# Original Paper

# Integration of an Intensive Care Unit Visualization Dashboard (i-Dashboard) as a Platform to Facilitate Multidisciplinary Rounds: Cluster-Randomized Controlled Trial

Chao-Han Lai<sup>1,2,3</sup>, MD, PhD; Kai-Wen Li<sup>4</sup>, BSc; Fang-Wen Hu<sup>4</sup>, PhD; Pei-Fang Su<sup>5</sup>, PhD; I-Lin Hsu<sup>1</sup>, MD, PhD; Min-Hsin Huang<sup>1</sup>, MD, MSc; Yen-Ta Huang<sup>1</sup>, MD, PhD; Ping-Yen Liu<sup>6,7,8</sup>, MD, PhD; Meng-Ru Shen<sup>9,10</sup>, MD, PhD

### **Corresponding Author:**

Meng-Ru Shen, MD, PhD
Department of Obstetrics and Gynecology
National Cheng Kung University Hospital, College of Medicine
National Cheng Kung University
138, Sheng-Li Road
Tainan, 704
Taiwan

Phone: 886 062353535 ext 5505

Fax: 886 2766676

Email: mrshen@mail.ncku.edu.tw

# **Abstract**

**Background:** Multidisciplinary rounds (MDRs) are scheduled, patient-focused communication mechanisms among multidisciplinary providers in the intensive care unit (ICU).

**Objective:** *i*-Dashboard is a custom-developed visualization dashboard that supports (1) key information retrieval and reorganization, (2) time-series data, and (3) display on large touch screens during MDRs. This study aimed to evaluate the performance, including the efficiency of prerounding data gathering, communication accuracy, and information exchange, and clinical satisfaction of integrating *i*-Dashboard as a platform to facilitate MDRs.

**Methods:** A cluster-randomized controlled trial was performed in 2 surgical ICUs at a university hospital. Study participants included all multidisciplinary care team members. The performance and clinical satisfaction of *i*-Dashboard during MDRs were compared with those of the established electronic medical record (EMR) through direct observation and questionnaire surveys.

**Results:** Between April 26 and July 18, 2021, a total of 78 and 91 MDRs were performed with the established EMR and i-Dashboard, respectively. For prerounding data gathering, the median time was 10.4 (IQR 9.1-11.8) and 4.6 (IQR 3.5-5.8) minutes using the established EMR and i-Dashboard (P<.001), respectively. During MDRs, data misrepresentations were significantly less frequent with i-Dashboard (median 0, IQR 0-0) than with the established EMR (4, IQR 3-5; P<.001). Further, effective recommendations were significantly more frequent with i-Dashboard than with the established EMR (P<.001). The questionnaire



<sup>&</sup>lt;sup>1</sup>Department of Surgery, National Cheng Kung University Hospital, College of Medicine, National Cheng Kung University, Tainan City, Taiwan

<sup>&</sup>lt;sup>2</sup>Department of Biochemistry and Molecular Biology, College of Medicine, National Cheng Kung University, Tainan City, Taiwan

<sup>&</sup>lt;sup>3</sup>Department of Biostatistics, Vanderbilt University Medical Center, Nashville, TN, United States

<sup>&</sup>lt;sup>4</sup>Department of Nursing, National Cheng Kung University Hospital, College of Medicine, National Cheng Kung University, Tainan City, Taiwan

<sup>&</sup>lt;sup>5</sup>Department of Statistics, College of Management, National Cheng Kung University, Tainan City, Taiwan

<sup>&</sup>lt;sup>6</sup>Division of Cardiology, Department of Internal Medicine, National Cheng Kung University Hospital, College of Medicine, National Cheng Kung University, Tainan City, Taiwan

<sup>&</sup>lt;sup>7</sup>Institute of Clinical Medicine, College of Medicine, National Cheng Kung University, Tainan City, Taiwan

<sup>&</sup>lt;sup>8</sup>Department of Clinical Medical Research, National Cheng Kung University Hospital, College of Medicine, National Cheng Kung University, Tainan City, Taiwan

<sup>&</sup>lt;sup>9</sup>Department of Obstetrics and Gynecology, National Cheng Kung University Hospital, College of Medicine, National Cheng Kung University, Tainan, Taiwan

<sup>&</sup>lt;sup>10</sup>Department of Pharmacology, College of Medicine, National Cheng Kung University, Tainan City, Taiwan

results revealed that participants favored using *i*-Dashboard in association with the enhancement of care plan development and team participation during MDRs.

**Conclusions:** *i*-Dashboard increases efficiency in data gathering. Displaying *i*-Dashboard on large touch screens in MDRs may enhance communication accuracy, information exchange, and clinical satisfaction. The design concepts of *i*-Dashboard may help develop visualization dashboards that are more applicable for ICU MDRs.

Trial Registration: ClinicalTrials.gov NCT04845698; https://clinicaltrials.gov/ct2/show/NCT04845698

(J Med Internet Res 2022;24(5):e35981) doi: 10.2196/35981

#### **KEYWORDS**

Intensive care unit; multidisciplinary round; visualization dashboard; large screen; information management strategy; electronic health record; medical record; digital health; dashboard; i-Dashboard; electronic medical record; information exchange

# Introduction

Medical care in intensive care units (ICUs) consumes a substantial part of the income of many countries worldwide, and the enormous burden continues to grow [1,2]. Integrated multidisciplinary teamwork, a patient-centered model of care in which intensivists and other members from relevant disciplines provide critical care as a team, effectively complements intensivist care and improves outcomes for critically ill medical and surgical patients [3,4]. Multidisciplinary rounds (MDRs; also called interprofessional rounds) are mechanisms that involve scheduled discussion among multidisciplinary providers, including physicians, registered nurses, nurse practitioners (NPs), respiratory therapists (RTs), pharmacists, and dietitians, to review clinical information, exchange opinions, and develop a plan of care [5]. Because effective communication among providers is essential to high-quality patient care, failures during this process may potentially impact the safety and outcomes of ICU patients [5-7].

Understanding causes that potentially impede interdisciplinary communication during MDRs may facilitate improvement in the communication quality among multidisciplinary providers. Based on a systematic review of evidence-informed practices for ICU MDRs, poor retrieval of patient information has been identified as a barrier that hinders information exchange [5]. Currently, clinicians manually access patient information from disparate modules in information systems, and data aggregated into electronic medical record (EMR)-generated printouts or handwritten notes are verbalized in MDRs [8,9]. A recent study revealed that nearly 40% of verbalized laboratory data are inaccurately communicated during MDRs, and only 7.8% of data misrepresentations that precipitate erroneous clinical decisions can be detected [8].

One of the objectives of the technological advancements applied to critical care is simplifying all the avenues of information [10]. It appears that visualization dashboards (also called EMR viewers) have great potential to be the solution as these dashboards are known for the efficiency of clinical information management [9,11-13]. Notably, compared to the standard EMR environment, introducing visualization dashboards may not improve perceived satisfaction with MDRs, such as information presentation or team participation and communication [12]. A possible problem is that displaying dashboards on small

monitors positioned on a trolley or bedside computers may give unequal access to data and cause a body orientation shift of providers from other participants to monitors [14], thus potentially hampering interdisciplinary communication during MDRs. In addition, because of unequal EMR access for real-time data viewing to recognize errors and the inability to simultaneously listen, process, and verify data, the multidisciplinary care team relies disproportionately on the intensivist to detect data misrepresentations that potentially lead to medical errors [8]. In the era of rapid development of information technology, an integrated information management strategy to facilitate information retrieval and enhance interdisciplinary communication in MDRs remains to be explored.

In this study, we aimed to develop a user experience—oriented platform as an integrated solution to assist MDRs. The *i*-Dashboard is a care team—designed, patient-centered visualization dashboard in which information extracted from different sources was reorganized on the basis of the requirement of different disciplines or transformed into time-series data as needed. During MDRs, *i*-Dashboard is displayed on wall-mounted large touch screens to bring effective visualization to the multidisciplinary care team. We assumed that *i*-Dashboard might aid prerounding data gathering, and integrating *i*-Dashboard displayed on large touchscreens during MDRs might enhance interdisciplinary communication. Thus, the efficiency, communication accuracy, information exchange, and clinical satisfaction of integrating *i*-Dashboard as a platform to facilitate MDRs were evaluated.

# Methods

# **Design and Participants**

The study was conducted in a 1300-bed university hospital that offers first-line and tertiary referral services for a population of approximately 1.8 million individuals in southern Taiwan. A cluster-randomized controlled trial was conducted in 2 of the 4 surgical ICUs with 10 and 8 beds. The established EMR (control) and *i*-Dashboard (intervention) were randomly assigned as tools to facilitate prerounding information collection and MDRs in the 2 units and exchanged at 2-week intervals.

Before this trial, MDRs have been carried out in the study units for ~5 years. An integrated multidisciplinary care team is composed of at least 1 intensivist, a registered nurse, an NP, an RT, a pharmacist, and a dietitian. All these providers attend



MDRs held on a regular schedule 3 times a week. MDRs are conducted only for patients who stay for more than 7 days because patients receiving surgical ICU care for more than 7 days have a high rate of in-hospital mortality [15], and ~75% of patients have a length of stay for 7 days or less in study units.

#### **Ethical Considerations**

This study was registered with ClinicalTrials.gov (NCT04845698). The study protocol was approved by the institutional review board of National Cheng Kung University Hospital (B-ER-110-040). Informed consent was obtained from all participants in the study. This study is reported in accordance with the CONSORT-EHEALTH (Consolidated Standards of Reporting Trials of Electronic and Mobile HEalth Applications and onLine TeleHealth) checklist (Multimedia Appendix 1) [16].

### **Established EMR**

The established EMR environment applied in the ICU includes the Philips IntelliSpace Critical Care & Anesthesia information system (ICCA; Philips) and the Hospital Information System (HIS) developed by the institutional Department of Information Technology and its subsystems, including the Laboratory Information System (LIS) and the Picture Archiving and Communication System (PACS). Philips ICCA is an ICU-specific EMR system that provides information essential for critical care [17]. Patient data are organized by data category (demographics, vital signs, laboratory data, etc) in a series of tabs or window panels. The HIS supports text data key-in and patient order entry.

# Development and Architecture of i-Dashboard

This study evaluated the performance of the first version of *i*-Dashboard. The *i*-Dashboard (Advantech) was custom-developed under the guidance of multidisciplinary professionals, including physicians, registered nurses, NPs, RTs, pharmacists, and dietitians, rather than only physicians because information for MDRs needs may vary on the basis of the clinical role. Every health care provider working in the surgical ICU participated in developing *i*-Dashboard. Different professionals held preparatory meetings of their own. Before *i*-Dashboard was formally implemented for clinical use, the

structure and layout were repeatedly revised and tailored to achieve broad acceptance among directors of multidisciplinary providers in the ICU.

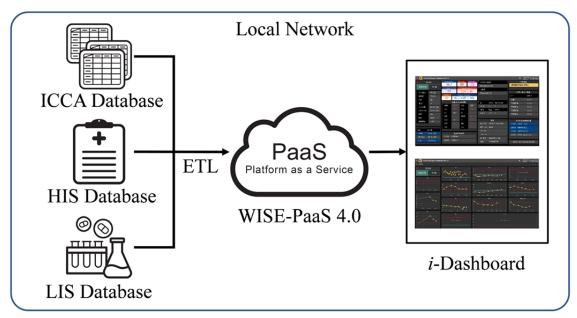
The architecture of *i*-Dashboard is summarized in Multimedia Appendix 2. In the static mode, the *i*-Dashboard was designed to substitute as a station whiteboard with lists of patients, information to aid emergency evacuation, and on-duty physicians, nurses, and NPs. Patient-level data in i-Dashboard were modified from the MDR checklist and digitally transformed. Therefore, data were preidentified and retrieved from different origins in the established EMR environment, especially ICCA. Instead of database-centered displays, these data were reorganized on the basis of the requirements of different professionals or disciplines to form dashboard pages (ie, an overview page and an RT-pharmacist-dietitian page) and element blocks. In addition to colored signaling for values outside the reference ranges, i-Dashboard was designed to support built-in automated calculation of severity scores (eg, Simplified Acute Physiology Score II and Sequential Organ Failure Assessment) and visualization of time-series data to expedite navigation of patient condition. Time-series data (eg, vital signs, laboratory data, or severity scores) that were transformed into line charts can be accessed through the hyperlinks located at the left upper corner of element blocks on the overview page. The pages of time-series data were designed to support both fixed (eg, last 24 hours or last 3 days) and relative custom time frames are available.

The technical details underlying *i*-Dashboard are summarized in Figure 1. We used a Windows 10 PC as the visualization platform to support *i*-dashboard. A K8s-based WISE-PaaS 4.0 platform (Advantech) facilitates the integration of diverse devices and communication protocols, making data exchange and system development agile. The entire platform was developed and deployed on 6 VMware servers, each with a 256-GB hard drive and 32-GB memory, and a 24-core Intel Xeon Gold 6248R 3.00 GHz processor. The servers received the data from the Philips ICCA, HIS, and LIS database servers.

In the study units, both the established EMR and *i*-Dashboard can be accessed through desktop computers with 17- or 22-inch monitors or mobile platforms.



Figure 1. Transfer of the IntelliSpace Critical Care & Anesthesia information system (ICCA), Hospital Information System (HIS), and Laboratory Information System (LIS) data to i-Dashboard. ETL: Extract-Transform-Load. PaaS: Platform as a Service. WISE-PaaS 4.0: brand name of the platform belonging to Advantech.



# **Prerounding Preparation and MDR With the** Established EMR

Prerounding data gathering and MDRs have long been standardized with a structured script for reporting (Multimedia Appendix 3). Without *i*-Dashboard, NPs accessed the established EMR systems, including ICCA, HIS, LIS, and PACS, for data gathering through desktop computers.

MDRs took place outside the patient rooms. To facilitate situation awareness of other participants, NPs delivered the oral case presentation and data communication based on the structured script, including basic information, catheter placement and their duration, vital signs, laboratory data, medications, input or output and nutrition, critical values, major image findings, consultations, and other major events (Multimedia Appendix 3). The intensivist summarized active problems, solicited feedback from nurses, RTs, pharmacists, and dietitians, and, if needed, provided in-depth knowledge on the pathophysiology of the current patient condition. The goals of care were documented.

#### Prerounding Preparation and MDRs With i-Dashboard

To ensure effective implementation of *i*-Dashboard, we prepared education materials (Multimedia Appendix 2) in the form of brief presentations for all the health care providers working in

study units. Subsequently, the use of *i*-Dashboard was tested consistently for 4 weeks.

As shown in Figure 2, *i*-Dashboard serves as a platform to facilitate MDRs. NPs accessed *i*-Dashboard for data gathering through desktop computers. Instead of ~20 geographically fragmented windows and panels in our established EMR systems, at-a-glance presentations of highly relevant information were displayed on *i*-Dashboard.

During MDRs, all MDR participants gathered in front of a 55-inch 4K interactive touch screen, approximately 3 m away with clear sightlines. The touch screen allowed users to enter different pages of *i*-Dashboard using the finger to tap hyperlinks. The *i*-Dashboard served as a visualization aid for exchanging information and opinions. With the overview page in i-Dashboard, the NP carried out patient presentation and data communication. The NP accessed time-series data (eg, laboratory data) through the hyperlinks on the overview page. Time-series data can be rearranged on the basis of different time frames as requested. In addition, the RT, pharmacist, and dietitian could take turns operating i-Dashboard and use the RT-pharmacist-dietitian page to demonstrate valuable information of their professionals. Finally, the intensivist used i-Dashboard to facilitate bedside teaching. The goals were documented after consensus was reached.



Figure 2. i-Dashboard as a platform to facilitate multidisciplinary rounds. (A) Data access through i-Dashboard on different devices (eg, desktop computers and mobile platforms). (B) i-Dashboard displayed on wall-mounted large touch screens as a visualization aid during multidisciplinary rounds.





#### **Data Collection**

Two NPs who were not directly involved in MDRs and patient care were trained to audit the processes. The 2 NPs have 8 and 6 years of ICU experience, respectively. The 2 observers were temporarily exempted from clinical work during the study period. To ensure adequate training in the study methodology, personnel piloted data collection and evaluation of communication accuracy were performed by the 2 observers and supervised by the senior investigator (CHL) during a 4-week run-in period. The 2 observers performed in-field observation and audio recordings and audited the process together using a standardized form (Multimedia Appendix 4) to reduce the possibility of losing any useful information and to ensure the correct assessment. Before MDRs, observers measured the amount of time for prerounding data gathering by the NP using the built-in stopwatch app on mobile phones. Subsequently, observers arrived before the start of MDRs and refrained from participating in the discussion during MDRs. Clinical characteristics of patients, information on patient disease severity, and therapeutic interventions during MDRs and established care plans were collected through EMR.

#### **Primary Outcomes**

Primary outcomes of interest included time of data gathering before MDRs and communication accuracy during MDRs. The amount of time that NPs spent gathering clinical data before rounding was recorded. Communication accuracy was evaluated on the basis of the items listed on the standardized form (Multimedia Appendix 4) through direct field observation and audio recordings. Spoken information was compared with EMR data captured by screenshots taken prior to patient presentations. Data communication, including laboratory and nonlaboratory data, was considered inaccurate (ie, data misrepresentation) when the values or data were not correctly reported. For laboratory data communication, only abnormal laboratory data points (outside the reference ranges) were assessed. Laboratory misrepresentations were further classified into several categories as previously defined [8], including omission, old data, pending results, misinterpretation, and erroneous values.

## **Secondary Outcomes**

Secondary outcomes included information exchange, using effective recommendations initiated by RTs, pharmacists, and

dietitians as an index, and clinical satisfaction on i-Dashboard. The recommendations initiated by RTs, pharmacists, and dietitians, as exemplified in Multimedia Appendix 5, were considered effective on the condition that they were successfully adopted into the care plan documented in the EMR. Clinical satisfaction with i-Dashboard as an information management tool was investigated using Likert scale-based questionnaires (Multimedia Appendix 6) from previously validated survey instruments with minor modifications [12]. Questionnaire 1 was designed to capture the perceived efficiency, accuracy, and safety of the established EMR and i-Dashboard was implemented when used to prepare for data gathering and to assist MDRs. The responses were grouped into four dimensions: task productivity, task innovation, customer satisfaction, and management control. Questionnaire 2 was designed to identify intention to use and personal impact of i-Dashboard as a result of i-Dashboard implementation. At the immediate end of the study, the 2 surveys were administered in hard copy form to study participants. Each participant responded only once.

# Sample Size Estimation and Statistical Analysis

Before the trial began, it was estimated that 12 MDRs would be observed per unit in a 2-week period. To estimate the required sample size, we used a cluster-randomized controlled trial design to account for the positive intraclass correlation expected among members of the same group or cluster. Observational pilot data for prerounding data gathering were collected. The results showed that the mean time difference between the use of the established EMR and i-Dashboard was 3 (variance 4) minutes. The intraclass correlation coefficient of this pilot study was 0.47. The corresponding estimations were treated as true parameters. Thus, enrolling approximately 144 patients during 24 unit-weeks would provide a power of 90% at a type I error rate of 0.05 to detect an intervention effect of 3 minutes between groups. Categorical variables were analyzed using the chi-square test or Fisher exact test as needed. Continuous variables and the Likert scale were analyzed using the Mann-Whitney *U* test. Statistical analyses were performed using R software (version 3.4.3; The R Foundation). A 2-tailed P value of <.05 was considered statistically significant.



# Results

# **Participants**

Between April 26 and July 18, 2021, there were 173 admissions

to the 2 study units. A total of 90 multidisciplinary providers (Table 1) participated in MDRs for the 25 individual patients (Table 2); 78 MDRs were performed with the established EMR environment, whereas 91 MDRs were performed with *i*-Dashboard (Figure 3).

Table 1. Characteristics of the 90 multidisciplinary providers.

Variable	Value, n (%)	
Sex		
Female	75 (83.3)	
Male	15 (16.7)	
Profession or discipline		
Physician	9 (10.0)	
Nurse practitioner	6 (6.7)	
Nurse	51 (56.7)	
Respiratory therapist	20 (22.2)	
Pharmacist	2 (2.2)	
Dietitian	2 (2.2)	
Intensive care unit experience (years)		
<1	3 (3.3)	
1-2	20 (22.3)	
3-4	15 (16.7)	
5-9	31 (34.4)	
>10	21 (23.3)	

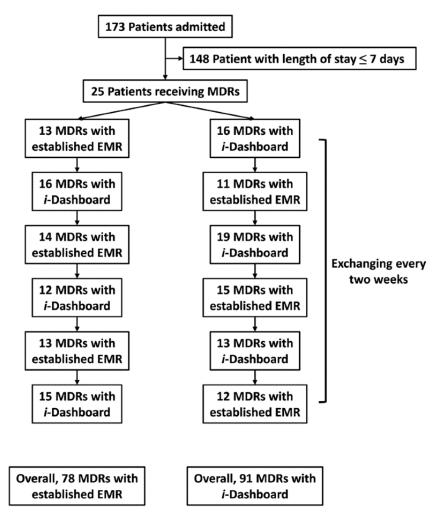


**Table 2.** Clinical characteristics of the 25 patients.

Variable	Value	
Age (years), median (IQR)	70 (58-73)	
Age distribution (years), n (%)		
<60	7 (28.0)	
60-79	17 (68.0)	
>80	1 (4.0)	
Sex, n (%)		
Female	11 (44.0)	
Male	14 (56.0)	
Specialty, n (%)		
General surgery	8 (32.0)	
Neurosurgery	11 (44.0)	
Cardiovascular surgery	5 (2.0)	
Trauma surgery	1 (4.0)	
Type of admission, n (%)		
Medical	10 (40.0)	
Scheduled surgical	7 (28.0)	
Unscheduled surgical	8 (32.0)	
Acute Physiology and Chronic Health Evaluation II	score on admission, n (%)	
<15	1 (4.0)	
15-34	21 (84.0)	
>35	3 (12.0)	
Mortality, n (%)	2 (8.0)	



Figure 3. Study flowchart. EMR: electronic medical record, MDR: multidisciplinary round.



# **Primary Outcomes**

Disease severity, in terms of severity scores, and therapeutic interventions at the day of MDRs were not different between the 2 groups (Table 3). The median time for prerounding data gathering was 10.4 (IQR 9.1-11.8) minutes and 4.6 (IQR 3.5-5.8) minutes per patient using the established EMR and i-Dashboard (P<.001; Table 3), respectively, indicating a reduction of 5.8 (95% CI 5.2-6.4) minutes when using i-Dashboard.

Regarding communication accuracy during MDRs (Table 3), data misrepresentations were significantly less frequent in MDRs

with *i*-Dashboard (median 0, IQR 0-0) than with the established EMR environment (median 4, IQR 3-5; *P*<.001). In addition, both laboratory and nonlaboratory data misrepresentations were reduced using *i*-Dashboard compared with the established EMR. Among audited laboratory results, only one misrepresentation (0.2%) occurred among 577 data points with *i*-Dashboard. In contrast, 163 (32.3%) misrepresentations occurred in 505 data points with the established EMR environment (*P*<.001), and the majority (95.1%) of these misrepresentations were omissions (155 data points).



Table 3. Disease severity and therapeutic intervention at the moment of MDRs and outcomes with the established EMR environment and i-Dashboard.

Variable	Established electronic medical record (n=78)	<i>i</i> -Dashboard (n=91)	P value
Severity scoring, median (IQR)			
Modified Early Warning Score	6 (5-8)	7 (5-8)	.95
Simplified Acute Physiology Score II	52 (39-61)	50 (42-62)	.92
Sequential Organ Failure Assessment	8 (5-11)	7 (4-11)	.57
Therapeutic Intervention Scoring System-28	35 (32-38)	33 (30-39)	.19
Therapeutic intervention, n (%)			
Mechanical ventilation	72 (92.3)	86 (94.5)	.56
Vasoactive drug support	18 (23.1)	32 (35.2)	.08
Mechanical support	3 (3.8)	0 (0)	.10
Total parenteral nutrition	29 (37.2)	30 (33.0)	.57
Complicated wound management	24 (30.8)	23 (25.3)	.43
Dialysis-requiring renal failure	11 (14.1)	13 (14.3)	.73
Outcome			
Time spent on data gathering (minutes), median (IQR)	10.4 (9.1-11.8)	4.6 (3.5-5.8)	<.001
Data misrepresentation, median (IQR)	4 (3-5)	0 (0-0)	<.001
Laboratory data	2 (1-3)	0 (0-0)	<.001
Nonlaboratory data	2 (1-3)	0 (0-0)	<.001
Effective recommendations, n (%)			<.001
0	16 (20.5)	15 (16.5)	
1	41 (52.6)	34 (37.4)	
2	18 (23.1)	25 (27.5)	
3	3 (3.8)	17 (18.7)	

# **Secondary Outcomes**

Regarding information exchange (Table 3), the proportions of 0 and 1 recommendations were lower in MDRs with i-Dashboard than with the established EMR, whereas the proportions of 2 and 3 recommendations were higher in MDRs with i-Dashboard than with the established EMR. The number of effective recommendations was significantly higher in MDRs with i-Dashboard than with the established EMR (P<.001).

A total of 76 health care providers (Table S1 in Multimedia Appendix 7) responded to the survey request of clinical satisfaction of *i*-Dashboard (response rate=84.4%). Grouping results of responses to Questionnaire 1 in term of task productivity, task innovation, customer satisfaction, and management control are shown in Table 4, and details are shown

in Table S2 in Multimedia Appendix 7. Grouping results revealed that *i*-Dashboard was superior to the established EMR in task productivity (mean 15.91, SD 2.28 vs 14.14, SD 2.35; P<.001). Further, *i*-Dashboard was superior to established EMR in task innovation (12.11, SD 1.92 vs 10.41, SD 1.97; P<.001), customer satisfaction (16.68, SD 2.02 vs 15.62, SD 2.27; P=.002), and management control (16.75, SD 2.21 vs 15.03, SD 2.30; P<.001). These findings suggest that *i*-Dashboard outperformed the established EMR across the 4 dimensions.

Finally, survey responses to questionnaire 2 (Table S3 in Multimedia Appendix 7) suggested that these participants were willing to use *i*-Dashboard continuously in association with the enhancement of situation awareness, care plan development, and team participation, and with a reduction in workload and complexity.



**Table 4.** Grouping results of responses to questionnaire 1 in terms of task productivity, task innovation, customer satisfaction, and management control (n=76).

Question	Established electronic medical record, mean (SD) <sup>a</sup>	<i>i</i> -Dashboard, mean (SD) <sup>a</sup>	P value
Task productivity	14.14 (2.35)	15.91 (2.28)	<.001
Q1 provides information catching up with condition changes.	3.68 (0.79)	4.17 (0.70)	
Q4. I get the information that I need in time using	3.82 (0.69)	4.12 (0.59)	
Q5. I get the information that I need using easily.	3.61 (0.80)	4.20 (0.69)	
Q9 makes data gathering difficult.	3.04 (0.93)	3.42 (1.04)	
Task innovation	10.41 (1.97)	12.11 (1.92)	<.001
Q10. Data gathering with was a mentally demanding task.	2.91 (1.00)	3.58 (1.07)	
Q14. Communication and opinion exchange in MDRs <sup>b</sup> is enhanced using	3.75 (0.77)	4.25 (0.66)	
Q15. Developing care plans relies on joint decisions by team members using	3.75 (0.73)	4.28 (0.65)	
<b>Customer satisfaction</b>	15.62 (2.27)	16.68 (2.02)	.002
Q2 provides information that meets my demand for following MDRs.	4.12 (0.63)	4.29 (0.61)	
Q3 provides me sufficient information for patient care.	4.00 (0.71)	4.16 (0.63)	
Q6. I am satisfied with the accuracy of the data using	3.87 (0.68)	4.03 (0.63)	
Q13 makes me fully understanding the situation and goal of each patient.	3.63 (0.83)	4.21 (0.60)	
Management control	15.03 (2.30)	16.75 (2.21)	<.001
Q7. The information presented by is clear.	3.78 (0.70)	4.25 (0.61)	
Q8. The information presented in the format of is effective and useful.	3.67 (0.76)	4.29 (0.63)	
Q11. The information presented using during MDRs was accurate.	3.87 (0.62)	4.07 (0.62)	
Q12. The presentation of patient information during MDRs using was organized.	3.71 (0.71)	4.15 (0.60)	

<sup>&</sup>lt;sup>a</sup>Values in Q9 and Q10 were calculated by reverse scoring.

# Discussion

# **Principal Findings**

The *i*-Dashboard was developed as a structured, process-oriented information platform for MDRs, where the efficiency of data retrieval, fidelity of data communication, and satisfaction of interdisciplinary communication are all requisites. Through a comprehensive evaluation of the performance of *i*-Dashboard, we found that under similar disease complexity, *i*-Dashboard may increase efficiency in prerounding data gathering compared to the established EMR. More importantly, displaying *i*-Dashboard on large touch screens in MDRs may enhance communication accuracy, information exchange, and clinical satisfaction.

# **Clinical Aspects**

Information overload has been a severe problem in the ICU [18]. Critical care providers express frustration with the difficulty in organizing data, especially quantitative dynamic data (eg, deteriorating serum creatinine levels during acute

kidney injury), and become overwhelmed by data overload [9,12,13,19]. In time-sensitive care environments, such as the emergency department and the ICU, visualization may provide information that can be readily perceived, easily recognized, and processed expeditiously into inferences [20]. In addition, visualization through dashboards may provide memory aids [11,13,20]. Implementing visualization dashboards in the clinical setting may improve data display and reduce cognitive overload among clinicians [7,9,11,13,21].

This study proposes the notion that large-screen visualization dashboards may improve data communication and information exchange during ICU MDRs. In the emergency department, large-screen visualization dashboards help health care providers find the desired information without wasting time [20,21]. In our study, *i*-Dashboard displayed on large, wall-mounted monitors could present well-organized data visually for the multidisciplinary care team during MDRs and thus avoid data misrepresentations through verbal communication. Compared with small computer monitors, a large screen display effectively prevents unequal access to data and seems more likely to



<sup>&</sup>lt;sup>b</sup>MDR: multidisciplinary round.

establish consensus. Thus, effective visualization through i-Dashboard displayed on large screens contributes to a better perception of information for decision-making by the multidisciplinary care team. When considering the user experience, dashboard visualization may improve the perception and comprehension of patient-level information [20], thereby removing barriers that hinder information exchange. Additionally, the concern regarding the prohibitive cost for large interactive touch screens [14] has been greatly attenuated.

# **Comparison With Previous Work**

Visualization dashboards can inform decision-making and support behavior change in public health and health care services [22-25]. A recent review of the literature suggests that the strength of evidence on the effect of ICU visualization dashboards remains low [9]. Of the 4 available randomized controlled trials, only Pickering et al [12] found a significant improvement compared to the pre-existing EMR environment. Time spent for prerounding data gathering efforts is practical to evaluate information tools on MDRs [7]. In their study, participants who had access to the AWARE dashboard significantly decreased the data gathering time from 12 to 9 minutes per patient (P < .03). In this study, we estimated a reduction of ~60 mouse clicks per patient using i-Dashboard versus the established EMR before the trial. For experienced NPs, this improvement can be translated to a 6-minute reduction, compatible with what has been observed (5.8 minutes) during the trial. Health care providers can reduce cognitive fatigue in the data extraction process and pay attention to more productive information.

The ICU is a dynamic environment in which multiple information pathways and personnel interactions facilitate patient care. Specially trained health care professionals in the ICU rely on interdisciplinary communication to make effective clinical decisions. Reliance on a single individual in patient data communication during MDRs represents a coping strategy for an EMR system that does not automatically provide an effective visualization display of the data needed [8]. Consistent with previous studies [8], we found that verbally shared communication of patient data during MDRs was prone to errors and inaccuracies, and most of the laboratory misrepresentations were omissions. Regardless of laboratory or nonlaboratory data, these misrepresentations could be almost eliminated using *i*-Dashboard as a visualization aid for MDRs.

While structured presentation using checklists and explicit definitions of each health care provider's role may facilitate MDRs, allied health care provider perceptions of not being valued by rounding intensivists have been recognized as an unfavorable factor that impairs the productivity of MDRs. In MDRs with *i*-Dashboard, participants of different professions had a space and time interval of their own, thereby enhancing

the sense of participation and collaboration. *i*-Dashboard may help the RT, pharmacist, and dietitian focus on expressing their thoughts explicitly, as other participants could obtain numerical information from the visualization aid. Their inputs were thus more likely to be valued and adopted by the multidisciplinary care team. The positive impacts of *i*-Dashboard on objective outcomes were corroborated by the increased perception of situation awareness and team participation in participants, as revealed in the questionnaire results.

We found that after the study period, health care providers in study units started to propose novel ideas that might improve the usability of *i*-Dashboard (eg, rearranging the layout and increasing laboratory items). A recent study has demonstrated valuable experience regarding the evolution process of an emergency department dashboard, which has undergone several significant revisions to respond to feedback from users [21]. Currently, we are developing the second version of *i*-Dashboard.

#### Limitations

Our findings must be interpreted within the context of the study limitations. First, traditional study outcomes in critical care, such as mortality and length of stay, were not evaluated in this study. No conclusion can be achieved regarding the effect of i-Dashboard on patient outcomes. Further studies are warranted in this respect. Second, the designers of i-Dashboard were part of the team that conducted the study and assessed the outcomes. Successful implementation of dashboards greatly relies on user experience. However, the participation of this paper's authors in the development process potentially leads to biases in outcomes [26]. Finally, *i*-Dashboard assessing custom-developed with reference to our established EMR environment. Therefore, it is difficult to extrapolate our study findings directly into ICUs of other hospitals, possibly limiting their generalizability. Nevertheless, visualization dashboards are intended to reduce the time spent on the data gathering process and improve situation awareness and navigation [11,21]. The promising results of *i*-Dashboard obtained in a mature MDR environment suggest that these design concepts may help develop or modify visualization dashboards in the ICU more applicably for MDRs through technological advancements.

#### **Conclusions**

In conclusion, we developed *i*-Dashboard as an information management platform for MDRs. The implementation of *i*-Dashboard can increase efficiency in prerounding data gathering. As a visualization aid, *i*-Dashboard displayed on large screens enhances communication accuracy and information exchange during MDRs. Establishing care team—designed visualization dashboards as an integrated information platform may reinforce the communication quality of MDRs, thus potentially improving the workflow process in the ICU.

# Acknowledgments

We appreciate Prof Yu Shyr, Department of Biostatistics, Vanderbilt University Medical Center, Nashville, Tennessee, for his help in study design, Mr Cheng-Ping Lai, Department of Information Technology, for his excellent technical support, Ms Yu Miao, Department of Statistics, for her contribution in data analysis, and Ms Yu-Fang Hsieh, Ms Pei-Jung Wu, Ms Li-Chin Hsiao, Ms Tzu-Yun Chiu, and Ms Kuan-Ling Chin, Department of Nursing, for their laborious contribution to this work. This work is



supported by grants from the Ministry of Science and Technology, Executive Yuan, Taiwan (MOST 109-2634-F-006-023 to M-RS).

#### **Conflicts of Interest**

None declared.

# Multimedia Appendix 1

CONSORT-EHEALTH checklist.

[PDF File (Adobe PDF File), 1391 KB-Multimedia Appendix 1]

# Multimedia Appendix 2

Architecture of i-Dashboard.

[PDF File (Adobe PDF File), 2433 KB-Multimedia Appendix 2]

# Multimedia Appendix 3

Structured script for data gathering and patient presentation.

[PDF File (Adobe PDF File), 216 KB-Multimedia Appendix 3]

# Multimedia Appendix 4

Standardized form for evaluating communication accuracy.

[PDF File (Adobe PDF File), 241 KB-Multimedia Appendix 4]

# Multimedia Appendix 5

Recommendations initiated by respiratory therapists, pharmacists and dietitians.

[PDF File (Adobe PDF File), 535 KB-Multimedia Appendix 5]

# Multimedia Appendix 6

Questionnaires.

[PDF File (Adobe PDF File), 416 KB-Multimedia Appendix 6]

#### Multimedia Appendix 7

Questionnaire results.

[PDF File (Adobe PDF File), 332 KB-Multimedia Appendix 7]

#### References

- Halpern NA, Pastores SM. Critical care medicine in the United States 2000-2005: an analysis of bed numbers, occupancy rates, payer mix, and costs. Crit Care Med 2010 Jan;38(1):65-71. [doi: 10.1097/CCM.0b013e3181b090d0] [Medline: 19730257]
- 2. Vincent J, Marshall JC, Namendys-Silva SA, François B, Martin-Loeches I, Lipman J, ICON investigators. Assessment of the worldwide burden of critical illness: the intensive care over nations (ICON) audit. Lancet Respir Med 2014 May;2(5):380-386. [doi: 10.1016/S2213-2600(14)70061-X] [Medline: 24740011]
- 3. Yoo EJ, Edwards JD, Dean ML, Dudley RA. Multidisciplinary critical care and intensivist staffing: results of a statewide survey and association with mortality. J Intensive Care Med 2016 Jun;31(5):325-332. [doi: 10.1177/0885066614534605] [Medline: 24825859]
- 4. Kim MM, Barnato AE, Angus DC, Fleisher LA, Fleisher LF, Kahn JM. The effect of multidisciplinary care teams on intensive care unit mortality. Arch Intern Med 2010 Feb 22;170(4):369-376 [FREE Full text] [doi: 10.1001/archinternmed.2009.521] [Medline: 20177041]
- 5. Lane D, Ferri M, Lemaire J, McLaughlin K, Stelfox HT. A systematic review of evidence-informed practices for patient care rounds in the ICU. Crit Care Med 2013 Aug;41(8):2015-2029. [doi: 10.1097/CCM.0b013e31828a435f] [Medline: 23666096]
- 6. Leonard MW, Frankel AS. Role of effective teamwork and communication in delivering safe, high-quality care. Mt Sinai J Med 2011;78(6):820-826. [doi: 10.1002/msj.20295] [Medline: 22069205]
- 7. Gurses AP, Xiao Y. A systematic review of the literature on multidisciplinary rounds to design information technology. J Am Med Inform Assoc 2006;13(3):267-276 [FREE Full text] [doi: 10.1197/jamia.M1992] [Medline: 16501176]



- 9. Waller RG, Wright MC, Segall N, Nesbitt P, Reese T, Borbolla D, et al. Novel displays of patient information in critical care settings: a systematic review. J Am Med Inform Assoc 2019 May 01;26(5):479-489 [FREE Full text] [doi: 10.1093/jamia/ocy193] [Medline: 30865769]
- 10. De Georgia MA, Kaffashi F, Jacono FJ, Loparo KA. Information technology in critical care: review of monitoring and data acquisition systems for patient care and research. ScientificWorldJournal 2015;2015:727694 [FREE Full text] [doi: 10.1155/2015/727694] [Medline: 25734185]
- 11. Khairat SS, Dukkipati A, Lauria HA, Bice T, Travers D, Carson SS. The impact of visualization dashboards on quality of care and clinician satisfaction: integrative literature review. JMIR Hum Factors 2018 May 31;5(2):e22 [FREE Full text] [doi: 10.2196/humanfactors.9328] [Medline: 29853440]
- 12. Pickering BW, Dong Y, Ahmed A, Giri J, Kilickaya O, Gupta A, et al. The implementation of clinician designed, human-centered electronic medical record viewer in the intensive care unit: a pilot step-wedge cluster randomized trial. Int J Med Inform 2015 May;84(5):299-307. [doi: 10.1016/j.ijmedinf.2015.01.017] [Medline: 25683227]
- 13. Wright MC, Borbolla D, Waller RG, Del Fiol G, Reese T, Nesbitt P, et al. Critical care information display approaches and design frameworks: a systematic review and meta-analysis. J Biomed Inform 2019;100S:100041 [FREE Full text] [doi: 10.1016/j.vjbinx.2019.100041] [Medline: 34384575]
- 14. Morrison C, Jones M, Blackwell A, Vuylsteke A. Electronic patient record use during ward rounds: a qualitative study of interaction between medical staff. Crit Care 2008;12(6):R148 [FREE Full text] [doi: 10.1186/cc7134] [Medline: 19025662]
- 15. Aslakson RA, Wyskiel R, Shaeffer D, Zyra M, Ahuja N, Nelson JE, et al. Surgical intensive care unit clinician estimates of the adequacy of communication regarding patient prognosis. Crit Care 2010;14(6):R218 [FREE Full text] [doi: 10.1186/cc9346] [Medline: 21114837]
- 16. Eysenbach G, CONSORT-EHEALTH Group. CONSORT-EHEALTH: improving and standardizing evaluation reports of web-based and mobile health interventions. J Med Internet Res 2011 Dec 31;13(4):e126 [FREE Full text] [doi: 10.2196/jmir.1923] [Medline: 22209829]
- 17. Roumeliotis N, Parisien G, Charette S, Arpin E, Brunet F, Jouvet P. Reorganizing care with the implementation of electronic medical records: a time-motion study in the PICU. Pediatr Crit Care Med 2018 Apr;19(4):e172-e179. [doi: 10.1097/PCC.00000000001450] [Medline: 29329162]
- 18. Manor-Shulman O, Beyene J, Frndova H, Parshuram CS. Quantifying the volume of documented clinical information in critical illness. J Crit Care 2008 Jun;23(2):245-250. [doi: 10.1016/j.jcrc.2007.06.003] [Medline: 18538218]
- 19. Wright M, Dunbar S, Macpherson B, Moretti E, Del Fiol G, Bolte J, et al. Toward designing information display to support critical care. A qualitative contextual evaluation and visioning effort. Appl Clin Inform 2016 Oct 05;7(4):912-929 [FREE Full text] [doi: 10.4338/ACI-2016-03-RA-0033] [Medline: 27704138]
- 20. Franklin A, Gantela S, Shifarraw S, Johnson TR, Robinson DJ, King BR, et al. Dashboard visualizations: supporting real-time throughput decision-making. J Biomed Inform 2017 Jul;71:211-221 [FREE Full text] [doi: 10.1016/j.jbi.2017.05.024] [Medline: 28579532]
- 21. Yoo J, Jung KY, Kim T, Lee T, Hwang SY, Yoon H, et al. A real-time autonomous dashboard for the emergency department: 5-year case study. JMIR Mhealth Uhealth 2018 Nov 22;6(11):e10666 [FREE Full text] [doi: 10.2196/10666] [Medline: 30467100]
- 22. Ivanković D, Barbazza E, Bos V, Brito Fernandes Ó, Jamieson Gilmore K, Jansen T, et al. Features constituting actionable COVID-19 dashboards: descriptive assessment and expert appraisal of 158 public web-based COVID-19 dashboards. J Med Internet Res 2021 Feb 24;23(2):e25682 [FREE Full text] [doi: 10.2196/25682] [Medline: 33577467]
- 23. Gremyr A, Andersson Gäre B, Greenhalgh T, Malm U, Thor J, Andersson A. Using complexity assessment to inform the development and deployment of a digital dashboard for schizophrenia care: case study. J Med Internet Res 2020 Apr 23;22(4):e15521 [FREE Full text] [doi: 10.2196/15521] [Medline: 32324143]
- 24. Bos VLLC, Jansen T, Klazinga NS, Kringos DS. Development and actionability of the Dutch COVID-19 dashboard: descriptive assessment and expert appraisal study. JMIR Public Health Surveill 2021 Oct 12;7(10):e31161 [FREE Full text] [doi: 10.2196/31161] [Medline: 34543229]
- 25. Zheng S, Edwards JR, Dudeck MA, Patel PR, Wattenmaker L, Mirza M, et al. Building an interactive geospatial visualization application for national health care-associated infection surveillance: development study. JMIR Public Health Surveill 2021 Jul 30;7(7):e23528 [FREE Full text] [doi: 10.2196/23528] [Medline: 34328436]
- 26. Garg AX, Adhikari NKJ, McDonald H, Rosas-Arellano MP, Devereaux PJ, Beyene J, et al. Effects of computerized clinical decision support systems on practitioner performance and patient outcomes: a systematic review. JAMA 2005 Mar 09;293(10):1223-1238. [doi: 10.1001/jama.293.10.1223] [Medline: 15755945]

# **Abbreviations**

EMR: electronic medical record



**HIS:** Hospital Information Systems

ICCA: IntelliSpace Critical Care & Anesthesia information system

**ICU:** intensive care unit

LIS: Laboratory Information System MDR: multidisciplinary round

NP: nurse practitioner

PACS: Picture Archiving and Communication System

RT: respiratory therapist

Edited by T Leung; submitted 02.01.22; peer-reviewed by S Khairat, M Wright, H He; comments to author 30.01.22; revised version received 20.02.22; accepted 25.04.22; published 13.05.22

Please cite as:

Lai CH, Li KW, Hu FW, Su PF, Hsu IL, Huang M, Huang Y, Liu PY, Shen MR

Cluster-Randomized Controlled Trial J Med Internet Res 2022;24(5):e35981 URL: https://www.jmir.org/2022/5/e35981

doi: 10.2196/35981

PMID:

©Chao-Han Lai, Kai-Wen Li, Fang-Wen Hu, Pei-Fang Su, I-Lin Hsu, Min-Hsin Huang, Yen-Ta Huang, Ping-Yen Liu, Meng-Ru Shen. Originally published in the Journal of Medical Internet Research (https://www.jmir.org), 13.05.2022. This is an open-access article distributed under the terms of the Creative Commons Attribution License (https://creativecommons.org/licenses/by/4.0/), which permits unrestricted use, distribution, and reproduction in any medium, provided the original work, first published in the Journal of Medical Internet Research, is properly cited. The complete bibliographic information, a link to the original publication on https://www.jmir.org/, as well as this copyright and license information must be included.

