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The association of diastolic arterial pressure and heart rate with mortality in septic shock: a retrospective cohort study

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Abstract

Background: The effects of diastolic arterial pressure (DAP) and heart rate (HR) on the prognosis of patients with septic shock are unclear, and whether these effects persist over time is unknown. We aimed to investigate the relationship between exposure to different intensities of DAP and HR over time and mortality at 28 days in patients with septic shock.

Methods: In this cohort study, we obtained data from the Medical Information Mart for Intensive Care IV, which includes the data of adult patients (\geq 18 years) with septic shock who underwent invasive blood pressure monitoring. We excluded patients who received extracorporeal membrane oxygenation (ECMO) or glucocorticoids within 48 h of ICU admission. The primary outcome was mortality at 28 days. Piece-wise exponential additive mixed models were used to estimate the strength of the associations over time.

Results: In total, 4959 patients were finally included. The median length of stay in the ICU was 3.2 days (IQR: 1.5–7.1 days), and the mortality in the ICU was 12.9%, with a total mortality at 28 days of 15.9%. After adjustment for baseline and time-dependent confounders, both daily time-weighted average (TWA) DAP and HR were associated with increased mortality at 28 days and strong association, mainly in the early to mid-stages of the disease. The results showed that mortality in patients with septic shock was lowest at a DAP of 50–70 mm Hg and an HR of 60–90 beats per minute (bpm). Throughout, a significant increase in the risk of death was found with daily exposure to TWA-DAP \leq 40 mmHg (hazard ratio 0.99, 95% confidence interval (CI) 0.94–1.03) or TWA-HR \geq 100 bpm (hazard ratio 1.16, 95% CI 1.1–1.21). Cumulative and interactive effects of harmful exposure (TWA-DAP \leq 40 mmHg and TWA-HR \geq 100 bpm) were also observed.

Conclusion: The optimal ranges for DAP and HR in patients with septic shock are 50–70 mmHg and 60–90 bpm, respectively. The cumulative and interactive effects of exposure to low DAP (\leq 40 mmHg) and tachycardia (\geq 100 bpm) were associated with an increased risk of death.

Keywords: Diastolic arterial pressure, Heart rate, Time-dependent intensity, Septic shock

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Background

Septic shock is characterized by persistent hypotension and tissue hypoperfusion despite fluid resuscitation [1]. Delays in the diagnosis and initiation of treatment of septic shock are associated with an increased risk of death, and early and effective fluid resuscitation and vasopressor administration are the cornerstones of the treatment of septic shock [2, 3]. Loss of vascular tone is a key

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pathophysiological feature of septic shock, in addition to relative volume deficiency, and plays a key role in the development of septic shock [1]. A decrease in diastolic arterial pressure (DAP), an important marker of arterial tone, reflects the severity of arteriolar vasodilation [4]. Additionally, low DAP can impair left ventricular myocardial perfusion, especially in tachycardia [5]. Therefore, when DAP is low, such as in early septic shock, there is an increased risk of myocardial ischemia, especially in patients with previous coronary artery disease. Myocardial ischemia can lead to reduced stroke volume and systemic flow, further affecting tissue and microcirculatory perfusion [6].

Although the Surviving Sepsis Campaign (SSC) guidelines recommend achieving a mean arterial pressure $(MAP) \ge 65$ mmHg during fluid resuscitation [7–9], intensivists often neglect the importance of DAP and underuse it to manage patients with sepsis despite its simplicity [10]. Importantly, DAP is also not considered in the current SSC guidelines. Its relationship to clinical outcomes has not been extensively described, and no suggestion has been provided on target DAP [10, 11]. However, assessing the loss of vascular tone according to the severity of diastolic hypotension can profoundly impact treatment decisions, such as the early use of norepinephrine. As DAP depends on vascular tone and duration of the cardiac cycle, the combination of DAP and heart rate (HR) can reflect the severity of circulatory dysfunction in the vasodilatory state. Ospina-Tascón et al. showed that gradually opposite changes in HR and DAP show more severe circulatory dysfunction, and the relative risk of death increases proportionally [12]. Moreover, they also found that a diastolic shock index (DSI) (described as HR divided by DAP)>2.2 was associated with higher mortality in septic shock [12]. Many studies have confirmed that prolonged sinus tachycardia induced by sympathetic excitation is associated with increased major cardiovascular events and higher mortality [13]. However, the effects of DAP and HR on mortality in septic shock have not yet been explored in clinical studies.

Our main objective was to estimate the effect of timedependent exposure to different intensities of DAP or HR on mortality at 28 days in patients with septic shock. We also examined whether the intensity of the effect varied over time and whether there was a cumulative and interactive effects of exposure time. Finally, we tried to determine the optimal range of DAP and HR.

Methods

Study design and participants

We conducted a retrospective cohort study using electronic health record data from the Medical Information Mart for Intensive Care IV (v2.0) (MIMIC-IV 2.0) database, a large open-access database. The MIMIC-IV database contained data of 382,278 patients admitted to the Beth Israel Deaconess Medical Center in Boston, Massachusetts, between 2008 and 2019. Patients meeting the criteria for sepsis after intensive care unit (ICU) admission were eligible for inclusion. Sepsis and septic shock were defined according to the Third International Consensus Definitions for Sepsis and Septic Shock (Sepsis-3) [1]. Sepsis is defined as organ dysfunction caused by infection and is clinically determined based on a sequential organ dysfunction assessment (SOFA) score of ≥ 2 points, which includes patients with confirmed or suspected infection. Septic shock was defined as a MAP < 65 mmHg or vasopressor administration within 24 h after ICU admission. We analyzed only the first stay in the ICU of patients who were admitted to the ICU more than once. Patients who were discharged from the hospital or died within 24 h after admission were excluded. To avoid bias, patients with the following conditions were also excluded: (1) age < 18 years; (2) who received extracorporeal membrane oxygenation (ECMO); (3) MAP > 65 mmHg or did not receive vasopressors within 24 h; (4) received glucocorticoids within 24 h; and (5) did not undergo invasive arterial blood pressure monitoring. The patient selection flow chart is shown in Additional file 1: Fig. S1, Additional file 2. At discharge, all relevant comorbidities were identified using the diagnostic codes of ICD-9 and ICD-10.

Variable extraction

Data on age, sex, body mass index (BMI), ethnicity, type of admission, and severity at admission were collected using SOFA score, Simplified Acute Physiology Score II (SAPS II), and Oxford Acute Illness Severity Score (OASIS). Comorbidity data were collected to calculate the Charlson comorbidity index (CCI) score. Lifesaving organ support treatment was collected as longitudinal data every 24 h, including continuous renal replacement therapy (CRRT), mechanical ventilation, and vasopressors. If a variable was recorded more than once per day, the worst value associated with the most severe degree of illness was used. Specifically, every 24 h, the timeweighted average (TWA) of the HR or DAP, which is the ratio of the area under the HR or DAP to the timeline, was calculated. In view of the follow-up investigation of MIMIC-IV 2.0 on patients' outpatient survival, all included patients were followed up from enrollment to 28 days.

Exposures and outcomes

The primary exposures were the time-dependent TWA-DAP and TWA-HR. Because our study showed a consistent increase in the risk of death with TWA-DAP \leq 40 mmHg and with TWA-HR \geq 100 beats per min (bpm) (Additional file 1: Fig. S2), we defined low DAP and tachycardia as TWA-DAP \leq 40 mmHg and TWA-HR \geq 100 bpm, respectively. Two methods were used to quantify the effect of harmful exposures: (1) exposure to low DAP or tachycardia during the stay in the ICU and (2) the proportion of time exposure to low DAP and tachycardia.

The primary outcome was mortality at 28 days. Secondary outcomes included ICU mortality and length of ICU stay.

Statistical analysis

Continuous variables are expressed as mean (standard deviation). Nonparametric variables are expressed as medians (interquartile ranges, IQR). Comparisons between groups were made using the Chi-squared test or Fisher's exact test for categorical variables and the Mann–Whitney U test for continuous variables.

We first applied piece-wise exponential additive mixed models (PAMMs) [14] to estimate the subject-specific longitudinal distributions of TWA-DAP or TWA-HR in relation to mortality at 28 days. PAMMs allow examination of the time-dependent effects of time-dependent exposures (time-dependent TWA-DAP or TWA-HR in this study) on time-to-event outcomes. Based on prior knowledge, baseline variables were purposefully selected as time-dependent confounders in PAMMs, including age, sex, type of admission, BMI, and CCI. We treated longitudinal data during follow-up, including CRRT, vasopressor use, and DAP, as time-dependent confounders in PAMMs. To investigate whether the correlation between TWA-DAP or TWA-HR and mortality at 28 days varied over time, we included an interaction term between time and exposure in the model. We used multiple interlocking equation interpolation to account for the missing data, interpolation was only used in baseline variables (Additional file 1: Fig. S3), and the absence of longitudinal data was allowed in the model.

We determined the approximate DAP and HR thresholds below or above which the risk of 28-day mortality began to increase, based on PAMMs. Three secondary analyses were then performed. We considered any low DAP or tachycardia as a time-dependent exposure variable and investigated the effect of any low DAP or tachycardia exposure on mortality, as well as the relationship between the proportion of harmful exposure time (TWA-DAP \leq 40 mmHg or TWA-HR \geq 100 bpm) and mortality. We examined the relationship between cumulative dose and 28-day mortality using areas with longitudinal profiles with TWA-DAP \leq 40 mmHg or TWA-HR \geq 100 bpm.

Several subgroup analyses were performed based on the type of admission, gender, comorbidities, and the proportion of exposure time in the ICU (<10%, 10–30%, 30–50%, 50–70%,>70%). Furthermore, the interaction and causal mediating effects of tachycardia and low DAP at different exposure times were explored.

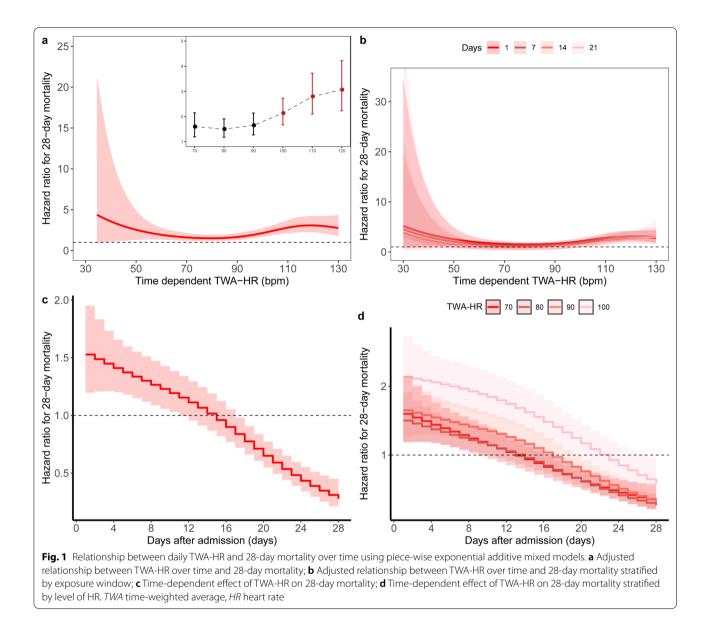
Statistical analyses were performed with R (version 4.1). Statistical significance was established at P < 0.05.

Results

Within the MIMIC-IV database, 24,707 patients met the Sepsis 3.0 criteria, and 4959 patients with septic shock were included in this study. The median age of the patients was 67.6 years (IQR: 57.2-77.3); 63.3% were male and predominantly Caucasian. In the study cohort, 71.3% of the patients received vasoactive drugs, 67.9% received invasive mechanical ventilation (IMV), and 2.1% received CRRT. The median stay in the ICU was 3.2 days (IQR: 1.5–7.1), and ICU mortality was 12.9%, with a total mortality of 15.9% at 28 days (Additional file 1: Tables S1, S2). In total, 4959 patients had complete data for TWA-DAP and TWA-HR on day 1, of which 28.7% were exposed to low DAP (TWA-DAP≤40 mmHg) and 66.7% were exposed to tachycardia (TWA-HR \geq 100 bpm). Patients' characteristics and outcomes varied widely based on the TWA-HR (Additional file 1: Table S1) and TWA-DAP (Additional file 1: Table S2) levels on day 1.

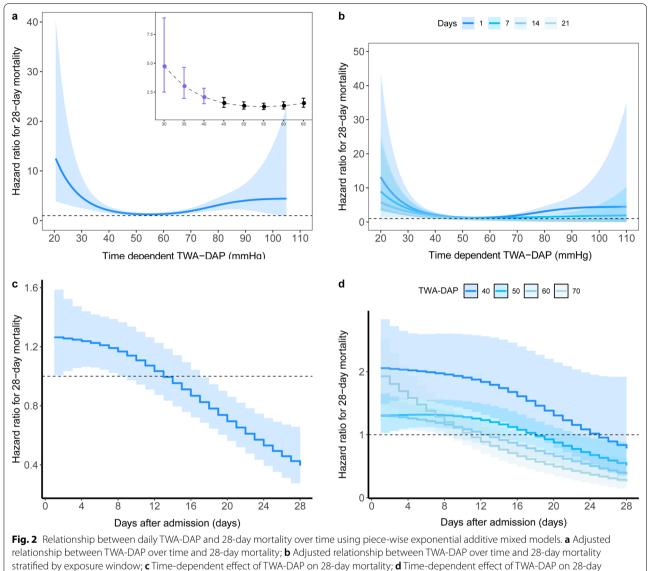
Based on the PAMMs, we determined a U-shaped relationship between time-dependent TWA-HR or TWA-DAP and the risk of 28-day mortality (Figs. 1a and 2a). The results showed that patients with septic shock had the lowest mortality at DAP of 50-70 mmHg (Fig. 1a), while HR of 60–90 bpm (Fig. 2a). The risk of death consistently increased at TWA-HR \geq 100 bpm (Fig. 1b) and TWA-DAP \leq 40 mmHg (Fig. 2b). The strength of the correlation between DAP intensity and 28-day mortality, as measured by TWA-HR or TWA-DAP, did not persist during the ICU stay (Figs. 1c, 2c). TWA-DAP had a significant effect on mortality in the early-mid stage of the disease (12–14 days after ICU admission), especially within 7 days (Fig. 2d). Although the effect of TWA-HR was in the early-mid stage of disease (within 14 days after ICU admission) and for higher levels of TWA-HR, its effect on mortality persisted until mid- to late ICU admission (up to 24 days) (Fig. 1d).

After adjusting for age, sex, type of ICU, BMI, CCI, receiving IMV, receiving vasopressors, CRRT, SOFA and lactate, time-dependent TWA-DAP (hazard ratio per 5 mmHg, 0.99 95% CI 0.94–1.03) and TWA-HR (hazard ratio per 10 bpm 1.16, 95% CI 1.1–1.21) were both associated with an increased risk of death at 28 days (Additional file 1: Table S3).



First, exposure to tachycardia (hazard ratio 1.37, 95% CI 1.1–1.7) or low DAP (hazard ratio 1.53, 95% CI 1.31–1.79) was associated with an increased risk of mortality at 28 days (Table 1). Early cumulative mortality due to tachycardia increased rapidly, with cumulative mortality at 28 days reaching approximately 10%. Subsequently, the risk of death was lower in patients without low DAP exposure than in those with overall exposure, while the risk of death was significantly increased in patients with combined low DAP exposure (Additional file 1: Fig. S4). It has been suggested that there may be a potential interaction between tachycardia and low DAP. Secondly, as the proportion of time

exposed to tachycardia and low DAP increased, the risk of death increased significantly (Fig. 3), the risk of death caused by tachycardia increased 3.78 times (hazard ratio 3.78, 95% CI 2.91 to - 4.9), and lower DAP leads to a 6.41 times higher risk of death (hazard ratio 6.41, 95% CI 3.86–10.65) (Additional file 1: Table S4). In general, lower DAP was associated with a higher risk of death. Finally, no causal effect was found in the model of the mediating effect of tachycardia and low DAP (Additional file 1: Fig. S5), whereas a sharply increased risk of death was found when patients were exposed to both tachycardia and low DAP, increasing with the proportion of exposure time via the interaction effect (p for interaction < 0.001) (Additional file 1: Fig. S6).



mortality stratified by level of DAP. TWA time-weighted average, DAP diastolic arterial pressure

The subgroup analysis of the relationship between time-dependent low DAP, tachycardia, and 28-day mortality is shown in Fig. 4. As the proportion of exposure time increased, the risk of death from tachycardia increased significantly only after a long time (>50%), and when the proportion of exposure time was >70%, the risk of death increased 2.45 times (hazard ratio 2.45, 95% CI 1.78–3.37) (Fig. 4a), while exposure to low DAP increased the risk of death, and when the proportion of exposure time was >70%, the risk of death increased 4.51 times (hazard ratio 4.51, 95% CI 2.35–8.66) (Fig. 4b). Finally, tachycardia affected the prognosis of patients with myocardial infarction, diabetes mellitus, congestive heart failure, and hypertension and that of women, while low DAP

affected the prognosis of patients with hypertension and that of men.

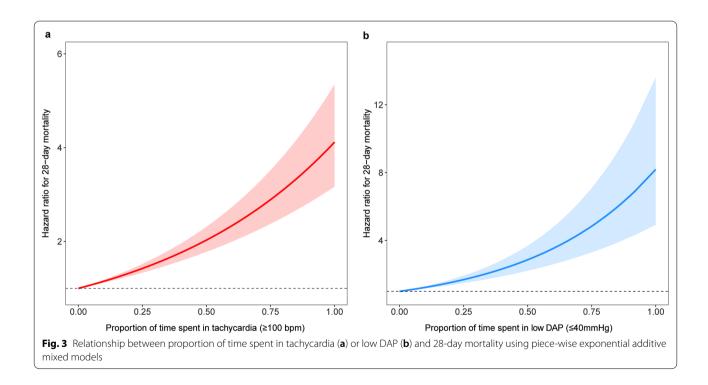
Discussion

The time-dependent intensity of HR and DAP exposure, measured by daily TWA-HR or TWA-DAP, was associated with increased mortality at 28 days in patients with septic shock, and the strength of this association was predominant in the early-middle course of illness, particularly within 7 days. Patients in septic shock have the lowest mortality at a DAP of 50–70 mmHg and an HR of 60–90 bpm. We also found a cumulative effect of harmful exposure (TWA-DAP \leq 40 mmHg or TWA-HR \geq 100 bpm) over time. Moreover, tachycardia and

Table 1 Effects of exposure to tachycardia and low DAP on 28-day mortality in patient with septic shock

	Exposure to tachycardia (HR≥100 bpm)			Exposure to low DAP (DAP \leq 40 mmHg)		
	HR	95%Cl	P value	HR	95%CI	P value
Baseline variables						
Age, years	1.02	(1.01-1.03)	< 0.001	1.01	(1.01-1.02)	< 0.001
Male	0.81	(0.69–0.94)	0.004	0.85	(0.73–0.98)	0.026
BMI, kg/m ²	0.99	(0.98-1.00)	0.075	0.99	(0.98–1.00)	0.097
CCU	0.33	(0.28-0.40)	< 0.001	0.32	(0.27–0.38)	< 0.001
OASIS	1.02	(1.01-1.03)	< 0.001	1.02	(1.02-1.03)	< 0.001
SOFA	1.09	(1.06–1.11)	< 0.001	1.08	(1.05–1.11)	< 0.001
CCI	1.10	(1.06–1.13)	< 0.001	1.09	(1.06-1.12)	< 0.001
Lactate, mmol/l	1.11	(1.09–1.13)	< 0.001	1.11	(1.09–1.13)	< 0.001
Time-dependent variables						
Receiving IMV	1.24	(1.01-1.52)	0.034	1.24	(1.01-1.52)	0.032
Receiving CRRT	1.95	(1.52-2.50)	< 0.001	1.81	(1.41-2.32)	< 0.001
Use of vasopressors	3.20	(2.66–3.87)	< 0.001	3.15	(2.61-3.80)	< 0.001
Tachycardia (<u>></u> 100bmp)	1.37	(1.10–1.70)	< 0.001			
Low DAP (≤40 mmHg)				1.53	(1.31-1.79)	< 0.001

HR hazard ratio, CI confidence interval, BMI body mass index, OASIS Oxford Acute Severity of Illness Score, SOFA sequential organ failure assessment, CCI Charlson Comorbidity Index, CRRT continuous renal replacement therapy, IMV invasive mechanical ventilation, CCU Cardiac Care Unit, TWA time-weighted average, DAP diastolic arterial pressure, HR heart rate, bpm beats/breaths per minute



low DAP had an interactive effect on the increased risk of death with prolonged exposure times. Tachycardia and low DAP have different effects on the risk of death in different populations. With the emergence of a large amount of evidencebased medical evidence, the SSC guidelines have been updated several times [7–9]. Current guidelines emphasize the importance of MAP in sepsis and septic shock,

Subgroups	Ν		HR(95%CI) p value	Subgroups	N	HR(95%Cl) p val
All patients	4959	H B -1	1.37(1.10 - 1.70) 0.003	All patients	4959	1.53(1.31 - 1.79) <0.0
Exposure proport	ion			Exposure propo	rtion	
<=10%	2775	• •• •	0.94 (0.72 - 1.22) 0.633	<=10%	4525 🗖	1.33(1.12-1.58) 0.00
10-30%	1035	- -	0.98 (0.75 - 1.29) 0.896	10-30%	294 া 📥	1.90(1.47-2.45) <0.0
30-50%	533	• •	1.26 (0.91 - 1.73) 0.155	30-50%	89 🛏 🛏	2.29(1.49-3.53)<0.0
50-70%	267		1.45(1.00-2.12) 0.046	50-70%	31	3.19 (1.71 - 5.95) <0.0
>70%	349		2.45(1.78 - 3.37)<0.001	>70%	20	4.51 (2.35 - 8.66) <0.0
Gender				Gender		
Female	1818		1.57(1.13-2.18) 0.006	Female	1818 🚍	1.35(1.07 - 1.71) 0.0 ⁻
Male	3141	• -	1.24 (0.93 - 1.65) 0.132	Male	3141 🚍	1.69(1.38-2.08)<0.0
Comorbidity				Comorbidity		
Myocardial infarct	1015	-	1.83 (1.17 – 2.87) 0.007	Myocardial infarct	1015 🚍	1.30 (0.93 - 1.82) 0.1
Congestive heart fail	ure 1294		1.55(1.07-2.24) 0.018	Congestive heart fa	ailure 1294 📑	1.31(1.00-1.71) 0.04
Diabetes	1510	· · · · · · · · · · · · · · · · · · ·	− 1.98 (1.36 − 2.89) <0.001	Diabetes	1510 🚘	1.29(0.98-1.71) 0.06
Hypertension	3277	H-	1.49(1.15-1.94) 0.002	Hypertension	3277 🗖	1.43(1.18-1.73) <0.0
	0.	5 1 1.5 2 2.5	3 3.5		1 2 3 4	5 6 7 8 9

Fig. 4 Subgroup analyses of the relationship between different proportions of time exposure to tachycardia (a) or ow DAP (b) and 28-day mortality over time using piece-wise exponential additive mixed models. *HR* hazard ratio, *CI* confidence interval

whereas the value of DAP is rarely mentioned [15]. Since loss of vascular tone is a crucial pathophysiological feature of septic shock, the effect of DAP, as a marker of vascular tone, on the clinical outcomes of patients with septic shock has not been elucidated and is easily overlooked by intensivists [6, 11]. Although it is well known that DAP is important for maintaining tissue perfusion [16] and organ function [17, 18], current guidelines do not recommend an appropriate target DAP [6, 10, 11].

From a physiological point of view, DAP is not only a marker of arterial vascular tone but also an upstream pressure of left ventricular perfusion [19]. As long as the aortic valve is normal and the vascular tone from the ascending aorta to the peripheral vessels remains almost constant, detection of DAP in the peripheral vessels can reflect the vascular tone [4]. DAP depends on the vascular tone and duration of the cardiac cycle, since the coronary arteries provide perfusion to the left ventricle only during diastole [16]. Low DAP can impair left ventricle myocardial perfusion, especially in tachycardia with limited diastolic time [20]. Tascón et al. found that DAP and HR simultaneously moving in opposite directions may indicate more severe cardiovascular dysfunction, while isolated DAP or HR values could not clearly identify this risk [12].

Previous retrospective studies exploring the effect of DAP on outcomes in patients with septic shock were limited by a single measurement of DAP, that is, within 24 h after admission to the ICU, and did not account for the interaction between tachycardia and DAP [21, 22]. Biologically, a single exposure can alter the results

so dramatically that they are unreliable. Although Tascón et al. proposed that DSI could reflect the prognosis of patients with septic shock, they only compared the change in DSI before and after the use of vasopressors [12]. To resolve this defect, we evaluated exposures to DAP and HR throughout admission to the ICU (up to 28 days) and treated daily DAP and HR as time-dependent variables in PAMMs to explore their effects over time. Second, previous studies believed that DAP < 50 mmHg would affect the prognosis of patients with sepsis, but the grade of clinical evidence was exceptionally low [22]. In this study, we identified thresholds for DAP and HR below (\leq 40 mmHg) or above (\geq 100 bpm), which significantly increased the risk of mortality at 28 days, suggesting that norepinephrine can be used as soon as possible when DAP < 40 mmHg, especially in tachycardia [11]. Third, in previous studies, multivariate regression models were adjusted only for baseline confounders, which may have led to residual confounders [14]. The difference in this study was that we used PAMMs to account for both baseline and time-dependent confounders.

We visualized the longitudinal association between TWA-DAP or TWA-HR and mortality at 28 days throughout ICU admission and suggested that intensivists should pay more attention to DAP and HR during the early to mid-stages of illness, especially within 7 days after ICU admission. The results showed that the optimal range of DAP is 50 to 70 mmHg, while HR is 60 to 90 bpm as much as possible to not affect myocardial perfusion. Assessing cumulative exposure is equally important. For the first time, we found that both time-dependent low exposure to DAP and tachycardia are associated with harm. With prolonged exposure to tachycardia, the effect on mortality progressively increased with time. However, exposure to low DAP was associated with increased mortality, and the interaction between low DAP and tachycardia was more significant. This finding suggests that the incorporation of DAP into the management of septic shock may have profoundly impact treatment decisions, such as the early use of norepinephrine [23]. Furthermore, the effects of exposure infarction, hypertension, and other specific populations on tachycardia and low DAP are different, and the treatments should also be different.

Limitations

This study has several limitations. First, our study design was a retrospective observational study, and MIMIC-IV is a single-center database; this study has some selection bias, which limits the extrapolation of our conclusions. Second, our diagnostic criteria for septic shock are not completely equivalent to Sepsis-3, making it necessary to further verify the results by clinical studies based on Sepsis-3. Finally, we excluded patients who did not use invasive blood pressure monitoring, because of doubts regarding the accuracy of DAP when obtained using a noninvasive blood pressure device [24]. In fact, the device did not directly measure the DAP. Therefore, for patients with septic shock, we also recommend the insertion of an arterial catheter so that DAP can be measured directly, increasing the reliability of the results [12, 21].

Conclusions

DAP and HR should be closely monitored in patients with septic shock, especially in the early to mid-stages after ICU admission. The optimal ranges for DAP and HR in patients with septic shock are 50–70 mmHg and 60–90 bpm, respectively. Cumulative exposure to low DAP (\leq 40 mmHg) and tachycardia (\geq 100 bpm) is associated with an increased risk of death, and there are interactive effects between low DAP and tachycardia.

Abbreviations

DAP: Diastolic arterial pressure; HR: Heart rate; MIMIC-IV: Medical Information Mart for Intensive Care IV; TWA: Time-weighted average; MAP: Mean arterial pressure; DSI: Diastolic shock index; ICU: Intensive care unit; ICD: International Classification of Diseases; BMI: Body mass index; SAPS II: Simplified acute physiology score II; OASIS: Oxford Acute Severity of Illness Score; SOFA: Sequential organ failure assessment; CCI: Charlson Comorbidity Index; CRRT : Continuous renal replacement therapy; IMV: Invasive mechanical ventilation; RR: Respiratory rate; MAP: Mean arterial pressure; bpm: Beats/breaths per minute; PAMMs: Piece-wise exponential additive mixed models; MICE: Multiple interlocking equations interpolation.

Supplementary Information

The online version contains supplementary material available at https://doi. org/10.1186/s40001-022-00930-6.

Additional file 1: Figure S1. Study flow diagram in the current study. Figure S2. Time-dependent effect of TWA-HR (a) or TWA-DAP (b) on 28-day mortality. Figure S3. Distribution of missing values for baseline variables. Figure S4. Cumulative effect of tachycardia and low DAP on 28-day mortality. (a) Cumulative mortality exposure to tachycardia. (b) Cumulative mortality exposure to tachycardia without low DAP. (c) Cumulative mortality exposure to tachycardia combined low DAP. Figure S5. The direct and indirect effects of tachycardia and low DAP on 28-day mortality. Figure S6. The interaction effect of proportion of time spent in tachycardia and low DAP on 28-day mortality.

Additional file 2: Table S1. Baseline characteristics and outcomes of patients stratified by TWA-HR on Day 1. Table S2. Baseline characteristics and outcomes of patients stratified by TWA-DAP on Day 1. Table S3 Effects of time-dependent TWA-HR and TWA-DAP on 28-day mortality in patients with septic shock. Table S4. Effects of proportion of exposure time in tachycardia and low DAP on 28-day mortality in patients with septic shock.

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Author contributions

XW and YM designed the study; LW (Record ID: 39691989) extracted the data; XW, LW, and ZJ conducted data quality management and statistical analysis and drafted the manuscript; HT participated in the literature search; LY, HT, and YM critically revised the manuscript. All the authors contributed to the article, read, and approved the final manuscript.

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Availability of data and materials

The datasets are available in PhysioNet (https://physionet.org/content/mimic iv/2.0/).

Declarations

Ethics approval and consent to participate

MIMIC-IV database is a publicly available anonymized database, and approval for the ethical committee was not necessary.

Consent for publication

Not applicable.

Competing interests

The authors declare that they have no competing interests.

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