

# Medical Internet of Things: from bedside to big data

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rti  
**Industrial IoT**  
Connex Conference

- Autonomous Vehicles
- Flying Cars
- Connected Hospitals

# Overview

- Problem
- Integrated Clinical Environment (ICE)
- How is DDS Connex Used
- Medical Internet of Things Platform
- Medical IOT → Big Data → Data Driven Healthcare
- The Future



# User Requests

"We need complete, accurate and contextually aware data"

"Why can't this be automatically put in the medical record?"

"Health data must be contextually aware"

"Why can't I manage my devices remotely?"

"We need to change what is expected of technology in healthcare"

"Why can't I pause an infusion pump when the person is overdosing?"

"Can I know in real-time how many ventilators I have?"

"how do I take my 30 years of experience and use it to help a new physician provide high quality healthcare?"

"I need to keep a patient alive for 5 days without a doctor present with what I carry in my backpack"

"I want to monitor every patient at every bed in every country I have a hospital"



# Problems

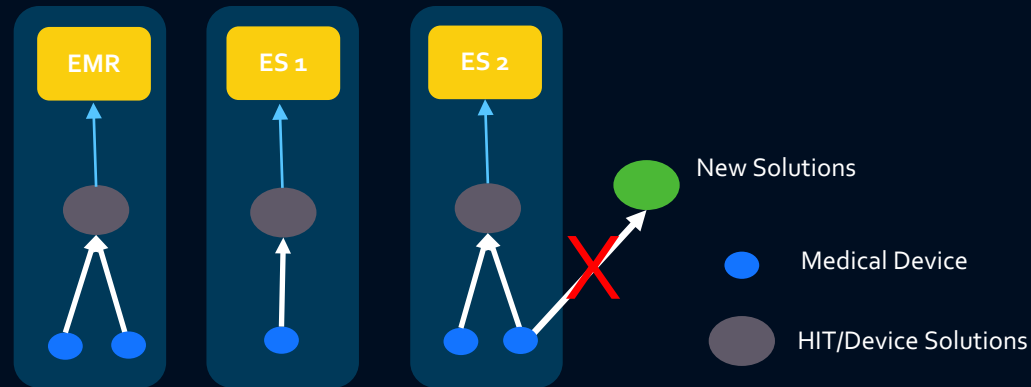


J. Goldman, MD MGH

- Architecture
- Data
- Process



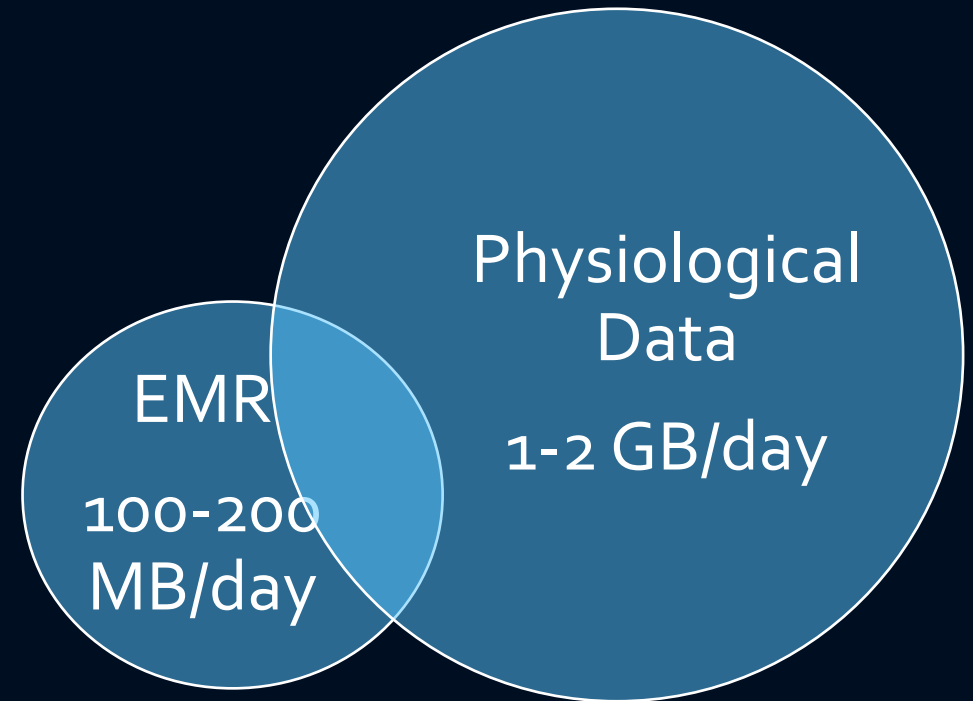
# Architecture



- Device, point solutions and EHR are proprietary and vertically integrated.
- Integration is expensive, complicated & incomplete
- No way of bringing the data back to innovate

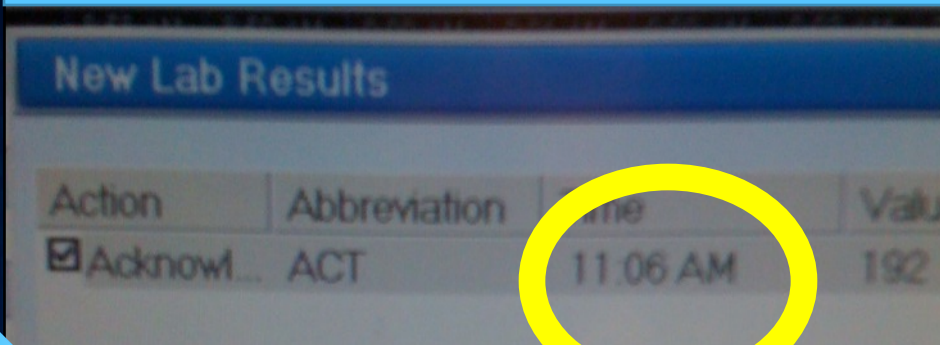
# Data

- EMR data is infrequent
- Poor data quality
- Proprietary vertically integrated data creates analytics and clinical solution challenges
- Lacks consistent time stamps
- Lacks contextually complete data





EMR screen



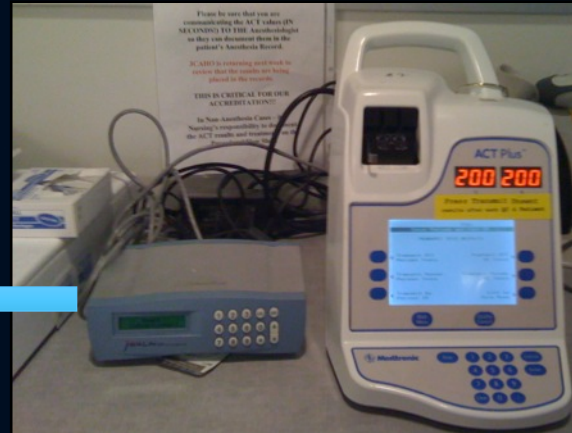
Action	Abbreviation	Time	Value
<input checked="" type="checkbox"/> Acknowl...	ACT	11:06 AM	192

ACT – appeared to have been checked 22 minutes after heparin administration (was actually 30 min). Could → stroke.  
Cause – ACT device time incorrect  
(Note - device does not use NTP)

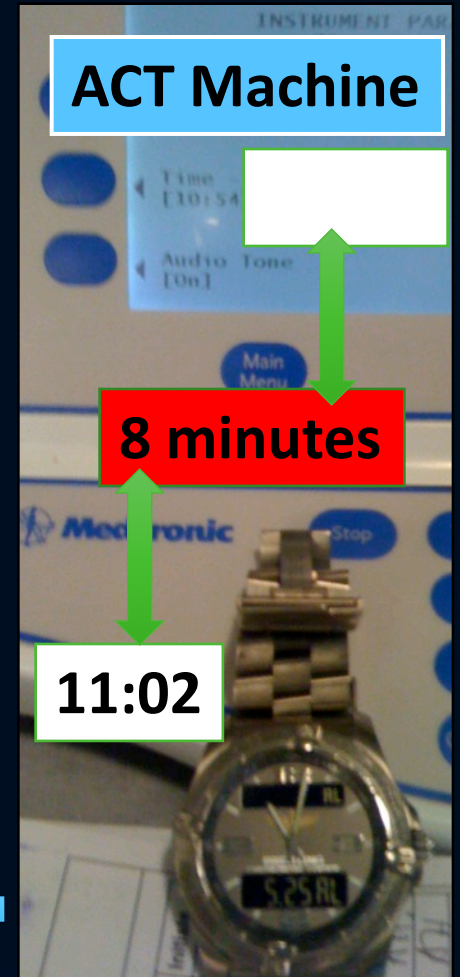
## EMR time-stamp error



Data protocol converter



ACT Machine

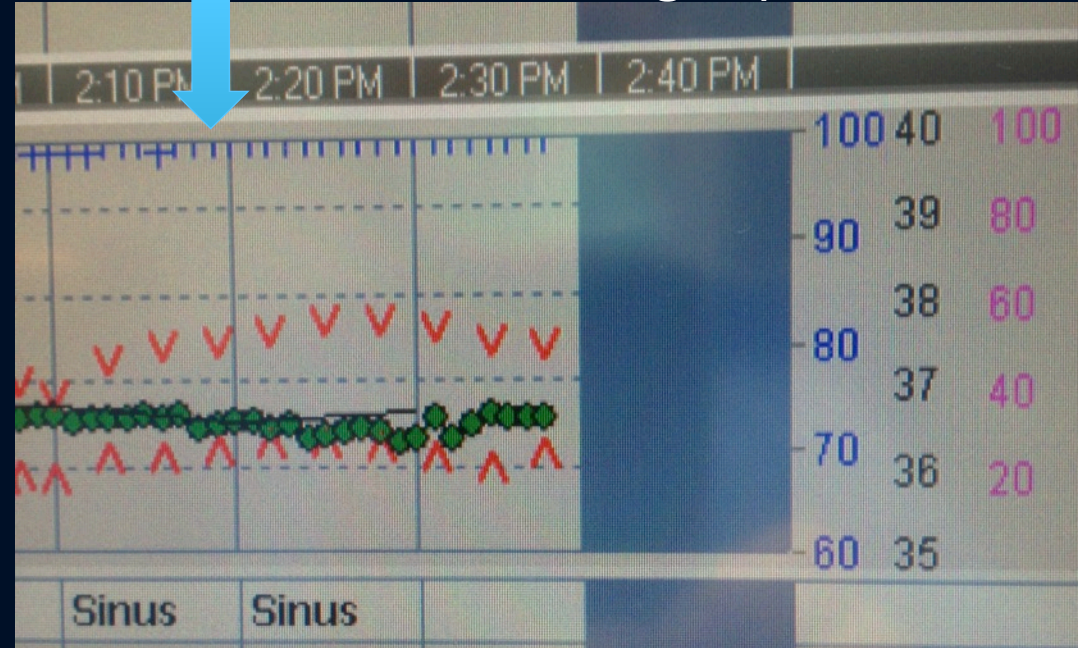




Patient Monitor  
Recorded Low  
SpO<sub>2</sub> Alarm Event  
"84%"

- 84% oxygen saturation detected by bedside physiological monitor
- Not recorded in permanent record

No evidence of low SpO<sub>2</sub> in EHR  
(blue ticks along top)





# EHR data – 1 point collected

← 60 Seconds →

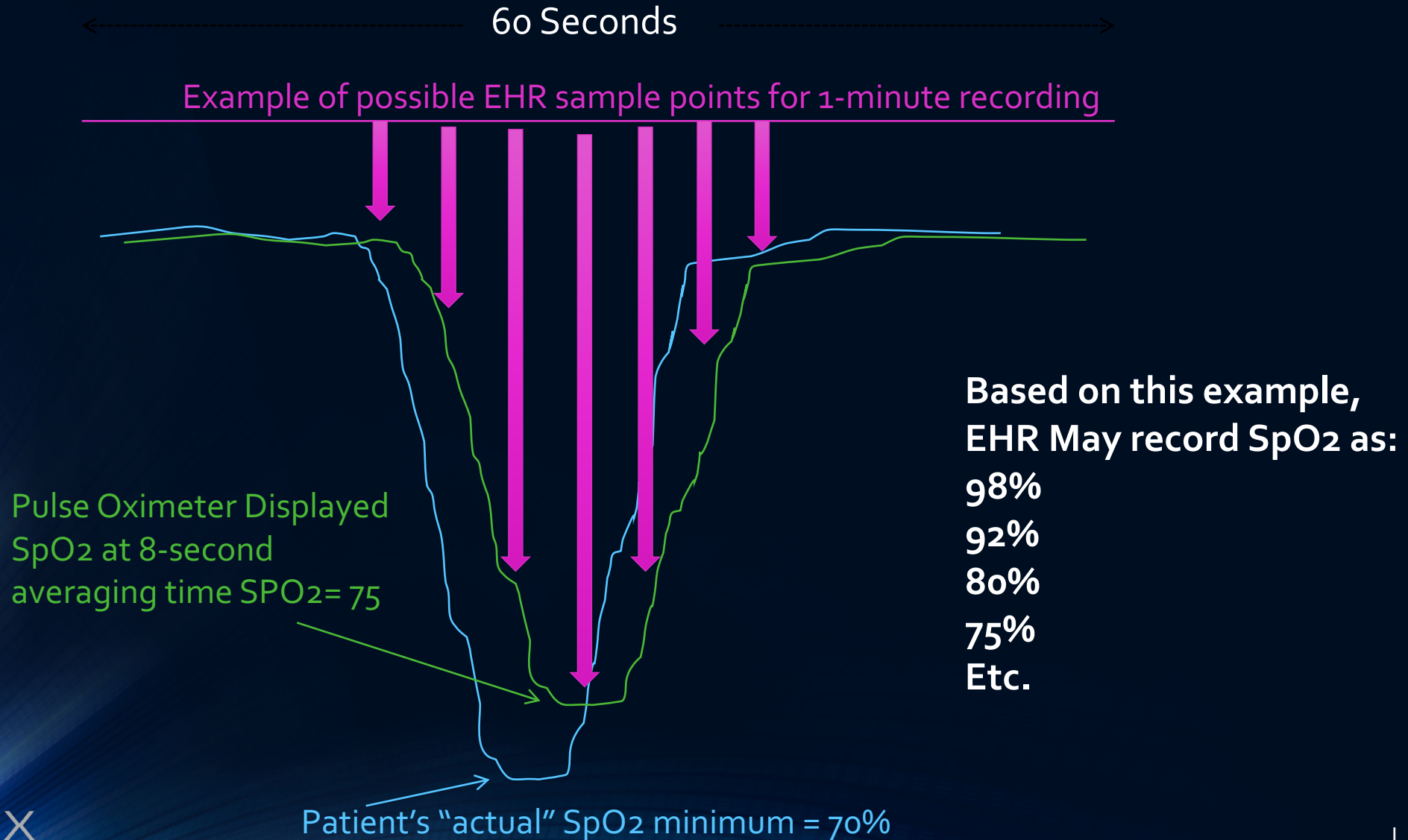
Example of possible EHR sample point

Pulse Oximeter Displayed  
SpO<sub>2</sub> at 8-second  
averaging time SpO<sub>2</sub> = 75

Based on this example,  
EHR May record SpO<sub>2</sub> as:  
75%

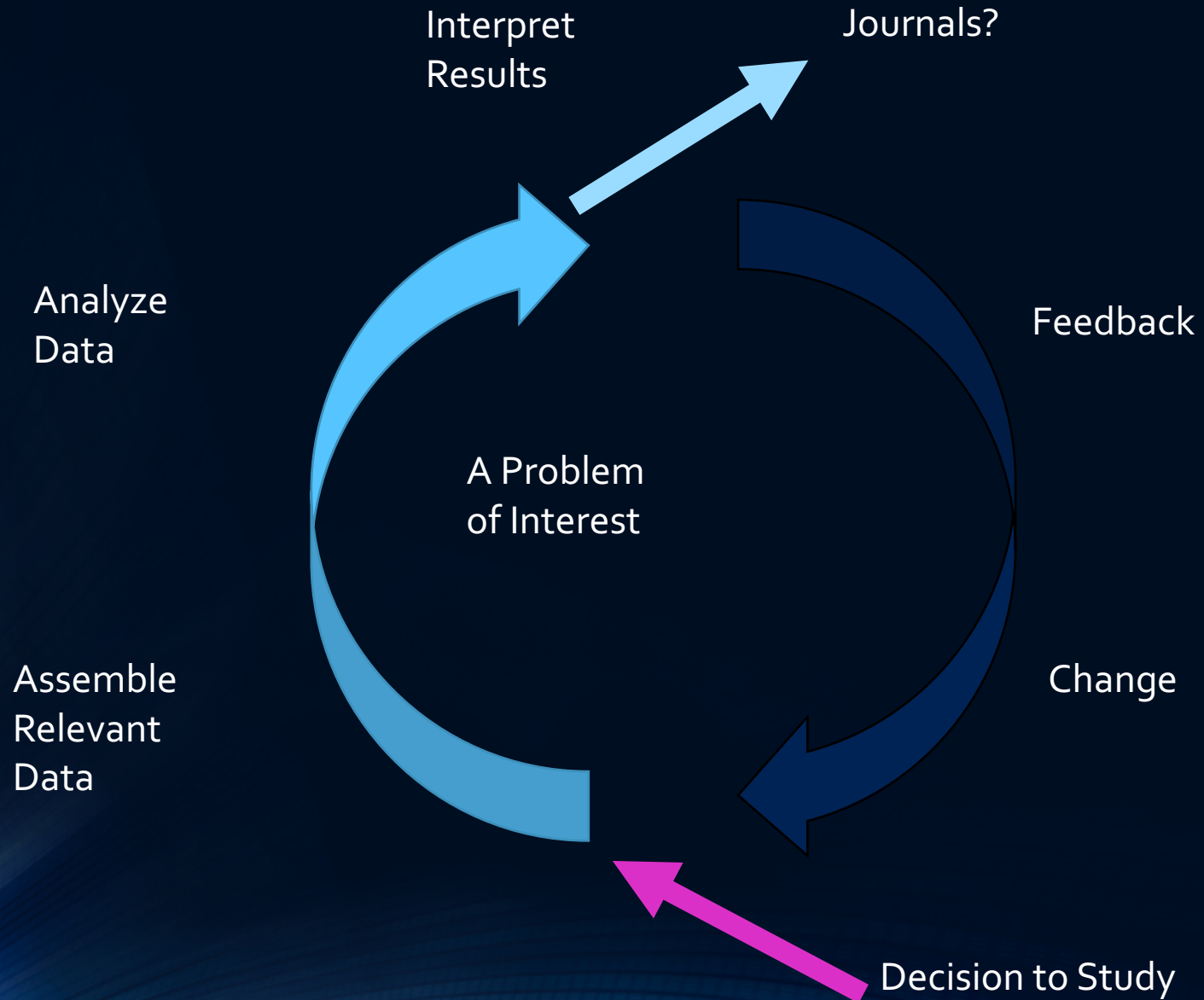
Patient's "actual" SpO<sub>2</sub> minimum = 70%

# Sources of variation in EHR documentation d/t Data Sampling

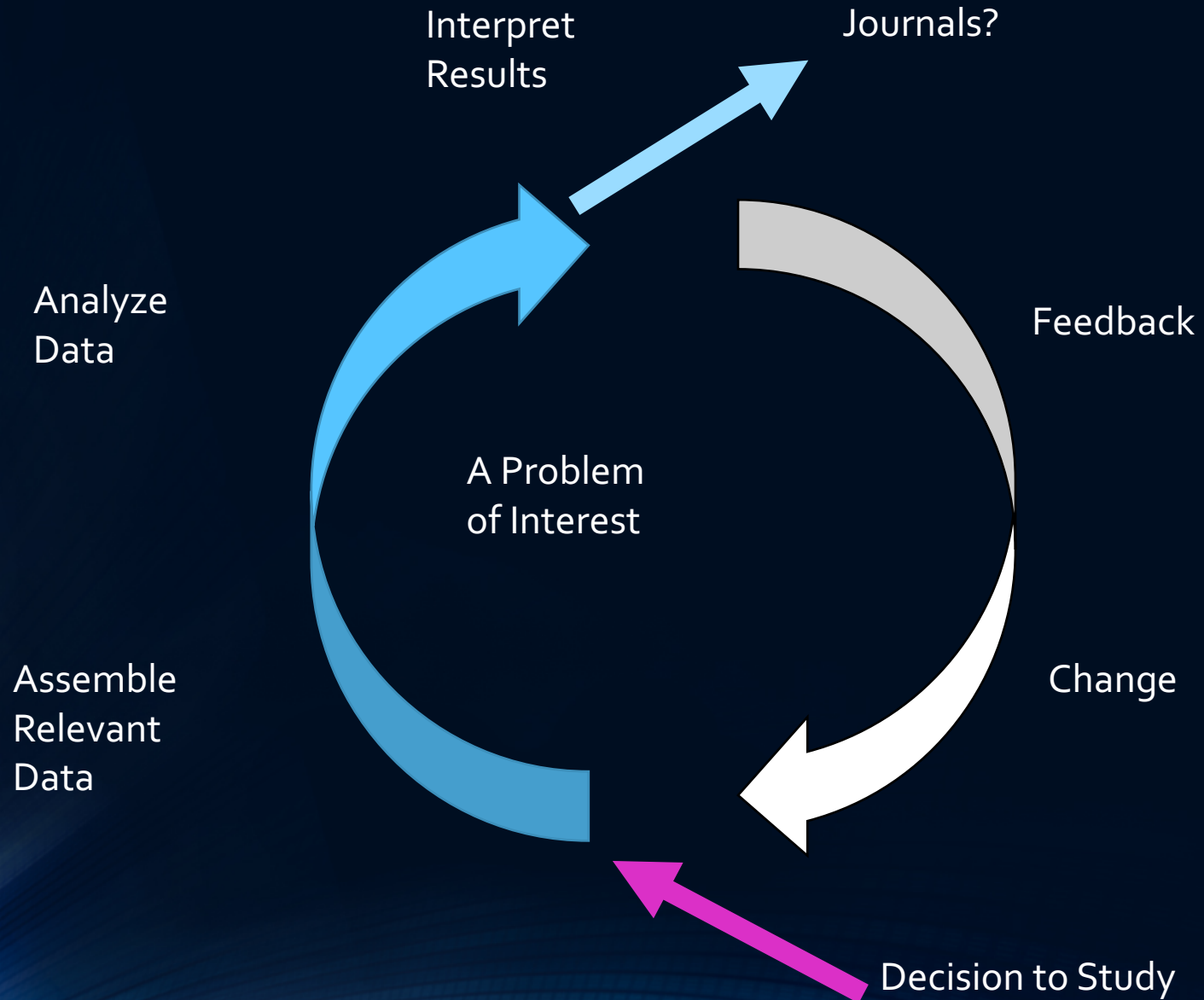




# Process

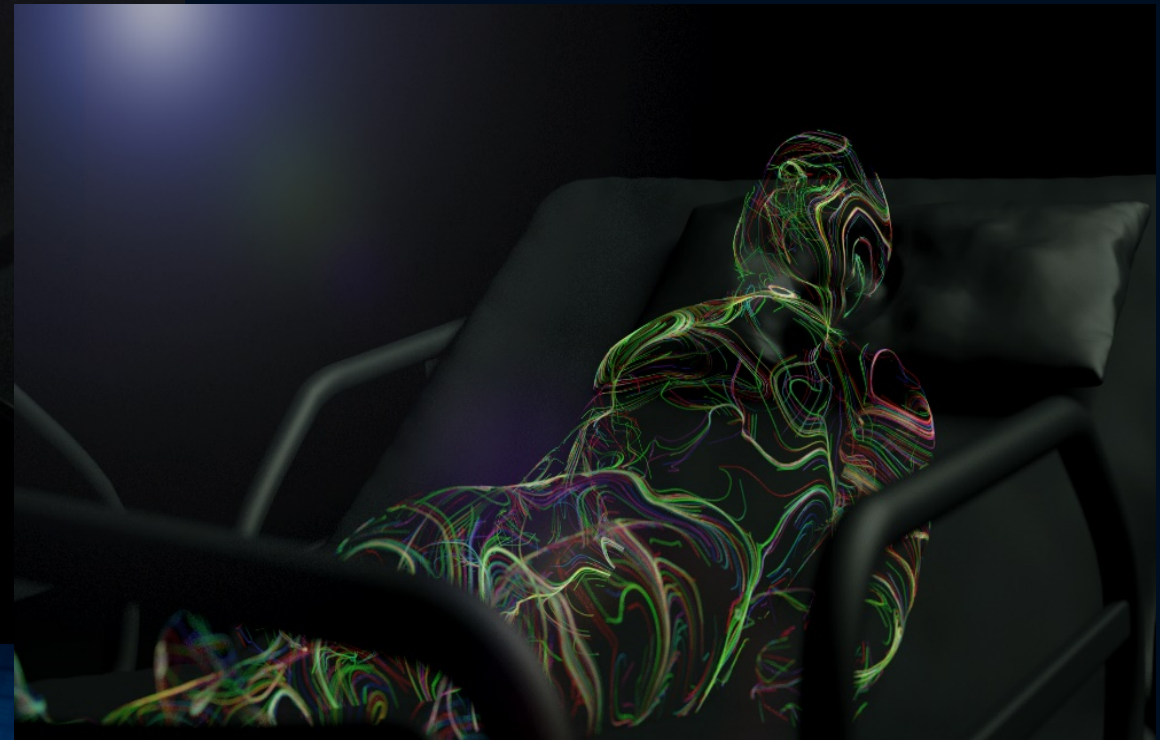
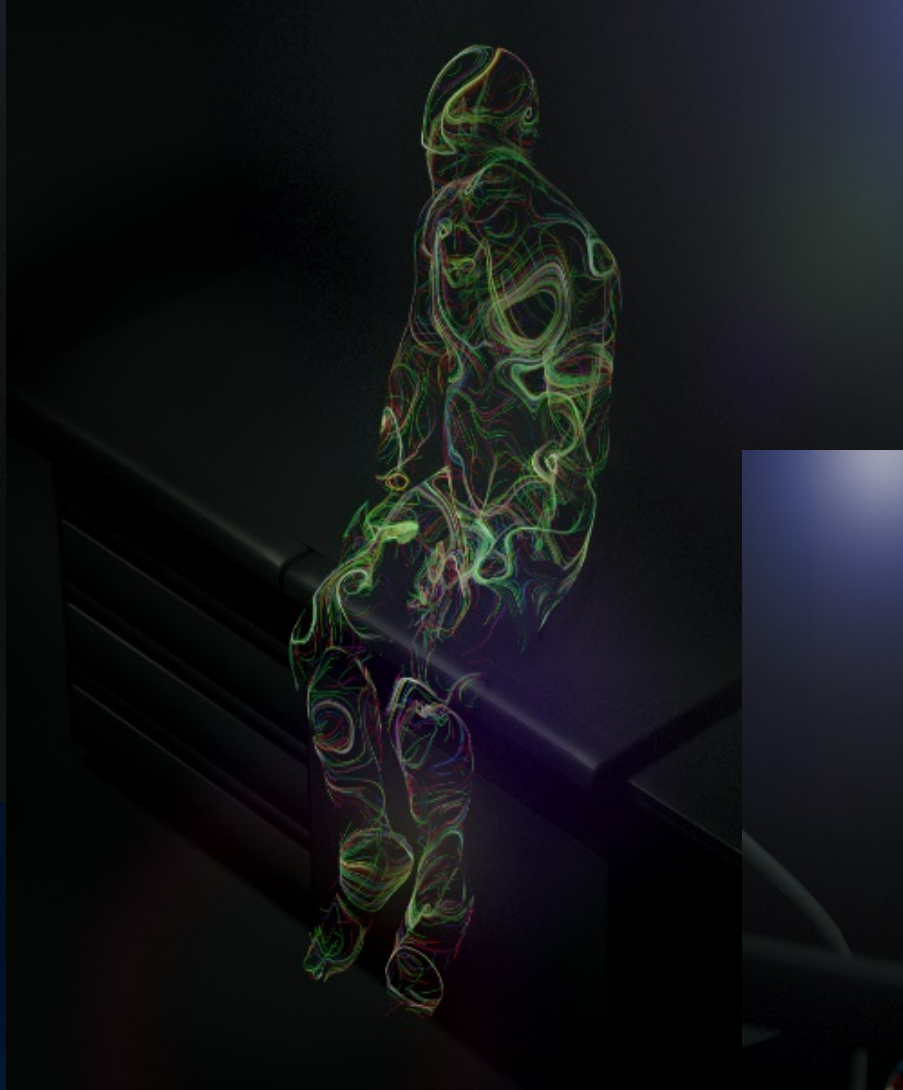


# Process

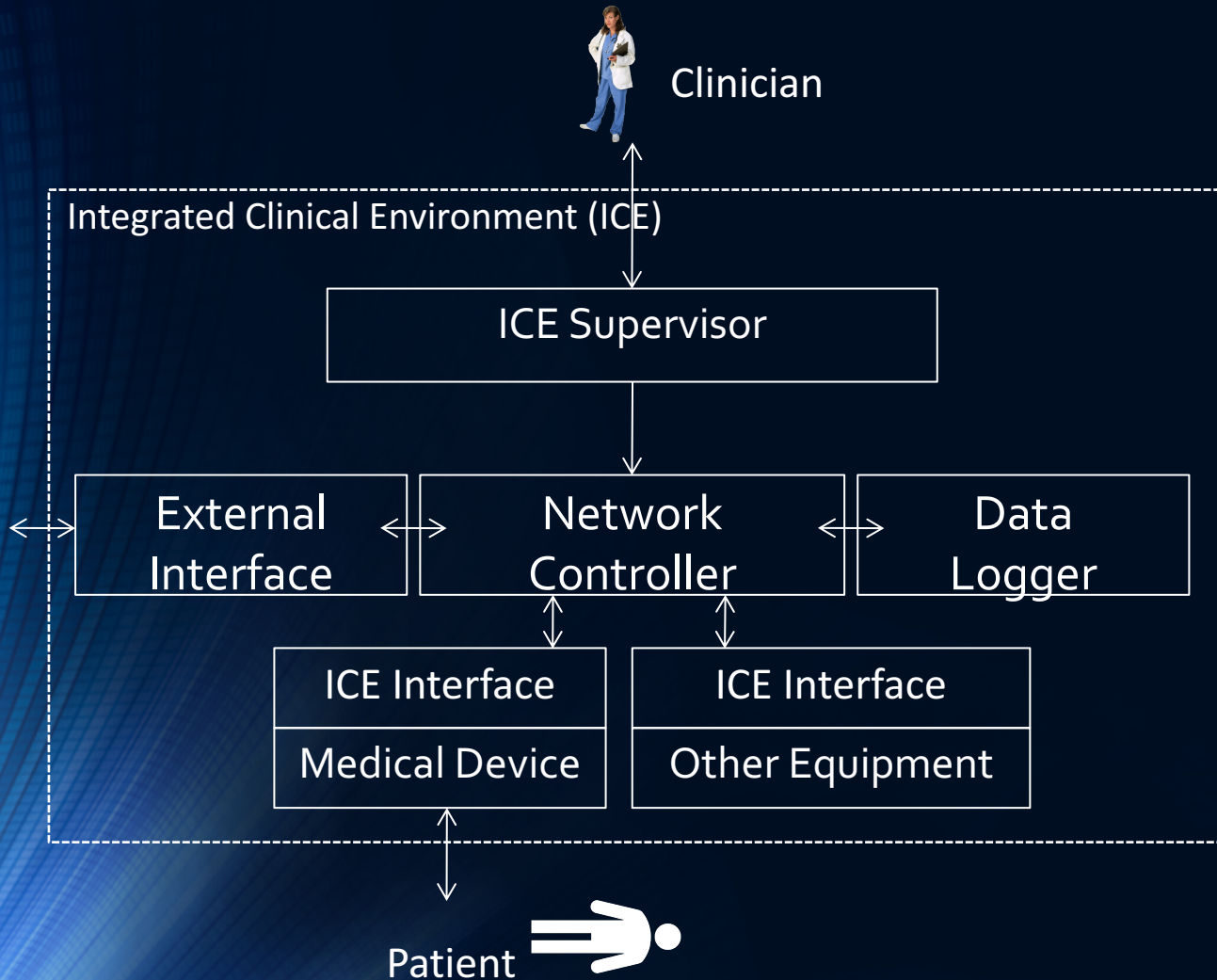




# Patient Centered



# Integrated Clinical Environment (ICE)



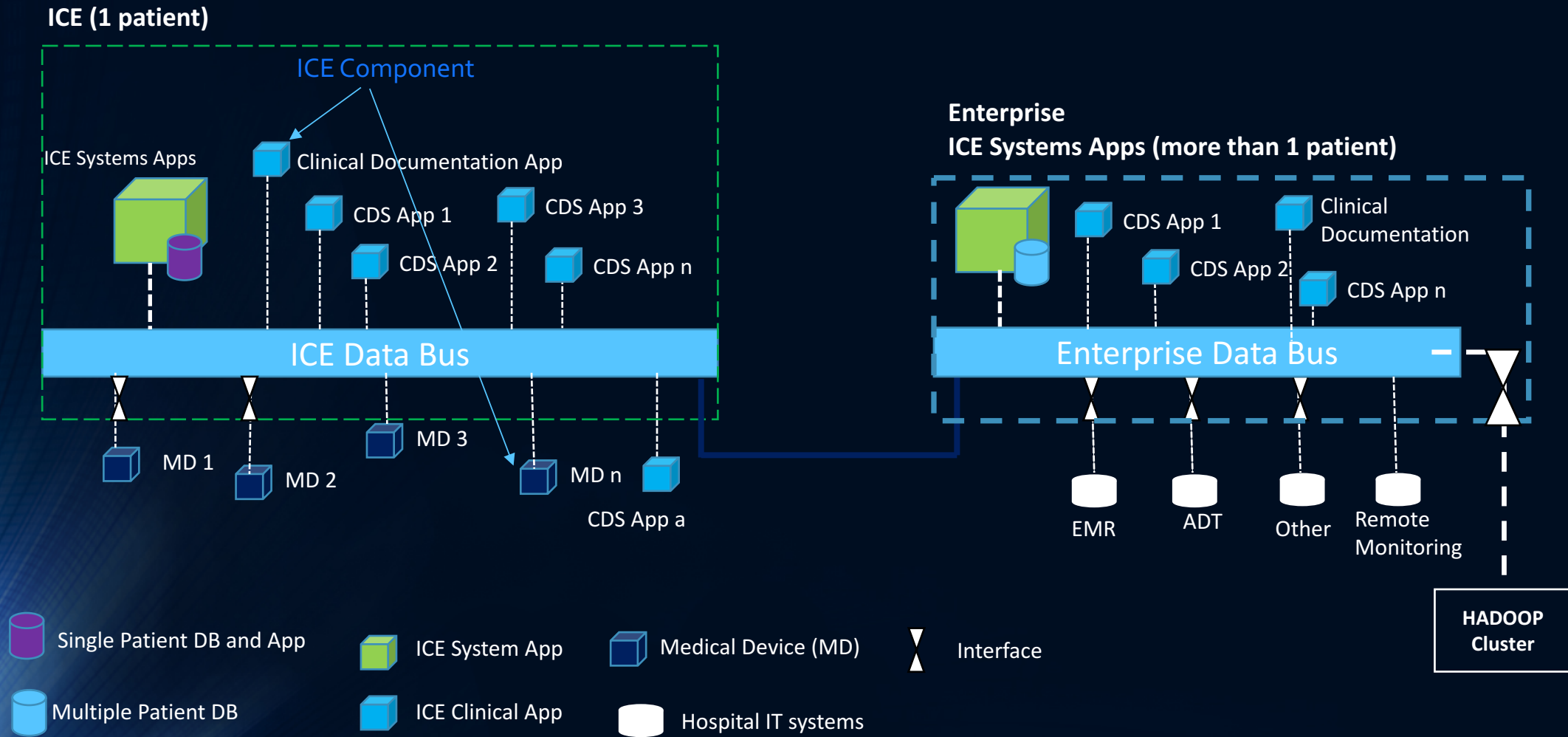
- Work began in 2004
- ASTM F2761 standard
- New Data Logger Standard AAMI active
- 1 patient per ICE
- **FUNCTIONAL** architecture
- Currently new \$14M in DoD, DHS funding supporting further development. In excess of \$30M in R&D in total.

# Medical IoT Platform

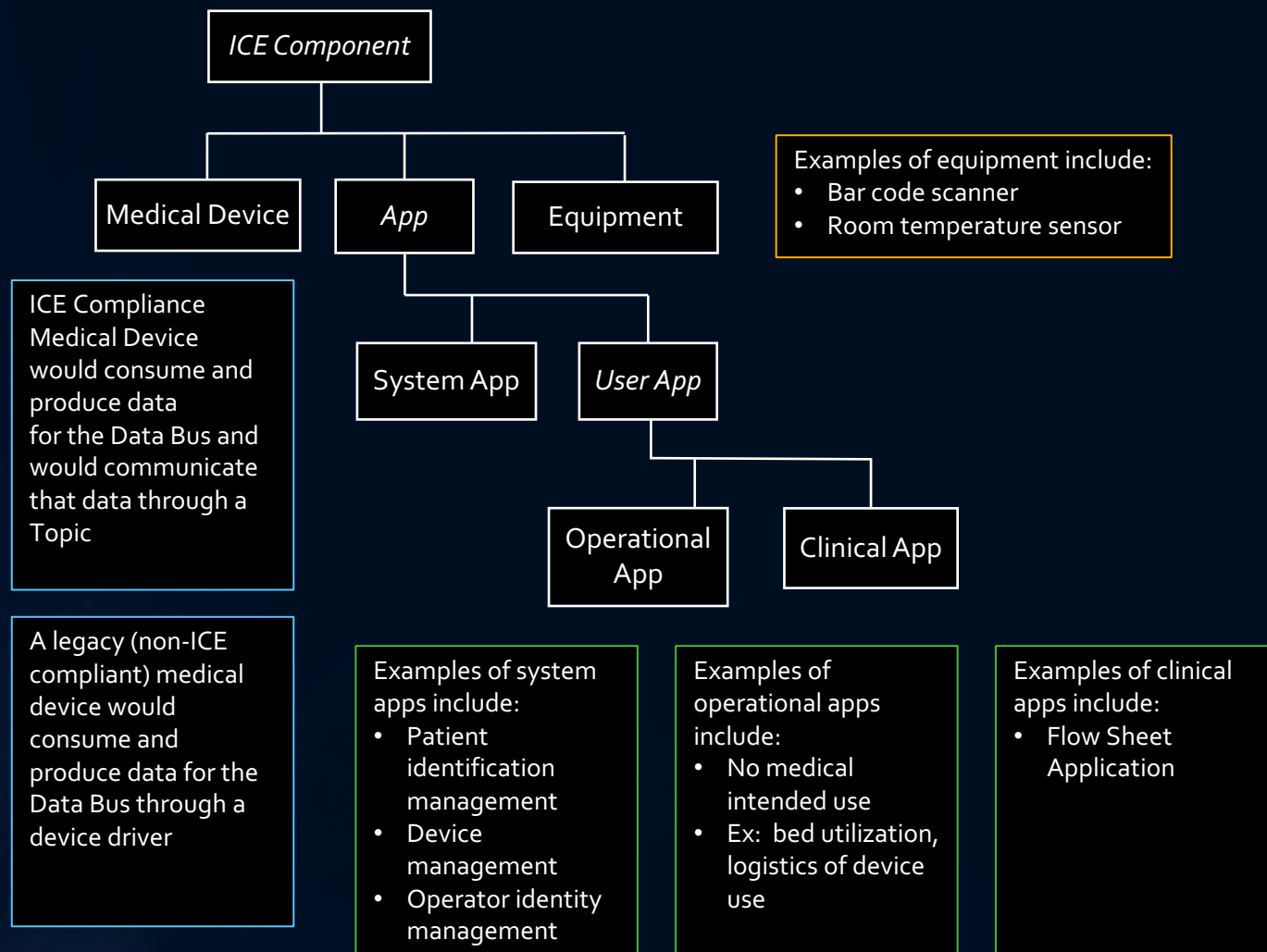
- Based on Integrated Clinical Environment (1 ICE = 1 Patient)
- Distributed
- Open
- Standards based data model
- Cybersecurity and risk management is included



# DocBox's Platform



# ICE Component



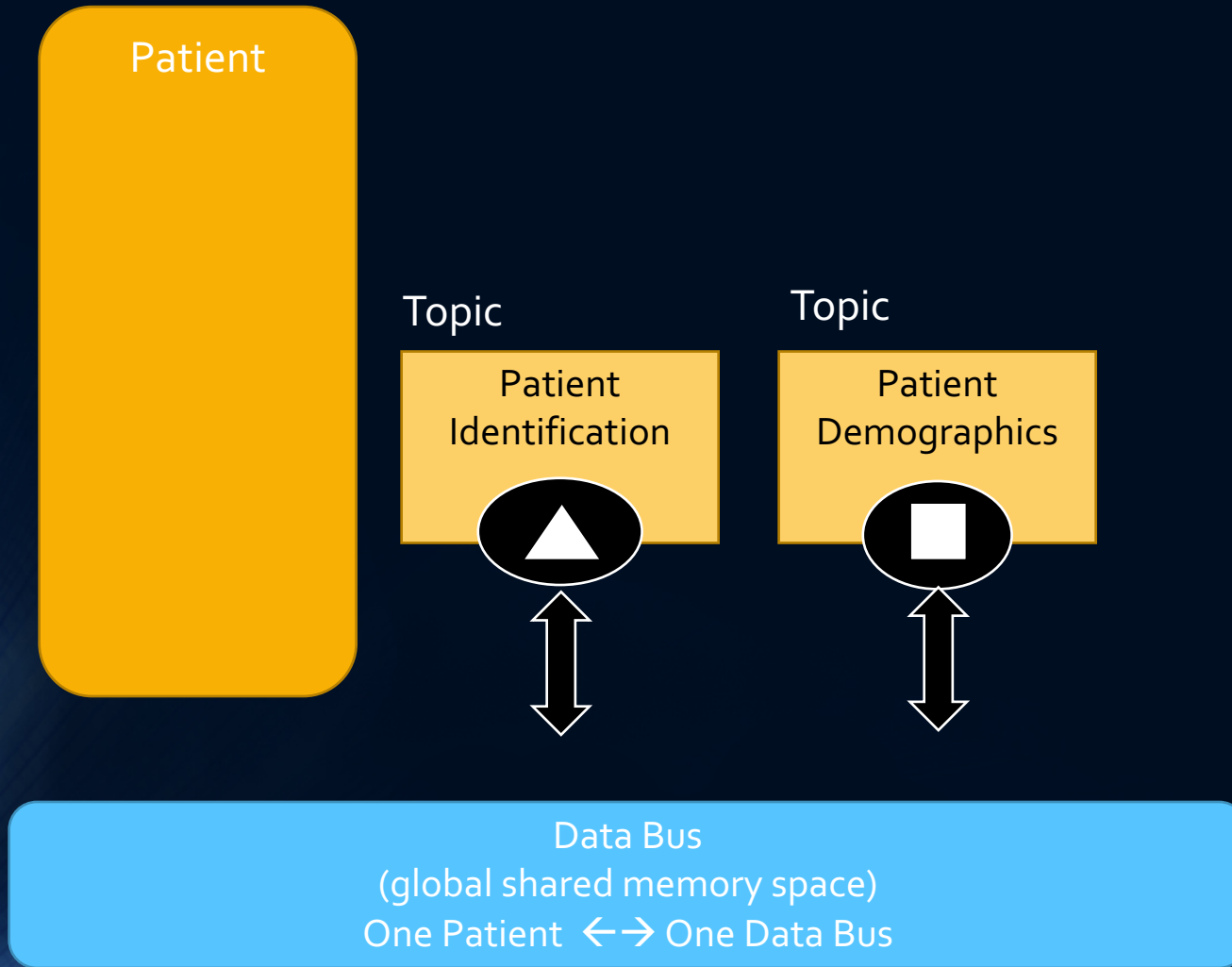
RTI Connex DDS Data Bus  
(global shared memory space)  
One Patient ↔ One Data Bus

# Data Model

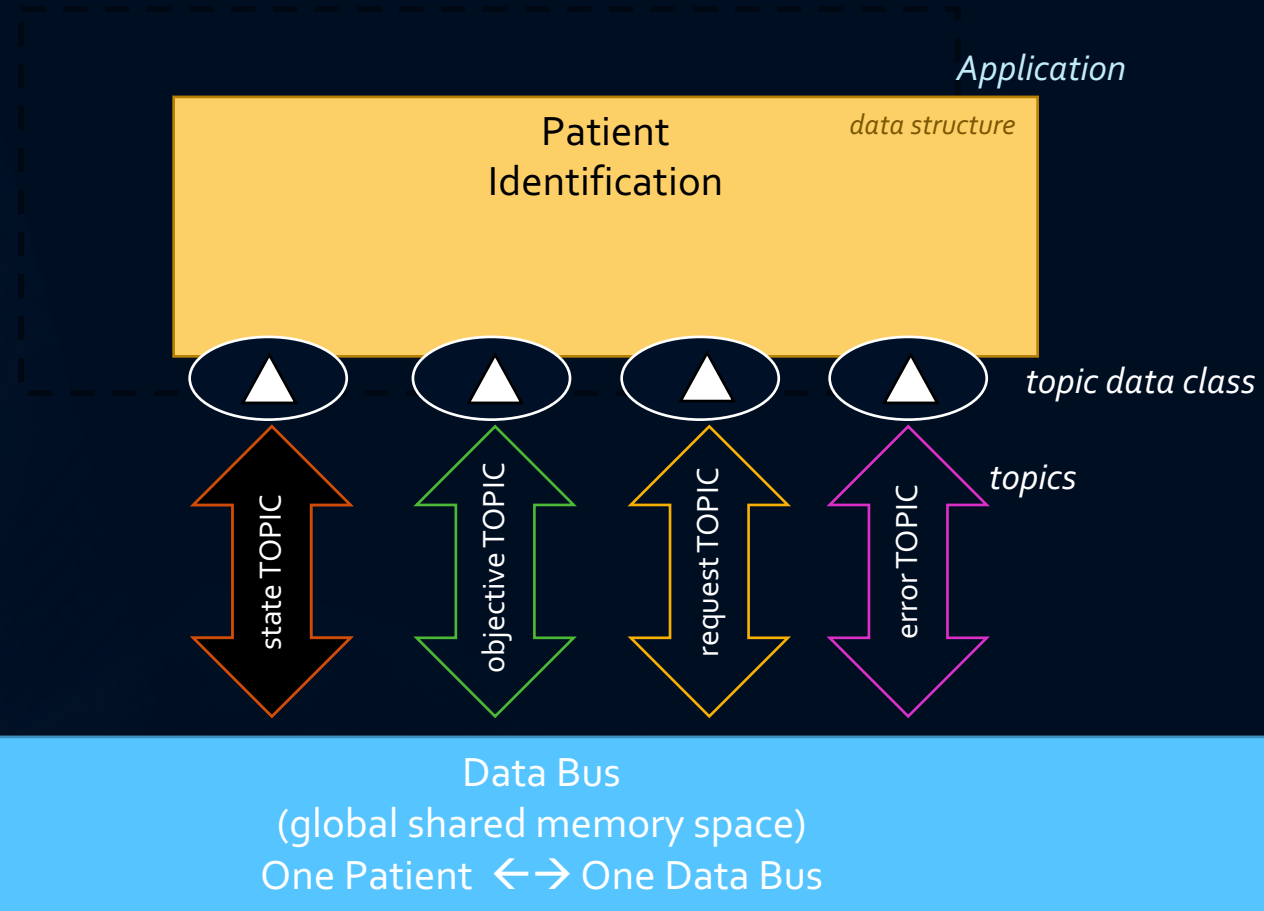
- Utilizes IEEE 11073-10201, FHIR for data structures
- Utilizes IEEE 11073-10101, LOINC, SNOMED CT for nomenclature
- Patient centric and Data Centric
- Interface Definition Language (IDL) is created from Data Model
- Data Model is setup by Object Type and Nomenclature becomes key



# Patient Component of Data Model



# Objective State Pattern

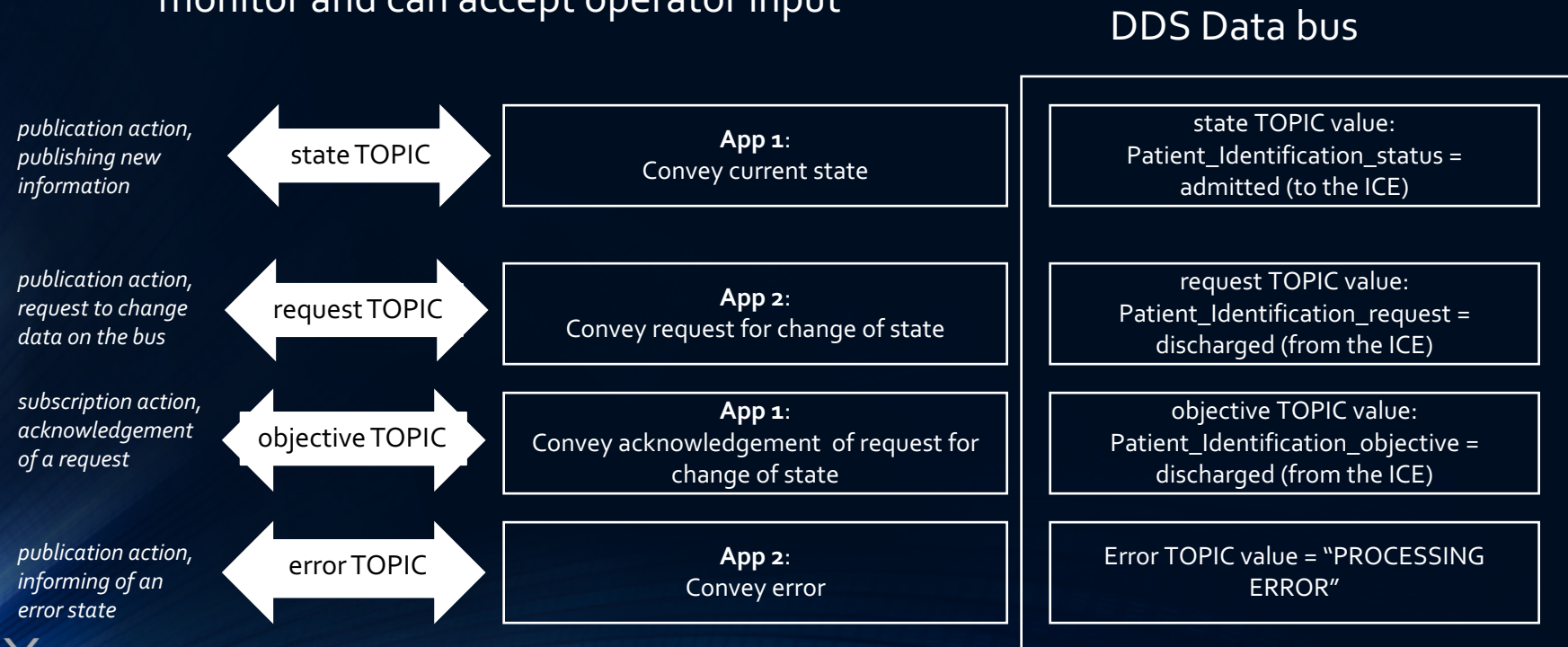


# Communication Pattern (Objective State Pattern)

There are 4 specific TOPIC types that are strongly coupled with the data structure for which they support. These 4 types are state, request, objective, and error TOPICS.

Let's consider the following example:

- App 1 is the Patient Manager app (System App)
- App 2 is a Clinical App (e.g. Flow Sheet) that displays patient information on the monitor and can accept operator input

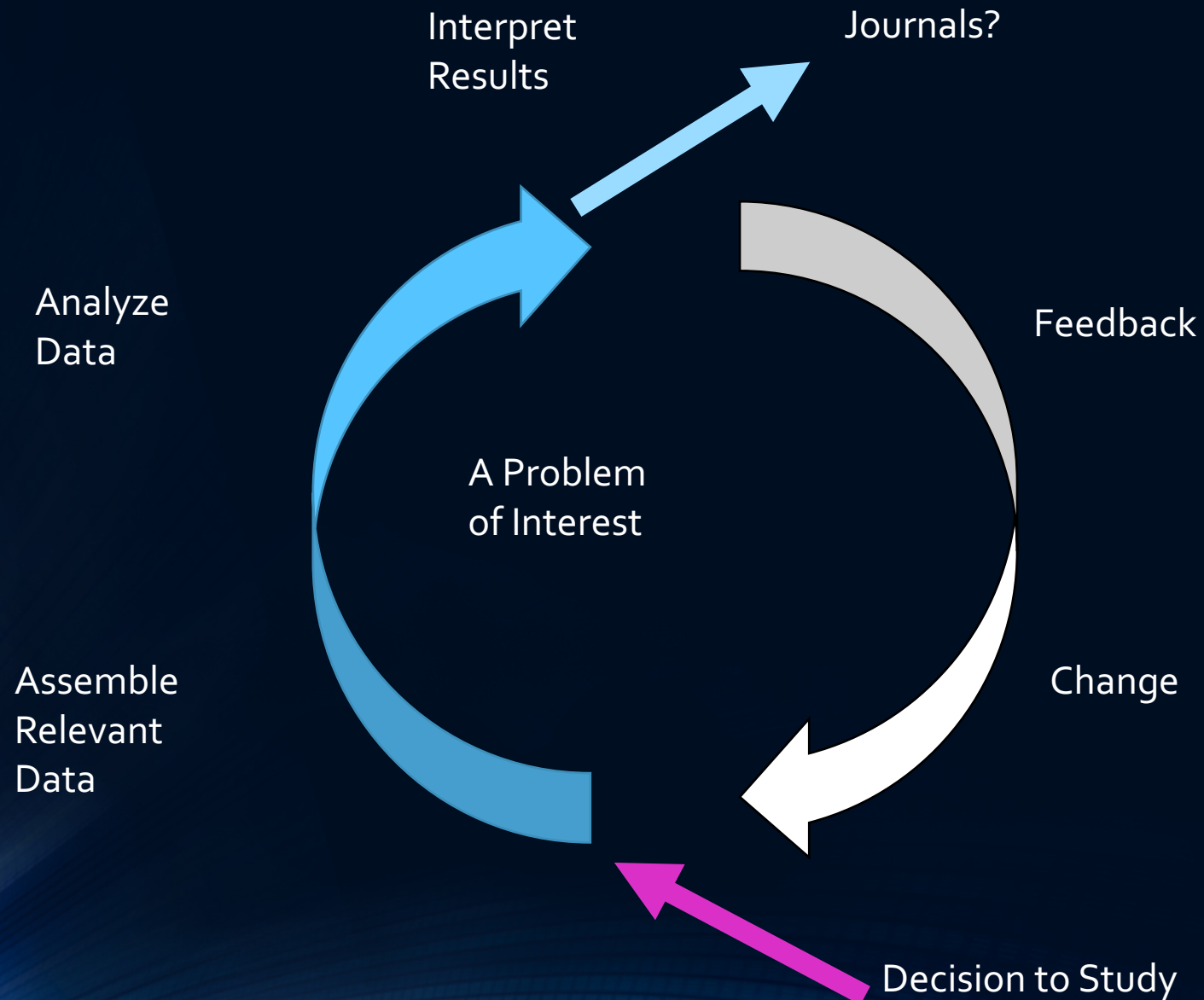




# ICE Component Software Development Kit (SDK)

- Applications, Devices and Equipment will be able to connect, and V&V to the platform
- Regulatory Benefits , V&V is part of connectivity of FDA Master File (in process Q2 2018)
- Cybersecurity aspects will meet DoD RMF cybersecurity certification (in process Q2 2018)
- Funded by USAMRMC CMMRP W81XWH-17-C-0013

# Closing the Loop



# How Do You Close the Loop?

- Using an ICE architecture highly granular patient data can be collected
  - ~1.5 – 2 GB per day per critical care bed
- Data is collected from multiple devices in a vendor agnostic, data centric, structured data model
- Data can be used for real-time and historical analytics
- Data can be viewed from both a clinical and operational perspective



# IoT to Big Data

ICE Data Bus



+



# Process - Clinical









### Total Patient Admission Events

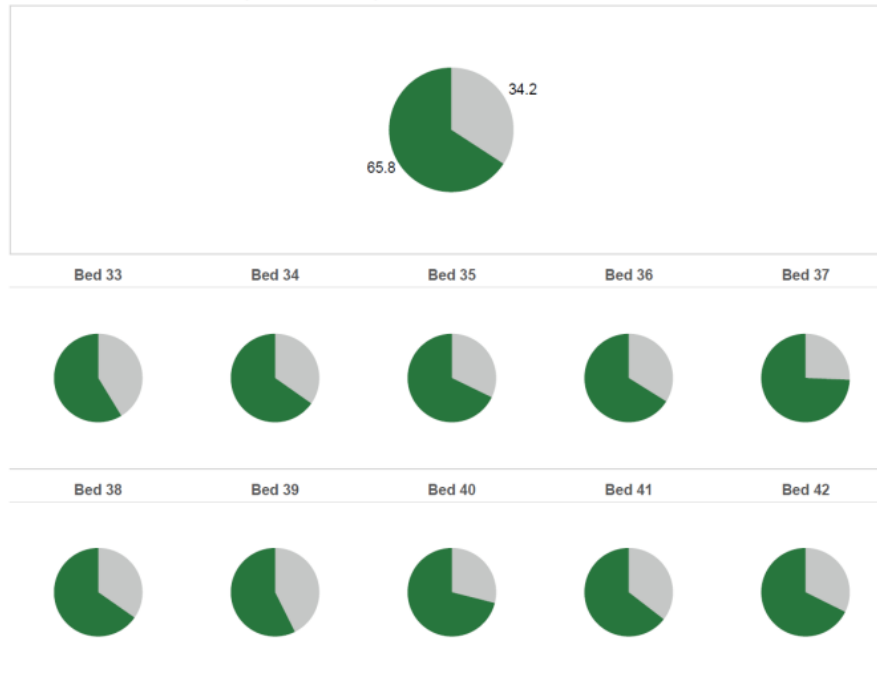
Total # of Unique Admitted Patients	Average # of Unique Patients Admitted per Day
914	5.0

### Patient Bed Utilization (hrs)

Total ICU2 Bed Utilization (hrs)	Total ICU2 Bed Utilization (days)	Avg ICU2 Bed Utilization per Bed per Day (hrs/day)
29,060.18	1,210.84	15.79

### 6 month analysis using platform data

% Bed Utilization in ICU2 (10 Beds Total): 01/03/2017 - 31/08/2017



NOTE: Patient bed utilization time has been calculated based on active, valid SpO2 and ECG heart rate monitoring.

■ Patient in Bed  
■ No Patient in Bed

### August 2017 analysis

% Bed Utilization in ICU2 (10 Beds Total): 01/08/2017 - 31/08/2017

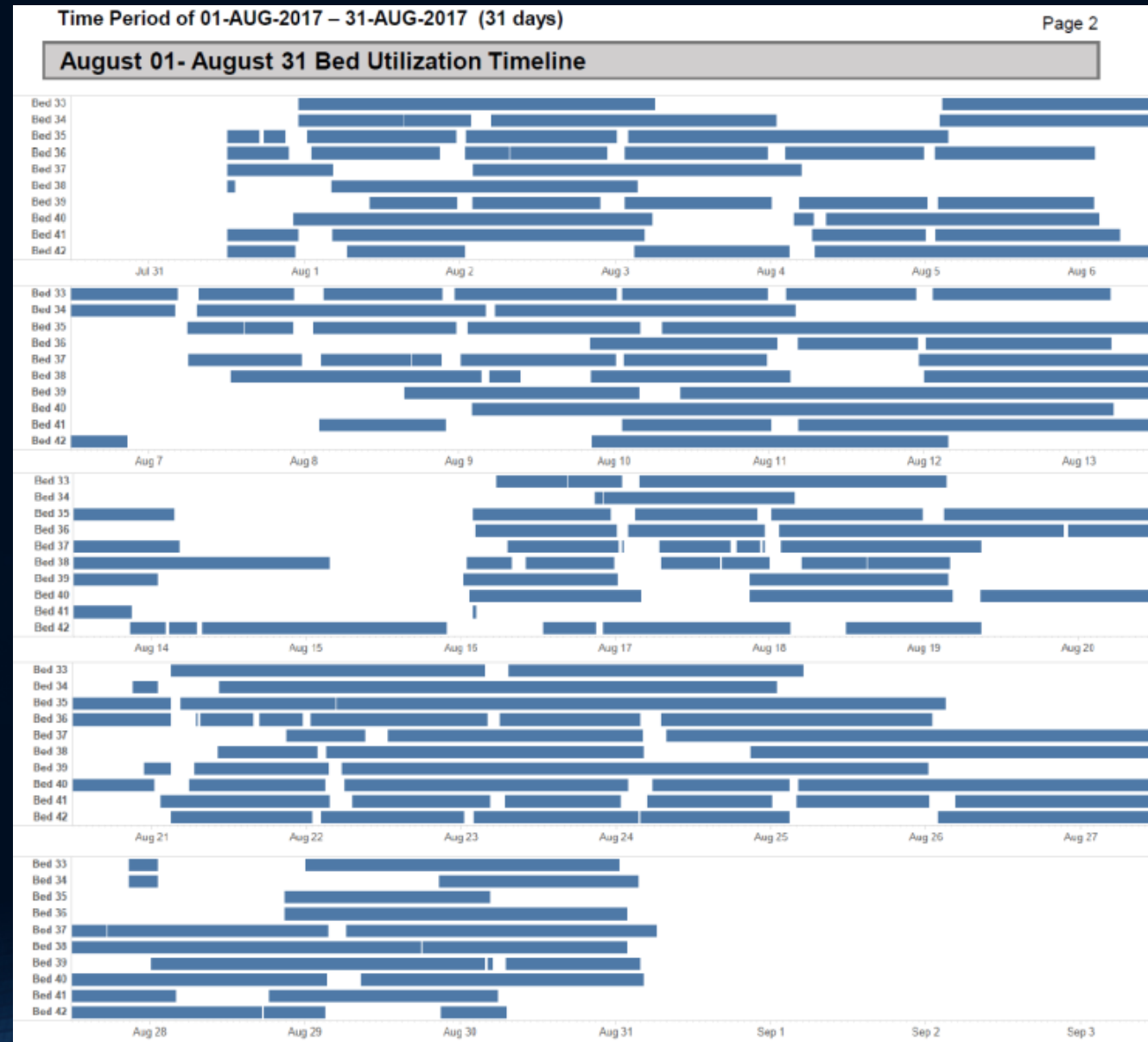


NOTE: Patient bed utilization time has been calculated based on active, valid SpO2 and ECG heart rate monitoring.

■ Patient in Bed  
■ No Patient in Bed

# Individual Bed Utilization by Day/Hour

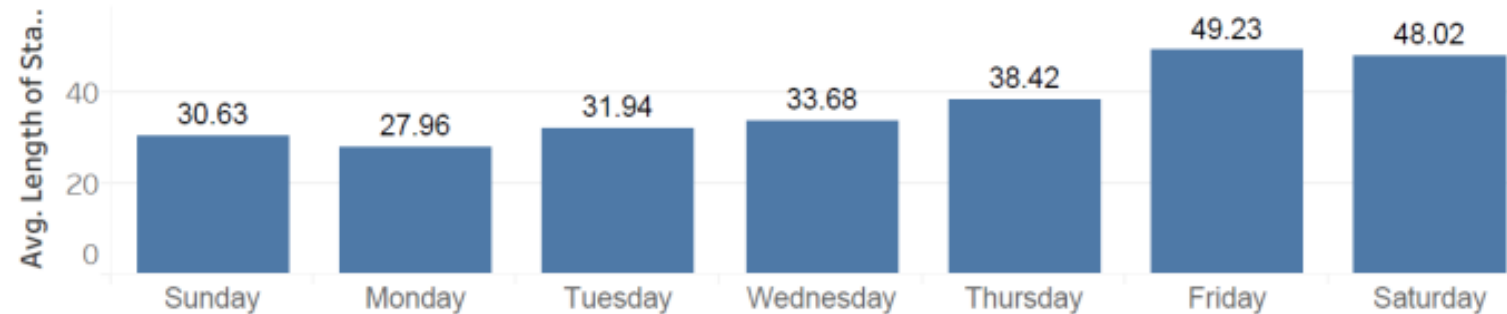
- Blue - bed is occupied
- Can be provided in near real time (i.e. operations dashboard)
- Granularity to sub sec



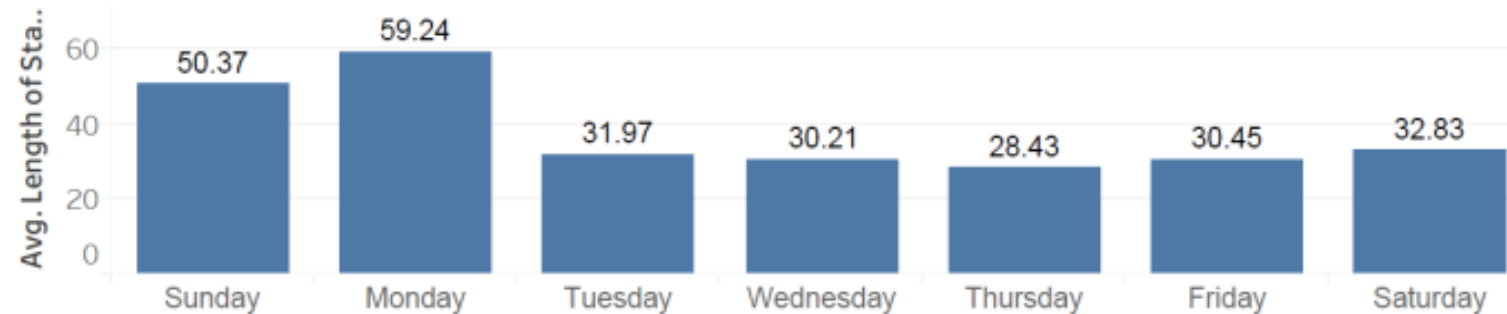
# Length of Stay Analysis

Length of Stay by Day (hours)

Length of Stay by Day Admitted

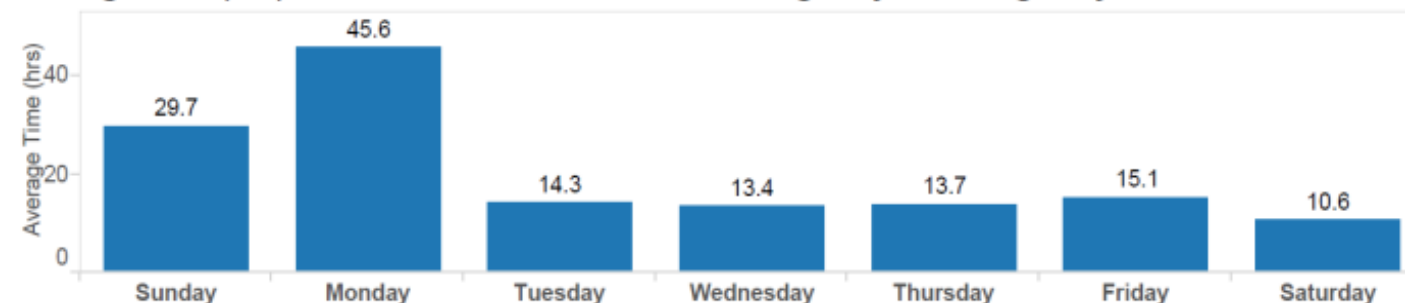


Length of Stay by Day Discharged



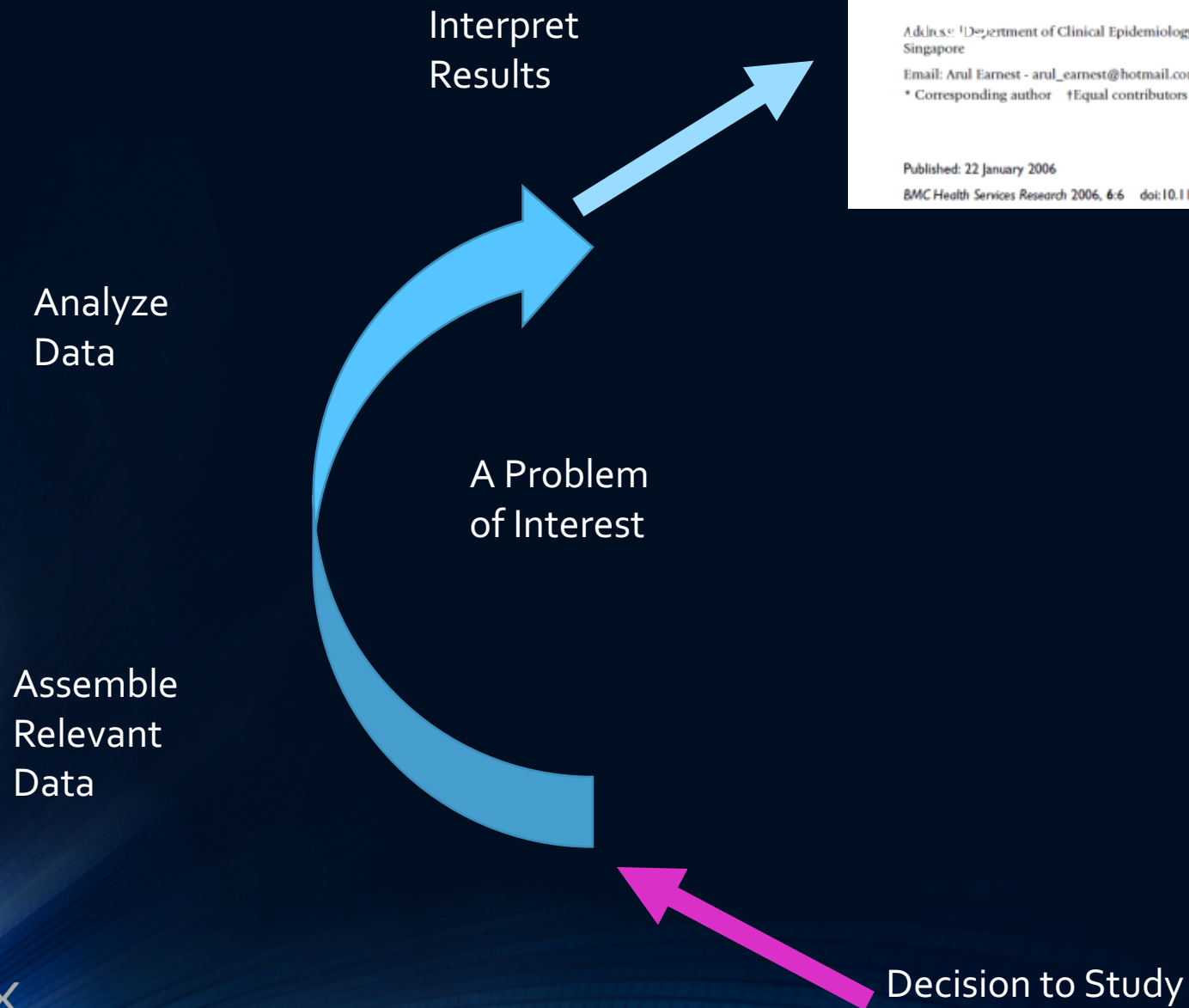
Why are Sunday and Monday discharges so much longer?

Average Time (hrs) from Patient Extubations to Discharges by: Discharge Day of Week Total



\*extubation is determined by when tidal volume is no longer available from ventilator





Research article

Open Access

# Exploring if day and time of admission is associated with average length of stay among inpatients from a tertiary hospital in Singapore: an analytic study based on routine admission data

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# Average Procedure Time in ICU

Average Length of stay (hrs) for March-  
August 2017

## Length of Stay by Procedure (hrs)

Length of Stay, St Dev, and Number of Patients	ASD	AVR	AVR + CABGx1	AVR + CABGx2	AVR + CABGx4	AVR + CRIF	AVR + DVR	AVR + MVR	Bentalls	CABGx1
	26.38	36.51	29.39	74.83	19.19	84.51	26.42	20.00	46.08	41.79
	22.594	22.543	15.597	22.778					18.817	18.063
	5	21	8	2	1	1	1	1	5	5
Length of Stay, St Dev, and Number of Patients	CABGx1 + MVR	CABGx2	CABGx2 + MVR	CABGx3	CABGx3 + MVR	CABGx4	CABGx5	DVR	Endarte..	LA Myxoma Excision
	63.58	37.96	44.45	46.37	44.80	51.73	20.69	62.08	19.48	50.46
	14.20	44.91	2.40	25.59		45.53		44.44		
	5	3	2	10	1	13	1	3	1	1
Length of Stay, St Dev, and Number of Patients	LA Myxoma Resection	MIDCABx1	MVR	MVR + LAA ligation	MVR + TVR	No Procedure Provided	OPCABGx1	OPCABGx1 + Endartere ctomy		
	14.34	23.41	47.59	47.67	47.14	36.74	30.32	23.72		
		6.65	38.95	65.21	19.37	26.88	23.86			
	1	2	13	2	6	416	22			1
Length of Stay, St Dev, and Number of Patients	OPCABGx2 + Endartere ctomy	OPCABGx2 + DJ stent	OPCABGx3	OPCABGx3 + Cholesyst ectomy	OPCABGx3 + diffuse Tvd	OPCABGx4	OPCABGx5			
	33.38	19.32	25.43	34.45	13.71	19.30	34.33	31.34		
	19.03	0.14		22.55			22.41	21.12		
	32	2	1	124	1	1	76	6		

Example of breakdown  
by procedure  
(this can be used as a  
quality metric when  
enough patients are in  
base data set.

With a little more data,  
clinicians could easily  
see in real time that  
patient is not in line  
with care pathway

# Clinical Data View



Date & Time August 24, 2016 9 PM CD August 24, 2016 10 PM

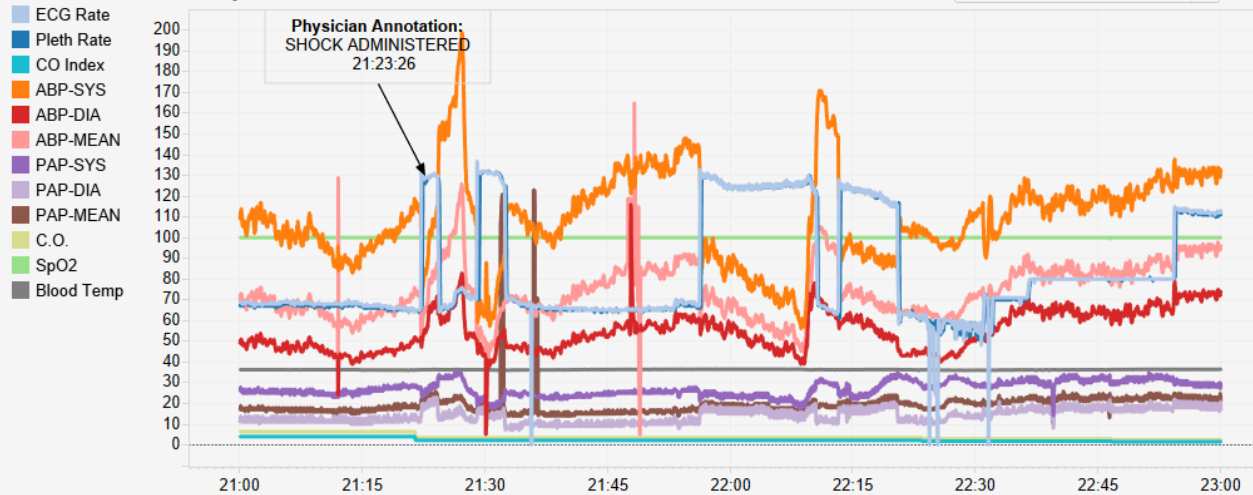
[Back to Patient Info](#)

[View Alarms](#)

PATIENT MM1234567 Name: Smith, Joan  
Sex: F Age: 74Y Location: ICU2 Bed 33

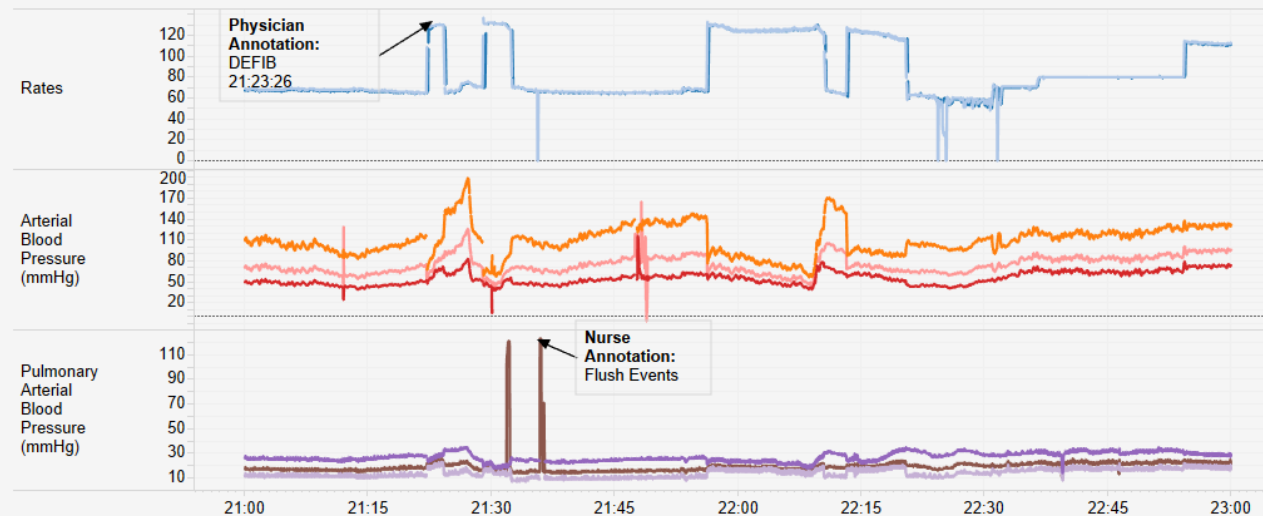
## Clinical Trends Graph

Select values to view in Clinical Trends View: (All)



## Detailed View

Select values to view in Detailed View: (Multiple values)



## Ventilator Settings

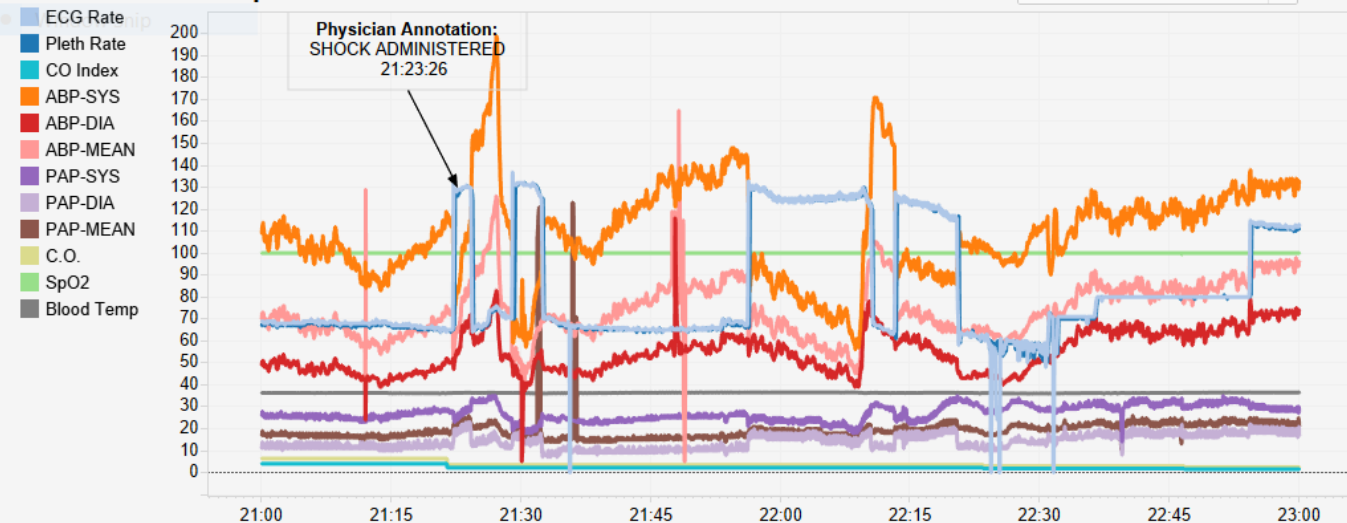
Vent Mode:	SIMV-VC				
Mech RR	12.0				
Trigger Window	25.0				
End Flow	25.0				
Pressure Rise T..	100.0	100.0	100.0	100.0	100.0
Pmax	30.0	30.0	30.0	30.0	30.0
PSV Rise Time	50.0				
FiO2	50.0	50.0	50.0	50.0	50.0
Tube Size	7.5	7.5	7.5	7.5	7.5
Nebulizer Time	15.0	15.0	15.0	15.0	15.0
Pt Weight	70.0	70.0	70.0	70.0	70.0
Pt Height	170.0	170.0	170.0	170.0	170.0
ARC Level	35.0	35.0	35.0	35.0	35.0
RR	12.0	12.0	12.0	12.0	12.0

Waveforms - Select Values in Detailed View to View Relevant Waveforms



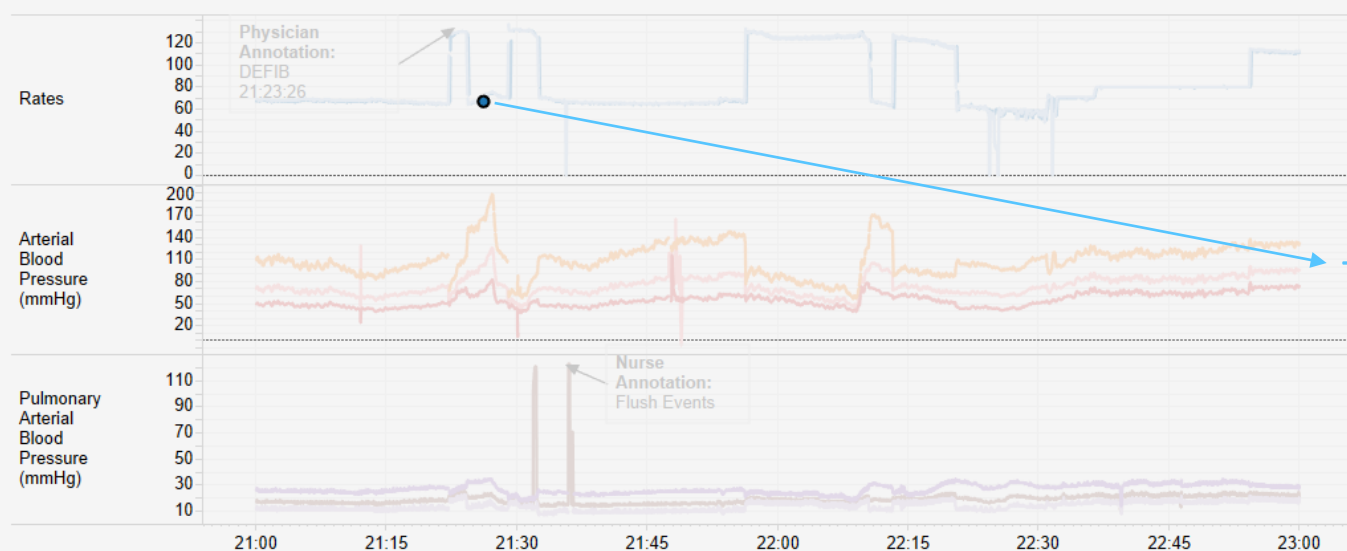
## Clinical Trends Graph

Select values to view in Clinical Trends View: (All)



## Detailed View

Select values to view in Detailed View: (Multiple values)



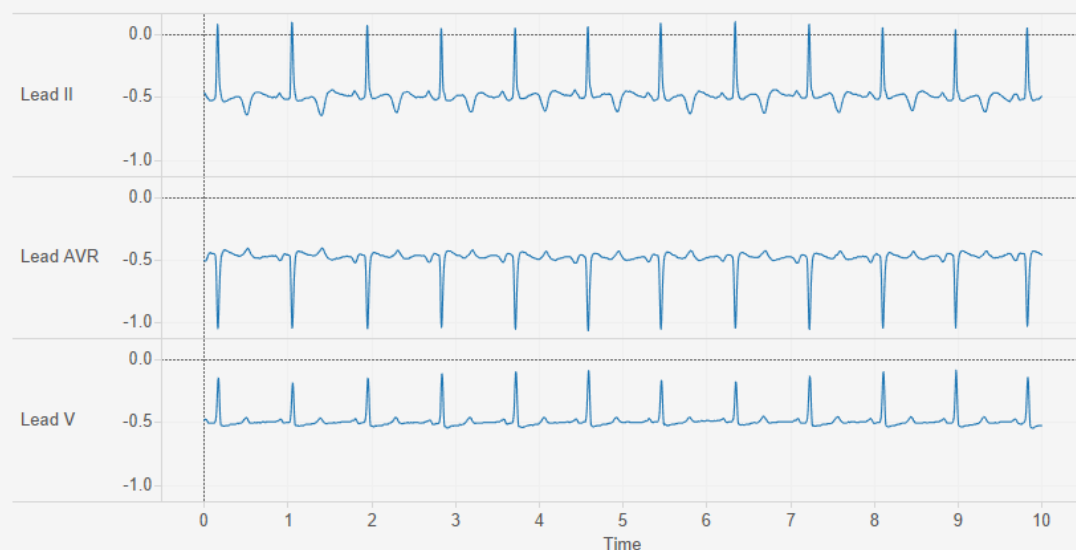
## Ventilator Settings

Vent Mode: SIMV-VC

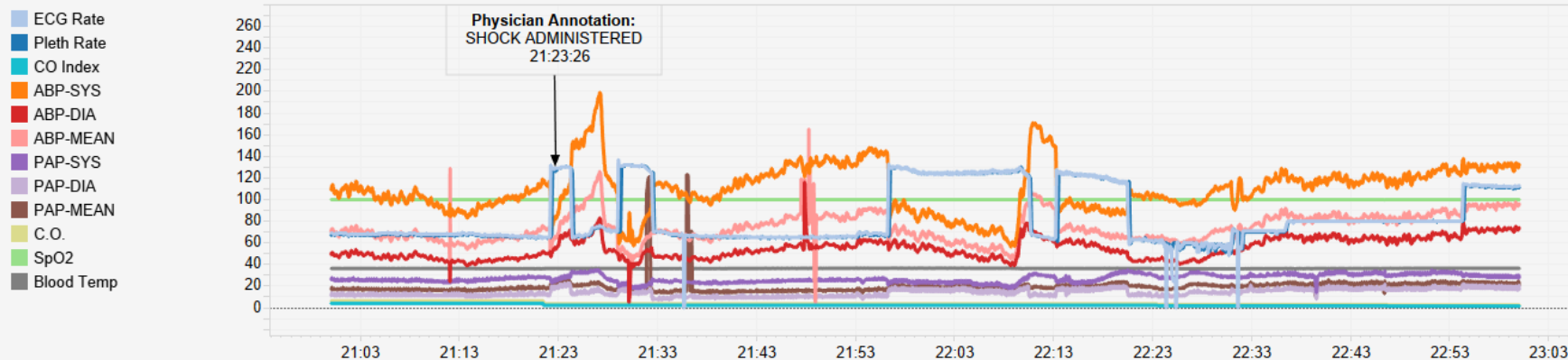
Select values to view in Ventilator Settings: (All)

Mech RR	12.0				
Trigger Window	25.0				
End Flow	25.0				
Pressure Rise T..	100.0	100.0	100.0	100.0	100.0
Pmax	30.0	30.0	30.0	30.0	30.0
PSV Rise Time	50.0				
FiO2	50.0	50.0	50.0	50.0	50.0
Tube Size	7.5	7.5	7.5	7.5	7.5
Nebulizer Time	15.0	15.0	15.0	15.0	15.0
Pt Weight	70.0	70.0	70.0	70.0	70.0
Pt Height	170.0	170.0	170.0	170.0	170.0
ARC Level	35.0	35.0	35.0	35.0	35.0
RR	12.0	12.0	12.0	12.0	12.0

## Waveforms - Select Values in Detailed View to View Relevant Waveforms



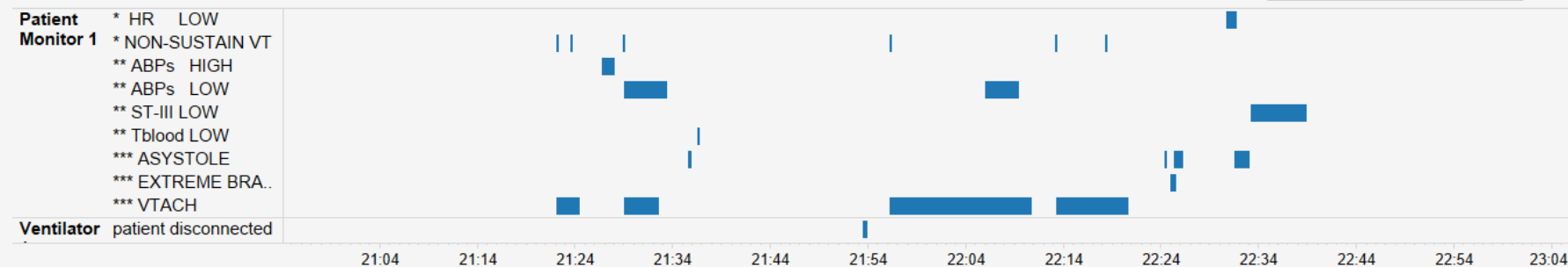
## Clinical Trends Graph



Select values to view in Clinical Trends View:

(All) ▼

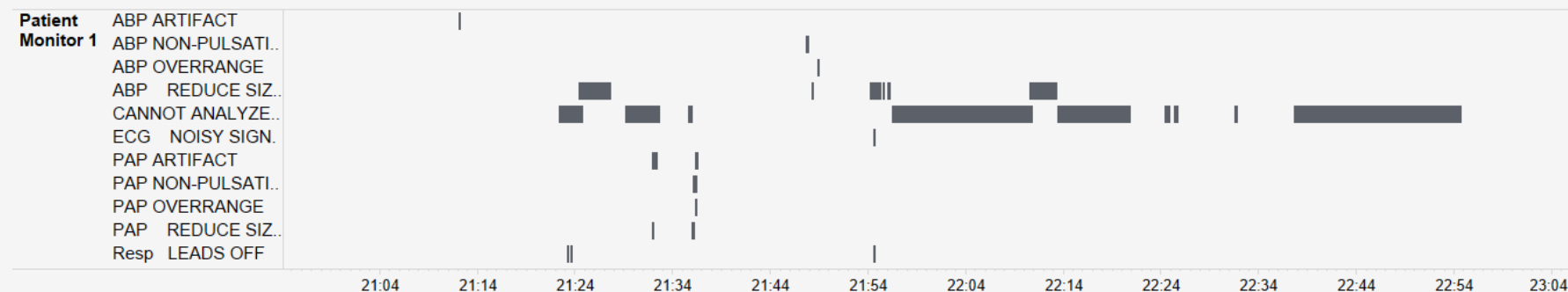
## Physiological Alarms



## Physiological Alarm Total Durations

Alarm Message	Device	Seconds	Hours
^ patient disconnected	Ventilator 1	2	0.001
plimit reached	Ventilator 1	4	0.001
* NON-SUSTAIN VT	Patient Monitor 1	7	0.002
** Tblood LOW	Patient Monitor 1	7	0.002
*** EXTREME BRADY	Patient Monitor 1	23	0.006
* HR LOW	Patient Monitor 1	50	0.014
** ABPs HIGH	Patient Monitor 1	66	0.018
*** ASYSTOLE	Patient Monitor 1	124	0.034
** ST-III LOW	Patient Monitor 1	321	0.089
** ABPs LOW	Patient Monitor 1	415	0.115
*** VTACH	Patient Monitor 1	455	0.126

## Technical Alarms

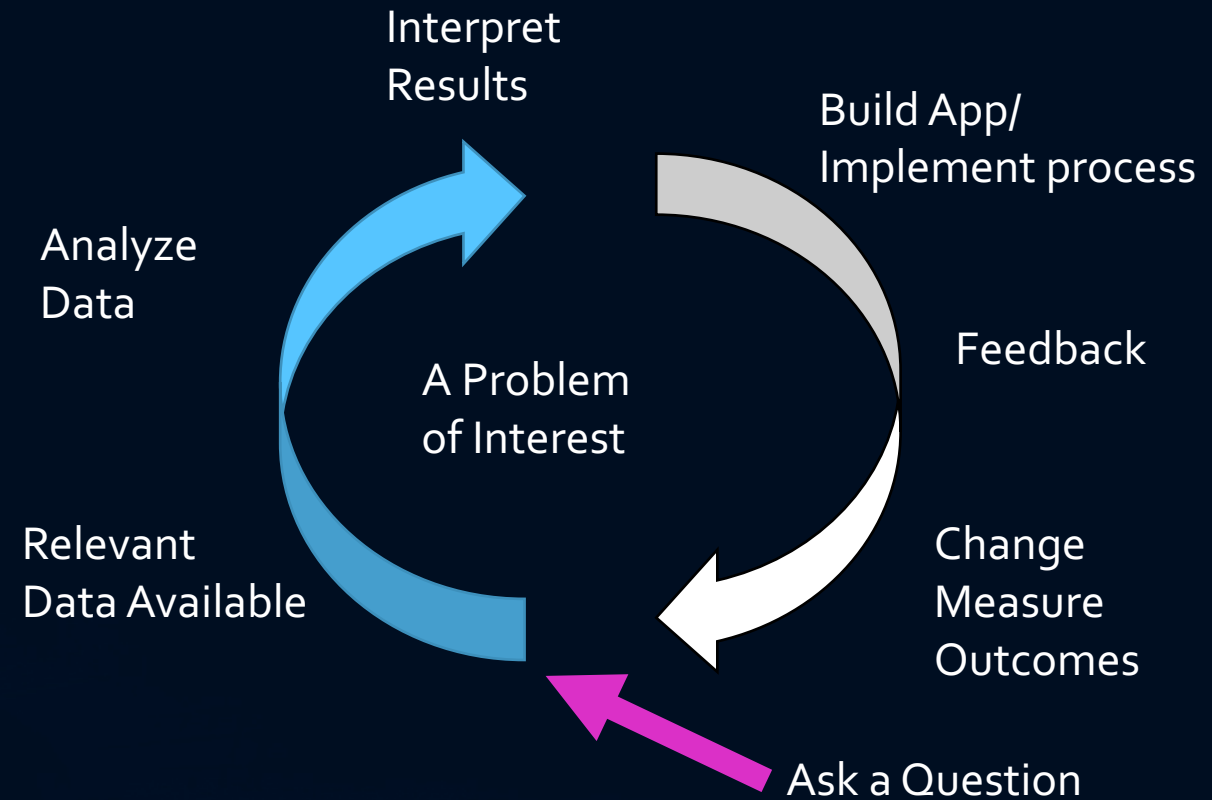


## Technical Alarm Total Durations

Alarm Message	Device	Seconds	Hours
^ PAP OVERRANGE	Patient Monitor 1	1	0.000
ABP OVERRANGE	Patient Monitor 1	2	0.001
ECG NOISY SIGN.	Patient Monitor 1	2	0.001
SpO2 POOR SIGNAL	Patient Monitor 1	2	0.001
ABP ARTIFACT	Patient Monitor 1	5	0.001
Resp LEADS OFF	Patient Monitor 1	5	0.001
ABP NON-PULSATILE	Patient Monitor 1	6	0.002
PAP NON-PULSATILE	Patient Monitor 1	12	0.003
PAP REDUCE SIZE	Patient Monitor 1	14	0.004
PAP ARTIFACT	Patient Monitor 1	25	0.007
SpO2 LOW PERF	Patient Monitor 1	31	0.009

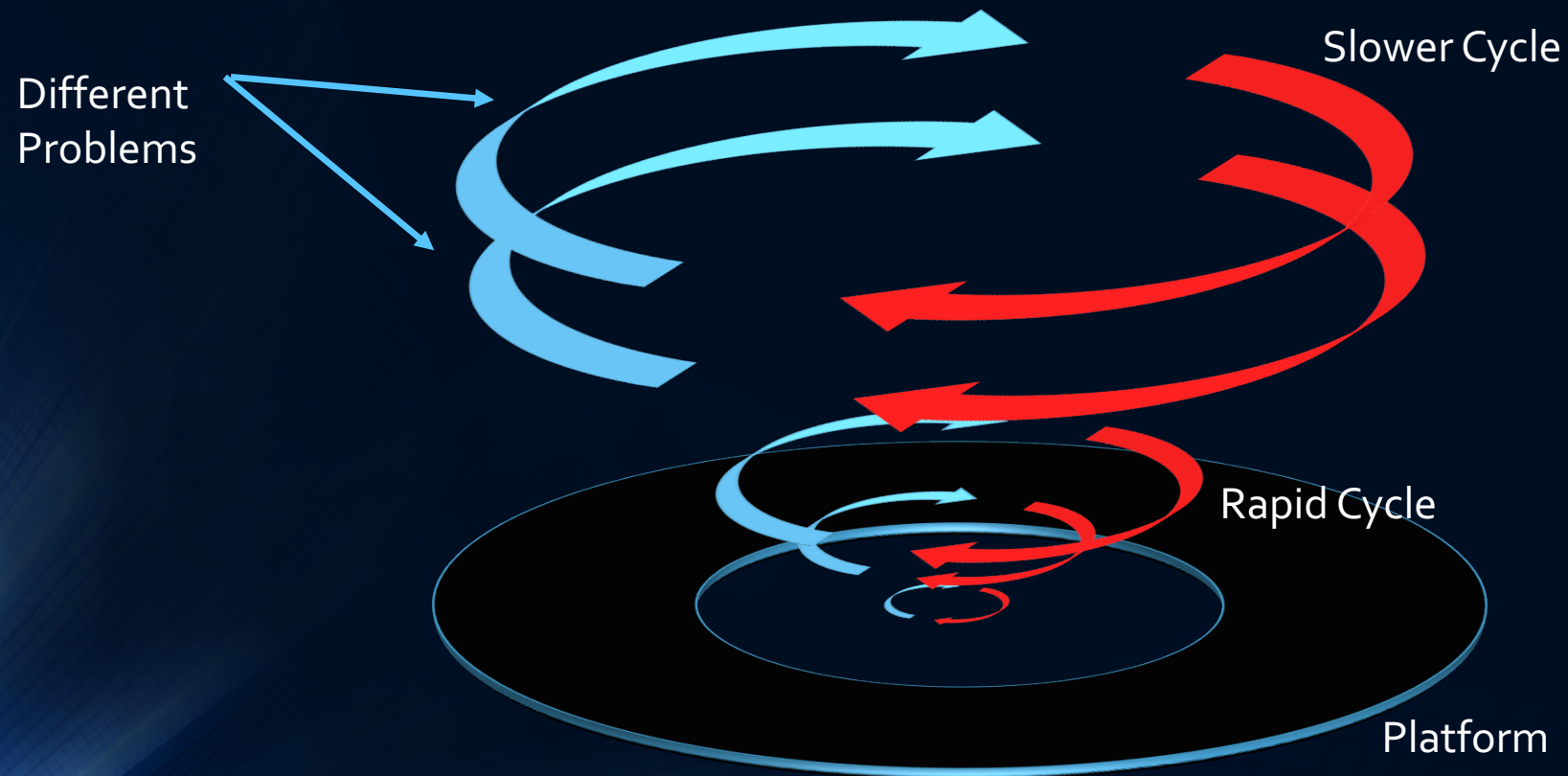
# Closing the Loop

- New solutions can be deployed
- Data is collected continuously
- Improvements are continuous based on data
- Innovation is enabled
- Scale with new Apps on platform





# Medical Internet of Things Creates Platform



# What is Next?

- Add a Virtual Care Domain and associated Apps
- Implementation in pre-hospital environments
- SDK and Regulatory Framework for 3<sup>rd</sup> Party Apps
- Increased Bed Role Out for Data Collection
- More Apps
- mIoT testbeds for interoperability and cybersecurity





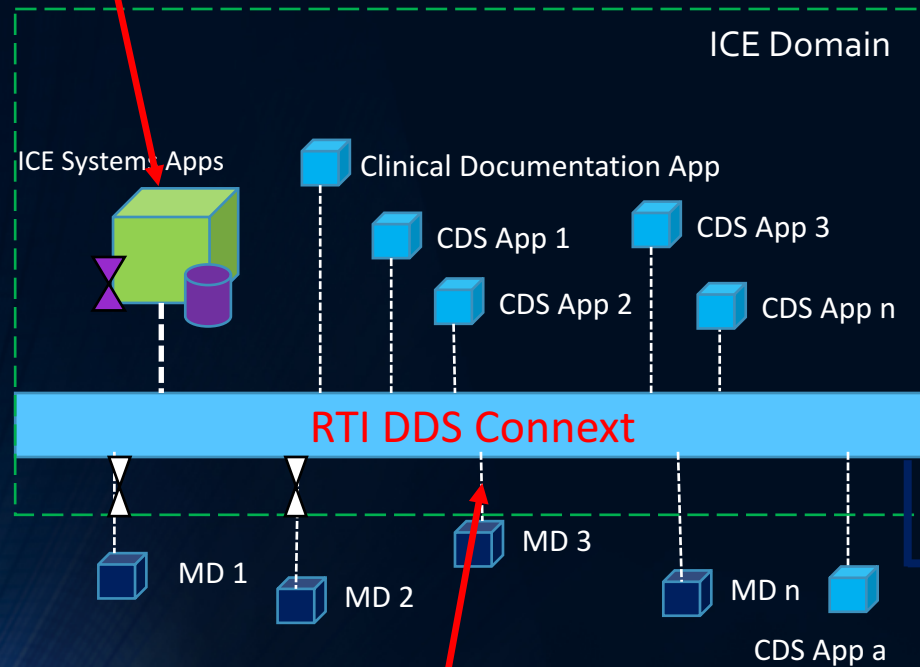
# Thank You

[WWW.DOCBOXMED.COM](http://WWW.DOCBOXMED.COM)  
[TRAUSCH@DOCBOXMED.COM](mailto:TRAUSCH@DOCBOXMED.COM)

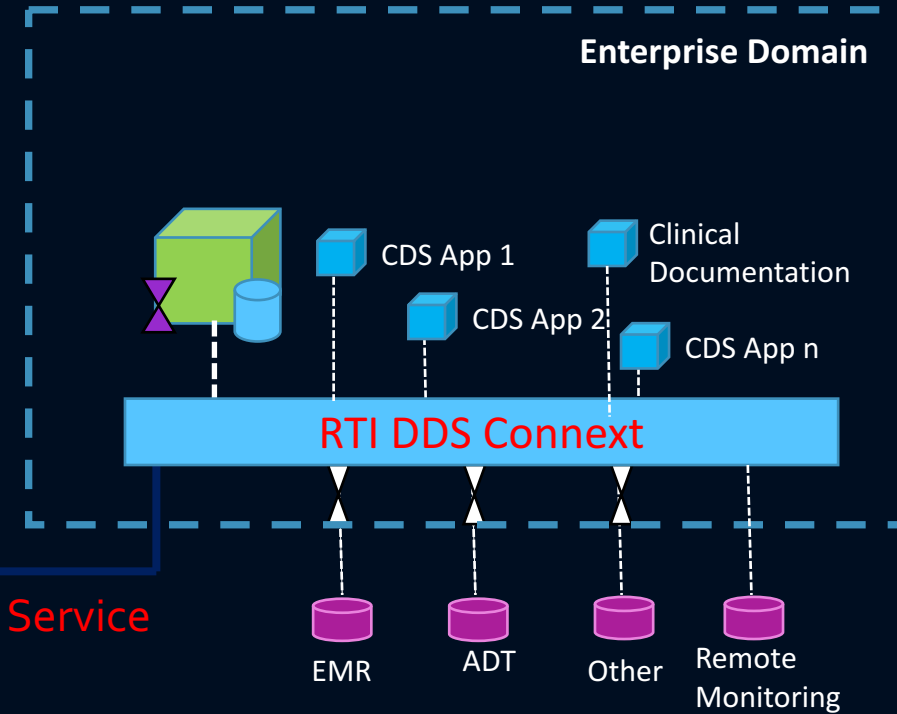


# ICE with DDS

RTI Recording Service  
(Data Logger)



IDL  
Objective State Pattern



Remote Domain

DDS Secure  
IP mobility (SWIF)

