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## **Exploring Patient Perspectives on Telemedicine Monitoring within the Operating Room**

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## **Abstract**

**Background:** Clinical decision support systems and telemedicine for remote monitoring can together support surgical patients' intraoperative decision-making and care management. However, there has been limited investigation on patient perspectives about advanced health information technology use in intraoperative settings, particularly within an intraoperative telemedicine setting (eOR).

**Purpose:** Our study objectives were: (1) to identify participant-rated items contributing to patient attitudes, beliefs, and level of comfort with eOR monitoring; (2) to highlight barriers and facilitators to eOR use; and (3) to develop guidelines for eOR implementation that improve patient buy-in.

**Methods:** We surveyed 324 individuals representing surgical patients across the United States using Amazon Mechanical Turk, an online platform supporting internet-based work. The structured survey questions examined the level of agreement and comfort with eOR for remote patient monitoring. We calculated descriptive statistics for demographic variables and performed a Wilcoxon matched-pairs signed-rank test to assess whether participants were more comfortable

Conflicts of interest

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MP, AC, and MA led the conception and design of the study along with data collection. JA, AM and KH performed data coding and analysis. All authors were involved in the various phases of the study. All authors participated in providing critical feedback in writing or the manuscript.

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with familiar clinicians from local hospitals or health systems monitoring their health and safety status during surgery than clinicians from hospitals or health systems in other regions or countries. We also analyzed open-ended survey responses using a thematic approach informed by an eightdimensional socio-technical model.

**Results:** Participants' average age was 34.07 (SD = 10.11). Most were white (80.9%), male (57.1%), and had a high school degree or more (88.3%). Participants reported a higher level of comfort with clinicians they knew monitoring their health and safety than clinicians they did not know, even within the same healthcare system  $(z = -4.012, p < .001)$ . They reported significantly higher comfort levels with clinicians within the same hospital or health system in the United States than those in a different country ( $z = -10.230$ , p<.001). Facilitators and barriers to eOR remote monitoring were prevalent across four socio-technical dimensions: 1) organizational policies, procedures, environment, and culture; 2) people; 3) workflow and communication; and 4) hardware and software. Facilitators to eOR use included perceptions of improved patient safety through a safeguard system and perceptions of streamlined care. Barriers included fears of incorrect eOR patient assessments, decision-making conflicts between care teams, and technological malfunctions.

**Conclusions:** Participants expressed significant support for intraoperative telemedicine use and greater comfort with local telemedicine systems instead of long-distance telemedicine systems. Reservations centered on organizational policies, procedures, environment, culture; people; workflow and communication; and hardware and software. To improve the acceptability of remote monitoring by an OR telemedicine team and address these concerns, we highlight evidence-based guidelines applicable to telemedicine use within the context of OR workflow. Guidelines include backup plans for technical challenges, rigid care, and privacy standards, and patient education to increase understanding of telemedicine's potential to improve patient care.

#### **Keywords**

Telemedicine; Surgery; Remote Monitoring; Operating Room

## **1 Introduction**

Each year, approximately 7 million patients out of 300 million global surgeries (50 million in the United States [1, 2]) experience postoperative complications, resulting in over 1 million deaths annually [3]. Up to half of these complications are preventable, and many are attributed to ineffective intraoperative decision-making and care management in the operating room (OR) [3, 4]. Commonly reported barriers to intraoperative decision-making include information overload [5], inefficient communication leading to limited shared understanding between disciplines and teams  $[6–11]$ , and cognitive constraints (e.g., human bias) [12, 13].

Clinical decision support systems (CDSS) [14] can monitor patient status, streamline documentation, guide evidence-based treatments [15, 16], flag critical events and patient risk factors [3, 4], and enhance situational awareness [17] to aid decision-making and care planning and reduce opportunities for decision-making errors and preventable complications

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[18]. However, their use is often limited by several socio-technical issues, including unclear alerts and changing guidelines to CDSS use [16, 19].

To ameliorate these CDSS limitations, researchers have evaluated the use of telemedicine for the OR (hereafter called electronic OR, eOR) across various inpatient surgical services [4, 20]. Currently, within the eOR, eOR teams (comprised of attending anesthesiologists, residents, certified/student registered nurse anesthetists) assess real-time surgical procedures through remote monitoring equipment feeding data into an eOR-based clinical decision support system. After determining patient data and clinical status, eOR team members identify red flags, contingencies, or patient complications and offer evidence-based risk mitigation strategies to the OR team through virtual consultations and feedback over an electronic message or phone call [21]. Once the OR receives the message, they determine how best to move forward with the procedure and maintain safety under time constraints and high-pressured conditions [22, 23]. Initial clinician-centered evaluations [20, 24, 25] identified barriers to eOR use, including poorly timed alerts, emotional responses, and care redundancy, and enablers including workload reduction and case-relevant alerts from eOR.

Studies conducted on telemedicine use internationally [26–28] indicate that patientperceived and clinician-perceived factors affected its implementation. Patients in more rural areas with less education on telemedicine can resist its use [28]. Many patients are concerned about privacy [26]. Facilitators to successful implementation include collaboration between healthcare institutions and institutions of higher education or the government to provide resources, education, and training for telemedicine use [28]. In addition, many clinicians perceive telemedicine to enhance access to healthcare and offer better patient care quality [27]. While these international studies examined patient and clinician perspectives on telemedicine, studies within the US have primarily focused on clinician perspectives.

Patient-centered high-quality care should incorporate patients' values, needs, and goals [29]. Thus obtaining patient perspectives on intraoperative care is essential to consider before large-scale implementation of the eOR. Leaders need to understand patient perspectives about using intraoperative telemedicine as part of their OR care to enhance care quality and improve intraoperative patient-centered outcomes. Towards this end, we conducted a survey study to examine the perspectives of past surgical patients on the eOR. Our study objectives were: (1) to identify perceived factors contributing to their attitudes, beliefs, and level of comfort with eOR monitoring; (2) to highlight barriers and facilitators to eOR use; and (3) to develop guidelines for eOR implementation that improve patient buy-in.

#### **2 Methods**

#### **2.1 Study Setting and Participants**

The survey was administered in October 2018 via Amazon Mechanical Turk (MTurk), an online platform supporting internet-based work [30]. Eligibility included English-speaking adults (age 18+) with internet access who underwent surgery within a year before participation. Potential participants were provided an online information sheet to read before

agreeing to the survey. Washington University School of Medicine's institutional review board deemed the study exempt (HRPO 201809038).

#### **2.2 Conceptual Framework: 8-dimensional Socio-technical Model**

We use the 8-dimensional socio-technical model to examine participant-perceived factors impacting patient acceptability towards eOR across qualitative responses [31]. The model includes eight interrelated dimensions: 1) hardware and software (e.g., all technology within the OR and eOR); 2) clinical content (e.g., clinical programs used within the OR and eOR); 3) human-computer interface (e.g., clinical program user interfaces); 4) people (e.g., OR patients and OR/eOR clinicians); 5) workflow and communication (e.g., intraoperative workflow); 6) internal organizational (e.g., hospital) policies, procedures, and cultures; 7) external rules, regulations, and pressures; and 8) system measurement and monitoring (e.g., telemedicine system) (Figure 1).

These dimensions address the socio-technical barriers and facilitators to designing, developing, implementing, and evaluating health information technology within complex healthcare systems. Without adequate support across all eight interdependent and interrelated dimensions, challenges arise in developing, implementing, and using the examined system (i.e., eOR). The socio-technical model has been used to inform institutional policies, improve clinician training, and develop and implement health information technology tools and clinical decision support interventions [32–34].

#### **2.3 Data Collection**

We developed a 40-item survey with close- and open-ended items to assess perceptions, comfort, and concerns with telemedicine remote monitoring scenarios within the local hospital, from a different hospital or health system within the US, and from a hospital or health system in another country (see Appendix for the survey with the scenarios). Our survey had four open-ended questions related to initial reactions to possible eOR use, eOR pros, eOR cons, and any other concerns. The survey development was informed by prior research [35–37] and surveys [38, 39] and was internally tested with researchers, clinicians, and patients/members of the general public  $(N=15)$  before being launched. Responses were not mandatory for all questions. An attention check question identified those who might not read each question before responding. Participants were categorized according to age (6 categories) and US Census regions (5 categories). Participants were compensated per MTurk guidelines at a rate consistent with minimum wage and the expected duration of the survey (\$1.00 deposited into users' Amazon account) [30].

#### **2.4 Data Analysis**

**2.4.1 Quantitative analysis—**Descriptive statistics were calculated for demographic variables and questions about their level of agreement and comfort with different scenarios. A Wilcoxon matched-pairs signed-rank test was conducted to assess whether participants were more comfortable with clinicians in a local hospital or health system monitoring the OR than clinicians from other hospitals or countries. The Wilcoxon test was selected as a non-parametric test to compare proportions for ordinal data.

**2.4.2 Qualitative analysis—**Thematic analyses of free-text responses were conducted using a hybrid inductive-deductive approach [40]. Responses were reviewed multiple times by two researchers (JA, AM) to familiarize themselves with the content. Relevant quotations and topics were labeled. Data was openly coded line-by-line to characterize the data's underlying semantics, such as barriers and facilitators to intraoperative telemedicine use (i.e., inductive coding). Next, a priori codes informed by the socio-technical model [31] were applied to each transcript to categorize relevant data on eOR characteristics and patient-telemedicine relationships into one of the eight dimensions (i.e., deductive coding). Areas of similarity and overlap between codes were identified to synthesize unifying or repeated sub-themes under each relevant socio-technical dimension – for example, attention issues were categorized as a barrier to eOR use under the "People" socio-technical dimension (Table 1). Themes were finalized within and across transcripts after multiple rounds of data review and sub-theme refinement to arrive at 100% consensus between researchers.

#### **3 Results**

324 out of 360 individual responses were analyzed. Twenty-nine were removed due to incomplete response (≤ 27% completed), six were removed because the participant responded incorrectly to the attention check, and one was removed for taking 29 seconds to answer "2" for every question.

Table 2 presents demographic information for the 324 included participants. The mean age was  $34.07$  (SD = 10.11). Most were white  $(80.9\%)$ , male  $(57.1\%)$ , and had a high school degree or more (88.3%). Participants resided across US census regions in rural, urban, and suburban areas. Most were employed (89.4%) with a range of household incomes.

#### **3.1 Participants' comfort with remote monitoring by eOR**

Table 3 shows participants' comfort level with the use of the eOR and highlights responses around specific eOR-based scenarios.

Results from the Wilcoxon matched-pairs signed-rank test showed participants reporting greater comfort with familiar eOR clinicians than unfamiliar clinicians within the same healthcare system  $(z = -4.012, p < .001)$ . Furthermore, they reported significantly higher comfort with clinicians in the same hospital or a health system in the US than those in a different country  $(z = -10.230, p < .001)$ .

## **3.2 Perceptions of eOR barriers and facilitators characterized by the socio-technical model**

Two hundred fifty-three participants provided free-text responses to the four open-ended questions focused on their initial reactions to a hypothetical eOR use (78.1%), 250 participants reported on pros to eOR use (77.2%), 212 participants responded with cons to eOR use (65.4%), and 41 participants highlighted other concerns (12.7%). Across rating and free-text responses, participants' perceptions of eOR use were categorized by four of eight socio-technical dimensions: organizational policies, procedures, and cultures;

hardware and software; workflow and communication; and people (Figure 2). We present each dimension's key themes, supported by quotes (Table 4).

#### **3.2.1 Organizational policies, procedures, environment, and culture—**

Participants mentioned privacy concerns, feeling self-conscious about the number of clinicians monitoring their surgeries, and worrying about health data falling into "the wrong hands." Approximately 33% of responding participants were slightly concerned about the privacy of their health information, though 41% were unconcerned.

"I know many people value their privacy a lot and would want as few people witnessing their surgery as possible (P205)."

Others worried that eOR implementation would be "*a waste of resources (P122)*, "increasing patient or hospital costs. A few felt that even if patient bills did not increase, resource wastage would "*cost somebody extra money (P2)*" or increase insurance payments. Other logistical concerns involved resource shortages, with telemedicine barring staff and resources from other hospital tasks. Some worried that "[the eOR] might take doctors away from other patients (P291)." Others agreed that "additional tracking may create a shortage of staff, causing other surgeries to be… delayed (P242)."

Positive perceptions surrounding improvements to organizational safety culture emphasized a system of checks and balances with the eOR providing an unbiased risk assessment and alerting OR clinicians of feedback and concerns. Participants felt comforted by this transparency between team members.

"[The eOR] could provide more input and feedback for [clinicians] and improve their expertise. The [eOR] might be more unbiased and unafraid to speak up if they see something wrong (P125)."

**3.2.2 Hardware and software—**Despite some apprehension, participants expressed optimism overall about use of advanced technology with the eOR intervention. Participants believed that if "there is no extra cost that would not be covered by insurance," the eOR would be "helpful (P90)" and provide "additional caretakers at no additional cost (P242)." Some also felt that "technology has advanced so much that this doesn't seem risky, but an added bonus to [patient] welfare (P62)."

Common concerns involved technological errors leading to communication and information transfer failures or false alarms. As one participant stated, "Doctors may not listen to calls, and sometimes you need to see the patient versus just looking at… a computer  $(PI10)$ ." A few worried that "[system] *malfunctions (P56)*" or "*technical problems (P107)*" could prevent accurate communication between eOR and OR clinicians. About 42.7% of responding participants were slightly concerned that the OR team would rely too much on eOR reports during high-risk cases, indicating distrust in technology.

"Being too heavily relied on technology… can be a risky thing to do in case… the machines aren't working optimally (P267)."

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Some speculated that data could overwhelm eOR clinicians (P66), resulting in inaccurate or inefficient interpretations. A few others worried that "there could be a misinterpretation of *(data and eOR feedback) (P62)*," leading to inaccurate and harmful decision-making.

"The technology [might] mess up and [the clinicians might] do something based on faulty data (P179)."

**3.2.3 Workflow and communication—**Many felt the eOR would increase patient safety from real-time monitoring, improving clinician workflow and team communication, and reducing patient risks and complications.

"Early abnormality detection, data storage easily accessible and monitored by healthcare professionals (P274)."

In addition to patient surveillance tasks, one participant also suggested that the eOR could provide a teaching tool to clinicians (P316).

Participants also felt that by assigning monitoring tasks to eOR clinicians, clinicians could improve their surgical focus without distractions in the OR. As one participant explained, "[Bedside doctors] do not have to devote mental effort to tracking certain quantities when performing more complex tasks (P258)."

Furthermore, eOR clinicians could improve efficiency by monitoring multiple patients at a time, "allowing clinicians to carefully examine patient status without being in the [OR] (P175)." This safeguard for the OR offered more reliable patient care.

However, some participants felt that miscommunication or team disconnect could disrupt workflow, as "the work could be outsourced and lead to communication issues between [eOR and OR teams] (P165)." Primarily, a lack of bedside context could potentially lead to inaccurate eOR assessments and information transfer.

"Not being in the room, they may miss physical vital signs. (P114)."

**3.2.4 People—**Participants speculated that distributing clinicians into the eOR would reduce people-related risks in the OR, such as distractions and infection risks, improving patient safety and reflecting across survey ratings (extremely or somewhat likely = 81.7%).

"No one would be disturbing the doctor, the room would be less crowded, less chance of… something to go wrong (P64)."

Within the eOR, clinicians could focus on the case, smoothly integrating telemedicine care into the existing workflow. As one participant stated, within the eOR, "there is no distraction, just... focus on the computer screen (P114)." In reducing cognitive workload for the OR team, both the eOR and OR would run at maximum efficiency, resulting in quicker risk and concern detection. Many felt that an eOR intervention could reduce patient blood loss and infections (P28). This perception aligned with survey ratings, as most felt confident that intraoperative remote monitoring would improve surgery outcomes (extremely likely or likely =  $78.7%$ ).

Participants predicted that the eOR intervention would enhance patients' overall surgical experience by increasing their sense of comfort and security with care from multiple experienced clinicians. One participant explained, "It makes me feel safer and more comfortable, like the healthcare professionals… are really paying attention to my body and are doing everything in their power to make sure nothing goes wrong (P3)."

Most indicated they trusted their clinicians to take care of them and therefore trusted the intervention. One participant confidently stated, "I trust that professionals in the field understand and implement best practices (P95)." Many agreed, reporting similarly high comfort with doctors and nurses they knew keeping track of their health and safety outside of the OR (extremely comfortable or comfortable  $= 83.2\%$ ) and with unfamiliar doctors and nurses who were part of the same hospital (extremely comfortable or comfortable = 74.6%). Over half of the participants (extremely comfortable or comfortable = 60.3%) felt comfortable with unfamiliar doctors and nurses in different hospitals. 43.3% felt extremely comfortable or comfortable with unfamiliar doctors and nurses who were part of a hospital system in another country (extremely uncomfortable or uncomfortable  $= 35.9\%$ ).

Of those who felt uncomfortable with eOR use, many stated that they did not fully trust their care teams and eOR technology. These participants worried that remote monitoring could worsen surgery outcomes, although more than half of respondents strongly or somewhat disagreed (56.1%). This response was similar to whether clinicians tracking their wellbeing would worsen the quality of care (strongly or somewhat disagree  $= 57.3\%$ ) or worsen safety (strongly or somewhat disagree  $= 57.6\%$ ).

Some discussed attention issues within the eOR and OR, such as multitasking, as "the doctors [could be] disconnected/distracted from the task at hand if they had to keep referring to a screen (P202)." Some also speculated that the eOR would be distracting if eOR clinicians sent messages or called the OR during a surgical case; 43% of responding participants reported that they would be slightly concerned about eOR distractions affecting patient care.

Another common concern was that too many members within a patient care team could lead to decision-making conflicts through coordinating issues. One participant explained that "many doctors watching the situation… could be distracting at a certain point and could jeopardize the operation (P301)." P301 elaborated that confusion and distractions could "especially happen if the doctors [argue about] how things are going." In the event that one team inaccurately predicted patient risks or that "somebody could have an outlying opinion, meaning they think something is wrong when nothing is, in fact, wrong (P268)," some expressed concern about decision-making and confusion about leadership and coordination during eOR/OR conversations, asking, "Who has the final authority to make decisions... if several avenues of treatment arose (P170)?"

Other participants agreed that using multiple care teams would lead to a sense of shared responsibility for errors and a subsequent lack of accountability. This "less personable" patient care (P256) could lead to disjointed teamwork.

"There will be a lot of different people involved in communication, making coordination potentially more complicated if there are no clear rules (P258)."

## **4 Discussion**

This exploratory study highlights recent surgical patients' attitudes and beliefs towards intraoperative telemedicine use to support care delivery and management. Participants generally supported the use of remote monitoring technology from eOR clinicians to improve team coordination, ensure shared understanding, foster situational awareness, and serve as a backup care team and safeguard to support clinical decisions, all leading to improvements in care quality and safety outcomes.

Participants reported significantly more comfort with locally managed eOR teams retrieving their data, assessing clinical status, and providing feedback and suggestions to their OR team than distant eOR services, which potentially indicates a decrease in comfort as their familiarity with eOR staff decreased. Similarly, they reported comfort with eOR teams managed within the US healthcare system compared to internationally hosted eOR services. Cross-border telemedicine is often seen as a low-cost solution that does not take local clinicians away from their responsibilities [41]; for example, a telemedicine center in the Caribbean monitored pediatric inpatient units of a Canadian hospital and provided feedback and decision support to their bedside care teams [42]. Benefits of such international telemedicine use included expedition of patient case review processes, development of informal clinical education forums between centers, and sustainable allocation of resources to provide specialized patient care. Nevertheless, several other factors, such as cost of eOR implementation, training, staff and resources, healthcare reimbursement structure, etc., play into which scenario is feasible and cost-effective, as highlighted by our participants.

Irrespective of the scenario of eOR use, participants identified four dimensions in the 8-dimensional socio-technical model to be critical for its acceptance: organizational policies, procedures, environment, and culture; workflow and communication; people; and hardware and software. Key facilitators to eOR use include checks and balances between eOR and OR teams, increased patient safety with real-time risk monitoring and patient surveillance, improved focus and lack of distraction within the OR, increased trust in clinicians due to a safeguard system, use of advanced technology, and enhanced patient comfort. Significant barriers to eOR use included increased hospital costs or patient costs, privacy concerns, incorrect eOR clinician assessments, technology malfunctions, eOR clinician attention issues, decreased accountability for errors, and eOR-OR decision-making conflicts. Similar barriers have been reported in studies on CDSS use in surgical outpatient clinics (e.g., privacy [43]) and studies evaluating telemonitoring (e.g., data interpretation difficulties and overtreatment [44]).

To establish successful intraoperative telemedicine use, institutions need intraoperative telemedicine guidelines, similar to those developed for primary and urgent care by the American Telemedicine Association (ATA) [45] that can account for strategies for addressing these barriers and facilitators to eOR adoption and use by patients. Informed by findings from this study, we present preliminary guidelines that can address the four socio-

technical dimensions to enhance patient acceptance and comfort levels towards telemedicine and its embedded technologies (e.g., CDSS, EHR) and their integration within the routine intraoperative workflow (Figure 2).

#### **Guidelines for organizational policies, procedures, environment, and culture:**

To foster a system of checks and balances between the eOR and OR teams, professional environment standards can be established through rigid protocols to emphasize methods of ensuring best practices, quality care, and decision-making with a fresh perspective [45]. Furthermore, to mitigate privacy concerns, patient education on confidentiality limits and the introduction of physical and technical data safeguards can minimize the risk of data compromise. As patients undergo surgery from a multidisciplinary team of care providers, some may be out-of-network, resulting in surprise medical bills [46, 47]. As such, patients should also be reassured that eOR use will not waste resources or increase costs to them through accurate and complete documentation of medical billing and coding. Lastly, although some patients expressed more comfort with local telemedicine use, resource shortages within local institutions can be prevented through cross-border telemedicine, which provides many previously mentioned benefits [42].

#### **Guidelines for hardware and software:**

To make the most of telemedicine's advanced technology and sustain the infrastructure, we recommend building a backup system for the eOR in the event of any technical errors or malfunctions. If technology fails or user error prevents adequate access to patient data or online communication, other means of accessing necessary information via mobile phone or tablet would be useful [48].

#### **Guidelines for workflow and communication:**

To enhance patient safety from real-time remote monitoring of the OR and improve efficiency across the intraoperative workflow, rigid and evidence-based telemedicine care standards and expectations recommended by the ATA can be applied [45]. These telemedicine care standards would encourage clear communication between eOR and OR clinicians to avoid misunderstandings and prevent inaccurate eOR patient assessments while serving as a safeguard for the OR. Furthermore, professional environment standards must be established through rigid OR protocols to improve OR team attention and limit distraction in the OR [45].

#### **Guidelines for people:**

To instill a sense of comfort for surgical patients in the eOR, we suggest patient education about eOR functions and their role, along with the implementation of physical and technical data safeguards. Elucidating the eOR process, benefits, and resources could improve patient understanding and buy-in [49]. Additionally, patient trust can be promoted through discussion using simple, standardized common language to ensure patient-provider shared knowledge [45]. Professional environment standards must continue to be upheld to further combat distrust, avoid distractions within the eOR and OR, OR-eOR decisionmaking conflicts, and related lack of accountability. Our findings on patient-perceived

socio-technical barriers and facilitators related to the use of eOR in the US are similar to the ones reported in studies on telemedicine use internationally (i.e., outpatient settings, robotic-assisted surgery) [50] (i.e., in outpatient settings) [51]. Hence, the proposed guidelines can be tailored to address the unique contextual needs and related socio-technical factors for widespread telemedicine adoption internationally (e.g., emphasizing telemedicine infrastructure and financial planning in regions with little government healthcare support).

Our findings should be interpreted within the context of several study limitations. First, the survey was developed for this study based on the literature and existing surveys because validated instruments were not available for these topics. We tested the survey for clarity before administering the survey to participants, but future studies could develop validated measures to assess eOR perceptions. Second, although Amazon MTurk provides an online service for users to complete research studies in exchange for payment [52] and is often more representative than other convenience samples [53, 54], respondents were younger, more likely to be female, more educated (and possibly more technically savvy), less wealthy (household income of < \$150,000 yearly), and less likely to be Hispanics or Black [55]. Lastly, we compensated participants \$1.00 for participation, a rate higher than many MTurk studies and consistent with minimum wage [56]. However, the low incentive could lead to hasty responses. We included an attention check question and excluded those who did not respond correctly to it to check for this possibility. In other studies, MTurk participants consistently produced the same standard decision-making biases as those from different samples [57].

## **Conclusion**

eOR acceptability was influenced by barriers and facilitators across four socio-technical dimensions regarding successful eOR implementation: organizational policies, procedures, environment, and culture; people; workflow and communication; and hardware and software. Our study provides insights to inform intraoperative telemedicine guidelines for surgical settings that can address barriers and facilitators to eOR acceptability identified by previous surgical patients. These insights can inform eOR design and implementation strategies and, increasing acceptability, adoption and use, and effectiveness for future largescale implementation.

## **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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## **References**

- 1. National Quality Forum, NQF-Endorsed Measures for Surgical Procedures. 2015.
- 2. Nepogodiev D, Martin J, Biccard B, Makupe A, Bhangu A, et al. , Global burden of postoperative death. Lancet, 2019. 393(401): p. 33139–8.
- 3. Weiser TG and Gawande A, Excess surgical mortality: strategies for improving quality of care. 2015.
- 4. King CR, Abraham J, Kannampallil TG, Fritz BA, Abdallah AB, et al., Protocol for the effectiveness of an anesthesiology control tower system in improving perioperative quality metrics and clinical outcomes: The TECTONICS randomized, pragmatic trial. F1000Research, 2019. 8.
- 5. Melby L and Toussaint P. Supporting operating nurses' collaborative work: preventing information overload and tailoring information access. in 2009 22nd IEEE International Symposium on Computer-Based Medical Systems. 2009. IEEE.
- 6. Brilli RJ, McClead RE Jr, Crandall WV, Stoverock L, Berry JC, et al. , A comprehensive patient safety program can significantly reduce preventable harm, associated costs, and hospital mortality. The Journal of Pediatrics, 2013. 163(6): p. 1638–1645. [PubMed: 23910978]
- 7. Davenport DL, Ferraris VA, Hosokawa P, Henderson WG, Khuri SF, et al. , Multivariable predictors of postoperative cardiac adverse events after general and vascular surgery: results from the patient safety in surgery study. Journal of the American College of Surgeons, 2007. 204(6): p. 1199–1210. [PubMed: 17544078]
- 8. de Vries EN, Prins HA, Crolla RM, den Outer AJ, van Andel G, et al. , Effect of a comprehensive surgical safety system on patient outcomes. New England Journal of Medicine, 2010. 363(20): p. 1928–1937. [PubMed: 21067384]
- 9. Jameson JK, Transcending intractable conflict in health care: an exploratory study of communication and conflict management among anesthesia providers. Journal of Health Communication, 2003. 8(6): p. 563–581. [PubMed: 14690889]
- 10. Kane M and Smith A, An American tale–professional conflicts in anaesthesia in the United States: implications for the United Kingdom. Anaesthesia, 2004. 59(8): p. 793–802. [PubMed: 15270972]
- 11. Pronovost PJ and Freischlag JA, Improving teamwork to reduce surgical mortality. Journal of the American Medical Association, 2010. 304(15): p. 1721–1722. [PubMed: 20959587]
- 12. Stiegler MP and Ruskin KJ, Decision-making and safety in anesthesiology. Current Opinion in Anesthesiology, 2012. 25(6): p. 724–729. [PubMed: 23128454]
- 13. Stiegler MP and Tung A, Cognitive processes in anesthesiology decision making. Anesthesiology, 2014. 120(1): p. 204–217. [PubMed: 24212195]
- 14. Chau A and Ehrenfeld JM, Using real time clinical decision support to improve performance on perioperative quality and process measures. Anesthesiology Clinics, 2011. 29(1): p. 57. [PubMed: 21295752]
- 15. Durieux P, Nizard R, Ravaud P, Mounier N, and Lepage E, A clinical decision support system for prevention of venous thromboembolism: effect on physician behavior. Journal of the American Medical Association, 2000. 283(21): p. 2816–2821. [PubMed: 10838650]
- 16. Karlen W, Dumont GA, Petersen C, Gow J, Lim J, et al. Human-centered phone oximeter interface design for the operating room. in Proceedings of the International Conference on Health Informatics. 2011.
- 17. Levine WC, Meyer M, Brzezinski P, Robbins J, and Sandberg WS. Computer automated total perioperative situational awareness and safety systems. in International Congress Series. 2005. Elsevier.
- 18. Sim I, Gorman P, Greenes RA, Haynes RB, Kaplan B, et al. , Clinical decision support systems for the practice of evidence-based medicine. Journal of the American Medical Informatics Association, 2001. 8(6): p. 527–534. [PubMed: 11687560]
- 19. Okumura LM, Veroneze I, Bugardt CI, and Fragoso MF, Effects of a computerized provider order entry and a clinical decision support system to improve cefazolin use in surgical prophylaxis: a cost saving analysis. Pharmacy Practice (Granada), 2016. 14(3): p. 0–0.

- 20. Gregory S, Murray-Torres TM, Fritz BA, Abdallah AB, Helsten DL, et al., Study protocol for the Anesthesiology Control Tower—Feedback Alerts to Supplement Treatments (ACTFAST-3) trial: a pilot randomized controlled trial in intraoperative telemedicine. F1000Res, 2018. 7.
- 21. Abraham J, Meng A, Sona C, Wildes T, Avidan M, et al. , An observational study of postoperative handoff standardization failures. International Journal of Medical Informatics, 2021. 151: p. 104458. [PubMed: 33932762]
- 22. Carter J Telemedicine in the operating room: the 'new normal' for MedTech. 2020; Available from: [www.medicaldesignandoutsourcing.com/telemedicine-in-the-operating-room-the](http://www.medicaldesignandoutsourcing.com/telemedicine-in-the-operating-room-the-new-normal-for-medtech/)[new-normal-for-medtech/.](http://www.medicaldesignandoutsourcing.com/telemedicine-in-the-operating-room-the-new-normal-for-medtech/)
- 23. Wicklund E Opening up the OR: using telemedicine to enhance collaboration. 2018; Available from: [mhealthintelligence.com/news/opening-up-the-or-using-telemedicine-to-enhance](http://mhealthintelligence.com/news/opening-up-the-or-using-telemedicine-to-enhance-collaboration)[collaboration](http://mhealthintelligence.com/news/opening-up-the-or-using-telemedicine-to-enhance-collaboration).
- 24. Murray-Torres T, Casarella A, Bollini M, Wallace F, Avidan MS, et al. , Anesthesiology Control Tower—Feasibility Assessment to Support Translation (ACTFAST): mixed-methods study of a novel telemedicine-based support system for the operating room. JMIR Human Factors, 2019. 6(2): p. e12155. [PubMed: 31012859]
- 25. Murray-Torres TM, Wallace F, Bollini M, Avidan MS, and Politi MC, Anesthesiology Control Tower: Feasibility Assessment to Support Translation (ACT-FAST)—a feasibility study protocol. Pilot Feasibility Study, 2018. 4(1): p. 1–9.
- 26. Abd Ghani MK and Jaber MM, The Effect of Patient Privacy on Telemedicine Implementation in Developing Countries: Iraq Case Study. Research Journal of Applied Sciences, Engineering and Technology, 2015. 11(11): p. 1233–1237.
- 27. El-Mahalli AA, El-Khafif SH, and Al-Qahtani MF, Successes and challenges in the implementation and application of telemedicine in the eastern province of Saudi Arabia. Perspectives in health information management/AHIMA, American Health Information Management Association, 2012. 9(Fall).
- 28. Kifle M, Mbarika VW, and Bradley RV, Global diffusion of the Internet X: the diffusion of telemedicine in Ethiopia: potential benefits, present challenges, and potential factors. Communications of the Association for Information Systems, 2006. 18(1): p. 30.
- 29. Panda N and Haynes AB, Prioritizing the patient perspective in oncologic surgery. Annals of surgical oncology, 2020. 27(1): p. 43–44. [PubMed: 31452050]
- 30. Casler K, Bickel L, and Hackett E, Separate but equal? A comparison of participants and data gathered via Amazon's MTurk, social media, and face-to-face behavioral testing. Computers in human behavior, 2013. 29(6): p. 2156–2160.
- 31. Sittig DF and Singh H, A new socio-technical model for studying health information technology in complex adaptive healthcare systems, in Cognitive Informatics for Biomedicine. 2015, Springer. p. 59–80.
- 32. Feldstein AC, Smith DH, Perrin N, Yang X, Simon SR, et al. , Reducing warfarin medication interactions: an interrupted time series evaluation. Archives of Internal Medicine, 2006. 166(9): p. 1009–1015. [PubMed: 16682575]
- 33. Sittig DF, Ash JS, Zhang J, Osheroff JA, and Shabot MM, Lessons from "Unexpected increased mortality after implementation of a commercially sold computerized physician order entry system". Pediatrics, 2006. 118(2): p. 797–801. [PubMed: 16882838]
- 34. Smith DH, Perrin N, Feldstein A, Yang X, Kuang D, et al. , The impact of prescribing safety alerts for elderly persons in an electronic medical record: an interrupted time series evaluation. Archives of Internal Medicine, 2006. 166(10): p. 1098–1104. [PubMed: 16717172]
- 35. Dario C, Luisotto E, Dal Pozzo E, Mancin S, Aletras V, et al. , Assessment of patients' perception of telemedicine services using the service user technology acceptability questionnaire. International journal of integrated care, 2016. 16(2).
- 36. Lau M, Wong R, Bezjak A, and Levin W, Factors that Influence the Acceptability of Telemedicine as a means to Evaluate Treatment Outcome for Patients Completing Palliative Radiotherapy. Journal of Medical Imaging and Radiation Sciences, 2014. 45(2): p. 169.

- 37. Sekhon M, Cartwright M, and Francis JJ, Acceptability of healthcare interventions: an overview of reviews and development of a theoretical framework. BMC health services research, 2017. 17(1): p. 1–13. [PubMed: 28049468]
- 38. Nelson D, Kreps G, Hesse B, Croyle R, Willis G, et al. , The health information national trends survey (HINTS): development, design, and dissemination. Journal of health communication, 2004. 9(5): p. 443–460. [PubMed: 15513791]
- 39. NHS England and Department of Health and Social Care. NHS Patient Surveys. 2018; Available from: [nhssurveys.org](http://nhssurveys.org).
- 40. Fereday J and Muir-Cochrane E, Demonstrating rigor using thematic analysis: a hybrid approach of inductive and deductive coding and theme development. International Journal of Qualitative Methods, 2006. 5(1): p. 80–92.
- 41. Saliba V, Legido-Quigley H, Hallik R, Aaviksoo A, Car J, et al. , Telemedicine across borders: a systematic review of factors that hinder or support implementation. International journal of medical informatics, 2012. 81(12): p. 793–809. [PubMed: 22975018]
- 42. Gillis G, Newsham D, and Maeder A, Global telehealth 2015: integrating technology and information for better healthcare. Vol. 209. 2015: IOS Press.
- 43. Bator EX, Gleason JM, Lorenzo AJ, Kanaroglou N, Farhat WA, et al. , The burden of attending a pediatric surgical clinic and family preferences toward telemedicine. Journal of Pediatric Surgery, 2015. 50(10): p. 1776–1782. [PubMed: 26195452]
- 44. Ure J, Pinnock H, Hanley J, Kidd G, Smith EM, et al. , Piloting tele-monitoring in COPD: a mixed methods exploration of issues in design and implementation. Primary Care Respiratory Journal, 2012. 21(1): p. 57–64.
- 45. Harting MT, Wheeler A, Ponsky T, Nwomeh B, Snyder CL, et al. , Telemedicine in pediatric surgery. Journal of Pediatric Surgery, 2019. 54(3): p. 587–594. [PubMed: 29801660]
- 46. Cooper Z, Scott Morton F, and Shekita N, Surprise! Out-of-network billing for emergency care in the United States. Journal of Political Economy, 2020. 128(9): p. 3626–3677.
- 47. Dekhne MS, Nuliyalu U, Schoenfeld AJ, Dimick JB, and Chhabra KR, "Surprise" out-of-network billing in orthopaedic surgery: charges from surprising sources. Annals of Surgery, 2020. 271(5): p. e116. [PubMed: 32301796]
- 48. Henry TA 11 telehealth tweaks that help team-based care flourish. 2021.
- 49. Franco D, Montenegro T, Gonzalez GA, Hines K, Mahtabfar A, et al. , Telemedicine for the spine surgeon in the age of COVID-19: multicenter experiences of feasibility and implementation strategies. Global Spine Journal, 2020: p. 2192568220932168.
- 50. Al-Samarraie H, Ghazal S, Alzahrani AI, and Moody L, Telemedicine in middle eastern countries: progress, barriers, and policy recommendations. International Journal of Medical Informatics, 2020. 141: p. 104232. [PubMed: 32707430]
- 51. Dodoo JE, Al-Samarraie H, and Alzahrani AI, Telemedicine use in sub-Saharan Africa: barriers and policy recommendations for Covid-19 and beyond. International Journal of Medical Informatics, 2021: p. 104467. [PubMed: 33915421]
- 52. Berinsky AJ, Huber GA, and Lenz GS, Evaluating online labor markets for experimental research: Amazon. com's Mechanical Turk. Political analysis, 2012. 20(3): p. 351–368.
- 53. Buhrmester M, Kwang T, and Gosling SD, Amazon's Mechanical Turk: A new source of inexpensive, yet high-quality data? 2016.
- 54. Minton E, Gurel-Atay E, Kahle L, and Ring K. Comparing data collection alternatives: Amazon Mturk, college students, and secondary data analysis. in AMA Winter Educators' Conference Proceedings. 2013.
- 55. Moss A and Litman L, Demographics of People on Amazon Mechanical Turk, in CloudResearch. 2020, Prime Research Solutions LLC.
- 56. Cheung JH, Burns DK, Sinclair RR, and Sliter M, Amazon Mechanical Turk in organizational psychology: An evaluation and practical recommendations. Journal of Business and Psychology, 2017. 32(4): p. 347–361.
- 57. Goodman JK, Cryder CE, and Cheema A, Data collection in a flat world: The strengths and weaknesses of Mechanical Turk samples. Journal of Behavioral Decision Making, 2013. 26(3): p. 213–224.

#### **Summary table**

#### **What was already known regarding this topic:**

- **•** Clinical decision support systems (CDSS) support intraoperative decisionmaking through streamlined data interpretation to produce patient alerts, documentation and care recommendations.
- **•** Telemedicine is increasingly being adopted within the operating room to provide virtual consultations and real-time feedback to surgical teams.
- **•** Clinicians have found intraoperative CDSS and telemedicine to support resilience in patient safety through reduced workload and a safeguard system for the surgical team.
- **•** Clinicians have identified alert timing, emotional responses, and care redundancy as barriers to the use of intraoperative CDSS and telemedicine.

#### **What this study added to our knowledge:**

- Patients envision intraoperative CDSS and telemedicine (eOR) to enhance surgical team attention and increase patient safety through real-time monitoring and transparency between care teams.
- **•** Patient perceptions of organizational policies, procedures, environment, and culture; workflow and communication; people; and hardware and software are critical dimensions affecting patient acceptability and adoption of the eOR.
- Patients are more comfortable with intraoperative remote monitoring by familiar or local clinicians than by unfamiliar or international clinicians.

## **Highlights**

- **•** Patients perceive intraoperative telemedicine (eOR) to enhance patient safety through real-time remote monitoring.
- **•** Patient perceptions of organizational policies, procedures, environment, and culture; workflow and communication; people; and hardware and software are critical dimensions affecting patient acceptability and adoption of the eOR.
- **•** Patients are more comfortable with intraoperative remote monitoring by familiar or local clinicians than by unfamiliar or international clinicians.



**Figure 1.**  8-dimensional socio-technical model [31].

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## **Guidelines for eOR use**

#### **Figure 2.**

Potential guidelines to enhance patient adoption and use of telemedicine for OR (eOR), adapted from [45]). Blue outlines indicate dimensions of the socio-technical model, grey boxes indicate guidelines, green boxes indicate facilitators to eOR use, and orange boxes indicate barriers to eOR use.

#### **Table 1.**

Example of inductive and deductive thematic analysis.



#### **Table 2.**

Demographic information of participants ( $n = 324$ ).



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#### **Table 3.**

Participants' ratings on telemedicine support for OR, eOR (N=324).



#### **Table 4.**

Barriers and facilitators to patient acceptance of the eOR.





