

# Diffusing an Innovation: Clinician Perceptions of Continuous Predictive Analytics Monitoring in Intensive Care

Rebecca R. Kitzmiller<sup>1</sup> Ashley Vaughan<sup>1</sup> Angela Skeeles-Worley<sup>2</sup> Jessica Keim-Malpass<sup>3</sup>  
 Tracey L. Yap<sup>4</sup> Curt Lindberg<sup>5</sup> Susan Kennerly<sup>6</sup> Claire Mitchell<sup>2</sup> Robert Tai<sup>2</sup> Brynne A. Sullivan<sup>7</sup>  
 Ruth Anderson<sup>1</sup> Joseph R. Moorman<sup>8,9</sup>

<sup>1</sup> School of Nursing, University of North Carolina at Chapel Hill, Chapel Hill, North Carolina, United States

<sup>2</sup> Curry School of Education and Human Development, University of Virginia, Charlottesville, Virginia, United States

<sup>3</sup> School of Nursing, University of Virginia, Charlottesville, Virginia, United States

<sup>4</sup> School of Nursing, Duke University, Durham, North Carolina, United States

<sup>5</sup> Billings Clinic, Billings, Montana, United States

<sup>6</sup> College of Nursing, East Carolina University, Greenville, North Carolina, United States

<sup>7</sup> Division of Neonatology, University of Virginia, Charlottesville, Virginia, United States

<sup>8</sup> Departments of Cardiology and Biomedical Engineering, University of Virginia, Charlottesville, Virginia, United States

<sup>9</sup> Center for Advanced Medical Analytics, University of Virginia, Charlottesville, Virginia, United States

**Address for correspondence** Rebecca R. Kitzmiller, PhD, MHR, RN, BC, University of North Carolina at Chapel Hill, 4108 Carrington Hall, CB 7460, Chapel Hill, NC 27599, United States (e-mail: kitzm002@ad.unc.edu).

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## Abstract

**Background** The purpose of this article is to describe neonatal intensive care unit clinician perceptions of a continuous predictive analytics technology and how those perceptions influenced clinician adoption. Adopting and integrating new technology into care is notoriously slow and difficult; realizing expected gains remain a challenge.

**Methods** Semistructured interviews from a cross-section of neonatal physicians ( $n = 14$ ) and nurses ( $n = 8$ ) from a single U.S. medical center were collected 18 months following the conclusion of the predictive monitoring technology randomized control trial. Following qualitative descriptive analysis, innovation attributes from Diffusion of Innovation Theory-guided thematic development.

**Results** Results suggest that the combination of physical location as well as lack of integration into work flow or methods of using data in care decisionmaking may have delayed clinicians from routinely paying attention to the data. Once data were routinely collected, documented, and reported during patient rounds and patient handoffs, clinicians came to view data as another vital sign. Through clinicians' observation of senior physicians and nurses, and ongoing dialogue about data trends and patient status, clinicians learned how to integrate these data in care decision making (e.g., differential diagnosis) and came to value the technology as beneficial to care delivery.

**Discussion** The use of newly created predictive technologies that provide early warning of illness may require implementation strategies that acknowledge the risk–benefit of treatment clinicians must balance and take advantage of existing clinician training methods.

## Keywords

- ▶ predictive analytics
- ▶ continuous predictive monitoring
- ▶ neonatal intensive care
- ▶ sepsis
- ▶ Diffusion of Innovations
- ▶ innovation attributes
- ▶ implementation

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## Background and Significance

New technologies, such as predictive analytics, hold the potential to dramatically improve knowledge about illnesses and their effective treatment.<sup>1-4</sup> Predictive technologies are designed to assess for and warn of patient risk hours to days in advance of clinical signs toward the goals of early clinical intervention and improved patient outcomes.<sup>5-8</sup> However, risk of illness does not guarantee a patient will develop that illness, thus clinicians must balance the benefits of early intervention (e.g., resolving infection prior to sepsis onset) with the negative consequences of delayed treatment or unnecessary treatment (e.g., developing antibiotic-resistant organisms). To date, predictive analytics studies primarily focused on statistical model development and accuracy, rather than on clinicians' acceptance and adoption of predictive technologies into care.<sup>9-14</sup> Among studies that did evaluate clinician use, results underscore clinicians' difficulty in translating risk prediction into medically actionable interventions.<sup>6,15</sup> Known technology implementation challenges (e.g., poor design,<sup>16</sup> misalignment between system design and care processes,<sup>17-24</sup> changes to communication and care processes<sup>25</sup>) may further complicate use of these emerging innovations, negatively impact efficacy trials,<sup>26,27</sup> and delay systematic adoption.<sup>6</sup> This article describes neonatal intensive care unit (NICU) clinician perceptions of a continuous predictive analytics technology and how those perceptions influenced clinician adoption.

### Continuous Predictive Analytics: Heart Rate Observation

Using streaming electrocardiograph (ECG) monitoring heart rate data (RR interval, sample asymmetry, standard deviation, and calculations of sample entropy) from bedside

monitoring technology, a University of Virginia (UVA) interdisciplinary team (neonatology, cardiology, statistics, biomedical engineering) developed mathematical algorithms to discriminate neonatal sepsis and sepsis-like illness.<sup>28</sup> The team then created a monitor to visualize the algorithm, heart rate observation (HeRO), a predictive analytics technology and refined technology functions in response to neonatologist feedback (→Fig. 1). HeRO calculated and displayed a neonate's fold-increased risk of developing sepsis in the next 24 hours where a score of 1 represents baseline sepsis risk among all neonates. This score was known as the heart rate characteristic (HRC) index. Updated hourly, the monitor was designed to display a 5-day trend (→Fig. 1: orange, top) and indicate highest HRC (→Fig. 1: yellow vertical line) with corresponding raw heart rate data (→Fig. 1: green, bottom) with controls to allow users to scroll back through time.<sup>29</sup>

Following Food and Drug Administration approval, the HeRO research team conducted a parallel, two-group, individually randomized control trial (RCT) (NCT00307333) among 3,003 very low birth weight (< 1,500 g) neonates from 9 U.S. NICUs to determine if HeRO improved neonatal sepsis outcomes.<sup>29</sup> At UVA, a single HeRO monitor (→Fig. 1) was mounted in a central location in each of six pods to maximize visibility from the 6 to 9 beds contained in each pod.

At the beginning of the clinical trial (April, 2004), the research team provided NICU clinicians with information regarding how the score was calculated and that a rising score might indicate the need to assess the patient and, as needed, to test or treat as appropriate.<sup>29</sup> The research team did not use other implementation strategies (e.g., programmatic training, decision aids, treatment protocols) to promote or improve provider engagement with HeRO or to influence the use of HeRO data in clinical care due to concerns about unnecessary sepsis evaluations or overuse



**Fig. 1** Heart rate observation (HeRO) monitor-visualizing heart rate characteristics index, corresponding heart rate pattern, and controls to scroll forward and backward in time.

of blood cultures and antibiotics.<sup>29</sup> Concluded in May, 2010, the RCT resulted in significant reduction in sepsis-related mortality (22%) among very low birth weight neonates (hazard ratio= 0.7; 95% confidence interval [CI], 0.61–0.99,  $p = 0.04$ ) and among extremely low birth weight neonates (26%; hazard ratio = 0.74; 95% CI, 0.57–0.95;  $p = 0.02$ ).<sup>29</sup> Monitored infants experienced a slight increase in drawn blood cultures (10%) and days on antibiotics (5%), the difference from nonmonitored infants was not significant ( $p = 0.31$ ).<sup>29</sup> HeRO remains in use and has been associated with early recognition of other significant neonatal illnesses such as necrotizing enterocolitis<sup>30</sup> and respiratory decompensation.<sup>30–32</sup> HeRO represents an early example of predictive analytics using continuously available bedside ECG monitor data and may be the first to be routinely used in care delivery. Members of the UVA NICU were the first to use HeRO and represented an ideal user group from which to understand user perceptions of newly developed predictive monitoring technology.

**Guiding Framework: Diffusion of Innovation**

Diffusion of Innovations (DOI) served as the theoretical lens specifically because this theory considers clinical team members’ needs, motivation, values and goals, skills, learning style, and networks as core components influencing adoption of new practices.<sup>19</sup> The theory has proven useful for understanding adoption of care cueing,<sup>33</sup> surgical checklists,<sup>34</sup> after-visit summaries,<sup>35</sup> and technology in geriatric care.<sup>36</sup> DOI research notes that an innovation’s attributes (i.e., complexity, compatibility, trialability, observability, relative advantage) influences if and how quickly an innovation will be adopted (→ **Table 1**).<sup>33,34,36–38</sup>

If an innovation is perceived by clinicians as difficult to use, not integrated with existing workflow, and/or does not offer an advantage over existing practices, clinicians are less likely to adopt it.<sup>16,27,34,39,40</sup> And thus, careful attention to users’ perceptions of and reactions to an innovation’s attributes may lead to better design and improved integration into care delivery.

An innovation’s diffusion within a social system, such as a patient care unit, is influenced by communication among members.<sup>37</sup> Negative providers’ perceptions may create implementation issues, a significant challenge when newly developed technology undergo clinical trial effectiveness evaluation. For example, Kappen et al’s study of a newly

developed predictive screening tool recommending a pre-emptive approach to postanesthesia nausea and vomiting, found that clinicians’ preference for their usual, trusted treatment lead to failure to use the screening tool data, actions that may have contributed to the study’s null findings.<sup>26,27</sup> Among studies of surgical safety checklists and innovative surgical procedures, conflict between new and existing processes led clinicians to deviate from best practice<sup>16,34</sup> or abandon the new surgical procedure altogether.<sup>41</sup> Clinicians’ willingness to trial a newly developed innovation is a critical component of efficacy studies, predominant technology implementation strategies (classroom training, protocols) may be inappropriate because the technology lacks evidence of best use in practice.

**Methods**

**Study Design**

This study employed a cross-sectional qualitative descriptive design using individual interviews collected from an academic NICU in central Virginia.<sup>42</sup> Participants were recruited through a convenience sampling strategy that included any point of care clinician (registered nurse, respiratory therapist, nurse practitioner, attending physician) who worked in the unit and were exposed to the HeRO display monitoring for any period of time. There were no exclusion criteria.

**Setting**

UVA Health System is a regional academic medical center located in Charlottesville, Virginia, United States. UVA’s NICU was involved in the HeRO clinical trial from April 2004 to May 2010. At the time of the trial, this 45-bed, level IV NICU admitted approximately 600 neonates annually and was organized into 8 sections, or pods of 6 to 9 beds each.

**Participants**

Following permission from the UVA NICU medical director, NICU members (nurses, nurse practitioners, and resident, fellow, and attending physicians) were contacted by email inviting participation in a qualitative study of medical decisionmaking using HeRO. A follow-up email was sent 2weeks later. Respondents were scheduled for in-person or telephonic semistructured interviews during January and February 2012. Consent was obtained from each participant at the

**Table 1** Innovation characteristics defined<sup>a</sup>

Complexity	Degree to which an innovation is perceived as difficult to understand and use; complexity can be reduced by practical experience and demonstration, or adopted piecemeal (p. 596)
Compatibility	Degree to which an innovation is perceived as consistent with existing values, past experiences, and needs of potential adopters (p. 596)
Trialability	Degree to which an innovation may be experimented with on a limited basis; reduces risk (p. 596)
Observability	Degree to which the results of an innovation are visible to others; results are visible; stimulates peer discussion of a new idea (p. 596)
Relative advantage	Degree to which an innovation is perceived as better than the one it supersedes; can be measured in economic terms, social prestige, convenience, satisfaction (p. 595)

<sup>a</sup>Rogers, E. Diffusion of Innovations.5th ed. New York: Free Press; 2003.

time of the interview. The study received ethics approval (UVA Institutional review board- SBS #2015-0352).

### Data Collection

Following an interview guide (→Appendix A), semistructured interviews with open-ended questions were conducted in-person and telephonically, audio recorded, transcribed verbatim, and imported into ATLAS.ti (Scientific Software Development GmbH, Berlin, Germany). These data were not subsequently analyzed due to study staff turnover.

### Data Analysis

Because these data were collected to answer a different research question, R.A., R.K., C.L., and J.M. read five interviews (registered nurse, nurse practitioner, resident, fellow, and attending) to determine if appropriate data existed to answer study aims.<sup>43,44</sup> Due to the open-ended nature of the questions and the topics covered in the interview guide, this preliminary review found descriptions of participants' perceptions of HeRO, interactions with HeRO, and use of HeRO data in practice.

Informed by the desire to understand NICU clinicians' perceptions of HeRO and the relationship between perceptions and subsequent adoption of HeRO, the team developed four broad a priori codes to explore how clinicians first became aware of HeRO (awareness); learned to interpret HeRO data (interpretation); used HeRO (use); and how HeRO data guided care decisions and actions (decision-making and action).<sup>45</sup> The team then read a subset of interviews and identified additional codes to capture contextual information about professional roles and routines, and care responsibilities. Following code and code definition agreement, the teams were divided into pairs to conduct descriptive analysis using the full code book. Each interview was read in its entirety by both coders, and then in a second reading, codes were applied to text segments. Coding pairs conducted code agreement meetings at two separate times during the coding process. The entire team met on a weekly basis to review code level text segments, evolving memos, and emerging themes. Guided by Miles et al.,<sup>46</sup> text segments were abstracted for each code into matrices as matrices facilitate sorting and grouping segments to identify themes informed by DOI's five innovation attributes. The team frequently returned to original material to uncover assumptions and explore alternate hypotheses. The team used four strategies to enhance trustworthiness: (1) multiple team members coded the same interview data with cross-validation of code use; (2) assumptions and questions about the data were captured in memos and reviewed with the team; (3) all aspects of the study design were open for review by the members of the research team; and (4) all members used ATLAS.ti to provide an audit trail.<sup>46</sup>

## Results

The 22 participants represented a cross-section of healthcare professionals: registered nurses ( $n = 3$ ), nurse practitioners ( $n = 3$ ), resident physicians ( $n = 3$ ), neonatology fellows ( $n = 4$ ), and neonatology attending physicians ( $n = 7$ ). Participants ranged in professional experience from 2 to 30 years

and worked in the UVA NICU between 1 month and 15 years. Seven participants were employed at the inception of the clinical trial, seven joined during the clinical trial, and six joined after the trial concluded. No participants were members of the UVA research team. Participants' perceptions of HeRO are organized according to the five DOI innovation attributes (complexity, compatibility, trialability, observability, relative advantage) (→Table 2).<sup>37</sup>

### Complexity

Innovations that are easily understood and used, can be learned incrementally, or can be experimented with are more likely to be adopted.<sup>37</sup> At clinical trial inception, participants ( $n = 9$ ) reported receiving a brief presentation provided by a member of the HeRO research team. This presentation described the monitor's function and score meaning: the fold-increased risk that a neonate will develop sepsis in the next 24 hours. Although participants received initial information about the display and score, participants did not know whether a changing score should drive clinical decision making or whether it should merely contribute to overall clinical impressions. A neonatology fellow reflected on the introduction of technology into care, suggesting that use may take more than simply understanding how predictive data are calculated and what the data represents: "Until somebody says to you and takes you by the hand...this is how to approach these screens; these are the questions you can answer with this technology, I won't use it just cause it's there."

Prior to HeRO's introduction, users were accustomed to making care decisions based on physiologic data that provided information on the neonate's current status (i.e., respiratory rate, heart rate, laboratory values, etc.). Because this was the first application of HeRO in a clinical environment, participants had no experience with HeRO scores or their association with patient symptoms. Neither could participants rely on other members of the care team to help them learn about or use HeRO. This lack of experience may have negatively affected initial engagement with HeRO data. In fact, the lack of use was pervasive across the entire care team. It appears that participants' initial engagement with the data was not influenced by knowledge about HeRO provided when the monitors were installed or by the monitors' presence on the unit.

### Compatibility

Innovations that align with users' values, needs, or past experiences are more likely to be adopted.<sup>33,34,37</sup> Clinicians noted that the location of HeRO differed from the location of other devices they used in day-to-day care delivery. Physiologic monitors that displayed heart and respiratory rates, oxygenation, blood pressure, etc., resided at each neonate's bedside. The single HeRO display was centrally located in each pod. To see the data, clinicians describe the need to move away from the bedside, stand on "tippy toes," or to walk to the monitor. Thus, physical location may have deterred routine engagement with HeRO.

The research team and unit managers agreed to undertake initial steps to increase participant attention to the HeRO

**Table 2** Select quotations related to DOI innovation attributes

Complexity	
Location	“It’s very different pod by pod. I think that it sometimes can be kind of hard to see since especially if you’re going to a—you go to a bedside, you hear all the things and you say, “Oh, what’s the HeRO score?” Either they haven’t looked or you’re trying to look and sometimes if you’re [in] the middle of B pod you’re trying to stand on tippy toes and look through the glass or around the corner or something and see, and count of beds so that you can kind of see what the HeRO score is from a distance and it’s kind of hard to do.” (Attending)
	“The nurses weren’t focusing on it. The residents really didn’t know much about it. [Research team] realized that there were times when the HeRO score was just getting ignored.” (Attending)
Understanding	“Until somebody says to you and takes you by the hand...this is how to approach these screens; these are the questions you can answer with this technology, I won’t use it just cause it’s there.” (Fellow)
	“As long as I understand what it’s there for and I understand how it works, that it’s been well-taught and that there’s some evidence behind its use, then I’m all for it. I think if it’s been well-explained I can latch onto things pretty quickly as long as I get to play with it a little bit before it has to be on a real patient, if I get to really sort of see it in action or whatever.” (RN) **cotheme: Trialability
	“Cause we’ve seen the results. That frequently the blood cultures will come back positive. The baby did have an infection. Particularly when the study was going on and you’d have babies that were blinded that weren’t on the Hero you wished, when they showed signs of infection. You wished you could’ve seen what the Hero was doing there, because you just knew it would’ve gone up. So, I feel like we have certainly seen that it does seem have a predictive value.” (RN)
	“For example, like I said, the fact that Hero is on a wall and I can scan nine patients and pretty much instantly know what’s going on, that, to me, is a testament to the power of the graphic, versus the fact that I can go into Epic and find it but the visualization process is different.” (Fellow)
Compatibility	
Care tasks	“Initially, our physician group wanted nursing staff to begin to just document that number. I (said) You are delegating a responsibility of observing a numerical trend, but you have not provided any direction as to what constitutes need for a response. Until you can articulate that to the nursing staff, the nursing staff cannot assume accountability without knowing what your response algorithm is. I think they, as a team, determined what those parameters would be for response.” (RN)
	“Then the nurses were told if the HeRO score goes up by a certain amount they need to alert a clinician—a nurse practitioner, or a resident, or a fellow, or an attending.” (Attending)
	“...routine care involves vital signs every so many hours, depending upon your patient population, and the HeRO score is a part of vital signs monitoring.” (RN)
	“It actually now appears automatically. There’s a way to automatically get it put into the progress note. Even just in the last six months when I’ve been rounding with Epic, I’ve noticed that the residents are much more aware of what the HeRO score is and what it means than they were three years ago.” (Attending)
Communication	“We actually had the fellows responsible for reviewing the HeRO trending overnight so they would know what might have transpired with the baby’s monitoring overnight. So that would be part of their presentation. Even if it’s the matter of the HeRO remains below two they were looking at it.” (Attending)
	“You know, I’m trying to think of who doesn’t use it. We’re a pretty—it’s pretty engrained in our practice at this point that everybody, even in our report as nurses when we hand off, will make a comment; HeRO stable or HeRO went up overnight, but this is what we’re doing about it. So I really can’t talk to very many instances where it hasn’t come up.” RN
Trialability	
Clinical reasoning	“...especially at the beginning when it was over two we were doing a full blown workup, I felt like there was a lot of unnecessary workups. That just in itself predisposes the baby to—you stick in a catheter in their urethra, you probably—a little bit more prone to bladder infections then.” (Nurse Practitioner)
	“On call at night when there’s a kid that’s not doing well, we have some suspicion of sepsis, the nurse practitioners or the fellows would take a look at the HeRO monitors. Then we’d talk a little bit about what the significance of those numbers were and whether or not that push[es] us one way or another in our decision making.” (Resident)
	“It’s something that if I go to them [physicians] with the information and say, there’s been a change in the HeRO score that draws their attention to it. They’ll look on that and try and incorporate that as one more piece of the puzzle in trying to make their decisions.” (RN)
	“Then there are some babies where they might do one little odd thing or something that’s maybe a little bit concerning but it’s only the one event. Then you go back and you look at the HeRO score and say, well, did it go up?” (Attending)

(Continued)

Table 2 (Continued)

	<p>“What [HeRO’s] really done is shown me that I think putting both together, using HeRO score and something else is a lot more predictive, or it guides my care and my decision making more so.” (Attending)</p> <p>It has shown that it [HeRO] makes a difference, and we obviously believe in it strongly here, so we pay attention when the HeRO goes about two. We don’t necessarily-and if it’s just a HeRO, then we get a CBC, but if there’s more clinical symptoms that are correlating with the HeRO then we go ahead and do blood and urine and potentially start antibiotics” (Nurse Practitioner)</p>
Observability	
	“We’ve all learned about it from the same attendings and fellows and nurse practitioners, so if you learn something from the same people, I think your practice with it tends to be at least similar.” (Resident)
	“[Attendings] spent some time explaining to me what it is, how it works, how you can look at it...so, just learning in which clinical aspects would you do this versus that I’ve learned from the attendings.” (Fellow)
	“Nobody really explained it. I learned about it from just the routine of once in a while people would go and check on it (HeRO score), or a nurse would say, oh, the HeRO score’s up, and I’d be like, ah, what does that mean? I don’t know. What’s a HeRO score? Then just from being there, gradually I picked up that it was about heart rate variability.” (Fellow)
	“The HeRO score is a part of vital signs monitoring. So the ability to critically analyze that for a new hire is supported by an experienced nurse helping [them] along the way to interpret that.” (RN)
	“When nurses are brought into our unit, if they’re a novice new grad, they get six months of a precepted orientation. So that means, they are paired with a person. At the very beginning, routine care involves vital signs every so many hours, depending upon your patient population, and the HeRO score is a part of vital signs monitoring.” (RN)
Relative advantage	
Supports clinical judgment	“The vital signs of the baby, as far as monitors go. Hero is helpful sometimes. But lots of times I feel that the baby tells you first. Especially after having a good bit of experience, the Hero can kinda help back up your feeling that the baby’s getting sick. But at this point I can kind of get a feeling.” (RN)
	“...it can always kind of help out my case I think. If I think that a baby who ... is becoming ill, or he needs respiratory support further than what he’s already on. I can kind of grab the docs and be like; this is what I’m seeing. Oh by the way the Hero score is up. Then that kind of helps them say, oh okay well let’s go ahead and get septic work, or whatever needs to be done.” (RN)
	“I think it’s just another thing to add to their [RN] story to get me concerned...I think that’s reasonable but then that prompts us to go in and investigate it.” (Fellow)
Surveillance	“...one of the things that it’s [HeRO Score] done is both shown how something that’s non-invasive that can be active all the time can be helpful.” (Attending)
	“...I’m giving tours at the NICU to families and they’re worried about their baby hooked up to these monitors—what’s reassuring to some of them is saying “Here is the monitor, here are all the numbers we’re looking at and we’re getting data on your baby. I’m not even touching your baby. I’m not poking or prodding your baby. I can see what the heart rate is, I can see what the respiratory pattern is, see what the blood pressure is, ... we have all these methods of evaluating your baby without having to wake the baby up and take a blood sample. I think the HeRO is one of those ways that we can assess the baby without hurting the baby so to speak.an advantage is not hurting the baby.” (RN)
	“There really was not anything like Hero that they used before in terms of its predictive quality. the only close comparison is a human caregiver having an instinct that something MIGHT happen.” (Fellow)
Evidence base	“I know there has been a recent review in [journal] by [doctor]. I have not had a chance to read that. But we talk about HeRO all the time. Before they present some data in big national meetings.” (Attending)
	“[The published study] has shown that it makes a difference, and we obviously believe in it strongly here, so we pay attention when the HeRO goes above two.” (Nurse Practitioner)
	“We’re always proud to say it’s the biggest randomized clinical trial of very low birth weight infants ever with 3,000 patients. The fact that that showed mortality reduction, I mean there’s really not much that reduces mortality in preemies.” (Attending)

Abbreviations: CBC, complete blood count; DOI, Diffusion of Innovation; HeRO, heart rate observation; NICU, neonatal intensive care unit; RN, Registered Nurse.

score, yet refrained from requesting specific care interventions in response to the data. Participants described strategies that align with or were compatible with routine care practices. Nurses were instructed to record the score every 4 hours and

alert nurse practitioners and physicians if the score reached two or increased by two. Fellows were required to observe and report on score trends and care actions during morning patient rounds. These strategies appear to have influenced participant

behavior as noted by one nurse practitioner, “Having the nurses writing it down was key to us being successful in reacting appropriately to the spikes and so forth as they happen. I think that was a turning point.”

At first, nurses documented HeRO data on the paper vital signs flow sheet, then later in the electronic health record. Similarities between HeRO and vital signs collection pattern (every 4 hours) or its documentation in close proximity to vital signs data eventually caused nurses to view HeRO as a vital sign. Prior to these requirements, HeRO data did not have a place in the routine assessment, documentation, or daily conversations about patients. Overtime, data collection and communication became embedded in care routines and team interactions.

### **Trialability**

The trialability, or the ability of participants to experiment<sup>37</sup> with HeRO during the RCT, allowed for a more nuanced understanding of the application to develop over the course of the study. Several attendings and nurse practitioners observed that initial reactions to rising HeRO scores may have led to unnecessary testing due to inexperience. “... especially at the beginning when it [HeRO Score] was over two we were doing a full blown workup, I felt like there was a lot of unnecessary workups” (nurse practitioner). They attribute this perception to inexperience with HeRO as well as clinical inexperience among some team members.

The clinical team eventually learned that a score of two or a rise of two did not necessarily mean that a neonate had sepsis. Through documentation and data presentation during patient rounds, HeRO data became integrated as a component of the overall dataset routinely used in care decision making. Further, participants eventually learned that not all neonates with rising HeRO scores would develop sepsis. As they gained experience, participants developed critical judgment about the relationship between HeRO scores and signs to guide when to undertake diagnostic testing and treatment. Over time, participants came to rely on the score to help them understand uncertain emerging symptoms and used HeRO in ongoing communication and decision making about next care interventions.

### **Observability**

The more readily a user can see or observe the results of using an innovation, the more likely it will be adopted.<sup>37</sup> Members of the NICU also learned how to interpret and react to HeRO data by observing the practices of more experienced clinicians. Less experienced clinicians observed if and how senior participants used HeRO data. “[Attending] spent some time explaining to me what it is, how it works, how you can look at it...so, just learning in which clinical aspects would you do this versus that I’ve learned from the attendings” (fellow). Less experienced participants appear to have benefited most when senior members shared how they use HeRO data in care decision making. Both less experienced as well new members of the NICU reported observing the practices of experienced participants to figure out how to interpret and use HeRO data in care delivery.

### **Relative Advantage**

Observable, substantiated advantage of an innovative and newly introduced technology is seen as a pivotal attribute for influencing its adoption.<sup>37</sup> In the case of HeRO, there was no evidence base or even experienced participants upon whom the NICU team could rely. Through interaction with the data and observation of neonatal symptoms and outcomes, HeRO data served different purposes for different types of participants. For example, the data confirmed nurses’ emerging clinical impressions and helped nurses determine when to share their observations to other members of the care team. Physicians came to expect nurses to use HeRO data when communicating about a patient’s status. The inclusion of HeRO data in nurses’ communication about patients seemed to serve as a trigger for physician team members because this may have prompted patient assessment or closer examination of patient data. Over time, participants recognized the benefit of noninvasive, continuous monitoring.

As evidence from the RCT emerged, NICU clinicians identified themselves as contributors to a significant improvement in neonatal care delivery. RCT findings may also have served to reinforce that participants made the correct decision to use HeRO in care delivery as it implies that use has scientific merit.

### **Discussion**

This study examined NICU clinicians’ perceptions of a predictive analytics monitoring technology following the conclusion of the RCT establishing its efficacy. In light of the novel nature of HeRO, evidence of effectiveness as well as guidance for its application in care delivery was limited.<sup>28,47</sup> Use of prediction in care delivery often requires a balance between the benefits and risk of taking action. Consistent with DOI research, study results suggest that HeRO’s attributes were key to influencing its use in the NICU. The findings highlight participants’ initial reaction to HeRO, the effect of minimal prompts on participant engagement with HeRO data, how the care team learned to interpret and use HeRO to guide care decisions, and how the benefits, or relative advantage, of HeRO data emerged over time with experience.

### **Reduce Complexity: Provide Simple Guidelines for Engaging with HeRO**

Knowledge about the usefulness of an innovation may not be sufficient to promote an innovation’s use. Although sepsis remains a significant cause of death for neonates, the presence of HeRO in relative proximity to the bedside was insufficient to promote use among study participants. Prior research indicates that if an innovation is difficult to use or understand, adoption may occur slowly or not at all.<sup>26,48</sup> Because HeRO provided an early alert for the increasing potential for sepsis, but was not a definitive test for sepsis, participants may have had difficulty knowing if and when an increasing HeRO score warranted medical action. Combined with the physical location of HeRO, difficulty interpreting the score in the context of care delivery may have been a

contributing factor for the initial lack of attention. Simple, mandated interaction with the data, such as documenting and communicating, increased both written and verbal visibility and was seen by study participants as a turning point. Further, guidelines for when to report score changes, a “call out” procedure, likely reduced nurse uncertainty or worry about raising false alarms and engaged several types of care providers in the evaluation of HeRO trends and patient status. Call out procedures, a type of decision aid, are associated with effective clinician communication, early care intervention,<sup>49</sup> and reduced mortality among hospitalized patients.<sup>50</sup> However, several participants expressed concern that initial reactions to HeRO led to unnecessary sepsis work-ups. The RCT did note a nonsignificant increase in blood cultures and antibiotics<sup>29</sup>; it may be that the concern voiced by more experienced clinicians actually curtailed overreaction to rising HeRO scores. Decision aids, such as the one described in our study, may promote engagement, while avoiding mandated care actions and may provide a more effective means of introducing predictive analytics technologies into complex healthcare settings.

#### **Enhance Compatibility: Align HeRO-Related Tasks with Existing Clinician Experience**

Studies note that congruence, or compatibility, with user norms, values, and experiences increases the likelihood of adoption.<sup>36,51</sup> In this study, nurses were asked to document the HeRO score every 4 hours, a pattern and task nurses routinely perform. Fellows were tasked with observing HeRO trends and reporting their observations as a component of their daily patient presentation to the care team. Through documentation, HeRO data were in the same medical record location as other relevant clinical data (e.g., heart and respiratory rate) that, in turn, may have influenced clinician perspective perhaps because it overcame the misalignment between HeRO's location on the unit when compared with other physiologic devices. Over time, HeRO data gained credibility and were eventually viewed as another vital sign that became a component of care communication and decision making. Thus, defining HeRO as a vital sign connected the innovation to existing clinician practice and understanding of physiologic data.<sup>52</sup>

#### **Foster Trialability: Promote Observation and Association**

Users desire the opportunity to trial an innovation because it lessens uncertainty, promotes trust, and may confirm the benefits of using an innovation.<sup>37,53</sup> Further, seeking feedback from users' trial experiences may provide opportunities to improve functionality.<sup>54</sup> HeRO may be a particularly difficult technology with which to experiment because scores rise as much as 24 hours in advance of symptom presentation.<sup>55</sup> Thus, early forecast of sepsis may be incongruent with clinical assessment. Yet, it appears that clinicians engaged in a form of trialability. Through active evaluation of HeRO trends, emerging signs, and neonates' responses to care actions, clinicians made sense of HeRO and developed judgment about when to wait, undertake further

testing, or initiate treatment.<sup>56</sup> This finding suggests that developing learning cases may provide opportunities to trail clinical decision making by allowing clinicians to look back over time, explore patterns, and associated care actions as well as neonates' responses.<sup>57</sup> This may be particularly important for patients who exhibit a high degree of score variability and present an uncertain clinical picture. Further, deliberation about HeRO data in conjunction with patient signs often took place among a few collaborating clinicians, thus the larger NICU community missed the opportunity for collective learning, a situation that may be improved by consistent use of learning cases.

#### **Increase Observability: Respected Leaders Provide Meaningful Examples**

During their training, residents work with attendings from different clinical specialties. Study attendings integrated HeRO into their education practices including one-on-one mentoring, conducting patient rounds, demonstrating clinical reasoning, and providing formalized classes. Resident and fellow participants noted that they valued “hearing” attendings' cognitive processing of HeRO data and indicated that they followed attendings' examples. In addition to participation in patient rounds, nurses learning took the form of orientation, one-on-one work with a nurse preceptor, and protocolized tasks. Direct observation of respected, successful “other's” innovation use is associated with increased likelihood of adoption.<sup>53</sup> Although not planned, attendings served as champions, key individuals who supported the innovation through observable HeRO use and verbalization about HeRO within clinical reasoning. Formally assigning HeRO data collection and communication tasks to fellows and nurses may have implied that attendings and senior nurses valued HeRO data.<sup>53</sup> Unlike technology training methods that move clinicians to the classroom and separate the professions, senior clinicians served as role models and provided HeRO training and learning within the context of care.<sup>58</sup>

#### **Demonstrate Relative Advantage: Experience and Evidence**

Through continued use, HeRO was eventually viewed as advantageous to clinicians' care communication and decision making. Studies identify relative advantage, defined as an innovation's benefit to the user, as an essential innovation attribute linked to adoption.<sup>53,59</sup> In the absence of firm evidence of benefit (e.g., monetary, quality, efficiency, satisfaction), uptake of innovations is prolonged.<sup>60</sup> In the case of HeRO, relative advantage had not yet been established, thus clinicians had to discover the advantage as they worked with and learned about HeRO. Fitzgerald et al suggest that in medical contexts ambiguous new scientific knowledge is socially mediated, meaning that an innovation's benefits are established through use and ongoing dialog between clinicians.<sup>61</sup> In this study, social mediation occurred through the use of call out procedures, daily patient rounds, and clinicians' day-to-day collaborative clinical reasoning. HeRO data provided evidence to support emerging clinical



impressions that nurses communicated to providers. Physicians and nurse practitioners came to expect nurses to use HeRO data as evidence of clinical concern. Clinicians came to value the noninvasive nature of HeRO as it provided continuous monitoring without the pain or risk of infection associated with laboratory testing. Positive clinical trial results may have served as a form of affirmation. Since evidence of effectiveness influences clinician willingness to use prediction in practice, frequent review of case examples may provide sufficient evidence to promote initial clinician engagement with new innovations such as HeRO.

### Strengths and Limitations

Study limitations include generalizability, strong interest in HeRO at UVA, small sample size, and recall bias. While selecting participants from a single hospital unit limits generalizability, this unit's extensive experience with HeRO allowed us to explore the experience of implementing a newly developed technology. Our participants were the first to be recruited into the RCT, the first to encounter HeRO data and knowledge in the care environment, and therefore, had the greatest experiences to share with the study team. Although our sample was small, it represented a cross-section of professions, neonatal experience, tenure on unit, and experience with HeRO. Due to the wide variation in experience with HeRO, we achieved thematic saturation only in terms of HeRO use in clinical decisionmaking: HeRO was a "piece of the puzzle," on data point among many considered when developing a medical course of action. Because participant interviews took place a year following the conclusion of the clinical trial, participant data were at risk for recall bias. However, we found consistent descriptions of the original implementation; the strategies unit managers first established; as well as how members learned through role modeling and dialog across participants. A next step to understanding the use of HeRO in hospitals might include direct observation of care team actions. Finally, this study examined a single type of prediction, sepsis, a particularly persistent, devastating illness. Future research efforts should consider evaluating other types of negative patient experiences, such as hemorrhage, where early intervention is associated with improved survival.

### Conclusion

Other than a handful of prediction studies, the majority focused on model development and validation, therefore there is little evidence to guide integrating predictive data into providers' care routines.<sup>11,27</sup> Tools such as the Acute Physiology and Chronic Health Evaluation, are typically used to benchmark ICU quality and not alert providers to patient decline.<sup>11</sup> Further, there is little evidence to guide interventions to promote clinician acceptance and use of predictive technologies as the majority of studies focus upon model development and accuracy, not on providers' acceptance of prediction as an element of care decision making.<sup>9,11,14,62,63</sup> Because the success of predictive technologies such as HeRO rely on the human system for interpretation and action,<sup>26,49,64</sup> processes to build human

capacity to interpret predictive data in the context of clinical reasoning are essential. Simple strategies designed to engage clinicians' attention and promote data communication may be foundational to helping clinicians to learn how to effectively use new tools in care delivery.

### Multiple Choice Questions

1. What attributes of an innovation influence user adoption?
  - a. Relative advantage, trialability, observation, accountability, complexity.
  - b. Observation, relative advantage, sustainability, complexity, compatibility.
  - c. Complexity, compatibility, observation, trialability, relative advantage.
  - d. Affordability, relative advantage, observation, trialability, complexity.

**Correct Answer:** The correct answer is option c. Although there is no order or ranking, the five DOI theory innovation attributes include complexity, compatibility, observation, trialability, and relative advantage.

2. When implementing new technology into health care settings, what strategy would most likely promote its use in care delivery?
  - a. Training classes scheduled to meet the needs of varying shifts.
  - b. Reminder emails that included best practice materials.
  - c. Integration into existing data collection, documentation and communication.
  - d. Vendor provided online tutorials that includes case examples.

**Correct Answer:** The correct answer is option c. In general, integration into workflow is essential for implementation of any kind of technology, evidenced-based practice, or care protocol. While other options provide knowledge about an innovation, integration provides opportunities to develop skills.

### Authors' Contributions

C.L., J.R.M., R.A., R.K., and R.T. developed the study design. R.T. conducted participant interviews. A.V., C.L., R.A., R.K., S.K., and T.Y. lead the application of the theoretical framework. Data analysis was conducted by A.S.-W., A.V., C.K., C.M., J.K.-M., R.A., R.K., S.K., and T.Y. Drafts of the manuscript were prepared by A.S.-W., A.V., B.S., C.L., J.K.-M., J.R.M., R.A., R.K., S.K., and T.Y. All authors read and approved the final manuscript.

### Protection of Human and Animal Subjects

Ethics approval was obtained from the University of Virginia IRB-SBS #2015-0352. Procedures included participant consent to participate.

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#### Conflict of Interest

J.R. Moorman has equity and is Chief Medical Officer of Advanced Medical Predictive Devices, Diagnostics and Displays, which has licensed technology for the University of Virginia related to predictive monitoring. Funding support (R. Anderson, C. Lindberg, and R. Kitzmiller) for the project provided by the MITRE Corporation. The MITRE Corporation operates the Centers for Medicare & Medicaid Services (CMS's) Alliance to Modernize Healthcare (CAMH), a federally funded research and development (FFRDC) dedicated to strengthening the nation's health care system. The MITRE Corporation operates CAMH in partnership with CMS and the Department of Health and Human Services. Additional funding support for R. Kitzmiller's salary came from National Center for Advancing Translational Sciences, National Institutes of Health (KL2TR001109), and for J. Keim-Malpass' salary from a University of Virginia Translational Health Research Institute of Virginia (THRIV) Scholars award. The remaining authors declare that they have no competing interests.

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## Appendix A Semistructured interview guide

Date:	
Profession	MD-Attending; MD-Fellow; MD-Resident Medical Student; Nurse Practitioner; Registered Nurse
How long have you been a [physician, nurse, student]?	
How long have you worked in the neonatal intensive care unit (NICU)?	
Please describe your routine on a typical day in the NICU. When you walk up to a baby, what do you do to assess the situation? What's the very first thing that you physically do?	
There are a lot of devices and data displayed in the NICU, which ones do you pay the most attention to? What kind of information do you get from them?	
If a new piece of equipment arrived in the NICU, how would you integrate a new approach into your practice of taking care of infants?	
Do you feel there are any personal obstacles that could prevent you from incorporating a new approach into your practice?	
Can you tell me a little bit about when and how you were introduced to the HeRO monitor? Do you remember when you were introduced to the HeRO monitor and how that took place? How did you learn to use the data available through the HeRO monitor? Since you were first introduced to the HeRO monitor, how do new members of the care team learn about HeRO?	
How does HeRO play a role in your practice? What information do you get from HeRO? What role does HeRO play in terms of all the other monitor information you use?	
Does the literature on the HeRO monitor currently, or when you first were introduced to it, inform your practice?	
Is there anything else you would like to tell me about your practice when it comes to the HeRO monitor?	
Would you share your observations about how other members of the NICU healthcare team use HeRO? Is there a difference in how they use it? Do you find that certain members of the team look more at the trend compared with the absolute value? HeRO data are presented or used differently by the nurses compared with nurse practitioners? Do parents provide any information about HeRO scores?	