Unanticipated Respiratory Compromise and Unplanned Intubations on General Medical and Surgical Floors

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BACKGROUND: Unanticipated respiratory compromise that lead to unplanned intubations is a known phenomenon in hospitalized patients. Most events occur in patients at high risk in well-monitored units; less is known about the incidence, risk factors, and trajectory of patients thought at low risk on lightly monitored general care wards. The aims of our study were to quantify demographic and clinical characteristics associated with unplanned intubations on general care floors and to analyze the medications administered, monitoring strategies, and vital-sign trajectories before the event. METHODS: We performed a multicenter retrospective cohort study of hospitalized subjects on the general floor who had unanticipated, unplanned intubations on general care floors from August 2014 to February 2018. RESULTS: We identified 448 unplanned intubations. The incidence rate was 0.420 per 1,000 bed-days (95% CI 0.374–0.470) in the academic hospital and was 0.430 (95% CI 0.352–0.520) and 0.394 per 1,000 bed-days (95% CI 0.301–0.506) at our community hospitals. Extrapolating these rates to total hospital admissions in the United States, we estimate 64,000 events annually. The mortality rate was 49.1%. Within 12 h preceding the event, 35.3% of the subjects received opiates. All received vital-sign assessments. Most were monitored with pulse oximetry. In contrast, 2.5% were on cardiac telemetry, and only 4 subjects used capnography; 53.7% showed significant vital-sign changes in the 24 h before the event. However, 46.3% had no significant change in any vital signs. CONCLUSIONS: Our study showed unanticipated respiratory compromise that required an unplanned intubation of subjects on the general care floor, although not common, carried a high mortality. Besides pulse oximetry and routine vital-sign assessments, very little monitoring was in use. A significant portion of the subjects had no vital-sign abnormalities leading up to the event. Further research is needed to determine the phenotype of the different etiologies of unexpected acute respiratory failure to identify better risk stratification and monitoring strategies.
Key words: intubation; respiratory insufficiency; epidemiology; lung monitoring; airway management.
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Introduction

Respiratory compromise is defined as deterioration in respiratory function in which there is a high likelihood of respiratory failure or death.[1] Once respiratory compromise

has progressed to respiratory failure, the only measures that can provide necessary support are intubation and mechanical ventilation. Respiratory compromise is common in the hospital and a frequent reason for urgent intervention.[2,3] Although most of these events occur in intensively

monitored units and in patients thought to be at risk for respiratory compromise based on various prediction models[4,5]; they can also occur on lightly monitored general care floors.

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General care floors are staffed at a lower nurse-to-patient ratio, and vital signs are conducted at less-frequent intervals compared with ICUs or step-down units.[6] There are no guidelines to define admission criteria to general care floors, but, typically, patients who do not require intensive monitoring or who are thought by clinicians to be at low risk for physiologic decompensation are housed on general care floors. The literature about respiratory compromise on general care floors, however, is scant, and, to our knowledge, there is only one study from a resuscitation registry that estimated the incidence of these events at 44,500 per year in the United States.[7]

Respiratory compromise that leads to an unplanned intubation in a general care ward is a particularly challenging situation for clinicians. The event is generally unanticipated, respiratory deterioration is rapid, the emergency response is often slow, access to emergency equipment may be limited, and efforts to avoid an intubation may thus be unsuccessful. A better understanding of risk profiling and appropriate monitoring strategies for the broad general care population of patients who go on to experience an unplanned intubation is important.

The specific aims of this study were to (1) quantify demographic and clinical characteristics associated with unanticipated respiratory compromise and unplanned intubations on general medicine and/or surgery floors; and (2) analyze the medications administered, the monitoring strategies used, and the vital-sign trajectories of these subjects in the 12–24 h before the unplanned intubation. We specifically focused on the most severe form of respiratory compromise in patients on the general care floor: the requirement for an artificial airway and mechanical

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QUICK LOOK

Current knowledge

Respiratory compromise is a life-threatening event that can occur in any care setting. Demographics and clinical characteristics of patients who develop unanticipated respiratory compromise that requires an unplanned intubation during hospitalization are not well understood.

What this paper contributes to our knowledge

Unanticipated respiratory compromise leads to high mortality. Commonly used monitoring modalities may not be sufficient to detect respiratory compromise.

ventilatory support. It is in this population that the system may have failed the most in both early warning and in subsequent detection and/or management. By understanding the characteristics of these patients and the support structure that surrounds them, we hope to inform processes that may improve monitoring, prediction, and treatment of respiratory failure in this population.

Methods

We performed a retrospective, health-system–wide study that analyzed electronic health record data from the Duke University Health System. Duke University Health System is composed of one tertiary-care academic facility and 2 community hospitals. The academic hospital had 957 acute care beds and >42,000 admissions per year. Community hospital 1 had 369 acute care beds and >16,000 admissions per year, whereas community hospital 2 had 186 acute care beds and >9,400 admission per year.

Cohort Definition

We used a nested case-control study design to account for the potentially large sample, with a relatively rare outcome. Patients were eligible if they were hospitalized from August 1, 2014, to February 14, 2018, and were ages ≥19 y. Subjects were defined by a documented endotracheal tube insertion or death within 1 h of cardiopulmonary resuscitation on a general care floor by any member of the care team in the flowsheet data within our electronic health record. In our institutions, emergency endotracheal intubations are performed by physicians, advanced practice professionals, and advanced respiratory therapists.

Death within 1 h of cardiopulmonary resuscitation was selected as a surrogate marker because of the high rates of intubation during cardiopulmonary resuscitation,[8] which was likely not documented because the patient expired

quickly. The event had to be at least 24 h after admission or surgical procedure. A patient was eligible to be a control if he or she was hospitalized for at least 24 h on a general care floor. Patients were excluded if they had an endotracheal intubation within 24 h of admission to the hospital, 24 h after an operation, or 24 h after transferring out of an ICU or a step-down unit. Endotracheal intubation before admission was also an exclusion criterion. Sample scenarios are illustrated in Supplemental Figure 1 (see the supplementary materials at http://www.rcjournal.com).

Outcome

The outcome for our study was an intubation defined as an endotracheal tube placement during the encounter, as shown in the lines, drains, and airways data or flow-sheet data, or death within 1 h of cardiopulmonary resuscitation.

Variables of Interest

For all the subjects, we abstracted demographics, encounters, and comorbidities. We abstracted vital signs and medication data for all subjects and a random subset of controls. Medication data during the encounter and the year before the encounter were grouped according to therapeutic and pharmaceutical class. Device use during the encounter was obtained from flowsheets. Vital signs, including telemetry and pulse oximetry, could be visualized centrally or at the bedside.

Statistical Analysis

By using the sampled cohort, we compared baseline characteristics of subjects and controls, stratified by hospital. We calculated the incident ratio ratio for unplanned intubation and associated 95% CI by using the full eligible cohort. By using the sampled cohort, we assessed medication usage during the year preceding the encounter of interest and the medication use during hospitalizations. For subjects, we assessed device use in the 1–12 h preceding the unplanned intubation. We compared changes in vital signs between subjects and controls before intubation by using a method described previously.[9]

In brief, the time at admission was considered time 0; at the time each subject had his or her unplanned intubation, we sampled 4 eligible controls who were still at risk of being intubated. We then abstracted vital signs during the preceding 24 h. For each vital sign, we fit a linear mixed model, regressing the vital sign onto time and adjusting for the patient's age, sex, and race. To allow for flexibility in the change in the vital sign, we included a time as cubic spline and used a likelihood ratio test to determine the degrees of freedom for each

vital sign. We fit an interaction term between case-control status and time, which allows the curves to vary between case status.

The model had the form of

$$Vitals_{ij} = \alpha_i + \beta_1 f(t_{ij}) + \beta_2 I(case = 1) + \beta_3 f(t_{ij})$$
$$\times I(case = 1) + W_i w + \varepsilon_{ij}$$

where α_i represents the random effects; $f(t_{ij})$ represents a flexible function, that is, spline, of time; and W_i are patient demographics. The parameter of interest, β_3, is a parameter vector based on the spline of time. We performed a likelihood ratio test on this interaction term (β_3) to assess whether the curves differed between the 2 groups. With each subject, for each vital sign, we also fit a simple linear model to assess whether the individual's vital signs were increasing or decreasing when leading up to the event. All analyses were conducted by using SAS 9.4 (SAS Institute, Cary, North Carolina) and R version 3.5.2 (R Foundation, Vienna, Austria). This study was approved by the Duke University Institutional Review Board.

Results

We identified a total of 448 unplanned intubations: 291 at our academic facility, and 100 and 57 at community hospitals 1 and 2, respectively. There were 202,910 eligible controls across all 3 hospitals; 20,056 sampled controls were included in the analyses. Baseline characteristics of subjects and sampled controls are presented in Table 1. Of the 448 unplanned intubations on general ward floors from our 3 facilities, the median age was 65.5 (quartiles, 56.6, 75.4) y, 57.1% were men, and the median body mass index was 27.4 (quartiles 23.4, 32.8) kg/m². The median age for the controls were 62.3 (quartiles, 49.9, 72.6) y, 48.2% were men, and the median body mass index was 28 (quartiles, 24.0, 33.3) kg/m².

Based on our analyses, we found the incidence rate of unplanned intubations to be 0.420 per 1,000 (95% CI 0.374–0.470) bed-days in the academic hospital; 0.430 per 1,000 (95% CI 0.352–0.520) bed-days in community hospital 1 and 0.394 per 1,000 (95% CI 0.301–0.506) bed-days at community hospital 2. The mortality rate of the subjects with unplanned intubation was 49.1% during the event hospitalization. Seventeen subjects were defined by cardiopulmonary arrest. Subjects had higher rates of coronary artery disease, cerebrovascular disease, congestive heart failure, COPD, and organ transplantations compared with the controls. The medication use during the past year for subjects and controls is illustrated in Supplemental Table 1 (see the supplementary materials at http://www.rcjournal.com). Notably, subjects had higher rates of anti-hyperglycemics, cardiac and cardiovascular drugs, and diuretics.

Table 1. Baseline Characteristics for Subjects With Unplanned Intubations and Sampled Controls

Characteristic	Academic Hospital (n = 291)	Community Hospital 1 (n = 100)	Community Hospital 2 (n = 57)	Controls (n = 20,056)
Demographics				
Age, y	64.4 (55.4–73.3)	71.1 (63.8–79.1)	72.0 (61.0–78.3)	62.3 (49.9–72.6)
Males	167 (57.4)	52 (52.0)	37 (64.9)	9,676 (48.2)
Non-Hispanic blacks	96 (33.0)	47 (47.0)	22 (38.6)	6,395 (31.9)
Non-Hispanic whites	179 (61.5)	47 (47.0)	31 (54.4)	12,229 (61.0)
Smoker				
Current	27 (12.1)	16 (16.5)	3 (5.7)	2,734 (16.5)
Former	112 (50.2)	44 (45.4)	27 (50.9)	6,407 (38.6)
Never	84 (37.7)	37 (38.1)	23 (43.4)	7,441 (44.9)
Clinical characteristics and comorbidity history in the past year				
Body mass index, kg/m^2	27.7 (23.1–33.4) (274)	27.8 (24.4–33.3) (93)	26.1 (22.4–29.9) (56)	28.0 (24.0–33.3) (17,953)
Asthma	14 (5.7)	8 (9.2)	3 (6.5)	1,108 (6.3)
CAD	73 (29.8)	38 (43.7)	12 (26.1)	2,762 (15.6)
Cerebrovascular disease	48 (19.6)	17 (19.5)	6 (13.0)	1,803 (10.2)
CHF	75 (30.6)	37 (42.5)	8 (17.4)	2,821 (16.0)
COPD	72 (29.4)	33 (37.9)	12 (26.1)	3,627 (20.5)
Organ transplantation	40 (16.3)	5 (5.7)	0 (0.0)	1,336 (7.6)
Sleep apnea	47 (19.2)	10 (11.5)	3 (6.5)	2,396 (13.6)
Comorbidities (of total 15)	4.0 (2.0–5.0) (245)	4.0 (2.0–6.0) (87)	2.0 (1.0–4.0) (46)	2.0 (1.0–4.0) (17678)
Cardiopulmonary resuscitation	6 (2.1)	10 (10.0)	1 (1.8)	NA
Died during an encounter	141 (48.5)	54 (54.0)	25 (43.9)	238 (1.2)
Emergency admission	185 (63.6)	91 (91.0)	43 (75.4)	10649 (53.1)
Service line				
Medicine	223 (76.6)	94 (94.0)	44 (77.2)	12672 (63.2)
Surgery	65 (22.3)	6 (6.0)	13 (22.8)	6922 (34.5)
Other	3 (1.0)	0 (0.0)	0 (0.0)	461 (2.3)

Data are shown as n (%) or median (Q1–Q3).
CAD = coronary artery disease
CHF = congestive heart failure
NA = not applicable

The use of medication and devices in the 1–12 h before the event is presented in Table 2. Of the subjects, 12.9% received a benzodiazepine, 35.3% received an opiate, 9.3% received either a sedative or antipsychotic, 23.7% received a bronchodilator, 20.1% received a diuretic, and 29.0% were on antibiotics. The vast majority were receiving pulse oximetry and had received oxygen supplementation. A small minority were on telemetry (2.5%), whereas only 4 cases had used an end-tidal CO_2 monitor before the event; 5.4% used noninvasive ventilation, and 5.1% used high-flow nasal cannula oxygen therapy.

The average vital-sign trajectories of pulse, breathing frequency, systolic and diastolic blood pressure, and pulse oximetry in leading up to the events for subjects compared with time-matched controls are illustrated in Figure 1. All vital signs except diastolic blood pressure showed significantly different average trajectories ($P < .01$, likelihood ratio test). However, there was heterogeneity in the individual trajectories (Table 3). For example, with respect to respiration, 4.8% of the subjects showed a significant decrease in leading up to the event, indicative of bradypnea, whereas 13% showed a significant increase indicative of tachypnea. Importantly, 46.3% of the subjects had no significant change in any vital sign in leading up to the event.

Discussion

To our knowledge, this was the first study that focused solely on unplanned emergent intubations, the severest form of respiratory compromise, in subjects who were lightly monitored and in seemingly stable general floor care. Over our 43-month study period, we identified 448 such events in 3 hospitals, with >67,000 combined admissions per year. Extrapolating that to American Hospital Association data (https://www.aha.org/statistics/2020-01-07-archived-fast-facts-us-hospitals-2019, *Accessed January 5, 2020*), which reported >36 million admissions in 2017 in the United States, analysis of our results suggested that >64,000 unplanned intubations/year occur on general care services, a number comparable with that observed in the

Table 2.   Medications and Devices in Subjects With Unplanned Intubations 1–12 h Before an Event

Characteristic	All Subjects ($n = 448$)	Academic Hospital ($n = 291$)	Community Hospital 1 ($n = 100$)	Community Hospital 2 ($n = 57$)
Medication use in previous 1–12 h, n (%)				
Benzodiazepines	58 (12.9)	38 (13.1)	10 (10.0)	10 (17.5)
Opioids	158 (35.3)	105 (36.1)	31 (31.0)	22 (38.6)
Sedatives	10 (2.2)	8 (2.7)	0 (0.0)	2 (3.5)
Anticholinergics	53 (11.8)	37 (12.7)	10 (10.0)	6 (10.5)
Antipsychotics	32 (7.1)	22 (7.6)	6 (6.0)	4 (7.0)
Bronchodilators	106 (23.7)	59 (20.3)	31 (31.0)	16 (28.1)
Diuretics	90 (20.1)	63 (21.6)	17 (17.0)	10 (17.5)
Antibiotics	130 (29.0)	89 (30.6)	31 (31.0)	10 (17.5)
Systemic corticosteroids	49 (10.9)	36 (12.4)	8 (8.0)	5 (8.8)
Pressors or inotropes	22 (4.9)	20 (6.9)	0 (0.0)	2 (3.5)
Device use and therapies in previous 1–12 h, n (%)				
None (room air)	28 (6.3)	22 (7.6)	3 (3.0)	3 (5.3)
Pulse oximetry	442 (98.7)	288 (99.0)	98 (98.0)	56 (98.2)
Telemetry	11 (2.5)	7 (2.4)	4 (4.0)	0 (0.0)
ETCO$_2$ device	4 (0.9)	4 (1.4)	0 (0.0)	0 (0.0)
Nasal cannula	198 (44.2)	125 (43.0)	51 (51.0)	22 (38.6)
High-flow nasal cannula	23 (5.1)	13 (4.5)	6 (6.0)	4 (7.0)
Face mask	20 (4.5)	13 (4.5)	2 (2.0)	5 (8.8)
CPAP	12 (2.7)	10 (3.4)	1 (1.0)	1 (1.8)
BPAP	12 (2.7)	6 (2.1)	3 (3.0)	3 (5.3)

Data are shown as n (%).
ETCO$_2$ = end-tidal carbon dioxide
BPAP = bi-level positive airway pressure

aforementioned study by Andersen et al[7] in subjects outside the operating room, emergency department, and ICU.

Not surprisingly, we found that subjects who received an unplanned intubation had a significantly high mortality rate compared with the control subjects who were hospitalized and in general care, 49% of the subjects who required an unplanned intubation expired either at the time of intubation or during the hospitalization. This mortality rate was significantly higher than was found in other general care cohorts, including sepsis,[10] COPD exacerbation,[11] pneumonia,[12] and heart failure.[13] Compared with controls, our cases had higher rates of coronary disease, diabetes, COPD, and congestive heart failure. Furthermore, the cases had higher rates of multiple comorbidities compared with the controls. Interestingly, there was little difference in the rates of sleep apnea between the cases and the controls. The lack of difference runs contrary to the current literature because previous research has shown obstructive sleep apnea to be a risk factor for respiratory failure.[14,15]

In the 12 h leading up to the intubation event, the rate of opiate and sedative use was high in the cases that required intubations. Both of these medication classes have been shown to impact ventilatory drive.[16-18] This likely suggests that the addition of sedative medications on a cohort of patients with comorbidities while acutely ill would play a factor in their decompensation. This warrants further study.

Vital sign monitoring is a cornerstone of current general floor care management, and although designed to detect decompensation, monitoring is only done intermittently.[19] Important vital sign changes were observed in the h before the unplanned intubation in a number of our cases. However, there were a significant number of subjects who had no vital sign abnormalities before their respiratory decompensation, which illustrates the shortcomings of current general floor vital sign monitoring modalities. The considerable heterogeneity in these vital sign patterns underscores the range of etiologies and trajectories of in-hospital respiratory compromise.

These "phenotypes" of respiratory compromise would include sudden (catastrophic) events versus gradual deteriorations that involve neurologic, cardiovascular, or respiratory function. Thus, there is no single approach to predicting, monitoring, or preventing these occurrences.[20] For each of these phenotypes, risk prediction models, monitoring strategies, and intervention potential are likely to be different. Future research can be directed to better characterize these phenotypes and to group patients accordingly. Patients with specific patterns could then benefit from more-focused monitoring and intervention strategies.

In addition to vital-sign measurements, 2 monitors are generally available for patients in general care: exhaled gas capnography and pulse oximetry (S_{pO_2}). Capnography can
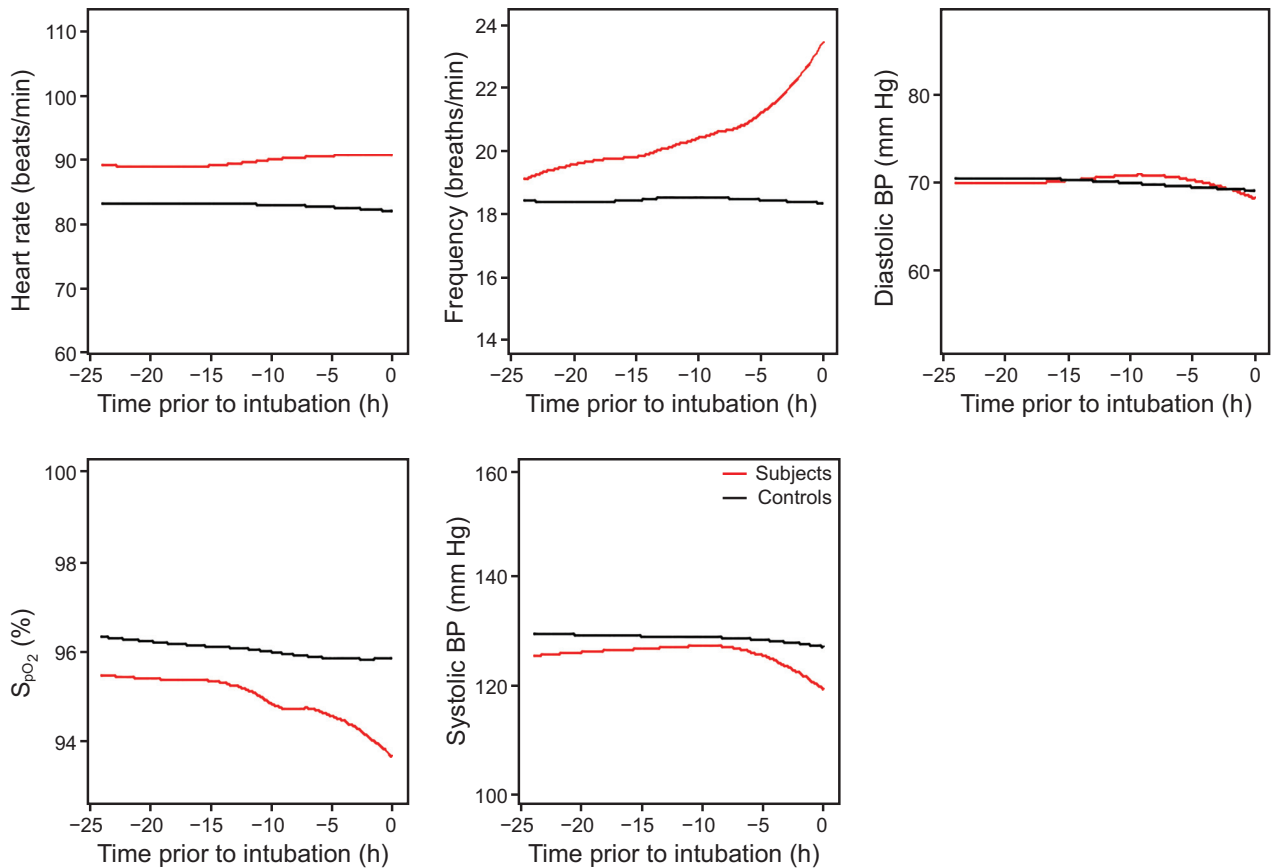
Fig. 1. Vital sign trajectories heart rate, breathing frequency, diastolic blood pressure (BP), pulse oximetry, and systolic BP.

Table 3. Percentage of Subjects Who Had a Significant Increase or Decrease in a Vital Sign in the 24 h Before the Event

Vital Sign	Decrease, %	Increase, %
Pulse	10.7	16.1
Respirations	4.8	13.1
Diastolic blood pressure	10.4	6.6
Systolic blood pressure	12.4	7.2
S_{pO_2}	7.3	5.7

offer a noninvasive means of accurately measuring the breathing frequency and is generally available in most hospitals. Capnography has also been shown to be effective in identifying respiratory compromise in patients in general care.[21] However, despite the high use of opioids and sedatives, the rate of capnography monitoring in our subjects was very low. This underscores the likelihood that providers truly thought that these subjects were at low risk for further cardiopulmonary decompensation. Although guidelines exist for capnography usage for operating rooms, patients who are moderately sedated and on advanced life care support, there are no guidelines to direct capnography usage on patients on the general floor.[22]

Pulse oximetry is a widely used monitor that is noninvasive, simple to operate, and often is a part of admission order sets. Indeed, nearly all of our subjects had pulse oximetry monitors in use but, as noted above, recorded changes in S_{pO_2} before the unplanned intubation were uncommon. Whether this is because adequate supplemental oxygen was being adjusted to achieve the normal range of oxygen saturation or these subjects truly had no aberrancy in their oxygen saturation before respiratory failure remains unclear. The limitations of pulse oximetry are well known. The reported values are time-weighted averages and thus delays in recognizing acute events occur. Hypotension, vasoconstriction, motion artifacts, and low cardiac outputs can all lead to poor signal quality.[23-25]

Given the heterogeneity of respiratory compromise and the limited available data to inform clinicians, it should not be surprising that evidence-based guidelines on general floor care monitoring are lacking. Decisions and selection are largely left up to providers. Furthermore, initiatives such as the Choosing Wisely Campaign, have adopted recommendations in minimizing device monitoring in certain clinical settings.[26] Our results strongly suggest that "one size does not fit all" and that much more research is needed to understand cost-effective strategies for general floor care monitoring.

The findings of this study should be interpreted in the context of the study design and the limitations of the data sets. Our definition of unplanned intubation, defined a 24-h time limit for inclusion after admission, ICU transfer, or operation, and does not truly reflect a point in time reflective of clinical stability. We also delineated the time frame for medication and device usage as 1-12 h before the event. From the data available, it is not possible to assess if the medications or devices were being used for routine treatment and/or monitoring (eg, noninvasive ventilation for obstructive sleep apnea) or directed toward impending respiratory failure.

Another limitation of our study was the reliance of data captured by documentation in the electronic health record. Electronic health record data can be incomplete[27] and due to data entry discrepancies as well as back-end data transformation, not always reflective of the true clinical experience. Furthermore, although vital signs have been shown to be predictive of deterioration,[28] recordings may be incomplete.[29,30] Because we censored the subjects after the time stamp of intubation or cardiopulmonary arrest, data that were time stamped after the event but could have occurred before the event would not have been included.

Also, we used subjects who died 1 h after cardiopulmonary arrest as a surrogate marker for unplanned intubation since, patients generally need endotracheal intubation who develop cardiopulmonary arrest. Because we censored the subjects after the time stamp of intubation or cardiopulmonary arrest, data that were time stamped after the event but could have occurred before the event would not have been included.

Conclusions

Respiratory compromise that requires an unplanned intubation of patients on the general care floor, although uncommon, carries a high mortality and is potentially preventable. Not surprisingly, the subjects in general care who were older and sicker were at higher risk. Importantly, besides pulse oximetry and routine vital sign assessments, very little other monitoring was in use in our patient population. There clearly were multiple etiologies and clinical trajectories for acute respiratory compromise that occurred in this population. Further research is needed to effectively determine the phenotype of the different etiologies of acute de novo respiratory failure on the general care floors to identify better risk stratification, monitoring processes, and interventional strategies for these patients.

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