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Disaster Management

- Motivation
- SMART
 - Project overview
 - System
 - Results
 - Lessons learned



Emergency Medical Response

Locate

Rescue

Assess/Triage

Care

Identify

Transport

Resource allocation needs to change according to evolving conditions





How Can We Provide Best Care?

- Monitor patients
 - How are they?
 - Where are they?
 - Who is the primary responder?
- Monitor caregivers
 - Locate nearest available provider
 - Avoid broadcast alerts

- Track
 - Equipment
 - Providers
 - Transport units

- Make decisions
 - Resource allocation



Current Care



Paper tags

- Vital signs recorded periodically
- ESI indicated by detaching colored part

- Assessment
- Triage
 - Emergency Severity Index (ESI)
- Prioritization

Continuous Remote Monitoring



e-tags

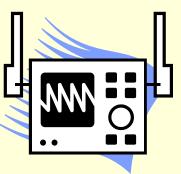
Vital signs analyzed continuously Updatable Emergency Severity Index Remote transmission





Rationale

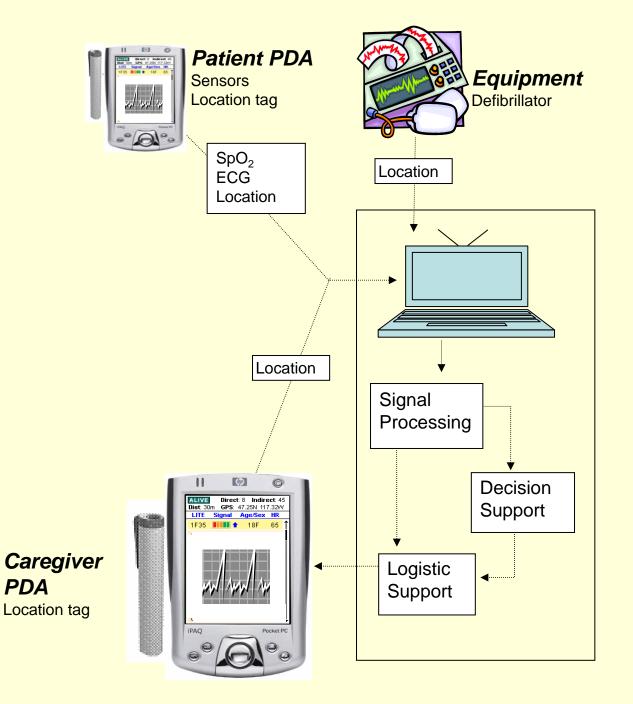
- Monitor patients' vital signs and location in nontraditional contexts:
 - Mass casualty situations
 - While waiting for medical attention
 - In an ambulance
 - At home
- Make technology part of standard of care so it does not have to change in disaster situations



SMART Testbed: Emergency Department at BWH

- Excessive time spent waiting
 - 3 hour wait for medical care
- Difficulty finding patients, personnel and equipment
 - over 50 beds in three different units
 - units expand and contract
- Triage Priority System cannot account for changes
 - Medical conditions can worsen in waiting room
- Uncoordinated alarms
 - sensory overload





Location System

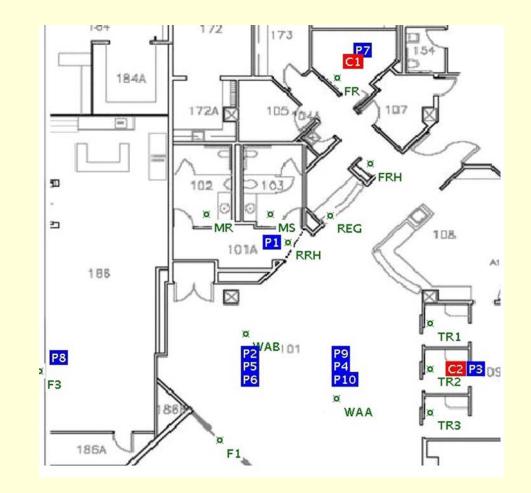
 Patients, Providers, Vehicles

Indoor

- Ultrasound-based (Sonitor Technology)
- Room and zone-level location

Outdoor

Commercial GPS



Sonitor Indoor Location: Tags and Detectors

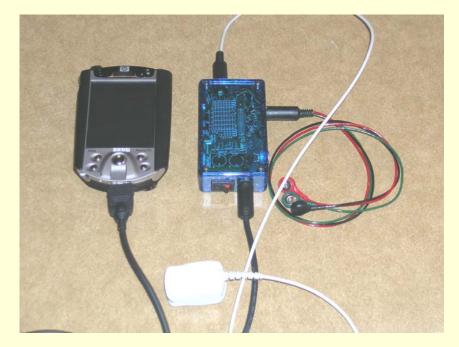


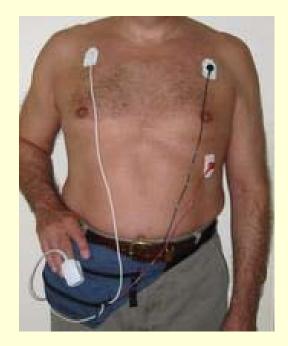
Other Indoor Positioning Systems

- RFID (passive and active)
- Cricket (ultrasound and RF)
- 802.11-based tracking



Patient Monitoring System



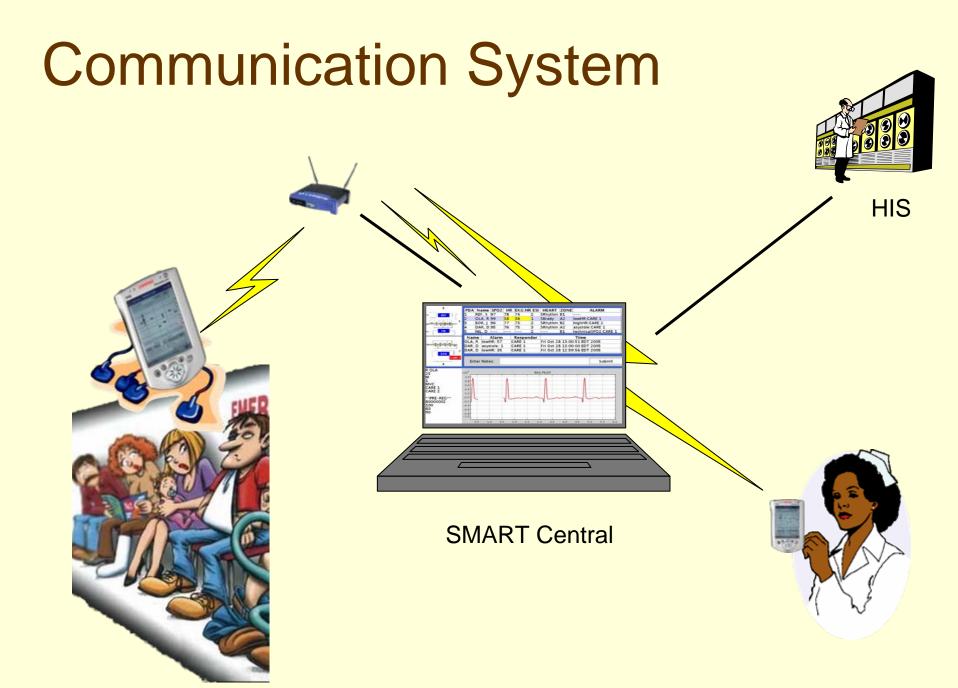


One lead EKG

Oximeter

Patient Monitoring



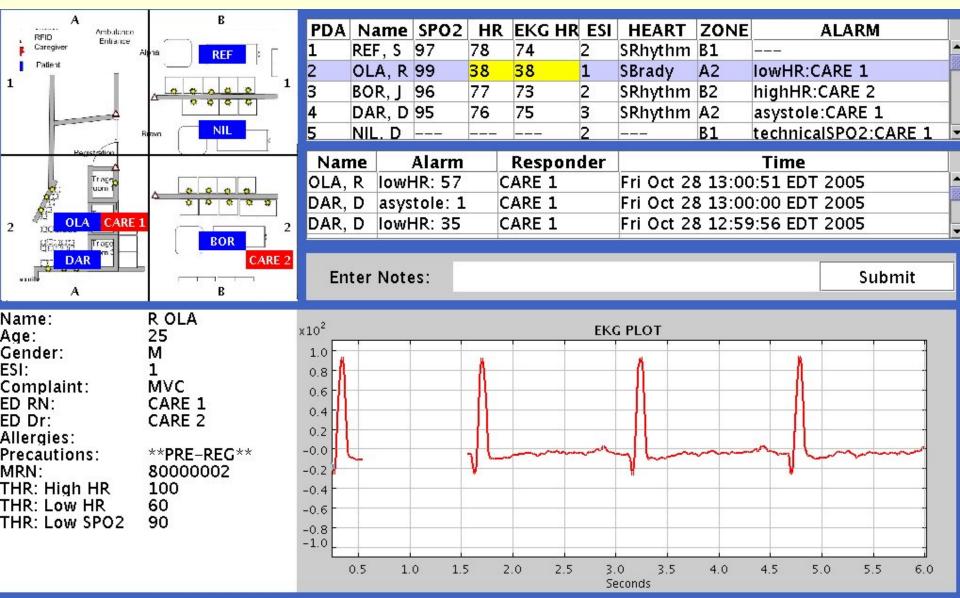


SMART Central



IRB requirement: ACLS-trained professional to monitor the central station (the "SMART Operator")

SMART Central



Caregiver PDA



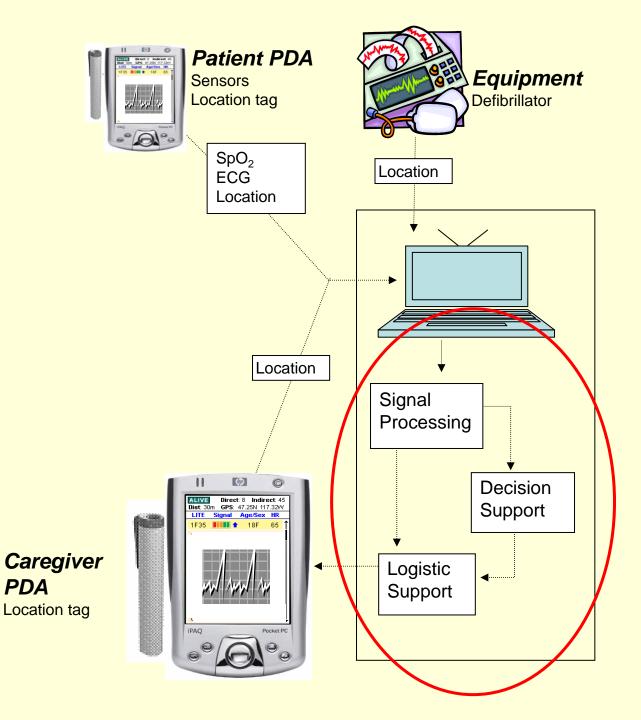


Ambulance Bridge



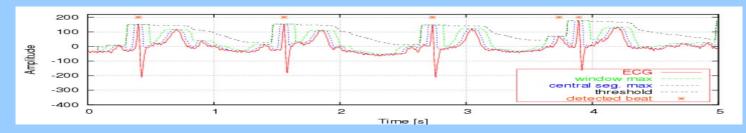
SMART Central with GPS Location



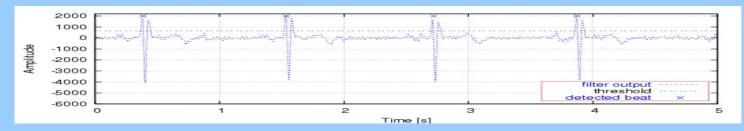


Beat Detection Algorithms

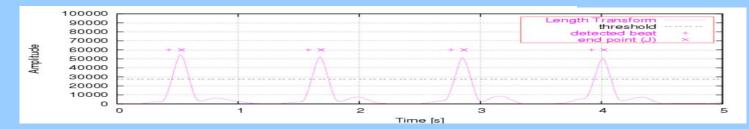




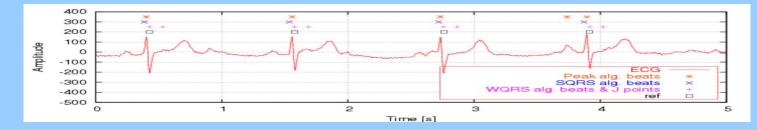
SQRS Alg. (FIR filter)



WQRS Alg. (Length transf.)

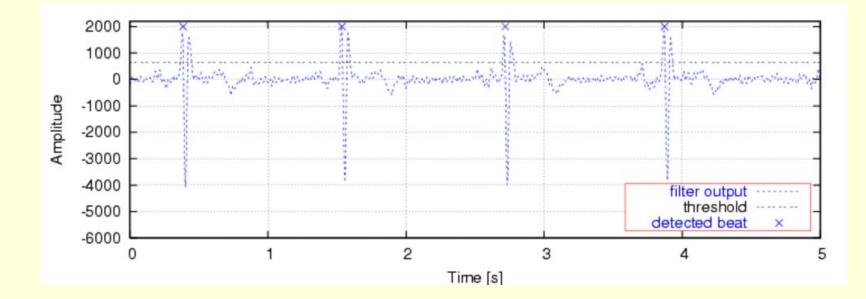


Comparison



Signal Processing

- Several algorithms were implemented
- Simple SQRS algorithm was selected
- Comparisons with QRS detection from oximeter showed some discrepancies



Decision Support System

- Integration of data from multiple sensors
- Recognition of potentially dangerous conditions
 - Arrhytmia diagnoses
- Logistics
- Alerts to specific providers
 - Avoid broadcast alerts
 - Minimize false alarms
 - Escalation strategy



Oximeter Medical Alarms

- High HR
 - Heart rate from oximeter sensor above patientspecific threshold (default threshold is 100bpm)
- Low HR
 - Heart rate from oximeter sensor below patientspecific threshold (default threshold is 60bpm)
- Low SpO2
 - Oxygen saturation below patient-specific threshold (default threshold is 90%)

ECG Medical Alarms

- Tachycardia, Bradycardia
- Irregular
 - ECG QRS complexes are irregularly spaced
- Asystole
 - No beat detected in 3 seconds
- Ventricular Fibrillation
 - ECG shows artifacts, abnormal skewness, wide waves or no waves, lacks QRS complexes, and the SpO2 heart rate is missing, below 20bpm, or above 150bpm
- Ventricular Tachycardia
 - ECG has wide QRS complexes and heart rate > 100bpm

Technical Alarms

- Leads Off
 - ECG lead is off (signal is saturated)
- No signal
 - No ECG data received
- Technical SpO₂
 - Oximeter sensor removed from finger
- AWOL (away without leave)
 - No communication between PDA and SMART Central
- Battery
 - Low battery (below 20%)

Poseidon Disaster Drill

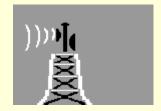
- 50 federal, state, local agencies
- \$750,000
- 150 injured, 25 dead
- threat at LNG (liquid natural gas) facility
- Cambridge Galleria (mall) with a dirty bomb
- (Volunteer) patients processed as usual and delivered to a variety of hospitals
- at BWH, SMART monitored the arrivals (after decontamination)
- system set up quickly ~5 minutes: one laptop, one wireless hub
- 8 patients monitored

Formative Evaluation

Feasibility of devices

- Will patients wear the monitor?

- Reliability of devices
 - Are there benefits in dual monitoring?
 - How well do indoor positioning systems work?



Feasibility

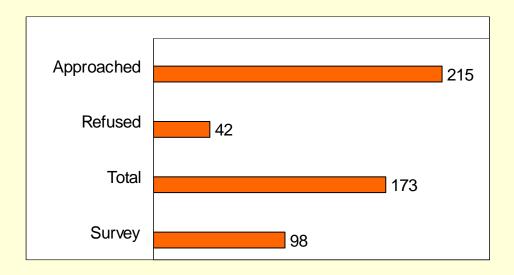
- Of first 42 eligible patients approached, 33 signed consent form
 - 1 changed his mind before starting
 - -2 were admitted before having chance to start
- No patient returned the device before end of study
- Duration varied from 26 seconds to 2:24h
- 20 patients answered surveys

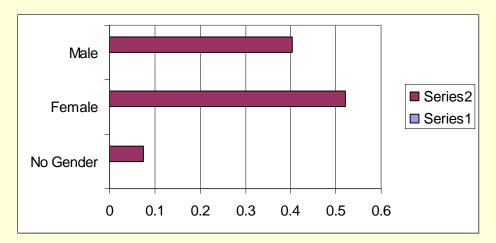


Data

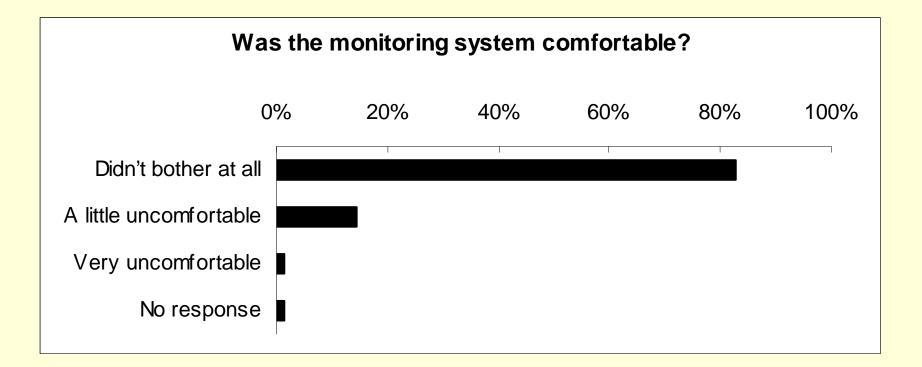
- Eligibility: cardiovascular complaint, not too severe, during hours covered by the SMART operator
- Signed informed consent
- Survey languages:
 English, Spanish, Portuguese
- We collected 129hr 59min of data

Subjects

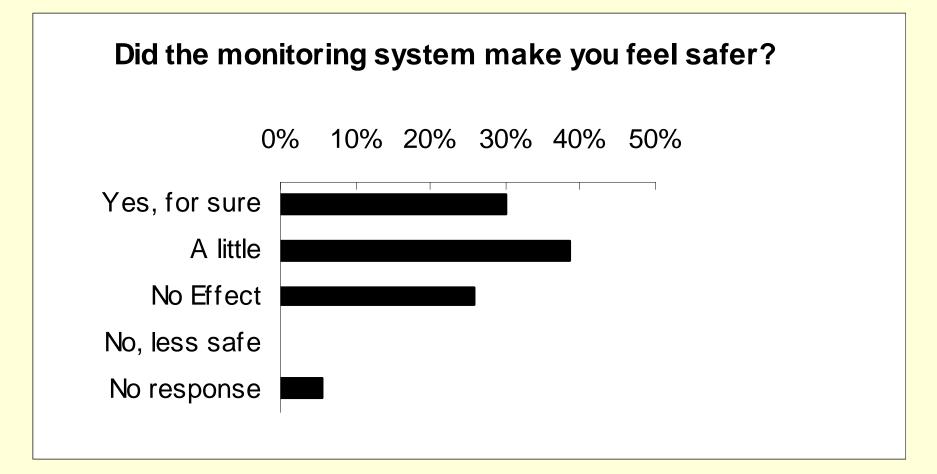




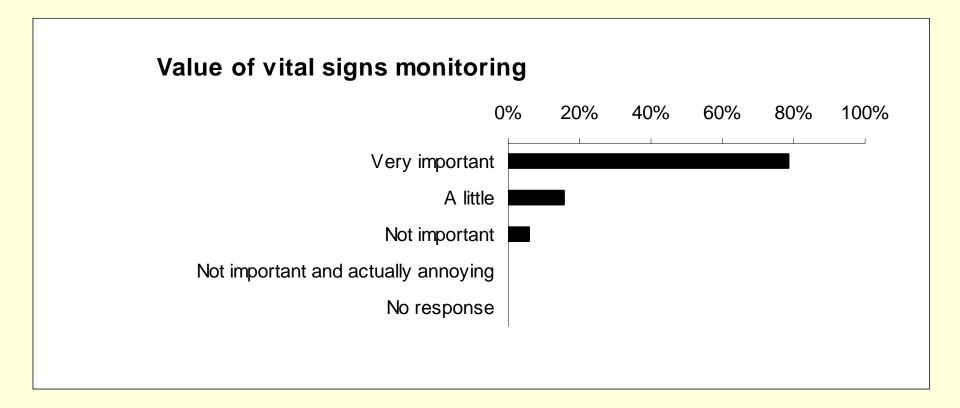
Patient Survey: Comfort



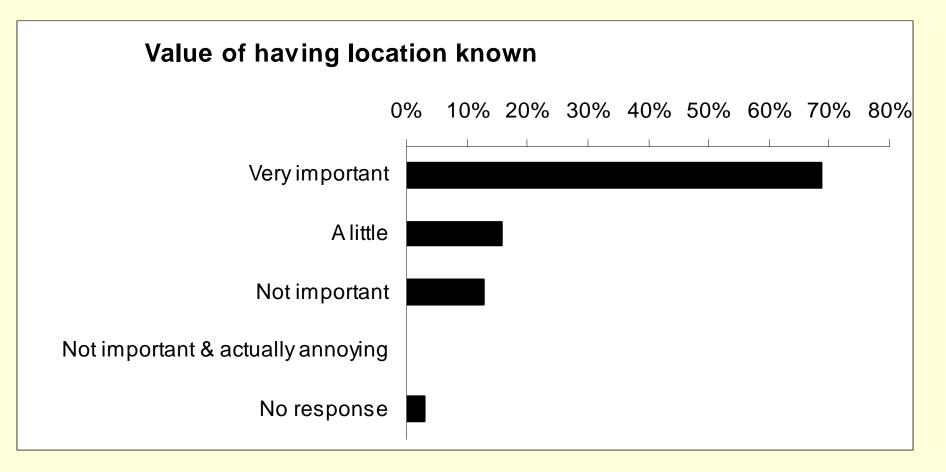
Patient Survey: Safety



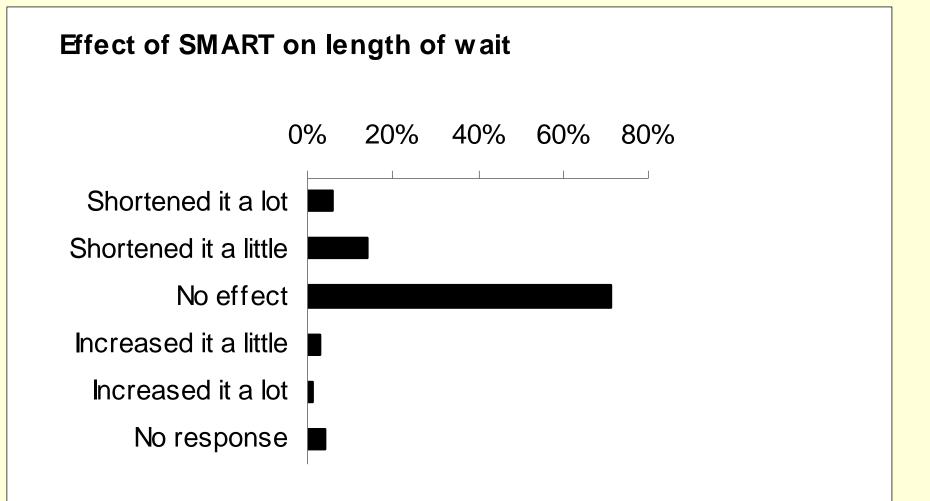
Patient Survey: Value of Monitoring Vital Signs



Patient Survey: Value of Location Monitoring

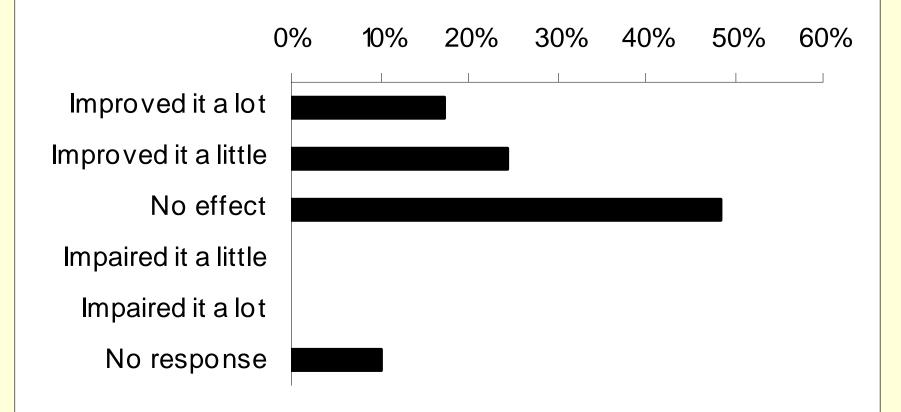


Patient Survey: Effect on Wait

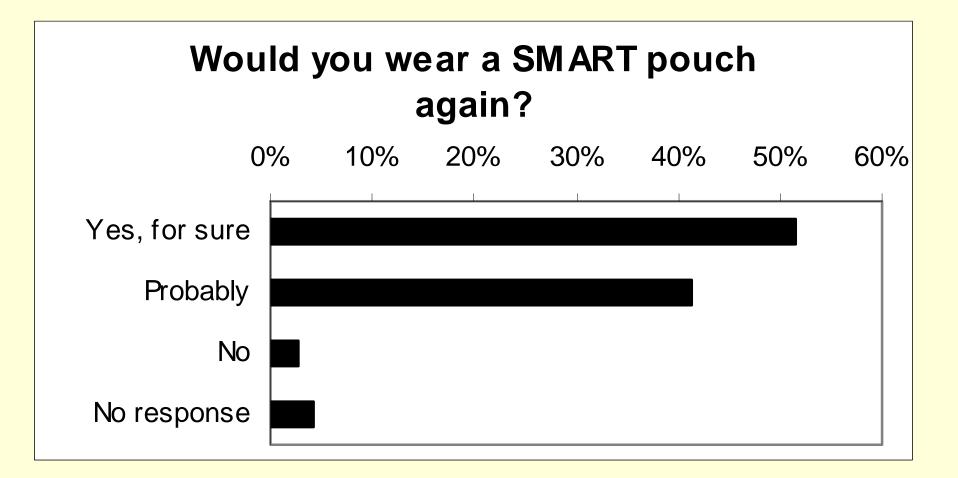


Patient Survey: Effect on Care

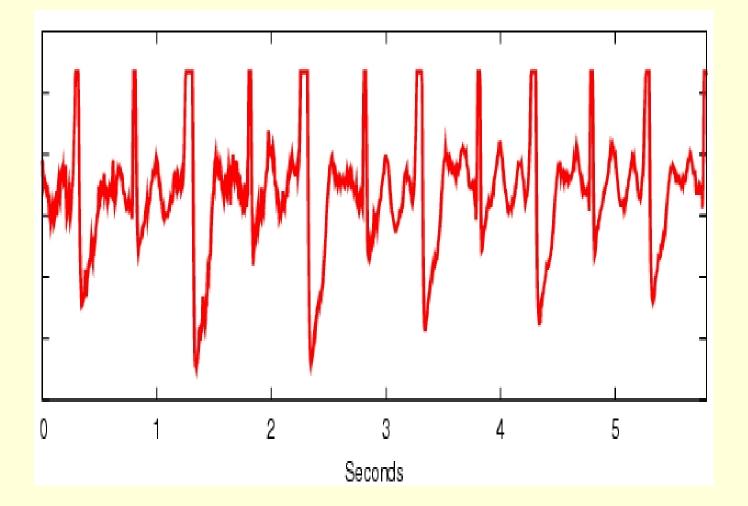


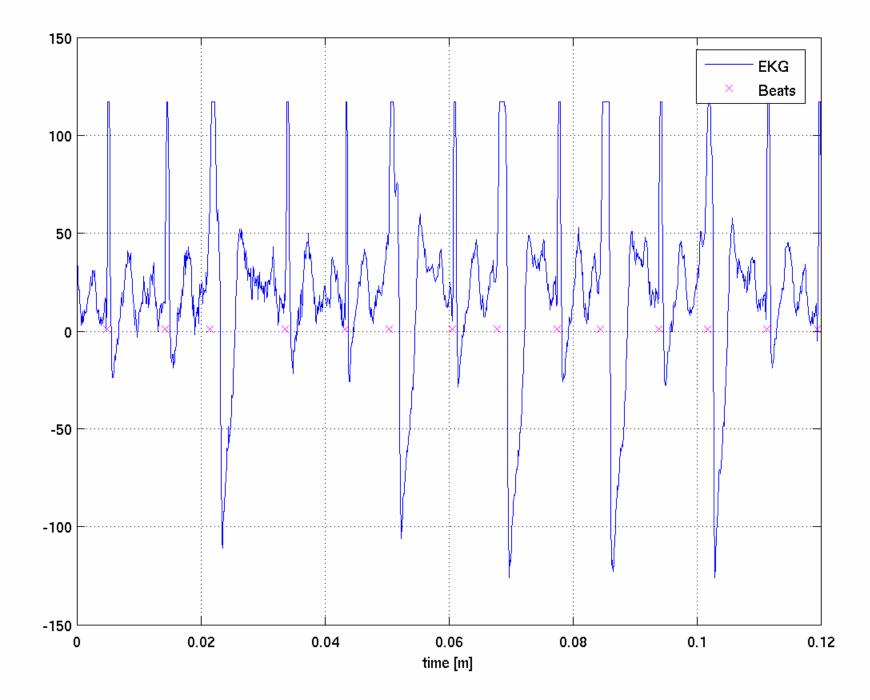


Patient Survey: Wear Again?

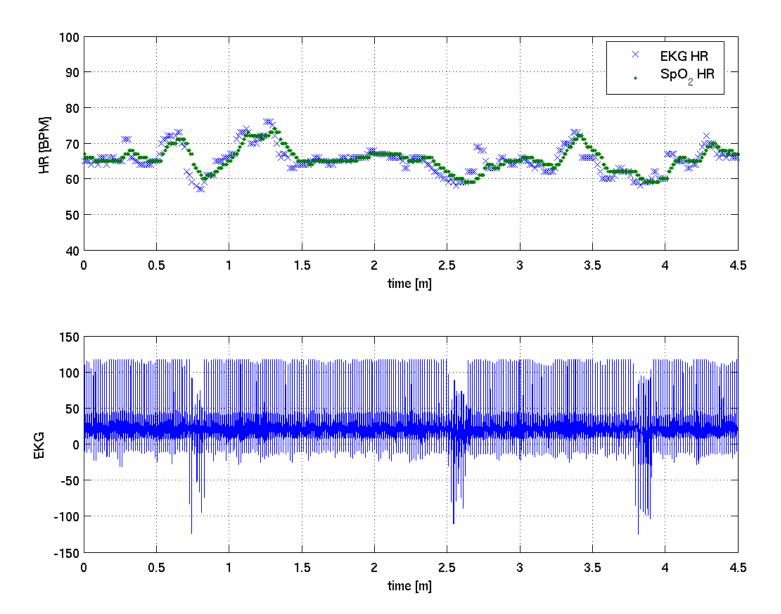


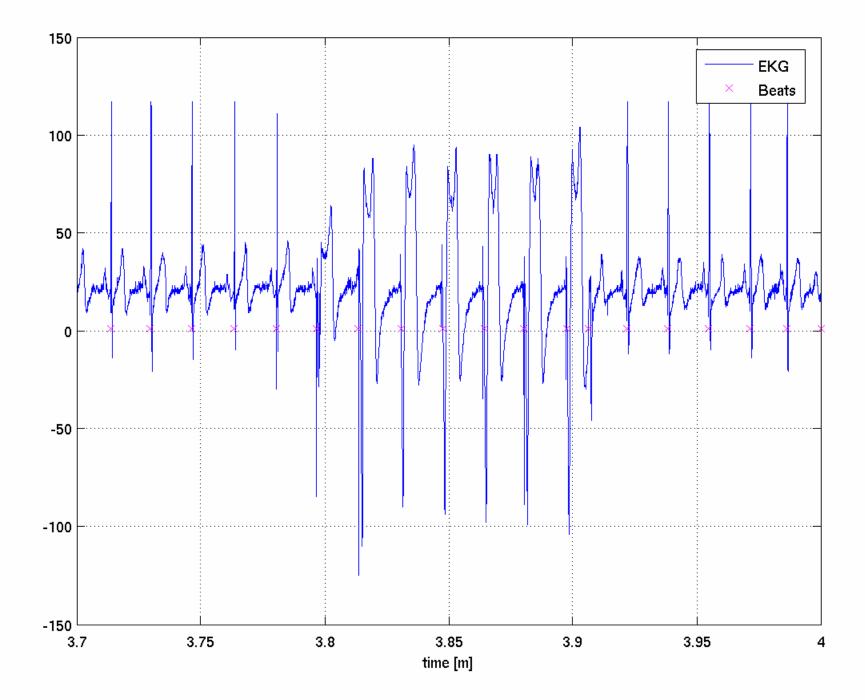
Reprioritization Due to Bigeminy





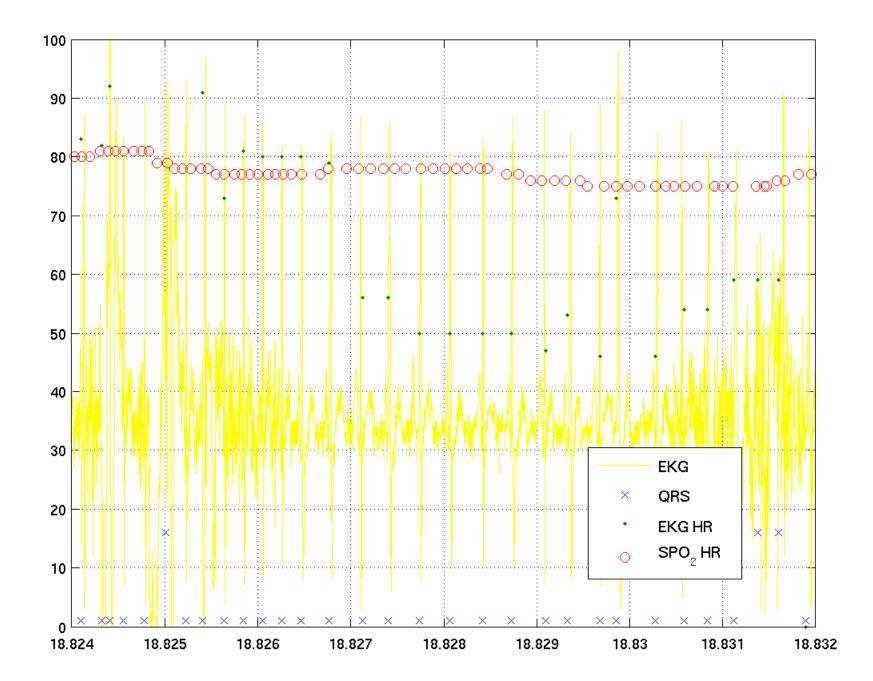
Is the Pace Maker Working?



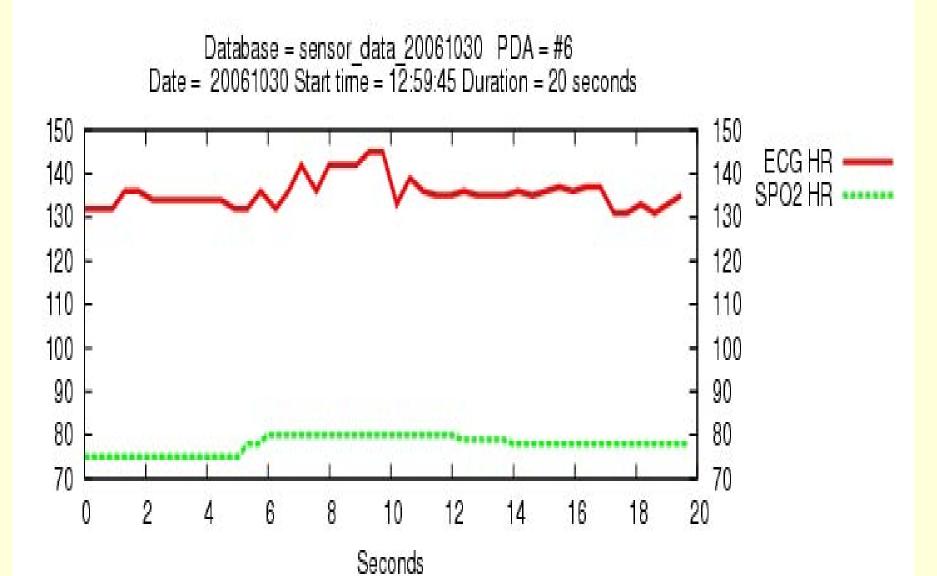


Mismatch

- ECG diagnosis inconsistent with SpO2 heart rate:
 - (a) if ECG indicates asystole and oximeter heart rate is between 20bpm and 150 bpm, or
 - (b) if ECG indicates ventricular fibrillation and oximeter heart rate is between 20bpm and 150 bpm with noisy artifacts and acceptable skewness in ECG signal



Possible Atrial Fibrillation



SpO2 Alarm Results

Alarm	Total	True Positive	False Positive	Unclear
High HR (SpO2 sensor)	79	75	1	3
Low HR (SpO2 sensor)	21	15	3	3
Low SpO ₂				
	44	35	5	4

ECG Alarm Results

Alarm	Total	True Positive	False Positive	Unclear	Comments
Tachycardia (ECG)	124	61	31	32	Noise often mistaken for tachycardia
Bradycardia (ECG)	18	12	5	1	
Irregular rhythm	116	43	34	39	Noise often mistaken for irregular

More ECG Alarm Results

Alarm	Total	True Positive	False Positive	Unclear	Comments
Asystole	79	0	79	0	No SpO2 sensor present + noise or no signal
Ventricular Fibrillation	46	0	46	0	No SpO2 sensor present + noise
Ventricular Tachycardia	0	0	0	0	

More ECG Alarm Results

Alarm	Total	True Positive	False Positive	Unclear	Comments
Irregular rhythm	116	43	34	39	Noise often mistaken for irregular
Mismatch	59	59	0	0	
Noisy	59	47	12	0	
Leads Off	56	49	2	5	Noise sometimes mistaken for leads off
No Signal	0	0	0	0	

Technical Alarms

Alarm	Total	True Positive	False Positive	Unclear
SpO2 Sensor Off	86	85	1	0
AWOL	329	309	16	4
Battery	16	15	1	0

Lessons Learned (1)

- Acceptance of device by patients was high
- Institutional requirements for ACLS trained individual made testing of provider response not feasible
- ED doctors liked it, nurses accepted it, but wanted improvements: documentation of abnormalities in paper form was requested



Lessons Learned (2)

- The number of false positive alerts was still relatively high, but manageable for the SMART operator
- Location system was somewhat underutilized because of the low volume and limited space that needed coverage
- Technical solution to disaster management is even more feasible now than when this pilot started: a cost-effective system can be developed from off-the-shelf components

SMART Collaborators

Decision Systems Group

BWH

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