# SPECIAL ARTICLE

# Identification of Variables Needed to Risk Adjust Outcomes of Coronary Interventions: Evidence-Based Guidelines for Efficient Data Collection

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*Objectives.* Our objectives were to identify and define a minimum set of variables for interventional cardiology that carried the most statistical weight for predicting adverse outcomes. Though "gaming" cannot be completely avoided, variables were to be as objective as possible and reproducible and had to be predictive of outcome in current databases.

*Background.* Outcomes of percutaneous coronary interventions depend on patient risk characteristics and disease severity and acuity. Comparing results of interventions has been difficult because definitions of similar variables differ in databases, and variables are not uniformly tracked. Identifying the best predictor variables and standardizing their definitions are a first step in developing a universal stratification instrument.

*Methods.* A list of empirically derived variables was first tested in eight cardiac databases (158,273 cases). Three end points (in-hospital death, in-hospital coronary artery bypass graft surgery, Q wave myocardial infarction) were chosen for analysis.

Comparison of outcomes of coronary interventions from different medical centers requires consideration of the risk characteristics of the different patient populations served as well as the severity and acuity of the disease itself (1–3). In addition, accurate evaluation of the anticipated risk of a procedure is essential for planning treatment strategies (4). Comparing the results obtained in various databases (1,5-9)has been difficult because the definitions of seemingly similar

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Univariate and multivariate regression models were used to quantify the predictive value of the variable in each database. The variables were then defined by consensus by a panel of experts.

*Results.* In all databases patient demographics were similar, but disease severity varied greatly. The most powerful predictors of adverse outcome were measures of hemodynamic instability, disease severity, demographics and comorbid conditions in both univariate and multivariate analyses.

*Conclusions.* Our analysis identified 29 variables that have the strongest statistical association with adverse outcomes after coronary interventions. These variables were also objectively defined. Incorporation of these variables into every cardiac dataset will provide uniform standards for data collected. Comparisons of outcomes among physicians, institutions and databases will therefore be more meaningful.

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variables differ (3), and the variables are not uniformly tracked. Standardizing variable definitions as well as identifying variables that carry most of the statistical weight in the analysis would be an important first step in developing a minimum dataset. This principle has been developed for cardiac surgery by Jones et al. (10). This report identifies a standardized stratification instrument that should be captured by databases designed to assess performance of catheter-based coronary interventions.

## **Methods**

A working group with expertise in epidemiology, biostatistics and coronary interventions was convened to develop and define a list of variables relevant to coronary interventional procedures. Variables to be tested were proposed by the participants on the basis of empirical results from individual databases and knowledge of published scientific reports.

**Databases used.** Eight databases ranging in size from 2,431 to 66,358 cases were used for this analysis (Table 1). Five of the eight databases were single- or multi-institutional clinical

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#### Abbreviations and Acronyms

- CABG = Coronary artery bypass graft surgery
- CCP = Cooperative cardiac project
- MI = myocardial infarction
- PTCA = percutaneous transluminal coronary angioplasty

databases including all types of coronary interventional cases performed between 1990 and 1996. The National Heart, Lung, and Blood Institute (NHLBI) database was a multi-institution registry performed during 1985 to 1986. The New Approaches to Cardiac Intervention (NACI) Registry database was a multi-institutional clinical registry that included cases involving newer coronary interventional device technologies other than conventional balloon angioplasty only. The Cooperative Cardiac Project (CCP) database was a multi-institutional database limited to patients  $\geq$ 65 years undergoing coronary interventional procedures. In total, our final analysis dataset included 158,273 cases.

**Definition of variables.** Whenever possible, variables were defined similarly to those used in the Cooperative CABG [coronary artery bypass graft surgery] Database Project (10). For the remainder, definitions were developed by consensus of the working group. Definitions were written to be objective in an effort to minimize "gaming." Nevertheless, variables for potential subjective interpretation include unstable angina, Canadian Cardiovascular Society (CCS) class, congestive failure and urgency of the procedure. Three end points were chosen: 1) *In-hospital death* (death within the same hospital period from any cause after a coronary interventional proce-

Table 1. Databases Used For Analyses

Database (acronym)	Duration of Study (yr)	No. of Pts	Description
National Cardiovascular Network (NCN)	1994–96	66,358	Multicenter registry
National Heart, Lung and Blood Institute Coronary Angioplasty Registry (NHLBI)	1985–86	2,431	Multicenter registry
New Approaches to Coronary Intervention Registry (NACI)	1990–94	3,561	Multicenter registry (new devices only)
New York State Cardiac Database (NY)	1994	18,558	Multicenter registry
Society for Coronary Angiography and Intervention Registry (SCAI)	1993–95	31,455	Multicenter registry
Duke Cardiovascular database (Duke)	1991–95	9,462	Single-center registry
Northern New England Cardiac database (NNE)	1987–96	23,252	Multicenter registry
Cooperative Cardiac Project database (CCP)	1994–95	3,196	Multicenter registry (pts ≥65 yr old)

Pts = patients.

dure). "Cardiac death" was considered but is more subjective, leading to possible "gaming" (11). 2) *In-hospital CABG* (any CABG during the same hospital period as the coronary intervention). This end point includes "elective" CABG done after an intervention. 3) *Q wave myocardial infarction* (MI) (new Q waves in two contiguous electrocardiographic leads and a twofold increase in serum creatine kinase levels within the same hospital period as the coronary intervention). Non–Q wave MI was not used because of the wide variability of definitions for this entity in existing databases.

Within each database attempts were made to match existing variable definitions to those set forth by the working group. If a database manager considered that a database variable definition differed significantly, it was not included in the analysis. The availability of predictor variables varied among databases. Missing data were handled by sites in one of two ways: If the variable was missing in >50% of cases within a database, it was deleted from analysis. If the variable was missing in a minority of cases, it was imputed to the median for continuous variables and the lowest risk category for categoric data (e.g., missing ejection fractions at Duke were replaced with a score of 56 [the median ejection fraction for the Duke data], whereas missing comorbid variables [e.g., renal insufficiency] were imputed to the "none" level). These imputation methods are conservative and tend to underestimate the predictive power of a variable. For outcomes, all databases had information on in-hospital death and CABG; only four had information on in-hospital Q wave MI. We also tested whether a variable's effect on outcome varied among the eight data sources using a standard test for homogeneity (12).

Univariate analysis. The first step was to construct univariate logistic regression models predicting each of the three outcomes. Each database reported univariate coefficients and standard errors for each variable. To consolidate this large amount of information, these estimates were then combined using meta-analytic methods. The databases were independently analyzed, and then pooled odds ratios from these analyses were developed. Specifically, using a random-effects empirical Bayes methodology model, we calculated a "pooled estimate" for the univariate odds ratio and the confidence interval surrounding these point estimates. This randomeffects model provides a more conservative estimate of a variable's effect on outcome (13,14).

**Multivariate analysis.** Because many of the candidate variables describe similar aspects of the patients' disease, multivariate logistic regression models were next used to distinguish between "competing" specifications of risk. Each database was asked to place all the variables it had collected into a "full" model and report the coefficients and standard errors for each variable. After fitting this model, each database used an automated stepwise selection algorithm to fit a smaller "stepwise" model that contained only variables significant at an alpha level of 0.05. Finally, to better assess the discrimination abilities of the variables in question, the C-index or area under the ROC curve was computed for each full and stepwise multivariate model (15).

Table 2. Baseline Characteristi	CS
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Variable	Overall Weighted Mean	Minimum Site	Maximum Site
Median age (yr)	62.2	58.0	71.0
Gender (% male)	68.1	57.0	74.5
Median height (cm)	171.5	170.0	173.0
Median weight (kg)	80.5	77.0	82.0
Race/ethnicity			
Black	4.0	4.4	11.0
White	91.6	85.0	95.1
Other	2.0	0.2	4.2
Median LVEF	56.7	51.0	60.0
No. of vessels stenosed $>70\%$			
1	62.1	52.5	67.9
2	24.8	22.1	29.0
3	12.1	9.6	17.5
Unstable angina	51.1	28.9	71.8
CCS class			
0	6.9	0.7	21.0
Ι	9.1	1.4	15.8
II	16.8	7.0	39.1
III	37.1	16.0	64.9
IV	30.1	6.9	49.0
CHF	7.0	4.0	14.7
AMI			
None	50.5	50.4	90.3
<24 h	6.0	0.7	12.4
1–7 days	13.6	6.0	28.0
>7 days	31.0	3.0	71.2
IV NTG	26.7	17.9	33.8
Hemodynamically unstable	2.7	2.0	5.8
Cardiogenic shock	0.7	0.2	2.5
Preprocedural IABP/CPS	1.9	0.7	3.5
Acuity			
Elective	54.8	35.2	90.5
Urgent	38.9	2.0	57.9
Emergent	6.3	1.2	9.5
VT	2.1	2.1	2.1
Ao valve disease	0.1	0.1	0.4
MR	2.3	0.5	9.0
Diabetes	20.3	13.5	24.0
PVD	7.8	7.0	8.1
Carotid disease	7.3	7.0	8.0
Stroke	5.6	2.6	8.5
Renal failure (dialysis)	0.8	0.2	1.8
HIN	49.2	41.8	63.0
Smoking	34.7	17.5	70.8
COPD	7.6	4.4	11.5
Cholesterol >225 mg/dl	49.9	32.9	57.8
No. of prior PTCA			
0	63.0	60.9	100.0
1	26.7	20.2	34.0
>2	10.3	0.0	18.9
Prior heart operation	13.9	3.0	35.6
Prior PTCA same vessel	17.6	0.0	29.6
Lytic Rx within 6 days	7.5	3.9	9.6
PTCA same time as cath	28.0	24.2	34.6
No. of lesions/vessels attempted		_	
1	78.2	56.2	90.4
>2	21.8	9.4	43.8

Table	2.	Continued
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Variable	Overall Weighted Mean	Minimum Site	Maximum Site
Highest lesion type (ACC/AHA)			
А	26.2	11.3	34.6
В	59.1	55.9	68.1
С	14.7	9.2	22.3
LMCA attempted	5.4	0.4	13.0
Vein graft attempted	6.0	0.8	25.3
Thrombus	17.0	15.8	17.2
Lesion length	7.8	7.8	7.8
Ca in lesion	20.4	13.0	25.4

ACC = American College of Cardiology; AHA = American Heart Association; AMI = acute myocardial infarction; Ao = aortic; Ca = calcium; Cath = catheterization; CCS = Canadian Cardiovascular Society; CHF = congestive heart failure; COPD = chronic obstructive pulmonary disease; CPS = cardiopulmonary support device; HTN = hypertension; IABP = intraaortic balloon pump; IV NTG = intravenous nitroglycerin; LMCA = left main coronary artery disease; LVEF = left ventricular ejection fraction; MR = mitral regurgitation; PTCA = percutaneous transluminal coronary angioplasty; PVD = peripheral vascular disease; Rx = therapy; VT = ventricular tachycardia.

As part of an international conference to further the development of data standards held in Bethesda, Maryland on June 27 to 28, 1996, the variables were reviewed to create explicit, objective definitions of each variable by consensus.

#### Results

Baseline demographics, disease severity and comorbidity characteristics of the 158,273 cases entered into the eight databases are shown in Table 2. Patient demographics were similar, but disease severity varied greatly among databases (e.g., the proportion of patients with triple-vessel disease ranged from 9.6% to 17.5%, acute MI within 24 h from 0.7% to 12.4% and congestive failure from 4.0% to 14.7%). Significant variability existed among the more subjectively defined variables (e.g., the frequency of unstable angina at the time of procedure varied from 9.6% to 71.8%, and procedures classified as "urgent" varied from 2.0% to 43.1%). For the three outcomes, overall rates were similar across databases (Table 3). The one exception to this was a generally higher event rate

Table 3.	Outcomes	by	Database
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Database	In-Hospital Death (%)	In-Hospital CABG (%)	Q Wave MI (%)
NCN	1.3	2.1	1.0
NHLBI	1.4	6.0	_
NACI	1.3	2.4	1.1
NY	0.9	3.2	_
SCAI	0.4	2.2	1.0
Duke	1.1	2.4	_
NNE	1.1	2.8	1.7
CCP	3.5	3.3	1.4

CABG = coronary artery bypass graft surgery; MI = myocardial infarction; other abbreviations as in Table 1.

 Table 4. Significant Univariate Predictors of In-Hospital Death

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Table 5. Significant Univariate Predictors of 1	In-Hospital	CABG
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		No. of Sites	5
	No. of Sites	Signif	Pooled Univariable
Variable	Tested	Predictor	OR (95% CI)
Age (per 10-yr inc)	8	8	1.84 (1.67–2.02)
Gender (% male)	8	8	0.57 (0.47-0.70)
Height (per 10-cm inc)	7	4	0.85 (0.75-0.90)
Weight (per 10-kg inc)*	7	5	0.79 (0.72-0.89)
LVEF (per 10% dec)	7	7	1.89 (1.79-2.00)
No. of diseased vessels*			
2 vs. 1	7	5	1.93 (1.47-2.54)
3 vs. 1	7	7	4.26 (3.09-5.88)
CHF	8	8	4.41 (2.67–7.27)
AMI*			
None vs. <24 hr	5	4	8.34 (5.26-13.22)
None vs. 1–7 days	7	5	2.43 (1.37-4.30)
IV NTG	2	2	3.40 (2.72-4.25)
Hemodynamically unstable	2	2	15.12 (10.26-22.28)
Acuity			· · · · · · · · · · · · · · · · · · ·
Elective vs. urgent	4	3	5.38 (1.33-21.83)
Elective vs. emergent	5	5	8.00 (6.88-9.30)
Cardiogenic shock	4	4	37.88 (25.47–56.34)
Preprocedural IABP/CPS*	5	5	15.19 (9.75-23.70)
VT	2	2	25.23 (8.83-72.15)
MR	2	2	5.97 (4.02-8.87)
Diabetes	8	6	1.83 (1.57-2.14)
PVD	4	4	2.16 (1.78-2.63)
Carotid disease	4	4	1.91 (1.42-2.58)
Stroke*	3	2	4.47 (1.10-18.20)
Renal failure (dialysis)	5	4	5.30 (3.56-7.89)
Creatinine >2.0 mg/dl*	4	4	2.64 (1.32-5.30)
Smoking	6	2	0.69 (0.55-0.87)
Any prior coronary interventions	4	2	0.79 (0.68-0.91)
Prior heart operation	7	4	1.50 (1.22–1.84)
Thrombolytic Rx within 6 days	4	4	1.75 (1.37-2.30)
Highest lesion type (ACC/AHA)			
A vs. B	4	2	1.58 (0.97-2.60)
A vs. C	4	3	3.50 (1.83-6.68)
LMCA attempted	5	2	2.56 (1.02-6.44)
Vein graft attempted	4	4	2.75 (2.14-3.53)
Thrombus	3	3	2.87 (1.69-4.88)

\*Indicates variables for which the test for homogeneity was p < 0.01, indicating variability in effect size across individual sites. CI = confidence interval; dec = decrease; inc = increase; OR = odds ratio; Signif = significant; other abbreviations as in Table 2.

in the CCP database, reflecting the inclusion of only older patients in this database.

Univariate predictors of events. Tables 4, 5 and 6 display the significant univariate predictors of in-hospital death, inhospital CABG and in-hospital Q wave MI, respectively. The tables display the number of sites for which the variable was tested, the number of databases for which the variable was significant at the p < 0.05 level and the overall pooled univariable odds ratio and 95% confidence interval around this odds ratio. We indicate for which variables the test for homogeneity of risk effect was p < 0.001. In-hospital death had the highest number of clinical predictors and measures of hemodynamic instability (e.g., cardiogenic shock and use of an intraaortic

		No. of Sites	Pooled
	No. of Sites	Signif	Univariable OR
Variable	Tested	Predictor	(95% CI)
LVEF (per 10 inc)	6	2	0.90 (0.82-0.99)
CCS class			
1 vs. 2	3	1	0.67 (0.53-0.83)
1 vs. 3	4	1	0.84 (0.63–1.12)
1 vs. 4	4	3	0.84 (0.40-1.43)
AMI			
None vs. <24 h	4	3	2.15 (1.57-2.95)
None vs. 1–7 days	3	1	1.22 (1.03–1.43)
IV NTG	1	1	1.76 (1.46-2.12)
Hemodynamically unstable	2	2	6.67 (4.56–9.74)
Acuity			
Elective vs. urgent	3	2	1.37 (1.17–1.61)
Elective vs. emergent	2	1	5.82 (4.88-6.93)
Cardiogenic shock	4	3	4.72 (2.47–9.00)
Preprocedural IABP/CPS	3	3	9.12 (4.06-20.50)
VT	1	1	2.05 (1.35-3.13)
MR	2	2 (pooled)	1.38 (1.03–1.85)
COPD	4	1	1.36 (1.16-1.60)
Cholesterol >225 mg/dl	2	1	0.78 (0.69-0.90)
Any prior coronary interventions	3	2	0.66 (0.58-0.74)
Prior heart operation	6	5	0.59 (0.42–0.83)
Prior intervention, same vessel	1	1	0.35 (0.18-0.66)
Highest lesion type (ACC/AHA)			
A vs. B	2	1	1.66 (1.18-2.34)
A vs. C	2	1	3.20 (2.19-4.66)
Calcium in attempted lesion	2	1	1.65 (1.21–2.27)

Abbreviations as in Tables 2 and 4.

balloon pump) were the most powerful. Measures of disease severity (such as number of diseased vessels, lesion type, mitral regurgitation and ejection fraction) were also strong predictors of mortality. Finally, patient demographics (e.g., age, gender and body habitus) and a number of comorbid conditions (e.g., diabetes, vascular disease and renal function) were also found to predict in-hospital death.

We also found that the test for homogeneity was significant for certain variables, indicating that the risk factor predictive effect varied significantly between individual sites. However, given our large individual site sample sizes, this test statistic may be overly sensitive and not indicate clinically meaningful differences in the predictive power of a risk factor (12).

Although many of these same baseline clinical features also predicted in-hospital CABG and Q-wave MI (Tables 5 and 6), these variables tended to be less powerful predictors of these other end points (i.e., lower odds ratios). In addition, certain variables that predicted a higher mortality risk (e.g., ejection fraction) predicted a lower risk for CABG or were not significant predictors of CABG (e.g., congestive heart failure).

**Multivariate predictors of events.** Tables 7, 8 and 9 display the variables chosen in stepwise multivariate analysis by each database for the three end points. The variables chosen by each database are organized in the tables into four subgroups for classification purposes: 1) demographics; 2) coronary disease severity; 3) comorbidity; 4) catheterization/intervention data.

Table 6.	Significant Univariate	Predictors of	f In-Hospital Q V	Wave
Myocard	ial Infarction			

		No. of Sites	5
	No. of Sites	Signif	Pooled Univariable
Variable	Tested	Predictor	OR (95% CI)
Age (per 10-yr inc)	4	2	1.12 (1.05–1.19)
No. of diseased vessels			
2 vs. 1	3	3	1.35 (1.15-1.58)
3 vs. 1	3	2	1.88 (1.59-2.23)
Unstable angina	3	2	1.86 (1.57-2.20)
AMI*			
None vs. <24 h	3	2	1.55 (1.04-2.31)
None vs. 1-7 days	2	1	1.29 (1.02-1.63)
IV NTG	1	1	1.84 (1.49-2.27)
Hemodynamically unstable	1	1	4.78 (2.30-10.00)
Acuity			
Elective vs. urgent	4	2	1.43 (1.16-1.76)
Elective vs. emergent	3	3	3.07 (2.11-4.45)
Cardiogenic shock	1	1	2.85 (1.02-7.95)
Preprocedural IABP/CPS	3	3	4.19 (2.52-6.95)
MR	1	1	4.36 (2.02-9.41)
Stroke	4	2	1.45 (1.17-1.79)
Prior heart operation	4	3	1.60 (1.21-2.13)
Prior intervention, same vessel	2	2	0.55 (0.42-0.72)
Thrombolytic Rx within 6 days	1	1	1.27 (1.02-1.57)
>2 lesions/vessels attempted	3	1	1.51 (1.23-1.85)
Highest lesion type (ACC/AHA)			
A vs. B	2	1	1.62 (1.30-2.01)
A vs. C	2	1	2.23 (1.65-3.01)
Vein graft attempted	2	1	1.91 (1.42-2.58)
Thrombus	2	2	2.01 (1.40-2.89)

\*Indicates variables for which the test for homogeneity was p<0.01, indicating variability in effect size across individual sites. Abbreviations as in Tables 2 and 4.

There was a high degree of consistency in the significant multivariate predictors of outcomes across the databases, as was noted in the univariate analysis.

Although the attempt of this analysis was not to develop the ideal predictive instrument, we did ask the databases to report the discrimination abilities of their final stepwise multivariate models (in terms of the area under the receiver operating characteristics curve or C-index). For in-hospital death, all databases were able to discriminate which patients were likely to live from those who were likely to die, the C-index for in-hospital mortality ranging from 0.79 to 0.93. The models using variables for CABG within the same hospital period and Q wave MI were less robust, with CABG model C-indexes of 0.60 to 0.70 and Q wave MI model C-indexes of 0.60 to 0.60.

**Variable selection.** These data were then used to select the most important prognostic variables for coronary interventional outcomes. This comparison process provided a list of 29 variables that demonstrated an odds ratio >2.0 (or <0.5) in  $\geq$ 50% of the databases in the univariate analysis or were a significant predictor identified in a majority of the multivariate analyses. The variables were divided into the categories of demographics, heart disease severity, acuity, comorbidity and procedure details. Consensus definitions for these variables are provided in Table 10.

Table 7. Variables	Chosen in	Stepwise	Procedure	by Site (in-
hospital death)				

	NCN	NHLBI	NACI	NY	SCAI	Duke	NNE	CCP
Demographics								
Age	×	×	Х	×	X	X	×	X
Gender					Х	Х	X	
Height				×		X		
Weight	Х							
CAD severity								
LVEF	Х			×		X	X	×
No. of diseased vessels	×	×		×		×		Х
Unstable angina	Х				Х			×
CCS class	Х				Х	X		
CHF	Х	×	×	×	Х		X	×
AMI	Х			×	Х			×
Hemodynamically unstable				Х	×			
Acuity		×	×		Х		X	×
Cardiogenic shock	×			×	×		×	Х
IABP	Х			×	Х			
VT				×				
Comorbidity								
Diabetes	Х	×		×	Х			×
MR						X		×
PVD	Х			×				
Renal failure	Х			×	Х		X	×
HTN	Х							
Interventional Hx								
Same-vessel intervention			×	×				
Lesion type				×			X	
LMCA attempt					×			
Graft attempt					X		×	
Thrombus		×	×					

CAD = coronary artery disease; Hx = history; other abbreviations as in Tables 1 and 2.

## Discussion

Selection of variables. This report presents guidelines for a data-supported minimum set of variables required to risk stratify patients undergoing catheter based coronary interventions that could be incorporated into all interventional databases. A uniform minimum dataset, permitting risk adjustment of performance could thus be recorded by any institution, permitting simple responses to requests for information and comparisons between databases. For any database, the actual selection of variables is problematic and is closely related to the goals of data collection. Databases can be used for other analyses (e.g., process measures, cost) that demand collection of other variables. The purpose of the present study was to strictly limit the variables to those which actually provide risk information. Completely objective definitions limit "gaming" but are not possible for all variables. Thus, in multiinstitutional databases some form of auditing will likely be needed to allow consistent interpretation of data across institutions. It is also important that the variable is reproducible.

	NCN	NHLBI	NACI	NY	SCAI	Duke	NNE	CCP
Demographics								
Age					X	Х		
Gender							Х	
Weight	×	×						
CAD severity								
LVEF	Х					Х		
No. of diseased vessels	Х	×		×		×	×	×
Unstable angina		×			Х			×
CCS class	Х			Х		×		
CHF					×	Х		
AMI	Х				×			
Prior MI	Х							
IV NTG				×				
Hemodynamically unstable	1			×				
Acuity							Х	×
IABP	Х				×			×
Comorbidity								
Diabetes	Х				×	Х	Х	×
PVD	Х							
COPD				×				
Stroke						Х		
Renal failure							Х	
Smoking						Х		
High						Х		
cholesterol								
Intervention Hx								
No. of prior	Х				×			×
interventions								
Prior heart operation	×	×		Х	×		×	×
Same vessel			×					
No. of lesions attempted				Х			×	
Lesion type			Х	×			X	
Graft attempt			Х				X	
Lesion Ca		×						

Table 8. Variables Chosen in Stepwise Procedure by	Site (in-
hospital coronary artery bypass graft surgery)	

Abbreviations as in Tables 1, 2 and 7.

For example, although lesion characteristics appear to be predictive in individual databases, Botas et al. (16), using Bypass Angioplasty Revascularization Investigation (BARI) data showed that reproducibility of readings by core laboratory interpreters was unacceptable for features such as tortuosity, eccentricity, discrete, diffuse or tubular lesions or calcification.

**End points.** Another problem is the choice of end points. Adverse outcomes are relatively few (3), so there is a desire to increase the end points, thus improving the robustness of any model by combining several outcomes. Usually, in-hospital mortality, emergency CABG and Q wave infarctions are combined. However, this study points out that individual variables may have interactions opposite in direction to the individual end points, so that their important role is not apparent. This is seen in the case of the variables "depressed

 Table 9. Variables Chosen in Stepwise Procedure by Site (Q wave myocardial infarction)

	NCN	NACI	SCAI	NNE	CCP
Demographics					
Weight					×
CAD Severity					
Unstable angina	×				X
CCS Class	×				
AMI	×				
Prior MI	×				
IABP	×		×		
Comorbidity					
MR					Х
Carotid disease	×				
Smoking					Х
Intervention Hx					
No. of prior interventions				×	
Prior heart operation	×		×		X
Intervention same vessel				×	
No. of lesions attempted	×				
Thrombus		×		×	

MI = myocardial infarction; other abbreviations as in Tables 1, 2 and 7.

ejection fraction" and "percutaneous transluminal coronary angioplasty (PTCA) of a graft," which were associated with increased in-hospital death but not associated with in-hospital CABG.

**Definition of end points.** The methods used to define the end points chosen for analysis deserve comment. *Short-term mortality* is defined as "in-hospital death." "Death within 30 days of an intervention" may be better but is at present impractical because of difficulty in obtaining outpatient follow-up information. "All-cause mortality" is not gameable and was therefore chosen. This minimum data set for coronary interventional procedures is not meant to be predictive for all patients undergoing all types of coronary interventional procedures. However, as much as possible we attempted to remain congruent with definitions chosen for CABG (10) so that if outcomes by patient characteristics were compared, data would be available.

Which variables best predict outcome? It should be emphasized that we intended to identify a *minimum* dataset for catheter-based interventional cardiology outcomes. Data elements that reflect longer term effects on cardiac disease (e.g., hypertension, lipid profile, family history) are important in any database where the intent is to evaluate longer term outcomes. We realize that other variables that were not tested in this report may be equally predictive of short-term outcomes. The American College of Cardiology database includes our minimum data elements and is an example of a larger, more comprehensive database that might be used to evaluate both short-term and longer range outcomes (17).

**Limitations of the study.** By necessity, the data on the variables included in this report were retrospectively gathered. Existing variable definitions were matched as closely as possible to the consensus variable definitions. However, our pooled

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## Table 10. Variables Related to In-Hospital Adverse Outcomes\*

Demographics	
Age	Date of birth as stated by patient or family
Gender	Male; female
Heart disease severity	
LVEF	
Calculated—%	Calculated by LV gram, echo, blood pool scan
Estimated—%	Estimated by LV gram, echo, blood pool scan
No. of vessels $>/0\%$	By angiography measured, quantified or estimated diameter stenosis; "vessel" defined as RCA and its branches, proximal LAD (before 1st diagonal) mid/distal LAD and its branches and Cx and its branches
Unstable angina	Progressive or new onset or occurs at rest accompanied by ECG changes, hypotension or pulmonary congestion
CCS class IV	Highest CCS angina class leading to hospital admission and/or intervention; 0 = no angina by Hx
CHF	Hx of CHF before intervention
<24 h AMI	Within 24 h of AMI
1–7 days after AMI	>1 day; <7 days of AMI
Acuity/hemodynamic variables	
Urgency (urgent/emergent)	Elective: patient clinically stable; procedure routinely scheduled
	Urgent: unstable patient; procedure scheduled before discharge Emergent/ongoing ischemia: ongoing ischemia including rest angina despite maximal therapy (medical or IABP)
	Emergent/hemodynamic instability: shock, with or without hemodynamic support Emergent/salvage: arrest with CPR immediately before entering lab
Cardiogenic shock	Hypoperfusion with SBP <80 mm Hg and central filling pressure >20 mm Hg or cardiac index <1.8 liters/min per m <sup>2</sup> ; also present if inotropes or IABP needed to maintain these values
Preprocedural IABP/CPS	IABP/CPS assist device placed before intervention
Comorbidity	
Ao disease	Ao valve area $<1.0 \text{ cm}^2$ and/or Ao regurgitation $>2+$
MR > 2+	Presence of mitral regurgitation $>2+$
Diabetes (treated)	Clinical diagnosis of diabetes treated either with oral agents or insulin with or without sequelae
PVD	Presence of occlusive disease in the aorta, iliac or femoral artery sufficient to cause symptoms
Stroke	Hx of/presence of fixed neurologic deficit
Renal failure	
Creatinine	If creatinine preintervention known, list creatinine
Creatinine $>2 \text{ mg/dl}$	Creatinine >2 mg/dl known in past
Dialysis	Patient on dialysis
Cholesterol >225 mg/dl (reduced risk)	Measured cholesterol >225 mg/dl before intervention
Same vessel intervention (reduced rick)	Any pravious intervention on some vessel
Type C lesion attempted	Type A: concentric, noncalcified, >3 mm in length, not at bifurcation or angulated. Type C: total occlusion. Type B: all others (ACC/AHA)
LMCA attempted	
Unprotected	Intervention involving all or part of LMCA
Protected	"Protected" LMCA stenosis by patent bypass conduit
Vein graft intervention	Any intervention to SVG or IMA
Thrombus	Intraluminal filling defect, haziness or contrast staining in artery before intervention
Other variables with $OR > 2.0$ but not independent predictors	
ot in-hospital outcomes on multivariate logistic analyses	
IV NIG	Use of preinterventional IV NIG
VT	VT needing pharmacologic Ry or cardioversion
v 1 Carotid disease	Presence of $>70\%$ carotid stenosis by ultrasound or antiography
	reserve or > 7070 carona stenosis by an asound or angiography

\*More than 50% of databases that evaluated the variable showed an odds ratio >2.0 or variable chosen on multivariable analysis. CPR = cardiopulmonary resuscitation; Cx = circumflex coronary artery; ECG = electrocardiographic; Echo = echocardiography; IMA = internal mammary artery; lab = laboratory; LAD = left anterior descending coronary artery; LV gram = left ventriculogram; SVG = saphenous vein graft; other abbreviations as in Table 2.

estimates of a specific variable's effect size should be considered only as a relative approximation because this effect varied somewhat across individual sites for certain variables. In addition, some important variables, such as jeopardy score (18) or lesion characteristics defined by coronary ultrasound, were not included because they were not available in the databases surveyed. The data were also collected at various times, and most data were collected before the introduction of the new atherectomy devices, stents, and glycoprotein IIb/IIIA platelet receptor antagonists, which may have a significant impact on the importance of lesion specific variables (e.g., thrombus, eccentricity). We used data that predominantly referred to PTCA. As new devices are used, device-specific risk factors may be identified. Some variables amenable to gaming had to be included because of their predictive power (1). In some respects trying to control for gaming may seem "unfairly harsh" in some instances (e.g., in-hospital CABG includes all same-admission CABG, even elective), and even the broad definition of in-hospital death will obviously include some patients with a nonprocedure-related death. We only analyzed variables predicting adverse outcomes and do not imply that databases should be limited to that end point only.

**Summary.** By analyzing interventional outcomes across several large cardiac databases we were able to select 29 variables that had the strongest statistical association with outcomes. The variables selected are generally objective, easily obtainable and definable. Incorporation of these elements in every cardiac dataset will permit laboratories to be able to provide the information required in this era of managed care and preferred provider contracts as well as permit comparisons of the outcome of coronary interventions.

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