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# Quantitative evidence for resilience in responses to patient admissions, discharges and transfers

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# Overview

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- **Motivation**
- **Theoretical assumptions about systems**
- **Method & Results**
- **Conclusions & Limitations**
- **Next Steps**

# Motivation

- Patients exposed to shifts with: ↑ADTs ↓RN:Pt ratios have ↑30-day mortality (Needleman 2011)
- ↑RN workload: Care left undone, errors of omission (Kalisch 2009; 2011; 2013; Ball 2013) → calls for increased staffing

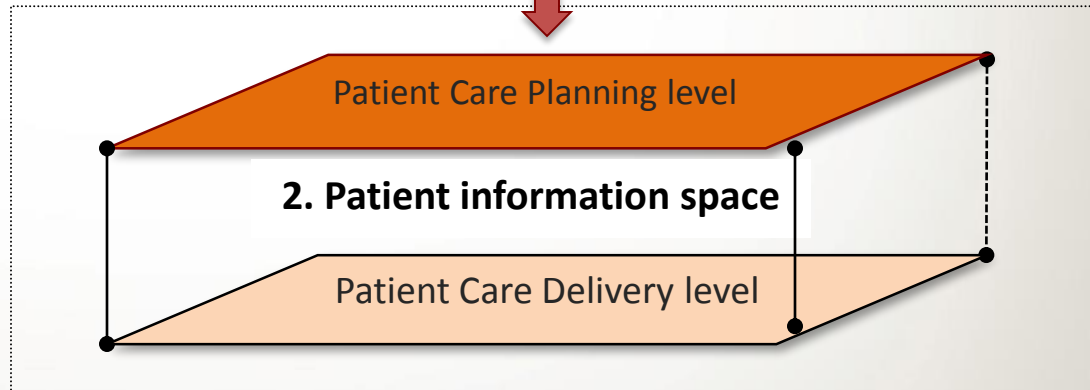
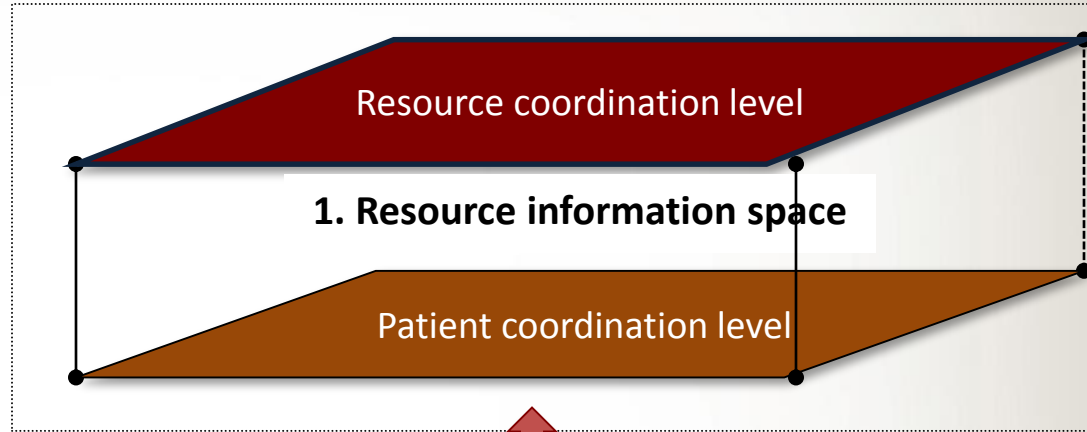
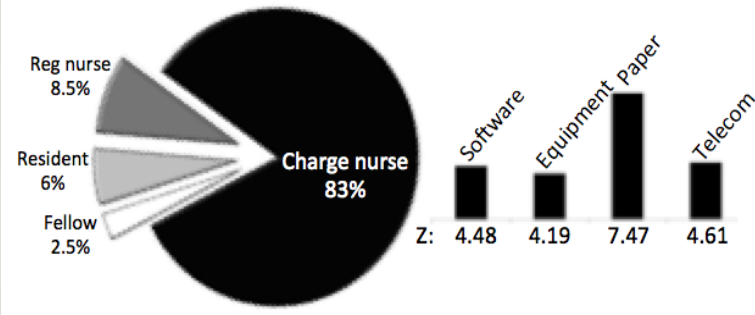
However:

- Demand variation is the issue (Litvak, 2005)
- Sources of variation (Jennings, 2013)
  - Timing & clustering
  - Source of admission (ED; OR)
  - Nature of admission (planned vs unplanned)
  - Nurse to patient allocation
  - Admission, discharge & transfer effort differs



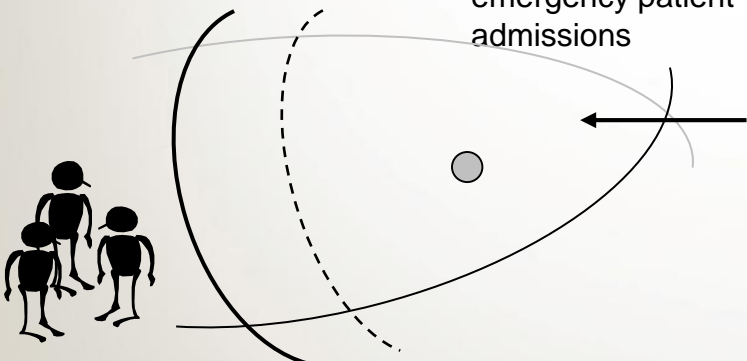
**ADTs have not been investigated  
from a 'management' perspective**

# Preliminary research



Miller et al, 2010, Human Factors

Daily variation in emergency patient admissions



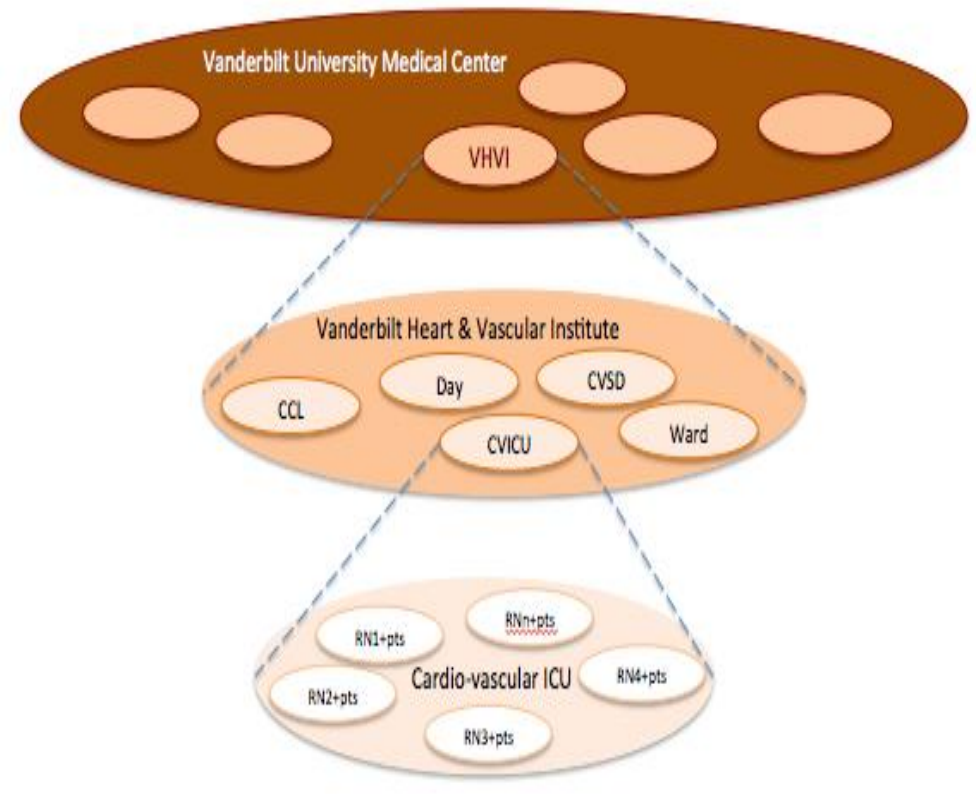
Miller & Xiao, 2007; CTW

# Theoretical Assumptions

## Structural complexity

Self-organizing Holarchic Organizations (SOHOs) (Simon 1962; Koestler 1978; Kay 2000)

1. **Nested hierarchy - All elements exhibit autonomy of wholes & dependency of parts**
2. As wholes - assert identity, through specialist functions
3. Internally self-regulating, self-organizing
4. As Parts are integrative – Share reciprocal relations laterally and vertically
5. Promote stability & cohesion

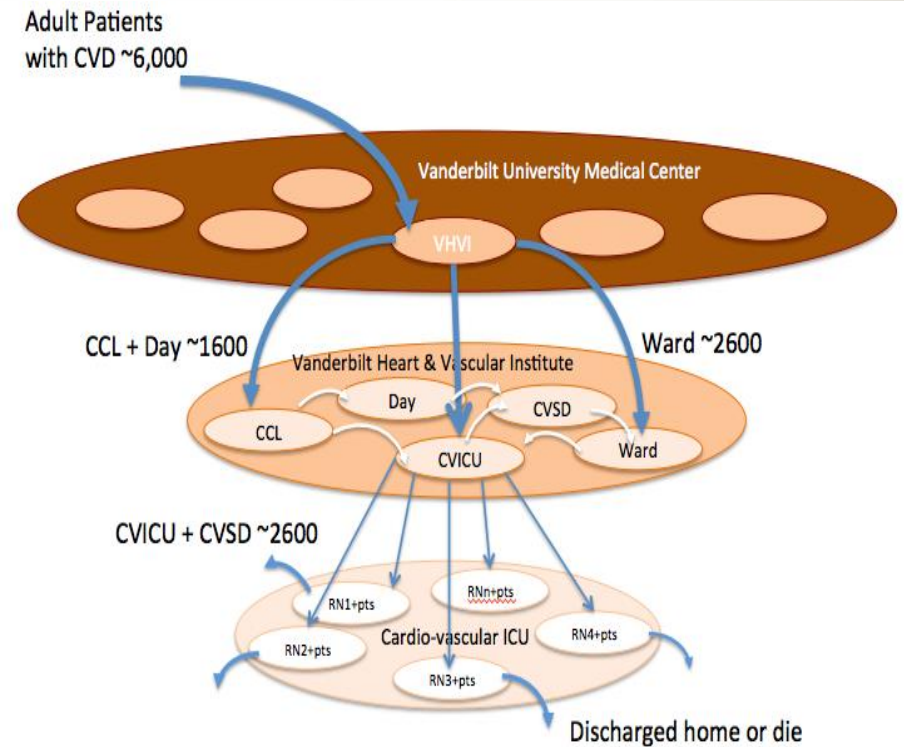


# Theoretical Assumptions

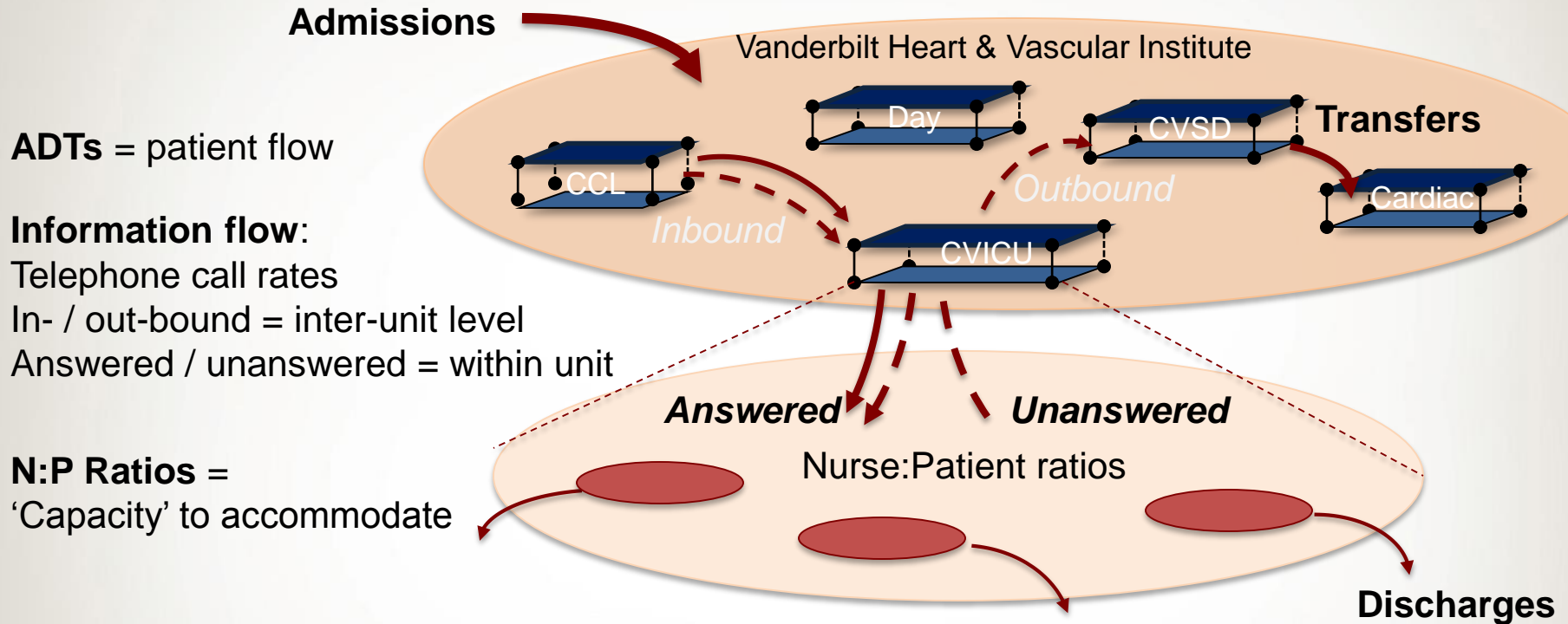
## Functional dynamism

Gradient dissipative structures (GDS)  
(Nicolis & Prigogine, 1989; Schneider & Kay 1994)

1. Gradients are flows of material, energy, information from external environment
2. Structures are processes of tightly coupled feedback loops that maintain states by reorganizing themselves
3. Reorganization involves reconfiguration to more complex forms - emergent
4. Dissipative in 2 ways:
  1. Without external flows, structures would not exist
  2. Process structures dissipate (distribute) flows



# Research hypotheses



1. Telephone call patterns are associated with ADTs and nurse to patient ratios
2. In a system of interconnected units (e.g., the VHVI), the patient (ADTs) and information (telephone call patterns) flows in one unit affect flows in other units
3. Outlier events expose system strengths and limits



# Method

**From November 2012 - 2014; for all 5 VHVI units**

- **Hourly Admissions, Discharges & Transfers**
  - **Bed management systems**
- **Hourly telephone call types (inbound, outbound, answered, unanswered)**
  - **Information technology services**
- **Hourly nurse staffing**
  - **Kronos HR system**

**N> 15,000 data points.**

# Results

## H1: Telephone call patterns are associated with ADTs and NPRs

### Inbound calls associated with:

- **High Admissions** (t=24.7; p<0.000)
- **High Transfers** (t=45.6; p<0.000)
- **Low Discharges** (t=-4.0; p<0.00)
- **Low NPR** (t=-2.2; p<0.00)

### Answered calls:

- **Admissions** (t=17.3; p<0.000)
- **Transfers** (t=19.0; p<0.000)
- **Discharges** (t=9.6; p<0.000)
- **NPR** (t=2.5; p<0.05)

### Outbound calls associated with:

- **High Admissions** (t=10.0; p<0.000)
- **High Transfers** (t=16.8; p<0.000)
- **High Discharges** (t=17.4; p<0.000)
- **NPR** (t=0.8; p=0.424)

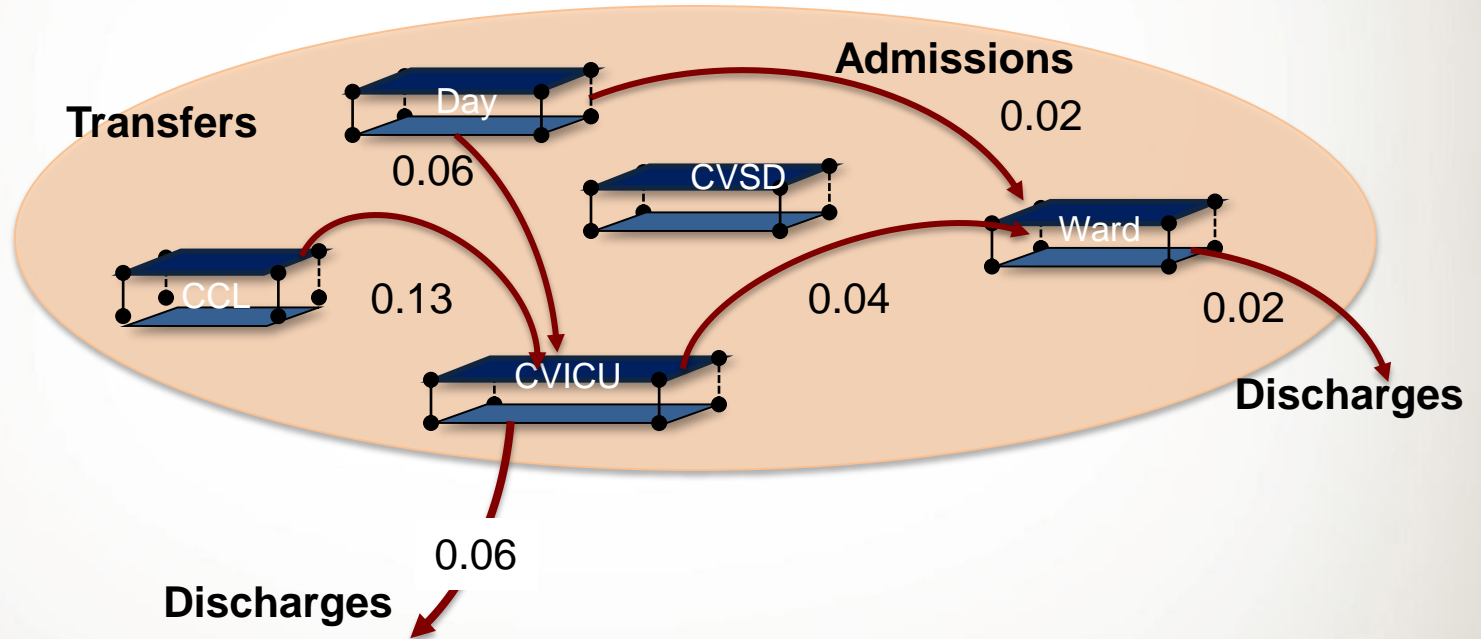
### Unanswered calls:

- **Admissions** (t=24.5; p<0.000)
- **Transfers** (t=38.6; p<0.000)
- **Discharges** (t=-1.1; p=0.27)
- **NPR** (t=7.8; p<0.000)

# Results

## H2: Patient (ADTs) and information (call patterns) flows in one unit affects other units

### Transfers

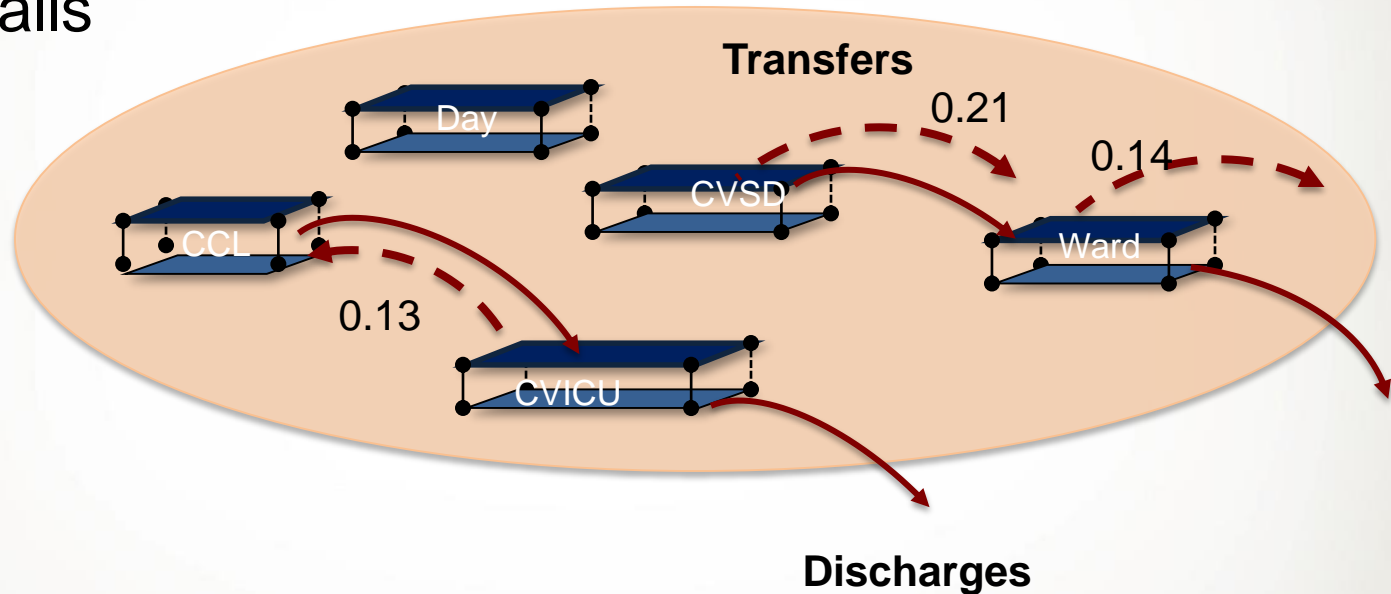


Patient movement tends to cascade through the system

# Results

## H2: Patient (ADTs) and information (call patterns) flows in one unit affects other units

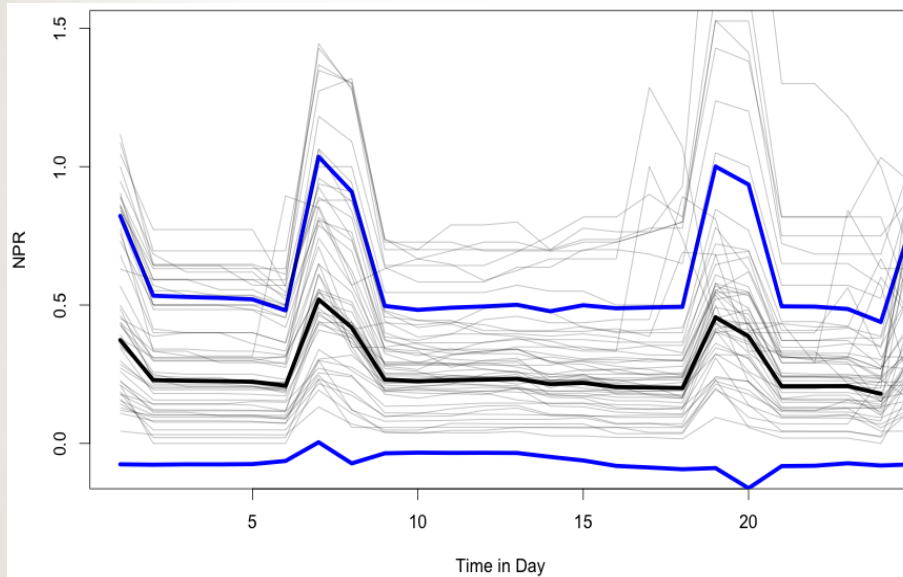
### Outbound calls



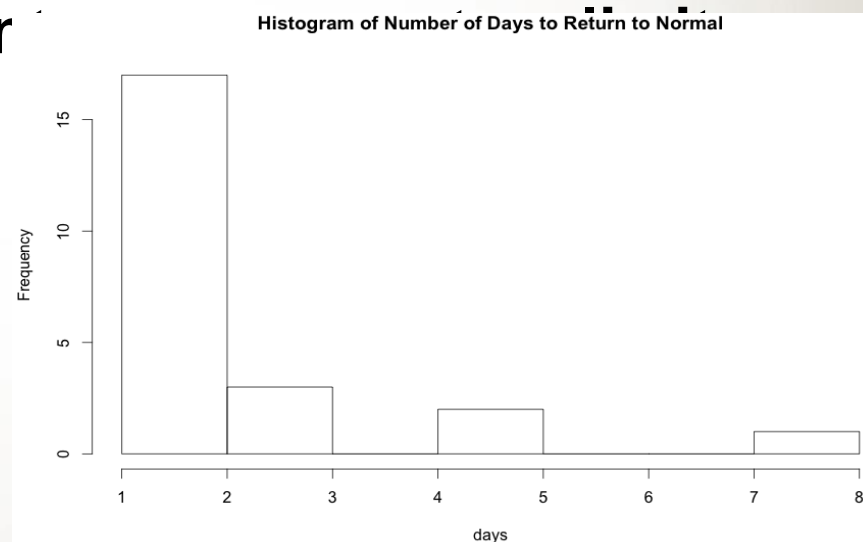
Outbound requests for information accompany transfers and admissions

# Results

## H3: Outlier events expose strengths & limitations



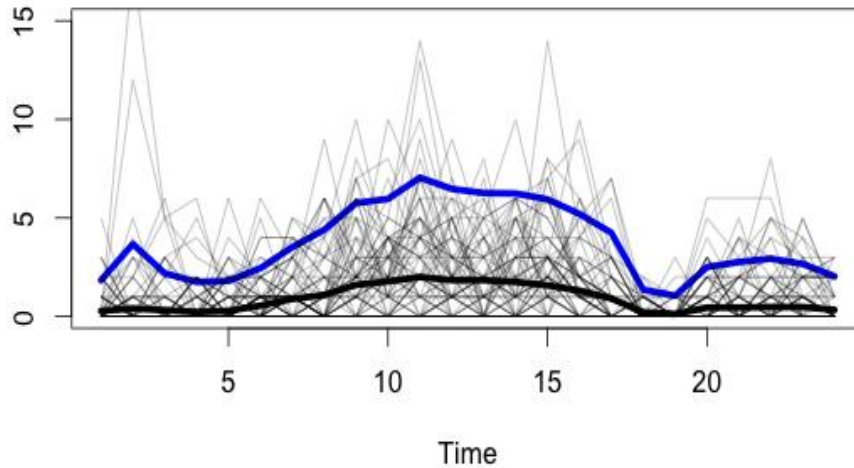
23 (11%) CVICU days had high nurse staffing - NPR approaching 0.8



74% of these were sustained for 1 day

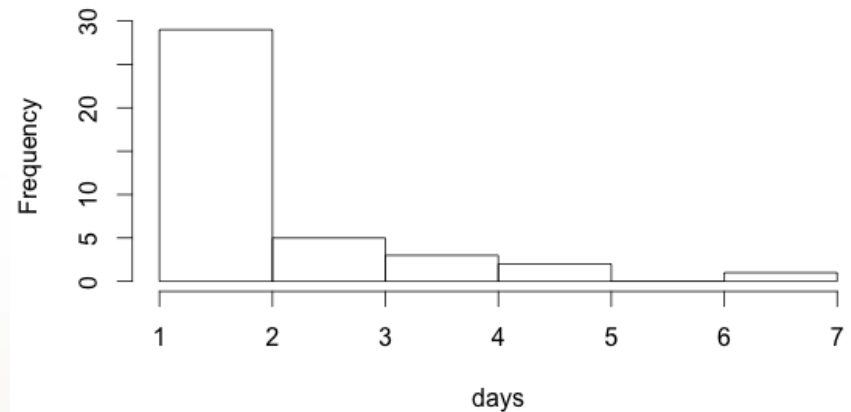
# Results

## H3: Outliers expose system strengths & limitations



40 (19%) CVICU inbound call were outlier events

Histogram of Number of Days to Return to Normal



72% of these were sustained for 1 day

# Conclusions

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**Overall conclusion is that ADTs management involves the management level**

- **Admissions & transfers associated with significant lateral communication**
- **Patient flow tends to cascade through the VHVI and is associated with significant outbound calls (information requests) more suggestive of proactive behavior**
- **Outlier events tend to persist**

# Limitations

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- **Quantitative data analysis – ‘what’ but not ‘why’**
- **No patient outcome data**
- **Hourly nurse staffing may be inaccurate as nurses do not swipe in and out of units**
- **No call destination data**
- **Other telecommunications (text, cell-phone, EHR messaging - asynchronous) not included**
- **Call content not included**



# Next steps

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- **AHRQ grant**
  - **Qualitative investigation of ADT management by middle nurse managers including information flows, ADT processing and artifact use (e.g. pagers, instant messaging, cell-phones etc)**
  - **Establish patient safety links between Manager' non-routine events and Bedside non-routine events**
  - **Build a more robust/comprehensive descriptive/predictive model**