Evidence-based Staffing and Scheduling

Jody Crane, MD, MBA Chief Medical Officer

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Outline

- Academic Principles
- Case Study 75,000-visit ED
- Approach to Staffing Optimization
 - Define Demand
 - Define Capacity
 - Contextualize
- Conclusions

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Queuing Theory - Agner Krarup Erlang



Copenhagen Telephone Company (KTAS), 1908

"Solution of some Problems in the Theory of Probabilities of Significance in Automatic Telephone Exchanges," 1917



Customer Arrivals Queue (waiting line)







Server •



Customer Departures







Customer
Arrivals

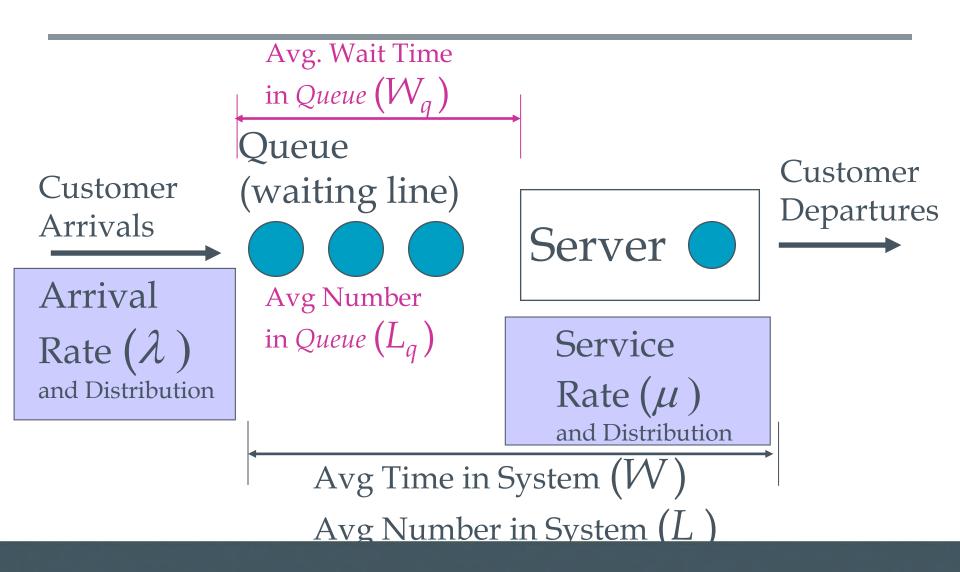
Arrival

Rate (λ)

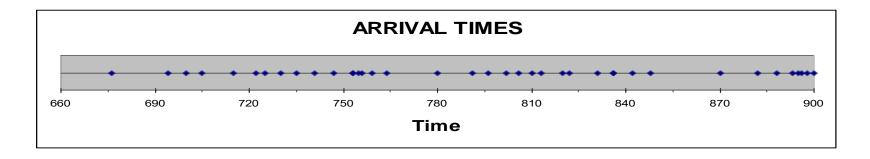
and Distribution

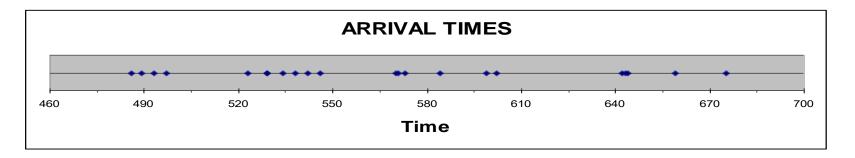
Server Customer
Departures

Service Rate (μ) and Distribution



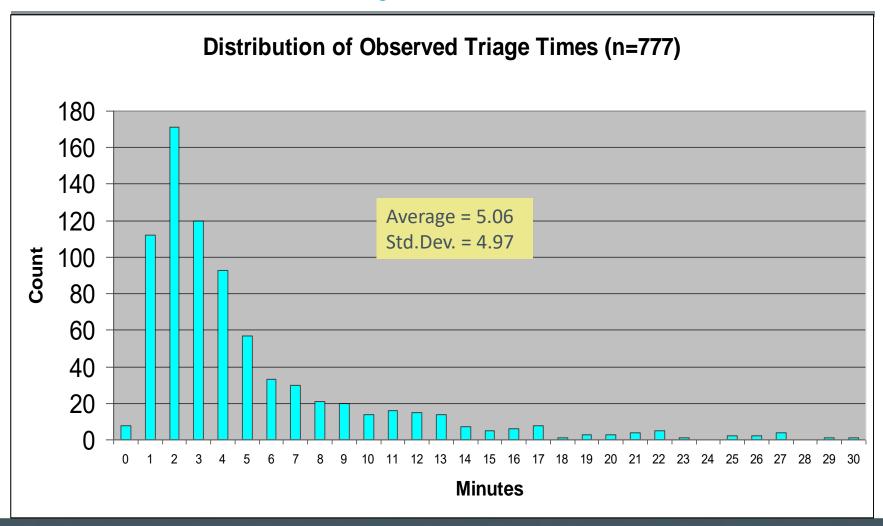
Demand on Key Servers - Arrivals





Arrival data from a California hospital. Mondays, 2pm-6pm.

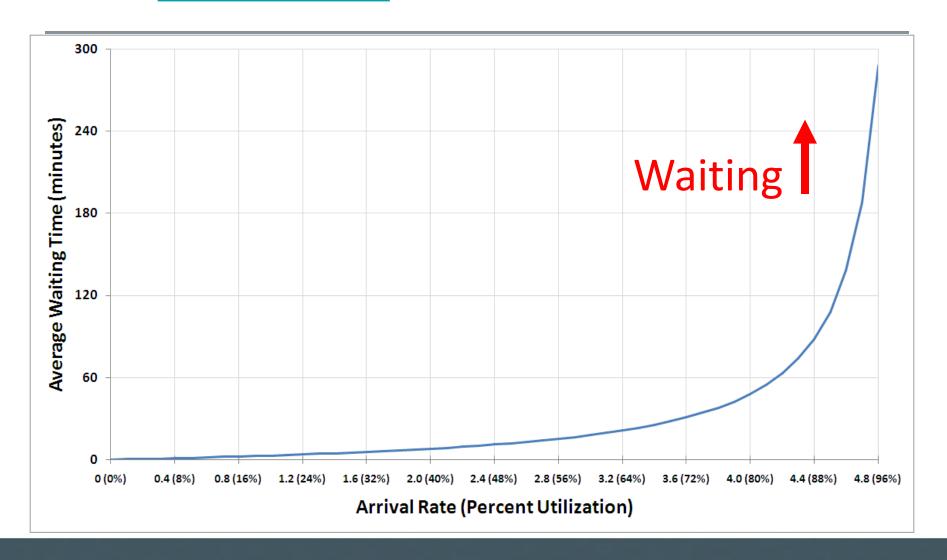
Demand on Key Servers - Service



As Server *Variation* Increases...



As <u>Utilization</u> Increases...



Theory of Constraints – FT Example



3pts/hr



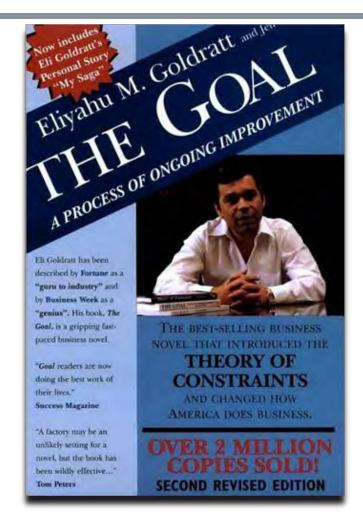
Nurse

30 min/pt

- 1) How many patients can my clinic see per hour?
- 2) How can you improve this system?
- 3) if you can't add resources....

TOC: The Theory of Constraints

- Bottleneck- A resource that has the capacity equal to or less than the demand placed upon it
- Non-bottleneck
 resource that has a capacity that is greater than the demand placed upon it



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Case Study: 75,000-visit Peds ED

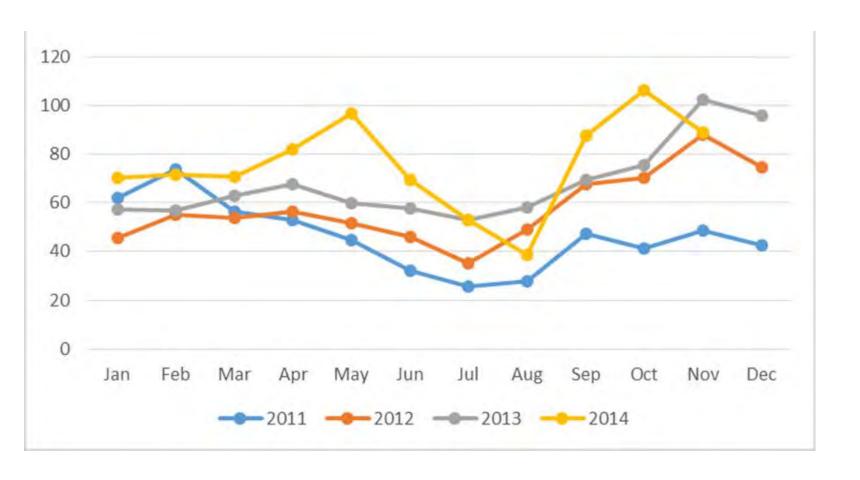


You're called into the CEO's Office!

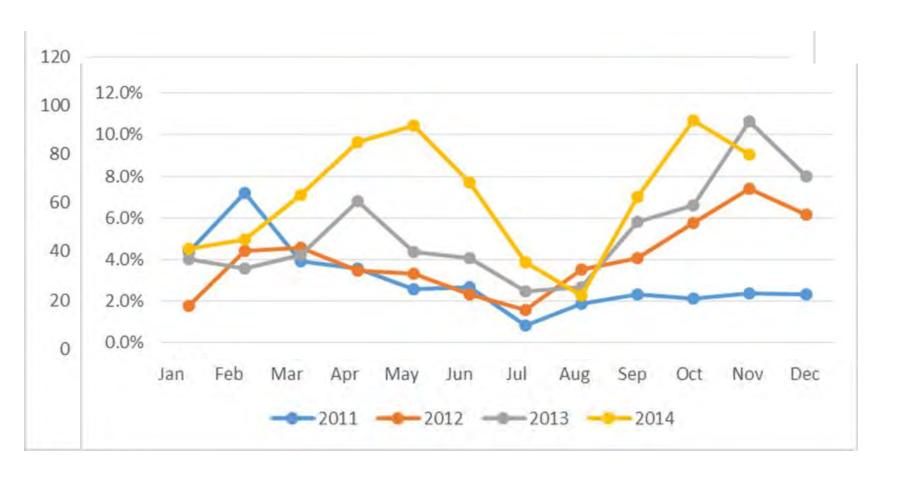
Our ED really stinks!



Peds ED Door to Doc by Month

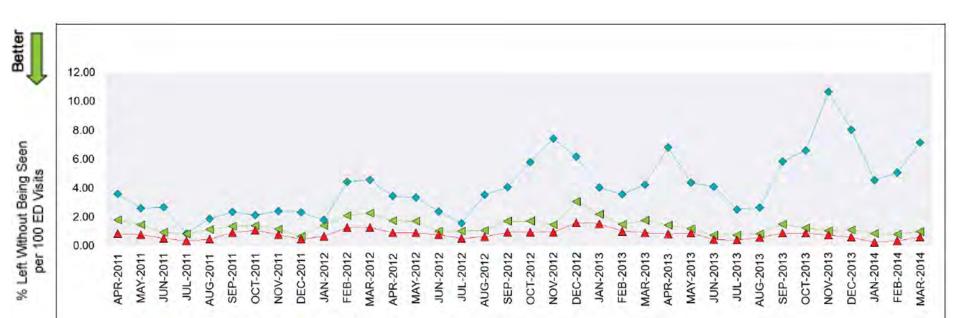


Peds ED LWOBS by Month



Peds ED LWOBS vs. Peers

My Hospital Value | Peer Median



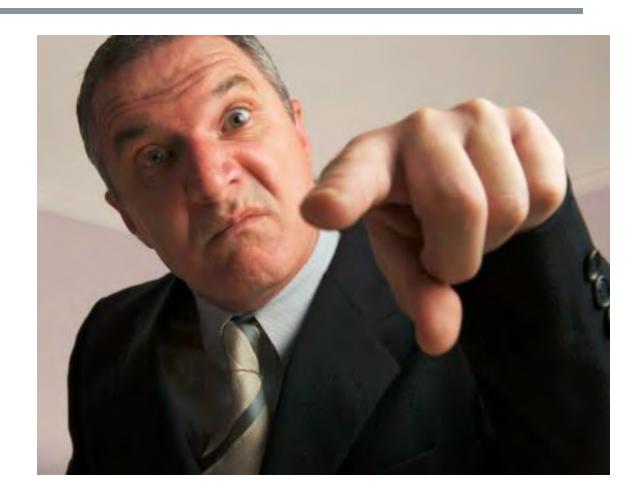
▲ Peer Top Quartile

- UCL

You're called into the CEO's Office!

Our ED really stinks!

YOU better fix this NOW!



What are you going to do?



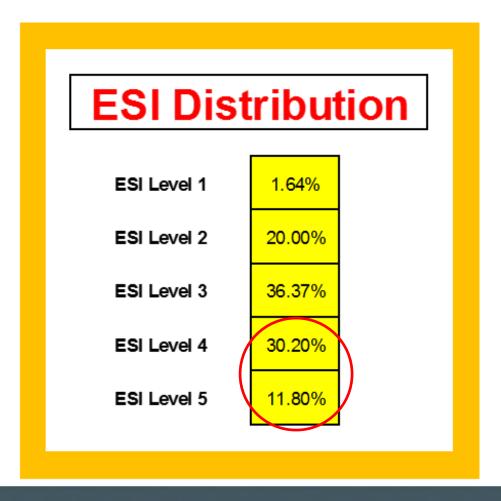
What Information Do You Need?



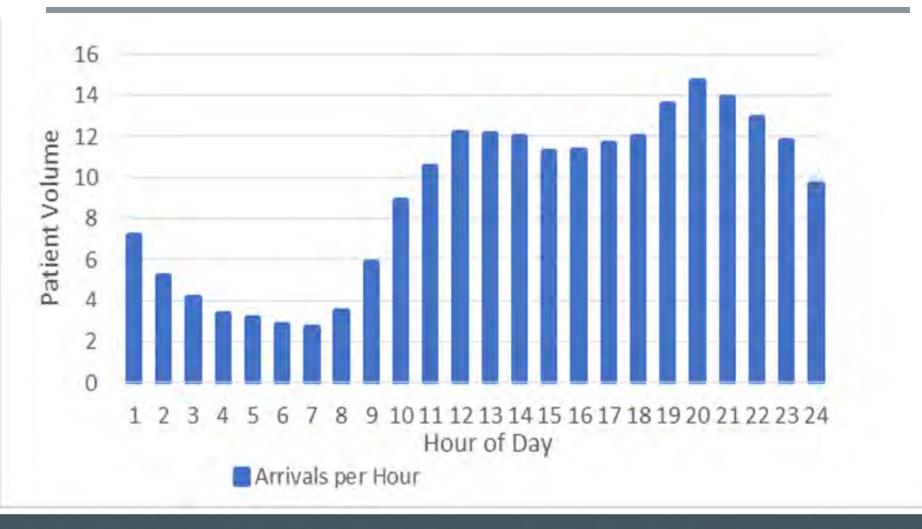
What data do you need from your analyst (1 word only)?



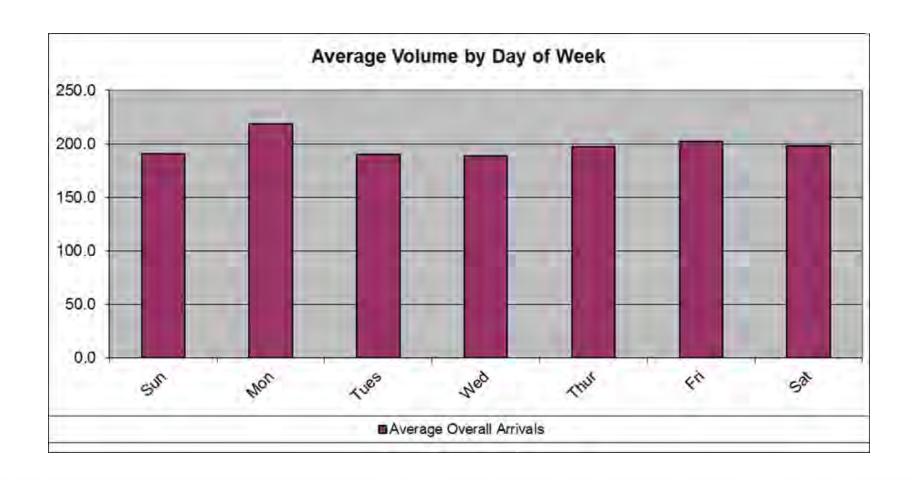
PEDs ED Acuity Mix by ESI Level



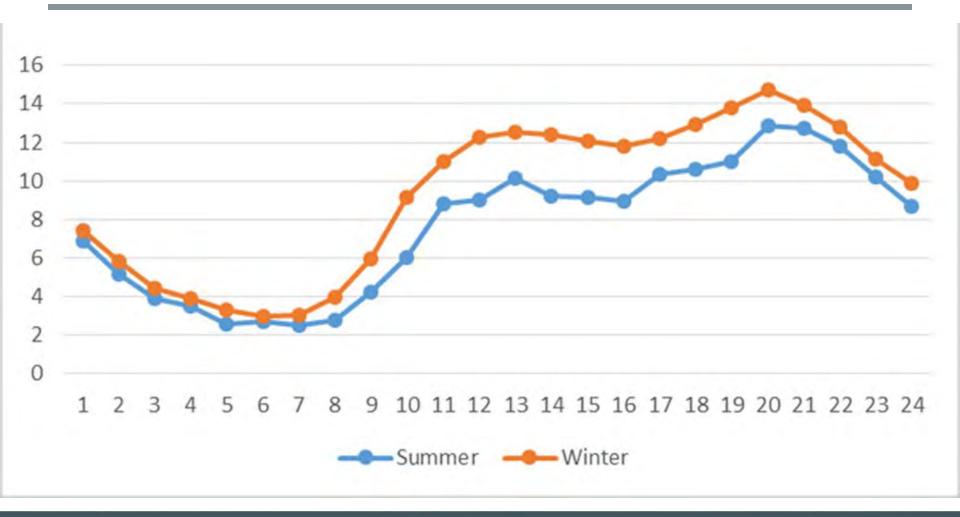
Peds ED Hourly Arrivals



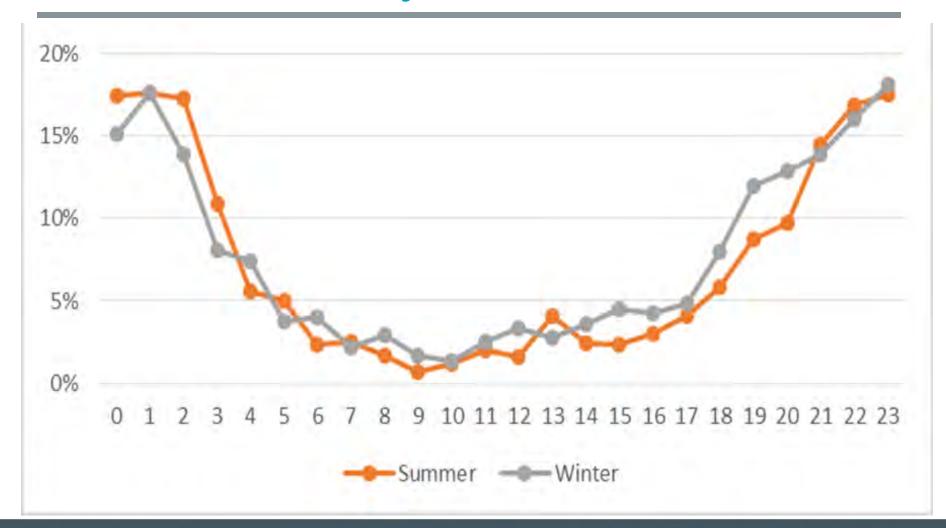
Peds ED Day of Week Arrivals



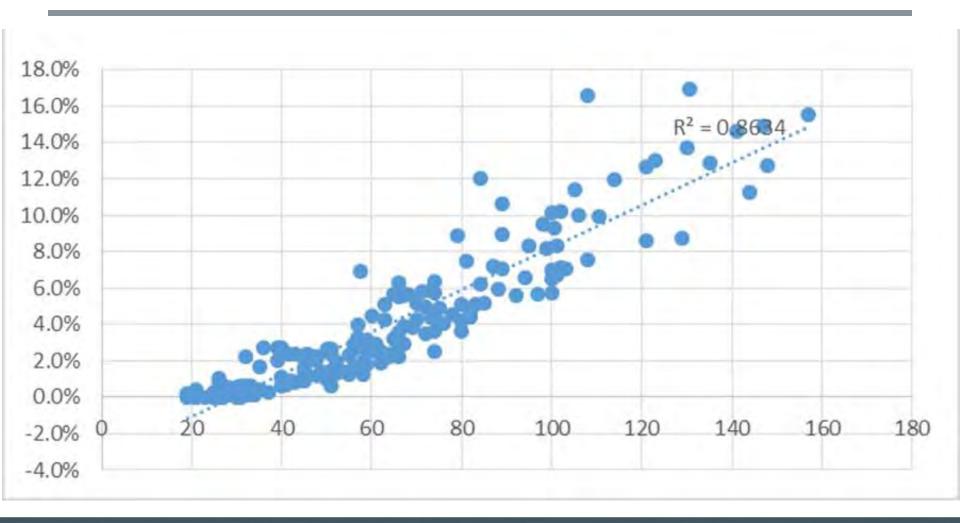
Peds ED Seasonal Hourly Arrivals



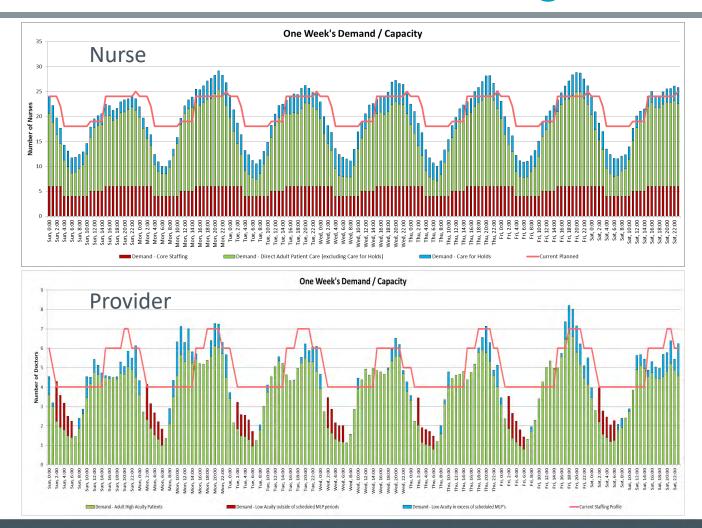
Peds ED Hourly LWOBS



Peds ED LWOBS vs Door to Doc



Nurse vs. Provider Staffing



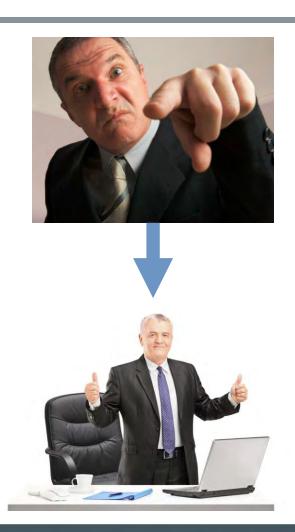
Breakout Session – 7 min

How do you turn this around?

Provide a 5-point, bulleted summary of the following:

- 1. Problems identified (top 3)
- 2. Proposed solutions (top 3)
- 3. Information needed (top 3)

Designate one person to present



What are the most significant problems in this emergency department?

тор test'

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Basic Approach to Staffing

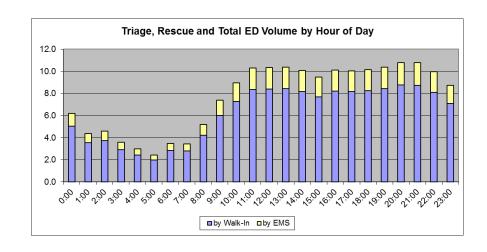
- Define the arrival <u>Demand</u>
- 2. Define and align the server <u>Capacity</u> (physician, nurse, APC, resident, bed productivity)
- 3. Execute in the *Context* of your current operational environment

Basic Approach to Staffing

- Define the arrival <u>Demand</u>
- 2. Define and align the server <u>Capacity</u> (physician, nurse, APC, resident, bed productivity)
- 3. Execute in the *Context* of your current operational environment

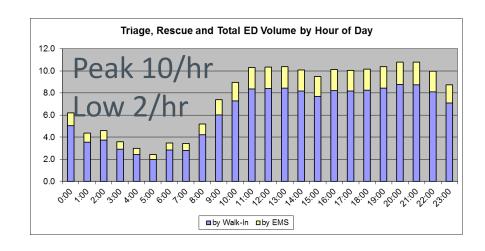
1. Define the Arrival Demand

- Arrival demand defines the demand for healthcare delivery
- Is the primary driver for physician, APC, and resident staffing



1. Demand – Hour of Day Variation

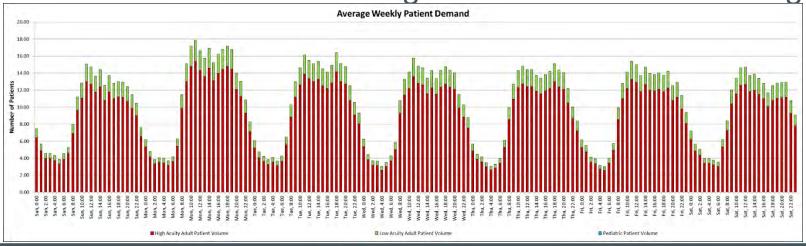
- Peak usually starts between 8a and 11am
- Usually ends between 9pm and 11pm
- Typically between 4:1 and 6:1 peak vs overnight arrivals
- Pediatrics and low acuity higher evenings



1. Demand – Hour of Week Variation

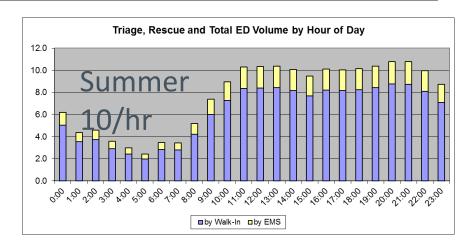
- Volume varies significantly by day of week in most institutions
- Weekend volume is usually lower than weekday volume
- Mondays are usually the <u>busiest</u> and also have the <u>highest</u> <u>acuity</u>

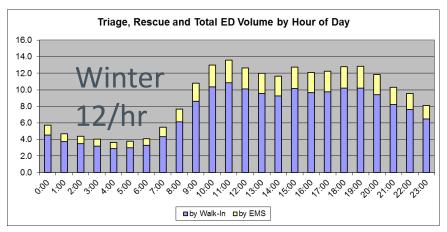
Pediatrics will have much higher weekends and evenings



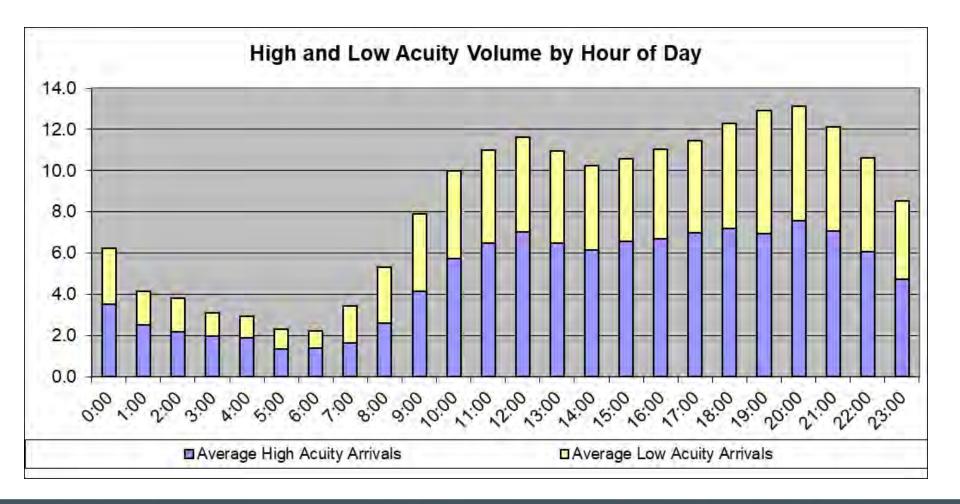
1. Demand - Seasonal Variation

- Seasonal Variation can be problematic if not considered
- Ultimately affects the size of your ED and the operational approach
- Peds follows this profile
- Need specific strategies to staff appropriately – part time staffing, preferential vacations, snowbird scheduling

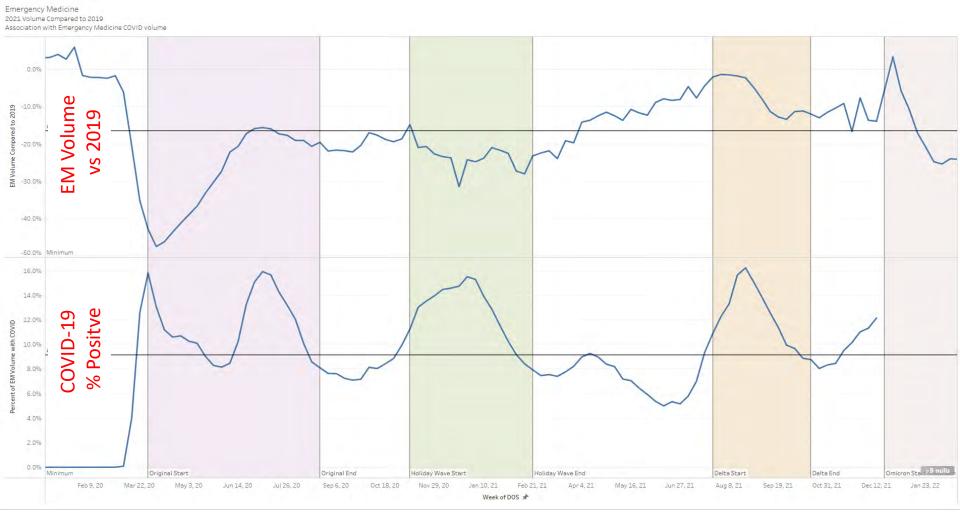




1. Demand - Acuity



1. Demand – Special Demand COVID-19



The 2020 holiday wave aligns most closely with the current volume experience; both in timing around the holiday season and the depth of the

Basic Approach to Staffing

- 1. Define the arrival *Demand*
- 2. Define and align the server <u>Capacity</u> (physician, nurse, APC, resident, bed productivity)
- 3. Execute in the <u>Context</u> of your current operational environment

2. Define Server Capacity

 Assess the volume over a week and divide by the total staffing hours

$$\frac{1400 \text{ pts/wk}}{700 \text{ doc hrs/wk}} = 2 \text{ pts/hr}$$



2. Capacity – Average Service Rate

- Assess the volume over a week and divide by the total staffing hours
- 2. Peak productivity will usually be higher as lower overnight volumes tend to drive the overall average down

$$\frac{1400 \text{ pts/wk}}{700 \text{ doc hrs/wk}} = 2 \text{ pts/hr}$$

$$\frac{1100 \text{ pts/wk}}{500 \text{ doc hrs/wk}} = 2.2 \text{ pts/hr}$$

Benchmarks are Scarce

Nursing

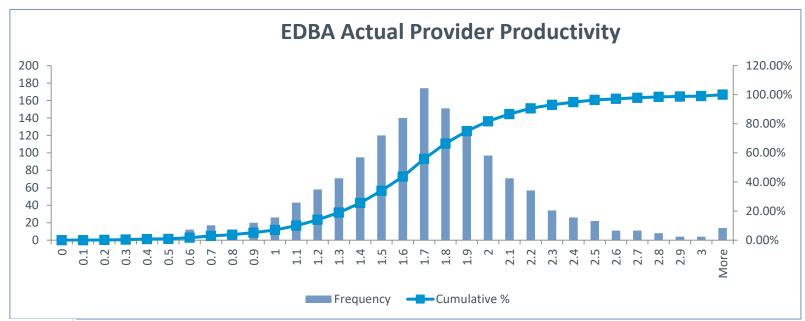
- No source for ideal productivity
- Most recommendations are from nurse advocate organizations
- Growing evidence that lower nurse staffing results in increased morbidity, mortality, and cost

Physician

- No source for ideal productivity
- ACEP, SAEM, AAEM all have position statements
- Other studies are largely inaccurate, outdated

Recommended Benchmarking Sources: ACEP; Premier; EDBA; VHA

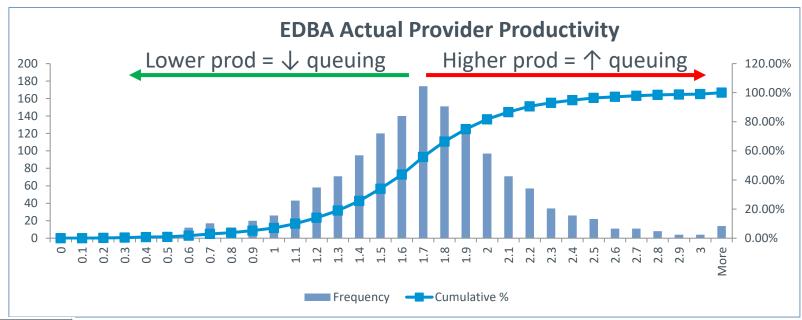
EDBA Actual PPH



EDBA Actual Provider PPH		
Mean	1.67	
Median	1.67	
Mode	1.34	
Standard Deviation	0.46	
Range	3.84	
Minimum	0.14	
Maximum	3.98	
Count	1377	

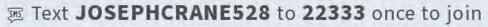
Based on 2018 data

EDBA Actual PPH

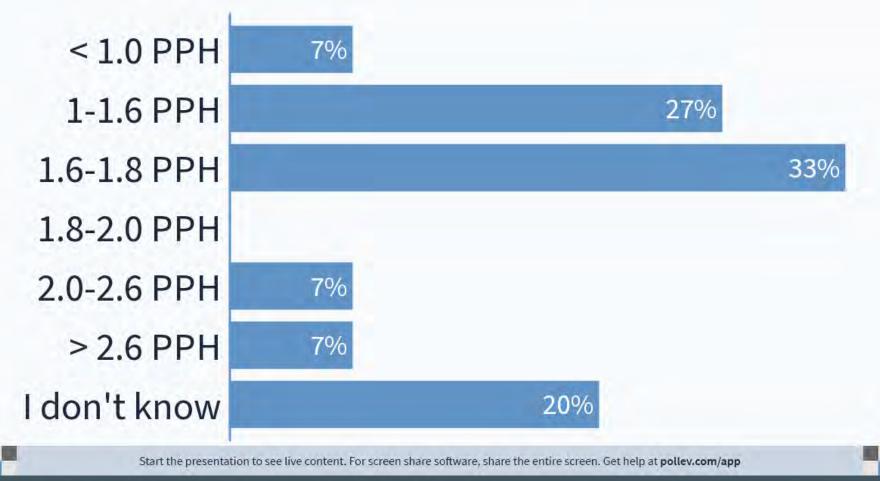


EDBA Actual Provider PPH		
Mean	1.67	
Median	1.67	
Mode	1.34	
Standard Deviation	0.46	
Range	3.84	
Minimum	0.14	
Maximum	3.98	
Count	1377	

Must take system flow into account!



What is Your Current Provider Productivity?

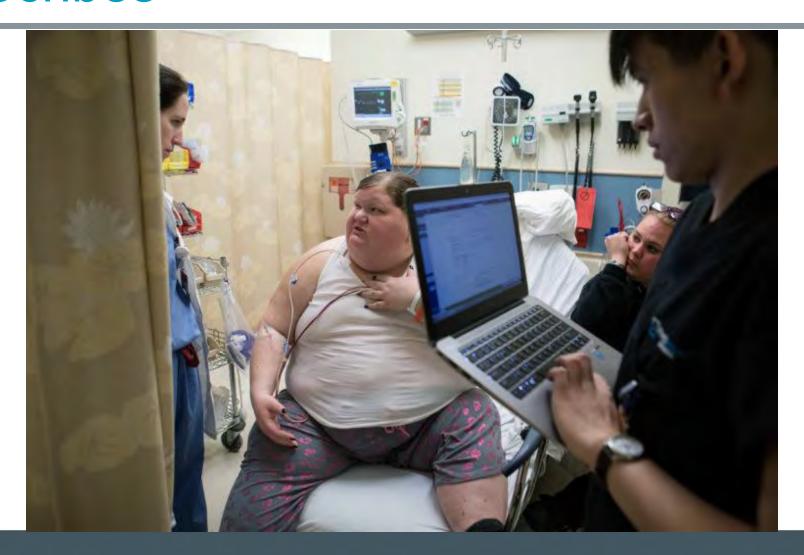


4,000 Clicks

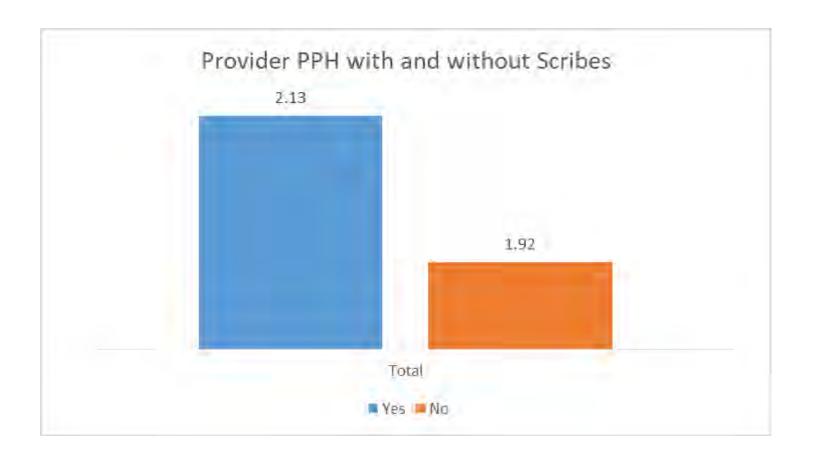


- 43% of time on data entry
- 28% on direct care
- 12% Results review
- 13% Communication
- 3% Other

Scribes



EDBA Impact of Scribes



Scribes vs Voice Dictation





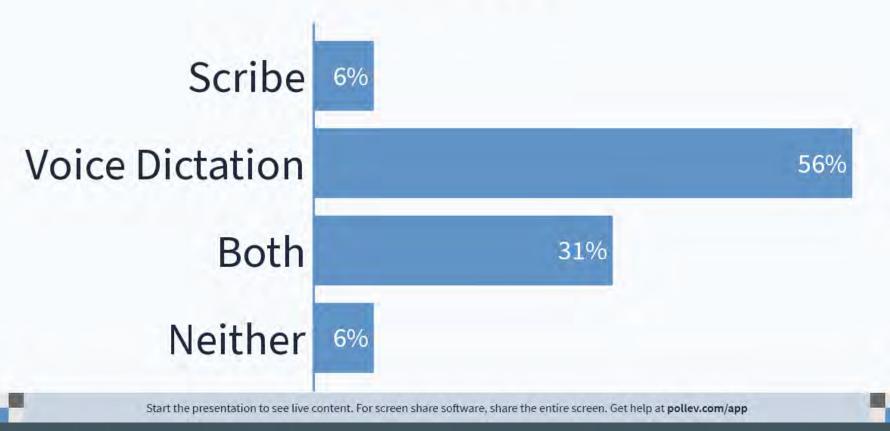


Care settings

Nuance Dragon Medical One



Does Your ED Currently Use Scribes or Voice Dictation?



Theory of Constraints – FT Example



3pts/hr



Nurse

30 min/pt

- 1) How many patients can my clinic see per hour?
- 2) How can you improve this system?
- 3) if you can't add resources....

2. Nurse Capacity



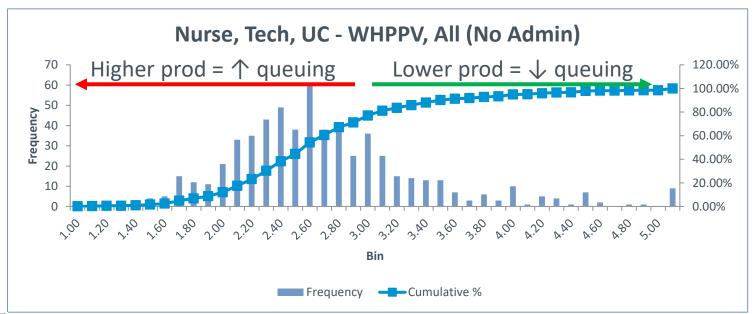
Worked Hours per Patient Visit (whppv)

- Nursing worked hours per patient visit:
- WHPPV is just the inverse of the calculation we use for provider pts/hr

$$\frac{1400 \text{ pts/wk}}{700 \text{ doc hrs/wk}} = \frac{2}{\text{pts/hr}} \left(\frac{88}{4}\right) \frac{1000 \text{ RN hrs/wk}}{600 \text{ pts/wk}} = \frac{1.67}{\text{whppv}}$$

 Total worked hours per patient visit is calculated similarly, but includes all other staff as well as nurse admin FTEs.

EDBA WHPPV – All Sites



WHPPV, All (No Admin)	
Mean	2.68
Median	2.56
Mode	2.80
Standard Deviation	0.80
Range	7.70
Minimum	0.67
Maximum	8.37
Count	610

*This data set does not include admin FTE



What is Your Current Nurse WHPPV?

< 2.0 9%

2.0 - 2.4

2.4-2.6

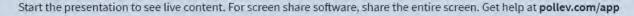
2.6-3.0

> 3.0

9%

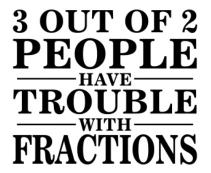
I don't know

82%



2. Capacity – Nurse Staffing Ratios

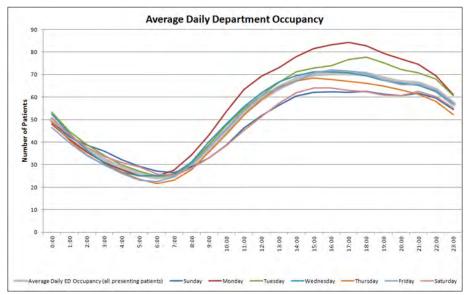
- 1. Many nurse staffing paradigms are driven off of bed ratios (4 beds per nurse)
- 2. Nurse staffing will depend on occupancy

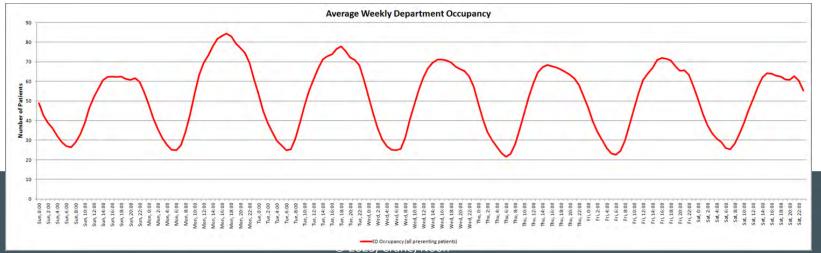




2. Capacity – Nurse Staffing Ratios

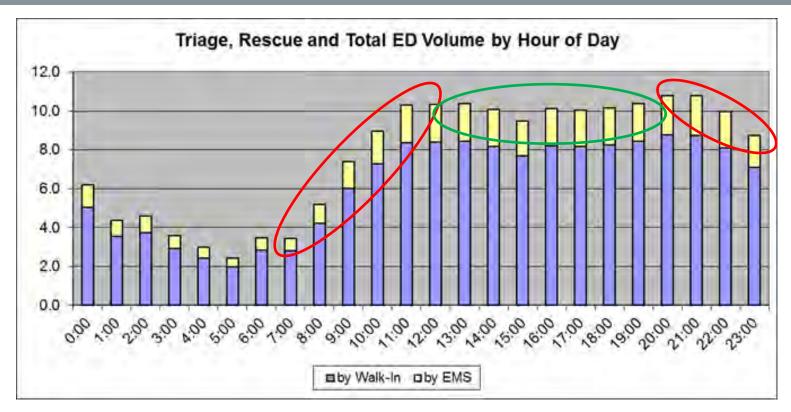
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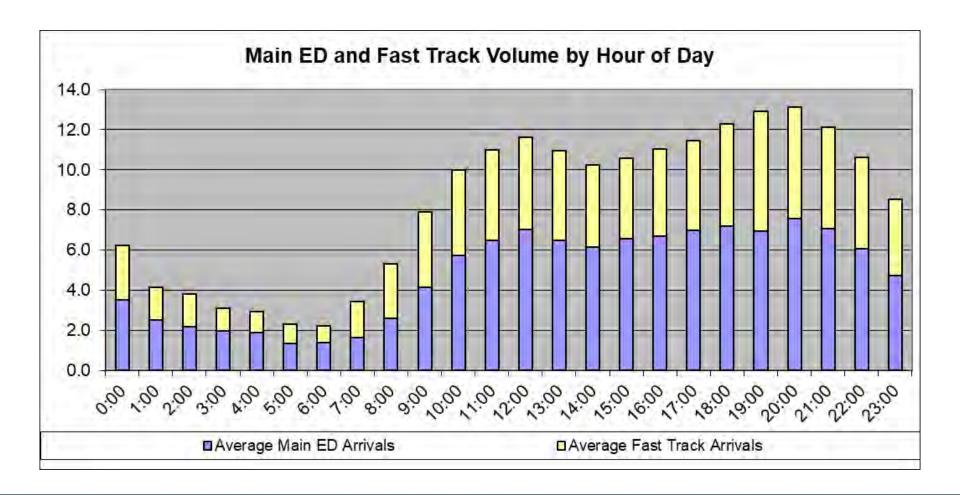


Dynamic Capacity Alignment

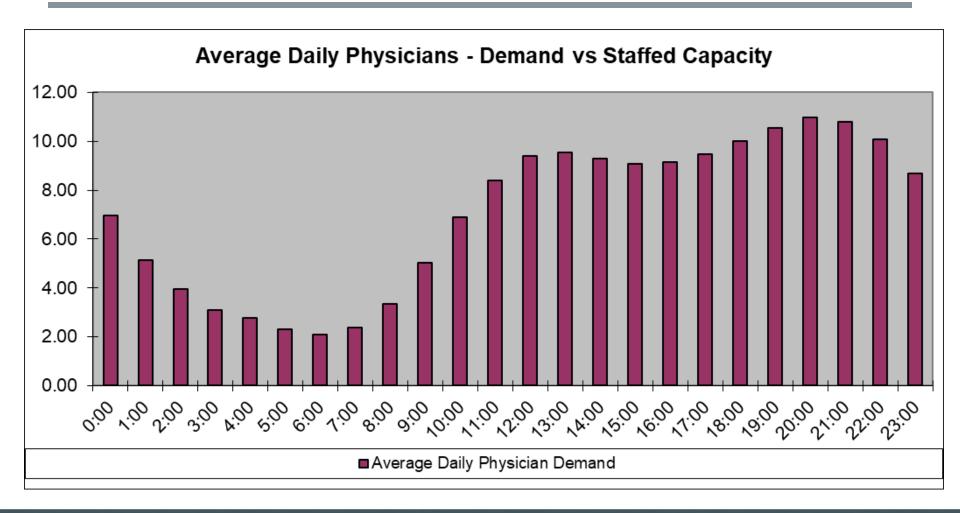


Steady state staffing is straightforward Ramp up and ramp down is more difficult

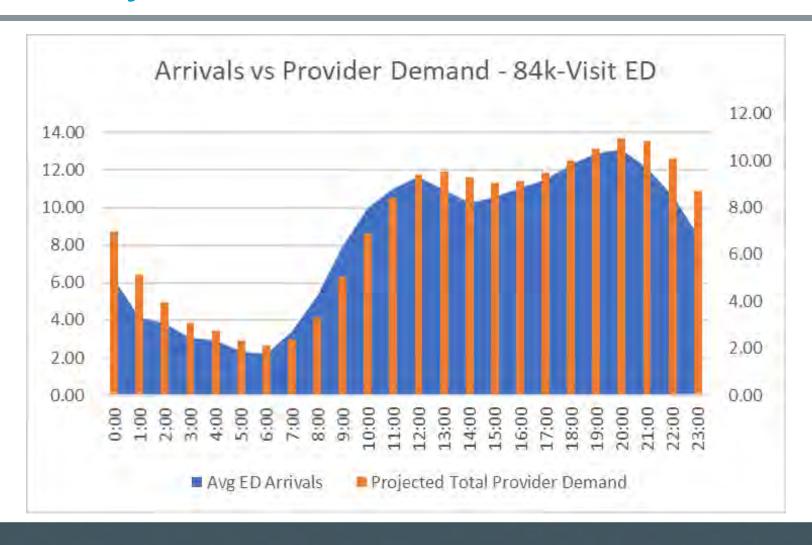
Arrivals – 72k Visits



Provider Demand – 72k Visits

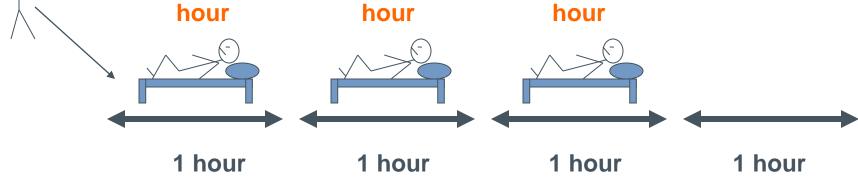


Overlay Arrivals and Provider Demand



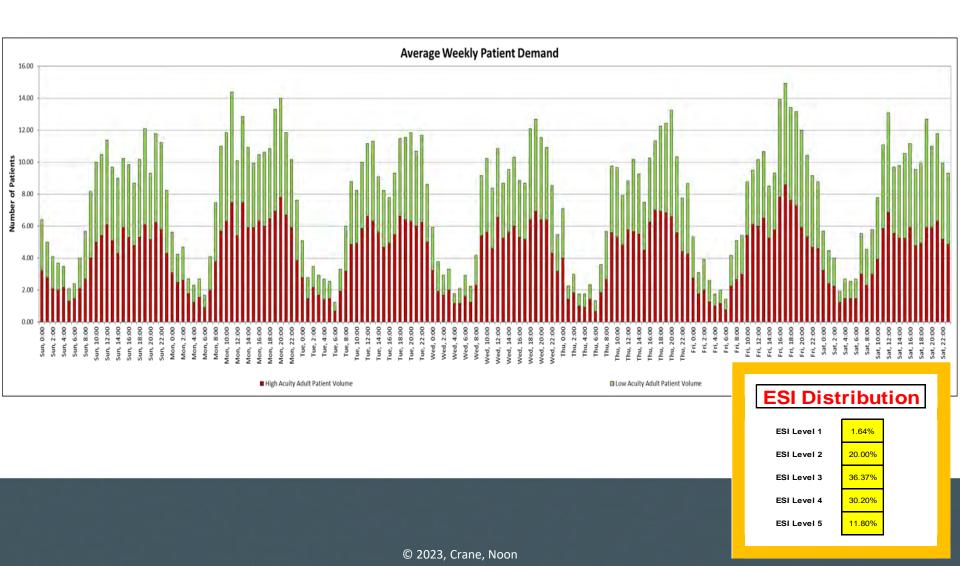
MD Demand – 2 pts/hr



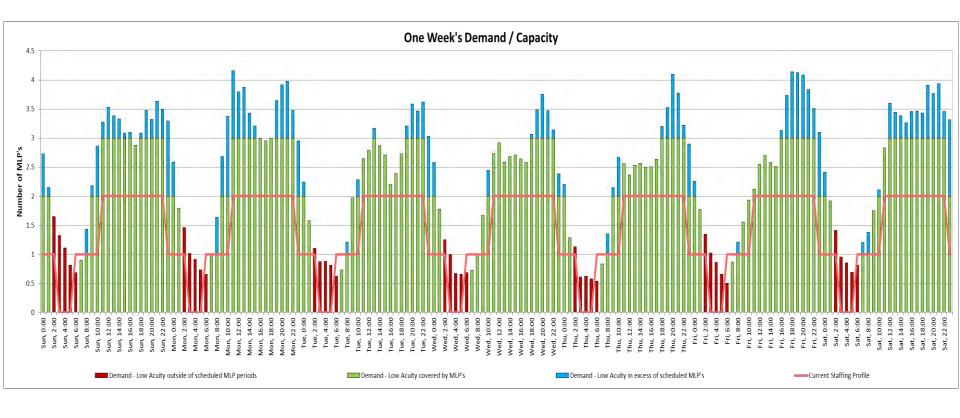


3-hour Length Of Stay

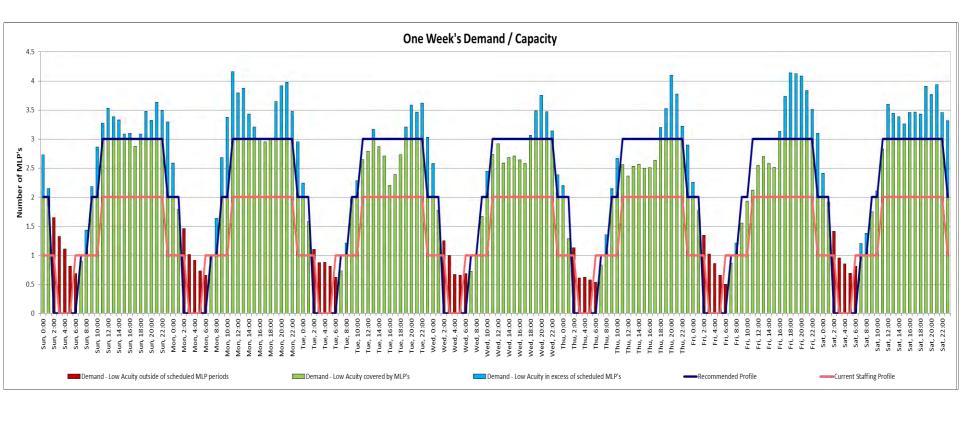
Optimizing the Alignment



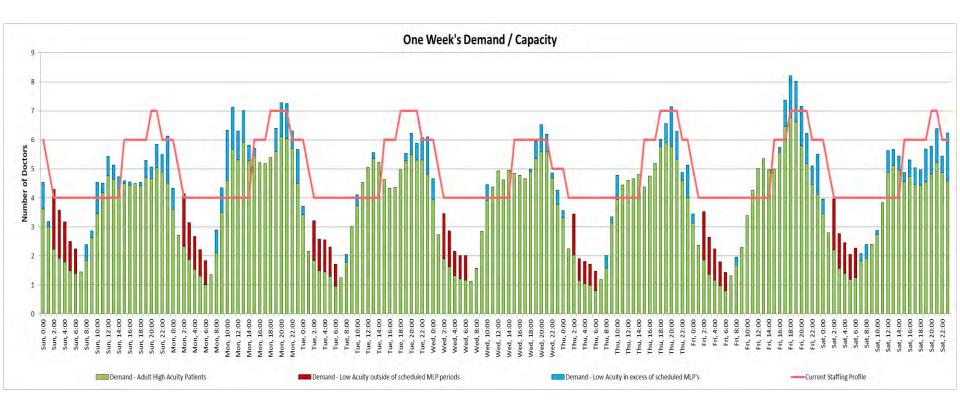
APC



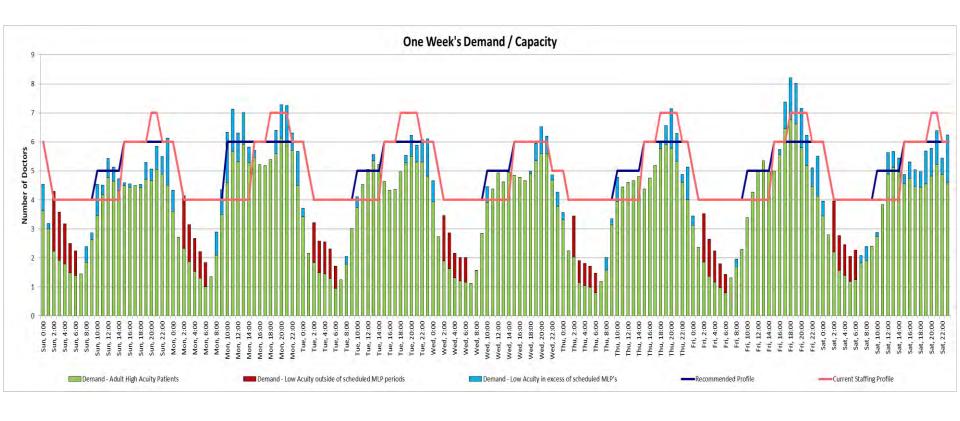
APC



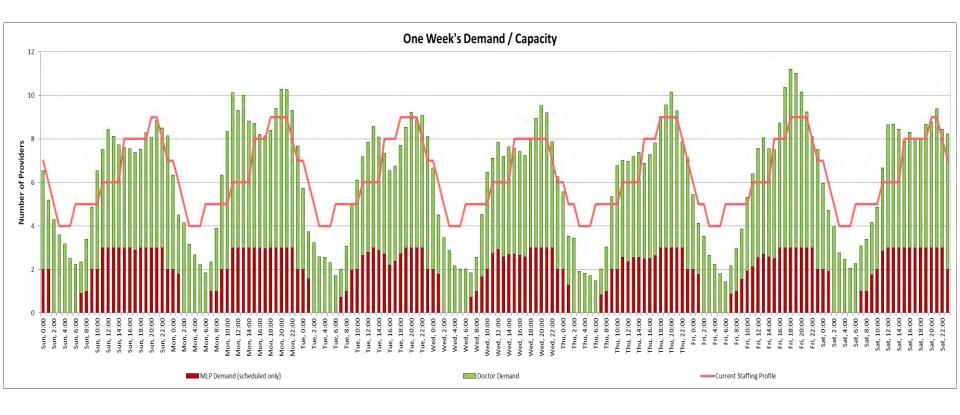
Physician



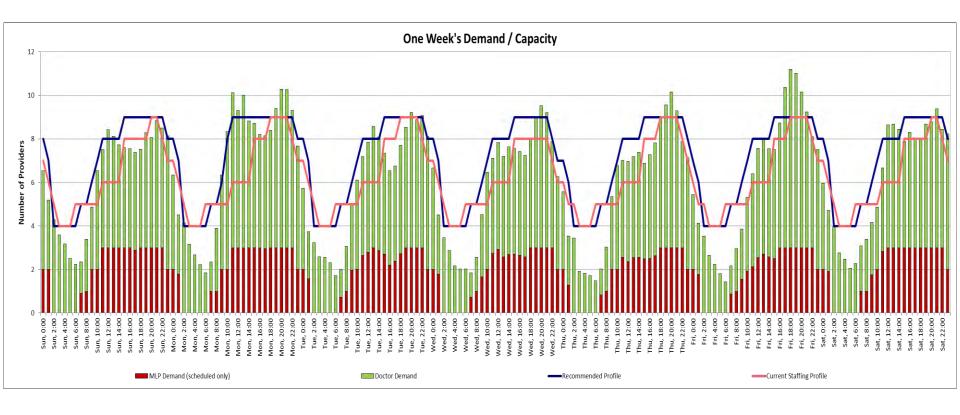
Physician



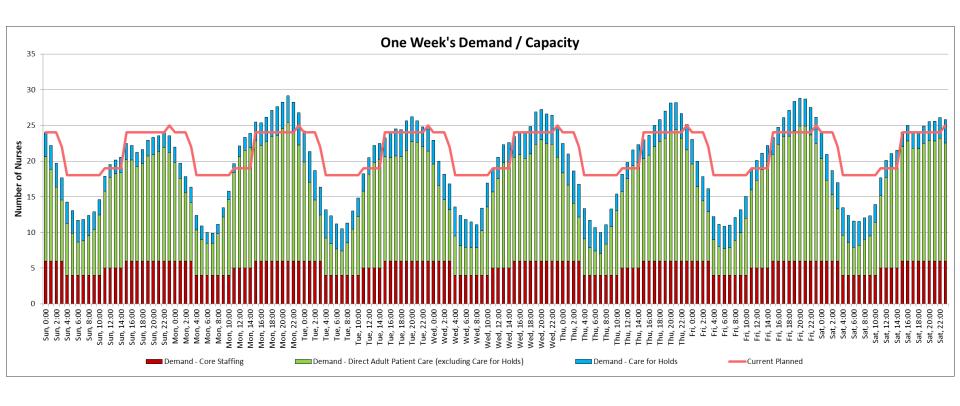
Provider



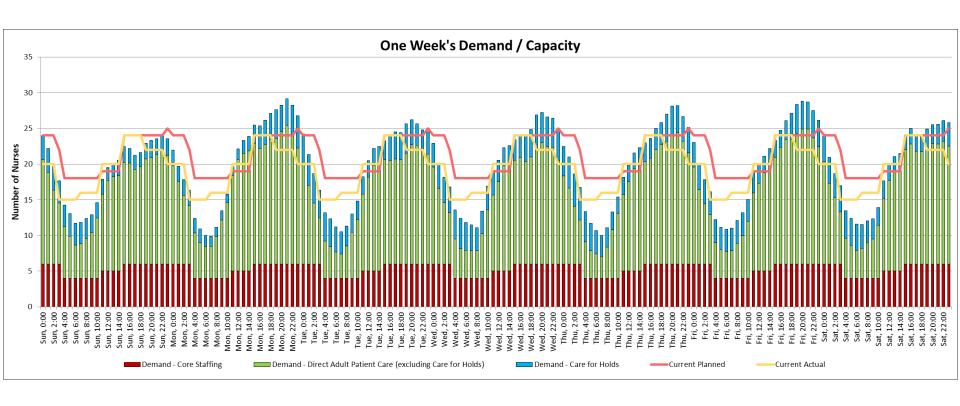
Provider



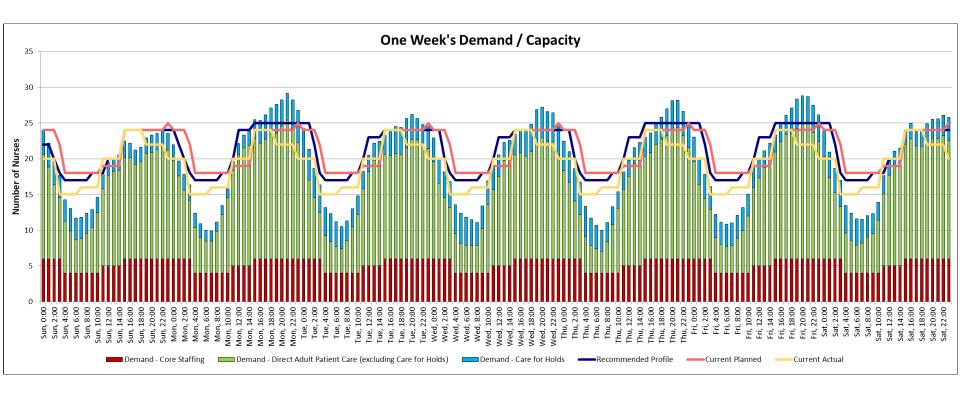
Current Nurse Staffing - Planned



Current Nurse Staffing - Actual



Future Nurse Staffing



Basic Approach to Staffing

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Clinical & Practice Management » Journals and Publications » ACEP News » August 2009

Clinical & Practice Management



To Learn More About Closing the Gap on Thrombotic Events click here HCP Access Code: REGISTER

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Staffing an ED Appropriately and Efficiently

Many EDs Vary 40% Between Their Slowest and Busiest Days, So Peak Load Crises Are Inevitable. But How Many Are Tolerable?

ACEP News August 2009

By Martha Collins

ACEP News Contributing Writer

Having the right mix of physicians, nurses, midlevel providers, and support staff in the emergency department can help ensure emergency department efficiency, patient satisfaction, cost-effective care, and medical-legal safety. But just how do you know that you are staffing your emergency department appropriately and efficiently?

"When it comes to ED staffing, there are strategic drivers and tactical drivers. The strategic drivers are quality of care, patient safety, and the level of service you want to deliver. The tactical drivers are patient volume, acuity, patient length of stay, admit holds, physician capabilities, and non-physician staffing," said Kirk B. Jensen, M.D., MBA, who is chief medical officer for BestPractices, Inc. Dr. Jensen also is a faculty member of the Institute for Healthcare Improvement (IHI) in Boston, and chair of IHI's collaborative on Improving Flow in the Acute Care Setting and Operational and Clinical Improvement in the ED

- Geography,Process,
- and People

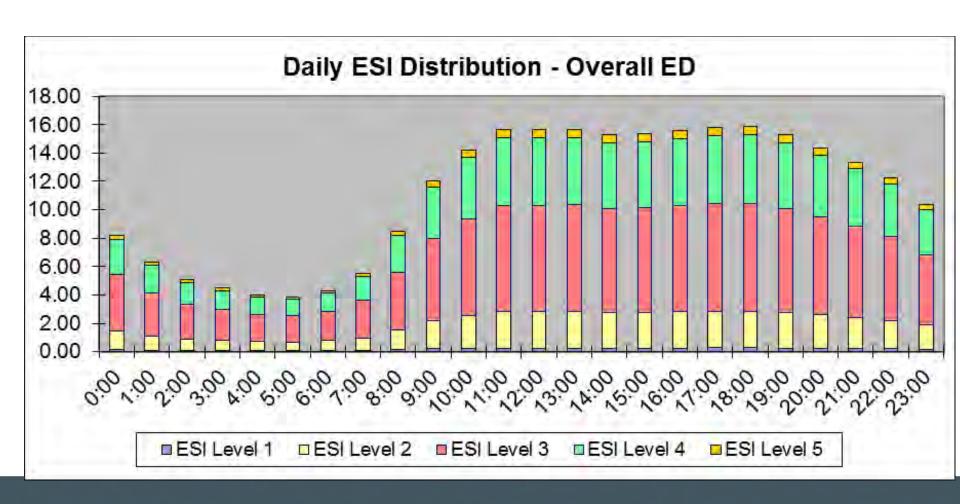
This ED is a lot harder to staff....



Than this ED....



Arrival Acuity by HOD



There are Really Only 3 Types of ED Patients...

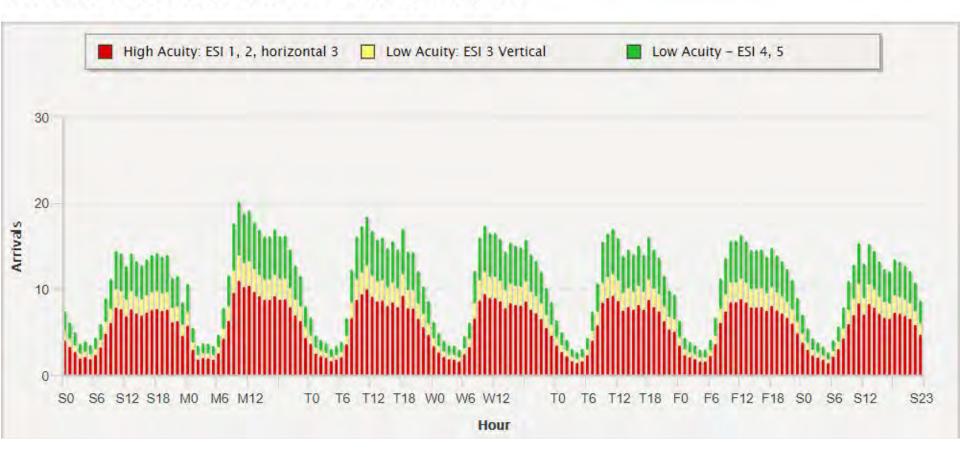






Optimizing Streams

Arrivals: Horizontal versus Vertical, 3 layers





Walk-in Arrivals

Assessment



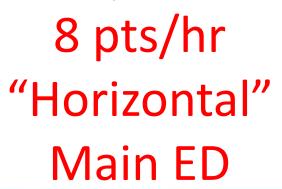
8 pts/hr
"Vertical"
Super Track

Easy

3 pts/hr
"Vertical"
Intake/RME

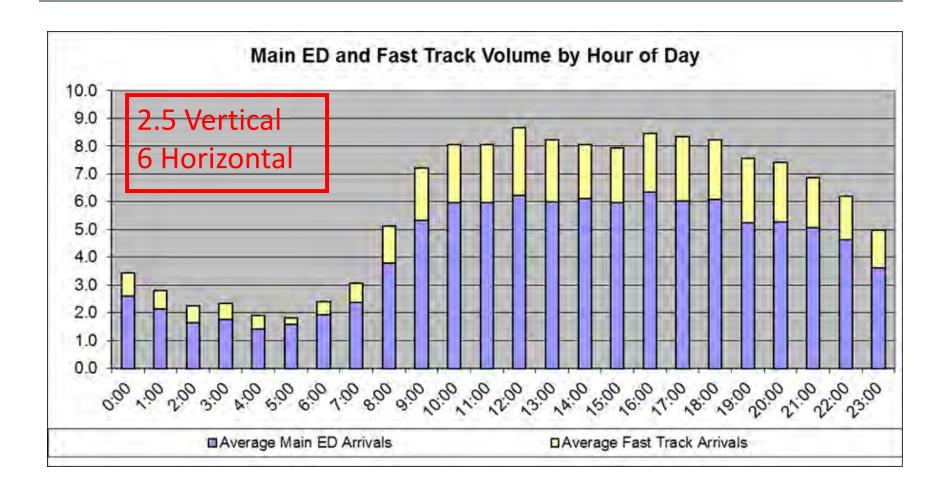


Ambulance Arrivals



Sick

Low Acuity Arrivals = ESI 4,5

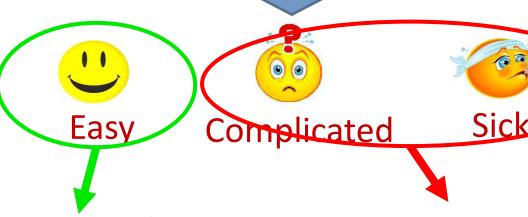




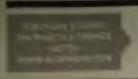
Walk-in Arrivals

Assessment

Ambulance Arrivals



2.5 pts/hr "Vertical" <u>Super Track</u> 6 pts/hr
"Horizontal"
Main ED



SPECIAL OPS



DR. WELCH is a praction of a operation physician with Little Enterguisty.

Physicians and a research relian at the Intermedian healthde for freath

Care Defrey Research. She has an ten in americal articles and three books

on ED quality satisfy and afficiency. She is a consultant with Quality Mallini

Concurring and her expenses is in ED operations.

The SuperTrack Is SUPER!

Patient segmentation can improve efficiency, patient care, and other key ED metrics

Other newer examples of patient segmentation include:

- Geriatric ED
- Chest pain center
- Pediatric ED
- Critical decision unit
- Observation unit
- SuperTrack

by SHARI WELCH, MD: FACEP

or emergency departments seeing medium to high voltimes of patients, the concept of patient segmentation is becoming popular as a flow strategy,13 Patient segmentation means grouping patients requiring similar levels of care and having similar anticipated lengths of stay (LOS) into a geographic area with deslicated staff and resources. The earliest example of putient angogentation in Fast Track, which now has a very compelling body of lineaums behind it. 19 Other newer examples of patient segmenration incitals.

- · Geriarric LD
- . Chest pain center
- · Pediatric ED
- Critical decision unit
- · Observation unit
- · SuperTrack

SuperTrack was pioneeted by Jody Crone, MD, in the Mary Wash ington Hospital Emergency Department in Frederickshung, Virginia, as part of a complete patient-flow makeover. The Mary Washington ED was seeing more than HO,000 visits when it opened its new doors in 2006 and was plagued with front-end waits and delays. As port of a complete aventual of its ED patient flow. Crame and his collectors.



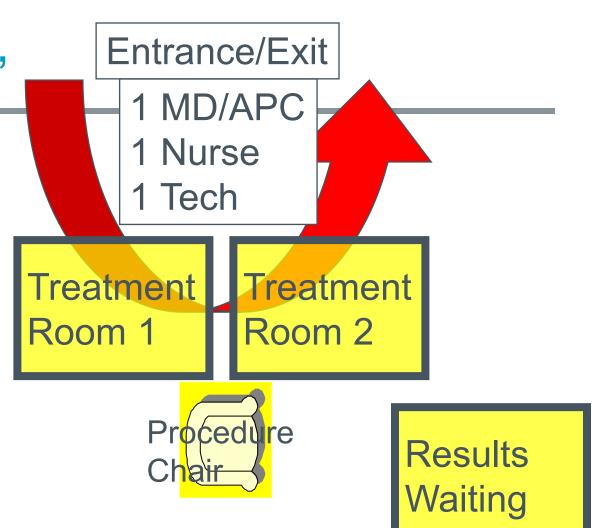
acuity patients (Emergency Severity Index Level 5). It dedicated six rooms as SuperTrack Irom 8 a.m. to 6 p.m. where identified patients would be \$2023, Crane, Noon am con

Once patients were found to meet the SisperTrack criteria, they were quickly placed in a moon, and a patient care tech (PCT) would expedite this process and alert the proplies, and staff dedicated in the case of very low ocuity patients. Parkland UCED improved all of its performance metrics, improved the overall flow of the department, and

"Super Track"

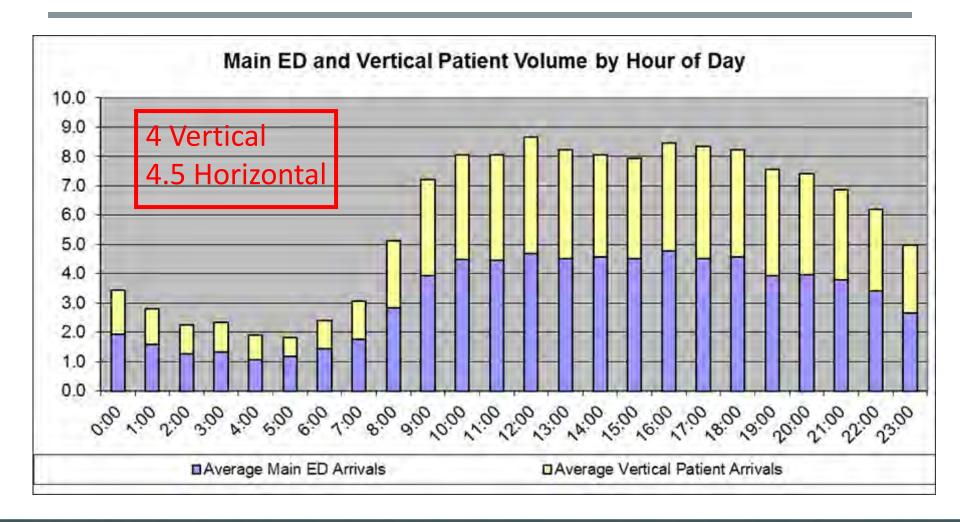
Fast Track located in or near triage for the purpose of promptly treating patients who require very low resource utilization

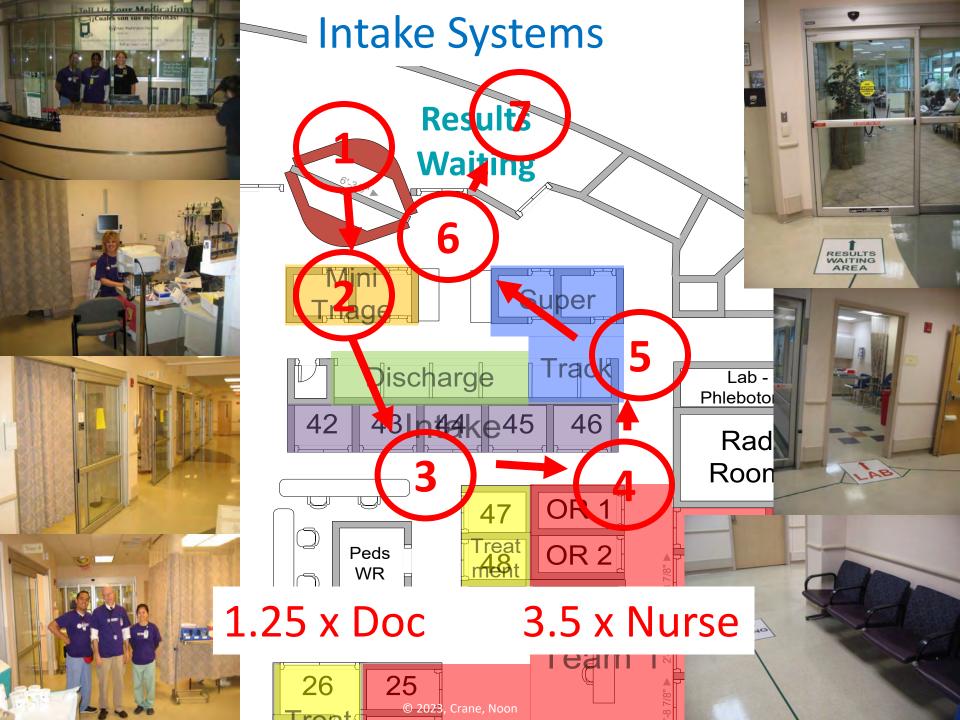
2 x Doc

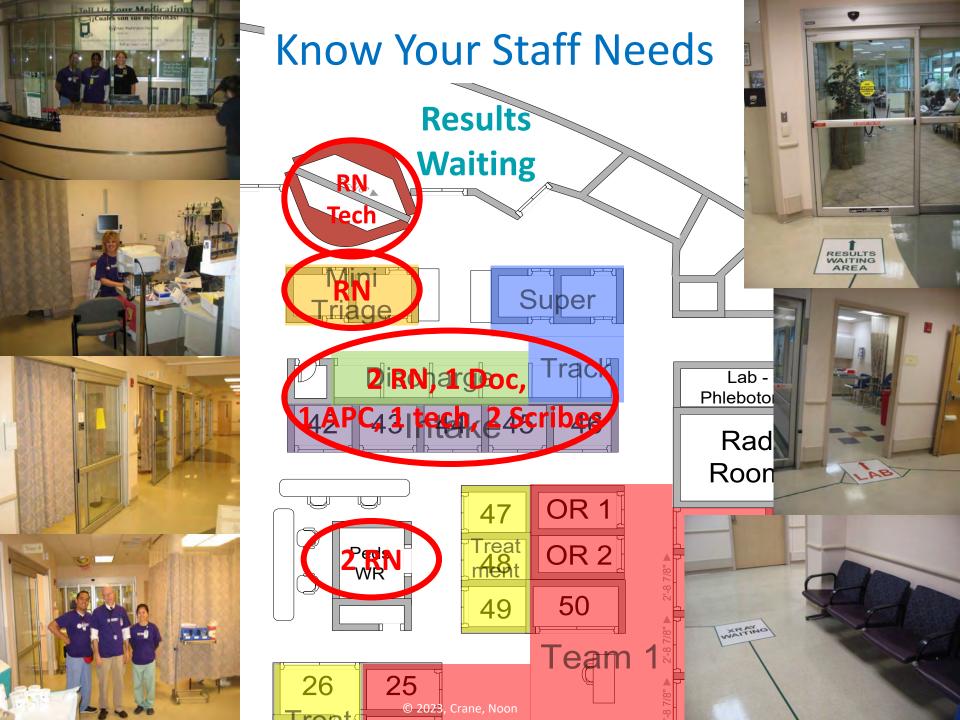


4.5 x Nurse

Intake Arrivals – ESI 4, 5, 33% ESI 3









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Staffing an ED Appropriately and Efficiently

Many EDs Vary 40% Between Their Slowest and Busiest Days, So Peak Load Crises Are Inevitable. But How Many Are Tolerable?

ACEP News August 2009

By Martha Collins ACEP News Contributing Writer

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Having the right mix of physicians, nurses, midlevel providers, and support staff in the emergency department can help ensure emergency department efficiency, patient satisfaction, cost-effective care, and medical-legal safety. But just how do you know that you are staffing your emergency department appropriately and efficiently?

"When it comes to ED staffing, there are strategic drivers and tactical drivers. The strategic drivers are quality of care, patient safety, and the level of service you want to deliver. The tactical drivers are patient volume, acuity, patient length of stay, admit holds, physician capabilities, and non-physician staffing," said Kirk B. Jensen, M.D., MBA, who is chief medical officer for BestPractices, Inc. Dr. Jensen also is a faculty member of the Institute for Healthcare Improvement (IHI) in Boston, and chair of IHI's collaborative on Improving Flow in the Acute Care Setting and Operational and Clinical Improvement in the ED

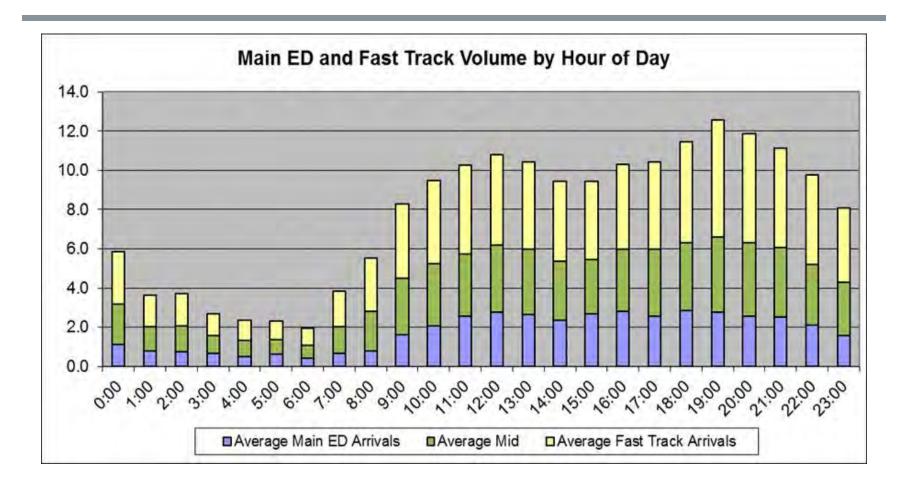
Symptoms:

- Elevated patient throughput times
- High left-without-being-seen rate
- Low patient satisfaction
- Clinician behavior in a stressful environment
- Low clinician satisfaction and retention
- The four key drivers of patient satisfaction:
 - Length of stay
 - Quality of the interactions with providers
 - Quality of the explanations
 - Pain management

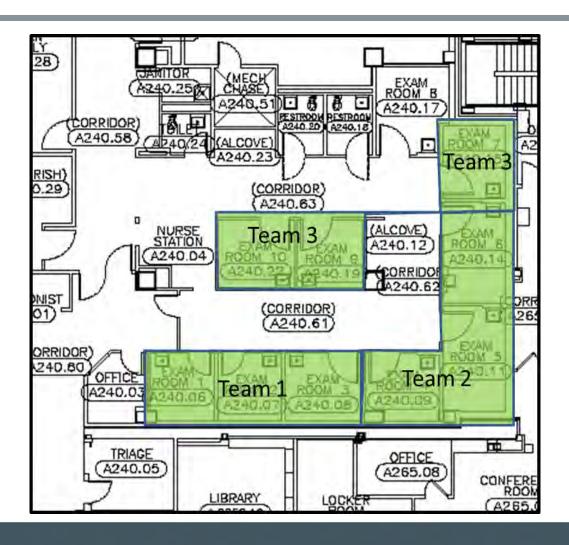
Outline

- Academic Principles
- Case Study 75,000-visit ED
- Approach to Staffing Optimization
 - Define Demand
 - Define Capacity
 - Contextualize
- Conclusions

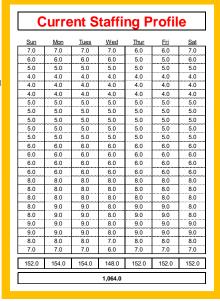
Case Study - Future Directions



Low Acuity Option 2



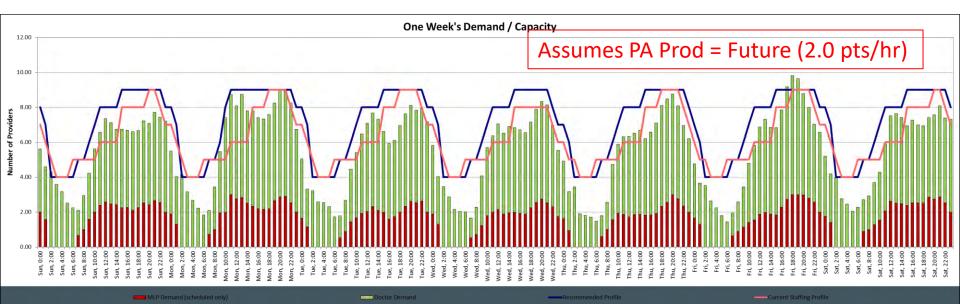
Overall Provider



Recommended Profile								
Sun	Mon	Tues	Wed	Thur	Fri	Sat		
8.0	8.0	8.0	8.0	7.0	7.0	8.0		
7.0	7.0	7.0	7.0	6.0	6.0	7.0		
4.0	4.0	4.0	4.0	4.0	4.0	4.0		
4.0	4.0	4.0	4.0	4.0	4.0	4.0		
4.0	4.0	4.0	4.0	4.0	4.0	4.0		
4.0	4.0	4.0	4.0	4.0	4.0	4.0		
4.0	4.0	4.0	4.0	4.0	4.0	4.0		
5.0	5.0	5.0	5.0	5.0	5.0	5.0		
5.0	5.0	5.0	5.0	5.0	5.0	5.0		
6.0	6.0	6.0	6.0	6.0	6.0	6.0		
7.0	8.0	7.0	7.0	7.0	7.0	7.0		
8.0	9.0	8.0	8.0	8.0	8.0	8.0		
8.0	9.0	8.0	8.0	8.0	8.0	8.0		
8.0	9.0	8.0	8.0	8.0	8.0	8.0		
8.0	9.0	8.0	8.0	8.0	8.0	8.0		
9.0	9.0	9.0	9.0	9.0	9.0	9.0		
9.0	9.0	9.0	9.0	9.0	9.0	9.0		
9.0	9.0	9.0	9.0	9.0	9.0	9.0		
9.0	9.0	9.0	9.0	9.0	9.0	9.0		
9.0	9.0	9.0	9.0	9.0	9.0	9.0		
9.0	9.0	9.0	9.0	9.0	9.0	9.0		
9.0	9.0	9.0	9.0	9.0	9.0	9.0		
9.0	9.0	9.0	8.0	9.0	9.0	9.0		
8.0	8.0	8.0	7.0	8.0	8.0	8.0		
170.0	175.0	170.0	168.0	168.0	168.0	170.0		
			1.189.0					

Pacammonded Profile

Change from Current						
Sun	Mon	Tues	Wed	Thur	<u>Fri</u>	Sat
1.0	1.0	1.0	1.0	1.0	1.0	1.0
1.0	1.0	1.0	1.0	1.0	1.0	1.0
-1.0	-1.0	-1.0	-1.0	-1.0	-1.0	-1.0
0.0	0.0	0.0	0.0	0.0	0.0	0.0
0.0	0.0	0.0	0.0	0.0	0.0	0.0
0.0	0.0	0.0	0.0	0.0	0.0	0.0
-1.0	-1.0	-1.0	-1.0	-1.0	-1.0	-1.0
0.0	0.0	0.0	0.0	0.0	0.0	0.0
0.0	0.0	0.0	0.0	0.0	0.0	0.0
1.0	1.0	1.0	1.0	1.0	1.0	1.0
2.0	3.0	2.0	2.0	2.0	2.0	2.0
2.0	3.0	2.0	2.0	2.0	2.0	2.0
2.0	3.0	2.0	2.0	2.0	2.0	2.0
2.0	3.0	2.0	2.0	2.0	2.0	2.0
2.0	3.0	2.0	2.0	2.0	2.0	2.0
1.0	1.0	1.0	1.0	1.0	1.0	1.0
1.0	1.0	1.0	1.0	1.0	1.0	1.0
1.0	1.0	1.0	1.0	1.0	1.0	1.0
1.0	0.0	0.0	1.0	0.0	0.0	1.0
1.0	0.0	0.0	1.0	0.0	0.0	1.0
0.0	0.0	0.0	1.0	0.0	0.0	0.0
0.0	0.0	0.0	1.0	0.0	0.0	0.0
1.0	1.0	1.0	1.0	1.0	1.0	1.0
1.0	1.0	1.0	1.0	1.0	1.0	1.0
18.0	21.0	16.0	20.0	16.0	16.0	18.0
125.0						

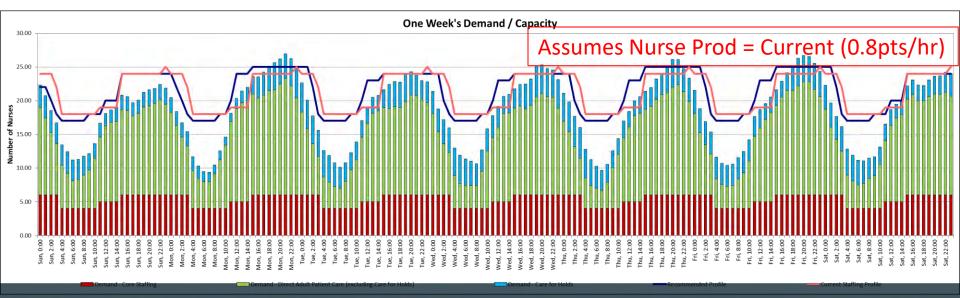


Overall Nursing

Current Staffing Profile						
Sun	Mon	Tues	Wed	Thur	<u>Fri</u>	Sat
24.0	24.0	24.0	24.0	24.0	24.0	24.0
24.0	24.0	24.0	24.0	24.0	24.0	24.0
24.0	24.0	24.0	24.0	24.0	24.0	24.0
22.0	22.0	22.0	22.0	22.0	22.0	22.0
18.0	18.0	18.0	18.0	18.0	18.0	18.0
18.0	18.0	18.0	18.0	18.0	18.0	18.0
18.0	18.0	18.0	18.0	18.0	18.0	18.0
18.0	18.0	18.0	18.0	18.0	18.0	18.0
18.0	18.0	18.0	18.0	18.0	18.0	18.0
18.0	18.0	18.0	18.0	18.0	18.0	18.0
18.0	18.0	18.0	18.0	18.0	18.0	18.0
19.0	19.0	19.0	19.0	19.0	19.0	19.0
19.0	19.0	19.0	19.0	19.0	19.0	19.0
19.0	19.0	19.0	19.0	19.0	19.0	19.0
19.0	19.0	19.0	19.0	19.0	19.0	19.0
24.0	24.0	24.0	24.0	24.0	24.0	24.0
24.0	24.0	24.0	24.0	24.0	24.0	24.0
24.0	24.0	24.0	24.0	24.0	24.0	24.0
24.0	24.0	24.0	24.0	24.0	24.0	24.0
24.0	24.0	24.0	24.0	24.0	24.0	24.0
24.0	24.0	24.0	24.0	24.0	24.0	24.0
24.0	24.0	24.0	24.0	24.0	24.0	24.0
24.0	24.0	24.0	24.0	24.0	24.0	24.0
25.0	25.0	25.0	25.0	25.0	25.0	25.0
513.0	513.0	513.0	513.0	513.0	513.0	513.0
3,591.0						

Recommended Profile						
Sun	Mon	Tues	Wed	Thur	Fri	Sat
22.0	24.0	25.0	24.0	24.0	25.0	25.0
22.0	22.0	25.0	24.0	24.0	25.0	25.0
20.0	20.0	22.0	20.0	20.0	22.0	22.0
18.0	18.0	18.0	18.0	18.0	18.0	18.0
17.0	17.0	17.0	17.0	17.0	17.0	17.0
17.0	17.0	17.0	17.0	17.0	17.0	17.0
17.0	17.0	17.0	17.0	17.0	17.0	17.0
17.0	17.0	17.0	17.0	17.0	17.0	17.0
17.0	17.0	17.0	17.0	17.0	17.0	17.0
18.0	18.0	18.0	18.0	18.0	18.0	18.0
18.0	18.0	18.0	18.0	18.0	18.0	18.0
18.0	20.0	20.0	20.0	20.0	20.0	18.0
20.0	24.0	23.0	23.0	23.0	23.0	20.0
20.0	24.0	23.0	23.0	23.0	23.0	20.0
20.0	24.0	23.0	23.0	23.0	23.0	20.0
24.0	25.0	24.0	24.0	25.0	25.0	24.0
24.0	25.0	24.0	24.0	25.0	25.0	24.0
24.0	25.0	24.0	24.0	25.0	25.0	24.0
24.0	25.0	24.0	24.0	25.0	25.0	24.0
24.0	25.0	24.0	24.0	25.0	25.0	24.0
24.0	25.0	24.0	24.0	25.0	25.0	24.0
24.0	25.0	24.0	24.0	25.0	25.0	24.0
24.0	25.0	24.0	24.0	25.0	25.0	24.0
24.0	25.0	24.0	24.0	25.0	25.0	24.0
497.0	522.0	516.0	512.0	521.0	525.0	505.0
3,598.0						

Change from Current						
Sun	Mon	Tues	Wed	Thur	Fri	Sat
-2.0	0.0	1.0	0.0	0.0	1.0	1.0
-2.0	-2.0	1.0	0.0	0.0	1.0	1.0
-4.0	-4.0	-2.0	-4.0	-4.0	-2.0	-2.0
-4.0	-4.0	-4.0	-4.0	-4.0	-4.0	-4.0
-1.0	-1.0	-1.0	-1.0	-1.0	-1.0	-1.0
-1.0	-1.0	-1.0	-1.0	-1.0	-1.0	-1.0
-1.0	-1.0	-1.0	-1.0	-1.0	-1.0	-1.0
-1.0	-1.0	-1.0	-1.0	-1.0	-1.0	-1.0
-1.0	-1.0	-1.0	-1.0	-1.0	-1.0	-1.0
0.0	0.0	0.0	0.0	0.0	0.0	0.0
0.0	0.0	0.0	0.0	0.0	0.0	0.0
-1.0	1.0	1.0	1.0	1.0	1.0	-1.0
1.0	5.0	4.0	4.0	4.0	4.0	1.0
1.0	5.0	4.0	4.0	4.0	4.0	1.0
1.0	5.0	4.0	4.0	4.0	4.0	1.0
0.0	1.0	0.0	0.0	1.0	1.0	0.0
0.0	1.0	0.0	0.0	1.0	1.0	0.0
0.0	1.0	0.0	0.0	1.0	1.0	0.0
0.0	1.0	0.0	0.0	1.0	1.0	0.0
0.0	1.0	0.0	0.0	1.0	1.0	0.0
0.0	1.0	0.0	0.0	1.0	1.0	0.0
0.0	1.0	0.0	0.0	1.0	1.0	0.0
0.0	1.0	0.0	0.0	1.0	1.0	0.0
-1.0	0.0	-1.0	-1.0	0.0	0.0	-1.0
-16.0	9.0	3.0	-1.0	8.0	12.0	-8.0
7.0						



What Are You Sinking About?





Conclusions

- Optimizing staffing in the emergency department requires understanding core flow concepts like queuing theory and the theory of constraints
- An accurate assessment of demand, capacity, and variation is necessary to be successful
- A consistent approach to staffing is necessary to achieve consistent results
- Physician staffing cannot be looked at in isolation and must be contextualized relative to nurse staffing, bed constraints, physical space, skill mix and acuity mix