

Can Big Data Drive Better Care for AKI? Leveraging Big Data in AKI and CRRT

Sean M Bagshaw, MD, MSc

Department of Critical Care Medicine, University of Alberta

AKI & CRRT 2018, San Diego, California

Thursday, March 8, 2018 – T4 12:30 – 2:00 pm

2018 Disclosures

- **Speaking/consulting:** Baxter Healthcare Corp.
- **Steering Committee:** Spectral Medical Inc.

Objectives

- Describe the elements necessary for the development and implementation of an e-alert for AKI
- Describe the importance of education, audit and feedback and integrated clinical decision support during the implementation of an e-alerts for AKI
- Appreciate the limitations and barriers to implementation of e-alerts for AKI

Not a new idea.....NEJM 1968

Vol. 278 No. 11

MEDICAL RECORDS THAT GUIDE AND TEACH—WEED

593

SPECIAL ARTICLE

MEDICAL RECORDS THAT GUIDE AND TEACH

LAWRENCE L. WEED, M.D.*

THE beginning clinical clerk, the house officer and the practicing physician are all confronted with conditions that are frustrating in every phase of medical action. The purpose of this article is to

9/10

Pt. received 40 units of regular insulin yest. because of B & 4+ urine sugars. Got 2000 cc Amigen yest. & 500 cc D₅W. Was febrile all night up to 40 at 8 PM this gradually came down to 39. 8 PM yest. suctioned & coughed up c̄ return of ½ cup of thick white sputum — cultured also blood cultures. Was in must. tent c̄ mucomist overnight. At 4 PM yest had B-R base. Sputum smear unremarkable — WBC's but no bacteria.

9/10-12:30

10 o'clock urine 2-3+/0. Given 10 U. reg. ins. at 12:30 PM. Temp. down to 38? Suctioned N.T. c̄ little return. However during suctioning pt. vomited 100-150 cc green fluid. Proximal jejunostomy tube draining well now.

9/11-9 AM

Urine 3+ given 10 U reg. insulin. Pt. was hiccuping all night & this AM. Levine tube passed c̄ 900-1000 cc bileous fluid removed. Jejunos-

acceptance and use of paramedical personnel and a more positive attitude about the computer in medicine. Eventually, for every physician all three areas will be an obligatory part of his professional envi-

Imp: prob. resolving now

Plan: KUB and continue small feedings

d. *Sepsis:* afebrile now on Ampicillin. see flow sheet. Reculture tomorrow.

b. *RLL Pneumonia:* Film of 9/28 shows some ↑ in this process. Will repeat P.A. chest tomorrow & cultures.

e. *Colonic-Cutaneous Fistula:* Continues to drain semi-formed stool several times per day; the problem is that stool drains onto granulating abd. wound.

Plan: culture stool; Remove some non-func stay sutures; Freq dressings & consider colostomy bag for fistula

10/3

#1 *Chronic Relapsing Panc.:*

c. *Panc. insufficiency:* Cotazyn-B will be begun (special purchase)

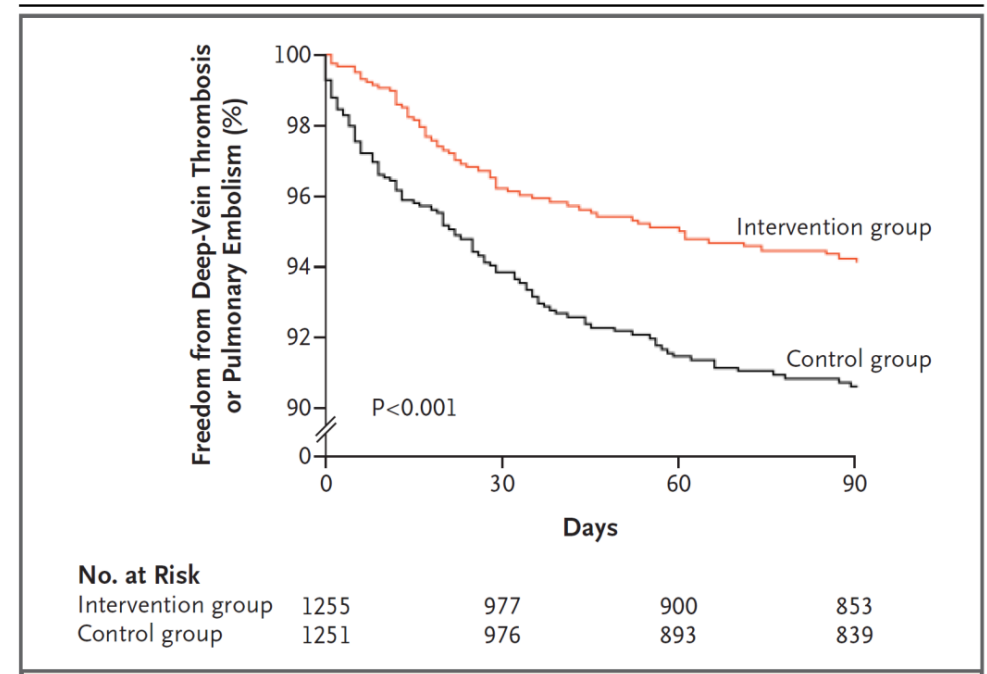
Electronic Alerts to Prevent Venous Thromboembolism among Hospitalized Patients

Nils Kucher, M.D., Sophia Koo, M.D., Rene Quiroz, M.D., M.P.H., Joshua M. Cooper, M.D., Marilyn D. Paterno, B.S., Boris Soukonnikov, M.S., and Samuel Z. Goldhaber, M.D.

RCT of EHR-generated alert for patients at high risk for VTE (n=2506) ~ MD had to acknowledge alert but could decide on whether to order or withhold

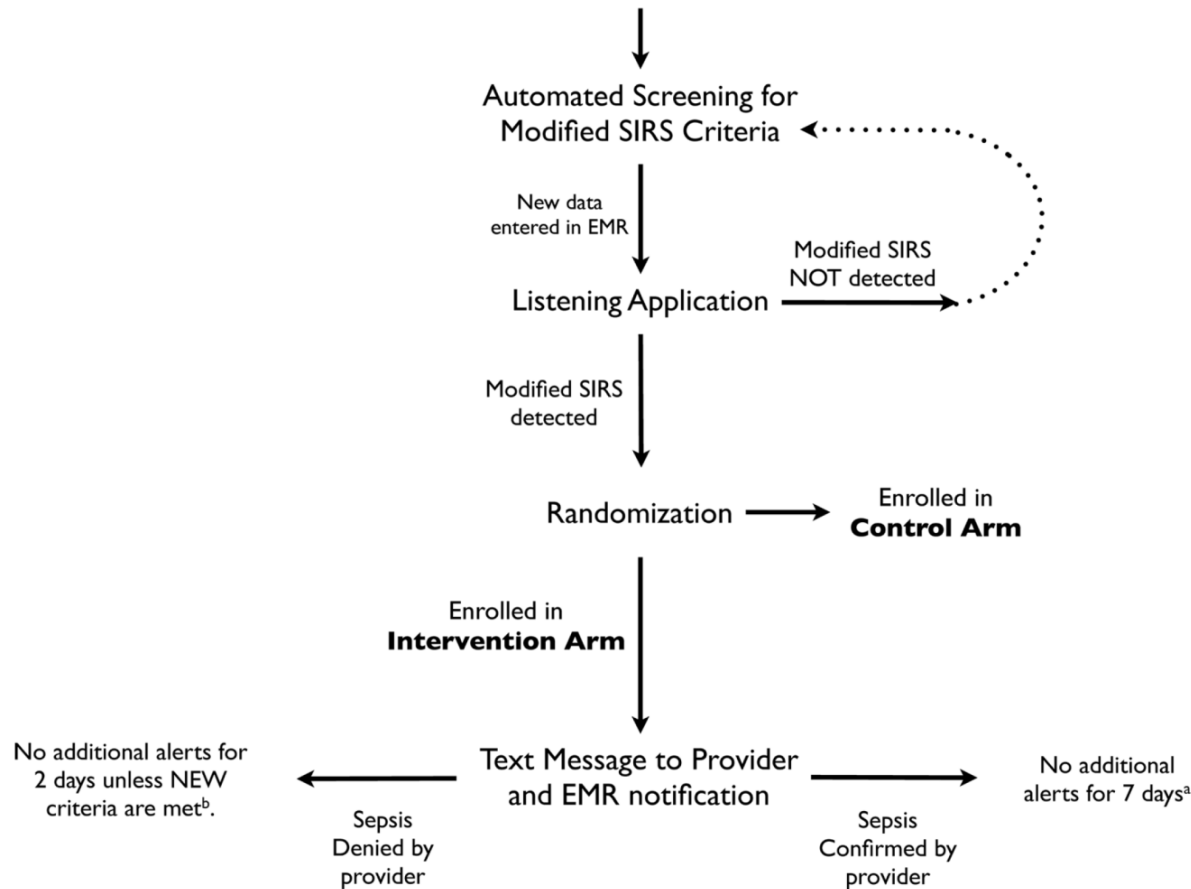
Table 2. Prophylactic Measures against Venous Thromboembolism.

Measure	Intervention Group (N=1255)	Control Group (N=1251)	P Value
	<i>no. of patients (%)</i>		
Mechanical	125 (10.0)	19 (1.5)	<0.001
Compression stockings	52 (4.1)	7 (0.6)	<0.001
Pneumatic boots	73 (5.8)	12 (1.0)	<0.001
Pharmacologic	296 (23.6)	163 (13.0)	<0.001
Unfractionated heparin	213 (17.0)	81 (6.5)	<0.001
Warfarin	28 (2.2)	41 (3.3)	0.11
Enoxaparin	55 (4.4)	41 (3.3)	0.18



Randomized trial of automated, electronic monitoring to facilitate early detection of sepsis in the intensive care unit*

Admission to the MICU



Variable	Intervention	Controls	P
Time to Abx	6.0 (2.4-18.8)	6.1 (2.5-21.0)	0.95
6-hr fluid administration	1019 (1241)	964 (1196)	0.57
ICU stay	3.0 (2.0-5.0)	3.0 (2.0-4.0)	0.22
Hospital stay	5.7 (2.8-10.5)	4.7 (2.7-8.1)	0.08
Mortality	14%	10%	0.29

Vitaly Herasevich
Murat Yilmaz
Hasrat Khan
Rolf D. Hubmayr
Ognjen Gajic

Validation of an electronic surveillance system for acute lung injury

Geert Meyfroidt
Pieter Wouters
Wilfried De Becker
Dominiek Cotten
Greet Van den Berghe

Impact of a computer-generated alert system on the quality of tight glycemic control

Development and validation of an electronic medical record-based alert score for detection of inpatient deterioration outside the ICU



Patricia Kipnis, PhD^{a,b,*}, Benjamin J. Turk, MAS^b, David A. Wulf, BS^b, Juan Carlos LaGuardia, MS^b, Vincent Liu, MD, MS^{b,c}, Matthew M. Churpek, MD, MPH, PhD^d, Santiago Romero-Brufau, MD^e, Gabriel J. Escobar, MD^{b,f}

Why e-Alerts for AKI?

- AKI is a common syndrome and increasingly encountered in hospitalized patients
- AKI imposes significant risk for major morbidity and mortality
- AKI is costly and expensive
- AKI care is suboptimal

Adding Insult to Injury

A review of the care of patients who died in hospital with a primary diagnosis of acute kidney injury (acute renal failure).

The logo for NCEPOD (National Confidential Enquiry into Patient Outcome and Death) features the letters N, C, E, P, O, and D in a white, sans-serif font, spaced out across an orange background. A white curved line arches over the letters, and another white curved line arches under the letters, creating a frame around the text.

N C E P O D

Selected Findings of the 2009 NCEPOD report:

- ~ 50% of AKI care was considered poor
- ~ 45% had unacceptable delays in recognizing AKI
- ~ 20% of AKI was predictable and avoidable
- ~ 13% had complications of AKI missed, 17% of which were avoidable and 22% managed badly
- ~ 29% had inadequacies in clinical management of AKI

Physician Prevention of Acute Kidney Injury

Hala Yamout, MD,^{a,*} Murray L. Levin, MD,^a Robert M. Rosa, MD,^a Kevin Myrie, MD,^b
Sara Westergaard, MD^c

- Retrospective cohort of hospitalized patients screened for AKI
 - AKI found in 170/492 (34.6%)
- 30% (n=51/170) adjudicated to have AKI that was “preventable” by better care
- **Preventable causes for AKI identified:**
 - Inadequate prophylaxis prior to contrast
 - Hemodynamic instability
 - Inappropriate medication use
 - Multiple nephrotoxic insults



KDIGO Clinical Practice Guideline for Acute Kidney Injury

Preventative Intervention

Diuretics

Low-dose Dopamine

Fenoldopam (DA1-R agonist)

Atrial Natriuretic peptide (ANP)

Nesiritide (BNP)

rh-IGF-1

On vs. Off-pump CABG

N-acetylcysteine (oral or IV)

Remote ischemic preconditioning (RIPC)

Recommendation

Do not use (1C)

Do not use (1A)

Do not use (2C)

Do not use (2C)

Do not use (2C)

Do not use (1B)

Do not use (2C)

Do not use (1A)

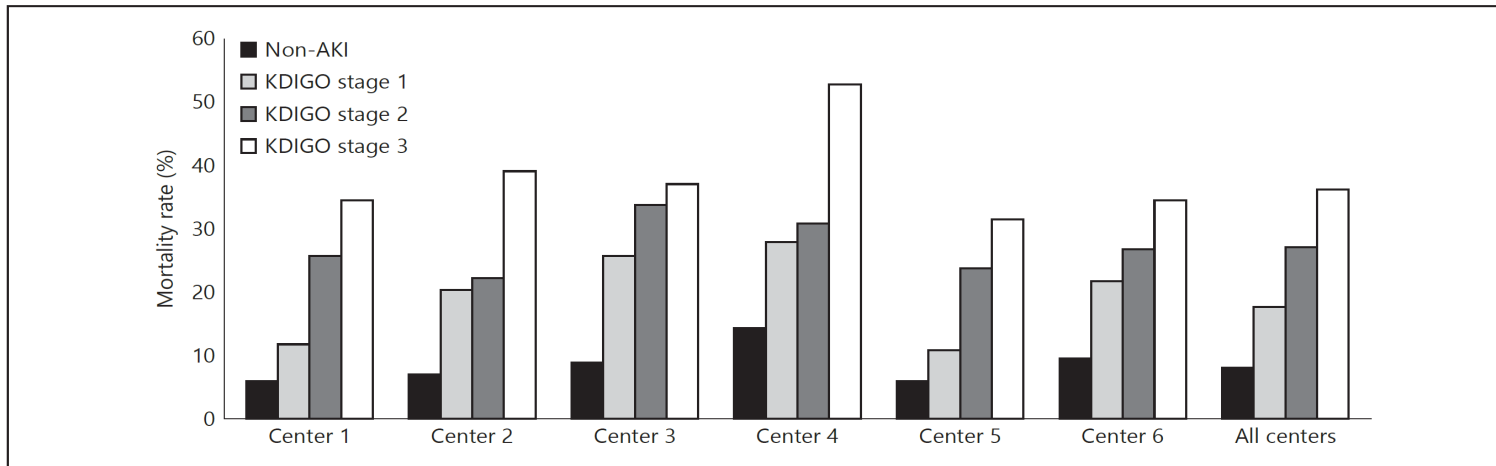
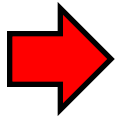
No recommendation

This should reinforce how vital it is to focus on improving and optimizing “basic medical care” for patients at risk of or who develop AKI to ensure they receive best possible management.

Variation in Risk and Mortality of Acute Kidney Injury in Critically Ill Patients: A Multicenter Study

- Retrospective study
 - n=15,132, 6 hospitals
- Incidence AKI ~ 15-44%
- RRT use ~ 5-12%
- Mortality ~ 20-36%
- Considerable variability:
 - Case-mix
 - Residual confounders
 - **Heterogeneity in care processes!**

Independent variables	KDIGO classification		RIFLE classification	
	adjusted OR (95% CI)*	p value	adjusted OR (95% CI)*	p value
Center effect (Center 2 as ref.)		<0.001**		<0.001**
Center 1	4.27 (3.66–4.99)	<0.001	5.38 (4.55–6.37)	<0.001
Center 3	2.57 (2.19–3.03)	<0.001	3.35 (2.81–4.00)	<0.001
Center 4	5.61 (4.07–7.75)	<0.001	5.09 (3.64–7.12)	<0.001
Center 5	6.04 (5.23–6.98)	<0.001	7.54 (6.43–8.83)	<0.001
Center 6	2.69 (2.29–3.16)	<0.001	3.56 (2.99–4.26)	<0.001
Age in 5-year increment	1.06 (1.04–1.07)	<0.001	1.07 (1.05–1.08)	<0.001
Males	1.10 (1.01–1.21)	0.031	0.97 (0.88–1.06)	0.453
APACHE 3 in 5-point increment	1.22 (1.21–1.23)	<0.001	1.22 (1.21–1.23)	<0.001



Bagshaw *et al.* *Canadian Journal of Kidney Health and Disease* (2016) 3:5
DOI 10.1186/s40697-016-0103-z



CANADIAN JOURNAL OF
KIDNEY HEALTH AND DISEASE
Journal canadien de la santé et de la maladie rénale

EDITORIAL

Open Access

Acute kidney injury in the era of big data: the 15th Consensus Conference of the Acute Dialysis Quality Initiative (ADQI)

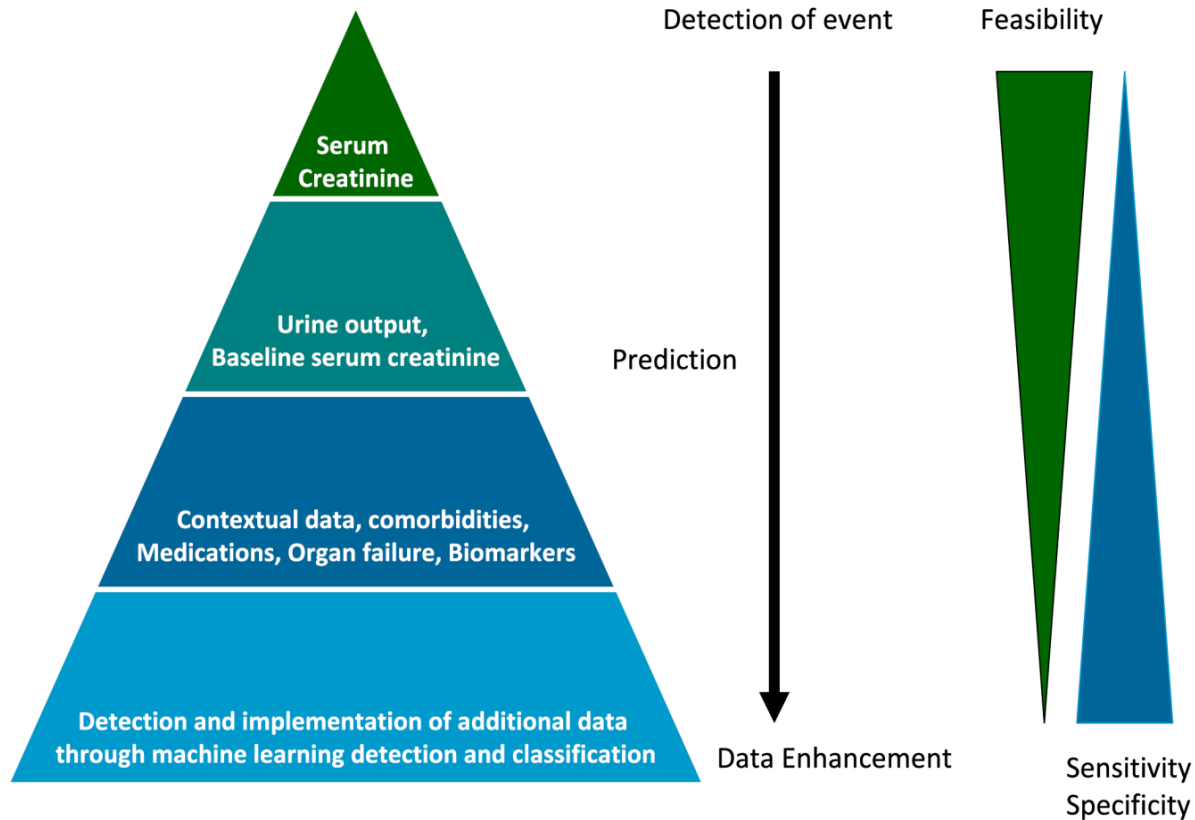


Sean M. Bagshaw^{1*}, Stuart L. Goldstein², Claudio Ronco³, John A. Kellum⁴ and for the ADQI 15 Consensus Group

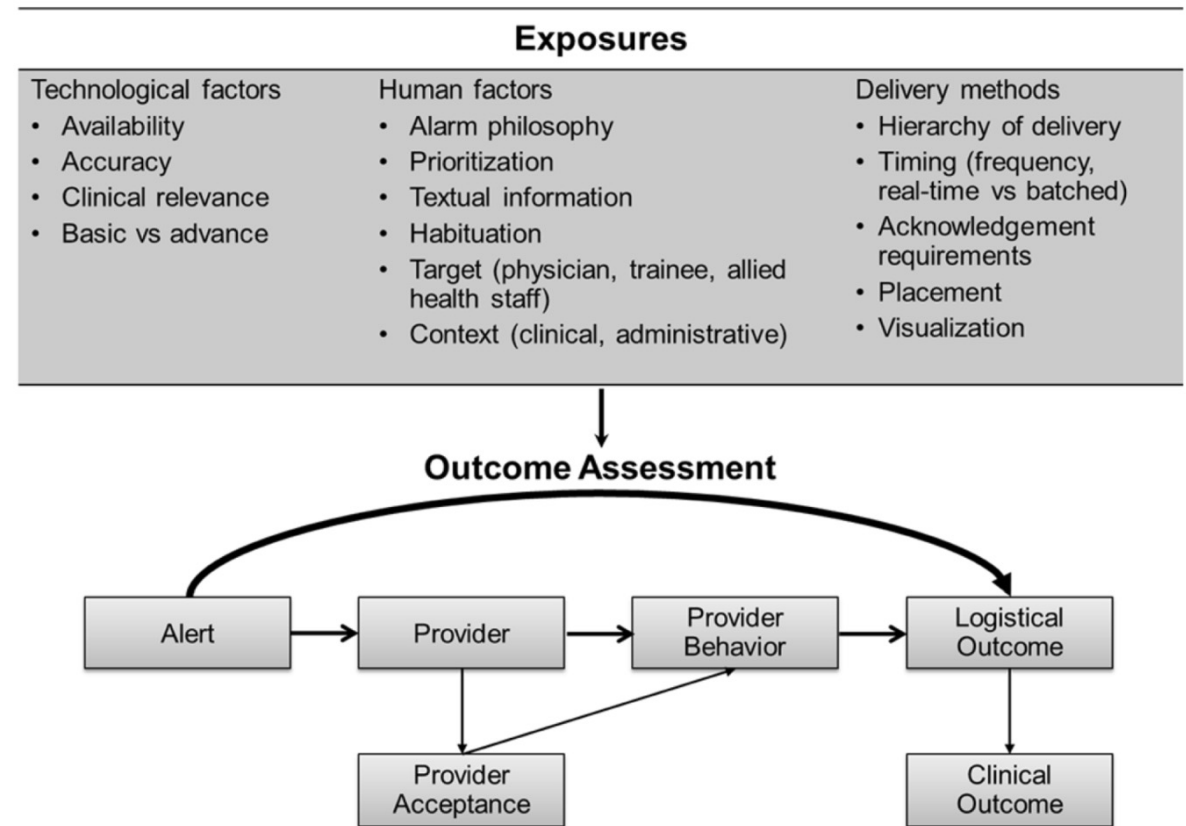
Approaches to Derivation, Development and Refinement of Automated AKI Alerting Systems



Detection



Alerting





Impact of e-alert for detection of acute kidney injury on processes of care and outcomes: protocol for a systematic review and meta-analysis

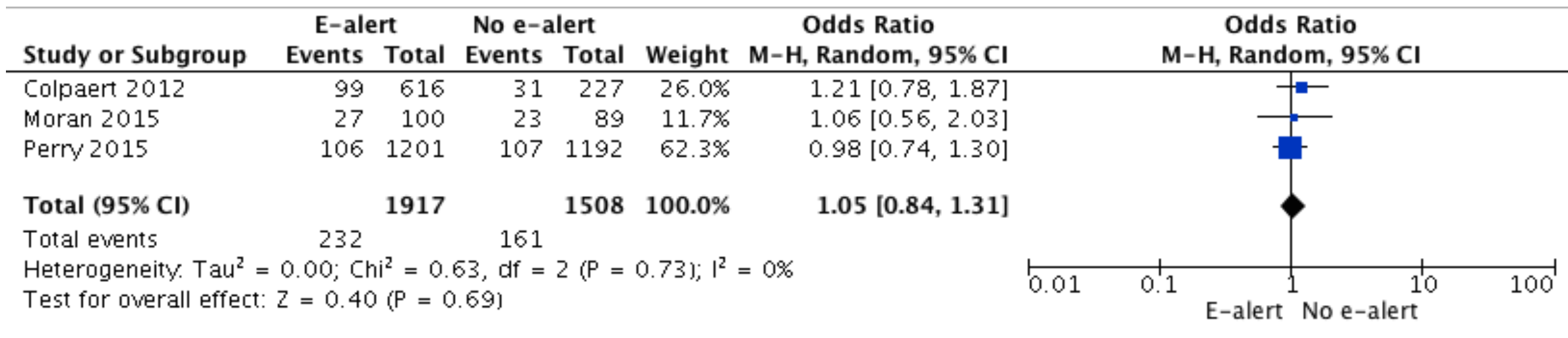
- **Objectives:** Describe the methods for designing and implementing e-alerts for AKI, their impact on quality of care indicators and processes of care (i.e., monitoring, investigations), patient-centered outcomes (i.e., death, RRT) and health services use (i.e., ICU admission, hospital stay)
- **Design:** Systematic review + evidence synthesis
- **Search:** Comprehensive peer reviewed strategy
- **Study Selection:** 1) original data from RCTs; 2) all hospitalized patients; 3) studies where e-alert implemented for AKI; 4) reported impact on one process of care, patient outcome or measure of health services use

Study	Trigger for e-alert	Timing	Target	Mode of Transmission	Generation	Intrusiveness*	Integration of Clinical Decision Support (CDS)			
							Diagnostic Recommendations	Mechanisms for Users	Follow-up Recommendations	Format of CDS Provided
Rind										
McCo										linked into internal site
Colpa										linked into internal site
Selby										linked into internal site
Morar										
Wilson										linked to website

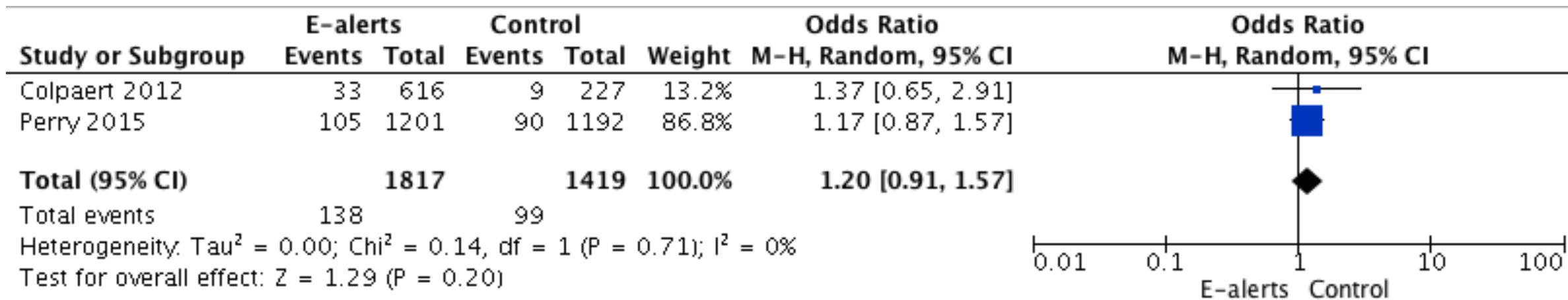
1. E-alerts are significantly heterogeneous in design (i.e., detection algorithms, modes of alerting, degrees of intrusiveness)
2. E-alerts have have been variably implemented (i.e., seldom formal education, training or processes to ensure audit and feedback)
3. E-alerts have seldom included directed clinical decision support (CDS) and if included has not been context-specific and questionably feasible

*Based on our intrusiveness scale (see Appendix 1)

Mortality



Use of Renal Replacement Therapy



Automated, electronic alerts for acute kidney injury: a single-blind, parallel-group, randomised controlled trial

F Perry Wilson, Michael Shashaty, Jeffrey Testani, Iram Aqeel, Yuliya Borovskiy, Susan S Ellenberg, Harold I Feldman, Hilda Fernandez, Yevgeniy Gitelman, Jennie Lin, Dan Negoianu, Chirag R Parikh, Peter P Reese, Richard Urbani, Barry Fuchs

- **Design:** RCT at single tertiary hospital, stratified by ward
- **Population:** Hospitalized patients to medical/surgical wards
- **Intervention:** Randomized (patient-level) to automated “disruptive” text-alert sent to covering providers (resident/NP) and unit pharmacists indicating new AKI (KDIGO) or standard-of-care (no alert)
- **Outcome:** Maximum change in SCr; use of RRT; death within 7 days

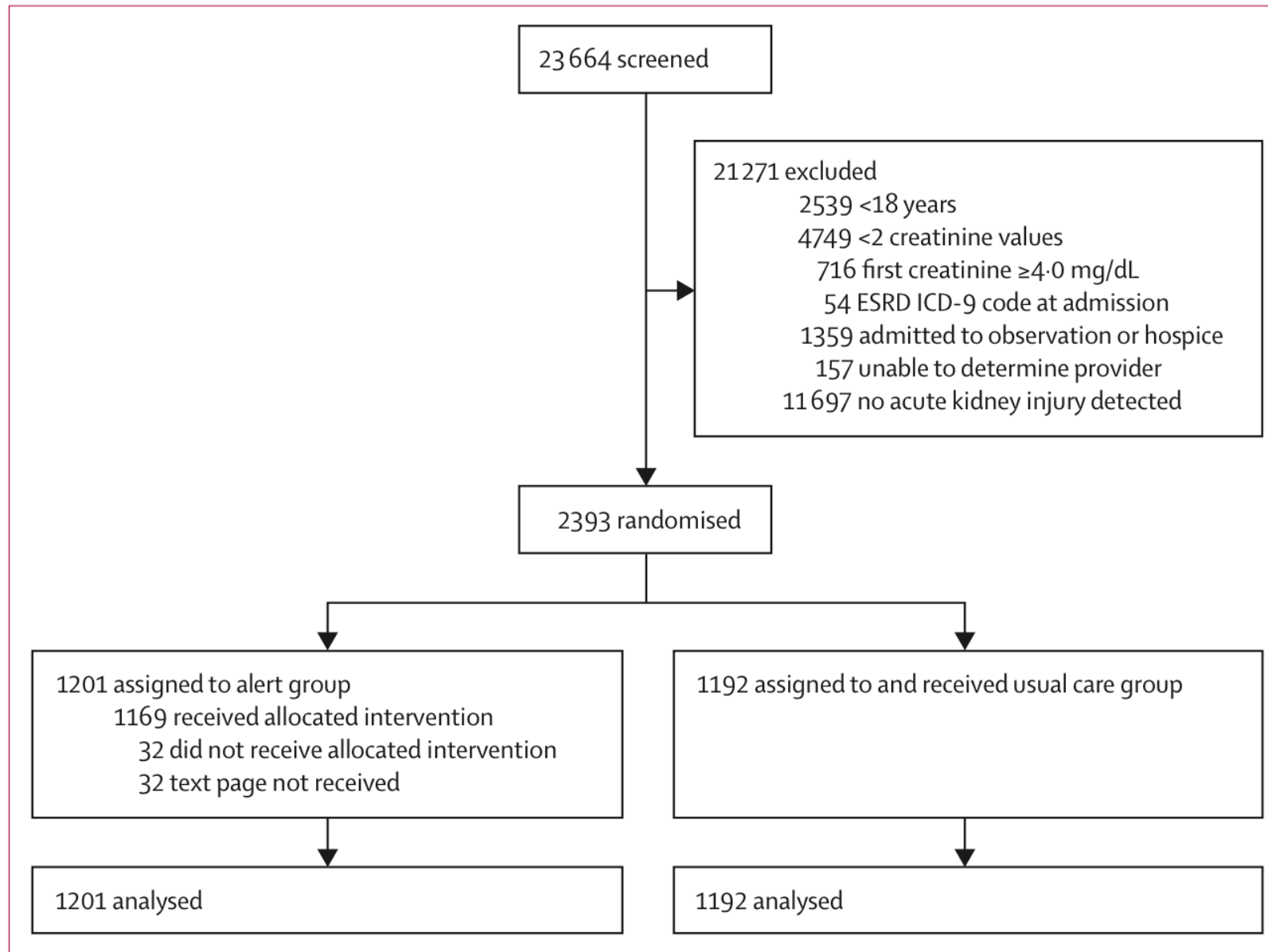
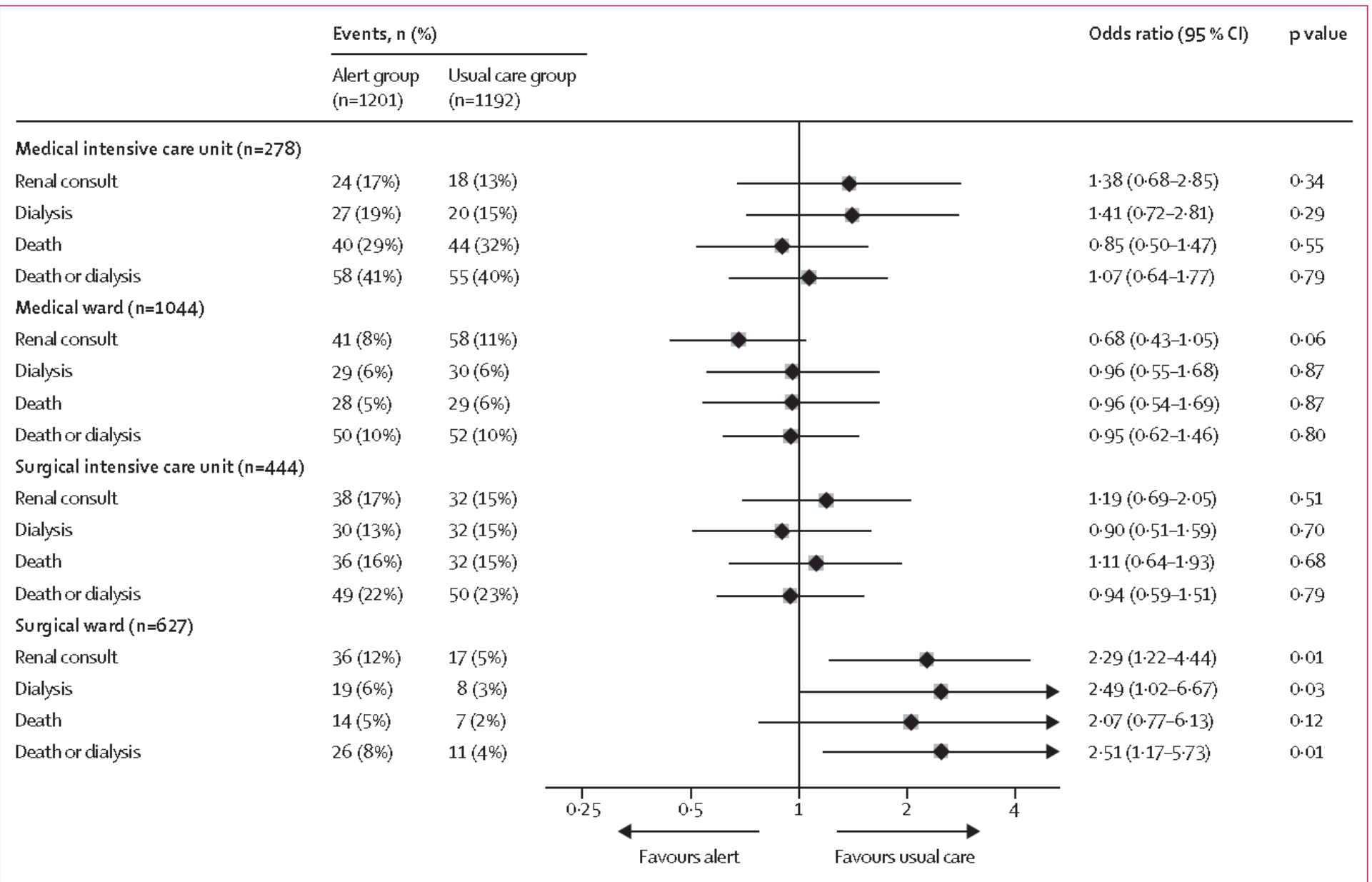


Figure 1: Trial profile

	Alert (n=1201)	Usual care (n=1192)	p value	Composite p value
7 days after randomisation				
Increase in creatinine from randomisation, %	0.0% (0.0–18.4)	0.6% (0.0–17.5)	0.81	0.88
Dialysis	87 (7.2%)	70 (5.9%)	0.18	
Death	71 (5.9%)	61 (5.1%)	0.40	
14 days after randomisation				
Increase in creatinine from randomisation, %	0.9% (0.0–20.6)	1.4% (0.0–20.2)	0.77	0.83
Dialysis	98 (8.2%)	79 (6.6%)	0.16	
Death	93 (7.7%)	85 (7.1%)	0.58	
30 days after randomisation				
Increase in creatinine from randomisation, %	1.3% (0.0–21.9)	2.1% (0.0–22.1)	0.65	0.89
Dialysis	104 (8.7%)	88 (7.4%)	0.26	
Death	106 (8.8%)	107 (9.0%)	0.85	



Secondary Process of Care Outcomes

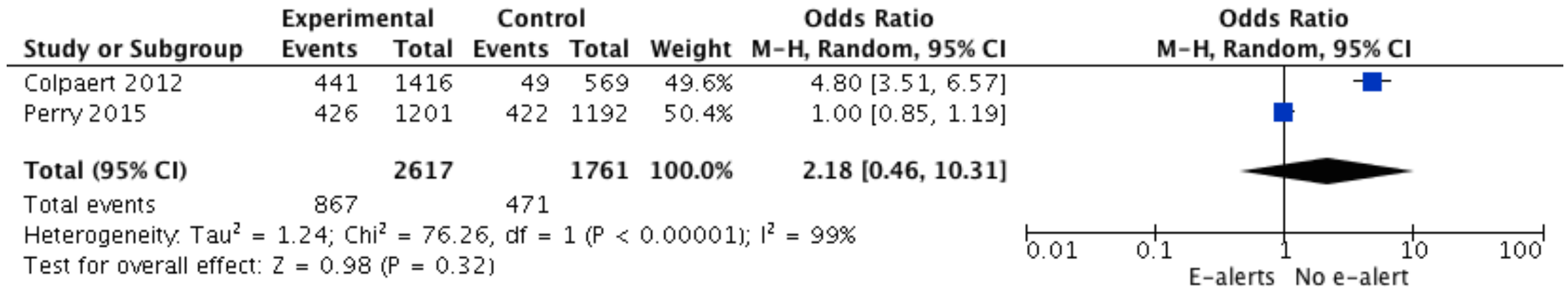
- **Documentation of AKI** (~45%)
- **Investigations:**
 - Renal ultrasound (~8%)
 - SCr tests within 48 hr (2 [2-3])
- **Consultations:**
 - Nephrology referral (~12%)
- **Interventions:**
 - Aminoglycoside (~7%)
 - NSAID exposure (~7%)
 - Contrast exposure (~15%)
 - ACE/ARB exposure (~24%)
 - Fluid bolus (~36%)

No significant differences across all secondary care process outcomes for patients allocated to e-Alert vs. standard of care

Process of Care Measures

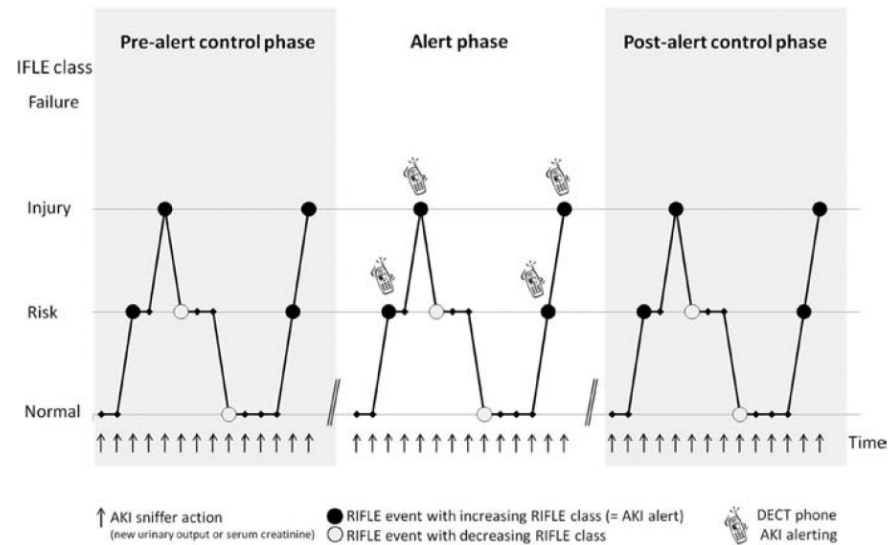
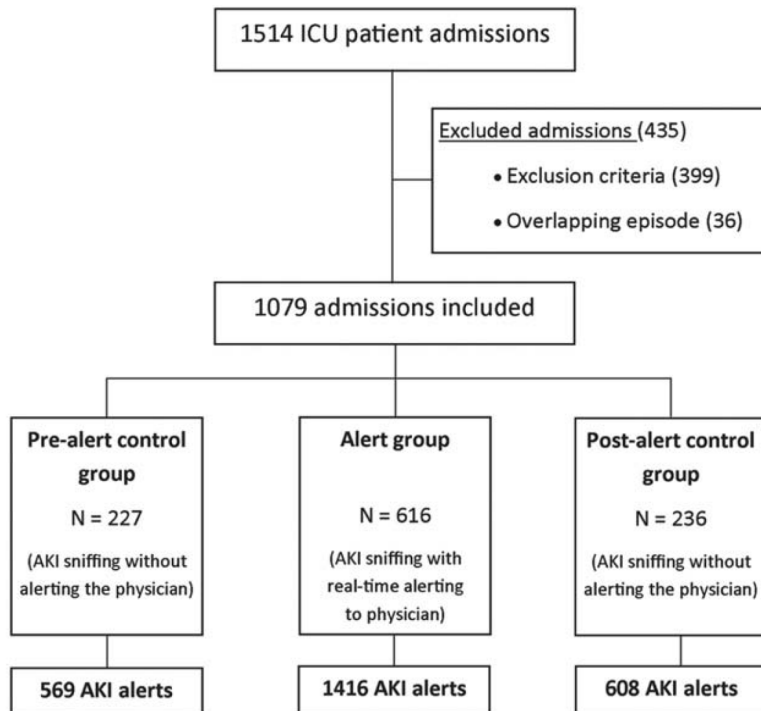
- **Primary:** Nephrotoxin dose-adjustment or discontinuation
- **Secondary:** Changes in frequency of monitoring, investigations or management (medication review; medical record documentation; fluid prescription; vasoactives or diuretic use; nephrology consult)

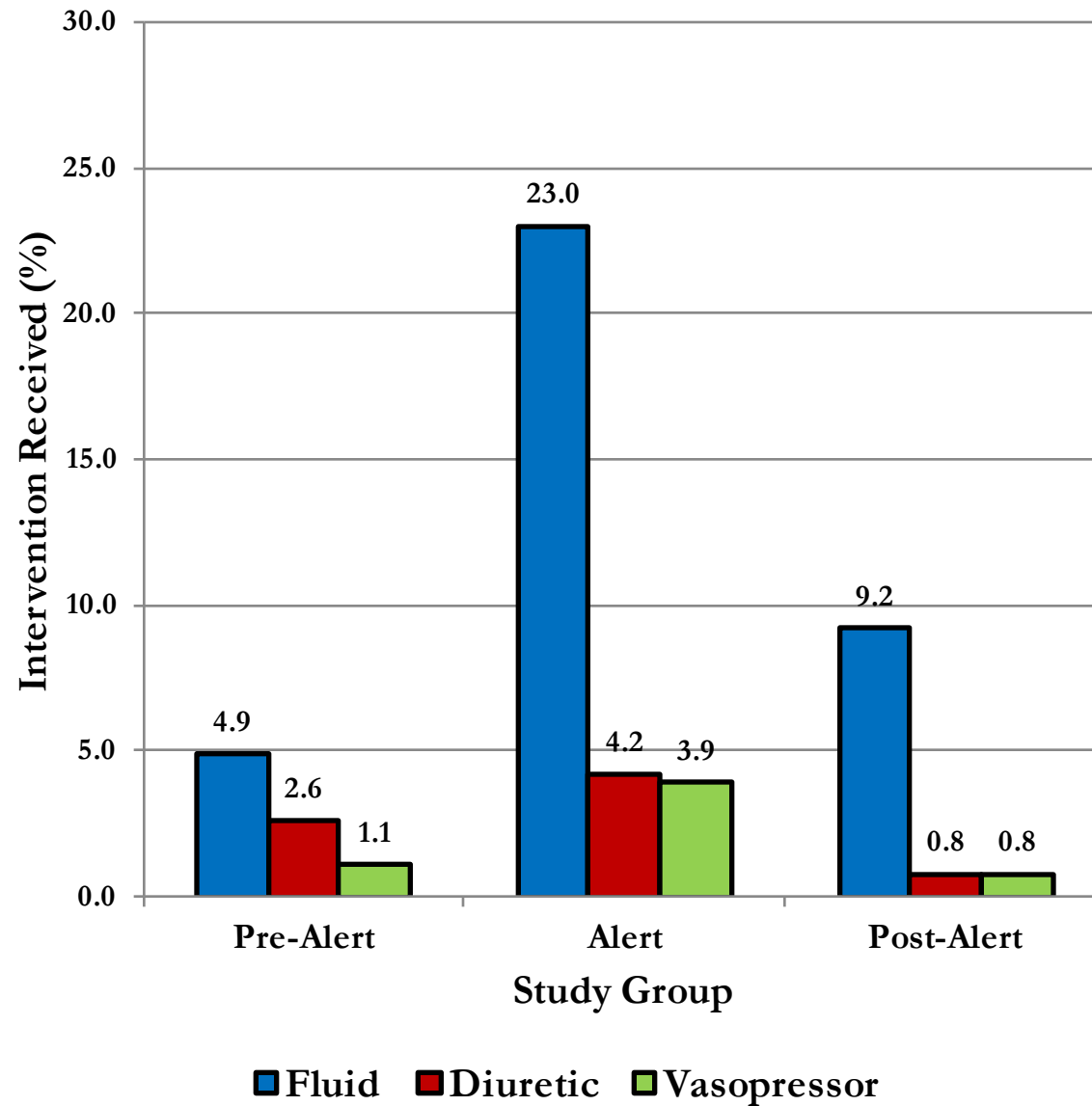
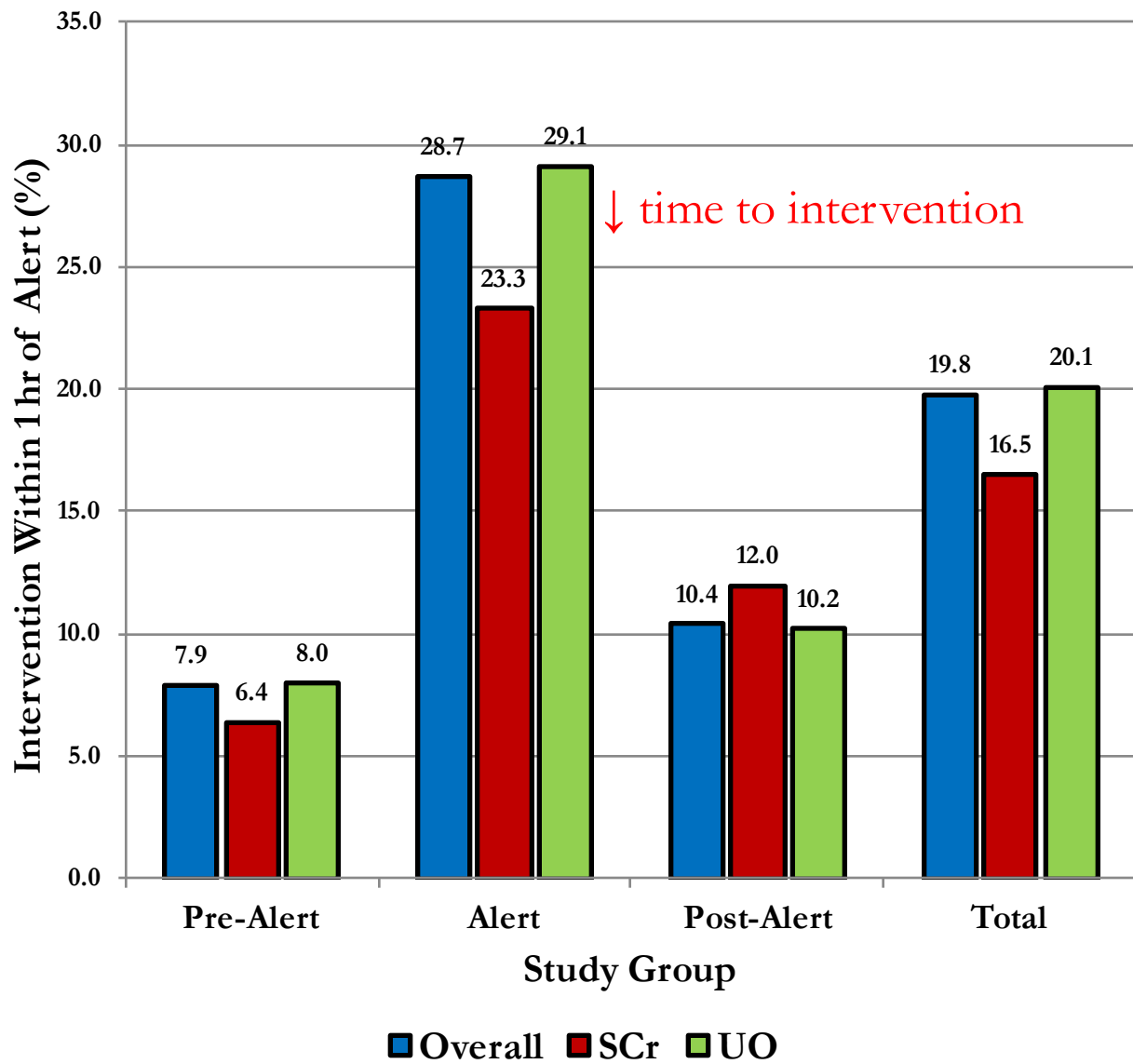
Prescription of Fluid Therapy



Impact of real-time electronic alerting of acute kidney injury on therapeutic intervention and progression of RIFLE class*

Kirsten Colpaert, MD; Eric A. Hoste, MD, PhD; Kristof Steurbaut; Dominique Benoit, MD, PhD; Sofie Van Hoecke, PhD; Filip De Turck, PhD; Johan Decruyenaere, MD, PhD





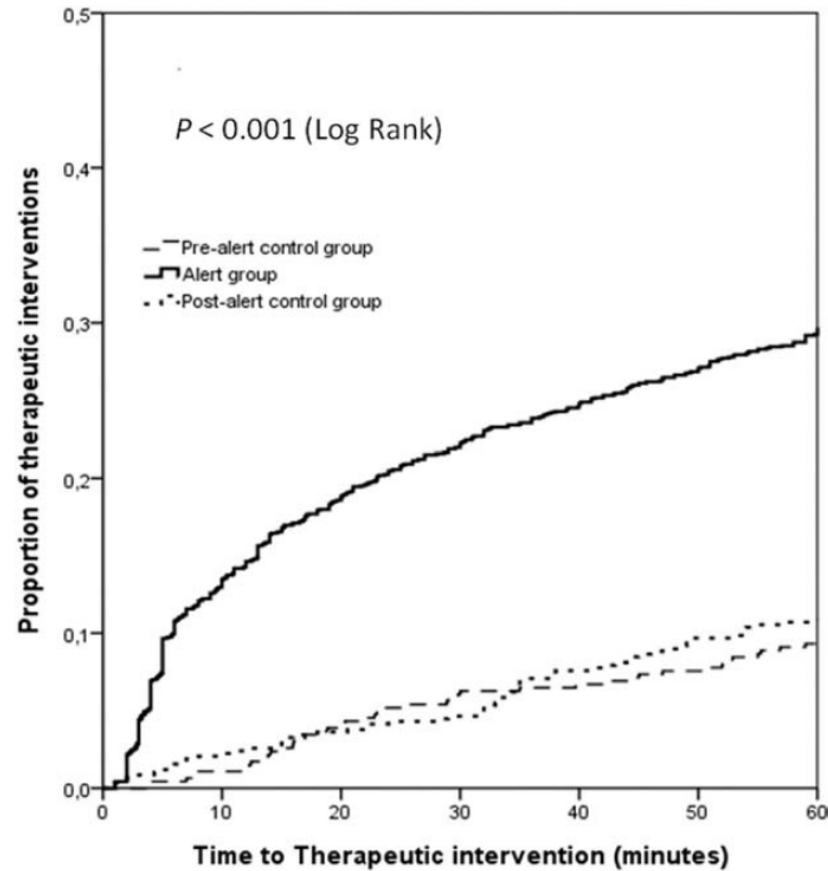
92.3% of all ALERTS were based on urine output

Impact of real-time electronic alerting of acute kidney injury on therapeutic intervention and progression of RIFLE class*

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Study outcomes:

- ↑ proportion during e-alert phase had return to baseline SCr
- No differences in proportion receiving RRT, ICU stay, or mortality



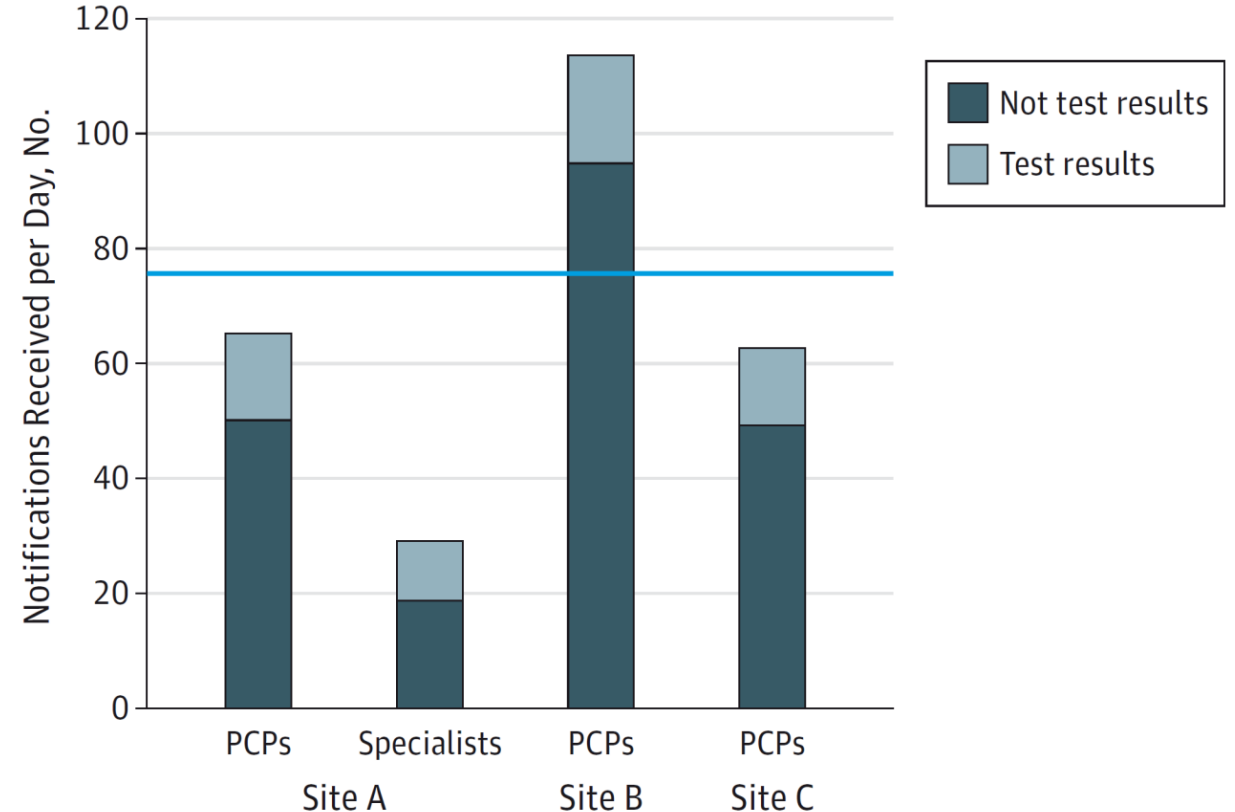
e-Alert Implementation Strategies

- Few studies employed a formal strategy to implement e-alerts into practice
 - No to little education, instruction/training or processes of audit-feedback (QA/QI/implementation methodology) introduced before or during
 - No strategy for ensuring sustainability before or during
- Significant confounder of e-alert success in negative studies
- Little appreciation for the impact of AKI-specific alert in context of “competing” alerts within given EHR or clinical setting

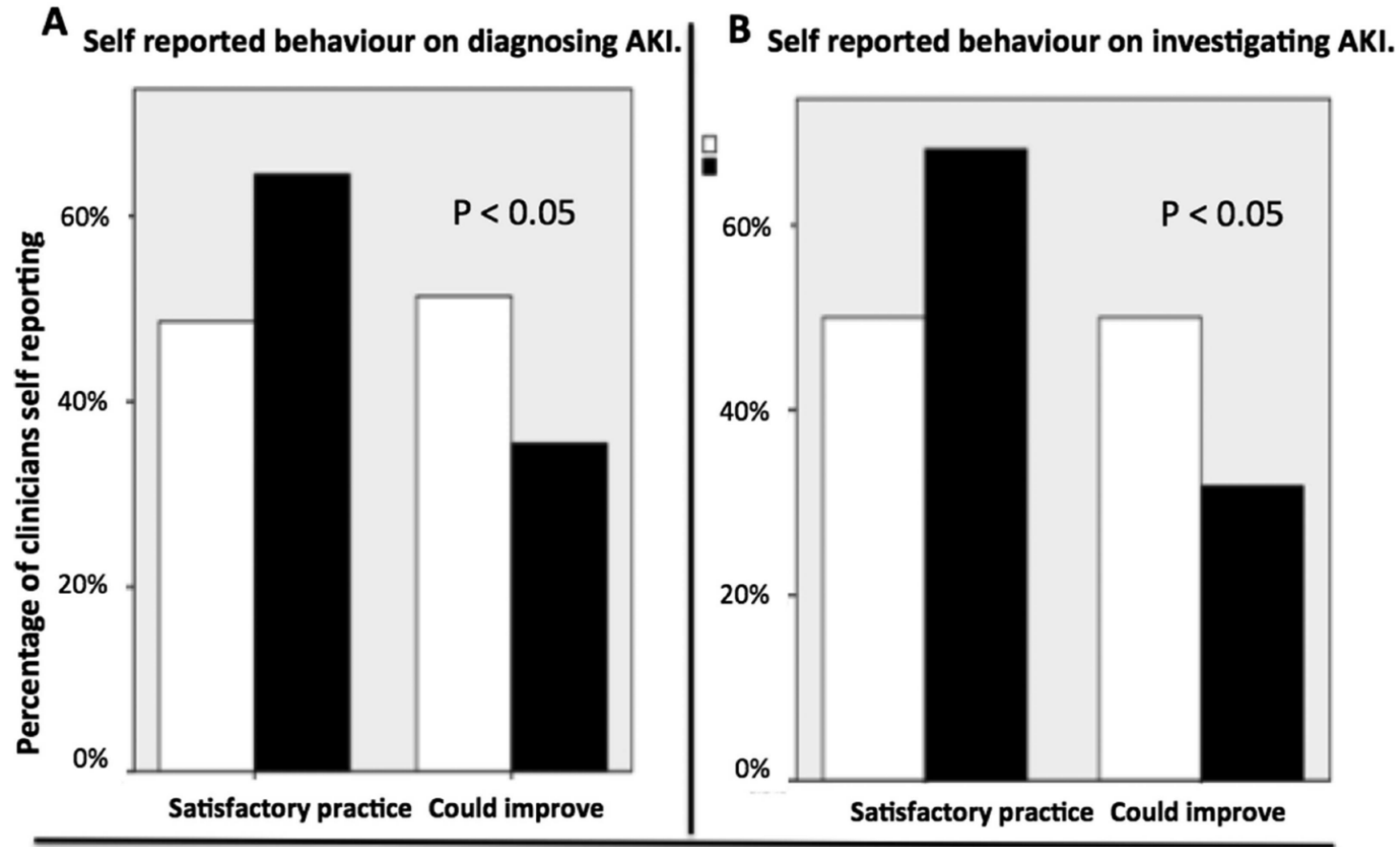
The Burden of Inbox Notifications in Commercial Electronic Health Records

- EHR-based notices to physicians are growing
- ↑ volume creates difficulty for discerning important vs. irrelevant information
- Translates into ↑ time spent reviewing and uncompensated workload

Figure. Quantities and Types of Notifications Received by Site and Physician Role



An educational approach to improve outcomes in acute kidney injury (AKI): report of a quality improvement project



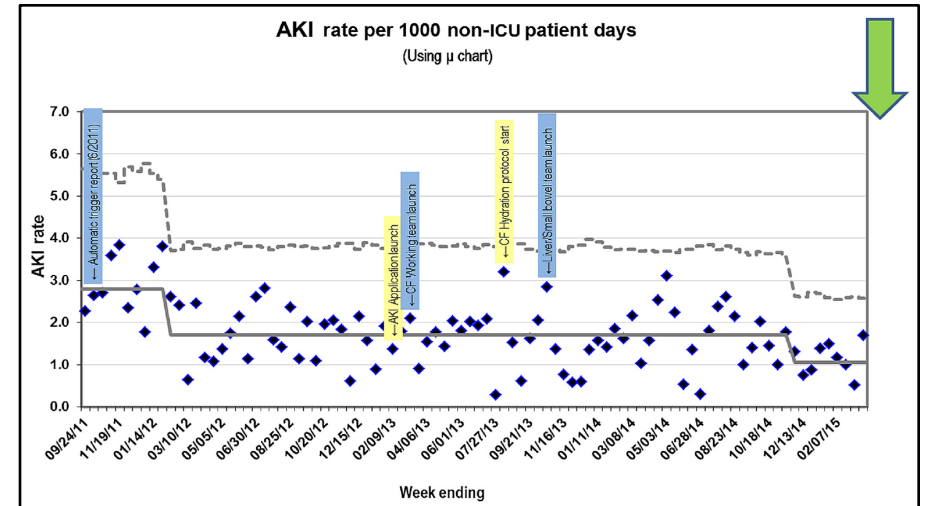
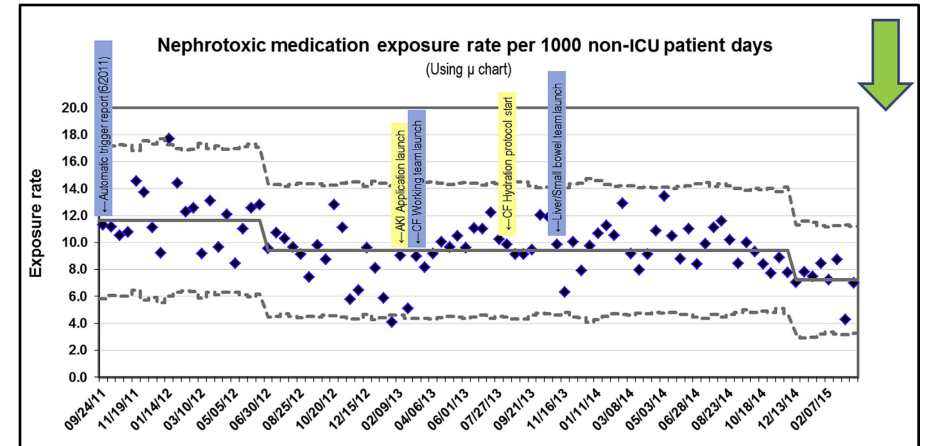
- Inadequate implementation strategies may be confounder in trials in our review
- Providing multifaceted education can improve provider satisfaction and confidence in their ability to diagnose and manage AKI.

e-Alert Integration of Decision Support

- Integration of clinical decision support (CDS) across studies has been highly variable
 - Specific CDS may guide context-specific management (i.e., investigations, monitoring, interventions)
 - More relevant for “non-AKI” experts (i.e., non-nephrologists)
- May also be a significant confounder of e-alert success in negative studies

A sustained quality improvement program reduces nephrotoxic medication-associated acute kidney injury

- **Study:** Prospective QI project (2011-2015)
- **Population:** 2,358 admissions (n=1,749)
- **Exposure:** Hospitalized children receiving either AG ≥ 3 days or ≥ 3 nephrotoxins (3,243 exposures)
- **Intervention:** EHR alert + CDS (pharmacy driven) to monitor SCr + dose-adjust
- **Outcomes:**
 - \downarrow exposure rate by 38%
 - \downarrow AKI rate by 64%
 - Avoided 398 episodes AKI



Earlier intervention for acute kidney injury: evaluation of an outreach service and a long-term follow-up

Type	Category	Number	Subtotal	
Fluid balance-related recommendations	Intravenous fluid recommendations	102	156	
	Monitor fluid balance and/or assess volume status	33		
	Urinary catheterization	21		
Investigational recommendations	Recheck urea, creatinine and electrolytes	150	289	
	Test urine dipstick	128		
	Arrange urinary tract ultrasound or other investigations	11		
Escalation and palliative care decisions and recommendations		16	16	
Care pathway recommendations	Primary team to review clinical situation	23	45	
	Patient to be seen as outpatient or other pathway advice	22		
General medical recommendations	Physiotherapy	20	35	
	Nutritional review or sepsis six [11, 12]	15		
Drug recommendations			227	
Drug cessation	Angiotensin converting enzyme inhibitors/angiotensin receptor blockers	65		
	Aspirin	30		
	Diuretics (non-potassium sparing)	21		
	Non-steroidal anti-inflammatory drugs (NSAIDs)	19		
	Enoxaparin (low-molecular weight heparin)	19		
	Other hypotensive agents	18		
	Potassium-sparing diuretics	13		
	Metformin	10		
	Other drugs (aminoglycosides, aciclovir, calcineurin inhibitors, NSAID gels and Hartmann's solution)	16		
	Drug dose reduction	Opioids		8
	Drugs to avoid (when use likely)	NSAIDs or iodinated contrast		8

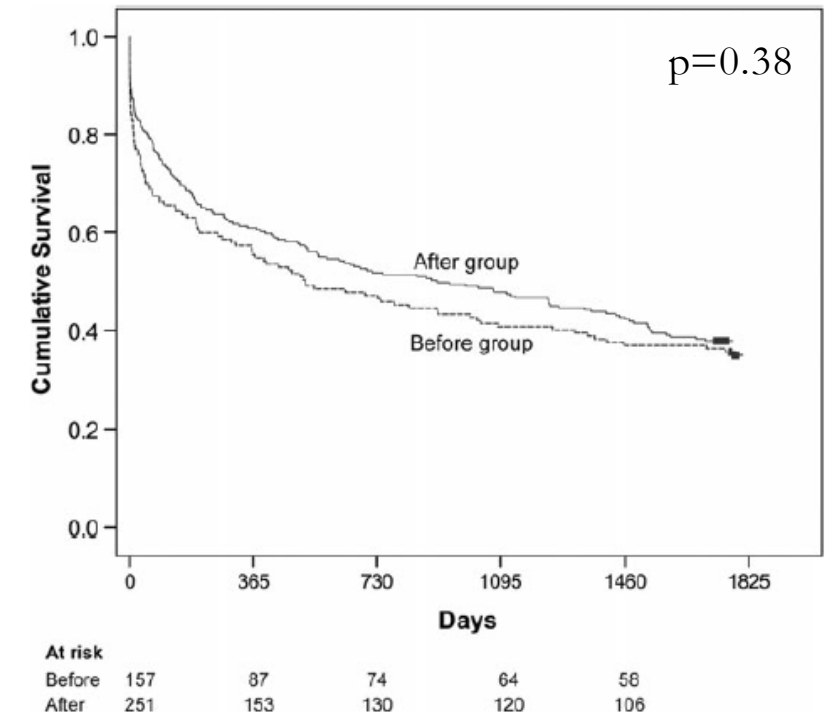
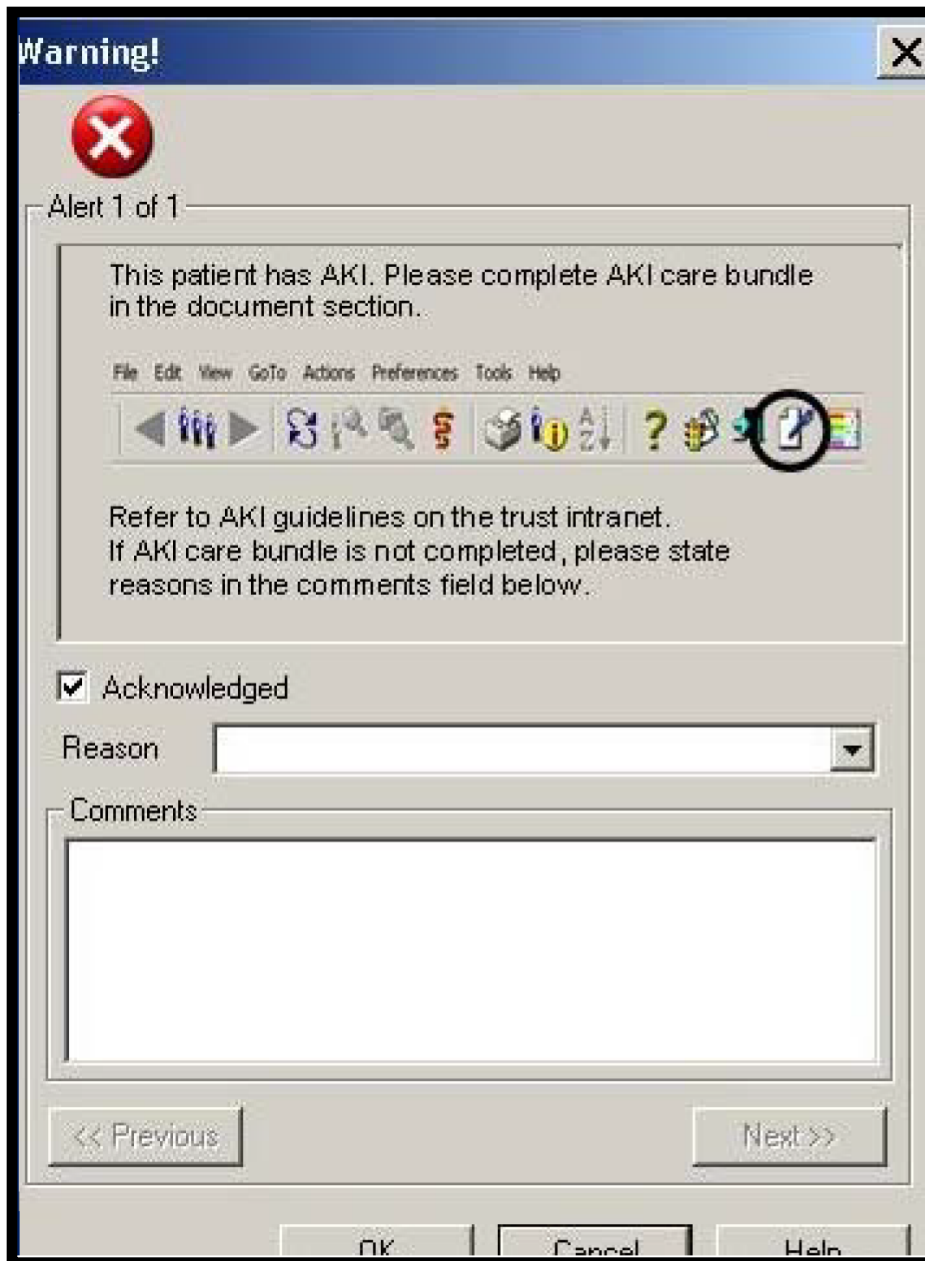


FIGURE 2: Survival of before and after groups.

Outreach call (Nephrology/RN) for precision advice successful in ~88% after median 14 hr

Impact of Compliance with a Care Bundle on Acute Kidney Injury Outcomes: A Prospective Observational Study

- **Design**: Before/After Study (11 months)
- **Population**: 2,297 hospitalized patients (2,500 AKI episodes)
- **Intervention**:
 - AKI e-alert (interruptive) linked to AKI-specific “care bundle”
 - Interruptive e-alert triggered by attempt to order blood work or medication in a patient identified as having AKI
 - e-alert would warn provider about AKI and request “care bundle” be completed
 - Once “care bundle” completed – provider could order tests or medications
 - e-alert could be overridden only after provider imputed reason



Derby Hospitals NHS Foundation Trust

AUDITS - The Acute Kidney Injury Care Bundle

Patient sticker

Date
 Time
 Ward.....

This care bundle applies to initial care of those admitted with Acute Kidney Injury (AKI)

Action	Parameter	Sign
A Assess History & examine (VENUS)	<ul style="list-style-type: none"> • Volume depletion • Esoteric history - 3H & 3R (Haemoptysis, Haemolysis, Hypercalcemia, Rash, Recent vascular intervention, raised CK) • Nephrotoxins – check medications • Urinary symptoms – outflow obstruction, haematuria, oliguria, colic • Sepsis 	
U Urine dispstick	<ul style="list-style-type: none"> • No blood or protein – Pre renal • Blood & protein – Renal • Only blood – post renal or renal 	
D Clinical Diagnosis	<ul style="list-style-type: none"> • Think cause of AKI as Pre renal, Renal and Post renal • Classify and document AKI as per AKIN stage. 	
I Investigations	<ul style="list-style-type: none"> • U+E, bicarbonate, Glucose, ANCA, SEP, ECG, CXR, MSU or blood & urine cultures depending on clinical suspicion. • USS to r/o post renal cause. 	
T Treatment - PUMP	<ul style="list-style-type: none"> • Perfusion – ensure euolemic status, ionotropes if required • Underlying cause – – remove nephrotoxins, antibiotics for sepsis • Monitor – EWS, volume status, Daily U+Es • Prevent complications - fluid overload, adjust doses of medications, sepsis including removal of potential sources of sepsis. 	
S Seek advice	Seek renal advice (bleep 8121) for all AKI stage 3 and, if esoteric cause for AKI is suspected - as per the Trust guideline. Refer to "DONUT" on the website Consider HDU/ITU according to severity	

AKI Care Bundle

Entered: _____

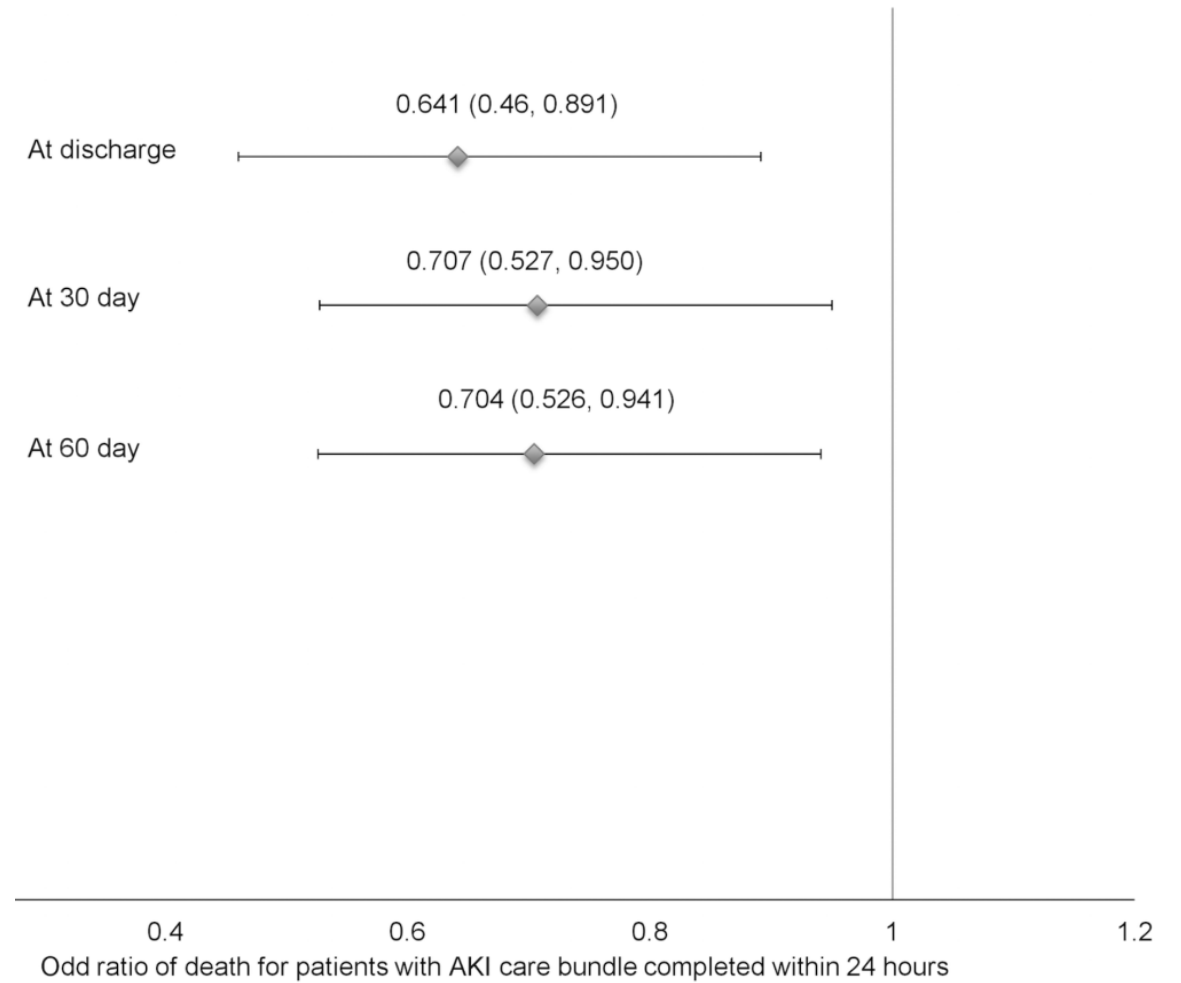
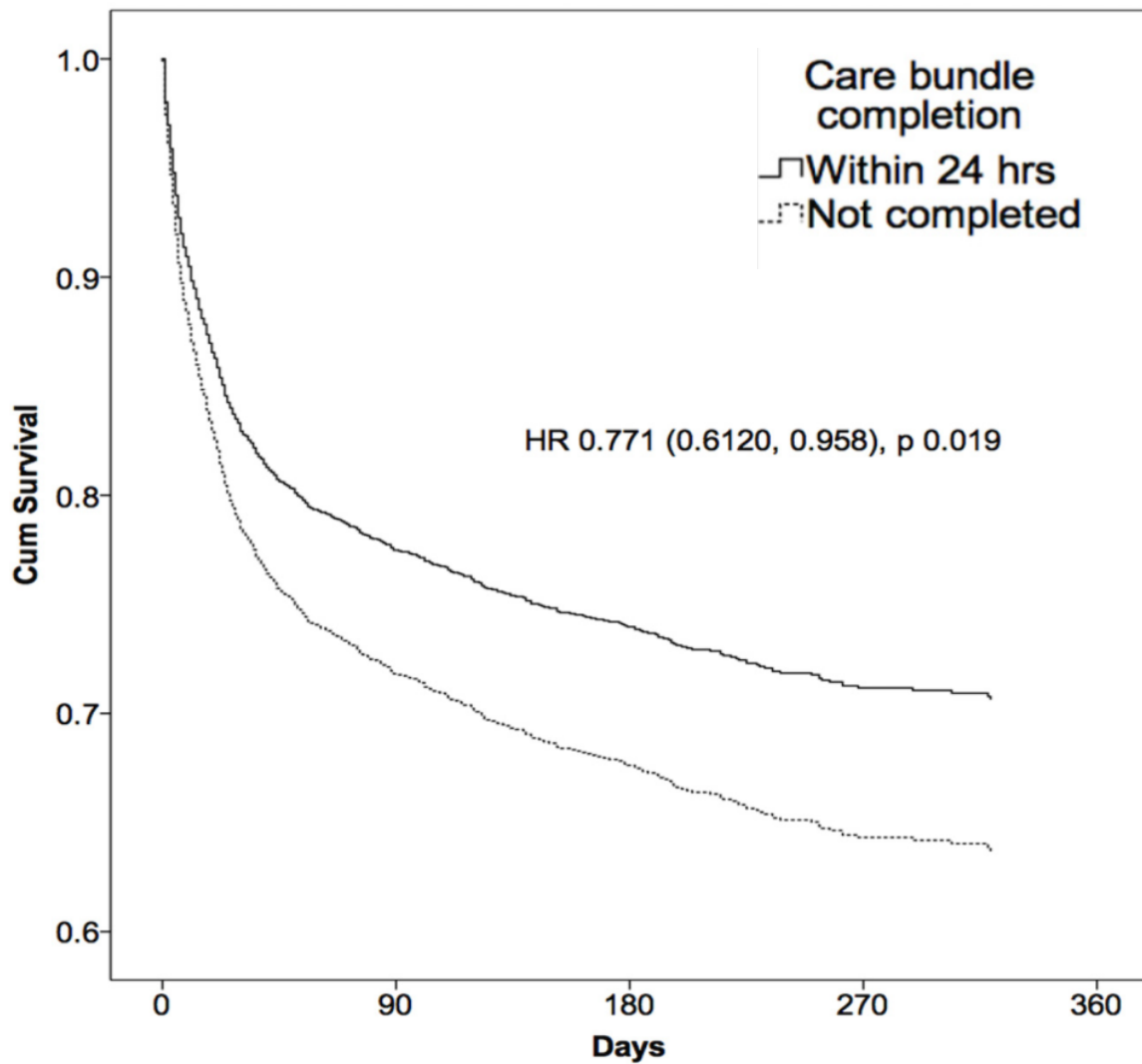
Completed: _____

Instructions

1. Attach patient label and fill in Box A
2. Detach square sticker, and place in notes and follow.
3. Detach round sticker, and place in front of notes folder.
4. File this backing sheet (with patient label) in designated audit tray.

- Overall compliance with Care Bundle ~ 12.2%
- Pre/post-interruptive e-alert compliance ~ 2.2% vs. 21.6%
- AKI stage 3 ~ 15.7% completed bundle within 24 hr
- 70.9% had “appropriate” treatment measures implemented

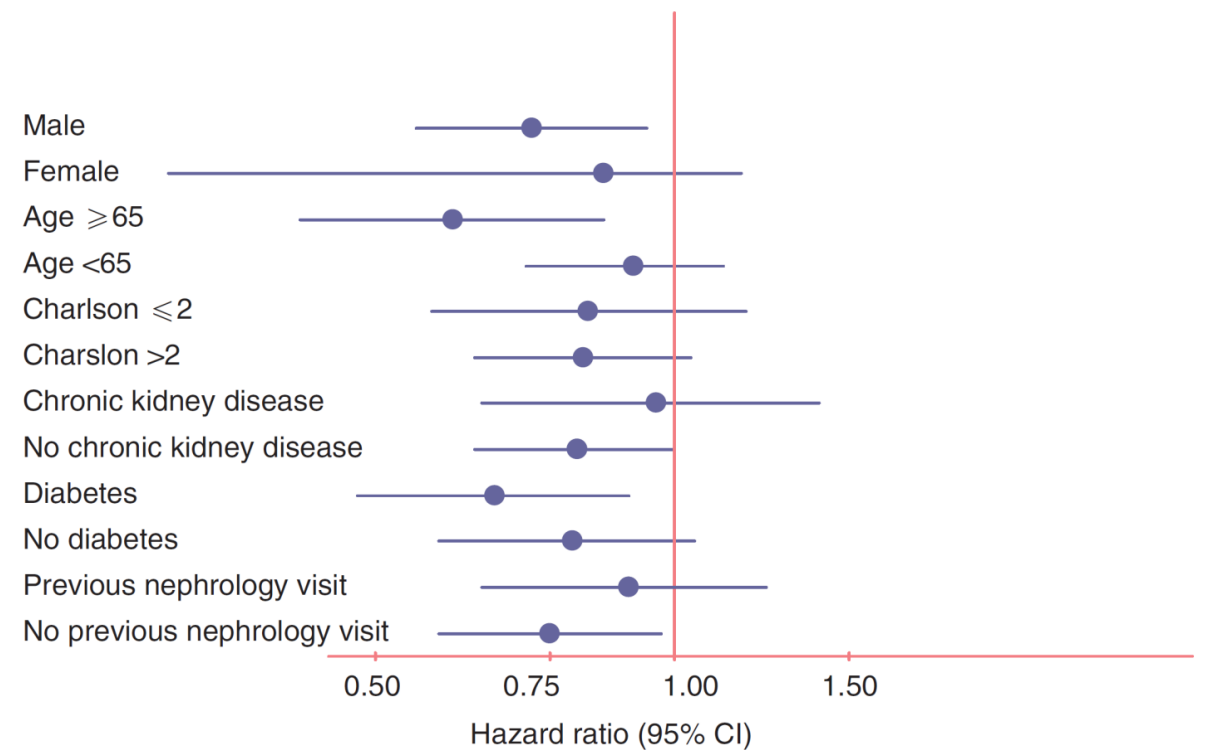
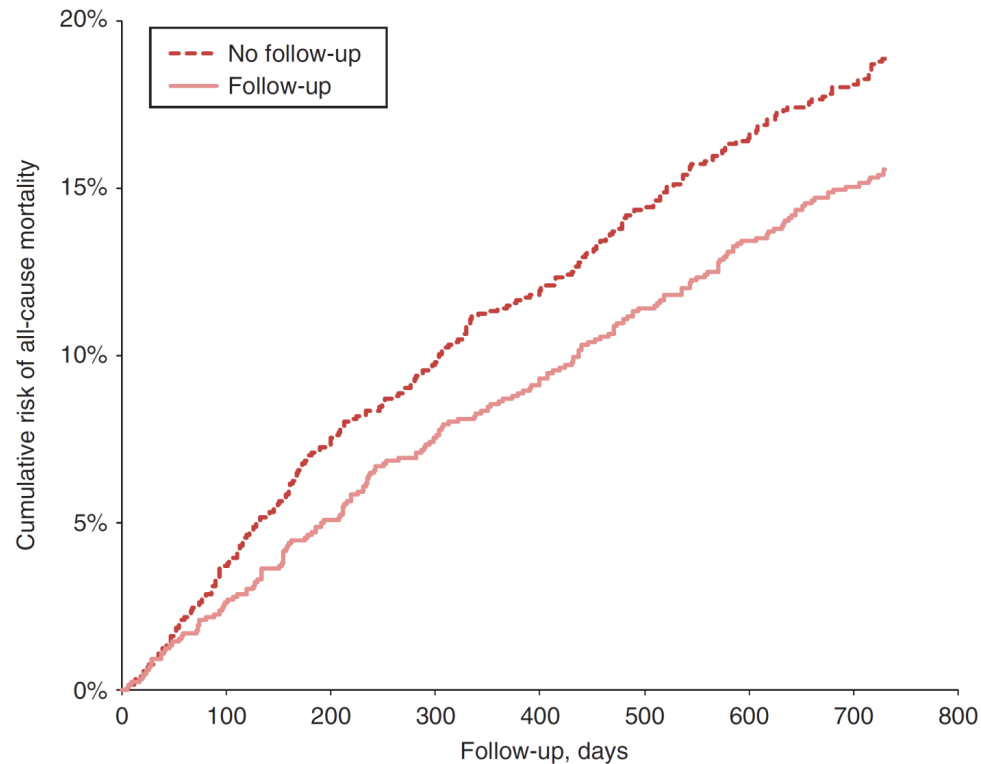
	Care Bundle completion		P value
	Within 24 hours	Not completed or completed after 24 hours	
Proportion of AKI episodes with progression to higher AKI stage	9 (3.9%)	149 (8.1%)	0.02
Length of stay in days†	11.2 (9.9, 12.4)	12.5 (11.9, 13.1)	0.098
In-hospital case fatality	55 (18%)	506 (23.1%)	0.046
30-day case fatality	77 (25.2%)	626 (28.5%)	0.219
60-day case fatality	83 (27.1%)	673 (30.7%)	0.205



Mortality associated with completion of care bundle within 24 hours of AKI detection/alert versus delayed or no completion

Nephrologist follow-up improves all-cause mortality of severe acute kidney injury survivors

Retrospective matched cohort study using linked administrative data from Ontario, Canada of RRT-treated AKI survivors



Early Nephrologist follow-up (within 90 days of discharge) associated with reduced all-cause mortality
(adj-HR 0.76; 95% CI, 0.62-0.93)

Summary

- AKI is common and increasing, contributes to less favorable patient outcomes and susceptible to suboptimal quality of care
- E-alerts can theoretically notified providers earlier of risk for or overt AKI
- Available evidence has shown variable impact of E-alerts in response to AKI on care processes and no meaningful improvement in patient outcomes or health services use
- E-alerts are likely context-specific and further rigorous evaluation is needed before widespread routine implementation

Thanks for Your Attention

Questions?

bagshaw@ualberta.ca

