Smart Triage: A prediction-based facility quality improvement program for critically ill children

Samuel Akech, MBChB, MMED (Paeds), PhD KEMRI-Wellcome Trust Research Programme, Nairobi, Kenya





Background

- 2016-4.9 million deaths in children aged < 5 years, most in LMICs
- Sepsis (pneumonia, diarrhea, or malaria) resulting in multiorgan dysfunction major cause of morbidity and mortality
- World Health Assembly (2017) resolved to prioritize prevention, recognition, and early treatment of sepsis



1. TRIAGE

CHART 2. TRIAGE OF ALL SICK CHILDREN Chart 2. Triage of all sick children **Emergency signs:** If any sign is positive: call for help, assess and resuscitate, give treatment(s), draw blood for emergency laboratory investigations (glucose, malaria smear, Hb) ASSESS TREAT Do not move neck if you suspect cervical spine injury, but open the airway. Coma/ Manage the airway (Chart 4) IF COMA OR convulsina If convulsing, give diazepam rectally CONVULSION (Chart 9) Coma Position the unconscious child (if or head or neck trauma is suspected, Convulsing stabilize the neck first) (Chart 6). (now) Give IV glucose (Chart 10). Severe Make sure the child is warm. dehydration DIARRHOEA If no severe malnutrition: PLUS (only in a child Insert an IV line and begin giving with diarrhoea) two sians fluids rapidly following Chart 11 and positive Diarrhoea plus diarrhoea treatment plan C in hospital any two of these Check for (Chart 13, p. 131). signs: severe If severe malnutrition: malnutrition Lethargy Do not insert an IV line. Sunken eyes Proceed immediately to full Very slow skin pinch assessment and treatment (see Unable to drink or drinks section 1.4. p. 19). poorly PRIORITY SIGNS These children need prompt assessment and treatment Tiny infant (< 2 months)</p> Restless, continuously irritable, or lethargic Temperature very high Referral (urgent) Trauma or other urgent surgical Malnutrition: visible severe wasting condition Oedema of both feet or face Pallor (severe) Burns (maior) Poisoning (history of) Pain (severe) Note: If a child has trauma or other surgical problems, Respiratory distress get surgical help or follow surgical guidelines. NON-URGENT Proceed with assessment and further treatment according to the child's priority.

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Hospital Care-Triage

Reality



staff shortage resulting in missed triage

Is there a role for SMART Triage?

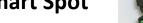
Smart Triage Platform

	Smart Triage	
Device: C Username		
Password		
	LOGIN	
	SMART T R I A G E	

1. Smart Triage Mobile App

3.Clinician Dashboard

2. Smart Spot





(Patient beacons)



(Treatment beacons)

Beacon Reader





Server box

								Search:	Show/Hide Rooms
本	*	*1		∱↓ Give	an Nama 斗	*	*		All Rooms
riority î↓	Time $\uparrow\downarrow$	Location î↓	Family Name	Give	en Name	Sex î↓	Age ^{↑↓}	Presenting Complaint	Room 1
A	4:10	Waiting Room 1				Μ	1 y	Obstructed Breathing	Room 2
•	2:23:59	Waiting Room 1				F	10 m	Chest complain	Public Dashboard Treatments
0	1:15:59	Waiting Room 1				М	1 y	Irritable	Admin Features
•	1:14:48	Lab/ Pharmacy				Μ	9 y	Trauma	Register User Reports
0	43:38	Waiting Room 1				Μ	< 1 m	Body rashes	Reader Data
	2:46:57	Travelling				Μ	4 y	Cough	Beacon Data
	2:46:52	Travelling				F	2 у	Headache	Tap Data Reader Setup
	2:18:46	Waiting Room 1				Μ	5 y	Cough	Beacon Setup Settings
	1:04:29	Travelling				Μ	6 у	Trauma	
	48:23	Lab/ Pharmacy				М	2 у	Fever	Patient History
	47:48	Lab/ Pharmacy				М	9 y	Stomachache	Feedback Form

Objectives of SMART Triage

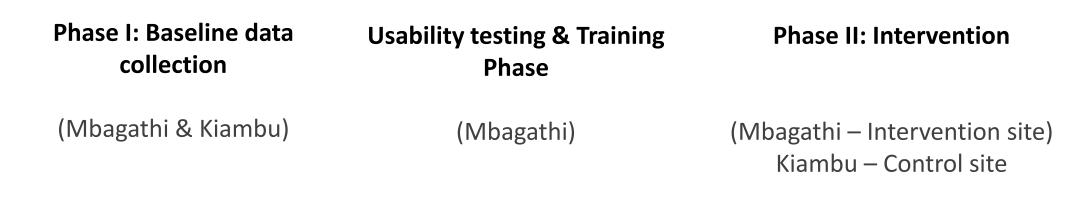


To develop and clinically validate a digital triage tool for improving hospital waiting times to treatment administration in seriously ill children



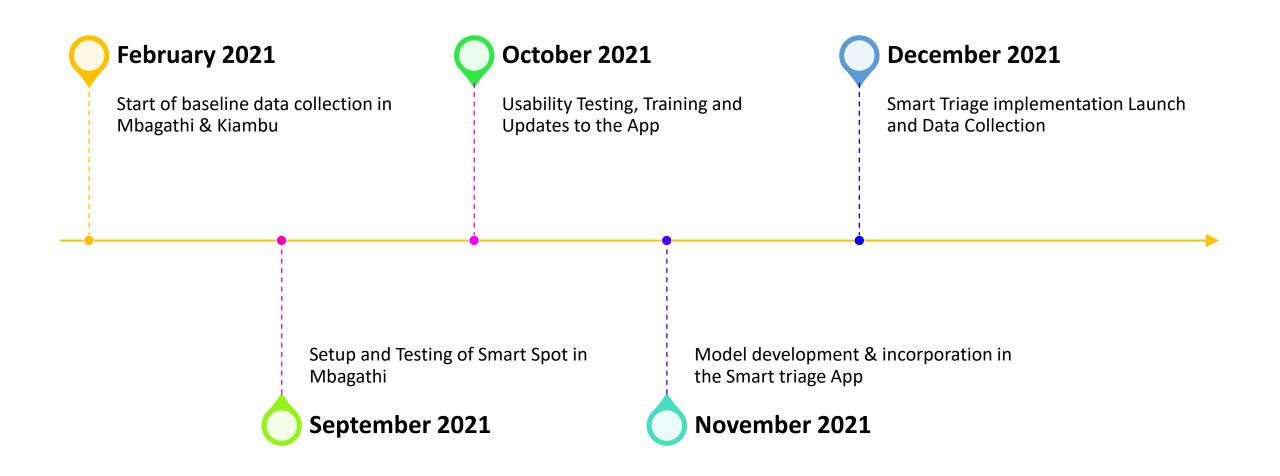
To validate use of RFID method to track timing of interventions in children presenting to hospitals with serious illnesses

Study procedures





Timeline



SMART TRIAGE MODEL

Variable	Estimate	P-value					
(Intercept)	-34.918	<0.0001					
Continuous Variables							
Heart Rate	0.015	<0.0001					
Temperature	0.877	<0.0001					
MUAC	-0.017	<0.001					
Transformed SpO2	0.058	<0.001					
Age	0.016	<0.0001					
Categorical Variables							
Parent Concern (caregiver thinks child should be admitted to the hospital)	1.828	<0.0001					
Difficulty breathing (reported or observed)	0.866	<0.0001					
Oedema	2.039	<0.0001					
Palmar Pallor	1.703	<0.0001					

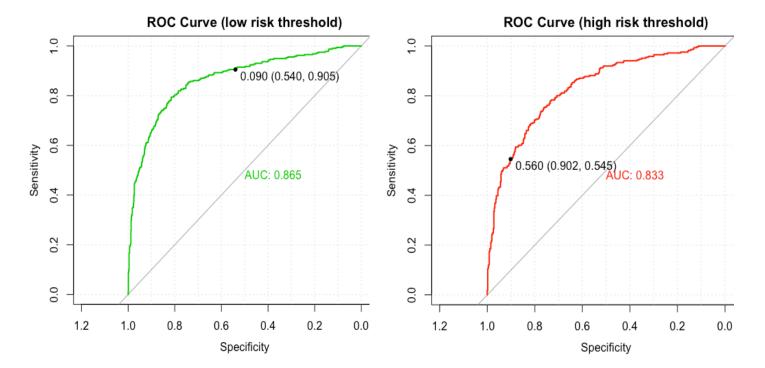
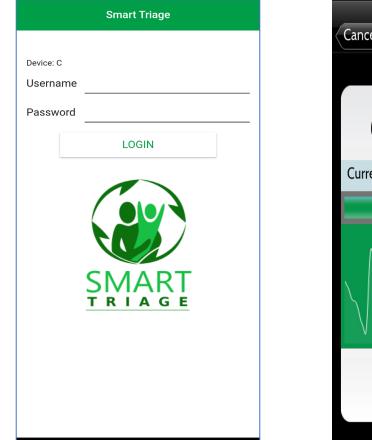


Figure 1a. Cross validated receiver operating characteristic curve of the final model in the study cohort (N=1333). The low risk threshold to classify non-urgent cases is labelled. AUC = Area under the curve.

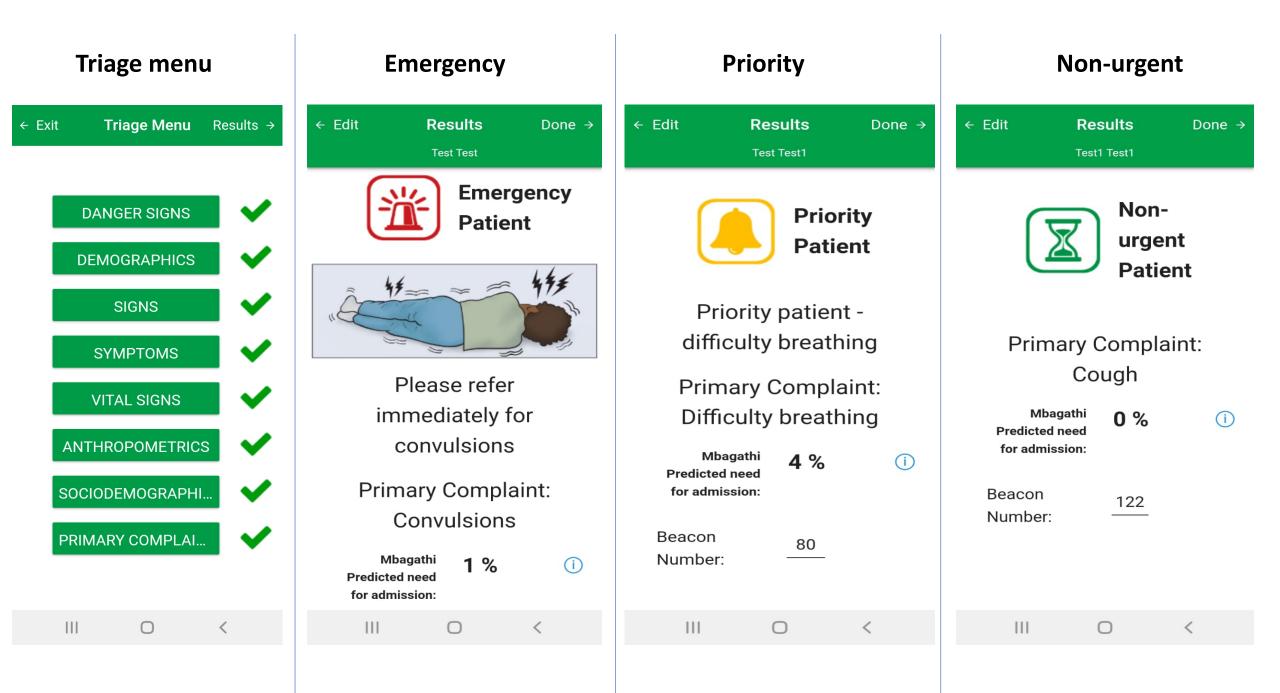
Figure 1b. Cross validated receiver operating characteristic curve of the final model in the study cohort classified as not non-urgent (N=754). The high risk threshold to classify emergency and priority cases is labelled. AUC = Area under the curve.

Smart triage App

- Used by nurses during triage to rapidly categorize patients as non-urgent, priority, or emergency
- Android app with attachable Masimo pulse oximeter
- Connects to local server box through WiFi
 - Authenticated with user database on server
 - Security certificate installed on each phone







Smart Spot (Tracking system)

(Patient beacons)



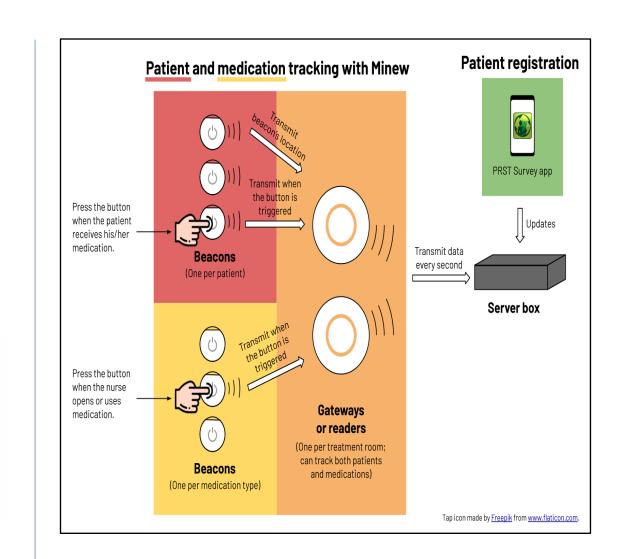
(Treatment beacons)

Beacon Reader





Server box



Clinician dashboard



Current patients

Historical patient records

Live treatment data

Reports

Clinician dashboard

irrent Patient	s						View	ving: All Rooms
							Search:	Show/Hide Rooms
Priority î↓	Time $\uparrow\downarrow$	Location ^{↑↓}	Family Name 🌐	Given Name	^{↑↓} Sex ^{↑↓}	Age 🌐	Presenting Complaint	All Rooms ^{↑↓} Room 1
A	4:10	Waiting Room 1			М	1 y	Obstructed Breathing	Room 2
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	47:48	Lab/ Pharmacy			М	9 у	Stomachache	Feedback Form
								Log Out

Historical patient records

All Patients From Last 24hrs

Search:

Date $\uparrow\downarrow$	Time Closed	^{↑↓} Surname	^{↑↓} First N	ime î	↓ Sex ^{↑↓}	Age 🌐	Presenting Complaint	$^{\uparrow\downarrow}$ Total Time $^{\uparrow\downarrow}$	Final Status	$\uparrow \downarrow \qquad \uparrow \downarrow$
2022-01-03	13:37:47				Female	3 у	Trauma	02:47:48	Discharged	>>>
2022-01-03	13:38:24				Male	2 у	Vomiting	02:42:34	Discharged	\gg
2022-01-03	13:38:05				Male	1 y	Rickets	02:24:13	Discharged	\gg
2022-01-03	13:37:56				Female	6 y	UTI	02:11:18	Discharged	\gg
2022-01-03	13:38:32				Male	4 y	Vomiting	02:05:31	Discharged	\gg
2022-01-03	13:38:16				Female	8 y	Headache	01:58:36	Discharged	\gg
2022-01-03	13:38:58				Female	3 у	Convulsion	01:52:45	Discharged	\gg
2022-01-03	13:01:42				Male	2 m	Extra digits	01:05:48	Discharged	\gg
2022-01-03	13:39:07				Male	1 y	Road accident	01:34:10	Discharged	>>>

Live treatment dashboard

Treatments of Active Patients								
Recently Tapped: Antibioti	cs - Emergency Room (10:26:03), 12 (10:26:03)			Search:				
Triage ID	^{↑↓} Family Name	^{↑↓} Given Name ^{↑↓}	Treatment î↓	Time Given	$\uparrow \downarrow \qquad \uparrow \downarrow$			
1432	Provia	Sharika	Antibiotics	10:26:03	>>>			
1404	Namuddu	Dembe	Antimalarials	10:08:57	>>>			
1373	Mukwaya	Akello	Antimalarials	09:32:39	>>>			
1329	Apio	Kaikara	Antibiotics	09:00:55	>>>			
1329	Apio	Kaikara	Oxygen	08:37:14	>>>			

Dashboard reports

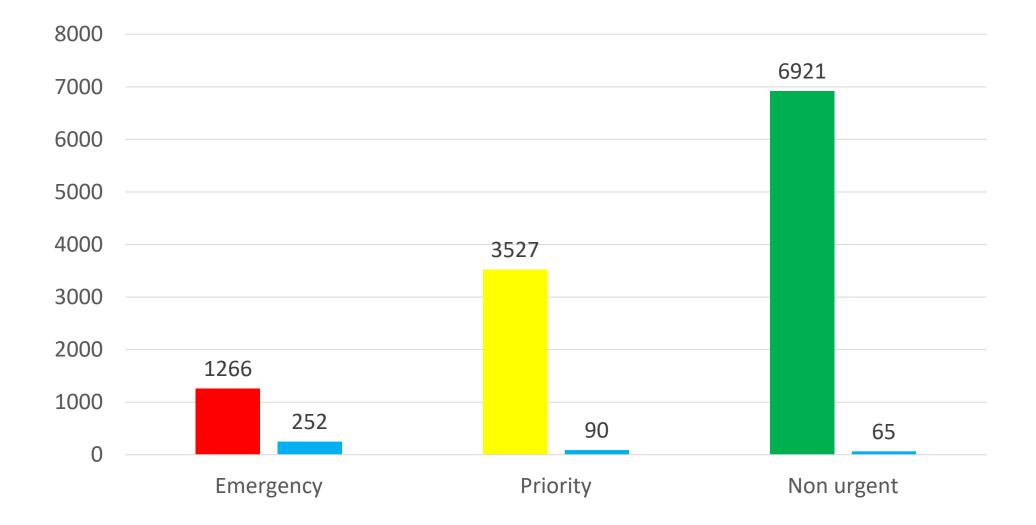


SMART TRIAGE SUMMARY

Month	Triages	Admissions	Anthropometrics	Pulse oximetry
December	680	19 (2.8%)	636 (93.5%)	668 (98.2%)
January	1053	34 (3.2%)	993 (94.3%)	1032 (98.0%)
February	1434	53 (3.7%)	1343 (93.7%)	1399 (97.6%)
March	1713	60 (3.5%)	1590 (92.8%)	1670 (97.5%)
April	1157	47 (4.1%)	1115 (96.4%)	1116 (96.4%)
May	1146	38 (3.3%)	1063 (92.8%)	1110 (96.8%)
June	1431	52 (3.6%)	1356 (94.8%)	1380 (96.4%)
July	1033	40 (3.9%)	913 (88.4%)	1008 (97.5%)
August	831	27 (3.2%)	771 (92.8%)	813 (97.8%)
September	1236	37 (3.0)	1155 (93.4%)	1207 (97.5%)

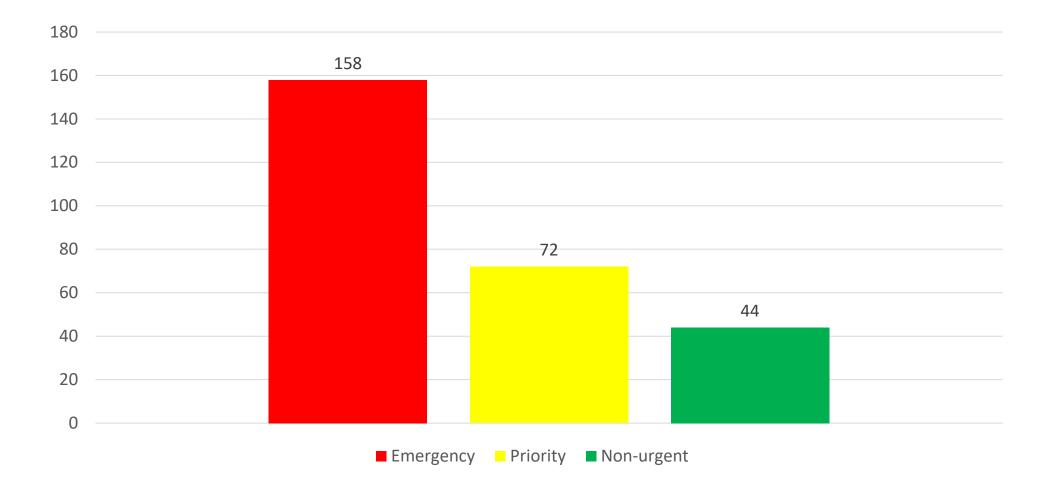


TRIAGE CATEGORIES

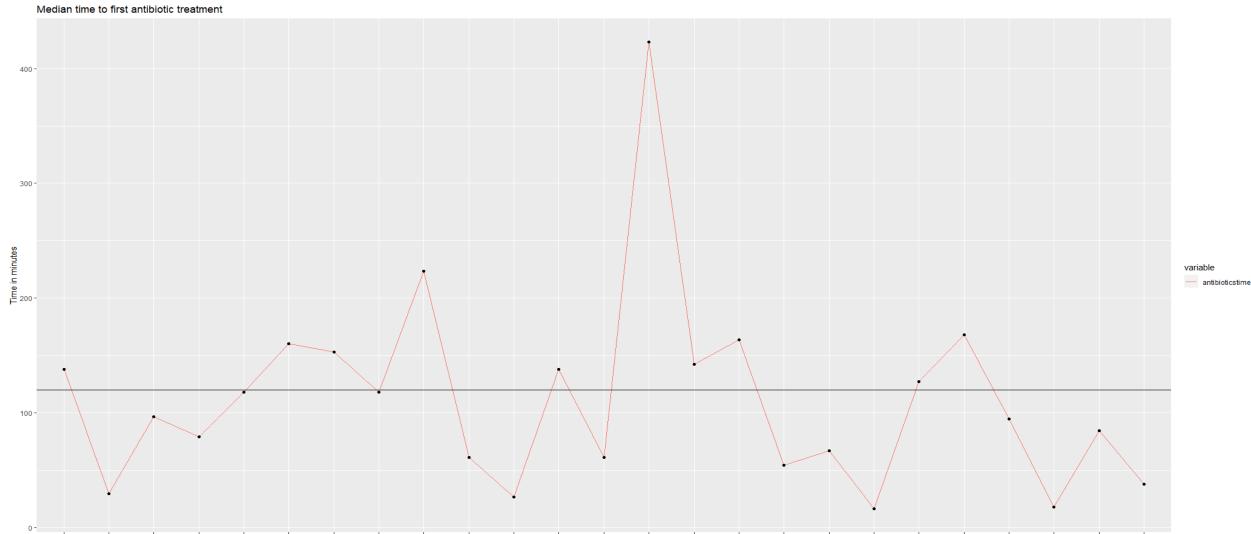




Admission per triage category



Median time to antibiotics



Dec 12-Dec 19-Dec 25 Jan 2-Jan 8 Jan 9-Jan 15 Jan 16-Jan 16-Jan 22 Jan 24-Jan 30 Jan 31-Feb & to 07- Feb 12eb 14- Feb 28eb 28- Mar06Mar07- Mar13Mar14- Mar20Mar21-Mar27Mar 28-April 0April 10-April 110-pril 118- April 12April 25- May0 May02- May19May16- May24May23- May29may30-June0fine06-June 12









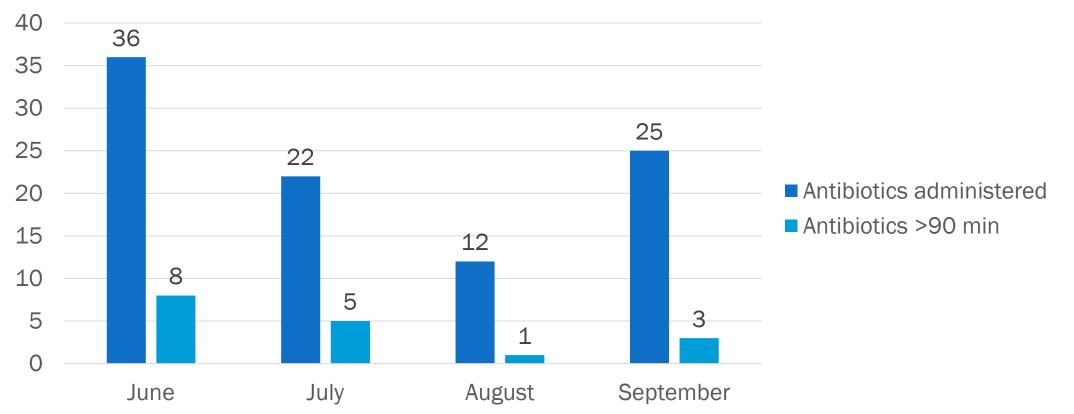
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All triaged children to receive treatment within 90 minutes from the time of triage.



TIME TO ADMINISTRATION OF ANTIBIOTICS

Emergency patients receiving antibiotics







Adoption of Smart Triage in Mbagathi County Hospital

Improved patient flow at the OPD Prioritization of critically ill children. Tracking of treatment administered in the acute room





Success







Beacon loss

Breakdown of pulse oximeters

Triaging on weekends

Smart Triage Potential Applications







Improve risk assessment and prioritization of critically ill children at triage. Increase the proportion of critically ill children receiving treatment within 1 hour of arrival. Improve effectiveness and efficiency of patient flow and resource allocation.

*Integration with existing electronic health records (EHRs) in hospitals

BMC Health Services Research

STUDY PROTOCOL

Smart triage: triage and management of sepsis in children using the point-of-care Pediatric Rapid Sepsis Trigger (PRST) tool



Open Access

Alishah Mawji^{1*}, Edmond Li², Clare Komugisha³, Samuel Akech⁴, Dustin Dunsmuir⁵, Matthew O. Wiens⁶, Niranjan Kissoon⁷, Nathan Kenya-Mugisha³, Abner Tagoola⁸, David Kimutai⁹, Jeffrey N. Bone¹⁰, Guy Dumont¹¹ and J. Mark Ansermino¹

STUDY TEAM

Kenya: David Kimutai, Mary Ouma, Stephen Kamau, Joyce Kigo, Ismail Mohammed, Samuel Akech Uganda: Clare Komugisha, Nathan Kenya-Mugisha, Abner Tagoola University of British Columbia, Canada : Alishah Mawji, Edmond Li, Dustin Dunsmuir, Matthew O. Wiens, Niranjan Kissoon, Jeffrey N. Bone, Guy Dumont, J. Mark Ansermino

PARTICIPANTS AND THEIR FAMILIES

KEMRI Wellcome Trust







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