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# Physiologic monitor alarm burden and nurses' subjective workload in a children's hospital

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# Abstract

**Background:** Physiologic monitor alarms occur at high rates in children's hospitals; 1% are actionable. The burden of alarms has implications for patient safety and is challenging to measure directly. Nurse workload, measured using a version of the National Aeronautics and Space Administration Task Load Index (NASA-TLX) validated among nurses, is a useful indicator of work burden which has been associated with patient outcomes. A recent study demonstrated

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Contributor Statements:

Dr Rasooly carried out the analyses, drafted the initial manuscript, and approved the final manuscript as submitted. Dr Kern-Goldberger participated in the analyses, reviewed and revised the manuscript, and approved the final manuscript as submitted. Drs. Xiao and Bonafide conceptualized and designed the study, participated in the analysis, reviewed and revised the manuscript, and approved the final manuscript as submitted.

Drs. Ponnala and Ruppel critically reviewed and revised the manuscript, and approved the final manuscript as submitted. Drs. Luo, Dr. Craig and Ms. McLoone coordinated NASA-TLX data collection, critically reviewed the manuscript, and approved the final manuscript as submitted.

Ms. Khan collected alarm data, critically reviewed the manuscript, and approved the final manuscript as submitted.

Drs. Ferro, Muthu, and Won conceptualized and designed the study, critically reviewed the manuscript, and approved the final manuscript as submitted.

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that 5-point increases in NASA-TLX were associated with a 22% increased risk in missed nursing care.

**Objective:** To measure the relationship between alarm count and nurse workload using the NASA-TLX.

**Methods:** We conducted a repeated cross-sectional study of pediatric nurses in a tertiary care children's hospital to measure the association between NASA-TLX workload evaluations (using the nurse-validated scale) and alarm count in the 2 hours preceding NASA-TLX administration. Using a multivariable mixed effects regression accounting for nurse-level clustering, we modeled the adjusted association of alarm count on workload.

**Results:** The NASA-TLX was assessed in 26 nurses during 394 nursing shifts over a 2-month period. In adjusted regression models, experiencing >40 alarms in the preceding 2 hours was associated with a 5.5 point increase (95% CI 5.2 to 5.7, p<0.001) in subjective workload.

**Conclusion:** Alarm count in the preceding 2-hours is associated with a significant increase in subjective nurse workload that exceeds the threshold associated with increased risk of missed nursing care and potential patient harm.

#### Introduction

High nurse workload has been associated with adverse patient outcomes including increased mortality,<sup>1–3</sup> hospital acquired harm,<sup>4</sup> nurse-patient miscommunication,<sup>5</sup> and missed delivery of nursing care.<sup>6</sup> Workload is generally conceptualized as the ratio of physical and cognitive demands to an individual's available resources<sup>7,8</sup> and nursing workload has been understood as the "performance required to carry out nursing activities."<sup>9,10</sup> Originally developed for the aerospace industry, the National Aeronautics and Space Administration Task Load Index (NASA-TLX) is a validated measure of subjective workload that is sensitive to individual differences used to assess work demands.<sup>11,12</sup> The NASA-TLX has been applied to nursing<sup>6,7,10,13</sup> and a shortened 4-dimension scale comprised of mental demand, physical demand, temporal demand, and effort has been validated to specifically measure nurse-specific workload.<sup>12</sup> Recent work demonstrated that each 5 point increase in nurse workload on the nurse-specific, 4-dimension NASA-TLX was associated with a 22% increase in the likelihood of self-reported omission of patient care tasks such as double-checking high-risk medications and adhering to infection prevention bundles during the same shift.<sup>6</sup>

Physiologic monitor alarms may contribute to nurse subjective workload. Physiologic monitoring of vital sign parameters (including heart rate, respiratory rate, and oxygen saturation) is commonplace on pediatric units, with estimates of up to 48% of non-intensive care unit pediatric patients receiving continuous monitoring of vital signs.<sup>14</sup> Abnormal vital signs trigger an alarm in the patient room and, in many institutions, relay a message to the bedside nurse's institutional mobile telephone. Pediatric nurses are responsible for responding to up to 155 alarms per monitored patient per day.<sup>14,15</sup> Analysis of alarms indicates that only approximately 0.5% - 1% of alarms are considered actionable or informative on pediatric wards.<sup>16,17</sup> High alarm count is associated with slower nurse response time to alarms,<sup>16</sup> but the broader association between alarms and nurse workload

has not been characterized in clinical practice. The objective of this project was to directly measure the relationship between alarm count and subjective nurse workload using the NASA-TLX.

### Methods

#### Patient Safety Learning Lab

This work was undertaken by the Agency for Healthcare Research and Quality (AHRQ) funded Patient Safety Learning Laboratory (PSLL) at a tertiary children's hospital. A primary aim of the PSLL is to re-engineer the system of monitoring hospitalized children within our hospital, aiming to reduce non-informative alarms and accelerate nurse response to critical events. Two general (non-intensive care) pediatric inpatient units participating in the PSLL's longitudinal quality improvement work. Evaluation of the relationship between alarm count and nurse workload was part of the initial problem analysis phase of this improvement initiative.

The hospital Committees for the Protection of Human Subjects (the IRB) determined that the PSLL's problem analysis portfolio (which included this project) was consistent with quality improvement activity and did not meet criteria for human subjects' research.

#### **Participants and Setting**

Nurses on the two participating general pediatric inpatient units participated. All patient rooms include General Electric Dash monitors for physiologic monitoring. Default alarm thresholds for physiologic parameters are defined by age, however can be adjusted by nurses to account for patient physiology. Monitor alarms are relayed to bedside nurses' institutional mobile telephones (Ascom d62; AscomHolding AG). On the units we studied, approximately 40% of patients are continuously monitored.

**Measuring nurses' workload**—We prospectively measured nurse subjective workload using the NASA-TLX (Figure 1) in a cohort of nurses whose workload we could assess repeatedly across a wide range of alarm exposure rates. This allowed us to use analytic methods designed to assess both within-nurse and between-nurse differences in workload at different alarm count exposure rates.<sup>11</sup> The NASA-TLX provides a scale to quantifying workload at the task or job level, while accounting for individual differences.<sup>11</sup>

We approached nurses from the 2 general pediatric units partnering with the PSLL for participation in workload evaluations. An in-person data collector obtained participating nurses' demographic information and guided them through completing their first NASA-TLX assessments. Subsequently, nurses were asked to complete the NASA-TLX at least once per shift between July 8, 2019 and August 31, 2019, using personalized paper forms available in envelopes with their names on them in a bin on their unit. In order to measure workload at all hours and days of the week, we reviewed nursing assignments approximately one week in advance and, based on these advanced assignments, programmed a system to automatically deliver personalized text messages to each assigned nurse during their shifts. The personalized text messages requested that nurses complete a workload evaluation,

reflecting on the past two-hours of the shift. We aimed to obtain at least 10 evaluations per nurse to allow for adjustment based on within-in nurse differences.

We collected data on all 6 dimensions of workload that comprise the original NASA-TLX designed for the aerospace industry. However, in pediatric hospital settings like ours, the 4-dimension version of the NASA-TLX validated in pediatric nurses is more appropriate than the original version.<sup>10</sup> This modified version of the NASA-TLX evaluates the following dimensions: mental demand, physical demand, temporal demand (i.e. time pressure), and effort required in the preceding 2 hours.<sup>6,10</sup> In our analysis we utilized the 4-dimension instrument; we calculated the sum of scores in these 4 dimensions and scaled to 100 to facilitate interpretation of the results and to inform subsequent analyses.<sup>6</sup> We performed sensitivity analysis using the original 6-dimension scale (scaled to 100).

In addition to nurse demographics, we collected information about the work environment and patient factors that potentially contribute to subjective workload, including unit, time of shift (day vs. night), time within a shift the NASA-TLX was completed, nurse to patient ratio, patient acuity, the number of assigned patients receiving physiologic monitoring, and alarm exposure in the preceding 2 hours. Nurses recorded the time of NASA-TLX completion and listed the medical record numbers of all patients they were caring for at the time of NASA-TLX completion. Patient acuity was evaluated using the Pediatric Rothman Index (PRI) score,<sup>18</sup> a measure of projected probability of clinical deterioration computed based on vital signs, lab results, and nursing assessments for each patient. At the time of data collection, PRI scores were embedded into the EHR. PRI scores <65 denoted patients at risk for clinical deterioration or transfer to intensive-care unit;<sup>19</sup> scores were dichotomized such that patients with PRI scores <65 were categorized as having "high acuity" and patients with PRI scores 65 were categorized as "normal or lower acuity."

**Alarm count**—We extracted monitor alarm counts (the absolute number of abnormal vital signs that triggered a monitor to alarm) from the hospital's clinical data warehouse. We paired NASA-TLX assessments with the total count of alarms for the nurse's assigned patients during the preceding 2 hours (the period evaluated in the NASA-TLX). We also included alarms from patients whom nurses were only covering for part of the 2 hour window (e.g. when covering another nurse's patients because the other nurse is on a break).

Employing an approach utilized in our prior work evaluating alarm-count and response time, we evaluated alarm counts categorically because we did not anticipate a linear relationship between alarms and workload.<sup>16</sup> When infrequent, nurses are likely able to respond to alarms, whereas at high levels we hypothesized they would be impose additional workload burden. We visually examined a locally weighted scatterplot smoother (LOWESS) to inform alarm count categorization. We divided alarm counts over the preceding 2 hours into 3 categories: 0 to 5 alarms to represent a low/typical alarm rate (50% of time periods), 6 to 39 alarms to represent an elevated alarm rate (50 to 90%), and 40 alarms to represent a very high alarm rate (the top 10% in terms of alarm frequency).

#### **Statistical Analysis**

To model this dynamic system in which numbers of repeat observations varied for each nurse, we utilized a hierarchical linear mixed-effects regression model that accounted for clustering of observations within nurse and clustering of nurses within units by including unit- and nurse-specific random effects. To select model variables, we examined the association of NASA-TLX workload score (the primary outcome) with each of the nurse, patient, and work environment variables as fixed effects in bivariate analysis and performed a Wald test to evaluate the linear hypothesis. Variables with p 0.20 in these bivariate, unadjusted analysis were included in the subsequent multivariable model of scaled, composite workload scores. Because alarm counts and the number of monitored patients being cared for measured overlapping constructs, we included only alarm counts in our multivariable analysis. Informed by the literature and awareness of the complex relationships between staffing ratios and patient acuity from our prior work<sup>20</sup> and the work of others,<sup>6</sup> we included a 2-way interaction between patient acuity and nurse to patient ratio in our model. We reported scaled, adjusted estimates of workload using predictive margins for each alarm count category.

We used REDCap hosted by our institution for data management<sup>21,22</sup> and Stata version 16.1 (StataCorp LLC) for statistical analysis.

## **Results:**

#### Association between alarm count and nurses' workload

We measured the subjective workload of 26 nurses 394 times using the NASA-TLX. After guiding nurses through completion of initial NASA-TLX evaluations in person (n=39), we transitioned to delivering automated text messages to prompt NASA-TLX completion. We delivered 586 automated messages and subsequently collected 355 workload evaluations. Our response rate (based on responses to automated text messages) was 61%. In attempting to understand non-response, it became clear that the pre-shift assignments that we based our automated messaging strategy on were subject to change due to nurses being called off or calling out of a shift, reassignments of nurses to different units, or assignment to serve as charge nurse. Nonetheless, participating nurses completed a median of 11 NASA-TLX evaluations (IQR: 6 to 17, range: 1 to 35) during the study period. Nurses had a median 3 years of nursing experience (IQR: 2 to 5 years) and 6 nurses (23%) were in their first year of practice. Most nurses (96%) evaluated a time period in which they cared for 1 high acuity patient (as defined as having Rothman score <65).

In terms of shift characteristics (Table 1), 46% of NASA-TLX evaluations were completed during day shifts, and 54% of evaluations during night shifts. In 63% of assessed shifts nurses cared for high acuity patients. Nurses cared for a median 4 patients (IQR: 3 to 4, range 2 to 5). Nurses cared for at least one patient receiving continuous monitoring in 74% of shifts. Nurses received a median of 6 alarms (IQR: 0 to 21) in the 2 hours prior to NASA-TLX completion. The median reported NASA-TLX workload score was 68.6 (IQR: 57.3 to 79.0).

In unadjusted analyses, all variables met *a priori* criteria of p 0.2 for inclusion in the multivariable model (Table 2). In multivariable mixed effects modeling, after controlling for other contributors to workload, experiencing a very high alarm rate increased workload scores by 5.5 points (95% CI: 5.2 to 5.7). Nurses with 2–5 years' experience, mid-shift (hours 3 to 7 of a 12-hour shift), increasing from 1–3 low acuity patients to 4–5 low acuity patients, and caring for at least one patient with high acuity (among nurses caring for 1–3 patients) were associated with increased workload. In Table 3, we modeled different conditions to illustrate the effect of alarms on nurse workload using predictive margins.

Sensitivity analysis using the 6-dimension NASA-TLX demonstrated similar results. In multivariable models using the six-domain scale, high alarm count increase workload scores by 5.8 points (95% CI: 5.7 to 5.8). While the coefficient values for the other covariates changed slightly, none changed in statistical significance or direction.

# Discussion

We sought to evaluate the relationship between alarm count and subjective workload using the NASA-TLX. Accounting for other contributors to work load, high alarm count (40 alarms) was associated with a >5-point increase in subjective workload. The association between high alarm counts on workload is clinically significant; in terms of magnitude it is similar to the increase in workload experienced when caring for 4 to 5 patients (as compared with caring for 1 to 3 patients). This finding is consistent with a simulation based study, which found that reduction in alarms resulted in a 5 point decrease in NASA-TLX workload scores.<sup>23</sup>

Our findings support the negative impact of high alarm count on nurses' provision of care. In work by Tubbs-Cooley et al each 5-point increase in nurse subjective workload was associated with a 22% increased risk in self-reported missed nursing care. Both increased alarm count<sup>16</sup> and subjective workload<sup>23</sup> have been associated with slowed alarm response time. Numerous other adverse outcomes are associated with high alarm burden including poor nurse-patient communication,<sup>5</sup> missed delivery of nursing care,<sup>6</sup> hospital acquired infection,<sup>4</sup> and increased mortality.<sup>1–3</sup> More broadly, the inverse relationship between increased workload and task performance has been established in the human factors literature.<sup>24,25</sup>

Multiple factors influence workload and thus (as highlighted in Table 3) the increased burden imposed by high alarm count may have different implications in different contexts. For example, nurses with 2–5 years of experience report high levels of subjective workload at low alarm counts compared to nurses with >5 years of experience. The human factors literature suggests that professional experience may confer "attentional spare margin," such that individual with experience have additional "spare capacity" that reduces the workload associated with tasks.<sup>26</sup> Moreover "limited capacity" model posits that as individuals approach their capacity "threshold" (the point at which additional task-demands cause performance to decline), their perceived workload increases.<sup>27–30</sup> These theories suggest that for nurses without spare capacity, who are already experiencing high levels of workload, the addition of alarm-associated workload may have serious implications for patient safety.

Of note, nurses with 2–5 years of experience report higher levels of subjective workload than nurses with <2 years of experience. A variety of factors may contribute to the lower subjective workload of new nurses including reporting bias, additional supervision and support given to new nurses (generally by nurses with 2–5 years of experience), and/or reduced or lower complexity patient assignments. The impact of additional workload on nurse performance when workload is already high (i.e. the nurse with 2–5 years' experience) may differ from the performance impact of additional workload for a more experienced nurse whose baseline workload is lower. Similarly, there may be particularly vulnerable moments within a clinical shift when an interruption from an uninformative alarm is more burdensome. For instance observational work has demonstrated the association of phone interruptions with medication administration errors.<sup>20</sup> Among the multitude of complex, interacting factors that influence workload, alarm-counts are modifiable. Reducing non-actionable alarms may be one of the most modifiable, pragmatic targets for improving nurse workload.

To our knowledge this is the first study to evaluate the relationship between alarms count and subjective nursing workload in clinical practice. Our reproducible approach allows for quantitative evaluation of the consequences of alarm fatigue. As part of our broader quality improvement work, workload will serve as a proximal outcome by which to evaluate future interventions focused on improving monitoring systems.

These findings must be contextualized within the limitations of our approach. We surveyed a limited number of nurses within a single, pediatric hospital. Intuitional policies and practices may influence both the frequency and experience of alarms. We used automated text messages to request nurses complete workload evaluations. Delivery of automated text messages was scheduled based on pre-shift assignments. While this approach allowed us to evaluate workload throughout shifts, we are unable to systematically evaluate why nurses did or did not complete workload evaluations. Some non-response was due to changes in staffing. However because nurses were prompted to complete the NASA-TLX during their clinical shifts, at times shift characteristics may have influenced completion. Busier nurses may have delayed or failed to complete evaluations of workload. Alternatively, nurses may have been eager to report workload during particularly challenging times. By obtaining frequent, repeated evaluations of workload on a routine basis we aimed to overcome these sampling challenges. We adopted a human factors approach that accounted for nurse, unit, and patient level factors; however, because nurses did not cross units, there may be unit-level factors we were unable to account for in our analysis. Finally, the literature with regard to workload and expected workload of nurses is emerging. The original NASA-TLX measures 6 dimensions of workload; for both validity and interpretability within the existing nursing literature, we report scores from a 4-dimension version that has been validated among nurses. Sensitivity analysis using the 6-component NASA-TLX found similar results.

# **Conclusion:**

Increased physiologic monitor alarm exposure was associated with clinically and statistically significant increases in subjective nurse workload that may lead to missed nursing care tasks

and patient harm. Reducing non-actionable physiologic monitor alarm burden should be a high priority to improve patient safety.

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If yes: which nurse? \_\_\_\_\_\_ start time: \_\_\_\_\_ end time: \_\_\_\_\_

• Thinking about your shift up until this time, do you have any lingering tasks to do for any admissions, transfers, or discharges? Yes or No

#### Figure 1:

Copy of NASA-TLX paper survey provided to nurses

#### Table 1:

#### Shift Characteristics.

Descriptive characteristics of the shifts in which NASA-TLX (n=394) was completed to assess workload. Nurses completed up to NASA-TLX workload evaluations per shift.

	Workload Evaluations No. (%)
Total (N)	394
Years of nursing experience	
<2 years	122 (31%)
2 to 5 years	215 (55%)
>5 years	57 (15%)
Unit	
Unit 1	124 (32%)
Unit 2	270 (69%)
Shift type	
Day	180 (46%)
Night	214 (54%)
Time (within a shift) of completion	
<3 hours	130 (33%)
3 to 7 hours	105 (27%)
8 to 12 hours	159 (40%)
No. of patients cared for	
1 to 3 patients	171 (43%)
4 or 5 patients	223 (57%)
No. of monitored patients cared for	
None	103 (26%)
1 patient	116 (29%)
2 to 4 patients	175 (44%)
Caring for 1 high acuity patient	249 (63%)
NASA-TLX Workload Score	
0 to 50	73 (19%)
51 to 75	186 (47%)
75 to 100	135 (34%)
No. of Alarms in the preceding two	hours
0 to 5 alarms	195 (50%)
6 to 40 alarms	159 (40%)
>40 alarms	40 (10%)

Table 2:

Predicted change in NASA-TLX workload score (scaled to 100)

	Unadjusted			Adjusted		
		n-d	alue	predicted change	'n-d	alue
	predicted change (95% CI)	category	composite	(95% CI)	category	composite
Alarms in the preceding 2 hours			<0.001			<0.001
0 to 5 alarms	reference			reference		
6 to 39 alarms	+6.9 (3.1 to 10.7)	<0.001		+1.9 (0.9 to 2.9)	<0.001	
40 alarms	+11.8 (5.6 to 17.9)	<0.001		+5.5 (5.2 to 5.7)	<0.001	
Years of nursing experience			<0.001			<0.001
<2 years	reference			reference		
2 to 5 years	+15.5 (11.9 to 19.1)	<0.001		+6.4 (5.4 to 7.4)	<0.001	
>5 years	-6.4 (-11.5 to -1.3)	0.01		-12.1 (-17.2 to -7.0)	<0.001	
Unit			<0.001	Random effect		
Unit 1	reference					
Unit 2	+15.0 (11.3 to 18.6)	<0.001				
Shift type			0.4			0.09
Day	reference			reference		
Night	+1.6 (-2.1 to 5.2)	0.4		-4.8 (-10.2 to 0.7)	0.09	
Time (within a shift)			0.003			0.9
<3 hours	reference			reference		
3 to 7 hours	+8.2 (3.5 to 13.0)	0.001		+3.5 (0.5 to 6.5)	0.02	
8 to 12 hours	+3.9 (-0.4 to 8.1)	0.07		+0.5 (-6.7 to 7.6)	0.9	
No. of monitored patients			<0.001	not included		
None	reference					
1 patient	+6.1 (1.5 to 10.8)	0.01				
2 to 4 patients	+14.3 (10.0 to 18.5)	<0.001				
No. and acuity of patients			<0.001			0.03
1 to 3 patients, none high acuity	reference			reference		
1 to 3 patients, 1 with high acuity	+13.1 (7.6 to 18.6)	<0.001		+8.1 (1.6 to 14.7)	0.02	

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	Unadjusted			Adjusted		
		ha-d	alue	predicted change	ha-d	alue
	predicted change (95% CI)	category	composite	(95% CI)	category	composite
4 to 5 patients, none high acuity	+8.5 (2.6 to 14.3)	0.005		+7.8 (0.6 to 15.1)	0.03	
4 to 5 patients, 1 with high acuity	+12.1 (6.9 to 17.3)	<0.001		+5.7 (2.0 to 9.4)	0.002	

Alarm Frequency
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	0 to 5 Alarms	6 to 39 Alarms	40 Alarms
	predicted score (95% CI)	predicted score (95% CI)	predicted score (95% CI)
Years of nursing experience			
<2 years	61.0 (51.7 to 70.3)	62.9 (52.5 to 73.2)	66.4 (57.4 to 75.5)
2 to 5 years	67.3 (58.3 to 76.4)	69.2 (59.2 to 79.3)	72.8 (64.1 to 81.6)
>5 years	49.5 (36.0 to 63.0)	51.4 (36.8 to 65.9)	54.9 (41.7 to 68.2)
Shift type			
day	64.3 (57.8 to 70.9)	66.3 (58.7 to 73.8)	69.8 (63.6 to 76.1)
night	61.4 (49.0 to 73.9)	63.3 (49.8 to 76.9)	66.9 (54.7 to 79.2)
Time (within a shift) of completion			
<3 hours	61.4 (55.7 to 67.0)	63.3 (56.6 to 70.0)	66.9 (61.4 to 72.3)
3 to 7 hours	66.2 (57.7 to 74.7)	68.1 (58.6 to 77.7)	71.7 (63.4 to 79.9)
8 to 12 hours	61.6 (47.7 to 75.6)	63.6 (48.6 to 78.5)	67.1 (53.5 to 80.8)
Patients and Acuity			
1 to 3 lower acuity patients	57.5 (44.3 to 70.7)	59.4 (45.2 to 73.6)	63.0 (50.0 to 75.9)
1 to 3 patients, including 1 with high acuity	64.6 (57.4 to 71.8)	66.5 (58.3 to 74.8)	70.1 (63.2 to 77.0)
4 or 5 lower acuity patients	64.4 (57.3 to 71.4)	66.3 (58.2 to 74.4)	69.8 (63.0 to 76.7)
4 or 5 patients, including 1 with high acuity	63.0 (51.6 to 74.5)	64.9 (52.4 to 77.4)	68.5 (57.3 to 79.7)