

## RESEARCH

# Risk assessment of sepsis through measurement of proAVP (copeptin): a secondary analysis of the TRIAGE study

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## Abstract

**Objective:** Systemic infections and sepsis lead to strong activation of the vasopressin system, which is pivotal for stimulation of the endocrine stress response and, in addition, has vasoconstrictive and immunomodulatory effects. Our aim was to assess the significance of the vasopressor system through measurement of C-terminal proAVP (copeptin) regarding mortality prediction in a large prospective cohort of patients with systemic infection.

**Design and methods:** This secondary analysis of the observational cohort TRIAGE study included consecutive, adult, medical patients with an initial diagnosis of infection seeking emergency department care. We used multivariable regression analysis to assess associations of copeptin levels in addition to the Sequential Organ Failure Assessment (SOFA) score with 30-day mortality. Discrimination was assessed by calculation of the area under the curve (AUC).

**Results:** Overall, 45 of 609 (7.4%) patients with infection died within 30 days. Non-survivors had a marked upregulation of the vasopressin system with a more than four-fold increase in admission copeptin levels compared to non-survivors ( $199.9 \pm 204.7$  vs  $46.6 \pm 77.2$  pmol/L). In a statistical model, copeptin was significantly associated with mortality (adjusted odds ratio of 1.04, 95% CI 1.01 to 1.07,  $P = 0.002$ ). Regarding discrimination, copeptin alone showed an AUC of 0.82, while adding copeptin to the SOFA score significantly improved its prognostic ability (AUC 0.83 vs 0.86,  $P = 0.027$ ).

**Conclusion:** Activation of the vasopressin system mirrored by an increase in copeptin levels provided significant information regarding mortality risk and improved the SOFA score for prediction of sepsis mortality.

## Key Words

- ▶ copeptin
- ▶ SOFA score
- ▶ risk-stratification
- ▶ infection
- ▶ sepsis

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## Introduction

Systemic infection leading to sepsis contributes to a major portion of patients seeking care in the emergency department (ED) and the intensive care unit (ICU) (1, 2). Sepsis has been defined as life-threatening organ dysfunction caused by a dysregulated host response to infection and is associated with increased use of healthcare resources and mortality (3, 4). Sepsis leads to

strong physiological activation of the vasopressin system aiming to co-stimulate the endocrine stress response and stabilize blood hemostasis through vasoconstrictive effects and the overwhelming immune response through immunomodulatory effects (5). While pharmacological treatment of sepsis patients with vasopressin did not appear to lower mortality (6), measuring the activation

of the vasopressin system could provide important prognostic information regarding the severity of the infection and associated mortality risks.

Estimating severity and risk for mortality has become the main focus in the initial assessment of sepsis. It has become clear that organ dysfunction is both a hallmark of severe systemic infection and a main prognostic indicator (7, 8). According to current guidelines, the diagnosis of sepsis thus also relies on the sequential organ failure assessment (SOFA), which reflects the individual degree of organ dysfunction (9). However, relying on SOFA still is not perfect, and there is misclassification of patients regarding their true mortality risk. Thus, improving SOFA by the addition of other prognostic indicators is important. Herein, novel biomarkers mirroring fluid and endocrine activation may be helpful (1, 10, 11, 12). Hemodynamic instability, including vascular tone loss, decreased arterial blood pressure and tissue perfusion, occurs in sepsis and in septic shock resulting in activation of counteracting mediators (13, 14). This includes activation of the arginine vasopressin (AVP) on the hypothalamic–pituitary–adrenal (HPA) axis (15, 16, 17). As AVP is hard to measure due to the instability and short half-life, the more stable pre-hormone copeptin (39-amino acid C-terminal portion of proAVP) may be measured instead (14, 18, 19, 20). Copeptin has previously been shown to provide prognostic information in patients with stroke and infection of the lung (10, 21, 22, 23, 24), as well as for critically ill patients with sepsis (13, 25, 26, 27, 28). However, to our knowledge, there is a lack of studies investigating whether the addition of copeptin to SOFA could improve the prognostic assessment of patients by providing information regarding activation of the vasopressin system.

Our aim was to assess the significance of the activation of the vasopressor system through measurement of copeptin in addition to SOFA regarding mortality prediction in a large prospective cohort of patients with systemic infection.

## Materials and methods

### Study design, setting and patient sample

This is a secondary analysis of the prospective TRIAGE study (1), a multi-national, observational cohort study, which recruited consecutive ED patients with any symptoms in Aarau (Switzerland), Paris (France), and Clearwater (FL, USA) between March 2013 and October 2014. The study protocol (29) and main results (1) have

been published previously. The Institutional Review Board of all centers approved the protocol and waived the need for individual information content due to the observational design of the study (main Swiss IRB: Ethic Commission of the Canton Aargau: registration number: EK-2012/059). The TRIAGE study was registered at the “ClinicalTrials.gov” website (<http://www.clinicaltrials.gov/ct2/show/NCT01768494>, last access 19.02.2021).

For this secondary analysis, only medical patients presenting at the tertiary care hospital in Aarau (Switzerland) with a main diagnosis of infection were included. Thus, all patients had a main infection diagnosis, which was verified through their Swiss diagnosis-related groups (DRG) coding at discharge (from: <https://www.swissdrg.org>, last access 19.02.2021). Surgical and pediatric patients were not part of the study.

### Data collection and selection

All included participants provided a medical history and underwent a physical examination, including measurement of vital signs, laboratory assessment and collection of leftover blood samples. We also recorded socio-demographical data, clinical symptoms, complaints, and comorbidities. Patient’ outcomes, including admission to ICU and length of hospital stay (LOS), were collected by chart review, if necessary. Missing data was supplemented through chart abstraction and automatic export from the internal medical data system. All included patients were contacted 30 days after hospital admission via telephone interview to assess their vital status.

### Primary and secondary endpoints

Consistent with the initial study, the primary endpoint of this analysis was defined as all-cause 30-day mortality. Secondary endpoints were defined as admission to the ICU within 30 days following ED admission and positive blood cultures during the hospital stay.

### Definitions of infection at ED admission

For this analysis, we grouped patients into pre-specified groups based on the main focus of infection, namely respiratory tract infection (including community-acquired pneumonia, chronic obstructive pulmonary disease (COPD)-exacerbation, asthma-exacerbation, bronchitis), urinary tract infection, skin infection, gastrointestinal infection, CNS infection, and other types of infections.

### SOFA score calculation

In order to identify organ dysfunction caused by a dysregulated host response to infection, the SOFA score as proposed by the 'Third International Consensus Definitions for Sepsis and Septic Shock' was used (30). The score evaluates different organ systems (respiratory, coagulation, liver, cardiovascular, central nervous, and renal), which require laboratory and clinical variables for assessment and computation (9). Because the main entry point of the study was the ED and not all patients had an arterial blood gas analysis taken, we used an adapted score as previously proposed relying on the  $SO_2/FiO_2$  index instead of the  $pO_2/FiO_2$  index (9). If the route of  $O_2$  administration was unknown, we assumed a  $FiO_2$  of 0.3 for patients with nasal  $O_2$  administration according to the previous study (31). For the cardiovascular system, 0 points were assigned for mean arterial pressure (MAP)  $\geq 70$  mmHg and 1 point for MAP  $< 70$  mmHg as specified in the original SOFA score calculation.

### Copeptin measurement and other markers of the osmotic system

For the analysis of these copeptin values, there were no new measurements performed. The analyzed copeptin data were measured during the TRIAGE study and are original data from there. For this, leftover samples of routinely collected blood samples upon admission were immediately centrifuged, aliquoted and frozen at  $-20^\circ\text{C}$  for later batch analysis of copeptin. Copeptin was batch-measured in plasma with a new sandwich immunoassay as described elsewhere (14, 32). The assays have analytical detection limits of 0.4 pmol/L. We also recorded other markers influencing the osmotic system, such as sodium, osmolality and glomerular filtration rate (GFR) from the routine laboratory assessment.

### Statistical analysis

All statistical analyses were performed using STATA 15.1 (StataCorp LLC). For descriptive statistics, discrete variables are expressed as frequency (percentage) and continuous variables are expressed as mean with s.d. or as medians with interquartile range (IQR). Imputation methods were used to complete data missing less than 10% of values. Univariable and multivariable logistic regression models with primary and secondary endpoints were used to examine the association of copeptin and other markers. Laboratory values with non-normal distribution were

normalized through log-transformation before being entered into the statistical models. Odds ratios (OR), including the corresponding 95% CIs were reported as a measure of association. We predefined three types of regression models, namely an unadjusted model (model 1), a model adjusted for age, sex, type of infection and comorbidities (model 2), and a model adjusted for age, sex, type of infection, comorbidities and SOFA score (model 3). The area under the receiver-operator-curve (ROC-AUC) was calculated as a measure of discrimination. Moreover, we also investigated subgroups for differences in performance based on socio-demographic factors (age and sex), type of infection and fluid balance makers.

## Results

### Patient population

This analysis includes a total of 654 medical inpatients presenting with a main diagnosis of infection to the ED of the Cantonal Hospital Aarau (Switzerland). The median age was  $61 \pm 20$  years and 56% ( $n = 365$ ) of the patients were male. The mean SOFA score was 1.5 points ( $\pm 2$ ) and 62.4% of patients had a SOFA score  $< 2$  points. Regarding focus of infection, respiratory tract infection ( $n = 272$ , 41.6%) and urinary tract infection ( $n = 154$ , 23.5%) were most frequent. Almost 30% of patients had chronic kidney disease ( $n = 184$ ). Overall, a total of 45 patients (6.9%) reached the primary endpoint of all-cause 30-day mortality. Baseline characteristics of the patient population overall and stratified according to the primary endpoint are presented in Table 1.

### Association of SOFA, copeptin and fluid balance markers with primary and secondary endpoints

Overall, initial SOFA score values were three-fold higher in patients who died compared to survivors ( $4.2 \pm 2.7$  vs  $1.3 \pm 1.8$ ,  $P < 0.001$ ) (Table 2). Also, copeptin levels upon admission were four-fold higher in non-survivors compared to survivors ( $199.9 \pm 204.7$  pmol/L vs  $46.6 \pm 77.2$  pmol/L). In an unadjusted logistic regression analysis (model 1), we found an association of copeptin with an OR of 1.08 (95% CI 1.06, 1.10,  $P < 0.001$ ) for the primary endpoint 30-day mortality. These results remained robust in the multivariable model 2 (OR 1.06 (95% CI 1.04, 1.09),  $P < 0.001$ ), adjusted for age, sex, type of infection and comorbidities, as well as in the multivariable model 3 adjusted for age, sex, type of infection, comorbidities

**Table 1** Baseline characteristics of the overall cohort and stratified by primary endpoint.

	All (n = 654)	Survivors (n = 609)	Non-survivors (n = 45)	P-value
<b>Sociodemographics</b>				
Age (years)	61.0 (20.3)	59.8 (20.3)	78.3 (10.2)	<0.001
Male sex	365 (55.8%)	336 (55.2%)	29 (64.4%)	0.23
<b>Clinical presentation at ED admission</b>				
Blood pressure systolic (mmHg)	129.9 (22.6)	130.7 (22.0)	119.3 (27.2)	0.001
Blood pressure diastolic (mmHg)	74.8 (15.3)	75.5 (14.3)	64.6 (23.1)	<0.001
Pulse rate (bpm)	90.4 (19.5)	89.8 (19.0)	97.7 (24.4)	0.010
SpO <sub>2</sub> (%)	93.8 (4.5)	94.0 (4.3)	91.2 (5.6)	<0.001
O <sub>2</sub> administration	119 (18.3%)	95 (15.7%)	24 (54.5%)	<0.001
Temperature (°C)	37.9 (1.1)	37.9 (1.1)	37.7 (1.0)	0.26
GCS	14.7 (1.2)	14.8 (0.8)	13.4 (3.1)	<0.001
<b>SOFA score at ED admission</b>				
Total SOFA score	1.5 (2.0)	1.3 (1.8)	4.2 (2.7)	<0.001
SOFA score < 2 points	408 (62.4%)	401 (65.8%)	7 (15.5%)	
SOFA score 2–5 points	208 (31.8%)	187 (30.7%)	21 (46.6%)	
SOFA score > 5 points	38 (5.8%)	21 (3.5%)	17 (37.9%)	
<b>Origin of infection</b>				
Respiratory tract infection	272 (41.6%)	246 (40.4%)	26 (57.8%)	0.12
Pneumonia	135 (49.6%)	117 (47.6%)	18 (69.2%)	0.023
Asthma exacerbation, bronchitis, others	120 (44.1%)	115 (46.7%)	5 (19.2%)	
COPD exacerbation	17 (6.3%)	14 (5.7%)	3 (11.5%)	
Urinary tract infection	154 (23.5%)	145 (23.8%)	9 (20.0%)	
Skin infection	59 (9.0%)	56 (9.2%)	3 (6.7%)	
Gastrointestinal tract infection	39 (6.0%)	35 (5.7%)	4 (8.9%)	
CNS infection	17 (2.6%)	17 (2.8%)	0 (0.0%)	
Other infection	113 (17.3%)	110 (18.1%)	3 (6.7%)	
<b>Comorbidities</b>				
Anemia	316 (48.3%)	279 (42.7%)	37 (5.7%)	<0.001
Hypertension	305 (46.6%)	278 (45.6%)	27 (60.0%)	0.063
Chronic renal failure	184 (28.1%)	155 (25.5%)	29 (64.4%)	<0.001
Cancer	122 (18.7%)	106 (17.4%)	16 (35.6%)	0.003
Diabetes mellitus	119 (18.2%)	108 (17.7%)	11 (24.4%)	0.26
Coronary heart disease	89 (13.6%)	73 (12.0%)	16 (35.6%)	<0.001
COPD	53 (8.1%)	42 (6.9%)	11 (24.4%)	<0.001
Congestive heart failure	47 (7.2%)	42 (6.9%)	5 (11.1%)	0.29
Dementia	45 (6.9%)	37 (6.1%)	8 (17.8%)	0.003
Substance abuse	27 (4.1%)	26 (4.3%)	1 (2.2%)	0.51
Stroke	26 (4.0%)	24 (3.9%)	2 (4.4%)	0.87
<b>Initial blood sample</b>				
Na (mmol/L)	136.8 (4.3)	136.7 (4.2)	137.4 (6.1)	0.34
Hyponatremia (<135 mmol/L)	214 (32.7%)	199 (32.7%)	15 (33.3%)	0.003
Normonatremia (136–143 mmol/L)	414 (63.3%)	390 (64.0%)	24 (53.3%)	
Hypertatremia (>143 mmol/L)	26 (4.0%)	20 (3.3%)	6 (13.3%)	
Osmolality (mosmol/kg)	289.1 (11.2)	288.4 (10.6)	297.6 (14.9)	<0.001
Hypoosmolality (<280 mosmol/kg)	101 (15.4%)	99 (16.3%)	2 (4.4%)	<0.001
Normoosmolality (280–300 mosmol/kg)	483 (73.9%)	458 (75.2%)	25 (55.6%)	
Hyperosmolality (>300 mosmol/kg)	70 (10.7%)	52 (8.5%)	18 (40.0%)	
GFR MDRD (mL/min/1.73 m <sup>2</sup> )	52.2 (14.9)	53.4 (13.9)	37.2 (18.7)	<0.001
CKD Stage 1 + 2 (>60)	410 (62.7%)	399 (65.5%)	11 (24.4%)	<0.001
CKD Stage 3 (30–60)	175 (26.8%)	158 (25.9%)	17 (37.8%)	
CKD Stage 4–5 (<30)	69 (10.6%)	52 (8.5%)	17 (37.8%)	

COPD, chronic obstructive pulmonary disease; ED, emergency department; GCS, Glasgow Coma Scale; GFR, glomerular filtration rate; MDRD, modification of diet in renal disease; SOFA score, sequential organ failure assessment score; SpO<sub>2</sub>, peripheral capillary oxygen saturation.

and SOFA score (OR 1.04 (95% CI 1.01, 1.07),  $P=0.002$ ). Copeptin also showed an association for the two secondary endpoints – ICU admission and blood culture positivity – in the unadjusted model (model 1). However, in the two

adjusted models (model 2 and model 3), the association was no longer significant for both secondary endpoints.

Regarding discrimination, copeptin was the strongest for 30-day mortality, with an AUC of 0.82 compared to



**Table 2** Univariable and multivariable logistic regression analysis for the primary and secondary endpoints.

	Survivors	Non-survivors	P-value	AUC	Model 1: Univariable OR (95% CI), P-value	Model 2 <sup>a</sup> : Multivariable OR (95% CI), P-value	Model 3 <sup>b</sup> : Multivariable OR (95% CI), P-value
Primary endpoint: 30-day mortality	n = 609	n = 45					
SOFA score	1.3 (1.8)	4.2 (2.7)	<0.001	0.83	1.66 (1.46, 1.89), P < 0.001	1.64 (1.38, 1.95), P < 0.001	-
Copeptin (pmol/L)	46.6 (77.2)	199.9 (204.7)	<0.001	0.82	1.08 (1.06, 1.10), P < 0.001	1.06 (1.04, 1.09), P < 0.001	1.04 (1.01, 1.07), P = 0.002
Na (mmol/L)	136.7 (4.2)	137.4 (6.1)	0.34	0.57	1.04 (0.96, 1.11), P = 0.340	1.01 (0.94, 1.09), P = 0.776	1.01 (0.94, 1.09), P = 0.843
Osmolality (mosmol/kg)	288.4 (10.6)	297.6 (14.9)	<0.001	0.74	1.06 (1.03, 1.08), P < 0.001	1.03 (1.00, 1.06), P = 0.033	1.01 (0.98, 1.04), P = 0.724
GFR MDRD (mL/min/1.73 m <sup>2</sup> )	53.4 (13.9)	37.2 (18.7)	<0.001	0.75	1.05 (1.03, 1.07), P < 0.001	1.05 (1.02, 1.08), P < 0.001	1.01 (0.98, 1.04), P = 0.579
Secondary endpoint: ICU admission	n = 588	n = 66					
SOFA score	1.3 (1.7)	4.0 (2.4)	<0.001	0.83	1.68 (1.49, 1.89), P < 0.001	1.65 (1.43, 1.90), P < 0.001	-
Copeptin (pmol/L)	51.8 (97.2)	105.0 (106.5)	<0.001	0.75	1.04 (1.02, 1.05), P < 0.001	1.02 (1.00, 1.05), P = 0.050	0.99 (0.96, 1.02), P = 0.417
Na (mmol/L)	136.8 (4.2)	136.4 (5.0)	0.46	0.52	0.98 (0.92, 1.04), P = 0.455	1.00 (0.94, 1.06), P = 0.899	1.01 (0.95, 1.07), P = 0.791
Osmolality (mosmol/kg)	288.5 (10.7)	294.3 (13.6)	<0.001	0.65	1.04 (1.02, 1.06), P < 0.001	1.02 (1.00, 1.05), P = 0.083	1.00 (0.98, 1.03), P = 0.828
GFR MDRD (mL/min/1.73 m <sup>2</sup> )	53.6 (13.5)	40.6 (20.2)	<0.001	0.70	1.04 (1.03, 1.06), P < 0.001	1.04 (1.02, 1.06), P < 0.001	1.00 (0.97, 1.02), P = 0.710
Secondary endpoint: blood culture positivity	n = 400	n = 81					
SOFA score	1.7 (2.0)	2.9 (2.5)	<0.001	0.65	1.28 (1.15, 1.41), P < 0.001	1.27 (1.11, 1.45), P = 0.001	-
Copeptin (pmol/L)	57.2 (95.2)	109.3 (131.9)	<0.001	0.68	1.04 (1.02, 1.06), P < 0.001	1.02 (1.00, 1.05), P = 0.052	1.01 (0.99, 1.04), P = 0.398
Na (mmol/L)	136.3 (4.3)	136.3 (4.5)	0.91	0.51	1.00 (0.94, 1.05), P = 0.912	1.00 (0.95, 1.06), P = 0.934	1.00 (0.94, 1.06), P = 0.968
Osmolality (mosmol/kg)	288.7 (11.4)	290.3 (13.3)	0.27	0.57	1.01 (0.99, 1.03), P = 0.271	1.00 (0.98, 1.02), P = 0.924	0.99 (0.97, 1.01), P = 0.333
GFR MDRD (mL/min/1.73 m <sup>2</sup> )	51.4 (15.8)	45.9 (16.1)	0.005	0.62	1.02 (1.01, 1.03), P = 0.006	1.01 (0.98, 1.03), P = 0.656	0.98 (0.96, 1.01), P = 0.196

<sup>a</sup>Adjusted for age, sex, type of infection and comorbidities; <sup>b</sup>adjusted for age, sex, type of infection and comorbidities and SOFA score. SOFA score, sequential organ failure assessment score; GF, glomerular filtration rate; MDRD, modification of diet in renal disease; AUC, area under the curve; OR, odds ratio.

the other fluid balance markers including Na (AUC 0.57), osmolality (AUC 0.74) and GFR (AUC 0.75) and similar to the SOFA score (AUC 0.82). We also compared AUCs of copeptin among different predefined patient subgroups. As demonstrated in Fig. 1, results were similar in the subgroup stratified by gender, type of infection, Na concentration and osmolality. However, a significant effect modification was found for urinary tract infection and CKD stage 3 (P for interaction < 0.05). We also investigated the same subgroups regarding SOFA score, where a subgroup effect was found for patients aged under 60 years (AUC 0.94) and for patients with CKD stages 4 and 5 (AUC of 0.53 (Fig. 2).

In the next step, we investigated whether the combination of SOFA score with copeptin and other fluid balance markers would further improve its prognostic potential. Table 3 shows the AUC of different bivariable and multivariable models combining different parameters. Adding copeptin to SOFA significantly improved its AUC from 0.83 to 0.86 (P = 0.028). Further addition of markers did only slightly provide better prognostication as assessed by improvements in AUC and none of the other markers improved the SOFA score, except MR-proADM which showed the same improvement as copeptin (AUC from 0.83 to 0.86, P = 0.002). Also, regarding blood culture positivity, copeptin improved the SOFA score from AUC 0.65 to 0.68, while none of the other markers had a similar effect. Finally, regarding admission to ICU, osmolality but not copeptin improved the model.

### Association of copeptin ICU admission and blood culture positivity

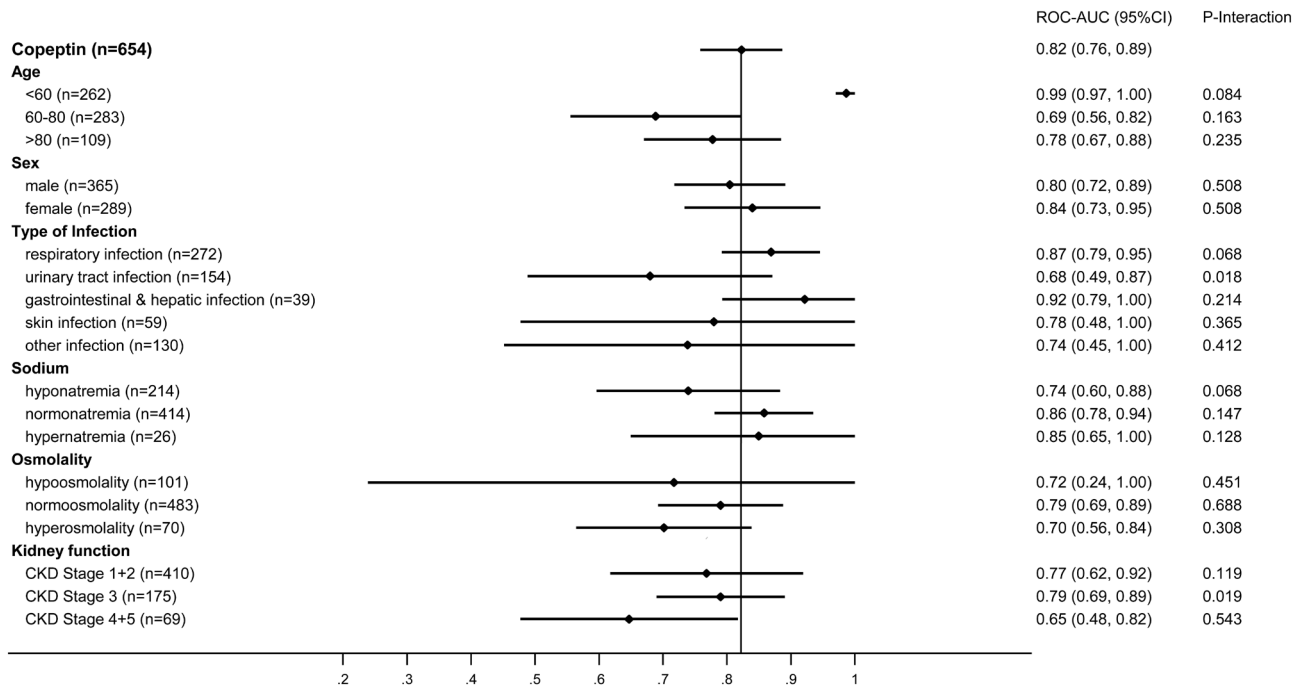
The SOFA score alone showed the best discrimination for the secondary endpoint of ICU admission as well (AUC 0.83) followed by copeptin with an AUC of 0.75. In contrast, regarding blood culture positivity, copeptin performed the best (AUC 0.68) followed by SOFA score (AUC 0.65), which nevertheless remained very weak. Results of the regression analysis and discrimination values are shown in Table 2.

Figure 3 illustrates the SOFA score together with copeptin, whereby stratification by age found higher AUC for 60 to 80 years (AUC 0.98) and a P for interaction of < 0.05 for stage 1 and 2 CKD.

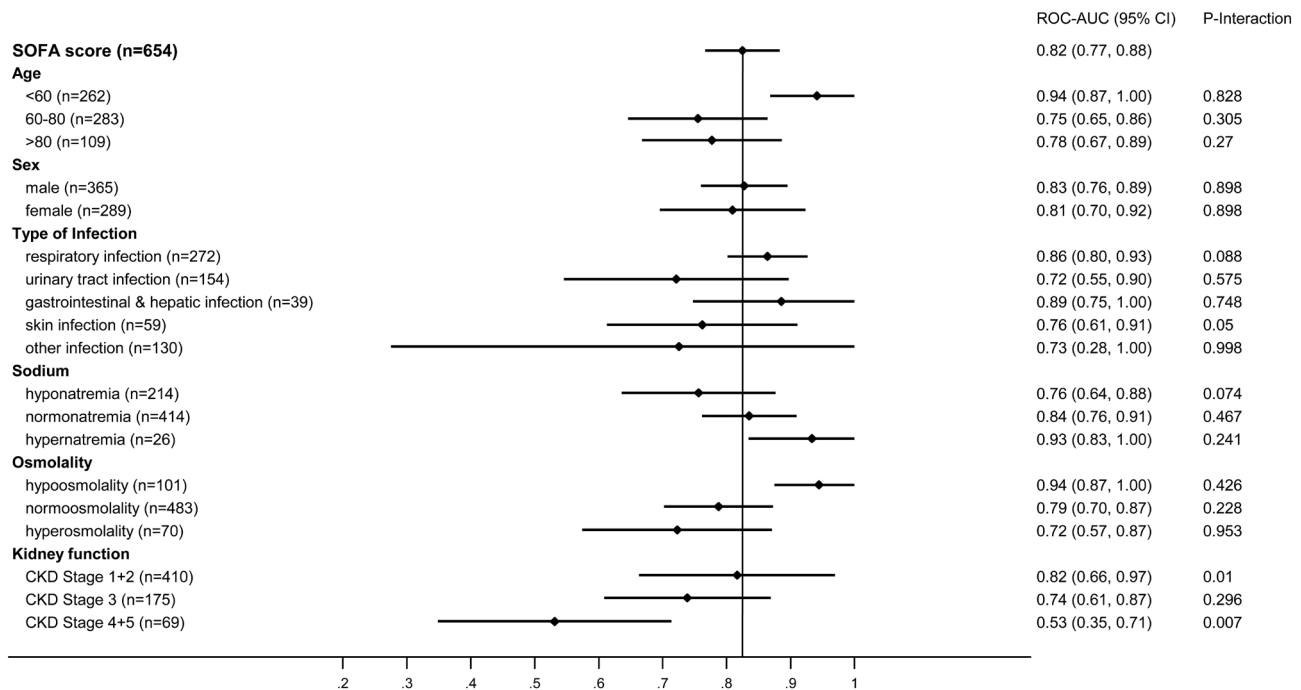
### Discussion

The key findings of this analysis are two-fold. First, we found that the activation of the vasopressin





**Figure 1** Prognostic performance of copeptin as predictor for 30-day mortality stratified by age, sex, type of infection, and fluid balance markers (sodium, osmolality and kidney function) to evaluate subgroup differences. The vertical reference line mirrors the overall AUC. AUCs to the right of the reference line indicate higher levels of discrimination, AUCs to the left of the reference line indicate lower levels of discrimination. The forest plot shows different levels of discrimination with their respective 95% CIs by subgroups. *P* for interaction indicates the level of effect modification by subgroups.



**Figure 2** Prognostic performance of SOFA score as predictor for 30-day mortality stratified by age, sex, type of infection, and fluid balance markers (sodium, osmolality and kidney function) to evaluate subgroup differences. The vertical reference line mirrors the overall AUC. AUCs to the right of the reference line indicate higher levels of discrimination, AUCs to the left of the reference line indicate lower levels of discrimination. The forest plot shows different levels of discrimination with their respective 95% CIs by subgroups. *P* for interaction indicates the level of effect modification by subgroups.

**Table 3** Association of various combinations of SOFA score with copeptin and fluid balance biomarkers for primary and secondary endpoints.

	AUC (95% CI)	P-value
Primary endpoint 30-day mortality		
SOFA score	0.83 (0.77, 0.88)	
Change in AUC in bivariate analysis		
SOFA score and Na	0.83 (0.77, 0.88)	0.7448
SOFA score and GFR	0.84 (0.78, 0.89)	0.0321
SOFA score and osmolality	0.84 (0.79, 0.89)	0.0861
SOFA score and copeptin	0.86 (0.81, 0.91)	0.0277
SOFA score and MR-proADM	0.86 (0.81, 0.90)	0.0016
Change in AUC in multivariate analysis		
SOFA score and copeptin and osmolality and GFR	0.87 (0.82, 0.92)	0.0281
SOFA score and copeptin and osmolality and GFR and Na	0.87 (0.82, 0.92)	0.0289
SOFA score and copeptin and GFR	0.87 (0.82, 0.92)	0.0144
SOFA score and copeptin and MR-proADM	0.87 (0.83, 0.92)	0.0075
Secondary endpoint admission to ICU		
SOFA score	0.83 (0.78, 0.88)	
Change in AUC in bivariate analysis		
SOFA score and copeptin	0.82 (0.77, 0.87)	0.0546
SOFA score and Na	0.82 (0.77, 0.87)	0.3127
SOFA score and GFR	0.82 (0.78, 0.87)	0.4976
SOFA score and osmolality	0.84 (0.80, 0.88)	0.0155
Change in AUC in multivariate analysis		
SOFA score and osmolality and GFR and Na and copeptin	0.83 (0.79, 0.88)	0.3516
SOFA score and osmolality and GFR and Na	0.84 (0.79, 0.88)	0.1387
SOFA score and osmolality and GFR	0.84 (0.79, 0.88)	0.0194
Secondary endpoint blood culture positivity		
SOFA score	0.65 (0.59, 0.72)	
Change in AUC in bivariate analysis		
SOFA score and GFR	0.64 (0.57, 0.71)	0.0589
SOFA score and osmolality	0.65 (0.58, 0.71)	0.7496
SOFA score and sodium	0.65 (0.58, 0.72)	0.9707
SOFA score and copeptin	0.68 (0.62, 0.74)	0.0144
Change in AUC in multivariate analysis		
SOFA score and copeptin and Na and osmolality and GFR	0.68 (0.61, 0.74)	0.0900
SOFA score and copeptin and Na and osmolality	0.68 (0.61, 0.74)	0.0876
SOFA-score and copeptin and Na	0.68 (0.62, 0.75)	0.0104

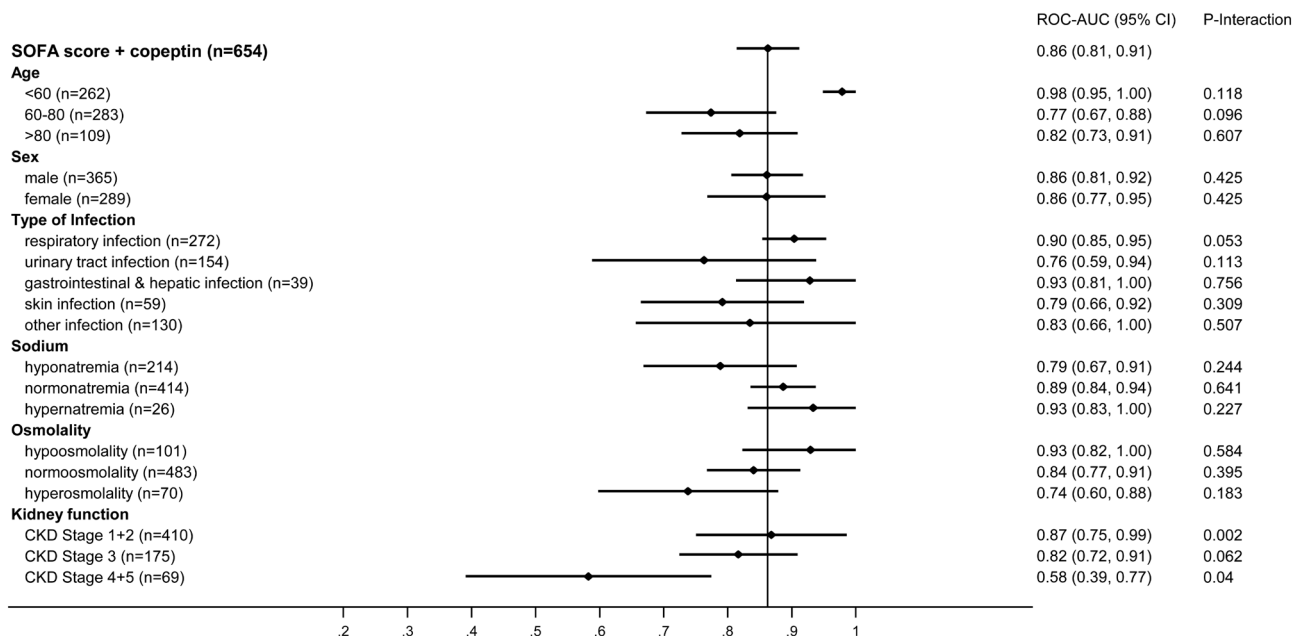
AUC, area under the curve; GFR, glomerular filtration rate; MR-proADM, mid-regional pro-adrenomedullin; SOFA score, sequential organ failure assessment score.

system mirrored by an increase in admission copeptin levels provided prognostic information regarding mortality. Secondly, when added to the SOFA score, this information further improved the early risk stratification of patients. The addition of fluid balance biomarkers, such as osmolality or Na, did not provide such prognostic information.

Early and reliable risk stratification in patients presenting with signs and symptoms of infection and possible sepsis is important to reduce time to effective treatment and improve the site of care decisions (1, 2). For this purpose, SOFA is a well-established score with high prognostic accuracy regarding mortality (8). It has been shown that the vasoactive peptide mid-regional pro-adrenomedullin (MR-proADM) is able to improve the mortality risk stratification in patients with infection

presenting to the ED beyond SOFA score alone and may further improve initial therapeutic site of care decisions (33). These findings were also shown for copeptin, as already mentioned above. Moreover, we have observed a further significant improvement of discrimination when adding both MR-proADM and copeptin to the SOFA score.

Physiopathologically, systemic infections lead to strong activation of the vasopressin system in order to balance vasodilatation by its vasoconstrictive and volume-retention effects. Often neglected vasopressin stimulates adreno-corticotrophic hormone (ACTH) secretion in synergy with hypothalamic corticotroph-releasing hormone (CRH). Thus, vasopressin mediates and amplifies the hypothalamic-pituitary-adrenal stress response. Vasopressin also has immunomodulatory effects (5). Vasopressin also controls Na balance by free water retention



**Figure 3**

Prognostic performance of SOFA score and copeptin as predictor for 30-day mortality stratified by age, sex-, type of infection, and fluid balance markers (sodium, osmolality and kidney function) to evaluate subgroup differences. The vertical reference line mirrors the overall AUC. AUCs to the right of the reference line indicate higher levels of discrimination, AUCs to the left of the reference line indicate lower levels of discrimination. The forest plot shows different levels of discrimination with their respective 95% CIs by subgroups. *P* for interaction indicates the level of effect modification by subgroups.

in the kidney. In addition to the production of vasopressin in response to volume and osmolality effects (5, 34), it is also a stress hormone that increases under physiological conditions of disease, including acute infections (27, 28). Physiological stress caused by infections or severe disease triggers the release of copeptin aiming to increase free water resorption in the kidney and thus maintaining blood pressure homeostasis through V2 receptors and inducing vasoconstriction of blood vessels through V1 receptors (35, 36, 37). The physiological role of copeptin is not yet known. However, this peptide may have a role during intracellular processing of provasopressin, which contributes to the correct structural formation of the AVP precursor, which in turn leads to efficient proteolytic maturation (38). Despite unknown function, copeptin has been described as a surrogate of AVP for physiological conditions and in different diseases (39). Several studies found copeptin to be increased in different types of infections and to be associated with short-term mortality (40, 41). Our finding of higher copeptin levels in infections as a marker and mediator of the stress response is, thus, not surprising. To our knowledge, however, this is the first large-scale study investigating the additive effects of the vasopressor system through measurement of copeptin to the SOFA score, the current gold standard for sepsis diagnosis, regarding mortality risk.

Our results are in line with previous studies showing that fluid balance markers (i.e. sodium, osmolality, GFR) may improve risk prediction for infection in addition to organ dysfunction markers (8, 12). Interestingly, patients with respiratory, gastrointestinal or hepatic infections had the most benefit when applying SOFA score together with copeptin levels. Especially remarkable is the impact of kidney function on predicting 30-day mortality when the SOFA score is combined with copeptin. Mortality prediction remains significant regardless of the stage of chronic kidney disease, indicating dysregulated fluid homeostasis, which is also in line with other investigations (42). Taken together with other study results, this is evidence of the strong correlation of body fluid balance with infection and mortality (43).

It represents also a fluid balance marker, associated with urine osmolality and sodium, released by increased plasma osmolality, decreased arterial pressure and reductions in cardiac volume (44). Earlier investigations of copeptin focused primarily on vasopressin-dependent disorders of fluid homeostasis, such as hyponatremia, polydipsia and diabetes insipidus in the outpatient setting with a generally low stress level (5, 34) or acute cardiovascular illness (45, 46).

Based on the above-mentioned findings, one may hypothesize that risk stratification can be improved by



assessing the SOFA score together with biomarkers, such as copeptin, in the initial assessment of patients with infection. One can expect better patient flow and a more adequate estimation of triage priority, which in turn may lead to lower ICU admissions and 30-day mortality rates. However, these findings must be investigated in further studies.

Our study has some limitations. First, because of the retrospective design of this analysis, we did not have all laboratory parameters and characteristics available, which would be of value in the context of copeptin measurement. We also used an adapted version of the SOFA score as not all patients had an arterial gas analysis done upon ED admission. Secondly, we limited all results to admission values only and no follow-up information regarding kinetics was available. Thirdly, we did not have a control patient population without infection to understand whether copeptin can discriminate between infection-related and non-infection-related deterioration in patients.

## Conclusion

In conclusion, activation of the vasopressin system mirrored by an increase in copeptin levels provided significant information regarding mortality risk and improved the SOFA score for prediction of sepsis mortality.

### Declaration of interest

P S and B M received research support paid to the Institution from Thermofisher, bioMerieux, Roche Diagnostics, Nestle Health Science and Abbott Nutrition. All other authors reported no conflicts of interest.

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### Author contribution statement

M K, C G and E H managed the data collection. M K, C G and P S performed the statistical analyses and M K and C G drafted the manuscript. E H, A K, B M and P S, amended and commented on the manuscript. All authors approved the final version.

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