

ORIGINAL ARTICLE

Prognostic Value of the Blood Urea Nitrogen-to-Albumin Ratio for ICU Mortality in Cardiogenic Shock Patients: Evidence from the MIMIC-IV Database

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SUMMARY

Background: Cardiogenic shock (CS) is a life-threatening condition with high mortality. This study explored the association between the blood urea nitrogen-to-albumin ratio (BAR), a marker of renal function and nutritional status, and mortality in CS, aiming to evaluate its utility as a simple early risk stratification tool.

Methods: This study analyzed data from the Medical Information Mart for Intensive Care IV (MIMIC-IV) database, categorizing participants by BAR quartiles to examine 28-day intensive care unit (ICU) mortality. Least absolute shrinkage and selection operator (LASSO) regression was used to identify key variables associated with BAR and clinical outcomes. Logistic regression, Cox proportional hazards models, and restricted cubic splines were applied to assess the relationship between BAR and mortality. Kaplan–Meier curves illustrated cumulative mortality, while sensitivity and subgroup analyses were conducted to ensure the robustness of the findings. Causal mediation analysis (CMA) was conducted to investigate the indirect effects of BAR on prognosis.

Results: This study of 1,474 CS patients found that a higher BAR was linked to a greater risk of 28-day ICU mortality. After adjustments, those in the highest BAR quartile had a significantly increased mortality risk (HR 1.88, 95% CI: 1.30 - 2.71, $p = 0.001$) compared to those in the lowest quartile. Kaplan–Meier analysis demonstrated significantly reduced 28-day ICU survival probabilities in highest BAR quartile. Hemoglobin partially mediated this relationship, explaining 10.88% of the effect. The association between BAR and prognosis in patients with CS remained consistent across most subgroups, with significant interactions identified in the race and acute kidney injury (AKI) subgroups.

Conclusions: This study found that elevated BAR is closely associated with adverse ICU outcomes in patients with CS.

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KEYWORDS

blood urea nitrogen-to-albumin ratio, cardiogenic shock, MIMIC-IV database, causal mediation analysis, mortality

LIST OF ABBREVIATIONS

CS - Cardiogenic shock
 BAR - Blood urea nitrogen-to-albumin ratio
 MIMIC-IV - Medical information mart for intensive care IV
 LASSO - Least absolute shrinkage and selection operator
 ICU - Intensive care unit
 CMA - Causal mediation analysis
 AKI - Acute kidney injury
 BUN - Blood urea nitrogen
 AMI - Acute myocardial infarction
 BMI - Body mass index
 CVA - Cerebrovascular accident
 CKD - Chronic kidney disease
 T2DM - Type 2 diabetes mellitus
 HF - Heart failure
 MI - Myocardial infarction
 IHD - Ischemic myocardial disease
 SBP - Systolic blood pressure
 DBP - Diastolic blood pressure
 SpO₂ - Oximetry saturation
 WBC - White blood cell count
 PLT - Platelet count
 PCO₂ - Carbon dioxide pressure
 PO₂ - Arterial oxygen pressure
 INR - International normalized ratio
 LDH - Lactate dehydrogenase
 SOFA - Sequential organ failure assessment
 SIRS - Systemic inflammatory response syndrome
 OASIS - Oxford acute severity of illness score
 APACHE II - Acute physiology and chronic health evaluation II
 MV - Mechanical ventilation
 CRRT - continuous renal replacement therapy
 VIF - variance inflation factors
 HR - hazard ratios
 OR - odds ratio
 RCS - restricted cubic spline

INTRODUCTION

CS is a critical condition characterized by severe cardiac pump failure [1], resulting in inadequate tissue perfusion, life-threatening organ dysfunction, and tissue hypoxia [2]. Despite advancements in medical care and improved survival rates in recent years, the prognosis for CS remains grim [3], with in-hospital mortality reaching 33.6% and short-term mortality ranging between 45% and 70% [4,5]. This condition not only places a substantial strain on national healthcare sys-

tems and medical resources but also poses significant health and economic challenges for affected individuals. Given its severe impact, CS remains a major focus of global healthcare efforts. Clinically, the development of CS is attributed to various underlying causes, including severe valvular disease, arrhythmias, and cardiac tamponade [6]. Therefore, there is an urgent need to identify reliable prognostic indicators associated with poor outcomes in CS patients, enabling timely therapeutic interventions and ultimately reducing mortality rates.

Blood urea nitrogen (BUN), a metabolic byproduct synthesized by the liver and excreted by the kidneys, is a widely used biochemical parameter for assessing renal function [7]. Alongside serum creatinine, BUN plays a crucial role in evaluating kidney health [8]. Recent studies have highlighted its prognostic significance in various diseases, including aortic dissection, acute pancreatitis, and cerebral hemorrhage [9-11]. Albumin, a liver-synthesized protein, serves multiple physiological functions, including osmotic regulation, antioxidation, and anti-inflammatory activity [12]. Numerous studies have established albumin as a valuable prognostic marker for critically ill patients with conditions such as acute kidney injury, cirrhosis-related gastrointestinal bleeding, acute heart failure, and sepsis [13-16]. The BAR integrates these two biomarkers. Previous research has demonstrated that BAR is a significant predictor of mortality in various diseases, including ischemic stroke, sepsis, acute respiratory failure, and lung cancer [17-20]. In the realm of cardiovascular diseases, BAR has been identified as an independent predictor of long-term mortality in patients with acute myocardial infarction (AMI) [21]. Notably, cardiogenic shock, a severe complication of AMI, occurs in approximately 10% of cases and is associated with exceptionally high mortality rates [22,23].

Although BAR has been studied in various critical illnesses, its prognostic value in CS remains unclear. This study investigated whether BAR can predict mortality in CS, aiming to support early risk identification and guide treatment strategies.

MATERIALS AND METHODS

Study design and population

This retrospective, observational cohort study utilized data from the MIMIC-IV 3.1 database (<https://mimic.mit.edu>), a large, single-center, publicly available clinical database that includes comprehensive medical records of 94,458 patients admitted to the Beth Israel Deaconess Medical Center in Boston, Massachusetts, USA, between 2008 and 2022. Access to the database was granted to one of the authors (Hu Liu) after completing the Collaborative Institutional Training Initiative Program (certification number: 68041273). Due to the de-identified nature of the patient health information in this database, the requirement for ethical approval was waived.

Study participants

This study encompassed patients aged 18 years and older who were admitted to the ICU with a diagnosis of CS, as classified by the Ninth and Tenth Revisions of the International Classification of Diseases (ICD-9 code 785.51 and ICD-10 code R57.0). The exclusion criteria were as follows: 1) patients with ICU stays of less than 24 hours were excluded; 2) for patients with multiple ICU admissions, only data from the initial hospitalization were considered; and 3) patients with missing blood urea nitrogen and serum albumin values in their initial laboratory tests were excluded (Figure 1).

Data extraction

Data were extracted from the MIMIC IV database using Structured Query Language in Navicat Premium (version 16.0). Patient characteristics, including age, gender, and body mass index (BMI), were collected. Information on comorbidities, such as hypertension, AKI, cerebrovascular accident (CVA), chronic kidney disease (CKD), type 2 diabetes mellitus (T2DM), heart failure (HF), myocardial infarction (MI), ischemic myocardial disease (IHD), and hyperlipidemia, were extracted based on the International Classification of Diseases coding system. Vital signs [heart rate, systolic blood pressure (SBP), diastolic blood pressure (DBP), respiratory rate, pulse oximetry saturation (SpO₂), and temperature] and laboratory tests [hemoglobin, white blood cell count (WBC), platelet count, serum sodium, serum potassium, serum calcium, pH, carbon dioxide pressure (PCO₂), arterial oxygen pressure (PO₂), lactate, prothrombin time international normalized ratio (INR), lactate dehydrogenase (LDH), aspartate aminotransferase, alanine aminotransferase, creatinine, BUN, serum albumin, and serum glucose] were extracted. Various scores [such as the sequential organ failure assessment (SOFA) score, systemic inflammatory response syndrome (SIRS) score, Oxford acute severity of illness score (OASIS), acute physiology and chronic health evaluation II (APACHE II) score, Charlson comorbidity index, and Glasgow coma scale score], treatment [mechanical ventilation (MV) and continuous renal replacement therapy (CRRT)], and drug therapies (vasopressors and glucocorticoids) were extracted. All of the laboratory data were extracted from the data collected the first time after the patient was admitted to the ICU. The blood urea nitrogen to BAR is defined as the index calculated using the following formula: BAR = blood urea nitrogen (mg/dL)/serum albumin ratio (g/dL).

Outcome

The main outcome was 28-day all-cause mortality in the ICU, while secondary outcomes included 90-day, 360-day, and overall ICU all-cause mortality.

Statistical analysis

The normality of continuous variables was assessed using Shapiro-Wilk test. Variables with normal distribution were expressed as mean \pm standard deviation and

compared using *t*-test; variables with non-normal distribution were expressed as median and interquartile range and compared using Wilcoxon test. Categorical variables (expressed as counts and percentages) were compared using chi-squared or Fisher's exact test. Variables exceeding 20% missing data were excluded, and missing values in the remaining variables were imputed through multiple imputation [24]. Detailed missing data patterns are provided in Supplementary Table S1. Multicollinearity was assessed using variance inflation factors (VIF), with variables exceeding a VIF threshold of 5 removed. Detailed VIF values for variables are provided in Supplementary Table S2. LASSO regression combined with 10-fold cross-validation was used for variable selection. The optimal λ value was determined based on the one-standard-error rule [25]. Variables with non-zero coefficients were retained for the subsequent multivariate regression analysis.

To explore the independent impact of BAR on the mortality rate of patients with CS, multivariate Cox analysis or multivariate logistic regression was used with different models being adjusted for potential confounders models. Model 1 was used for crude analysis, without any adjustments for confounders. Model 2 was adjusted for age, OASIS, Charlson comorbidity index, APACHE II score. Based on Model 2, Model 3 was further adjusted for lactate, pH, HF, CRRT, and vasopressors use. The BAR was divided into quartiles, with the first group as the reference. Adjusted hazard ratios (HR) or odds ratio (OR) for primary and secondary endpoints were calculated relative to this group. Kaplan-Meier analysis assessed 28-day, 90-day, and 360-day mortality rates for ICU-admitted, critically ill CS patients.

Restricted cubic spline (RCS) curves evaluated non-linear associations between BAR and mortality, and the log-likelihood ratio test compared non-segmented and segmented regression models to determine any thresholds.

To evaluate the robustness of the findings, a sensitivity analysis was performed using three incremental models. Model 1 included no adjustments. Model 2 was adjusted for age, gender, race, and BMI, whereas Model 3 incorporated comprehensive covariate adjustments.

CMA separates the total effect of a treatment into direct and indirect effects. If an independent variable X affects a dependent variable Y via another variable M, then M is the mediator [26]. This study hypothesized that BAR might impact the prognosis of cardiogenic shock patients by mediating variable changes. CMA average causal mediation effect, average direct effect, and total effect can validate this hypothesis.

The prognostic value of BAR was further examined through comprehensive subgroup analyses, for each subgroup analysis, both p-values and interaction terms were calculated to assess the consistency of the prognostic value of BAR across different patient populations.

All statistical analyses were performed using R software (version 4.5). Statistical significance was considered

Table 1. Association of BAR with mortality outcomes in patients with cardiogenic shock in ICU.

Outcomes	Model 1			Model 2			Model 3		
	HR/OR (95% CI)	p-value	p-for trend	HR/OR (95% CI)	p-value	p-for trend	HR/OR (95% CI)	p-value	p-for trend
28-day ICU all-cause mortality									
BAR (continuous)	1.03 (1.02 - 1.04)	< 0.001		1.02 (1.01 - 1.03)	< 0.001		1.02 (1.01 - 1.03)	< 0.001	
Q1	Reference			Reference			Reference		
Q2	1.71 (1.27 - 2.29)	< 0.001	< 0.001	1.37 (1.02 - 1.85)	0.037	0.001	1.40 (1.04 - 1.89)	0.026	< 0.001
Q3	2.20 (1.65 - 2.93)	< 0.001		1.49 (1.10 - 2.01)	0.010		1.57 (1.16 - 2.13)	0.003	
Q4	2.68 (2.03 - 3.54)	< 0.001		1.67 (1.24 - 2.26)	0.001		1.76 (1.30 - 2.38)	< 0.001	
90-day ICU all-cause mortality									
BAR (continuous)	1.03 (1.02 - 1.04)	< 0.001		1.02 (1.01 - 1.03)	< 0.001		1.02 (1.01 - 1.03)	< 0.001	
Q1	Reference			Reference			Reference		
Q2	1.66 (1.26 - 2.18)	< 0.001	< 0.001	1.36 (1.03 - 1.80)	0.032	0.001	1.38 (1.04 - 1.82)	0.026	< 0.001
Q3	2.10 (1.60 - 2.75)	< 0.001		1.46 (1.10 - 1.94)	0.009		1.53 (1.15 - 2.04)	0.003	
Q4	2.60 (2.00 - 3.37)	< 0.001		1.67 (1.26 - 2.22)	< 0.001		1.75 (1.31 - 2.33)	< 0.001	
360-day ICU all-cause mortality									
BAR (continuous)	1.03 (1.02 - 1.04)	< 0.001		1.02 (1.01 - 1.03)	< 0.001		1.02 (1.01 - 1.03)	< 0.001	
Q1	Reference			Reference			Reference		
Q2	1.77 (1.35 - 2.32)	< 0.001	< 0.001	1.45 (1.10 - 1.91)	0.008	< 0.001	1.47 (1.12 - 1.94)	0.006	< 0.001
Q3	2.16 (1.66 - 2.83)	< 0.001		1.51 (1.14 - 2.00)	0.004		1.58 (1.20 - 2.10)	0.001	
Q4	2.68 (2.07 - 3.47)	< 0.001		1.73 (1.31 - 2.29)	< 0.001		1.81 (1.36 - 2.40)	< 0.001	
ICU all-cause mortality									
BAR (continuous)	1.04 (1.03 - 1.05)	< 0.001		1.02 (1.01 - 1.04)	< 0.001		1.03 (1.01 - 1.04)	< 0.001	
Q1	Reference			Reference			Reference		
Q2	2.14 (1.54 - 2.99)	< 0.001	< 0.001	1.77 (1.25 - 2.50)	0.001	< 0.001	1.73 (1.21 - 2.48)	0.003	< 0.001
Q3	2.55 (1.83 - 3.58)	< 0.001		1.79 (1.26 - 2.58)	0.001		1.86 (1.28 - 2.70)	0.001	
Q4	3.44 (2.49 - 4.80)	< 0.001		2.21 (1.53 - 3.20)	< 0.001		2.35 (1.60 - 3.45)	< 0.001	

BAR quartiles: Q1 (1.03 - 6.29), Q2 (6.30 - 10.00), Q3 (10.26 - 16.30), Q4 (16.33 - 58.75).

Model 1: No variables were adjusted.

Model 2: Adjusted for age, OASIS, Charlson comorbidity index, APACHE II score.

Model 3: Based on Model 2, further adjusted for lactate, pH, HF, CRRT, and vasopressor use.

BAR blood urea nitrogen-to-albumin ratio, ICU intensive care unit, HR hazard ratio, OR odds ratio, OASIS Oxford acute severity of illness score, APACHE II acute physiology and chronic health evaluation II, pH potential of hydrogen, HF heart failure, CRRT continuous renal replacement therapy.

Table 2. The threshold analysis of the BAR.

Outcome	360-day ICU all-cause mortality		ICU all-cause mortality	
	HR (95% CI)	p-value	OR (95% CI)	p-value
Model I				
One line effect	1.02 (1.01, 1.03)	< 0.001	1.03 (1.01, 1.04)	< 0.001
Model II				
Turning point (K)	31.79		9.68	
< K effect 1	1.03 (1.01, 1.04)	< 0.001	1.14 (1.06, 1.22)	< 0.001
< K effect 2	0.97 (0.93, 1.01)	0.110	1.01 (1.00, 1.03)	0.108
LRT test		0.004		0.003

BAR blood urea nitrogen-to-albumin ratio, ICU intensive care unit, LRT log-likelihood ratio test, HR hazard ratio, OR odds ratio.

when p-value was < 0.05 using two-tailed tests.

RESULTS

Characteristics of patients

As shown in Supplementary Table S3, the median age of the 1,474 patients was 71 years (60.00 - 80.00 years), and men accounted for 60.39% of the total patient population. Compared with patients in the survival group, those in the non-survival group were older and had significantly higher glucose, WBC, INR, lactate, LDH, creatinine, BUN, BAR, and lower temperature, DBP, SBP, hemoglobin, pH, and albumin (all $p < 0.05$). Disease severity scores, including SOFA score, OASIS, Charlson comorbidity index, and APACHE II score were notably higher in the non-survival group (all $p < 0.001$). The non-survival group exhibited a higher incidence of complications including acute kidney injury, pneumonia, and chronic kidney disease, whereas heart failure and hyperlipidemia demonstrated a lower incidence compared to the survival group. The non-survival group had significantly higher proportions of patients receiving CRRT, glucocorticoid, and vasopressor support (all $p < 0.05$).

Association between BAR and clinical outcome in CS patients

LASSO regression identified 10 variables with non-zero coefficients (age, BAR, lactate, pH, OASIS, Charlson comorbidity index, APACHE II, heart failure, CRRT, and vasopressor use) based on the optimal λ value of 0.040 (Figure 2). The relative importance of these features is illustrated in Supplementary Figure S1. These variables were subsequently included in the multivariate regression analysis. As shown in Table 1, multivariable Cox regression analysis revealed a significant associa-

tion between elevated BAR levels and 28-day ICU all-cause mortality. When BAR was analyzed as a continuous variable, the unadjusted Model 1 demonstrated a strong association (HR 1.03, 95% CI: 1.02 - 1.04, $p < 0.001$). This association remained statistically significant but attenuated in Model 2 (HR 1.02, 95% CI: 1.01 - 1.03, $p < 0.001$) and Model 3 (HR 1.02, 95% CI: 1.01 - 1.03, $p < 0.001$). In quartile-based analyses, compared to the reference Q1 group, progressively higher mortality risks were observed for Q2, Q3, and Q4 in Model 1 (all $p < 0.001$). These graded risks persisted even after sequential adjustments in Model 2 and Model 3, with a consistent dose-response relationship across all models. Notably, Q4 (highest BAR quartile) exhibited the strongest risk elevation (Model 3 HR 1.76, 95% CI: 1.30 - 2.38, $p < 0.001$), underscoring the clinical relevance of extreme BAR levels in predicting adverse outcomes. Through multivariable Cox analysis or multivariable logistic regression analysis, elevated BAR was significantly associated with 90-day ICU all-cause mortality, 360-day ICU all-cause mortality, and ICU all-cause mortality, with the higher quartiles (Q3-Q4) predicting mortality risk after multivariable adjustments and demonstrating a clear dose-response relationship. As shown in Figure 3, Kaplan-Meier analysis demonstrated significantly reduced survival probabilities in Q4 across all time points (28-day, 90-day, and 360-day ICU survival rates).

Restricted cubic spline and threshold effect analysis

According to the RCS analysis results (Figure 4), both 28-day ICU all-cause mortality and 90-day ICU all-cause mortality demonstrated a linear relationship between BAR and mortality risk after adjusting for variables, whereas 360-day ICU all-cause mortality and ICU all-cause mortality exhibited a nonlinear association between BAR and mortality risk following the

Table 3. Sensitivity analysis of associations between BAR and mortality outcomes in patients with cardiogenic shock in ICU.

Outcomes	Model 1			Model 2			Model 3		
	HR/OR (95% CI)	p-value	p-for trend	HR/OR (95% CI)	p-value	p-for trend	HR/OR (95% CI)	p-value	p-for trend
28-day ICU all-cause mortality									
BAR (continuous)	1.03 (1.02 - 1.04)	< 0.001		1.02 (1.02 - 1.04)	< 0.001		1.02 (1.01 - 1.04)	< 0.001	
Q1	Reference			Reference			Reference		
Q2	1.71 (1.27 - 2.29)	< 0.001	< 0.001	1.61 (1.20 - 2.17)	0.002	< 0.001	1.45 (1.06 - 1.98)	0.020	0.001
Q3	2.20 (1.65 - 2.93)	< 0.001		2.04 (1.53 - 2.73)	< 0.001		1.64 (1.19 - 2.27)	0.003	
Q4	2.68 (2.03 - 3.54)	< 0.001		2.35 (1.77 - 3.12)	< 0.001		1.88 (1.30 - 2.71)	0.001	
90-day ICU all-cause mortality									
BAR (continuous)	1.03 (1.02 - 1.04)	< 0.001		1.03 (1.02 - 1.04)	< 0.001		1.02 (1.01 - 1.04)	< 0.001	
Q1	Reference			Reference			Reference		
Q2	1.66 (1.26 - 2.18)	< 0.001	< 0.001	1.59 (1.20 - 2.10)	0.001	< 0.001	1.46 (1.09 - 1.96)	0.010	< 0.001
Q3	2.10 (1.60 - 2.75)	< 0.001		1.99 (1.51 - 2.61)	< 0.001		1.65 (1.22 - 2.24)	0.001	
Q4	2.60 (2.00 - 3.37)	< 0.001		2.33 (1.78 - 3.04)	< 0.001		1.98 (1.40 - 2.79)	< 0.001	
360-day ICU all-cause mortality									
BAR (continuous)	1.03 (1.02 - 1.04)	< 0.001		1.03 (1.02 - 1.04)	< 0.001		1.02 (1.01 - 1.03)	< 0.001	
Q1	Reference			Reference			Reference		
Q2	1.77 (1.35 - 2.32)	< 0.001	< 0.001	1.70 (1.30 - 2.23)	< 0.001	< 0.001	1.56 (1.17 - 2.07)	0.002	< 0.001
Q3	2.16 (1.66 - 2.83)	< 0.001		2.05 (1.56 - 2.69)	< 0.001		1.68 (1.25 - 2.27)	0.001	
Q4	2.68 (2.07 - 3.47)	< 0.001		2.41 (1.85 - 3.14)	< 0.001		1.98 (1.41 - 2.79)	< 0.001	
ICU all-cause mortality									
BAR (continuous)	1.04 (1.03 - 1.05)	< 0.001		1.04 (1.03 - 1.05)	< 0.001		1.04 (1.02 - 1.06)	< 0.001	
Q1	Reference			Reference			Reference		
Q2	2.14 (1.54 - 2.99)	< 0.001	< 0.001	2.07 (1.48 - 2.91)	< 0.001	< 0.001	1.86 (1.27 - 2.73)	0.002	< 0.001
Q3	2.55 (1.83 - 3.58)	< 0.001		2.44 (1.74 - 3.45)	< 0.001		2.03 (1.35 - 3.07)	< 0.001	
Q4	3.44 (2.49 - 4.80)	< 0.001		3.17 (2.27 - 4.47)	< 0.001		2.87 (1.78 - 4.66)	< 0.001	

BAR quartiles: Q1 (1.03 - 6.29), Q2 (6.30 - 10.00), Q3 (10.26 - 16.30), Q4 (16.33 - 58.75).

Model 1: No variables were adjusted.

Model 2: Adjusted for age, gender, race, BMI.

Model 3: Based on Model 2, further adjusted for heart rate, respiratory rate, SpO₂, temperature, diastolic blood pressure, systolic blood pressure, serum glucose, white blood cell count, platelet count, hemoglobin, INR, pH, PCO₂, PaO₂, lactate, serum calcium, serum potassium, serum sodium, ALT, AST, LDH, creatinine, SOFA score, SIRS score, OASIS, GCS score, Charlson comorbidity index, APACHE II score, hypertension, acute kidney injury, cerebral vascular accident, chronic kidney disease, type 2 diabetes mellitus, heart failure, myocardial infarct, ischemic heart disease, hyperlipidemia, mechanical ventilation, CRRT, glucocorticoid, and vasopressor use.

BAR blood urea nitrogen-to-albumin ratio, ICU intensive care unit, HR hazard ratio, OR odds ratio, BMI body mass index, INR prothrombin time international normalized ratio, pH potential of hydrogen, PCO₂ partial pressure of carbon dioxide, PaO₂ partial pressure of oxygen, ALT alanine aminotransferase, AST aspartate aminotransferase, LDH lactate dehydrogenase, SOFA sequential organ failure assessment, SIRS systemic inflammatory response syndrome, OASIS Oxford acute severity of illness score, GCS Glasgow coma scale, APACHE II acute physiology and chronic health evaluation II, CRRT continuous renal replacement therapy.

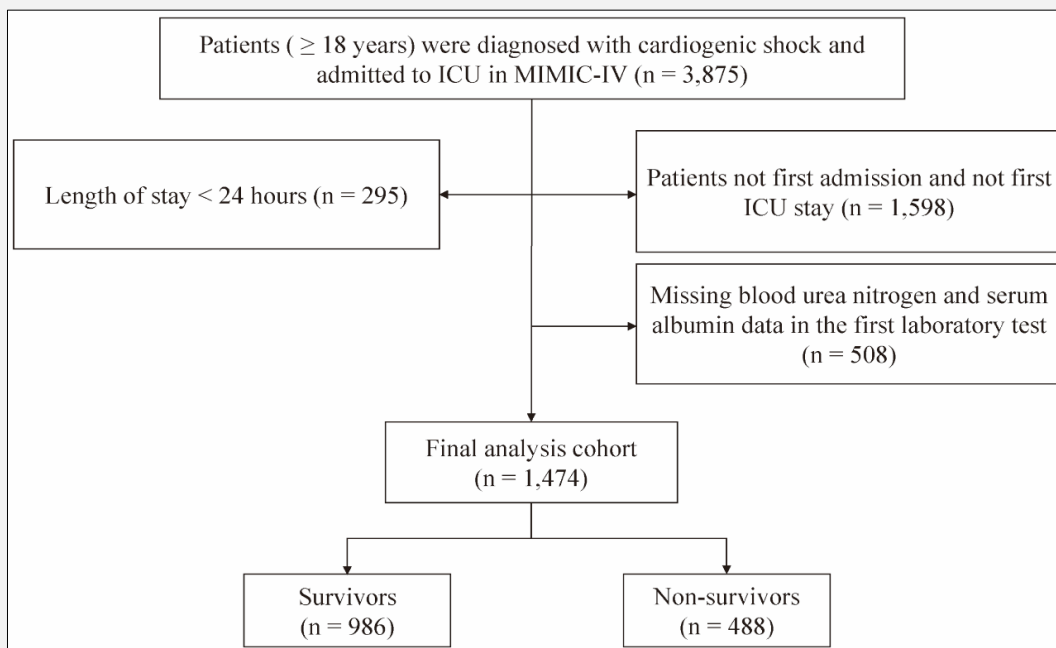


Figure 1. Flow chart of the current study.

MIMIC-IV medical information mart for intensive care IV, ICU intensive care unit.

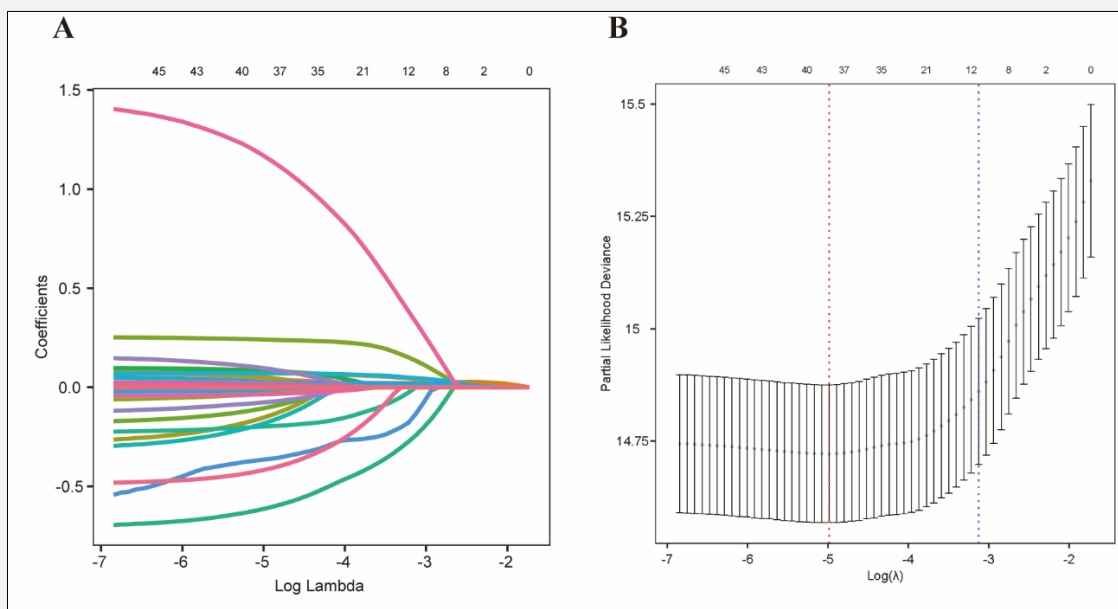


Figure 2. Selection using the LASSO regression model.

A) LASSO regression λ mean squared error plot. B) LASSO regression λ coefficient plot.

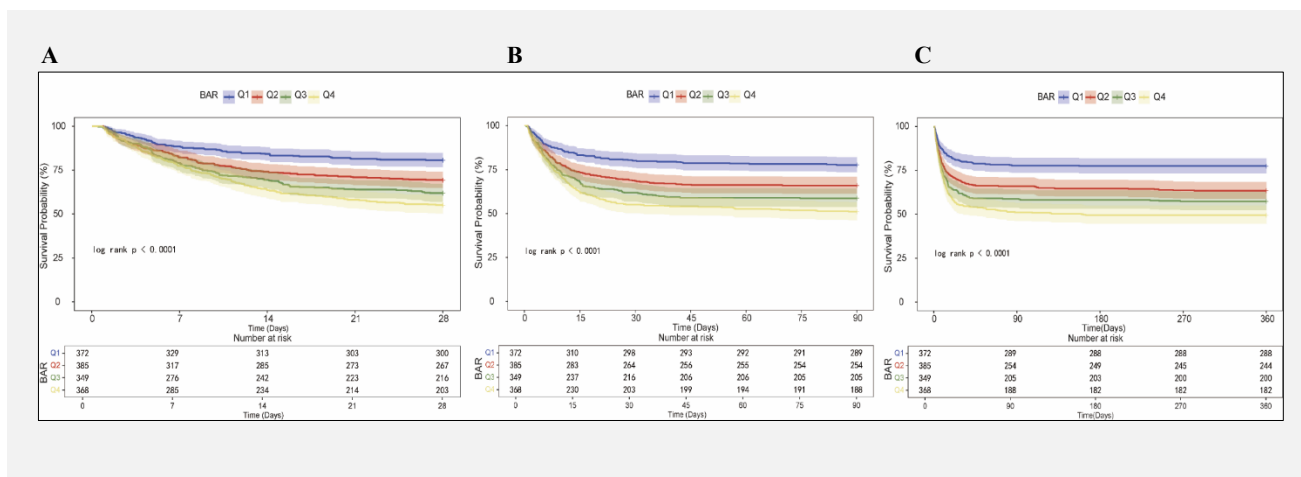


Figure 3. Kaplan-Meier survival curves for 28-day ICU all-cause mortality (A), 90-day ICU all-cause mortality (B), and 360-day ICU all-cause mortality (C) in patients with CS, stratified by quartiles of the BAR.

BAR categories: Q1 (1.03 - 6.29), Q2 (6.30 - 10.00), Q3 (10.26 - 16.30), Q4 (16.33 - 58.75). ICU intensive care unit, CS cardiogenic shock, BAR blood urea nitrogen-to-albumin ratio.

same adjustment. The threshold effects of BAR on 360-day ICU all-cause mortality and ICU all-cause mortality were further analyzed (Table 2). For 360-day ICU all-cause mortality, the threshold of BAR was 31.79, while for ICU all-cause mortality, the threshold was 9.68. Below the threshold, each unit increase in BAR significantly raised the 360-day ICU all-cause mortality risk (HR = 1.03, 95% CI: 1.02 - 1.04, $p < 0.001$), as well as the ICU all-cause mortality risk (OR = 1.14, 95% CI: 1.06 - 1.22, $p < 0.001$). However, when BAR exceeded the threshold, the risk association weakened and became statistically nonsignificant. Likelihood ratio tests indicated that the threshold effect model significantly outperformed the linear model (both $p < 0.05$).

Sensitivity analysis

Sensitivity analysis (Table 3) confirmed the stability of the association between BAR and outcomes in patients with cardiogenic shock after full adjustment (Model 3). As a continuous variable, BAR was significantly positively associated with 28-day ICU all-cause mortality (HR 1.02, 95% CI: 1.01 - 1.04, $p < 0.001$), 90-day mortality (HR 1.02, 95% CI: 1.01 - 1.04, $p < 0.001$), 360-day mortality (HR 1.02, 95% CI: 1.01 - 1.03, $p < 0.001$), and ICU all-cause mortality (OR 1.04, 95% CI: 1.02 - 1.06, $p < 0.001$). Grouped by BAR quartiles, patients in Q4 showed significantly increased mortality risks compared with Q1 (reference group) in Model 3: 28-day mortality (HR 1.88, 95% CI: 1.30 - 2.71, $p = 0.001$), 90-day mortality (HR 1.98, 95% CI: 1.40 - 2.79, $p < 0.001$), 360-day mortality (HR 1.98, 95% CI: 1.41 - 2.79, $p < 0.001$), and ICU all-cause mortality (OR 2.87, 95% CI: 1.78 - 4.66, $p < 0.001$). Additionally, the risk of mortality increased significantly with higher BAR quartiles (all p -for-trend < 0.05). These results were

consistent with the primary analysis, supporting a strong association between BAR and adverse outcomes in patients with CS.

Causal mediation analysis

In the CMA, hemoglobin was confirmed to have a mediating effect. Figure 5 shows that in terms of 28-day ICU mortality of CS patients, hemoglobin mediated 10.88% (95% CI: 4.23 - 19.86%; $p = 0.002$) of the adverse effect of BAR (ACME: $p = 0.002$)

Subgroup analyses

Subgroup analyses for the relationship between BAR and 28-day ICU all-cause mortality were performed according to gender, race, comorbidities (hypertension, AKI, CVA, CKD, T2DM, MI, IHD, and hyperlipidemia), MV, and glucocorticoid use. The findings consistently showed that a higher BAR was associated with an elevated risk of 28-day ICU all-cause mortality in most of the investigated subgroups (Figure 6). Overall, BAR showed significant associations with 28-day ICU all-cause mortality (HR 1.02, 95% CI: 1.01 - 1.03, $p < 0.001$). Significant interactions were observed in race subgroups (p for interaction = 0.03) and AKI subgroups (p for interaction = 0.01), indicating that the link between BAR and mortality may vary in these cohorts. Additionally, subgroup analyses of 90-day ICU all-cause mortality and 360-day ICU all-cause mortality demonstrated persistent interaction effects in race subgroups (all p for interaction = 0.02) and AKI subgroups (all p for interaction < 0.001), while ICU all-cause mortality analysis revealed interaction in race subgroups (p for interaction = 0.024), with detailed stratification results visualized in Supplementary Figure S2.

BAR Predicts ICU Mortality in Cardiogenic Shock

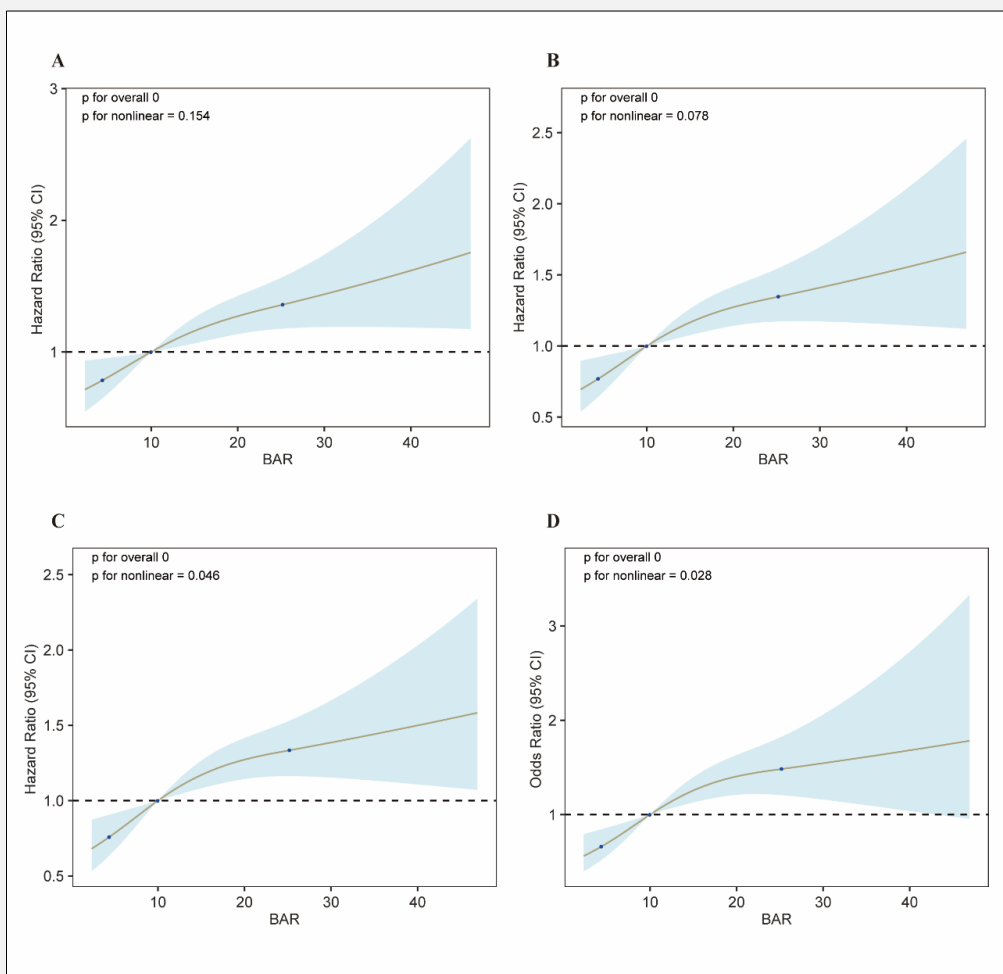


Figure 4. Restricted cubic spline function between BAR and 28-day ICU all-cause mortality (A), 90-day ICU all-cause mortality (B), 360-day ICU all-cause mortality (C), and ICU all-cause mortality (D) in patients with CS, adjusted for age, OASIS, Charlson comorbidity index, APACHE II score; lactate, pH, HF, CRRT, and vasopressor use.

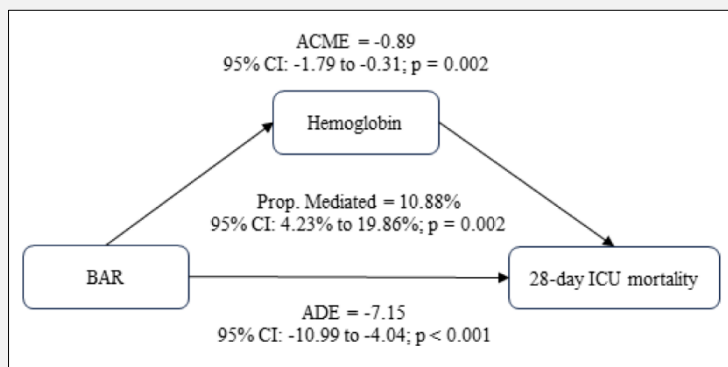


Figure 5. Causal mediation analysis for hemoglobin reduction.

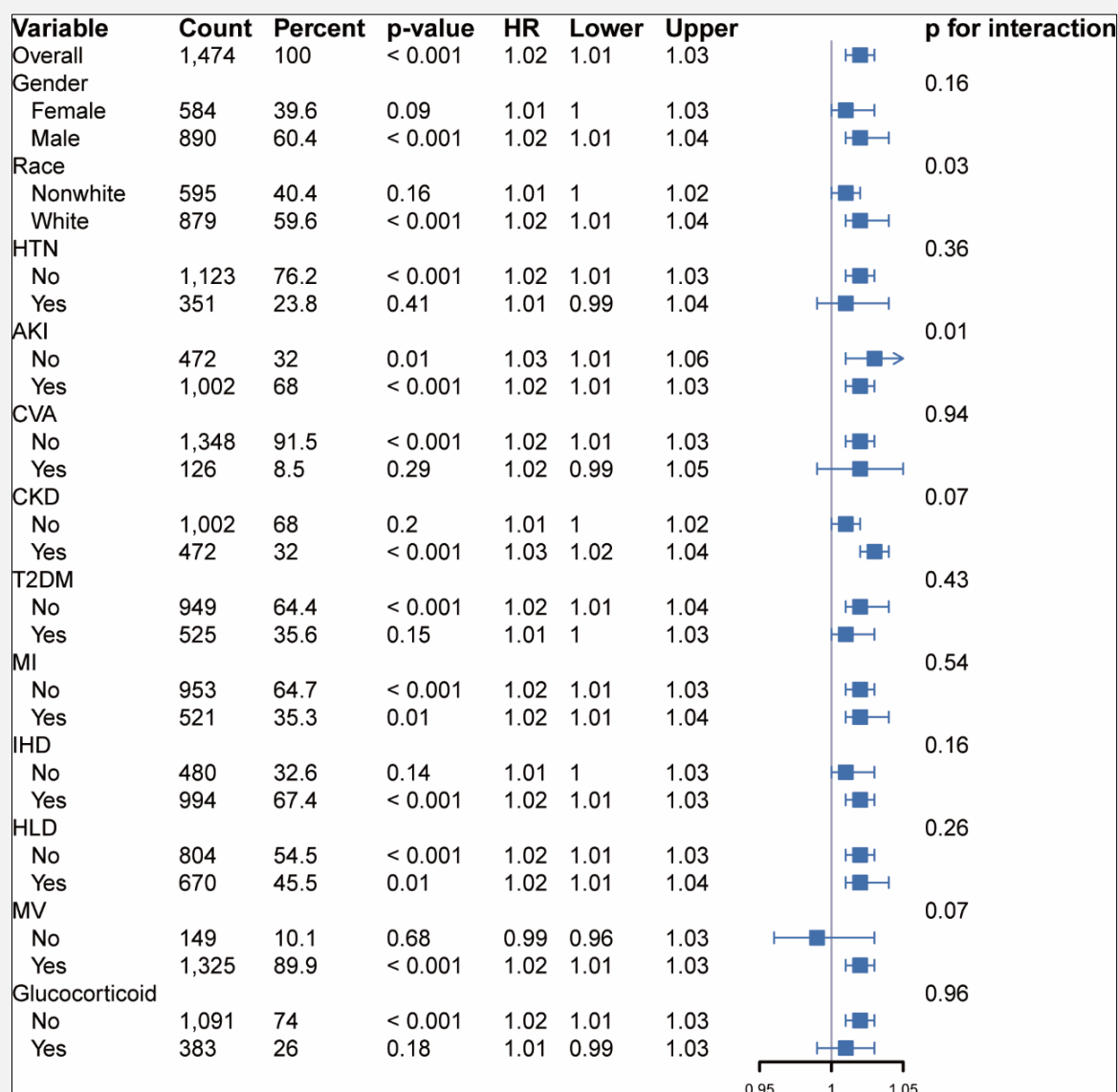


Figure 6. Subgroup analyses for the association of BAR with 28-day ICU all-cause mortality in patients with CS, adjusted for age, OASIS, Charlson comorbidity index, APACHE II score; lactate, pH, HF, CRRT, and vasopressors use.

HR hazard ratio, OR odds ratio, HTN hypertension, AKI acute kidney injury, CVA cerebrovascular accident, CKD chronic kidney disease, T2DM type 2 diabetes mellitus, MI myocardial infarction, IHD ischemic myocardial disease, HLD hyperlipidemia, MV mechanical ventilation.

DISCUSSION

Our study is the first to evaluate the association between BAR and ICU outcomes in patients with CS. The results indicate that patients in the high BAR group had a significantly increased risk of death at 28 days in the ICU. This association remained significant even after adjusting for multiple confounding variables. Kaplan-

Meier survival curves demonstrated that higher BAR levels were associated with lower survival rates. Additionally, CMA confirmed that hemoglobin mediated 10.88% of the adverse effects of BAR on 28-day ICU mortality, and subgroup analysis showed that higher BAR was associated with an increased risk of 28-day ICU mortality in most subgroups, with significant interactions observed only in the subgroups defined by race

and AKI. The RCS curve reveals a non-linear relationship between BAR and 360-day and overall ICU mortality risk. Further analysis indicates a clear threshold effect. Below the threshold, the risk increases significantly with the rise of BAR, while above the threshold, the risk remains statistically unchanged. This highlights the importance of clinical monitoring, especially focusing on changes below the BAR threshold, to achieve the best assessment of patient prognosis.

Given the high mortality rate of CS [27], recent studies have increasingly focused on novel biomarkers for early prognostic evaluation in CS patients. Wang et al. reported that the albumin-corrected anion gap independently and strongly correlates with clinical outcomes in CS, aiding clinicians in identifying high-risk patients [28]. Xie et al. demonstrated that an elevated stress hyperglycemia ratio is significantly associated with increased 30-day and 360-day all-cause mortality in CS patients, particularly those with concurrent AMI [29]. Similarly, Sun et al. identified that a higher blood urea nitrogen-to-creatinine ratio at admission independently predicts reduced in-hospital mortality in CS [30]. Notably, BAR, a comprehensive indicator reflecting inflammation, metabolic status, and nutritional conditions in critically ill patients, has shown significant prognostic value in cardiovascular diseases such as AMI and chronic heart failure [21,31]. Building on these findings, our study is the first to validate BAR as a predictive marker for ICU mortality in CS using a public database, offering new insights for clinical risk stratification.

In our study, elevated BAR was significantly associated with increased short-term mortality in patients with CS. The potential mechanisms underlying this adverse outcome may be explained through the following pathways: 1) Hypoperfusion-induced metabolic derangements: the abrupt decline in cardiac output during CS leads to systemic hypoperfusion and hypoxia, triggering mitochondrial dysfunction [32]. Compensatory anaerobic metabolism exacerbates metabolic acidosis, which accelerates skeletal muscle proteolysis and elevates serum urea nitrogen levels [33]. Elevated urea nitrogen reflects a hypercatabolic state and protein-energy imbalance, ultimately contributing to nutritional depletion and poor prognosis; 2) reduced renal blood flow in CS lowers the glomerular filtration rate, causing a spike in urea nitrogen. This triggers the sympathetic nervous system and renin-angiotensin-aldosterone system, leading to fluid retention and increased urea reabsorption [34]. These responses further increase cardiac preload, establishing a vicious cycle of "cardio-renal syndrome" and accelerating clinical deterioration [35].

CMA revealed that hemoglobin plays a partial mediating role in the relationship between the BAR and poor outcomes in cardiogenic shock, accounting for approximately 10.88% of the total effect. This suggests that the BAR not only directly influences patient prognosis but may also indirectly affect disease outcomes through hemoglobin as a mediating variable. Anemia is one of the

most common complications in the ICU. A prospective study by Thomas et al. [36] found that nearly all patients hospitalized in the intensive care unit for more than seven days experienced a decline in hemoglobin levels. In the context of an elevated BAR, reduced hemoglobin further impairs oxygen delivery and tissue perfusion, diminishing the ability of the injured myocardium and other vital organs to tolerate hypoxia [37]. This exacerbates disease severity and contributes to poorer patient outcomes. This finding offers valuable insight for clinical practice. In the management of CS, maintaining hemoglobin at an appropriate level may be a key factor in improving patient outcomes. It could help mitigate the adverse impact of elevated BAR on 28-day mortality, thereby contributing to the optimization of treatment strategies and enhancing patient survival.

Subgroup analysis revealed significant racial differences: the association between BAR and 28-day ICU mortality was more pronounced in White patients. This disparity may be partly attributed to the smaller sample sizes in other racial groups, potentially leading to reduced effect sizes. Alternatively, it might reflect inherent differences in nutritional metabolism among racial groups. A study by Vong et al. [38] reported that, among hospitalized adults with COVID-19, White patients were more susceptible to malnutrition compared to Asian, Black, or other racial groups. Since hypoalbuminemia may be more prevalent in malnourished individuals, this could partly explain the stronger association observed between BAR and mortality in White patients. Another significant finding was the moderating effect of AKI status on the prognostic value of BAR. Among patients without AKI, the association between BAR and mortality was notably stronger. This could be attributed to the fact that, in these patients, elevated BUN and decreased albumin levels more directly reflect a state of systemic hyper catabolism and nutritional imbalance, rather than azotemia and hypoalbuminemia resulting from impaired renal function. Consequently, BAR may serve as a more precise indicator of overall disease severity in patients without AKI, thereby enhancing its predictive value for mortality.

Limitations

However, this study has several limitations. First, as a single-center retrospective study based on the MIMIC-IV database, the findings are inherently subject to selection bias and may not be generalizable to broader patient populations or healthcare settings. Validation in large-scale, multi-center, prospective cohorts is essential to confirm the robustness and external applicability of our results. Second, although we adjusted for a wide range of potential confounders using commonly accepted statistical methods, the impact of unmeasured or residual confounding factors cannot be entirely excluded. Additionally, due to the retrospective nature of the database, we were limited by the availability and completeness of certain clinical variables, which may have influenced the observed associations. Third, the study popu-

lation was limited to ICU-admitted patients with cardiogenic shock. As a result, the findings may not reflect the prognostic value of the BAR index in patients managed outside the ICU setting. Future studies incorporating both ICU and non-ICU populations are warranted to provide a more comprehensive assessment. Finally, while this study focused exclusively on cardiogenic shock, the BAR index has shown potential prognostic relevance in various other diseases. Further research is needed to investigate its predictive utility across a broader spectrum of acute and chronic conditions, which may help establish BAR as a versatile biomarker for risk stratification in diverse clinical contexts. Moreover, mechanistic studies are encouraged to explore the underlying biological pathways linking BAR to adverse outcomes.

CONCLUSION

Elevated BAR is significantly correlated with heightened ICU mortality rates in patients experiencing cardiogenic shock. As a prospective early biomarker for mortality risk prediction, BAR could assist clinicians in identifying high-risk patients for targeted interventions. Nonetheless, larger-scale studies are necessary to validate these findings and evaluate the clinical applicability of BAR.

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Ethical Approval and Consent to Participate:

The MIMIC-IV database, accessed with credential number 68041273, contains de-identified, publicly available data, eliminating the need for further ethical approval or informed consent.

Consent for Publication:

All authors concurred with the submission.

Availability of Data and Materials:

The datasets from this study are accessible in the MIMIC-IV database (<https://mimic.mit.edu>).

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Declaration of Interest:

The authors confirm that the study was done without any ties to businesses or money matters that might be seen as a conflict of interest.

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