

The Modified Early Warning Score: A Useful Marker of Neurological Worsening but Unreliable Predictor of Sepsis in the Neurocritically Ill—A Retrospective Cohort Study

OBJECTIVES: To determine the performance of the Modified Early Warning Score and Modified Early Warning Score-Sepsis Recognition Score to predict sepsis, morbidity, and mortality in neurocritically ill patients.

DESIGN: Retrospective cohort study.

SETTING: Single tertiary-care academic medical center.

PATIENTS: Consecutive adult patients admitted to the neuro-ICU from January 2013 to December 2016.

INTERVENTIONS: Observational study.

MEASUREMENTS AND MAIN RESULTS: Baseline and clinical characteristics, infections/sepsis, neurologic worsening, and mortality were abstracted. Primary outcomes included new infection/sepsis, escalation of care, and mortality. Patients with Modified Early Warning Score-Sepsis Recognition Score/Modified Early Warning Score greater than or equal to 5 were compared with those with scores less than 5. Of 7,286 patients, 1,120 had Modified Early Warning Score-Sepsis Recognition Score greater than or equal to 5. Of those, mean age was 58.9 years; 50.2% were male. In-hospital mortality was 22.1% for patients (248/1,120) with Modified Early Warning Score-Sepsis Recognition Score greater than or equal to 5, compared with 6.1% (379/6,166) with Modified Early Warning Score-Sepsis Recognition Score less than 5. Sepsis was present in 5.6% (345/6,166) when Modified Early Warning Score-Sepsis Recognition Score less than 5 versus 14.3% (160/1,120) when greater than or equal to 5, and Modified Early Warning Score elevation led to a new sepsis diagnosis in 5.5% (62/1,120). Three-hundred forty-three patients (30.6%) had neurologic worsening at the time of Modified Early Warning Score-Sepsis Recognition Score elevation. Utilizing the original Modified Early Warning Score, results were similar, with less score thresholds met (836/7,286) and slightly weaker associations.

CONCLUSIONS: In neurocritical ill patients, Modified Early Warning Score-Sepsis Recognition Score and Modified Early Warning Score are associated with higher in-hospital mortality and are preferentially triggered in setting of neurologic worsening. They are less reliable in identifying new infection or sepsis in this patient population. Population-specific adjustment of early warning scores may be necessary for the neurocritically ill patient population.

KEY WORDS: early warning scores; neurocritical care; neurologic deterioration; outcome prediction; rapid response scores; sepsis; severity scores

Jeannette Hester, MSN, RN, CCRN¹

Teddy S. Youn, MD²

Erin Trifilio, PhD³

Christopher P. Robinson, DO, MS^{4,5}

Marc-Alain Babi, MD^{4,5}

Pouya Ameli, MD^{4,5}

William Roth, MD^{4,5}

Sebastian Gatica, MD^{5,6}

Michael A. Pizzi, DO, PhD^{4,5}

Aimee Gennaro, PharmD⁷

Charles Crescioni, RN⁸

Carolina B. Maciel, MD, MSCR^{4,5}

Katharina M. Busl, MD, MS^{4,5}

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Early warning scores and systems are used in clinical practice by hospital rapid response programs as standardized means for early identification of patients at high risk of deterioration (1). Different aggregate weighted Early Warning Scores (EWSs) were developed to facilitate identification of at-risk patients in various clinical settings—most based on simple physiologic measurements and clinical observations, typically including heart rate (HR), respiratory rate (RR), blood pressure, level of consciousness, and other metrics depending on selected modification tool (2). They have shown to be more accurate than previous generations of prognostic criteria where a single variable set of any, equally weighted abnormal physiologic thresholds would trigger the risk alarm system and lead to rapid response team activation (3). The Modified Early Warning Score (MEWS) is one such scoring system, validated in adult medical-surgical patients, to identify risk of clinical deterioration and mortality when the MEWS is greater than or equal to 5 (4). It comprises five physiologic variables: systolic blood pressure (SBP), HR, RR, temperature, and mental status. Additional modifications of the MEWS with focus on Sepsis Recognition Score (MEWS-SRS) and addition of WBC count (**Fig. 1**) were found 96.5% sensitive and 96.7% specific in medical-surgical ICUs as a method for early identification and treatment initiation in the setting of infection or sepsis, and reduction of sepsis-related mortality (5, 6).

Hospital-wide initiatives are often applied to all wards or ICUs to minimize variability and standardize bundle-care approaches (7). However, there are no specific data on the effectiveness of the MEWS, MEWS-SRS, or any other EWS, for the neurocritically ill population. We sought to determine the prognostic ability of the MEWS-SRS and MEWS to identify clinical deterioration, occurrence of infection or sepsis, and mortality in critically ill neurologic patients. Our hypothesis was that neurologic worsening is a contributive factor to trigger the warning score threshold, and our objective was to characterize performance of MEWS and MEWS-SRS in the neurocritically ill patient population.

METHODS

Setting

We retrospectively reviewed prospectively collected data from a single, tertiary-care, academic center

in North Central United States of consecutive adult patients admitted to the neuro-ICU or neurologic intermediate care unit (NIMC) from January 2013 to December 2016. The MEWS-SRS scoring system is used throughout our institution as standard EWS and recorded by the bedside nurse upon admission and every 4 hours, with closer interval follow-up when elevated greater than or equal to 5 ($\text{MEWS} \geq 5$ as the defined trigger threshold). This is accomplished by the primary bedside nurse who will evaluate the clinical variables for timing and accuracy. The primary nurse scores the patient into several categories within the MEWS-SRS/MEWS tool and each category is assigned weighted scores from zero to three points (best to worst compared with normal findings). Key variables include most recent WBC count, specific vital signs of temperature, HR, RR, SBP, and mental status. Mental status measures include unresponsive coma (3 points), stupor, responds to noxious stimuli (2 points), lethargic, responds to voice or tap (1 point), alert calm, cooperative (0 points), mildly agitated, confused, anxious (1 point), very agitated, requires restraints (2 points), and extremely agitated and danger to self or others (3 points). The scoring takes into account the baseline neurologic assessment. The combined categories are tallied and validated by the primary nurse in the electronic medical record (EMR). For MEWS-SRS scores greater than or equal to 5, the nurse will initiate a call to initiate the critical care team to evaluate the patient immediately due to the elevated MEWS-SRS. The critical care time will then respond within 3 minutes and evaluate the patient and intervene clinically as indicated, including notifying the primary provider (e.g., the admitting neurosurgeon) of the clinical condition. Nursing may notify the critical care team if the patient's clinical condition declines but does not reach a MEWS score greater than or equal to 5. The study was approved by the University of Florida Institutional Review Board (201700862) including a waiver of consent.

Clinical Variables

Baseline characteristics, MEWS-SRS scores, rates of sepsis, in-hospital mortality, and discharge destination were abstracted for all patients. For patients with MEWS-SRS and MEWS scores less than 5, diagnosis of sepsis was retrieved from *International Classification of Diseases* (ICD), 9th Revision/10th Revision-based coding. For patients with MEWS-SRS score(s) greater than

Score	3	2	1	0	1	2	3
Temp	< 32	< 35	< 36	36 - 38.4	38.5 - 38.9	39 - 40.9	≥ 41
HR	< 40	40 - 44	45 - 50	51 - 100	101 - 110	111 - 129	≥ 130
RR	≤ 7	8	9	10 - 14	15 - 20	21 - 29	≥ 30
SBP	≤ 70	71 - 80	81 - 100	101 - 160	161 - 180	181 - 199	≥ 200
Mental Status Change**	Unresponsive, coma	Stupor, responds to noxious stimuli	Lethargic, responds to voice or tap	Alert, calm, cooperative	Mildly agitated, confused, anxious	Very agitated, requires restraints	Extremely agitated and danger to self or others
Latest WBC	< 1*	1 - 2.9*		3 - 14.9	15 - 19.9	20 - 39.9	≥ 40

Figure 1. Modified Early Warning Score-Sepsis Recognition Score. *Do NOT score latest WBC, if low WBC is due to oncology therapy (e.g., chemo, bone marrow suppression). **Do NOT score mental status if patient has neurologic injury affecting mental status (e.g., traumatic brain injury, stroke) unless change from baseline. ICU only—If patient is receiving sedatives, score level of consciousness if patient's Richmond Agitation and Sedation Scale (RASS) is less than or equal to goal RASS. HR = heart rate (beats/min), RR = respiratory rate (breaths/min), SBP = systolic blood pressure (mm Hg), Temp = temperature (degree Celsius).

or equal to 5 at admission or during their neuro-ICU/NIMC stay, diagnoses (based on ICD codes, attending physician progress notes), physiologic variables, infections (based on microbiology results of blood cultures, urinalysis/urine culture, sputum cultures, bronchoalveolar lavage cultures, and radiographic imaging such as chest radiograph or CT scan), sepsis (following the Third International Consensus Definitions for Sepsis and Septic Shock [8]), treatment with antibiotics, and neurologic worsening were additionally abstracted manually from the EMR. Main scoring contributor was defined as the physiologic category that contributed most points to the MEWS-SRS score (for the individual elements of MEWS-SRS; Fig. 1). In cases of ties, the main scoring physiologic variable was defined as the variable that had the most extreme difference from prior value or was explicitly stated to be of concern in the note. Altered mentation included agitation, anxiety, and altered consciousness. Medical instability was defined as new/worsened cardiac arrhythmia, hemodynamic instability (requiring vasopressor support), or respiratory instability, requiring increasing respiratory care. Neurologic complications and worsening (“neuro-worsening”) were also abstracted and

included cerebral edema, midline shift, hydrocephalus, intracranial pressure (ICP) elevation (ICP > 22 mm Hg for ≥ 5 min), intracranial hemorrhage (including hemorrhagic transformation), vasospasm or delayed ischemic neurologic deficit, or seizure/status epilepticus (nonconvulsive or convulsive). Subtypes of both neuro-worsening and medical instability were abstracted from EMR description at the time when the MEWS-SRS was greater than or equal to 5. A flow sheet for data collection is described in **Figure 2**. The original MEWS score (as described by Subbe et al [4]) was calculated from collected data with application of the above-listed data for MEWS original).

Outcomes

Primary outcomes included discovery of a new infection, sepsis, or escalation of level of care (ELOC) for NIMC patients, and neuro-worsening.

Data Analysis

Descriptive statistics and parametric statistical comparisons, including *t* test mean comparisons and chi-square with post hoc tests, were performed with the

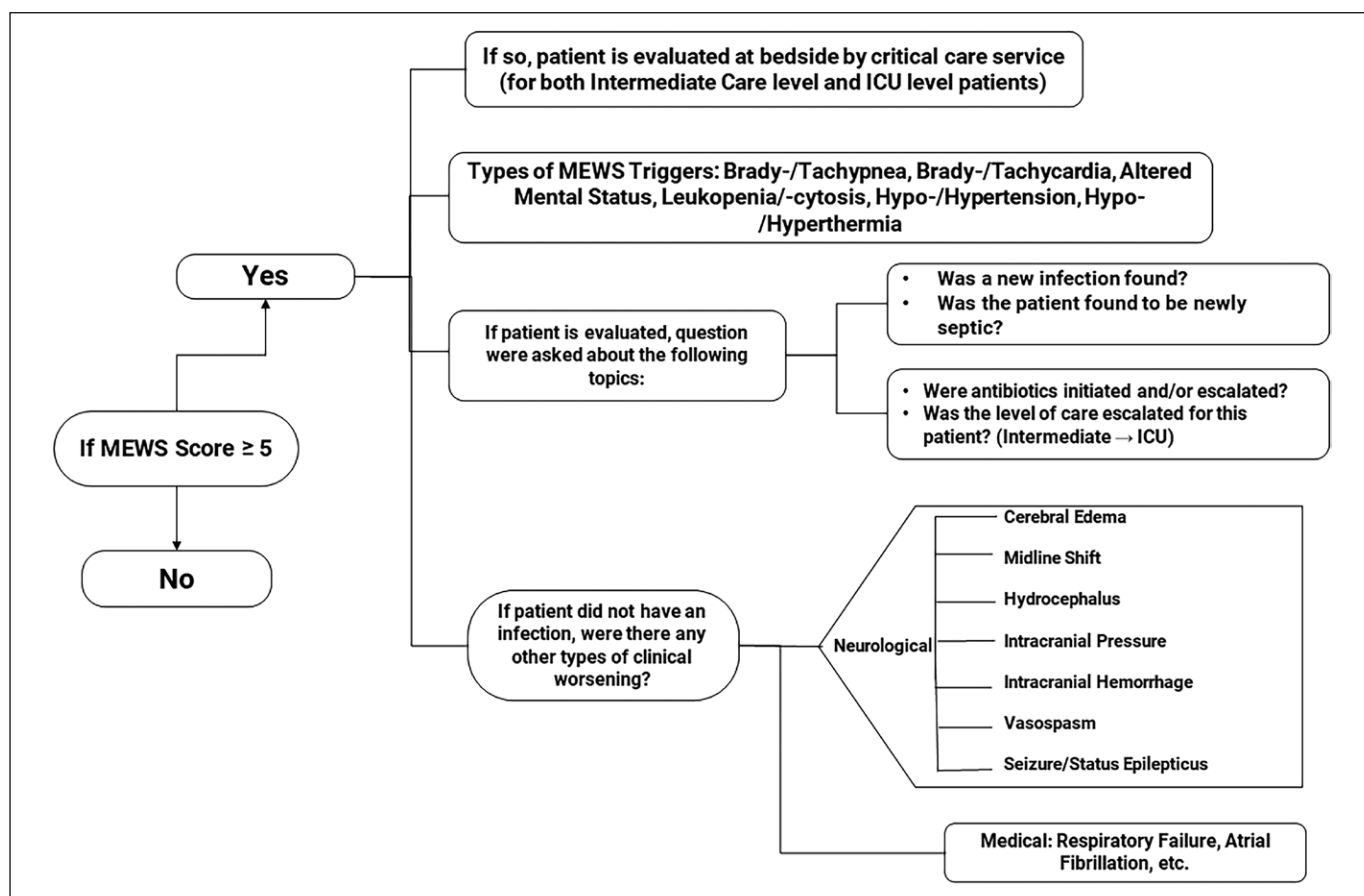


Figure 2. Clinical algorithm and data acquisition for Modified Early Warning Score (MEWS)-Sepsis Recognition Score greater than or equal to 5 triggers.

R statistical package 3.5.3 and SPSS Version 25 (IBM SPSS Software). Each admission was treated as an independent case for analyses.

RESULTS

Cohort Characteristics

Of a total of 7,303 admissions, MEWS-SRS (and MEWS) data were available for 7,286 patients, and these were included in the analysis. Forty-three patients were admitted to the neuro-ICU/NIMC more than once during the study period. Data for MEWS-SRS are presented here; data for MEWS (original) are presented as **Supplementary Material** (<http://links.lww.com/CCX/A572>).

Demographics and discharge disposition are displayed in **Table 1**. Of the 7,286 patients, 1,120 (15.5%) had a MEWS-SRS score(s) greater than or equal to 5. Those in the MEWS-SRS greater than or equal to 5 group were significantly younger. There was no association between sex and MEWS-SRS/MEWS score greater than or equal to 5 ($p = 0.303$). There was a significant association between minority status (i.e., non-Caucasian)

and MEWS-SRS score ($p < 0.001$). Elevated MEWS-SRS was significantly associated with discharge disposition ($p < 0.001$). Patients with a MEWS-SRS less than 5 were more frequently discharged home. Those in the MEWS-SRS greater than or equal to 5 group had longer hospital and ICU LOS and were more likely to be discharged to hospice ($p < 0.001$). Inhospital mortality of the MEWS-SRS greater than or equal to 5 group was 22% (247/1,120), compared with 6% (379/6,166) for patients with MEWS-SRS less than 5 at all times, and 9% (630/7,286) in the cohort as a whole ($\chi^2 = 305.377$; $p < 0.001$). When applying the original MEWS score criteria, 836 (11.5%) would have met the threshold of 5 at some point during admission, with similar associations of elevated score for length of stay (LOS), mortality, medical history, and discharge disposition, while age was not significantly associated. The odds ratio for mortality if MEWS-SRS greater than or equal to 5 was 1.453 (95% CI, 1.346–1.530). Of patients with MEWS-SRS greater than or equal to 5, 14.3% (160) were diagnosed with sepsis, while 345 (5.6%) of the 6,166 patients who did not reach the threshold MEWS-SRS score of 5 during their

TABLE 1.
Demographics, Characteristics, and Outcomes for Neuro-ICU Patients ($n = 7,286$)

Early Warning Score	MEWS-SRS < 5, $n = 6,166$ (85%)	MEWS-SRS ≥ 5 , $n = 1,120$ (15%)	p
Race/ethnicity ^{a,b} , n (%)			
White	4,831 (78)	800 (72)	< 0.001
Black or African American	926 (15)	212 (19)	
Other	409 (7)	108 (9)	
Sex, n (%)			
Male	3,197 (52)	562 (50.2)	
Female	2,968 (48)	558 (49.8)	
Age (yr) ^c , mean (SD)	60.2 (16.9)	58.9 (17.6)	< 0.05
ICU LOS (d) ^a , mean (SD)	3.7 (5.3)	12.9 (12.1)	< 0.001
Hospital LOS (d) ^a , mean (SD)	6.4 (15.1)	16.3 (15.5)	< 0.001
Inhospital mortality ^a , mean (SD)	379 (6.1)	248 (22.1)	< 0.001
Medical history, n (%)			
Hypertension	3,820 (62.0)	705 (62.9)	
Diabetes	1,467 (23.8)	260 (23.2)	
Coronary artery disease	175 (2.8)	33 (2.9)	
Chronic obstructive pulmonary disease	716 (11.6)	144 (12.9)	
Cancer ^a	1,638 (26.6)	211 (18.8)	< 0.001
Liver disease	143 (2.3)	27 (2.4)	
Sepsis ^a	345 (5.6)	160 (14.3)	< 0.001
Discharge disposition ^a , n (%)			< 0.001
Home/home care/rehabilitation ^a	4,591 (74)	422 (38)	
Hospice ^a	186 (4)	85 (8)	
Nursing home/long-term acute care hospital/other ^a	1,012 (16)	365 (32)	

LOS = length of stay, MEWS-SRS = Modified Early Warning Score-Sepsis Recognition Score.

^aStatistical significance at $p < 0.001$ level.

^bOf note: the p for race is reflecting a dichotomized evaluation (nonminority vs minority).

^cStatistical significance at $p < 0.05$ level.

Descriptive statistics with χ^2 and t tests by MEWS-SRS trigger (MEWS-SRS ≥ 5 vs MEWS-SRS < 5).

hospitalization were diagnosed with sepsis. The positive predictive value of the MEWS-SRS greater than or equal to 5 for sepsis was 6.0% and sensitivity was 16.5%. See **Supplementary Table 1** (<http://links.lww.com/CCX/A573>) for results utilizing the original MEWS score.

MEWS-SRS Greater Than or Equal to 5 Cohort

Admission neurologic diagnoses of the MEWS-SRS greater than or equal to 5 group ($n = 1,120$), clinical condition and clinical change surrounding the elevation of the

MEWS score are shown in **Table 2** (see Supplementary Table 2, <http://links.lww.com/CCX/A573>, for results utilizing the original MEWS score). Main neurologic admission diagnoses included cerebral infarction, subarachnoid hemorrhage, and intracerebral hemorrhage. At the time of MEWS-SRS greater than or equal to 5, 64.5% (722) were mechanically ventilated and 39.4% (444) were treated with one or several antimicrobials.

Infectious Complications and Clinical Condition Leading to MEWS-SRS Elevation

A new infection was discovered in 14.0% (157), and a new diagnosis of sepsis was made in 5.5% (62). Pneumonia (96; 39.5%) and urinary tract infection (69; 28.4%) were diagnosed most commonly with a majority of antibiotics being initiated for those two diagnoses.

The main contributors for the MEWS to elevate greater than or equal to 5 were altered mentation, tachypnea, and tachycardia (**Table 3**; and **Supplementary Table 3**, <http://links.lww.com/CCX/A573>). Tachypnea or tachycardia predominated as the main physiologic variables leading to either initiation or escalation of antibiotics or an escalation in the level of care.

Neurologic Worsening

The most common clinical change leading up to a MEWS-SRS score greater than or equal to 5 was neuro-worsening (343, 30.6%), while medical worsening was documented in 29.6% (331). Among patients with worsening neurologic status, two or more neurologic changes were present in 92 patients (27%) at the time of their MEWS-SRS elevation. Medical instability was present in 136 patients (39.6%) with neuro-worsening.

Resource Utilization and Mortality

Table 4 presents the resources that were used following a MEWS-SRS alert: initiation or escalation of antibiotics and ELOC. Antibiotics were initiated or escalated in 243 patients (21.6%) following a MEWS-SRS activation. Of those who had antibiotics added and did not have a new infection or new sepsis post-MEWS-SRS greater than or equal to 5 ($n = 124$), 21 died in the hospital (16.9%). Mortality of patients with sepsis at any time (prior or at MEWS-SRS ≥ 5 time) was similar, 24% (39/160), compared with 22% (209/960) for patients who never had sepsis ($\chi^2 = 0.539$;

$p = 0.436$). Among those in the MEWS-SRS greater than or equal to 5 group who were newly diagnosed with sepsis ($n = 62$), 11 (18%) died. This compares to a 31% mortality rate (37/119) in those without sepsis diagnosis ($\chi^2 = 3.728$; $p = 0.053$). Similarly, those diagnosed with infection following MEWS-SRS greater than or equal to 5 ($n = 157$) had a lower mortality rate than those without diagnosed infection (13% vs 19%; $\chi^2 = 2.819$; $p = 0.093$). In cases of antibiotic initiation or antibiotic escalation, 23.4% did not have an infection or sepsis and rather had neurologic deterioration as main etiology for MEWS-SRS elevation. This was also seen for ELOC, with one out of five (20.7%, 58) having neurologic deterioration without a new diagnosis of infection/sepsis. Data on assumed resource utilization (antibiotic initiation/escalation and escalation of care) in patients with and without neuro-worsening were calculated for the original MEWS score greater than or equal to 5 and are similar (**Supplementary Table 4**, <http://links.lww.com/CCX/A573>).

DISCUSSION

In this study, we investigated the application of the MEWS-SRS in the neurocritically ill patient population and found that MEWS-SRS is associated with higher inhospital mortality, while not a reliable tool to indicate new infection or sepsis for this population, with a positive predictive value of only 6%. Instead, the MEWS-SRS is triggered evaluation preferentially in patients with neurologic deterioration. When considering the utilization of resources, antibiotics were initiated or escalated in one of five patients with MEWS-SRS greater than or equal to 5, but nearly half of them did not have any infection or sepsis. Further, the higher mortality in patients with MEWS greater than or equal to 5 was not driven by sepsis or infection. These main findings were concurrent when using the original MEWS score, which does not include WBC count as a physiologic variable; although, as expected, less patients reached the threshold, and associations were slightly weaker overall.

Our findings are aligned with prior data indicating higher risk for inhospital mortality by EWSs. A study of critically ill patients showed prognostic value of the MEWS in predicting mortality (9). A smaller, homogeneous cohort of 274 stroke patients utilizing a slightly different version of an EWS also found that the score predictive of mortality (10). Our data expand the applicability of the association of the MEWS-SRS and

TABLE 2.

Neurologic Diagnoses, Clinical Condition, and Change Surrounding Modified Early Warning Score-Sepsis Recognition Score Greater Than or Equal to 5 Trigger in Patients With Modified Early Warning Score-Sepsis Recognition Score Greater Than or Equal to 5 ($n=1,120$)

Primary Diagnosis	<i>n</i> (%)
Cerebral infarction	270 (24.1)
Subarachnoid hemorrhage	206 (18.4)
Intracerebral hemorrhage	128 (11.4)
Neoplasm	94 (8.4)
Subdural hematoma	68 (6.1)
CNS infections	66 (5.9)
Spine	66 (5.9)
Encephalopathy	60 (5.4)
Seizures/status epilepticus	59 (5.3)
Traumatic brain injury	49 (4.4)
Aneurysm/arteriovenous malformation (unruptured)	19 (1.7)
Other	34 (3.0)
Intubated	722 (64.5)
Treated with antibiotics	444 (39.6)
Presence of infection or sepsis	
Infection (total)	479 (42.8)
New infection discovered	157 (14.0)
Sepsis (total)	160 (14.3)
New sepsis discovered	62 (5.5)
New sepsis or infection	164 (14.6)
Underlying process/trigger	
Medical worsening	331 (29.6)
Respiratory rate	281 (25.1)
Blood pressure	157 (14.0)
Heart rate	249 (22.2)
Mental status	299 (26.7)
Temperature	31 (2.8)
WBC count	103 (9.2)
Neuro-worsening	343 (30.6)
Intracerebral hemorrhage	108 (9.6)
Cerebral edema	88 (7.9)
Seizures/status epilepticus	71 (6.3)
Intracranial pressure elevation	47 (4.2)
Hydrocephalus	45 (4.0)
Vasospasm/delayed ischemic neurological deficit	43 (3.8)
Midline shift	42 (3.8)

TABLE 3.

Main Scoring Trigger in Patients With Modified Early Warning Score-Sepsis Recognition Score Greater Than or Equal to 5 ($n = 1,120$) and Relationship to Escalation in Antibiotic Treatment or Level of Care

Modified Early Warning Score Trigger	Altered Mentation Including Agitation and Pain	↑↓Blood Pressure	↑↓Heart Rate	↑↓Respiratory Rate	Temperature	↑↓WBC	<i>n</i>
Total, <i>n</i> (%)	299 (27)	157 (14)	249 (22)	281 (25)	31 (3)	103 (9)	1,120
Antibiotics	50	34	55	61	9	34	243 (22)
ELOC	8	8	22	11	3	6	58 (5)
Both antibiotics + ELOC	2	2	11	3	2	5	25 (2)

ELOC = escalation in level of care.

In parentheses: % relative to total cohort of $n = 1,120$.

TABLE 4.

Resource Utilization After Modified Early Warning Score-Sepsis Recognition Score Trigger in Relation to Neuro-Worsening

	Antibiotics Initiated/ Escalated, <i>n</i> = 243		ELOC, <i>n</i> = 58		Both Antibiotics and ELOC, <i>n</i> = 25	
	S/I	No S/I	S/I	No S/I	S/I	No S/I
Neuro-worsening	27	29	4	12	3	2
No neuro-worsening	92	95	17	25	13	7

ELOC = escalation in level of care, S/I = sepsis/infection.

Newly diagnosed (NEW) sepsis or NEW infection post-Modified Early Warning Score.

MEWS EWSs with in-hospital mortality in the neuro-ICU population.

We discovered that using MEWS-SRS score in the neuro-ICU population had poor sensitivity for a screening test (as discussed in [11]) detecting infections and sepsis, which may lead to improper resource allocation with initiation or escalation of antibiotics. This illustrates that a warning score developed for one patient population is not generalizable for a different patient population. Furthermore, while shown beneficial in certain settings, the overall value of early warning systems is questionable. A Cochrane review of automated monitoring systems compared with standard care for the early detection in critical ill patients (12) reviewed three studies with 680, 442, and 77 participants. In the largest study, the median time to initiation of antimicrobial therapy had a difference of 2.2 hours (5.6 hr in the intervention group vs 7.8 hr in the control group [12]). The other two studies,

however, showed no improvement in mortality rate and in one even a worsening of mortality in the intervention group. Hence, the effect from automated systems for monitoring sepsis remains unclear, with only low-quality evidence available and continued need for individual review of the patient's condition by experienced healthcare staff (12).

Other factors to consider include the application of warning scores and impact on healthcare teams. Increased numbers of positive triggers often produce additional work for the primary nurse, rapid response team, and responding physician (13)—an effort that must be weighed against the benefit in increased detection of adverse outcomes. The balancing act of clinical trigger surveillance and personnel response can have positive and negative implications. “Alarm-fatigue” with failure to respond to alerts quickly is a well-documented risk in critical care, especially if the false positive rate is high (14–17). This principle also

applies to the use of aggregate EWSs like the MEWS-SRS, where “risk alarm fatigue” can equally affect staff resource allocation, distort patient safety focus, and lead to delays in clinical response (13). Additionally, while our study focused primarily on patients in the neuro-ICU/NIMC and not those in the general neurologic floor setting, it is important to consider the potential impact EWS activation might have on the demand for neurologic ICU/IMC bed availability—recent evidence supports significant increases in the number of ICU admissions as a result of implementing EWS systems in acute care hospital setting (18). In our data from the neuro-ICU population, the mortality of patients identified with acute sepsis at the time of the MEWS-SRS elevation was slightly lower than the mortality rate in the overall MEWS-SRS greater than or equal to 5 cohort. The underlying trigger for MEWS-SRS (and MEWS) greater than or equal to 5 score elevation in one of three patients was neurologic worsening in patients where neurologic worsening that had been already recognized at the time of the score reaching the trigger-to-evaluate threshold. As our data show, altered mentation deviating from the base disturbance in the setting of neurocritical disease was the major physiologic variable, but derangement of vital sign functions also play an important role as neurologic deterioration may lead to CNS-induced changes of vital signs (19), directly affecting the MEWS-SRS/MEWS calculation. Mortality in the setting of neurologic worsening is often driven by adjustment of goals of care, a factor that we did not examine in this study; however, we postulate that this might be the reason why mortality in the overall MEWS-SRS greater than or equal to 5 group was higher than in the subset that eventually was diagnosed with sepsis. Our findings further pose the question whether a score such as MEWS-SRS/MEWS might be, possibly with additional modifications, able to more precisely and earlier predict neurologic worsening in the neuro-ICU population. Current developments in neuro-ICU bioinformatics with prediction analysis of vital signs would support this conceptual framework (20) but are often based on waveform analysis, limiting availability, and practicality. Our results demonstrated neurologic worsening as the most common clinical change associated with a MEWS-SRS score greater than or equal to 5. Given this finding, a future revised and targeted EWS

could potentially improve patient outcomes not only in neurocritical care patients with primary or secondary neurologic injury. A next step toward evaluating the potential utility of the MEWS-SRS or MEWS warning scores to identify early neurologic changes and the related triggering of interventions is prospective evaluation of this score in the neurocritical ill setting with specific attention to neurologic deterioration and related work-up and management.

Strengths of our study include the evaluation of the MEWS-SRS in a large cohort of a defined subspecialty population of neurocritically ill, detailed and reliable charting of EWS, and granular analysis of clinical circumstances at the time of the EWS elevation. Limitations include the retrospective design and confinement to a single center. While we observed disproportionately more MEWS greater than or equal to 5 in the Black/African American patient group, this finding likely is routed in cohort imbalance but will necessitate further details in data analysis to evaluate whether this may be due to worse manifestation of neurologic disease and existing racial disparities (21). Another limitation of our study specifically when considering potential to generalize our findings includes the interdependence between EWS and EMR systems to yield study results. If healthcare institutions are lacking EMR systems or have vastly different methods of documentation, our findings may not be as generalizable in non-EMR settings. In addition, we were not able to obtain detailed neurologic data for the entire admission population including patients with MEWS-SRS/MEWS score less than 5. Furthermore, MEWS-SRS scoring lack the ability to detect subtle changes in the neurologic status. Adding more granular detail to subsequent early warning scoring systems may contribute to allow potential use of the score for detection of neurologic changes. Last, for our comparison group with MEWS-SRS/MEWS less than 5, we relied on coding-based sepsis diagnosis, and it is well described that automated coding may overestimate or underestimate the number of sepsis cases (22). Wide variation in validity of recording sepsis data was demonstrated in a review showing sensitivity ranging from 5.9% to 82.3%, with specificity 78.3% to 100%, and negative predictive values of 62.1% to 99.7% (23). Nonetheless, it is likely that a subset of neurocritically ill with sepsis was not captured by MEWS-SRS.

CONCLUSIONS AND IMPLICATIONS

The MEWS and MEWS-SRS scores are associated with higher mortality in the neuro-ICU population but are not reliable indicators for new infection or sepsis. They preferentially triggered critical care team notification and evaluation in known high acuity patients with neurologic worsening. Refined screening tools may be an avenue for earlier identification of neurologic worsening, and different strategies are needed for early warning of infection-related clinical deterioration specific to the neuro-ICU population.

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- 1 Department of Nursing and Patient Services, Neurointensive Care Unit, UF Health Shands Hospital, Gainesville, FL.
- 2 Barrow Neurological Institute, Phoenix, AZ.
- 3 Department of Clinical and Health Psychology, University of Florida College of Medicine, Gainesville, FL.
- 4 Department of Neurology, University of Florida College of Medicine, Gainesville, FL.
- 5 Department of Neurosurgery, University of Florida College of Medicine, Gainesville, FL.
- 6 Department of Anesthesiology, University of Florida College of Medicine, Gainesville, FL.
- 7 Department of Pharmacy Services, UF Health Shands Hospital, Gainesville, FL.
- 8 Quality and Patient Safety, UF Health Shands Hospital, Gainesville, FL.

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For information regarding this article, E-mail: Katharina.Busl@neurology.ufl.edu

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