^2)	Odds ratio (95% confidence interval)	P value
STS PROM (linear)	846.7	1.89 (1.68-2.09)	<.0001
STS PROM (nonlinear)	251.5	6.59 (5.35-8.12)	<.0001
Operative year (reference = 2005)	46.3		<.0001
2001		0.38 (0.15-0.96)	
2002		0.92 (0.55-1.53)	
2003		1.15 (0.72-1.83)	
2004		0.72 (0.49-1.07)	
2006		0.92 (0.67-1.28)	
2007		0.90 (0.65-1.24)	
2008		1.43 (1.04-1.97)	
2009		1.79 (1.32-2.43)	
2010		1.46 (1.06-2.01)	
2011		1.27 (0.90-1.78)	
2012		1.34 (0.75-2.39)	
Surgeon operative volume (linear)	16.3	0.31 (0.47-0.15)	.0003
Surgeon operative volume (nonlinear)	0.8	0.73 (0.62-0.86)	.36

STS PROM, Society of Thoracic Surgeons predicted risk of mortality. *Model performance characteristics: C statistic = 0.81, Nagelkerke Pseudo R^2 = 0.16.

Comparison of Patient Risk Profiles With Respect to STS PROM Threshold

After empirically testing the adjusted relationship between operative mortality and STS PROM, a threshold value of STS PROM $\leq 1.27\%$ correlated with a desired goal of $\leq 1\%$ operative mortality. Thus, to further characterize patient risk profiles for those projected to achieve goal mortality compared with those who were not, the frequency of patient and operative risk factors were stratified into STS PROM categories: STS PROM $\leq 1.27\%$ and STS PROM $> 1.27\%$ (Table 3). Median STS PROM scores for both cohorts were 0.7% and 2.4%, respectively. Not surprisingly, patients with STS PROM $> 1.27\%$ were older with a higher burden of comorbid disease, reduced cardiac function, an increased burden of coronary artery disease, and more frequent nonelective operations. Mortality was significantly higher in those with STS PROM $> 1.27\%$ (3.7% vs 0.6%; $P < .001$).

Next, the adjusted relationship between operative mortality and patient risk factors and established processes of care was modeled for each STS PROM patient cohort to identify potential patient- and operation-related factors to explain differences in mortality risk. Table 4 displays the relative strength of association between modeled factors and mortality as determined by comparing the likelihood ratios (Wald χ^2). Figure 3 displays dot plots depicting the relative

predictive capacity of each modeled factor for the outcome of operative mortality among STS PROM study cohorts. Among both cohorts process of care measures such as perioperative medication use and cardiac protective medication at discharge were among factors with the strongest association with mortality risk. Similarly, potentially modifiable factors such as heart failure, preoperative renal function, and cerebrovascular disease had significant associations with mortality. Not surprisingly, in the cohort of patients with STS PROM $> 1.27\%$, intra-aortic balloon pump use and previous PCI demonstrated significant relationships with mortality, whereas these factors were not associated with mortality in patients with STS PROM $< 1.27\%$. Model performance within each study cohort was strong with respect to discrimination (C statistic = 0.91 and 0.94), explanation of variance (Nagelkerke Pseudo R^2 = 0.16), and calibration (Hosmer-Lemeshow $P < .05$).

Comparison of Patient Risk Profiles and Factors Between Survivors and Decedents in Patients Above the STS PROM Threshold

Patient risk profiles were compared between survivors and decedents in the cohort of patients with STS PROM scores above the 1.27% threshold to aid in clinical decision making for those where 1% observed mortality is not projected to be achievable (Table 5). In this cohort of patients, decedents expectedly presented with higher preoperative risk and significantly higher median STS PROM scores, were on average older, were likely to be women, and had much higher rates of hemodialysis, peripheral vascular disease, heart failure, advanced New York Heart Association functional class, and emergent operations. Median individual surgeon volume was significantly lower for decedents compared with survivors. Significant differences in the provision of cardiovascular medications at discharge were dramatic between overall survivors and decedents after discharge. Interestingly, no significant differences were observed with respect to preoperative beta-blocker use.

DISCUSSION

Our study reports on current trends in primary, isolated CABG mortality in a large, multi-institutional statewide cohort of patients with a focus of determining whether or not the challenge to achieve an observed mortality rate of $\leq 1\%$ is feasible in the modern surgical era and to identify in which patients this goal may be achieved. To investigate this question, the widely accepted and validated STS PROM score was used to demonstrate a threshold value at which expected mortality risk and adjusted probability of death correlate. Patient risk profiles, operative features, and perioperative processes of care were then examined as a function of this threshold to further identify patient populations where a 1% goal mortality rate may not be achievable. Overall, these novel findings further clarify the feasibility of the

FIGURE 2. Plot of adjusted association between operative mortality and (A) overall restricted cubic spline function for Society of Thoracic Surgeons (STS) predicted risk of mortality and (B) restricted cubic spline function for STS predicted risk of mortality (0%-1.27%).

charge to the cardiothoracic surgery community to reduce CABG and to demonstrate that these goals may be achievable in select patient populations. Further, these results highlight several important implications related to CABG quality assessment and reporting as well as surgical performance standards and process of care.

The principle purpose of our study was to determine if the challenge to achieve a $\leq 1\%$ operative mortality rate for primary, isolated CABG is feasible in the modern surgical era. A reduction in CABG mortality over the past several years has been reported by the STS in several nationwide series.^{1,2,11} In a recent report of national trends in STS CABG outcomes among 1.49 million patients from 2000 to 2009, predicted mortality rates of 2.3% were consistent over the study period, whereas observed mortality rates declined from 2.4% to 1.9%, representing a 24% reduction in relative risk for the performance of CABG over a 10-year period.¹ Considering these trends and that the STS PROM score has been developed and widely accepted as a method of determining surgical risk, our report empirically tested the correlation of STS PROM with adjusted probability of death, taking into account the confounding influence of individual surgeon volume and hospital as well generalized changes in practice pattern over operative years. Our results demonstrate a highly significant association between STS PROM and adjusted probability of death. More importantly, using RCS transformations of the STS PROM function, we demonstrated an important threshold value of STS PROM (PROM = 1.27%) where the adjusted probability of death following CABG could be expected to be $\leq 1\%$. Considering this threshold, the proportion of patients represented in this statewide, multi-institutional patient cohort with STS PROM $\leq 1.27\%$ accounted for 57% of the total study population and demonstrated an observed operative mortality rate of 0.6%. These findings may be extrapolated to suggest that the challenge to achieve $\leq 1\%$ operative mortality

for primary, isolated CABG may be feasible in less than two-thirds of patients requiring surgical myocardial revascularization.

The second purpose of our study was to identify in which patient populations a $\leq 1\%$ operative mortality goal is achievable relative to the estimated operative risk. To answer this question, the established threshold value for STS PROM was used to stratify the study cohort to compare patient risk profiles, operative features, and the role of established perioperative processes of care. Next, all 30 components of the STS PROM score as well as STS and National Quality Forum-approved measures of performance were modeled to determine their relative importance in the prediction of CABG-related mortality. The reported findings demonstrate that those patients in whom goal mortality can be achieved are on average significantly younger, more commonly men, present with a reduced burden of comorbid disease and with superior cardiac function, and undergo significantly fewer emergent operations. Perhaps more significant than these findings were the demonstrated differences in the relative strength of the association among modeled patient risk factors and adjusted mortality risk within each study cohort. Unique in our analyses was the demonstration that within the patient cohort in which goal mortality was deemed not achievable (ie, STS PROM $> 1.27\%$) the relative strength of association between certain risk factors and mortality was much higher than in the cohort in which goal mortality was deemed achievable (ie, STS PROM $\leq 1.27\%$). Thus, although in both cohorts of patients (STS PROM $\leq 1.27\%$ and $> 1.27\%$) process of care measures, including the provision of aspirin and beta-blockers at the time of discharge, were the strongest predictors of mortality, the modeled effect sizes or likelihood ratios within the STS PROM $> 1.27\%$ cohort (Wald statistic = 282 and 133, respectively) were significantly higher than those in the STS PROM $\leq 1.27\%$ cohort (Wald statistic = 57 and 29, respectively). These results imply that there exists

TABLE 3. Comparison of select patient risk factors and processes of care by Society of Thoracic Surgeons predicted risk of mortality (STS PROM) threshold

Variable	STS PROM ≤ 1.27%	STS PROM > 1.27%	P value
Median STS PROM, %	0.7 (0.5, 0.9)	2.4 (1.7, 4.0)	<.001
Age, y	59.0 ± 8.7	70.5 ± 9.4	<.001
Gender			<.001
Male	82.7	60.6	
Female	17.3	39.4	
Weight, kg	90 (79, 102)	81 (70, 93)	<.001
Height, cm	175 (168, 180)	170 (163, 178)	<.001
Diabetes	34.9	45.4	<.001
Dialysis	0.1	5.5	<.001
Chronic lung disease			<.001
Mild	7.6	13.1	
Moderate	2.9	8.2	
Severe	0.8	4.8	
Immunosuppression	0.8	3.6	<.001
Peripheral vascular disease	7.0	24.2	<.001
Cerebrovascular disease	6.7	22.5	<.001
Cerebrovascular accident	2.3	10.0	<.001
Myocardial infarction	15.4	30.8	<.001
Heart failure	4.6	21.6	<.001
New York Heart Association functional class			<.001
I	8.8	6.6	
II	34.5	21.9	
III	46.3	45.2	
IV	10.4	26.3	
Atrial fibrillation	1.8	7.1	<.001
Number of diseased vessels			<.001
One	5.3	2.5	
Two	20.3	14.6	
Three	74.1	82.8	
Ejection fraction, %	55 (50, 60)	50 (40, 60)	<.001
Status			<.001
Elective	46.5	32.3	
Urgent	53.1	60.0	
Emergent	0.4	7.7	
Median surgeon volume	530 (293, 848)	582 (317, 930)	<.001
Operative mortality	0.6	3.7	<.001
Beta-blocker (preoperative)	84.0	81.0	<.001
Beta-blocker (discharge)	91.7	83.2	<.001
Antiplatelet (discharge)	96.5	91.6	<.001
Lipid-lowering medication (discharge)	92.1	82.1	<.001

Values are given as median (25th, 75th percentile), mean ± standard deviation, or %. STS PROM, Society of Thoracic Surgeons predicted risk of mortality.

significant potential for the improvement of CABG mortality through improved efforts to modify practice patterns and optimize perioperative cardiac surgical care.

The third purpose of our study was to identify the patient- and operation-related risk factors that contribute most to mortality among patients where goal mortality was deemed not achievable. This was done to discern if certain patients

should not be receiving surgical myocardial revascularization. The results of these analyses reveal striking differences in patient risk profiles for survivors and decedents in this cohort of patients. Among this seemingly high-risk patient population, the most striking differences between survivors and decedents occurred as a function of estimated mortality risk; individual surgeon operative volume; and in the prevalence of preoperative hemodialysis requirements, preoperative heart failure, and performance of emergent versus nonemergent operations. Specifically, this result suggests that patients and surgeons should be particularly aware of the increased risk of performing isolated CABG operations in patients with STS PROM > 4.6%, patients with preoperative hemodialysis requirements, and patients with poor preoperative cardiac function. More importantly, these findings support the argument that surgeons performing CABG operations for these select patients should not be penalized for disproportionately high mortality rates compared with patients with lower risk profiles.

Critical to the reported results in our study are the methods used to analyze the relationship between the STS PROM score and adjusted probability of death as well as the results of these analyses. In our analyses the choice to model mortality as function of STS PROM was a result of several factors. STS PROM has become a validated and widely accepted tool used by surgeons to identify and predict mortality risk for individual patients. As a result, we wanted to not only quantify the number of patients in Virginia achieving a 1% mortality, but also to verify and demonstrate the reliability of using STS PROM in the future to help predict the potential to achieve this goal. The use of RCS transformations of the STS PROM variable is the most accurate and robust approach to modeling this continuous function because it characterizes the linear and nonlinear components that may exist between the relationship between STS PROM and operative mortality.^{12,13} A common approach used in the cardiac surgery literature is the seemingly arbitrary categorization of STS PROM into discrete categories (ie, quartiles or quintiles).^{9,14,15} This approach presents an inherent methodologic problem as the conversion of continuous data, such as STS PROM, into categorical data results in a crucial loss of information.¹² The segmentation of continuous data is problematic because it discards information in the original variable and requires arbitrarily selected cut points for defining categories and deriving conclusions,¹⁶ ultimately resulting in a loss of explanatory power as the modeled effect of that variable is flat across the range of values included in that category. Thus, if one categorizes STS PROM for CABG into a category that includes scores ranging from 0% to 1.5%, the resultant measure of association will be interpreted as the measure for the entire range of values included in that category. Thus, a distinction in mortality for STS PROM of 0.5% compared with STS PROM of 1.3% could not be drawn. The results of our series

TABLE 4. Comparison of modeled factors for operative mortality ranked by factor likelihood ratio

Model 1: STS PROM $\leq$ 1.27%			Model 2: STS PROM $>$ 1.27%		
Modeled factor	Likelihood ratio	P value	Modeled factor	Likelihood ratio	P value
ASA (discharge)	57.162	.000	ASA (discharge)	282.740	.000
Beta-blockers (discharge)	29.577	.000	Beta-blockers (discharge)	133.420	.000
Heart failure	20.166	.000	Lipid-lowering drug (discharge)	60.160	.000
Lipid-lowering drug (discharge)	17.655	.000	Patient age, y	22.877	.000
Preoperative creatinine level	12.034	.001	Heart failure	15.296	.000
Cardiovascular disease	11.206	.001	Surgeon volume	12.792	.000
New York Heart Association functional class	10.556	.014	Intra-aortic balloon pump	11.652	.001
Patient age, y	5.729	.017	Previous percutaneous coronary intervention	9.197	.002
TV insufficiency	5.272	.261	Cardiovascular disease	6.626	.010
Surgeon volume	4.512	.034	Beta-blockers (preoperative)	6.442	.011
ADP inhibitors	4.270	.039	Stroke	5.456	.019
Beta-blockers (preoperative)	3.177	.075	Diabetes mellitus control	4.647	.200
Diabetes mellitus control	2.986	.394	Timing of myocardial infarction	3.826	.575
IMA use	2.657	.448	TV insufficiency	3.722	.445
AV insufficiency	2.343	.673	Chronic lung disease	3.679	.298
Chronic lung disease	2.019	.568	ADP inhibitors	3.578	.059
MV insufficiency	1.941	.747	Peripheral artery disease	3.355	.067
Race	1.555	.907	Race	2.931	.711
Number of diseased vessels	1.104	.576	Immunosuppression	1.946	.163
Previous percutaneous coronary intervention	1.013	.314	Hemodialysis	1.817	.178
Diabetes mellitus	.857	.355	MV insufficiency	1.539	.820
Timing of myocardial infarction	.848	.974	New York Heart Association functional class	1.424	.700
Stroke	.779	.378	AV stenosis	.827	.363
Height, cm	.767	.381	AV insufficiency	.747	.945
Peripheral artery disease	.411	.521	IMA use	.668	.881
Status	.406	.816	Cardiogenic shock	.406	.524
Intra-aortic balloon pump	.157	.692	Diabetes mellitus	.356	.551
Ejection fraction	.118	.731	Preoperative creatinine level	.243	.622
Weight, kg	.096	.756	Gender	.195	.658
Gender	.025	.874	Ejection fraction	.178	.673
Immunosuppression	.000	.997	Number of diseased vessels	.161	.923
Preoperative inotropes	.000	.997	Preoperative inotropes	.147	.701
AV stenosis	.000	.998	Height, cm	.126	.723
Resuscitation	.000	.998	Resuscitation	.054	.816
MV stenosis	.000	.999	MV stenosis	.039	.843
Previous myocardial infarction	.000	.999	Status	.037	.982
Hemodialysis	.000	.999	Weight, kg	.003	.958
Cardiogenic shock	.000	1.000	Previous myocardial infarction	.000	.999

STS PROM, Society of Thoracic Surgeons predicted risk of mortality; ASA, American Society of Anesthesiologists; TV, tricuspid valve; ADP, adenosine diphosphate; IMA, internal mammary artery; AV, aortic valve; MV, mitral valve.

demonstrate that a significant difference in the adjusted probability of death between such a range of STS PROM scores is not only statistically, but also clinically significant in the context of achieving a goal of $\leq 1\%$ mortality for isolated CABG. Furthermore, the observation in our study that

STS PROM scores $>25\%$ do not appear to correlate well with the probability of death after adjustment for operative year and surgeon volume highlights an apparent limitation of the STS PROM score for very-high-risk patients undergoing isolated CABG operations that surgeons should be

FIGURE 3. Dot plots of likelihood ratios (Wald statistics) for each modeled factor as it relates to the probability of death for patients with (A) Society of Thoracic Surgeons predicted risk of mortality $\leq 1.27\%$ and (B) Society of Thoracic Surgeons predicted risk of mortality $> 1.27\%$. ASA, American Society of Anesthesiologists; CVD, cardiovascular disease; NYHA, New York Heart Association; TV, tricuspid valve; ADP, adenosine diphosphate; DM, diabetes mellitus; IMA, internal mammary artery; AV, aortic valve; MV, mitral valve; PCI, percutaneous coronary intervention; MI, myocardial infarction; PAD, peripheral arterial disease; IABP, intra-aortic balloon pump; EF, ejection fraction.

aware of during preoperative patient counseling and risk assessment.

Our results have significant surgeon- and health care system-related implications. In the current health care environment, many different organizations have become increasingly focused on risk-adjusted outcome reporting and the use of various metrics by which to rank hospitals and providers from a quality performance perspective. Thus, health insurance groups and organizations such as The Leapfrog Group, the National Quality Forum, and the Agency for Healthcare Research and Quality are attracted to easily measurable and identifiable metrics that can be used to base referral patterns and regionalization of medical care. With this in mind, the ambitious goal to achieve a $\leq 1\%$ observed mortality rate for isolated CABG operations may require significant qualification based on the results of our analyses to help guide such groups in the very near future. The fear that generalized adoption of a $\leq 1\%$ mortality rate for the performance of all isolated CABG operations could become a metric by which current and future generations of cardiothoracic surgeons could be held accountable leaves very little room for surgical error and creates an inhospitable environment for new surgeons and surgeons or hospitals that routinely perform operations on high risk CABG patients where the likelihood of achieving an average mortality rate of $\leq 1\%$ is unlikely. Nevertheless, surgeons will undoubtedly be presented with higher-risk patients in whom a 1% operative mortality will be very difficult to achieve but who will nonetheless have a better overall survival with the operation than with alternative forms of treatment, which questions the need to compete with PCI with respect to short-term, periprocedural

mortality. There are also ultra-high-risk patients who may be better candidates for PCI. With this in mind, the development of a surgeon and/or hospital quality index may be beneficial to take into account variations in patient risk profiles for the performance of isolated CABG operations.

Calculated observed to expected ratios are an alternative metric of performance for surgeons and hospitals. We believe that modeling mortality risk while taking into account factors such as surgeon experience (using volume as a surrogate), differences between hospitals, and inherent changes in practice pattern over time provide further insight into the use of commonly available and routinely used clinical tools such as the STS PROM calculator when determining patient mortality risk and assessing surgeon- and hospital-specific quality for the performance of CABG.

The role that various processes of care play in the context of our results deserves special attention. The STS and National Quality Forum have identified several different performance measures and processes of care for the performance of isolated CABG operations.^{17,18} The multidimensional performance measure is composed of 4 different domains consisting of 11 different operative and perioperative cardiac surgery metrics, including use of internal mammary artery grafts and perioperative medication use such as beta-blockers, antiplatelet medications, and lipid-lowering agents. Thus, in the context of our report, the role of these factors as determinants in the achievement of $\leq 1\%$ operative mortality is of critical importance. The results of our analyses demonstrate that among modeled factors for adjusted probability of death, the provision of perioperative medications plays a disproportionate role and that an increase in use of these processes

TABLE 5. Comparison of select patient risk factors and processes of care between survivors and decedents for patients with Society of Thoracic Surgeons predicted risk of mortality (STS PROM) > 1.27%

Variable	Survivors (n = 14,138)	Decedents (n = 549)	P value
STS PROM, %	2.4 (1.7, 3.9)	4.6 (2.7, 9.2)	<.001
Age, y	70.4 ± 9.5	72.3 ± 9.4	<.001
Gender			.08
Male	60.8	57.0	
Female	39.2	43.0	
Weight, kg	81 (70, 92)	80 (67, 92)	.05
Height, cm	170 (163, 178)	168 (160, 178)	.02
Diabetes	45.4	45.5	.93
Dialysis	5.3	11.3	<.001
Chronic lung disease			<.001
Mild	13.1	12.0	
Moderate	8.2	9.5	
Severe	4.6	9.8	
Immunosuppression	3.5	5.8	.005
Peripheral vascular disease	23.9	32.1	<.001
Cerebrovascular disease	22.4	26.2	.04
Cerebrovascular accident	9.9	10.2	.83
Myocardial infarction	30.9	29.7	.57
Heart failure	21.0	37.3	<.001
New York Heart Association functional class			<.001
I	6.7	3.3	
II	22.1	16.5	
III	45.4	38.6	
IV	25.7	41.6	
Atrial fibrillation	6.9	11.1	<.001
Number of diseased vessels			.68
One	2.5	2.4	
Two	14.5	16.6	
Three	82.9	80.9	
Ejection fraction, %	50 (40, 60)	45 (30, 55)	<.001
Status			<.001
Elective	32.7	22.2	
Urgent	60.0	60.8	
Emergent	7.3	16.9	
Surgeon volume	582 (319, 930)	464 (266, 739)	<.001
Beta-blocker (preoperative)	81.8	77.7	.06
Beta-blocker (discharge)	85.8	19.7	<.001
Antiplatelet (discharge)	94.5	21.1	<.001
Lipid lowering medication (discharge)	84.7	19.5	<.001

Values are given as median (25th, 75th percentile), mean ± standard deviation, or %. STS PROM, Society of Thoracic Surgeons predicted risk of mortality.

of care measures may serve as 1 mechanism to further reduce mortality following performance of isolated CABG.

Our results also demonstrate the benefits of statewide and/or regional cardiac surgery quality initiatives to advance goals of the cardiothoracic and medical community. Also highlighted by leadership in the field of cardiothoracic surgery as an essential goal for cardiac surgery,⁴ regional and statewide cardiac surgical quality initiative groups play an important role in helping to define various processes of

care and best practice techniques to affect outcomes and quality care delivered to patients undergoing cardiac surgery. As a result, an important aspect of our study concerned the statewide collaborative effort of the VCSQI to use both clinical and uniform patient-specific financial data to help identify evidence-based best practice models with the goal of improving cardiac surgery outcomes while reducing costs. Through the process of examining the relative effects of various outcomes on cardiac surgical costs and resource use, we have been able to advance several different initiatives aimed to improve overall surgical quality within the Commonwealth of Virginia, including protocols designed to address the negative effect of atrial fibrillation and blood product use.¹⁹ The results of our study, therefore, set the stage for the future development of protocol-driven approaches to reduce complication rates and other identified factors contributing to operative mortality for the performance of primary, isolated CABG operations within VCSQI participating centers to achieve lower mortality rates in an attempt to increase the number of patients where the goal of ≤1% operative mortality can be achieved.

Our study has limitations. First, the secondary analysis of the VCSQI data registry and STS data limited the performed analyses to de-identified data that are nonrandomized. The study design is subject to limitations of inherent selection bias, and the reported results are limited to describe observed associations between factors and outcomes without assessing direct cause and effect relationships. Second, the blinded nature of the data further limited the ability to scrutinize certain surgeon- and hospital-specific details, including differences in individual surgeon experience (ie, years of practice) or surgical volume as a function of university versus community hospital environment. As a result, the opportunity to identify and describe best practice models within participating hospitals is not possible at this time. Third, although the influence of correlated hospital events was modeled as a random effect within the performed hierarchical regression models, the variance attributed to the unique characteristics of participating VCSQI hospitals cannot fully be accounted for in our statistical analysis. In addition, all analyses were limited to short-term, operative outcomes, and intermediate or long-term follow-up data were not available. Finally, the potential for unrecognized miscoding of data must also be considered in any secondary analysis of a data registry.

CONCLUSIONS

Based on reported results, the goal to achieve ≤1% operative mortality for primary, isolated CABG appears feasible in appropriately selected patients in the modern surgical era. However, this goal may be achieved in <60% of CABG patients without other improvements in processes of care. The calculated STS PROM score can be used to strongly identify patients with a threshold value of estimated mortality risk ≤1.27% to achieve this goal. However, the STS PROM

appears limited in its predictive capacity for very-high-risk patients with estimated risk $>25.0\%$. These data provide a strong foundation for further study to determine if $\leq 1\%$ mortality for CABG is achievable nationwide.

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Discussion

Dr Todd Rosengart (Houston, Tex). Congratulations on an excellent study and thank you for allowing me to see your manuscript in advance. This is important work and you present very interesting results.

One of the most striking findings of your study is the apparent implication of the failure to prescribe statins, beta-blockers, and aspirin before discharge. Dr Ralph Damiano was perhaps the first to suggest that maybe the greatest priority of an organization such as American Association of Thoracic Surgery and Society of Thoracic Surgeons should be to focus on a “get with the guidelines” campaign to improve outcomes, similar to the American Hospital Association program. Based on your analysis, do you think improvements in the rates of drug administrations would have affected outcomes?

Dr LaPar. When we modeled out all 30 different variables that go into calculating the Society of Thoracic Surgeons predicted risk of mortality score, took into account individual surgeon volume, and the accepted process of care measures for coronary artery bypass grafting, we found that beta-blockers, statins, and aspirin actually had the highest strength of association with predicted mortality rate in both of our cohorts and, in fact, that strength of association was significantly stronger in the cohort of patients with higher risk. So absolutely process of care measures are something we need to focus on if we are going to attempt achieving the $<1\%$ mortality goal in all of our efforts to reduce mortality related to coronary artery bypass grafting.

Dr Rosengart. Although the ambitious goal of $<1\%$ mortality across the board is certainly admirable, it would be difficult to expect that patients with predicted mortality of 25% or higher where even the predicted risk of mortality analysis becomes unpredictable of outcome could be taken care of with $<1\%$ mortality. You mentioned that 60% of a target population might be appropriate for a targeted 1% mortality outcome, but will you comment further on those highest-risk patients? What percentage of the population were they and what were the implications of accepting the fact that these clearly are not patients who can undergo surgery due to their low expected mortality rates?

Dr LaPar. I think that is an essential point. One of the things we were concerned about initially was exactly how many patients were actually going to be able to achieve this end point, because a number of institutions within our quality initiative (as well as many represented here) do in fact operate on patients who are at significantly higher risk. That has notable policy implications. We need to be very careful that we do not set ourselves up to have hospitals referring more and more patients with higher risk to some of the institutions represented in our analysis while we are charged with trying to achieve a very low mortality rate. It may not be achievable in those patients.

Dr Rosengart. I was hoping you could comment further on the implications of surgeon and institution case volume. It clearly was not as significant a factor as drug administration, but did you do any further subanalyses to look at the implication?

Dr LaPar. We did not do any specific subgroup analyses looking at surgeon volume. We did demonstrate a significant relationship between surgeon and institution volume. We included a smoothing function and we believe that surgeon experience and surgeon volume clearly are important.

It would be interesting to look at surgeon experience over time—because surgeons get better as they advance through their careers—to see where that correlates with predicted risk and these goals. We plan to look at that in the future.