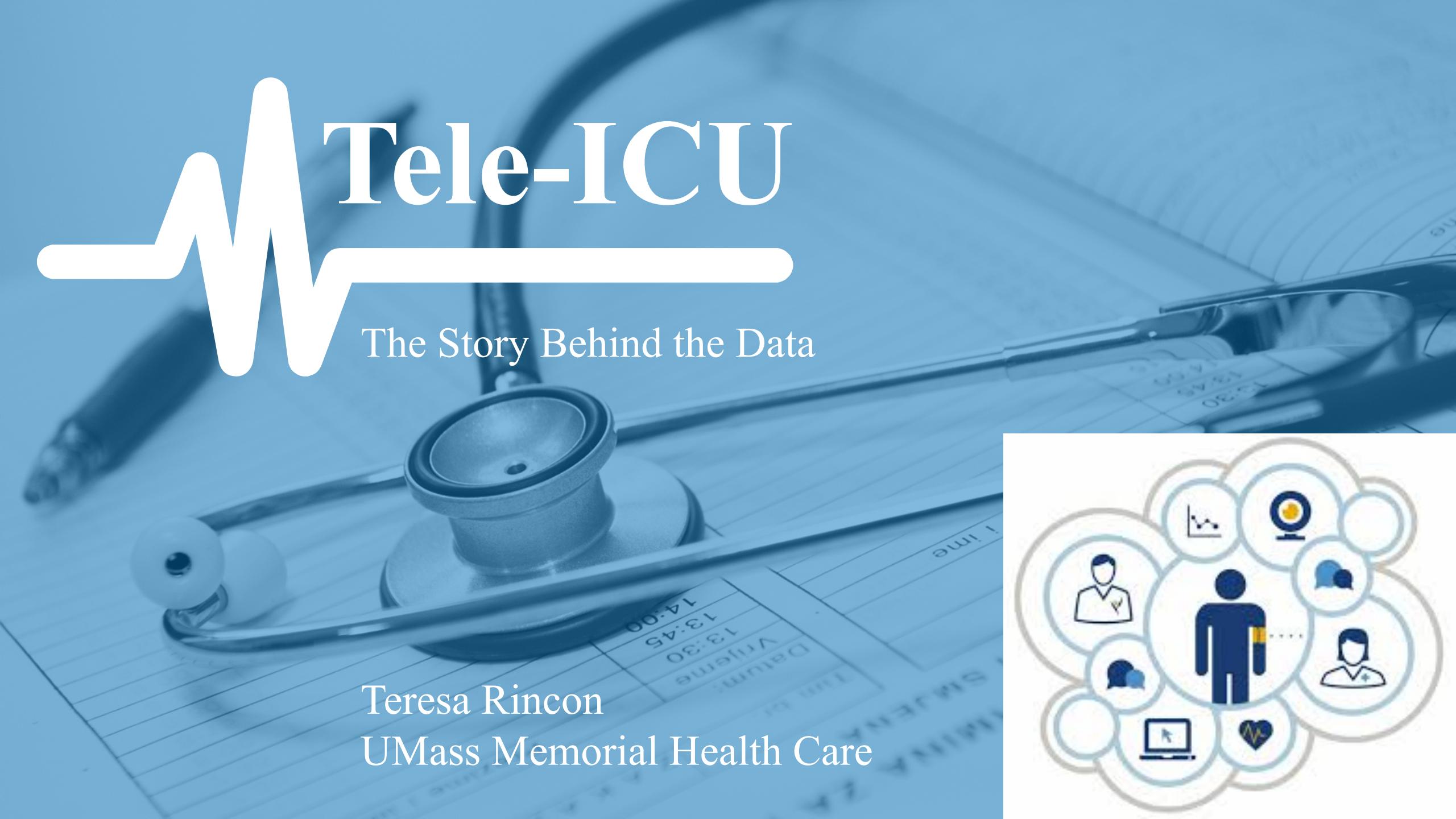


Tele-ICU



The Story Behind the Data

Teresa Rincon
UMass Memorial Health Care



Disclosures



**I have no disclosures or financial support or otherwise
to report**

OBJECTIVES



Describe the history of the Tele-ICU



Explain the role of Tele-ICU in the care of critically ill and injured patient

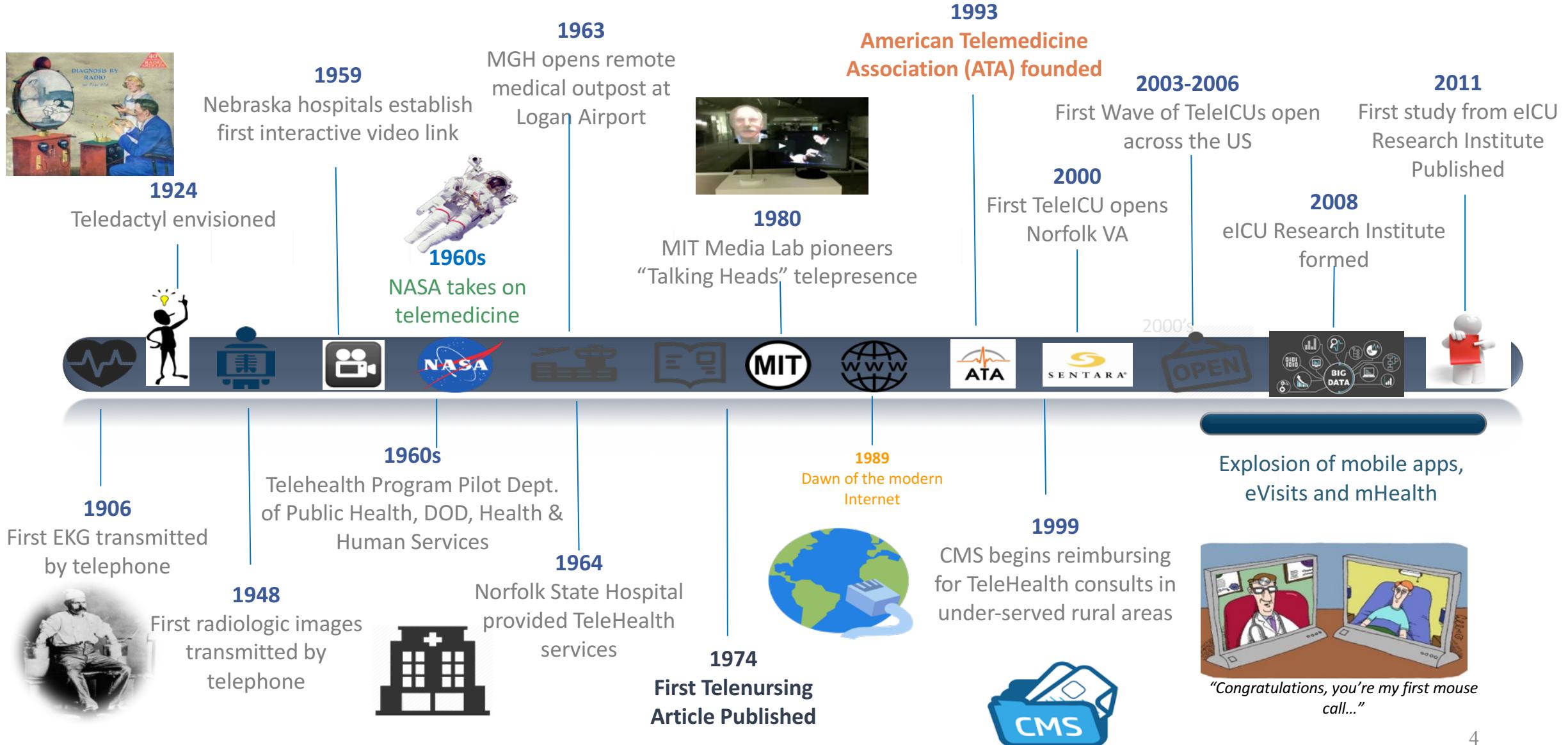


Examine the evolution of the eICU Research Institute (eRI)



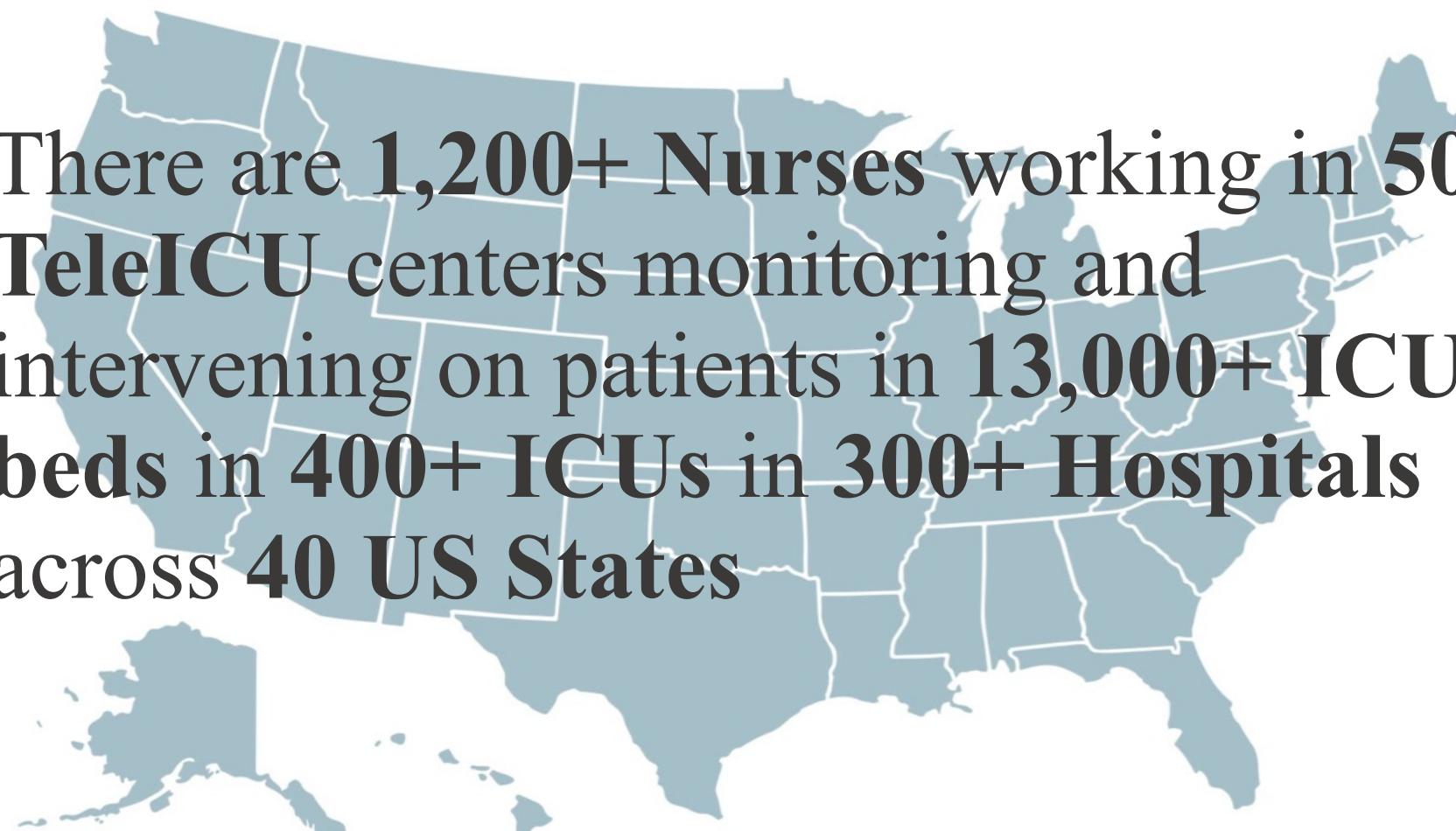
Review a study design using the complete eRI dataset

Evolution of Telehealth





TELEICU FAST FACTS



There are **1,200+** Nurses working in **50+** TeleICU centers monitoring and intervening on patients in **13,000+** ICU beds in **400+** ICUs in **300+** Hospitals across **40 US States**



WHY USE TELEICU?

WHY USE

TELEICU?



GROWING SERVICE

50 teleICU centers and 13,000 ICU beds in more than 400 ICUs across 40 US States

400 in 40

SHORTAGES

Shortage of clinical experts is growing

Knowledge deficit

THE FACTS

IMPACT ON OUTCOMES

Better adherence to best practices, decrease in length of stay, more lives saved

Lives saved!



COST EFFECTIVE

UMASS Critical Care \$50 million to the good after a decade of teleICU services

\$50 million



WHAT IS TELEICU?

TELEICU DEFINED

TeleICU is a centralized remote model of critical care delivery that uses special tools to leverage clinical expertise across a variety of clinical settings and geographical areas.

STRUCTURE TYPES

Care teams working in a defined physical structure are centralized. When care providers are not confined to a physical space it is considered decentralized.



TELEICU MODELS OF CARE

- Continuous Care is monitoring without interruption
- Responsive (Reactive) Care is unscheduled and prompted by an alert, alarm, page, telephone call...
- Scheduled Care are scheduled periodic consultations

SPECIAL TOOLS

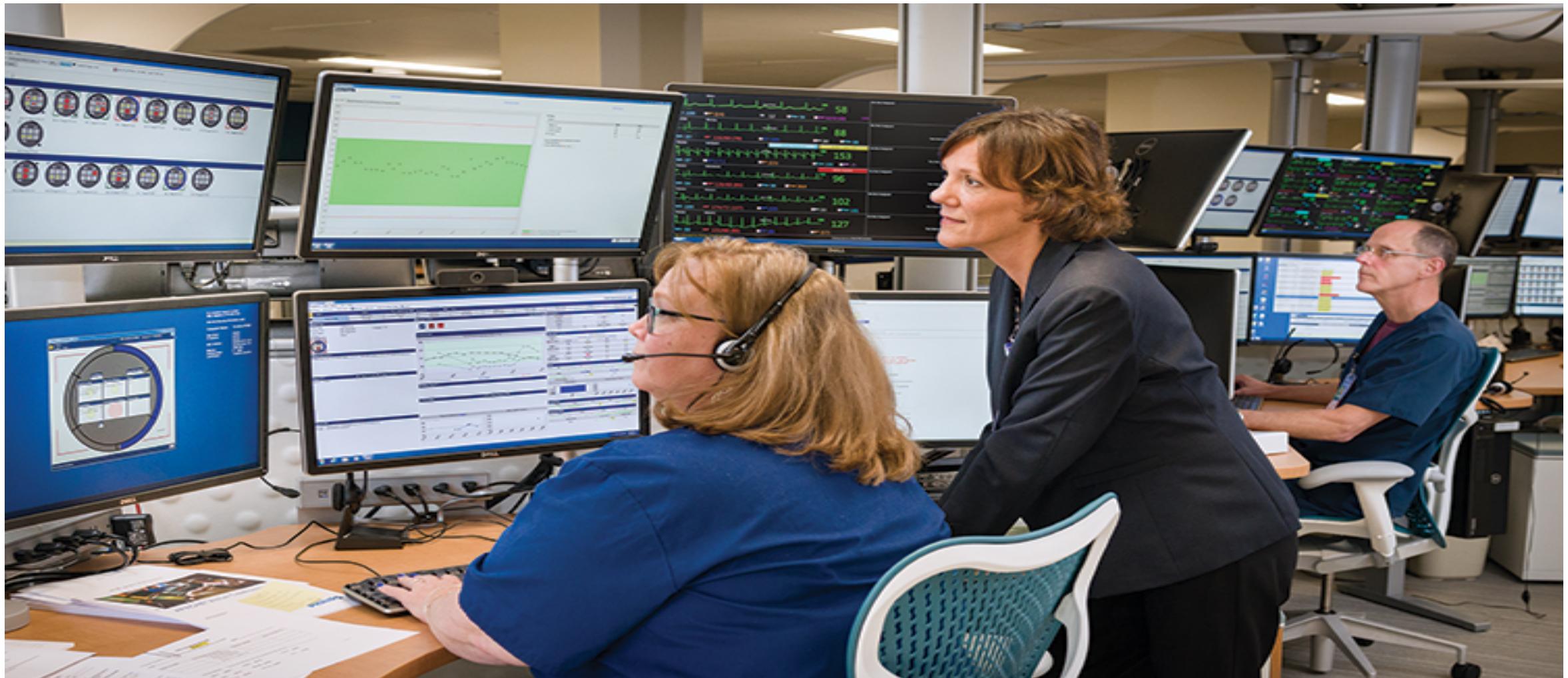
- Alerts are tools designed to recognizing signs of clinical deterioration
- Clinical decision support systems reduce the need to remember everything
- Tools support continuous capture, analyses, and disseminating of information
- Audio-video tools support remote assessment

1. ATA TeleICU Practice Guidelines Work Group. Guidelines for TeleICU Operations. ATA Standards & Guidelines. 2014;2014(June 21). <http://www.americantelemed.org/resources/standards/ata-standards-guidelines#.U7gm1hbZf1p>.

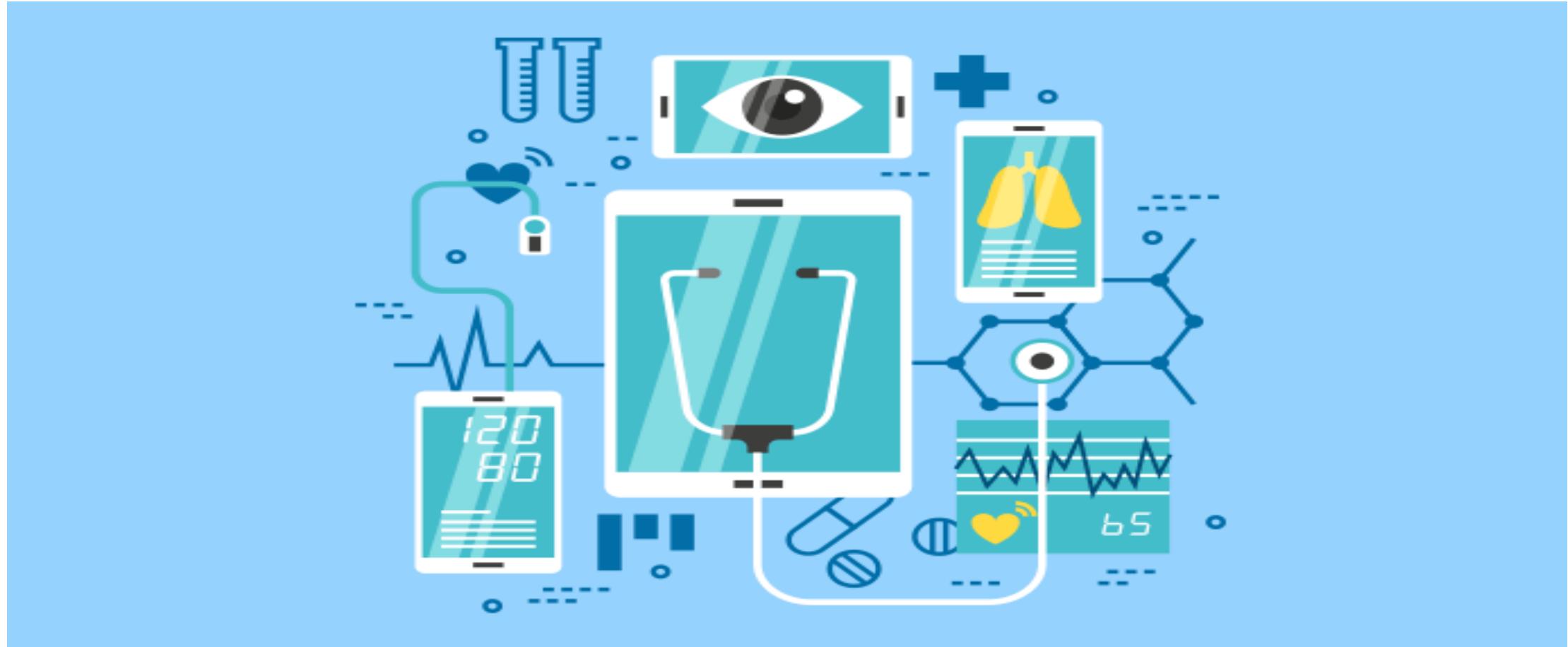
2. Lilly CM, Zubrow MT, Kempner KM, et al. Critical care telemedicine: evolution and state of the art. Crit Care Med. 2014;42(11):2429-2436.

3. Lilly CM, Motzkus C, Rincon T, Cody SE, Landry K, Irwin RS. ICU Telemedicine Program Financial Outcomes. Chest. 2017;151(2):286-297.

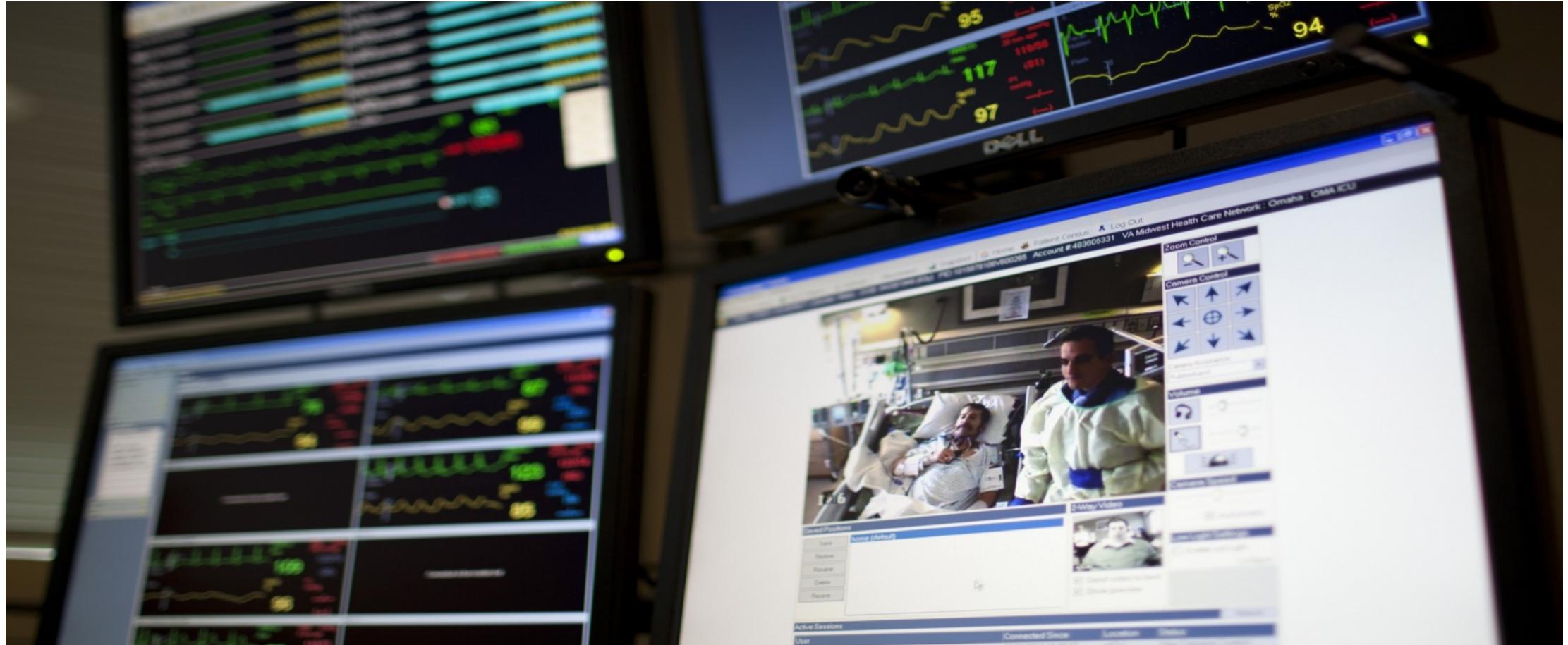
Special alerts designed to recognize signs of clinical deterioration



Clinical decision support systems reduce the need to remember everything



Audio-video tools support remote assessment



Inter-professional team of experts share knowledge



SQL
CORBA

ATOR

Y
Z

1

51

10

10

HESS

S

ACHEIVEMENTS: MULTIPLE PEER-
REVIEWED MANUSCRIPTS AND
PREDICTIVE MODELING AND CLINICAL
DECISION SUPPORT SYSTEMS

eICU RESEARCH INSTITUTE

Complete Dataset

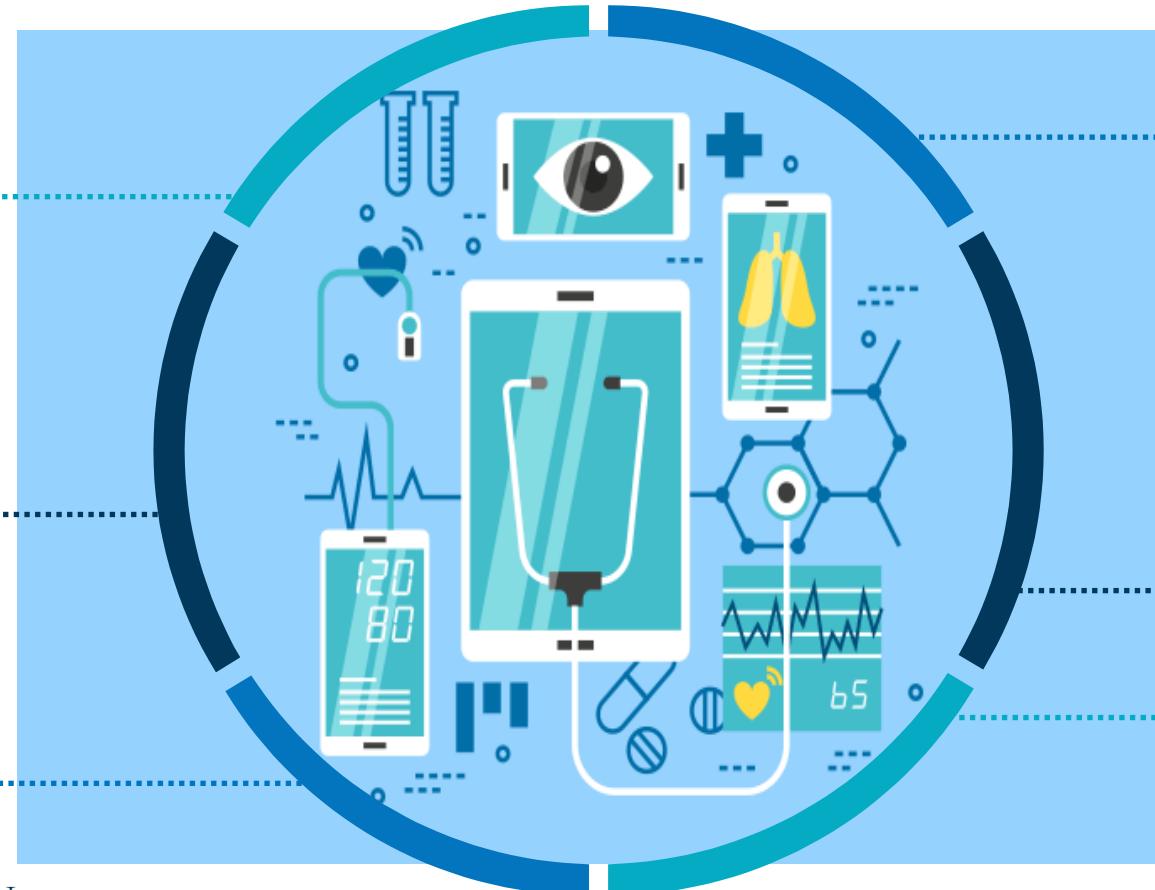
PATIENT DATA FROM 400+ ICUS
AT 300+ HOSPITALS ACROSS 40
STATES

CLINICAL DIAGNOSES DATA ON
3+ MILLION ICU PATIENT

STAYS 800+ BILLION LAB VALUES

100+ MILLION MEDICATION
ORDERS

2.8+ BILLION VITAL
SIGN MEASUREMENTS

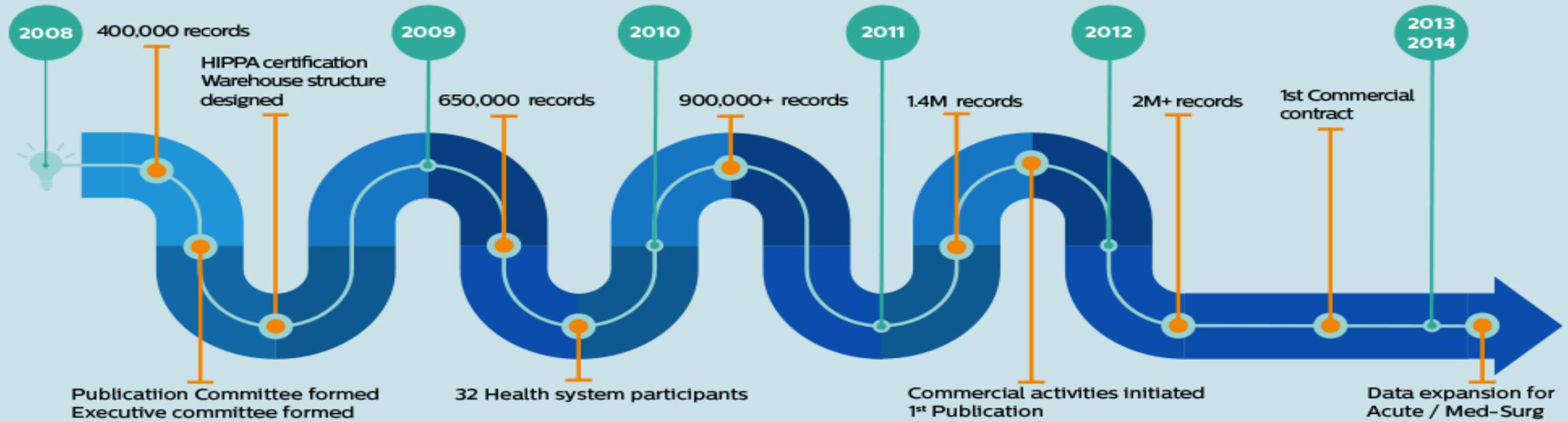


CHANGES OVER TIME



<https://www.usa.philips.com/healthcare/solutions/enterprise-TeleHealth/eri>

Continually evolving, continually improving



Primary documentation tool
Interfaces for ADT, Labs & VS
Med interfaces come later

More manual data entry

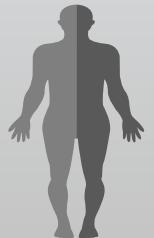
Additional clinical decision support tools and alerts developed
Meaningful use emerges

Hot fixes/upgrades

Primary documentation shifts to large EHR vendors

Reliance on interfaces

REVIEW OTHER eRI STUDIES



243,553 eligible patients in 271 ICUs 2008

Lilly C. et al Benchmark data from more than 240,000 adults that reflect the current practice of critical care in the United States. *Chest*. 2011

194,722 eligible patients 2008-2010

Badawi O et al. Association between intensive care unit-acquired dysglycemia and in-hospital mortality*. *Critical Care Medicine*. 2012

207,702 eligible patients in 344 ICUs 2008-2010

Waite MD, et al. Intensive care unit acquired hypernatremia is an independent predictor of increased mortality and length of stay. *Journal of Critical Care*. 2013

2,014 eligible patients in 344 ICUs 2008-2010

McPhee LC et al. Single-Dose Etomidate Is Not Associated With Increased Mortality in ICU Patients With Sepsis: Analysis of a Large Electronic ICU Database*. *Critical Care Medicine*. 2013

MY DISSERTATION STUDY

Prognostic accuracy of the SOFA score
and a sepsis prompt in discriminating in-
hospital mortality among patients with
sepsis in the intensive care unit



RAPID BREATHING



FAST HEART RATE



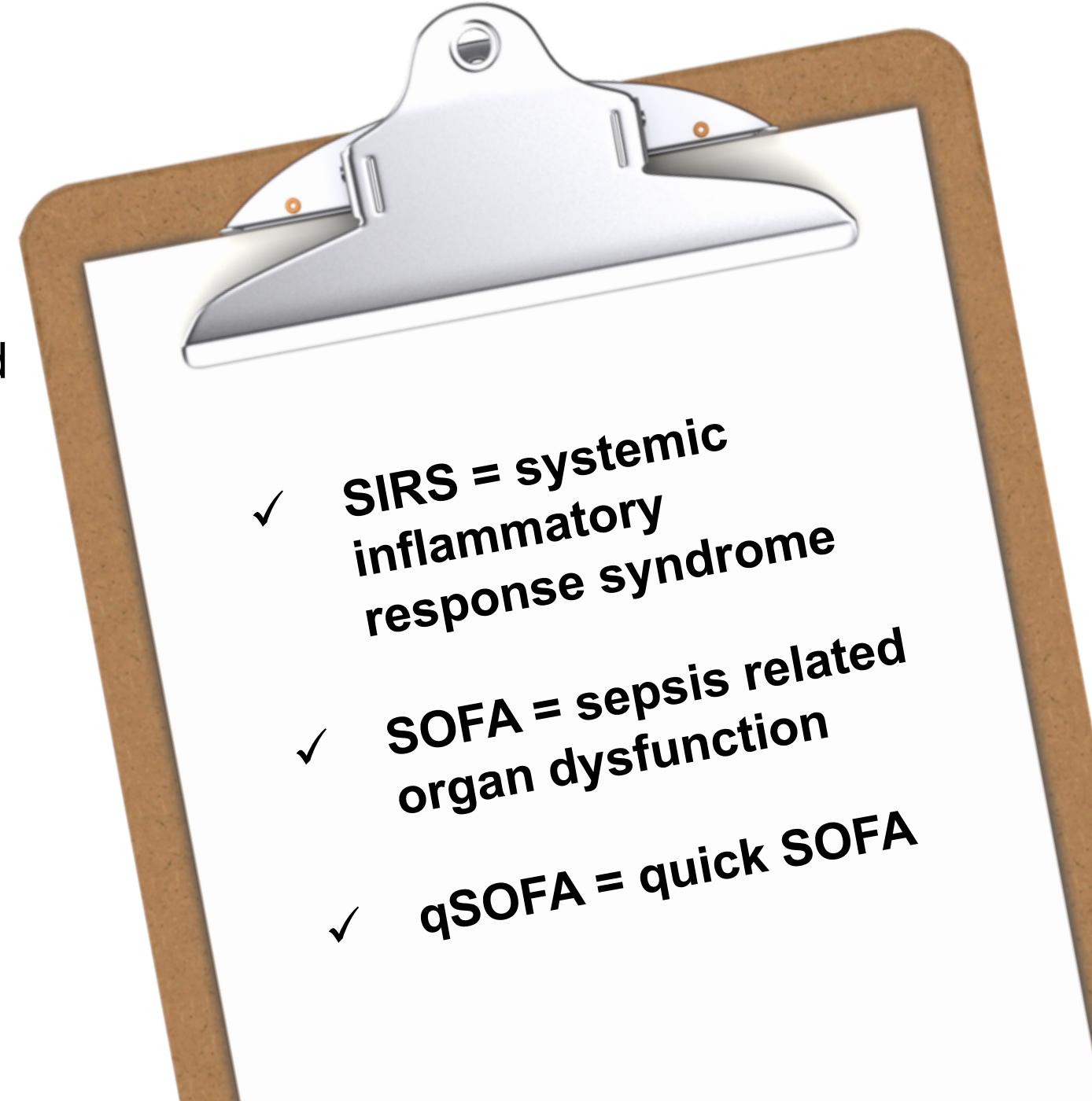
FEVER & CHILLS



CONFUSION

MY DISSERTATION STUDY

The **primary objective** is to conduct a retrospective study using a large data repository to determine if an electronic prompt that uses SIRs and organ failure criteria can detect sepsis AND to determine the prognostic accuracy of the SOFA score and the sepsis prompt in discriminating in-hospital mortality among patients with sepsis in the intensive care unit.



- ✓ SIRS = systemic inflammatory response syndrome
- ✓ SOFA = sepsis related organ dysfunction
- ✓ qSOFA = quick SOFA

ELIGIBLE PATIENTS



All ICU admissions from January 1, 2010 to December 31, 2015



Estimated number of ICU admissions = 2,400,000

2% will be <18 years and will be excluded



Estimated number of eligible patients = 2,352,000

20% will be readmissions and will be excluded



Estimated number of eligible patients = 1,881,600

80% will have APACHE (severity of illness) scores ≥ 1



Estimated number of eligible patients = 1,505,320

80% will have valid medication, laboratory, and vital sign data



Estimated number of eligible patients = 1,204,264

11% will have sepsis



Estimated number of eligible patients = 132,469



DETERMINING THE OUTCOME VARIABLES

Severe Sepsis:

A binary classification was made based on patients having one of the following diagnosis codes present within the first 24 hours of admission:

1. severe sepsis with/without septic shock OR
2. septic shock without severe sepsis OR
3. infection AND organ failure

Hospital discharge disposition:

alive versus expired



MAKING SENSE OF THE SEPSIS PROMPT VARIABLES



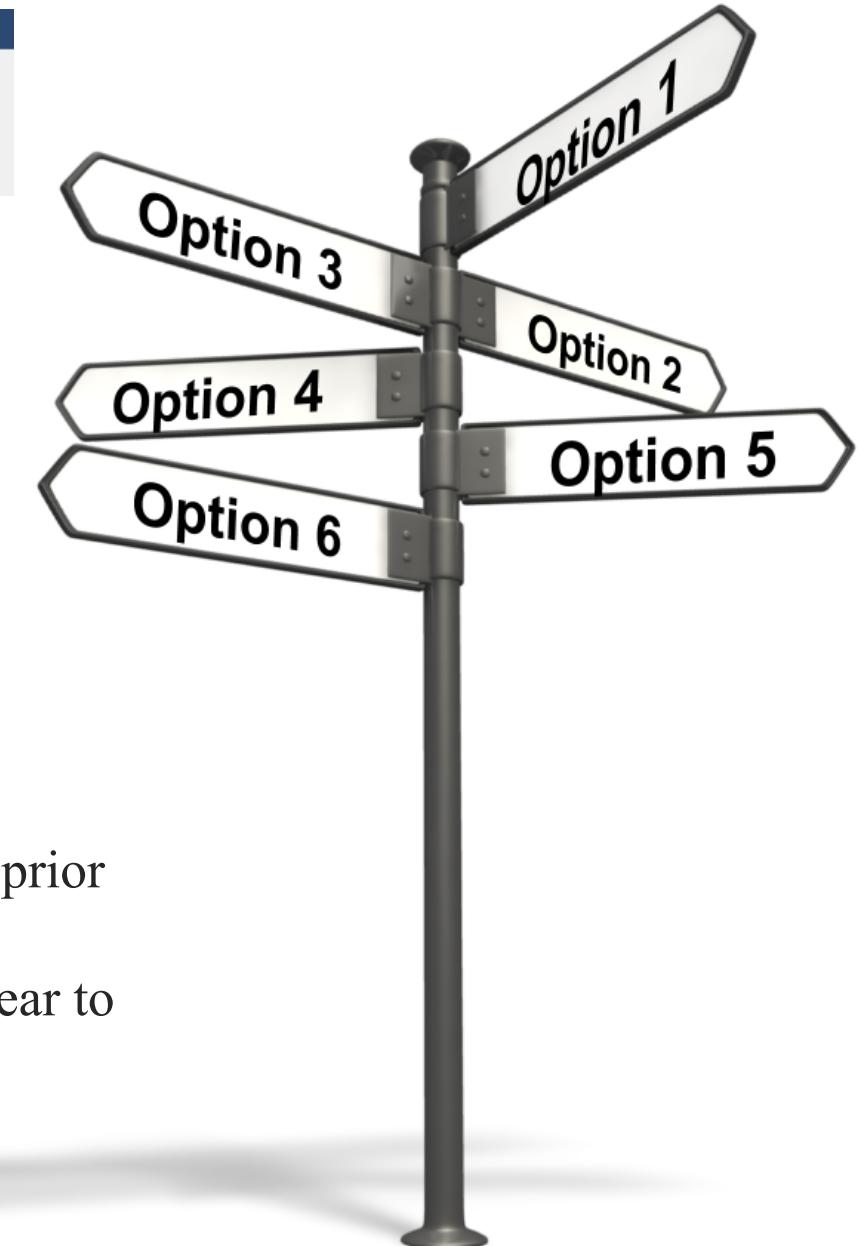
Multiple sepsis prompt variables

- prompt_severe_sepsis
- prompt_sepsis
- prompt_inflam
- prompt_inflam_with_org_dys
- prompt_clinical_response_req

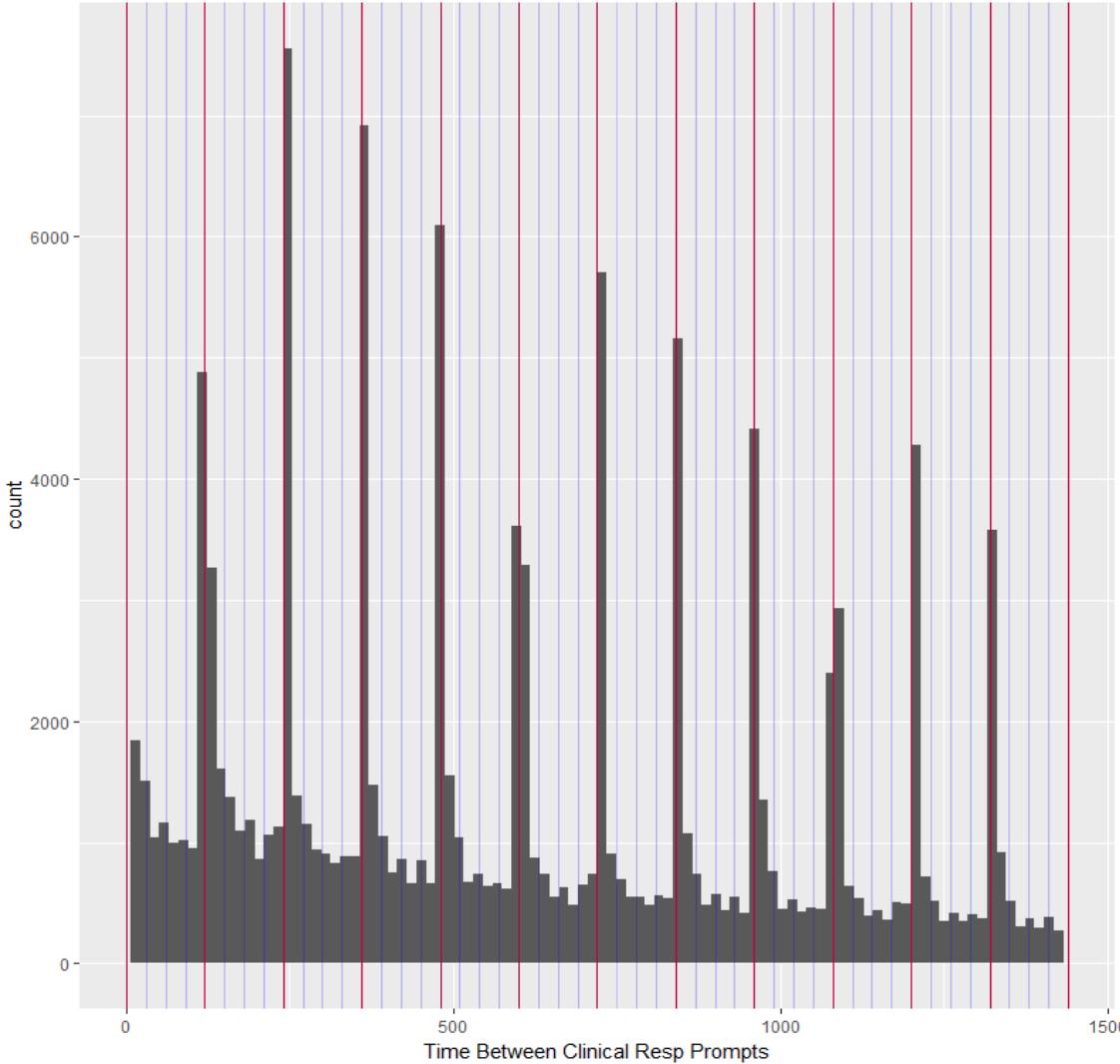


Timing of the prompt

- Some cases had negative trigger off sets (trigger time prior to ICU admission)
- Prompt activity varied from hospital to hospital and year to year



Sepsis Prompt Trigger Offsets

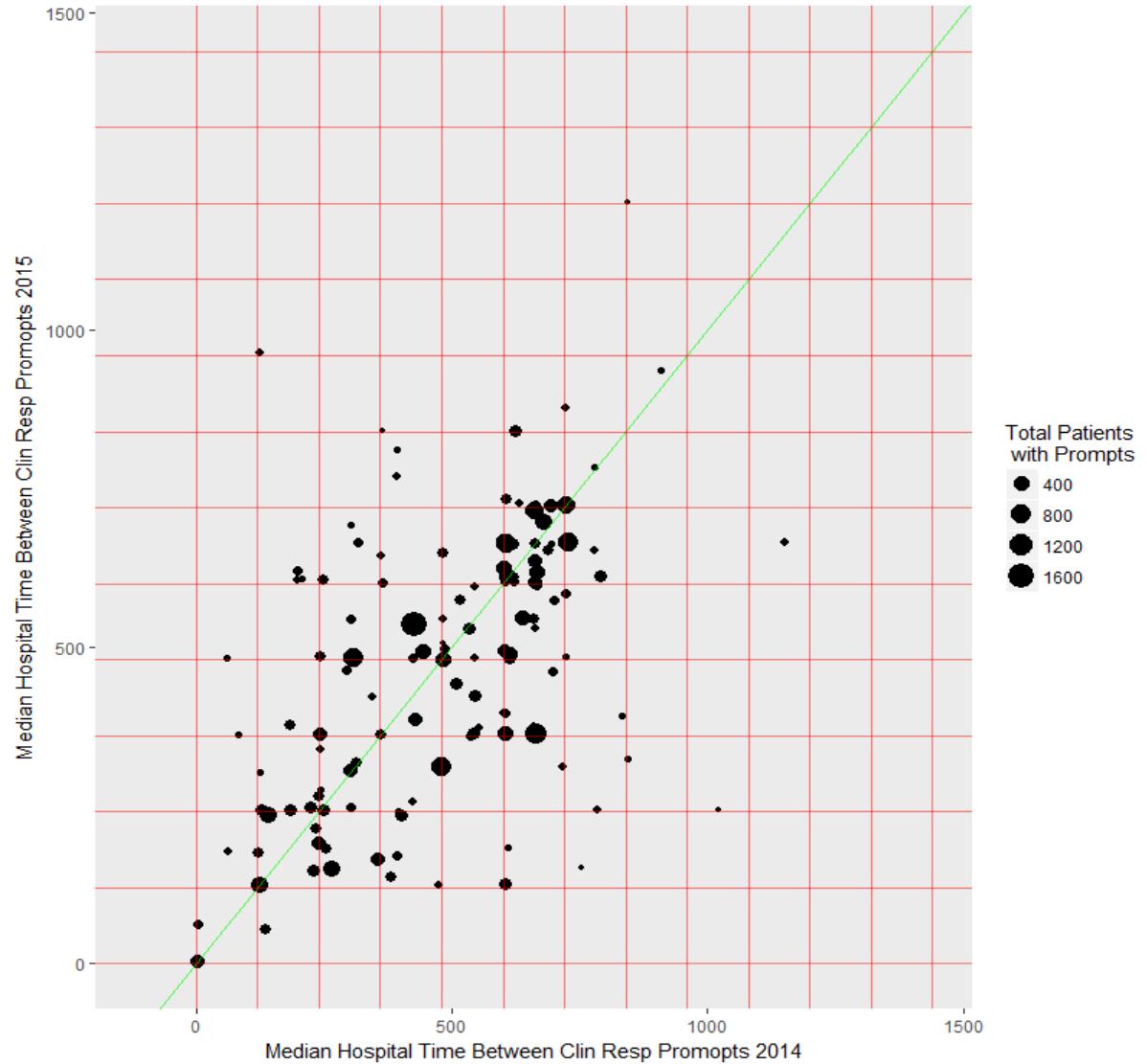


- Filtered out smaller hospitals (to be included hospitals must have >100 patients with at least two triggers)
- Variability in the spikes was visualized with the largest ones at four hours and ten hours
- The end user can choose to suppress the sepsis prompt for 2 hours or 72 hours
- Prompt only fires if/when conditions are met

Sepsis Prompt Trigger Offsets



- Gap time does appear to be correlated from 2014-15, but there appears to be considerable variation across hospitals (i.e., the median gap time varies between practically 0 and over 1000)
- Since these are in patients with at least two prompts, we wouldn't imagine this is due simply to variation in patient populations across the hospitals.





REASONS TO REVERSE ENGINEER THE PROMPT



Points/weights can be applied to the prompt criteria much like SOFA score criteria.

Reason 1

Centers applied version upgrades and hotfixes at different times. Need to reduce variation of prompt activity

Reason 2

Some Tele-ICU centers use the prompt for sepsis surveillance outside of the ICU

Reason 3

THE COMPONENTS AND CONTEXT OF THE TABLES

- Charted/documentated data versus interfaced variables
- Validated vital sign data versus un-validated vital sign data
- Understanding APACHE data values
- Making sense of medication tables
- Admission diagnosis versus active diagnoses

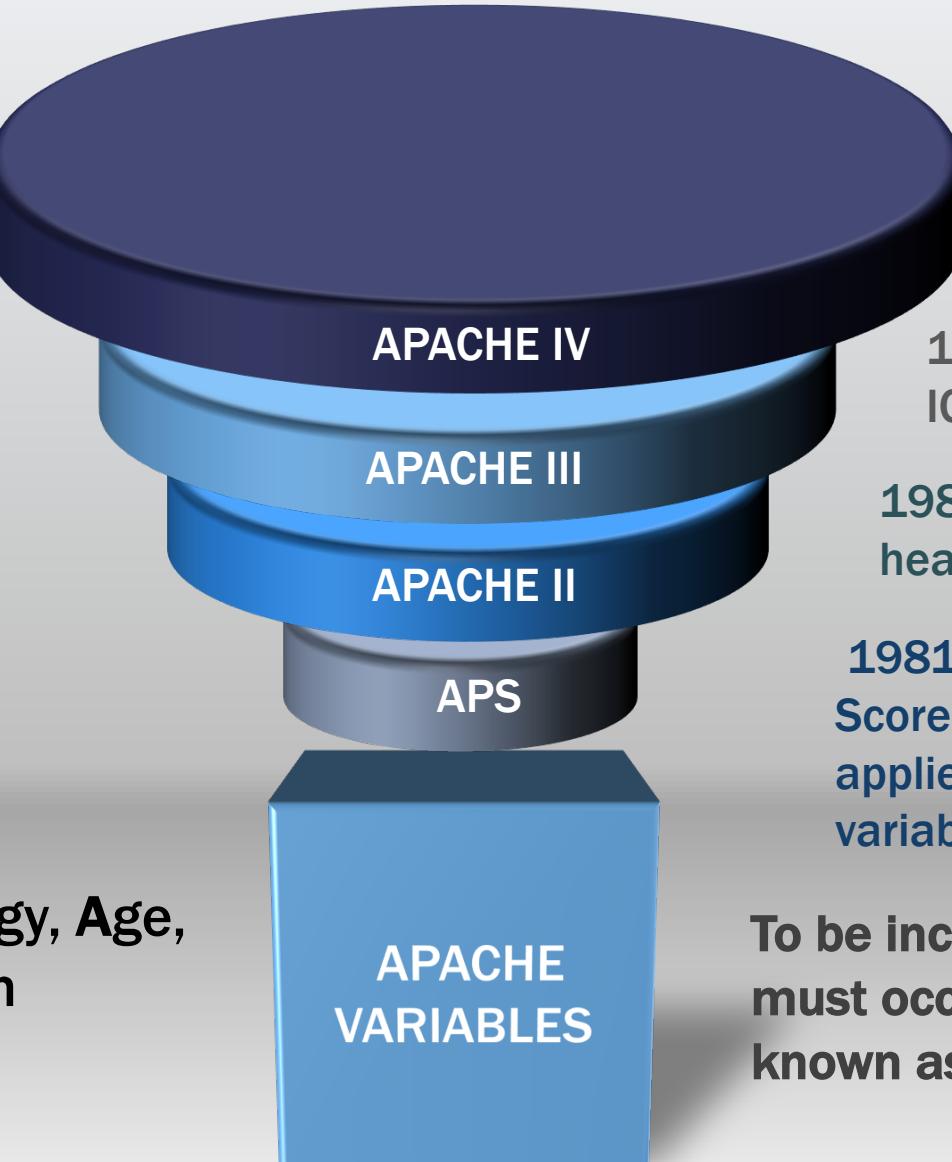




EVOLUTION OF APACHE

Four Major Components:

- Age
- Acute (current) physiology
- Prior site of healthcare (e.g., hospital floor, emergency room, etc.)
- Major disease category (reason for ICU admission)



APACHE = Acute Physiology, Age, Chronic Health, Evaluation

2006 APACHE IV model further refined

1991 APACHE III adds reason for ICU admission to the algorithm

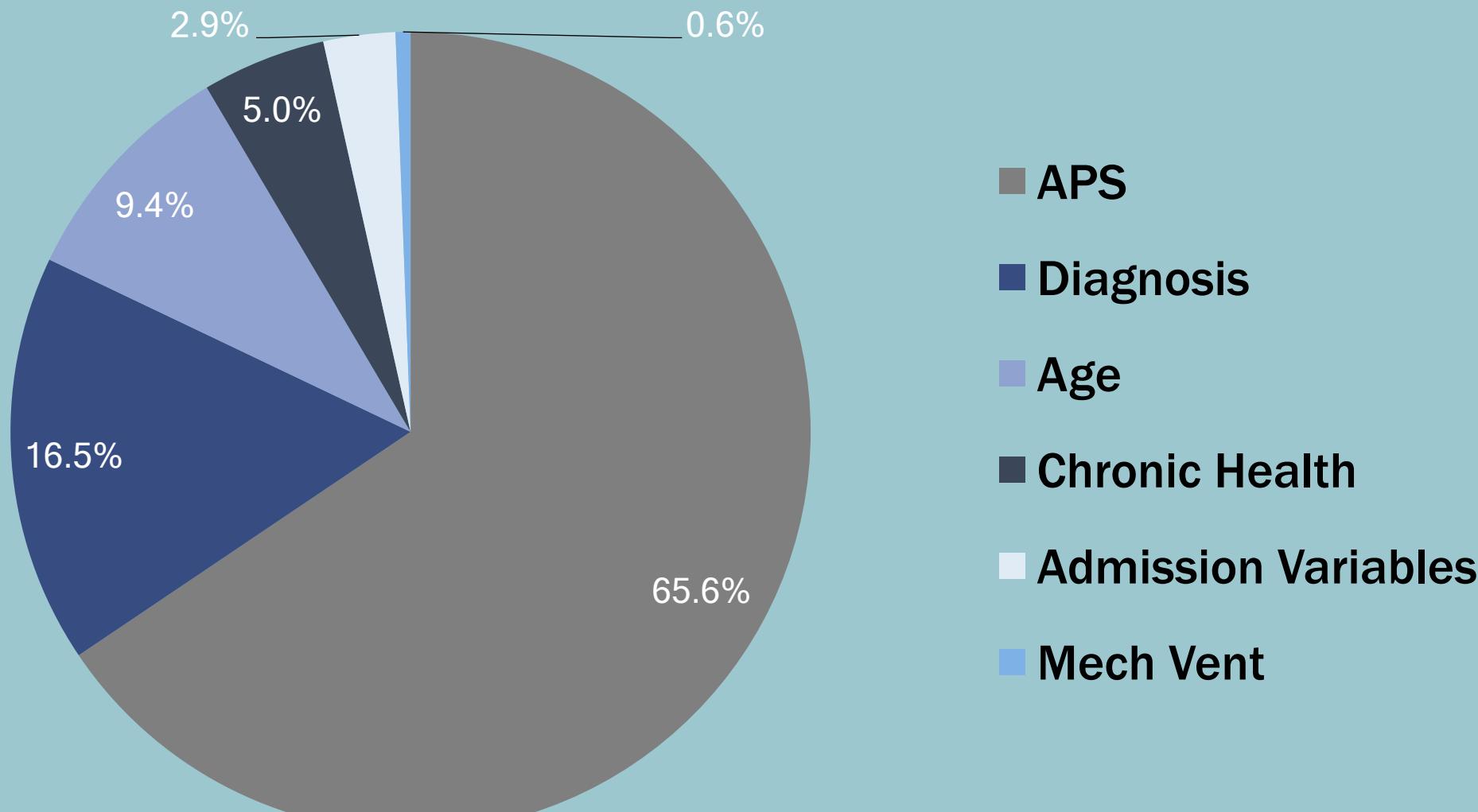
1985 APACHE II: APS and chronic health evaluation

1981 APS = Acute Physiology Score uses a relative value scale applied to 12 objective physiologic variables

To be included in the model all variables must occur within defined time limits known as the APACHE day



APACHE IV Hospital Mortality Predictive Equation Components





THINGS TO CONSIDER

H&P and Physical Exam

Who is entering the data? Bedside providers or TeleICU nurses?



RT/RN Charting

Are data interfaced or entered by primary documentation method?
When did a hospital move to interfaced data?



Vital Sign (VS) Tables

Which table contains charted (validated) VS data versus raw VS data? Which data do I need?



MEDICATION

Does the hospital have a medication interface for every year in the study? For continuous infusion meds like vasopressors is there nurse charted data?

WRAP IT UP



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