A pilot study of respiratory rate derived from a wearable biosensor compared with capnography in emergency department patients

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Purpose: Respiratory rate is assessed less frequently than other vital signs, and documented respiratory rates are often erroneous. This pilot study compared respiratory rates derived from a wearable biosensor to those derived from capnography.

Methods: Emergency department patients with respiratory complaints were enrolled and had capnography via nasal cannula and a wireless, wearable biosensor from Philips applied for approximately one hour. Respiratory rates were obtained from both of these methods. We determined the difference between median respiratory rates obtained from the biosensor and capnography and the proportion of biosensor-derived respiratory rates that were within three breaths/minute of the capnography-derived respiratory rates for each patient. A Spearman correlation coefficient was calculated to assess the strength of the correlation between mean respiratory rates derived from both methods. Plots of minute-by-minute respiratory rates, per patient, for each monitoring method were shown to two physicians. The physicians identified time periods in which the respiratory rates appeared invalid. The proportion of time with invalid respiratory rates for each patient, for each method, was calculated and averaged.

Results: We analyzed data for 17 patients. Median biosensor-derived respiratory rate was 20 breaths/minute (range: 7–40 breaths/minute) and median capnography-derived respiratory rate was 25 breaths/minute (range: 0–58 breaths/minute). Overall, 72.8% of biosensor-derived respiratory rates were within three breaths per minute of the capnography-derived respiratory rates for each patient. A Spearman correlation coefficient was calculated to assess the strength of the correlation between mean respiratory rates derived from both methods. Plots of minute-by-minute respiratory rates, per patient, for each monitoring method were shown to two physicians. The physicians identified time periods in which the respiratory rates appeared invalid. The proportion of time with invalid respiratory rates for each patient, for each method, was calculated and averaged.

Conclusion: Our pilot study suggests that the Philips wearable biosensor can continuously obtain respiratory rates that are comparable to capnography-derived respiratory rates among emergency department patients with respiratory complaints.

Keywords: respiratory rate, emergency department, clinical monitoring

Introduction
Respiratory rates and changes in respiratory rate have been found to be strong predictors of early clinical deterioration, making respiratory rate an important vital sign.1–3 However, evidence indicates that respiratory rate is assessed less frequently than other vital signs, and respiratory rates documented in the medical record are often erroneous due to estimation rather than actual measurement.1,4–7

Although capnography is regarded as the gold standard for monitoring respiratory rate in intubated and perioperative patients,8,9 there is no gold standard for
monitoring respiratory rate in patients who are awake and mobile. Capnography monitoring requires that the patient wear a nasal cannula connected to a capnograph that derives a respiratory rate, which limits patient mobility. The nasal cannula may be uncomfortable and may be moved or removed by the patient, leading to inaccurate measurements and erroneous alarms.

Manual observation of respiratory rate is standard clinical practice; however, it does not provide continuous monitoring, is prone to error, and is inefficient in busy settings. Therefore, non-intrusive methods of monitoring respiratory rate continuously and accurately are important. The objective of our pilot study was to compare respiratory rates derived from a wearable biosensor from Philips with those derived from capnography.

Methods

Study design and setting

We conducted a prospective pilot study of a convenience sample of adult patients with respiratory chief complaints who presented to the emergency department of North Shore University Hospital in Manhasset, New York between July 2017 and December 2017. North Shore University Hospital, part of the Northwell Health system, is a 738-bed tertiary care facility with an emergency department that cares for approximately 90,000 patients per year.

This study was approved by the Northwell Health Institutional Review Board and was conducted in accordance with the Declaration of Helsinki and Good Clinical Practice. Written informed consent was obtained from all subjects prior to completing any research procedures. We included patients who were English-speaking, ≥18 years of age, had an Emergency Severity Index score of 2 or 3, and had a respiratory chief complaint (eg, shortness of breath, difficulty breathing, or dyspnea). We excluded patients who had an implanted defibrillator, pacemaker, or allergy to adhesives.

Philips wearable biosensor

The Philips wearable biosensor is a wireless, battery-operated, skin-adhesive device that weighs 12 grams, and measures 115 mm in length, 36 mm in width, and 8 mm in depth. When adhered to a patient’s chest, it continuously records and transmits the patient’s respiratory rate, heart rate, ambulation, and posture. The biosensor has received Food and Drug Administration 510(k) clearance under K152139 for in-hospital use. Due to its wireless nature, patient movement is not restricted and patients are able to move away from their bed during the monitoring period.

Study protocol and data collection

Trained research assistants monitored our hospital’s electronic medical record system to track patients in the emergency department. Patients appearing to meet eligibility criteria were approached by a research assistant and the research assistant explained the study to the patient and verified eligibility. Patients were given the opportunity to ask questions as well as review the consent form alone. The research assistant returned after a few minutes and patients interested in participating were enrolled. After written informed consent was obtained, the research assistant applied the wearable biosensor on the patient’s chest as well as capnography via nasal cannula. Patients wore the biosensor and capnography for approximately one hour, and minute-by-minute respiratory rates were obtained. All data were stored in a secure, password-protected, electronic database, only accessible by study staff.

Data analysis

Respiratory rates derived from the biosensor and capnography for all patients, for the entire monitoring period, were qualitatively compared using boxplots. Following the method described by Bergese et al, capnography-derived respiratory rate was used as the reference and we determined the difference between respiratory rates obtained from the biosensor and capnography. We then determined the proportion of biosensor-derived respiratory rates that were within three breaths/minute of the capnography-derived respiratory rates for each patient, as described by Bergese et al. A Spearman’s correlation coefficient was calculated to assess the strength of the correlation between mean respiratory rates derived from both methods. Plots of minute-by-minute respiratory rates, per patient, for each monitoring method were shown to two physicians, dually board certified in emergency medicine and critical care medicine, along with the patient’s age, sex, chief complaint, and past medical history. The physicians were blinded to the method in which the respiratory rates were derived, and were asked to identify time periods on the plots in which respiratory rates appeared invalid based on their clinical judgment (eg, respiratory rates of two breaths per minute). The proportion of time with invalid respiratory rates for each patient, for each method, was calculated and averaged. Overall mean difference and proportion of biosensor-derived respiratory rates within three
breaths/minute of capnography-derived respiratory rates were recalculated with the invalid time periods excluded.

Because this was a pilot study, a sample size calculation was not performed prior to performing this study. A post-hoc power analysis was conducted and revealed that with 17 pairs of subjects, we had 74% power with a Type I error probability of 5%.

**Results**

A total of 23 patients were enrolled, but six patients were excluded from the analysis due to errors in application of the biosensor (eg, did not power on biosensor, did not remove chest hair from patient prior to application of the biosensor, and using an expired biosensor); therefore only 17 patients had analyzable data. Mean age was 61 years, 59% were male, and median emergency department length of stay was 12.1 hrs. A total of 990 minutes of respiratory rates from the biosensor and capnography were available. There was a statistically significant strong correlation between mean respiratory rates derived from both monitoring methods (Spearman’s $\rho=0.86275; \ p<0.0001$). As shown in Figure 1, median biosensor-derived respiratory rate was 20 breaths/minute (range: 7–40 breaths/minute) and median capnography-derived respiratory rate was 25 breaths/minute (range: 0–58 breaths/minute). Overall, 72.8% of biosensor-derived respiratory rates were within three breaths per minute of the reference capnography-derived respiratory rates. Mean difference in respiratory rates for each patient is shown in Figure 2. Overall mean difference (mean of mean difference for all patients) was 3.5 breaths/minute ($\pm5.2$ breaths/minute). The majority of capnography-derived respiratory rates were higher than biosensor-derived respiratory rates. Of note, patient #4 in Figure 2 appears to be an outlier, with substantially higher differences in respiratory rates between the two methods.

Based on the two physicians’ blinded review, respiratory rates appeared invalid 0.7% of the time for the biosensor and 5.0% of the time for capnography. When these invalid time periods were excluded, overall mean difference between the two methods was 3.2 breaths/minute ($\pm3.6$ breaths/minute) and 76.3% of biosensor-respiratory rates were within three breaths per minute of the reference capnography-derived respiratory rates.

**Discussion**

This pilot study compared respiratory rates derived from a wearable biosensor from Philips with respiratory rates derived from standard capnography via nasal cannula. Results from several studies show that clinical deterioration is often preceded by changes in respiratory rate.$^{1-3,5}$ Therefore, respiratory

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![Figure 1](https://www.journalname.com/figure1.png)

**Figure 1** Distribution of respiratory rates derived from Philips wearable biosensor and capnography ($n=17$). Boxplots showing the following values: minimum, quartile 1 (25th percentile), median (50th percentile), quartile 3 (75th percentile), and maximum.
rate is an important vital sign to monitor. However, respiratory rate is often assessed less frequently compared with other vital signs, and it is known in the medical community that respiratory rates are often estimated, rather than actually measured. Further, it is not feasible to obtain frequent respiratory rate measurements in busy clinical settings, such as the emergency department. The gold standard for monitoring respiratory rate in patients who are intubated and patients in perioperative setting is via capnography. However, it may not be practical to apply a nasal cannula on every patient in the emergency department, as it limits movement and may be uncomfortable to wear.

Therefore, non-intrusive methods of continuously monitoring respiratory rate are needed. With accurate respiratory rates, clinical deterioration may be predicted, and interventions may be initiated to prevent deterioration. Continuous respiratory rate monitoring may be particularly important in the emergency department setting, as patients are often placed in a room and unmonitored for long periods of time. With a reliable and non-intrusive, continuous respiratory rate monitoring method, conditions such as sepsis may be identified early, as many risk stratification and prediction scores include respiratory rate as a parameter. One study found that serial vital sign measurements among patients with suspected infection or sepsis in the emergency department can be used to identify patients at risk for deterioration within 72 hours, and respiratory rate was a significant predictor of deterioration. Another study found that respiratory rate can be used to predict patient outcomes among acute heart failure patients in the emergency department. Therefore, reliable and continuous respiratory rate measurements are critically important for patient safety, risk satisfaction, and prediction of clinical outcomes.

The Philips wearable biosensor can be adhered to the chest of patients, is completely wireless, and does not limit movement and thus, may be a viable respiratory rate monitoring method for emergency department patients. Our pilot study found that respiratory rates derived from the biosensor were generally similar to respiratory rates derived from capnography; 72.8% of the biosensor-derived respiratory rates were within three breaths/minute of the capnography-derived respiratory rates. Respiratory rates from both methods were also strongly correlated (Spearman’s ρ: 0.86275). Further, based on physicians’ blinded review, there appeared to be more invalid respiratory rates derived from capnography compared with the biosensor (5.0% vs 0.7%).

A prior study by Subbe et al reported on the performance of a similar wireless respiratory rate monitoring device compared with standard capnography. This studied enrolled patients admitted to an acute medical unit and found that the device can obtain respiratory rates that are comparable to standard capnography. Our study differs in that we enrolled patients from the emergency department, where patients may

Figure 2 Mean difference in respiratory rate per patient. Difference was calculated by subtracting Philips wearable biosensor-derived respiratory rate from capnography-derived respiratory rate. Mean difference was calculated by averaging the minute-by-minute differences. Error bars represent SDs. Patient #4 appears to be an outlier.
be unstable and unmonitored for long periods of time. Nevertheless, our results are complementary to those by Subbe et al, and adds to the growing body of literature on wireless respiratory rate monitoring devices.

Limitations
There are a few limitations of this pilot study to acknowledge. First, our study included a small sample size of only 17 patients. Therefore, a larger study is warranted to verify our findings. Second, we only enrolled patients with respiratory chief complaints. Therefore, whether other physiologic states affect the performance of the wearable biosensor is unknown. Lastly, capnography-derived respiratory rates were used as the reference in this study, as they are currently considered the gold standard. However, capnography often shows noise and errors when obtaining respiratory rates for awake and mobile patients. Hence, although we are able to conclude that biosensor-derived respiratory rates were comparable to respiratory rates derived from capnography, without a true gold standard, we are unable to determine the effect of errors on these findings.

Conclusion
Our pilot study suggests that the Philips wearable biosensor can continuously obtain respiratory rates that are comparable to capnography-derived respiratory rates among emergency department patients with respiratory complaints. The majority (72.8%) of biosensor-derived respiratory rates were within three breaths of capnography-derived respiratory rates and biosensor-derived respiratory rates appeared invalid <1% of the time. The Philips wearable biosensor appears to be a valid and reliable method of automated respiratory rate monitoring while allowing patients freedom of movement.

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Disclosure
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