

Electronic Medical Records: From Risks of Errors to Patient Safety Improvement

Moving Patient Safety Into the 21st Century: Measuring Monitoring and Improving Safety in Real Time with EHRs and AI

David Classen MD MS



A Patient Safety Case in The HIT Era

27 year old women evaluated in the ER for severe lower abdominal pain

Taken to surgery for what was felt to be an acute abdomen

At surgery she was found to be pregnant and the fetus did not survive

On review of the case a problem with interoperability lead to another patients lower abdominal ultrasound report being inadvertently inserted into this patients EHR record



Can CPOE Cause Errors?

JOBNAME: JAMA XML PAGE: 1 SESS 22 OUTPUT: Mon Feb 21 08:12:20 2005 /jama/05jobs/weekly/09mar05/joc42133 DATE: 024806 TME: 15:29 USER: miken

ORIGINAL CONTRIBUTION

Role of Computerized Physician Order Entry Systems in Facilitating Medication Errors

PEDIATRICS

Unexpected Increased Mortality After Implementation of a Commercially Sold Computerized Physician Order Entry System Scott Watson, Trung C. Nguyen, Hülya Bayir and Richard A. Orr

Yong Y. Han, Joseph A. Carcillo, Shekhar T. Venkataraman, Robert S.B. Clark, Richard A Orr.

Pediatrics 2005;116;1506-1512

High Rates of Adverse Drug Events in a Highly Computerized Hospital



Jonathan R. Nebeker, MS, MD; Jennifer M. Hoffman, PharmD; Charlene R. Weir, RN, PhD; Charles L. Bennett, MD, PhD, MPP; John F. Hurdle, MD, PhD

Background: Numerous studies have shown that specific computerized interventions may reduce medication errors, but few have examined adverse drug events (ADEs) across all stages of the computerized medication process. We describe the frequency and type of inpatient ADEs that occurred following the adoption of multiple computerized medication ordering and administration systems, including computerized physician order entry (CPOE).

Methods: Using explicit standardized criteria, pharmacists classified inpatient ADEs from prospective daily reviews of electronic medical records from a random sample of all admissions during a 20-week period at a Veterans Administration hospital. We analyzed ADEs that necessitated a changed treatment plan.

Results: Among 937 hospital admissions, 483 clinically significant inpatient ADEs were identified, accounting for 52 ADEs per 100 admissions and an incidence density of 70 ADEs per 1000 patient-days. One quarter of the hospitalizations had at least 1 ADE. Of all ADEs, 9% resulted in serious harm, 22% in additional monitoring and interventions, 32% in interventions alone, and 11% in monitoring alone; 27% should have resulted in additional interventions or monitoring. Medication errors contributed to 27% of these ADEs. Errors associated with ADEs occurred in the following stages: 61% ordering, 25% monitoring, 13% administration, 1% dispensing, and 0% transcription. The medical record reflected recognition of 76% of the ADEs.

Conclusions: High rates of ADEs may continue to occur after implementation of CPOE and related computerized medication systems that lack decision support for drug selection, dosing, and monitoring.

Arch Intern Med. 2005;165:1111-1116

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THE UNI

ULTIPLE BROAD-BASED studies during the past 15 years have demonstrated that adverse drug events (ADEs) account for up to 41%1 of all hospital admissions and more than \$2 billion annually in inpatient costs.24 Several of these studies have also estimated that as many as a quarter of inpatient ADEs may be preventable through interventions such as computerized physician order entry (CPOE) and related systems.37 On the basis of these projections and the proven success of these systems in identifying ADEs and reducing medication errors,8-11 computerized medication processes have been widely promoted as essential to preventing actual ADEs.^{9,12,13}

Recently, some researchers have questioned the extent to which currently available CPOE and related systems are preventing ADEs.¹⁴⁻¹⁰ There are concerns that features of commercial CPOE products vary widely and that few can match the sophistication of custom systems developed at institutions that have successfully reduced targeted ADEs.^{13,17-21} Moreover, broad-based surveys of ADEs in institutions that have implemented multiple computerized medication systems have not been published; it is unclear how these interventions together have affected the occurrence of ADEs linked to problems across stages of medication processing (ie, ordering, transcription, dispensing, administration, and monitoring).³

The Veterans Administration (VA) Healthcare System, one of the largest integrated delivery systems in the country, is a leader in patient safety and has actively sought to reduce medication errors using multiple computerized interventions such as CPOE,²²⁻²⁸ bar code– controlled medication delivery,^{9,27,28} a complete electronic medical record,^{1,29-31} automated drug-drug interaction checking,³²⁻³⁸ and computerized allergy tracking and alerting.³⁵⁻³⁸ The White House has

Tage Lof 18



The New Bork Strave Https://ngti.ms/2004124



By Henry Darithm

Art. N., 3020

For Alyssa Watrous, the medication mix-up means a pounding headache, nausea and diztness. In September, Ms. Watrous, a 17-year-old from Connecticut, was about to take another asthma pill when she realized CVS had mistakenly given her blood preasure medication intended for someone else.

Edward Walker, 36, landed in an emergency room, his eyes swollen and burning after he put drops in them for five days in November 2016 to treat a mild irritation. A Walgreens in Illinois had accidentally supplied him with ear drops — not eye drops.

For Mary Scheuerman, 85, the error was discovered only when she was dying in a Florida hospital in December 2018. A Public pharmacy had dispensed a powerful chemotherapy drug instead of the antidepressant her doctor had prescribed. She died about two weeks later.

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The Chicago Tribune tested 255 pharmacies to see how often stores would dispense risky drug pairs without warning patients. Fifty-tw percent of the tested pharmacies sold the medications without mentioning the potential interaction. (Chicago Tribune)

By Sam Roe, Ray Long and Karisa King Chicago Tribune

DECEMBER 15, 2016, 8:44 AM

he Tribune reporter walked into an Evanston CVS pharmacy carrying two prescriptions: one for a common antibiotic, the other for a popular anti-cholesterol drug.

Taken alone, these two drugs, clarithromycin and simvastatin, are relatively safe. But taken together they can cause a severe breakdown in muscle tissue and lead to kidney failure and death.

But that's not what happened. The two medications were packaged, labeled and sold within minutes, without a word of caution.

The same thing happened when a reporter presented prescriptions for a different potentially deadly drug pair at a Walgreens on the Magnificent Mile.

And at a Wal-Mart in Evergreen Park, a Jewel-Osco in River Forest and a Kmart in Springfield.

In the largest and most comprehensive study of its kind, the Tribune tested 255 pharmacies to see how often stores would dispense dangerous drug pairs without warning patients. Fifty-two percent of the pharmacies sold the medications without mentioning the potential interaction, striking evidence of an industrywide failure that places millions of consumers at risk.

CVS, the nation's largest pharmacy retailer by store count, had the highest failure rate of any chain in the Tribune tests, dispensing the medications with no warning 63 percent of the time. Walgreens, one of CVS' main competitors, had the lowest failure rate at 30 percent — but that's still missing nearly 1 in 3 interactions.

Health IT and Patient Safety:

Building Safer Systems for Better Care



IOM Recommendation 1 (continued)

b. The Office of the National Coordinator for Health IT (ONC) should expand its funding of processes that promote safety that should be followed in the development of health IT products, including standardized testing procedures to be used by manufacturers and health care organizations to assess the safety of health IT products.

c. ONC and AHRQ should work with health IT vendors and health care organizations to promote post-deployment safety testing of EHRs for high prevalence, high impact EHR-related patient safety risks.

- d. Health care accrediting organizations should adopt criteria relating to EHR safety.
- e. AHRQ should fund the development of new methods for measuring the impact of health IT on safety using data from EHRs.

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EHR Flight Simulator



AHRR

Simulations of EHR Use with CPOE

The assessment pairs medication orders that would cause a serious adverse drug event with a fictitious patient.

A physician enters the order ...

Patient AB

Female 52 years old Weighs 60 kg Allergy to morphine Normal creatinine



and observes and records the type of CDS-generated advice that is given (if any).



FOCUS ON QUALITY

By Jane Metzger, Emily Welebob, David W. Bates, Stuart Lipsitz, and David C. Classen

Mixed Results In The Safety Performance Of Computerized Physician Order Entry

DOI: 10.1377/hlthaff.2010.0160 HEALTH AFFAIRS 29, NO. 4 (2010): 655-663 © 2010 Project HOPE— The People-to-People Health Foundation, Inc.

ABSTRACT Computerized physician order entry is a required feature for hospitals seeking to demonstrate meaningful use of electronic medical record systems and qualify for federal financial incentives. A national sample of sixty-two hospitals voluntarily used a simulation tool designed to assess how well safety decision support worked when applied to medication orders in computerized order entry. The simulation detected only 53 percent of the medication orders that would have resulted in fatalities and 10–82 percent of the test orders that would have caused serious adverse drug events. It is important to ascertain whether actual implementations of computerized physician order entry are achieving goals such as improved patient safety. Jane Metzger (jmetzger2@ csc.com) is a principal researcher at CSC Healthcare in Waltham, Massachusetts.

Emily Welebob is an independent consultant in Indianapolis, Indiana.

David W. Bates is division chief for general internal medicine at Brigham and Women's Hospital in Boston, Massachusetts.

Stuart Lipsitz is a researcher at Brigham and Women's Hospital.

David C. Classen is an associate professor of medicine at the University of Utah in Salt Lake City, and is also with CSC Healthcare.

any people have suggested that electronic health records represent essential infrastructure for the provision of safe health care in the United States. For several years, the Institute of Medicine, the Leapfrog Group, the National Quality In this application of clinical decision support, physicians are made aware of potential safety issues that can result—for example, when ampicillin is given to a patient with a known allergy to penicillin, or the dose being ordered for a pediatric patient is much higher than the therapeutic range for a child of this age and weight. PrescribHospital Scores For Detection Of Test Orders That Would Cause An Adverse Drug Event In An Adult Patient According To The Software Product (Vendor) Implemented





Original Investigation | Health Informatics National Trends in the Safety Performance of Electronic Health Record Systems From 2009 to 2018

David C. Classen, MD, MS; A. Jay Holmgren, MHI; Zoe Co, BS; Lisa P. Newmark, BA; Diane Seger, RPh; Mellissa Danforth, BA; David W. Bates, MD, MSc

Abstract

IMPORTANCE Despite the broad adoption of electronic health record (EHR) systems across the continuum of care, safety problems persist.

OBJECTIVE To measure the safety performance of operational EHRs in hospitals across the country during a 10-year period.

DESIGN, SETTING, AND PARTICIPANTS This case series included all US adult hospitals nationwide that used the National Quality Forum Health IT Safety Measure EHR computerized physician order entry safety test administered by the Leapfrog Group between 2009 and 2018. Data were analyzed from July 1, 2018 to December 1, 2019.

EXPOSURE The Health IT Safety Measure test, which uses simulated medication orders that have either injured or killed patients previously to evaluate how well hospital EHRs could identify medication errors with potential for patient harm.

MAIN OUTCOMES AND MEASURES Descriptive statistics for performance on the assessment test over time were calculated at the overall test score level, type of decision support category level, and EHR vendor level.

RESULTS Among 8657 hospital-years observed during the study, mean (SD) scores on the overall test increased from 53.9% (18.3%) in 2009 to 65.6% (15.4%) in 2018. Mean (SD) hospital score for the categories representing basic clinical decision support increased from 69.8% (20.8%) in 2009 to 85.6% (14.9%) in 2018. For the categories representing advanced clinical decision support, the mean (SD) score increased from 29.6% (22.4%) in 2009 to 46.1% (21.6%) in 2018. There was considerable variation in test performance by EHR vendor and associated variation in national hospital quality reporting metrics by vendor as well.

CONCLUSIONS AND RELEVANCE These findings suggest that despite broad adoption and optimization of EHR systems in hospitals, wide variation in the safety performance of operational EHR systems remains across a large sample of hospitals and EHR vendors. Hospitals using some EHR vendors had significantly higher test scores. Overall, substantial safety risk persists in current hospital EHR systems.

JAMA Network Open. 2020;3(5):e205547. doi:10.1001/jamanetworkopen.2020.5547

Key Points

Question How did safety performance of electronic health record systems (EHRs) change in the US from 2009 to 2018?

Findings In this case series using 8657 hospital-year observations from adult hospitals nationwide that used the National Quality Forum Health IT Safety Measure, a computerized physician order entry and EHR safety test, from 2009 to 2018, mean scores on the overall test increased from 53.9% in 2009 to 65.6% in 2018. There was considerable variation in test performance by hospital and EHR vendor.

Meaning These findings suggest that, despite broad adoption and optimization of EHR systems in hospitals, wide variation in the safety performance of operational EHR systems remains across a large sample of hospitals and EHR vendors, and serious safety vulnerabilities persist in these operational EHRs.

Invited Commentary

Supplemental content and Audio

Author affiliations and article information are listed at the end of this article.



Figure 1. Basic and Advanced Clinical Decision Support Test Scores Over 10 Years

JAMA Network Open. 2020;3(5):e205547. doi:10.1001/jamanetworkopen.2020.5547



Original Investigation | Health Informatics

Inpatient EHR User Experience and Hospital EHR Safety Performance

David C. Classen, MD, MS; Christopher A. Longhurst, MD, MS; Taylor Davis, MSStat, MBA; Julia Adler Milstein, PhD; David W. Bates, MD, MSc

Abstract

IMPORTANCE Despite the broad adoption and optimization of electronic health record (EHR) systems across the continuum of care, serious usability and safety problems persist.

OBJECTIVE To assess whether EHR safety performance is associated with EHR frontline user experience in a national sample of hospitals.

DESIGN, SETTING, AND PARTICIPANTS This cross-sectional study included all US adult hospitals that used the National Quality Forum Leapfrog Health IT Safety Measure and also used the ARCH Collaborative EHR User experience survey from January 1, 2017, to January 1, 2019. Data analysis was performed from September 2020 to November 2022.

MAIN OUTCOMES AND MEASURES The primary outcomes were hospital performance on the Leapfrog Health IT Safety measure (overall and 10 subcomponents) and the ARCH collaborative frontline user experience scores (overall and 8 subcomponents). Ordinary least squares models with survey responses clustered by hospital were used to assess associations between the overall measures and their subcomponents.

RESULTS There were 112 hospitals and 5689 frontline user surveys included in the study. Hospitals scored a mean of 0.673 (range, 0.297-0.973) on the Leapfrog Health IT safety measure; the mean ARCH EHR user experience score was 3.377 (range, 1 [best] to 5 [worst]). The adjusted β coefficient between the overall safety score and overall user experience score was 0.011 (95% CI, 0.006-0.016). The ARCH overall score was also significantly associated with 10 subcategory scores of the Leapfrog Health IT safety score, and the overall Leapfrog score was associated with the 8 subcategory scores of the ARCH user experience score.

CONCLUSIONS AND RELEVANCE This cross-sectional study found a positive association between frontline user-rated EHR usability and EHR safety performance. This finding suggests that improving EHR usability, which is a current well-known pain point for EHR users, could have direct benefits in terms of improved EHR safety.

Key Points

Question is the safety performance of electronic health record (EHR) systems associated with frontline usability of such systems?

Findings In this cross-sectional study of 112 US hospitals from 2017 and 2018, there was a significant association between the overall scores of the National Quality Forum Health IT Safety Measure, a computerized physician order entry and EHR safety test, and the ARCH Collaborative EHR User Experience Survey. In addition, there was an association between the overall EHR Safety Test Score and the subcategory scores on the ARCH Survey mean scores and the overall ARCH Survey score and the subcomponent scores in the EHR Safety Score.

Meaning These findings suggest that EHR safety performance is associated with frontline EHR usability and that current broad efforts to improve EHR usability may be associated with improvements in EHR safety performance as well.

Supplemental content

Author affiliations and article information are listed at the end of this article.

JAMA Network Open. 2023;6(9):e2333152. doi:10.1001/jamanetworkopen.2023.33152



How Reliable is Healthcare

The rate of adverse events in hospital care is: 1. 1in 1,000,000 hospitalizations 2. 1 in 100,000 hospitalizations 3. 1 in 10,000 hospitalizations 4. 1in 1000 hospitalizations 5. 1 in 100 hospitalizations 6. 1 in 10 hospitalizations

U THE UNIVERSITY OF UTAH How safe is care today? Results from Safe Care published January 12, 2023

The NEW ENGLAND JOURNAL of MEDICINE

SPECIAL ARTICLE

The Safety of Inpatient Health Care

David W. Bates, M.D., David M. Levine, M.D., M.P.H., Hojjat Salmasian, M.D., Ph.D., M.P.H., Ania Syrowatka, Ph.D., David M. Shahian, M.D., Stuart Lipsitz, Sc.D., Jonathan P. Zebrowski, M.D., M.H.Q.S., Laura C. Myers, M.D., M.P.H., Merranda S. Logan, M.D., M.P.H., Christopher G. Roy, M.D., M.P.H., Christine Iannaccone, M.P.H., Michelle L. Frits, B.A., Lynn A. Volk, M.H.S., Sevan Dulgarian, B.S., B.A., Mary G. Amato, Pharm.D., M.P.H., Heba H. Edrees, Pharm.D., Luke Sato, M.D., Patricia Folcarelli, Ph.D., R.N., Jonathan S. Einbinder, M.D., M.P.H., Mark E. Reynolds, B.A., and Elizabeth Mort, M.D., M.P.H.

ABSTRACT

BACKGROUND

Adverse events during hospitalization are a major cause of patient harm, as documented in the 1991 Harvard Medical Practice Study. Patient safety has changed substantially in the decades since that study was conducted, and a more current assessment of harm during hospitalization is warranted. JOURNAL REPORTS: HEALTHCARE

Why Hospitals Still Make Serious Medical Errors—and How They Are Trying to Reduce Them

Some medical mistakes have been stubbornly hard to eliminate. Now, hospitals hope technology can make a difference.



Hospitals are using technology in a new effort to target medical errors. ILLUSTRATION: JON KRAUSE

By Laura Landro March 12, 2023 10:00 am ET

ERRORS & ADVERSE EVENTS

By David C. Classen, Roger Resar, Frances Griffin, Frank Federico, Terri Frankel, Nancy Kimmel, John C. Whittington, Allan Frankel, Andrew Seger, and Brent C. James

'Global Trigger Tool' Shows That Adverse Events In Hospitals May Be Ten Times Greater Than Previously Measured

DOI: 10.1377/hlthaff.2011.0190 HEALTH AFFAIRS 30, NO. 4 (2011): -© 2011 Project HOPE---The People-to-People Health Foundation, Inc.

ABSTRACT Identification and measurement of adverse medical events is central to patient safety, forming a foundation for accountability, prioritizing problems to work on, generating ideas for safer care, and testing which interventions work. We compared three methods to detect adverse events in hospitalized patients, using the same patient sample set from three leading hospitals. We found that the adverse event detection methods commonly used to track patient safety in the United States today-voluntary reporting and the Agency for Healthcare Research and Quality's Patient Safety Indicators—fared very poorly compared to other methods and missed 90 percent of the adverse events. The Institute for Healthcare Improvement's Global Trigger Tool found at least ten times more confirmed, serious events than these other methods. Overall, adverse events occurred in one-third of hospital admissions. Reliance on voluntary reporting and the Patient Safety Indicators could produce misleading conclusions about the current safety of care in the US health care system and misdirect efforts to improve patient safety.

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Roger Resar is a senior fellow at the Institute for Healthcare Improvement, in Cambridge, Massachusetts.

Frances Griffin is a faculty member at the Institute for Healthcare Improvement.

Frank Federico is an executive director at the Institute for Healthcare Improvement.

Terri Frankel is a director at the Institute for Healthcare Improvement.

Nancy Kimmel is director of quality and safety at the Missouri Baptist Medical Center, in St. Louis.



EXHIBIT 4

Adverse Event Detection, By Severity Level And Hospital

	IHI Global Trigger Tool	AHRQ Patient Safety Indicators	Hospital voluntary reporting system
SEVERITY LEVEL			
E	204	23	0
F	124	7	2
G	8	1	2
Н	14	0	0
1	4	4	0
Total	354	35	4
HOSPITAL			
Hospital A	161	13	0
Hospital B	92	13	3
Hospital C	101	9	1
Total	354	35	4



The NEW ENGLAND JOURNAL of MEDICINE

SPECIAL ARTICLE

Temporal Trends in Rates of Patient Harm Resulting from Medical Care

Christopher P. Landrigan, M.D., M.P.H., Gareth J. Parry, Ph.D., Catherine B. Bones, M.S.W., Andrew D. Hackbarth, M.Phil., Donald A. Goldmann, M.D., and Paul J. Sharek, M.D., M.P.H.



Summary Of Medicare OIG Trigger Tool Studies 2008-2018

Rates of All Cause Harm Found in Different Settings of Care

> Hospitals 27%--25% Skilled Nursing Facilities 33% Rehab Units 29% Nursing Homes 43%



U.S. Department of Veterans Affairs

Public Access Author manuscript

Qual Manag Health Care. Author manuscript; available in PMC 2015 September 15.

Identifying Previously Undetected Harm: Piloting the Institute for Healthcare Improvement's Global Trigger Tool in the Veterans Health Administration





The Foundation: Automated GTT the "First Step" to Real-time Patient Safety

IDEAS AND OPINIONS

Measuring Patient Safety in Real Time: An Essential Method for Effectively Improving the Safety of Care

Author Insight Video - Donald Berwick, MD (3:25)

In this video, Donald Berwick, MD, offers additional insight into the article, "Measuring Patient Safety in Real Time: An Essential Method for Effectively Improving the Safety of Care."



Don Berwick - "Using the EHR for Safety" via pascalmetrics.com

Conclusion: "All hospitals should use their EHRs ["as a lens"] to measure harm and better guide and monitor the real effect of their patient safety efforts."



CMS New Patient Safety Measure

Measure the occurrence of harm to patients in the hospital setting, using data from electronic health records (EHR) Using Electronic IHI Global Triggers Develop a quality measure that allows for comparison across hospitals to incentivize improvements Consider a wide range of harms for potential inclusion Identify limited set of harms initially and expand measure over time ultimately a composite safety measure Initial 7 trigger based safety measures undergoing hospital testing



New CMS Harms Measures

Opioid-Related Adverse Events Pressure Injury Hypoglycemia Hyperglycemia Acute Kidney Injury Medication-Related Bleeding *Falls*

QUALITY OF CARE

By David Classen, Michael Li, Suzanne Miller, and Drew Ladner

An Electronic Health Record-Based Real-Time Analytics Program For Patient Safety Surveillance And Improvement

ABSTRACT Twenty years after publication of the report To Err Is Human, studies demonstrate persisting high levels of patient harm. Most patient safety measurement remains highly retrospective, relying on voluntary reporting and post discharge administrative coding. Progress has been limited by the lack of advances in measurement accuracy, detection sensitivity, and timely actionability. The broad adoption of electronic health records (EHRs) offers a significant opportunity to leverage digital information to improve safety measurement and management using real-time data. We developed a novel method to extract safety indicators from EHRs to identify harm and its precursors by implementing a patient safety active management system (PSAM) in hospitals within a national Patient Safety Organization (PSO). The PSAM generated validated adverse event outcomes and leveraged EHR data to develop a real-time safety predictive model. This study describes the PSAM's pilot at two large community hospitals in 2014–17. We found that the PSAM could detect harm in real time, at higher rates than current levels are detected, and that such harm could be predicted. In addition to outlining future opportunities and challenges with this EHR-enabled PSAM approach, we discuss implications and next steps for policy and practice.

PATIENT SAFETY ORGANIZATION (PSO) REAL-TIME PATIENT SAFETY & IMPROVEMENT

Healthcare Provider



PSO

✓ Enabling healthcare systems at each level of care to anticipate and avoid/ameliorate patient harm and related cost







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Results – Identification: EHR-based vs. Industry Standard, i.e.Voluntary Event Reporting (VER)

Illustrative Example: I Hospital with Strong Culture Over 7 Years



Christine Sammer, DrPH, RN; Susanne Miller, RN, MS; Cason Jones, MLS, MHA; Antoinette Nelson, RN, BSN, MSHSA; Paul Garrett, MD; David Classen, MD, MS; David Stockwell, MD

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Results – Reduction: Specific Harm, System-wide



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The data elements in the table below contribute to this patient's cumulative safety risk, represented by the Global Safety Risk score. They reflect parts of the patient's current clinical state as well as clinical information that occurred earlier in the hospitalization.

You can click each GSR score to see the data elements for that specific score

Currently Viewing: 01/22/2014 05:00:00 | GSR: MODERATE 18

RANKING 👻	DATA ELEMENT	VALUE	DATE/TIME
1	Hct	21.7%	01/07/2015 11:23:31
2	Number of surgies	2	01/06/2015 11:44:00
3	Hgb	6.9 g/dL	01/07/2015 11:23:31
4	WBC	20.9X10'3/microL	01/07/2015 11:23:31
5	Platelet	674.0x10'3/microL	01/06/2015 11:44:00
6	Platelet	674.0x10'3/microL	01/06/2015 11:44:00
7	Braden Total	16.0	12/28/2014 20:00:00

Pascal HealthBench -		P	atient Look Up	P richard.feyn	nan@pascalmet	rics.com 🔻
Risk Trigger Monitoring	Safety Dashboard	Monitoring	Worklist	Authenticate	Approve	Reports
Safety Dashboard Southwest Regional, Johnson Hospital Memorial Medical Center In Patient Unit Johnson Hopital Memorial Medical Center					BETA	VERSION

ICU-JHMMC Patients in thins Unit by Global Safety Risk (i)



CURRENT GLOBAL SAFETY RISK 🔫	PATIENT NAME	AS OF	ROOM	POSITIVE TRIGGERS	AEs
✓ HIGH .84	Allen, Jonathan	8/5/2014 06:57	305-2	3	1
₩ нісн.7	Alejo, Smith	9/5/2014 07:57	302-1	2	2
✓ HIGH .62	Matthew, James	8/5/2014 06:57	307-4	-	1
MODERATE .58	Bennet, Jacob	8/5/2014 06:57	305-5	2	1
MODERATE .57	Allen, Jonathan	8/5/2014 06:57	205-1	3	1
MODERATE .51	Robinson, Alicia	8/5/2014 06:57	305-2	-	1
MODERATE .46	Alejo, Smith	8/5/2014 06:57	300-1	-	1
MODERATE .42	Allen, Jonathan	8/7/2014 07:33	305-2	-	1
₩ LOW .23	Matthew, James	8/5/2014 06:57	101-1	3	1
	Bennet, Jacob	8/5/2014 06:57	305-2	1	1

PASCAL HEALTHBENCH -			Patient Look Up 💡	richard.feyn	nan@pascalmetrics.com 👻	
Risk Trigger Monitoring	HARM PREDICTION Safety Dashboard	HARM IDENTIFICATION Monitoring Worklist	Authenticate	Approve	SAFETY OUTCOMES Reporting & Analytics	

Safety Dashboard Southwest Regional: County Hospital Memorial Medical Center

Latest Global Safety Risk (GSR) score calculation: 03/09/2015 05:00





ROBERT WOOD JOHNSON PROJECT

Share real time EHR based electronic safety information with patients, families, and care givers across multiple IT platforms as part of their own integrated care across the continuum of care

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John Smith Born: 1/1/1960		Му	Safe Overal	ty Ad II Risk S	visor core			Nurse Jill Jo Conta	e Manager: nes act info	
High Risk							مر			
Moderate Risk					~					
Low Risk	0	0								
1d 3d 1wk 1mo all	8/1/2014 8/1/2 18:58 18: 18:	2014 8/1/2014 58 18:58	8/1/2014 18:58	8/1/2014 18:58	8/1/2014 18:58	8/1/2014 18:58	8/1/2014 18:58			
My Safety Issues Today	Questions you	should ask	т	hings you	u can do			•	More Information	
You have tested positive for a bacteria in your urine	Why did this hap What can I do to happening again What will you do from happening	pen? prevent this from o to prevent this again?	Talk to why thi can be Make s how it i If you le sure yo	your doctor is happened avoided in t ure you und is being trea eave the hos u have deta	and nurses t and how thi he future erstand the s ted spital with a u	o make sure s should be source of th urinary cath ons for how	e you under treated , an is infection a eter in place to care for i	stand d how it and e make it	Medline Plus on Urine Culture	
Yesterday -										
Your stool has tested positive for a bacteria called C. difficile	Why did this ha What can I do to from happening What will you d from happening	ppen? o prevent this g again? o to prevent this g again	Always the rest Make s nurses, seeing	wash your h troom ure everyon therapists, you	nands and na e who treats etc.) Wash tl	ils before ea you in the l heir hand be	ating and aft hospital (doo efore and af	er using ctors, ter	Medline Plus on C. Difficile	
	Make note of yo	our question	At hom bleach	e make sure	e all clothes a	re washed v	with soap ar	nd		V

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Real Time Safety Patient Mobile App





Clinical Trial Impact on Patient Outcomes

Primary Outcomes

- Higher PAM Scores in E Dashboard User
- Lower 30 day readmission in High E Dashboard User
- Lower 30 day mortality in High E E Dashboard User

Secondary Outcomes

- No Increase in Fear Response
- Very Good Patient Acceptance and Value
- Good Usability Scores
- Heavy use of I-Phone and Family at Home Use







All Cold Rinses



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Artificial Intelligence-Definitions

The theory and development of computer systems able to perform tasks that normally require human intelligence, such as visual perception, speech recognition, decision-making, and translation between languages (Oxford)

Artificial Intelligence or sometimes called machine intelligence, is intelligence demonstrated by machines, in contrast to the natural intelligence displayed by humans and other animals. Some of the activities that it is designed to do is speech recognition, learning, planning and problem solving. (Wiki)

Artificial intelligence (AI) applies advanced analysis and logicbased techniques, including machine learning, to interpret events, support and automate decisions, and take actions. (Gartner)

Background- AI at Healthcare Systems

Concise Research Report | Published: 08 April 2022

Predictive Analytics Programs at Large Healthcare Systems in the USA: a National Survey

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- In 2021, a partnership with SI helped conduct one of the first surveys examining how U.S. healthcare systems integrate artificial intelligence-derived predictive models (AIDPM) into everyday clinical care
- The landscape has changed substantially, so we modified and repeated the study to assess for practice changes, this time with
 a focus on use cases and on how to integrate health equity into this work
- Response rate 60% (25/42) in 2021, down to 38% (25/65) in 2023, but a wider net was cast

Teams and Governance





Use Cases



• Although the vast majority of organizations (96%) use their AIDPM to produce CDS tools, when looking at the "most used" categories, business-facing tools come out ahead.

Large Language Models (LLMs)



Barriers to Incorporating AIDPM in Healthcare



Acceptance of AIDPM by patients

Google Algorithm Aims to Identify At-Risk Kidney Injury Patients

DeepMind unit's effort marks new application of machine learning in health care, but experts say model needs further testing before being applied in a live hospital setting

By Parmy Olson and Brianna Abbott

July 31, 2019 at 1:00 pm ET



The Streams app can use AI-powered software to detect the risk of kidney damage. PHOTO: DEEPMIND

Google's artificial-intelligence unit says it has developed an algorithm that can predict who

TECH

Special Article

A COMPUTER-ASSISTED MANAGEMENT PROGRAM FOR ANTIBIOTICS AND OTHER ANTIINFECTIVE AGENTS

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ABSTRACT

Background and Methods Optimal decisions about the use of antibiotics and other antiinfective agents in critically ill patients require access to a large amount of complex information. We have developed a computerized decision-support program linked to computer-based patient records that can assist physicians in the use of antiinfective agents and improve the quality of care. This program presents epidemiologic information, along with detailed recommendations and warnings. The program recommends antiinfective regimens and courses of therapy for particular patients and provides immediate feedback. We prospectively studied the use of the computerized antiinfectives-management program for one year in a 12-bed intensive care unit.

Results During the intervention period, all 545 patients admitted were cared for with the aid of the antiinfectives-management program. Measures of processes and outcomes were compared with those for the 1136 patients admitted to the same unit dur-

ACED with an increasing loss of autonomy in the managed care marketplace, physicians often view the debate about the quality of care as simply about finding ways to reward them for doing less for patients and to control costs by the use of arbitrary rules for clinical care.¹ Skeptics view quality-of-care projects as a disguised form of marketing; this skepticism will not disappear until physicians can see quality-of-care efforts that make difficult decisions easier and more accurate.^{2,3} Establishing systems for improving care is difficult, at best, for groups of specialist physicians, but it is next to impossible for physicians working alone or for those who are employees in large bureaucratic organizations.⁴ Both the provision of care and the monitoring of its quality depend on data that are often not available either in paper medical records or in administrative and billing data bases. Elaborate clinical computer systems, which are increasingly mileble and vitel for bealth care enconigations

TAdjusted Outcomes of Patients Who Received Antiinfective Agents

During Intervention Period

VARIABLE	INTERVENTION PERIOD	OVE	RALL
	Computer Regin	nen Computer Regim	en P VALUE
	Followed	Overridden	
	(N=203)†	(N=195)‡	
No. of different antiifective agents ordered	1.5 (1.3-1.7)	2.7 (2.5-3.0)	< 0.001
Duration of antiinfective therapy - hr.	103 (45-160)	330 (270-392)	< 0.001
No. of antiinfective-agent doses	11.4 (6.2-16.7)	27.6 (22.0-33.1)	< 0.001
Days of excessive antiinfective dosage	1.4 (0-2.7)	3.6 (2.0-5.1)	< 0.001
Cost of antiinfective agents - \$	102 (0-206)	427 (316-538)	< 0.001
No. of microbiology cultures	3.2 (1.5-4.9)	10.6 (8.7-12.6)	< 0.001
Length of stay in ICU - days	2.7 (1.5-4.0)	8.3 (7.0-9.5)	< 0.001
Days from ICU admission to hospital dischar	rge 7.8 (5.9-9.7)	14.3 (12.2-16.3)	< 0.001
Total length of stay - days	10.0 (7.7-12.3)	16.7 (14.2-19.1)	< 0.001
Total cost of hospitalization - \$	26,315 (20,393-3	32,237) 44,865 (38,56	64-51,166) <0.001

*Values shown are means per patient and 95 percent confidence intervals. Outcome variables have been adjusted for age, sex, Computer Severity Index score on admission to the Shock-Truama-Respiratory Intensi Care Unit (ICU), medical service, and mortality.

†These patients always received the computer-suggested antiinfective regimen.

‡These patients did not always receive the computer-suggested antiinfective regimen.

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00000000 Doe, Jane Q E606 67yr F	Dx:ABD SE	PSIS	
» Max 24 hr WBC=21.0↓ (21.3) Admit:07/27	7/98.14:55	Max 24hr	Temp=38.7 [↑] (38)
Patient's Diff shows a left shift, max 24hr ba	ands = $22 \uparrow ($	11)	
» RENAL FUNCTION: Decreased, CrCI =	50, Max 24hr	Cr= 1.0↓ (1.1)	IBWeight: 58
» ANTIBIOTIC ALLERGIES: Ampicillin,			
» CURRENT ANTIBIOTICS:			
1. 07/29/98 5DAYS TROVAFLOXACI	N (TROVAN),	VIAL 300. Q	24 hrs
2. 08/01/98 2DAYS AMPHOTERICIN	B (FUNGIZO	NE), VIAL 35Q	24 hrs
Total amphotericin given = $70mg$ K=	3.6mg/dl 08	8/03/98 MAG	i= 2.5mg/dl 08/03/
» » » IDENTIFIED PATHOGENS	SITE	COLLEC	CTED
p Gram negative Bacilli Peritoneal I	-luid 07/27	/98.17:12	
Yeast Perite	oneal Fluid	07/27/98.17:12	2
Torulopsis glabrata Perit	oneal Fluid	07/27/98.17:12	2
» THERAPEUTIC SUGGESTION DOS	AGE ROU	TE INTERV	AL
Imipenem 500mg	IV	*q12h (infuse o	over 1hr)
Amphotericin B 35mg	IV q24h	n (infuse over 2-	4hrs)
Suggested Antibiotic Duration: 10 days			
*Adjusted based on patient's renal function			
P=Prelim; Susceptibilities based on antibic	gram or same	e pathogen w/	suscept.
<1>Micro <2>OrganismSuscept, <3>Dr	ug into, <42	>ExplainLogic,	<5>Empiric Abx,
<6>ADX HX <7>ID RNds, <8>Lab/ADX L	eveis, <9>X	kray, <10>Dat	a Input Screen,
<pre><esc>EXII, <f1>Help, <u>UserInput, </u></f1></esc></pre>			DIF 12>Change Pa
$\downarrow \downarrow$, \cup KDEK:<">Suggested Abx, <ente< td=""><td>r>Other Abx,</td><td> U/C ADX,</td><td>< - >IVIODITY ADX,</td></ente<>	r>Other Abx,	U/C ADX,	< - >IVIODITY ADX,



Logic Used to Help Select Suggested Antibiotics

Patient should receive IV antibiotics. Suggested antibiotics are not one of patient's known antibiotic allergies. **Renal function dictates that dosage should be adjusted. Coagulase negative Staph.** In sputum or urine was not considered a pathogen. Cultures show fungi or yeast that were not considered pathogens. Aminoglycosides potentiate ototoxicity if administered with loop diuretics. **Amphotericin B is suggested for serious fungus infections.** S. maltophilia is generally not pathogenic unless found in sterile site. A staph or gram+ cocci reported in the blood was considered a contaminant. *Ceftazidime is usually suggested until gram negative bacillus is identified. Suggested antibiotics should include Rx for possible abdominal anaerobes. Suggest fluconazole for C. albicans in non immunosupressed patients. **Prophylactic antibiotics are not suggested for this patient at this time. Identified pathogens are covered by the suggested antibiotic(s).** Suggested antibiotic(s) are least expensive of the appropriate antibiotics.

> The antibiotic suggestions should not replace clinical judgement. Press the 'Enter' key for next screen...

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IHC ANTIBIOTIC ASSISTANT-Empiric Use

00000000	Doe, John Q	E605	22yr M	Dx: TRAUMA, MULTIPLE FX	-11-3
			Innatient F	E = Dioou Iospital - acquired	
PAST 5 YE	EARS		Inputiont	PAST 6 MONTHS	
ORGANI	SM	#	(%)	ORGANISM # (%)	
Staph. Coag	ulase neg.	208	(61)	Staph. Coagulase neg.14 (50)	
Enterococcu	IS	28	(8)	Escherichia coli 8 (29)	
Escherichia	coli	27	(8)	Enterobacter cloacae 2 (7)	
Staph. Aureu	18	18	(5)	Staph. Aureus 1 (4)	
Pseudomona	as aeruginosa	13	(4)	Pseudomonas aeruginosa1. (4)	
	TOTAL	294	(86)	TOTAL 26 (94)	
ANTIBIOTI	[C	(%)	COST/24hr	ANTIBIOTIC (%)	COST/24hr
Vancomyc+	Amikacin	(99)	\$116.33	Vancomyc+Tobramyci	(100) \$ 46.67
Vancomyc+	Ticar/cla	(99)	74.53	Vancomyc+Amikacin	(100) 116.33
Vancomyc+	Tobramyci	(98)	46.67	Vancomyc+Piperacil	(100) 74.97
Vancomyc+	Ceftazidi	(98)	57.03	Vancomyc+Ceftazidi	(100) 57.03
Vancomyc+A	Aztreonam	(98)	60.24	Vancomyc+Aztreonam	(100) 60.24
	EMPIR	IC AN	TIBIOTIC SU	GGESTION: Vancomyc+Tobramy	ci

>>ANTIBIOTIC ALLERGIES:None reported>>RENAL FUNCTION: Normal, CrCl: >120,Max 24hr Cr= $.6 \downarrow$ (.7)IBWeight: 67kgEnter <*> to order suggested antibiotics, press <Enter> to continue. . .



ANTIBIOTIC HISTORY

IMIPENEM/CILASTATIN (PRIMAXIN), VIAL 500. 07/27/98.15:49-07/27/98.19:51 AS D IMIPENEM/CILASTATIN (PRIMAXIN), VIAL 500. 07/27/98.19:51-07/27/98.19:43 0 6 FLUCONAZOLE IN NS (DIFLUCAN), IVPB 400. 07/28/98.09:45-08/01/98.10:38 Q 24 07/28/98.19:43-07/29/98.16:07 IMIPENEM/CILASTATIN (PRIMAXIN), VIAL 500. Q 8 TROVAFLOXACIN (TROVAN), VIAL 500.Q 24 07/29/98.15:53-VANCOMYCIN (VANCOCIN), VIAL 1000. 08/01/98.10:09-08/03/98.07:26 Q AMPHOTERICIN B (FUNGIZONE), VIAL 35 08/01/98.10:38-08/01/98.12:37 Q 08/01/98.12:37- AMPHOTERICIN B (FUNGIZONE), VIAL 35. Q 24 VANCOMYCIN (VANCOCIN), VIAL 1000. Q 08/03/98.07:26-08/03/98.07:29 08/03/98.07:29- VANCOMYCIN (VANCOCIN), VIAL 1000.Q 24 MAG= 2.5mg/dl 08/03/98 K= 3.6mg/dl 08/03/98

Press <Enter> to return

THE UNIVERSITY OF UTAH PATIENT NAME Pt. # I 07/26/98 C 22Y M E605 07/29/98.22:38 -RESPC (ROUTINE CULTURES) -Complete/Final/Verified-**Sputum Suctioned** Source: Gram. 2+ PMNs, Rare Gram Positive Cocci, Rare Gram Positive Baci Stain: Findings: Mixed Oral Flora Result: 2+ Staphylococcus aureus S: Cefazolin, Cefotaxime, Ceftriaxone, Cefuroxime, Clindamycin Levofloxacin, Nagcillin, Tetracycline, Trimethoprim/Sulfa R: Ampicillin, Penicillin Method: MIC Result: 2+ Neisseria species Result: 2+ Hemophilus species Beta Lactamase Negative Findings: Result: 2+ Streptococcus alpha hemolytic 1+ Yeast Result: 1+ Streptococcus beta hemolytic, Not Group A Result: Result: 1+ Diphtheroids Bacilli -BLDC (BLD CULTURE) 07/29/98.22:26 -Complete/Final/Verified-**Blood Right ARM** Source:

Findings: No Growth in 5da

-Press <Enter> to continue, <Esc> to quit, <Page Up>, <Page Down> or Arrow keys

- . ANTIBIOTIC: IMIPENEM
- 2. DOSAGE: 500mg IV q6h (infuse over 1hr)
- ADMINISTRATION: Drug should be diluted in at least 100ml of compatible fluid and infused over 40-60 minutes.
- PATIENT IV COST/24hr: \$75.92500mgIV q6h (infuse over 1hr)
- AVERAGE PO COST/24hr:IV Drug Only
- 5. INDICATIONS: Extremely broad spectrum of activity including, gram-positive, gram negative, and anaerobic organisms. In addition to its broad spectrum of activity, the drug is extremely betalactamase stable. Imipenem is often active against P. aeruginosa that is resistant to other antimicrobials. It is the DRUG OF FIRST CHOICE for Acinetobacter. Its use in meningitis is currently not recommended.
- . PROPHYLAXIS: Not indicated.
- B. PHARMACOLOGY: Peak serum conc.= 30-40mcg/ml (500mg); Protein binding= 20%; Half-life= 0.9hrs; Vd= 0.15 L/kg; 70% excreted unchanged in the urine. Renal Failure: CLcr= 80-50 ml/min: 0.5g q6-8h; 50-10 ml/min: 0.5g q8-12h;
 <10 ml/min: 0.25-0.5g q12h. Hemodialysis: 0.25-0.5g dose after dialysis.

Press the 'Enter' key for next screen. . .



Reasons for Antibiotic Disagreement

ANTIBIOTICS NEEDED ...

1. Patient has infection that is not identified by computer program.

2. Computer suggested antibiotics are not adequate for patient's therapy.

3. Patient has positive cultures collected before admission to this hospital.

4. Patient has positive Xray taken before admission to this hospital.

5. Patient's Xrays suggest antibiotic therapy is needed.

6. Patient's admit diagnosis warrants the use of antibiotic therapy.

7. Patient needs antibiotic(s) for surgical prophylaxis.

8. Patient needs antibiotic(s) due to contaminated or dirty surgery.

9. Do not agree with dosage suggested by computer program.

ANTIBIOTICS NOT NEEDED ...

10. Computer identified pathogens are incorrect.

11. Do not believe computer identified respiratory infection is correct.

12. Patient's Xrays do not warrant antibiotic therapy.

13. Other

Please select the main reason why you do not agree with the computer suggested antibiotic therapy for this patient.



Questions?