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January 31, 2016 – Healthcare Working Group, INCOSE International Workshop; Torrance, CA

### What to expect for the next 30 minutes:

- My background
- Perspectives on SE / M&S from the healthcare industry
  - Clinicians
  - Medical administrators
  - Medical researchers
- The disconnect
- The reconnect



### Consider the source:

**BROWN** 



S A E M





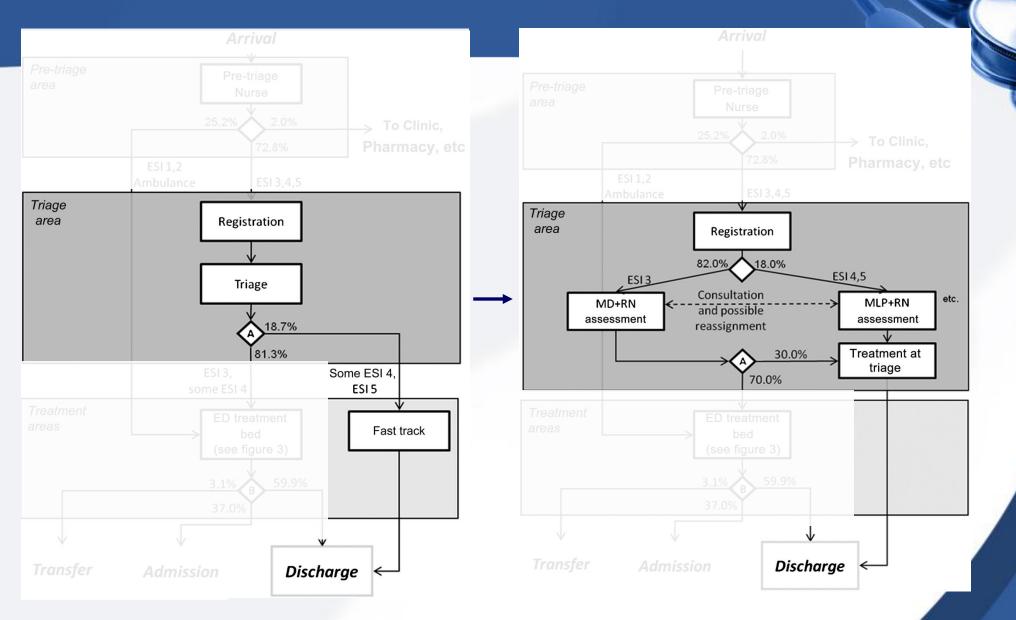


# St. Louis (John Cochrane) VA Medical Center



- QualityImprovementProject
  - Objective:
    Decrease % of
    ED patients with
    length of stay
    (LOS) > 6 hrs
  - Compared real vs simulated results

### And here's what I've done with it:



### VA: Throughput Metrics

### Mean Daily LOS:

- Simulation:  $249' \pm 39.7' \longrightarrow 200' \pm 19.0'$ 

- Real World: 247' ± 39.8' → 210' ± 16.6'

37 minutes (p < .0001)

### % Patients with LOS > 6h:

Simulation: 19.0% → 13.1%

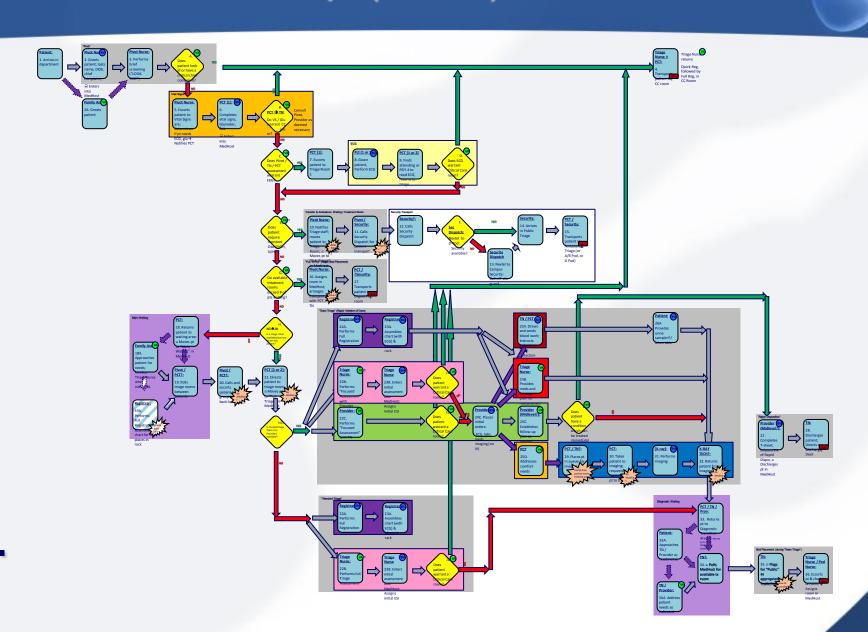
- Real World: 19.9% → 14.3%

28% reduction (p = .045)

No indication of negative effects on patient health or satisfaction Allows 3,500 more visits/year (17.5%) without adding staff or space



# AEC: Process Flow Map (2010)



• Yikes.

# AEC: Process Flow Map (2010)



- Develop a model which accurately predicts patient queue lengths by hour of day.
  - Waiting for triage room
  - \* Waiting for main treatment bed
  - Waiting for X-ray, CT, ultrasound
  - Waiting for a hospital bed (if admitted)

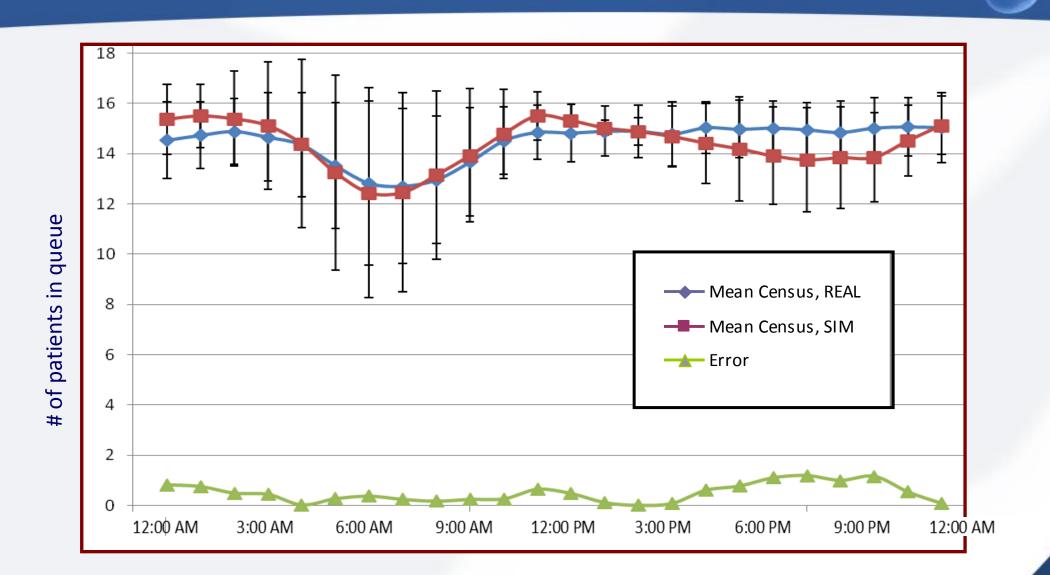
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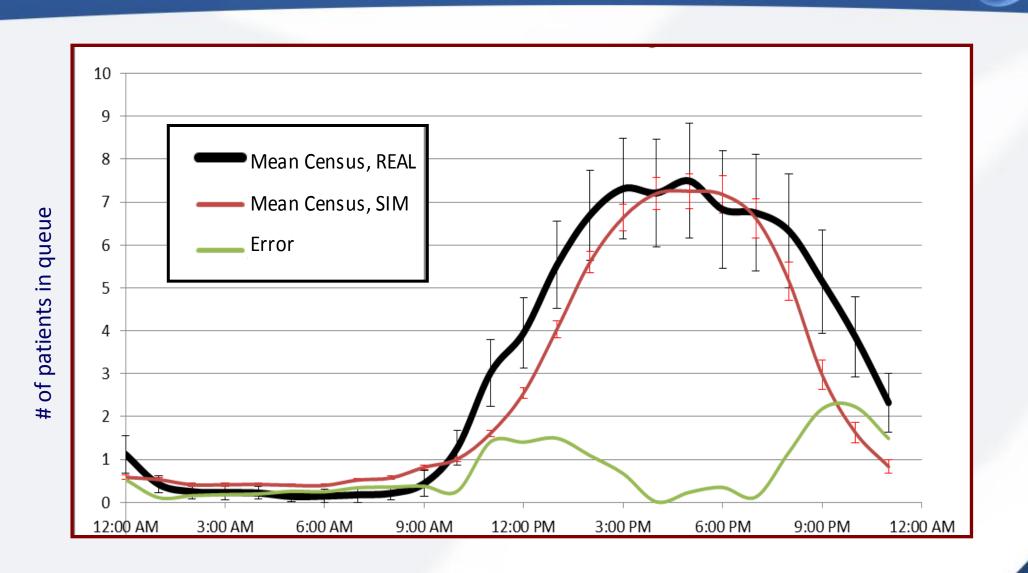




### Census: "A" Pod



# Queue for Service: "Main Waiting" Area





# My colleagues' view on SE:



Operations Researchers



Clinicians



**Administrators** 

# Although there are some good examples...

1975: First proposed... in the economics literature (Hannan 1975)

1989: First published simulation of ED flow (Saunders 1989)

2001: Second article, proof-of-concept model (Coats 2001)

<u>2001 – 2015:</u> Discrete Event Simulation to:

- Optimize physician and staff scheduling Hung '07, Brenner '10\*, Day '15
- Analyze & visualize patient flow Codrington-Virtue '05, \*Mes '12, Batarseh "
- Optimize unit bed capacity
   Zhu '12, Santos '13
- Forecast near-future operating status Hoot '08, Hoot '09
- Assist in ancillary service design (e.g., pharmacy)
   Reynolds '11

- Compare alternative triage processes Connelly '04, Day '13, Ward '14
- Assist in pharmaceutical allocation and trial design

   Barrett '12
- Decrease inpatient boarding Levin '08, Hung '09, Khare '09
- Evaluate ED/EMS interventions Stahl '03, Chase '06
- Study interactions between providers Genuis '13, Lim '13
- Identify bottlenecks in a continuum of care \* Noonan '09, Santos '13

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1989: Firs

2001: Sed

<u>2001 – 201</u>

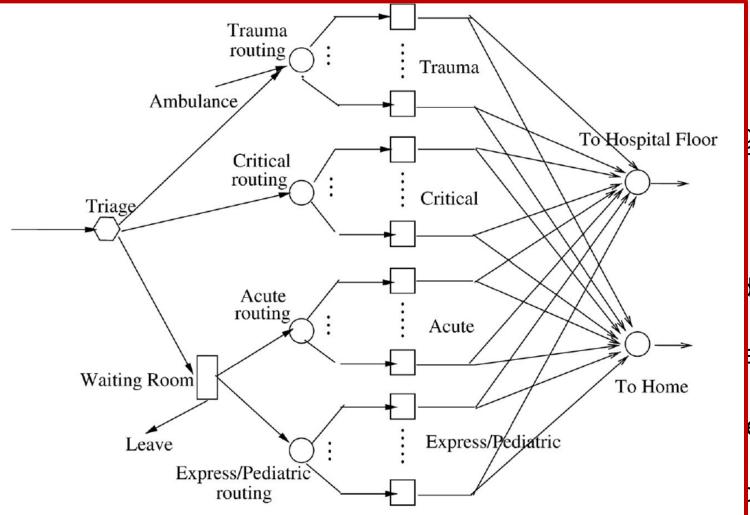
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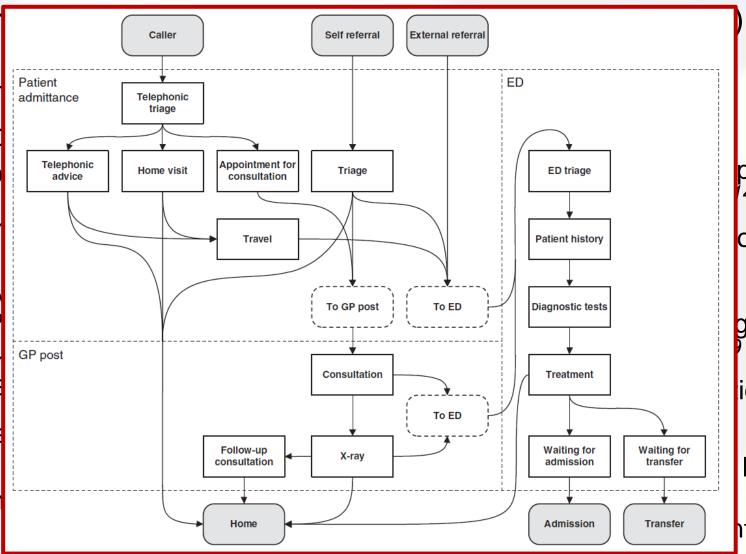
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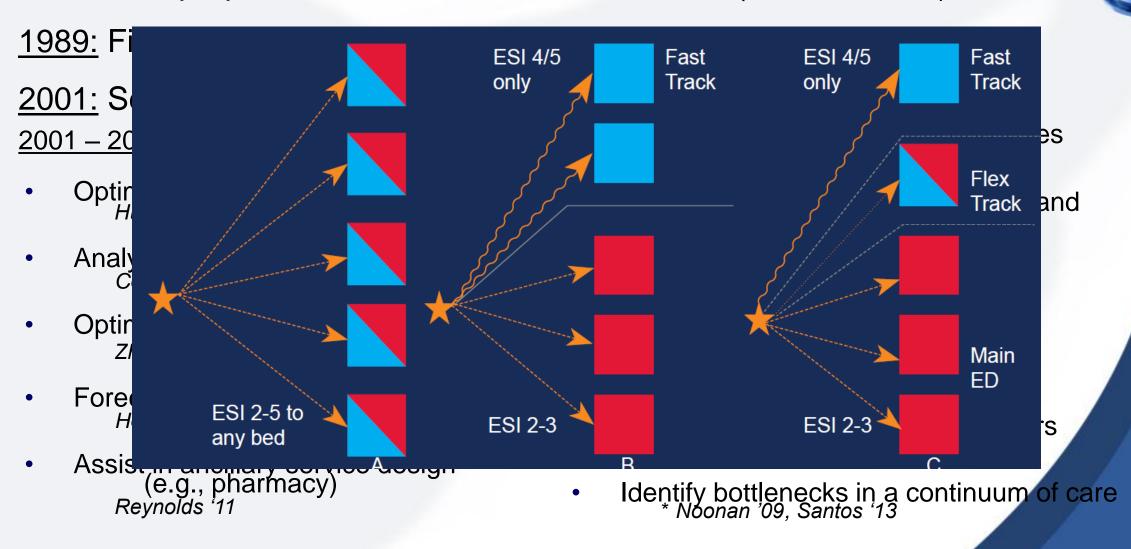
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1000: First published simulation of ED flow (Soundary 1000) Other destinations Community Hospital - Home or Tertiary Hospital - Long-term care - Etc. Acute Care at SCI Trauma Centre Pre-Hospital Phase Rehabilitation Centre Places where patients occupy beds In-patients Step Down Unit Ambulance Number of beds? Number of beds? Geographic Destination ◆@ Home Destination Grouped SCI clients? Staff ration? ransportation location of @ Destination Services provided? SCI-trained staff? methods injury Helicopter Out-patients Services provided to patients Other destinations Services provided PAR Long-term care SCI only or multiple Number of beds? - Other rehabilitation rehab programs. Hours of operation? Staff ration? provided? Out of the province or out of Canada identily bottjenecks in a continuum of care \* Noonan '09, Santos '13

# ... and a few who champion SE in healthcare...

### Modeling and Analysis of the Emergency DEPARTMENT AT UNIVERSITY OF KENTUCKY CHANDLER HOSPITAL USING SIMULATIONS

Authors: Stuart Brenner, MS, Zhen Zeng, MS, Yang Liu, MS, Junwen Wang, MS, Jingshan Li, PhD, and Patricia K. Howard, PhD, RN, CEN, FAEN, Lexington, KY

#### Computer Modeling of Patient Flow in a Pediatric Emergency Department Using Discrete Event Simulation

Geoffrey R. Hung, MD, FRCP(C) FAAP,\* Sandra R. Whitehouse, MD, FRCP(C),\* Craig O'Neill, BComm, MMOR,† Andrew P. Grav, BSc,† and Niranjan Kissoon, MD, FRCP(C) FAAP, FCCM‡

#### **Incorporating Discrete Event Simulation** Into Quality Improvement Efforts in **Health Care Systems**

American Journal of Medical Quality 201X, Vol XX(X) 1-5 © 2013 by the American College of Medical Quality Reprints and permissions: sagepub.com/journalsPermissions.nav DOI: 10.1177/1062860613512863 ajmq.sagepub.com

(\$)SAGE

Matthew Harris Rutberg, MBA, Sharon Wenczel, MSN, RN, John Devaney, BA, Eric Jonathan Goldlust, MD, PhD, 2,3 and Theodore Eugene Day, DSc

#### Discrete Event Simulation of Emergency Department **Activity: A Platform for System-level Operations** Research

Lloyd G. Connelly, PhD, Aaron E. Bair, MD

Journal of Simulation (2010) 4, 42-51 © 2010 Operational Research Society Ltd. All rights reserved. 1747-7778/10



#### Discrete event simulation for performance modelling in health care: a review of the literature

MM Günal\* and M Pidd

Lancaster University Management School, Lancaster, UK

#### Forecasting Emergency Department Crowding: A Discrete Event Simulation

Nathan R. Hoot. PhD Larry J. LeBlanc, PhD Ian Jones, MD Scott R. Levin. PhD Chuan Zhou, PhD Cynthia S. Gadd, PhD, MBA Dominik Aronsky, MD, PhD

From the Department of Biomedical Informatics (Hoot, Jones, Gadd, Aronsky), the Owen Graduate School of Management (LeBlanc), the Department of Emergency Medicine (Jones, Aronsky), the Department of Biomedical Engineering (Levin), and the Department of Biostatistics (Zhou), Vanderbilt University Medical Center, Nashville, TN.

# ...so Why the disconnect?



# How do we link SE and healthcare (in the minds of physicians)?

- STEP 0: Change the approach, to accommodate
  - Low engineering literacy
  - Physician egos
  - Reluctance to change
  - Need for visceral impact

Exploratory (sandbox)

Tech development Knowledge and cognitive systems

How do we link SE and healthcare (in the minds of physicians)?

- STEP 1: Approach (the right groups) with caution.
- STEP 2: Frame systems problems in clinical terms.
- STEP 3: Slowly translate into SE terms.
- STEP 4: ...
- STEP 5: Profit.



# Thank you one and all.

Especially:

Bob Malins

Ajay Thukral

- Chris Unger

Anyone still awake

- Ola Batarseh

– Eugene Day

– Nathan Hoot

Mike Ward