

## Optimized Hospital Radiologist Staffing in a Multisite Radiology Enterprise: A Data Driven Rational Approach to Efficiently Delivering Real Time Subspecialized Radiology

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## 24x7 Subspecialized Radiology Balancing Quality with Efficiency

### Quality:

24x7 Final Reports  
Subspecialized  
Radiology



### Efficiency:

Optimal  
Radiologist Staff

## Matching Radiology Staff to Workload 24x7

- ▶ Staff Too Small For Workload → Quality Suffers
  - ▶ Turn Around Time Increases
  - ▶ Cannot Provide Subspecialized Interpretation
- ▶ Staff Too Large for Workload → Resources are Wasted
  - ▶ Does anyone really have this problem?

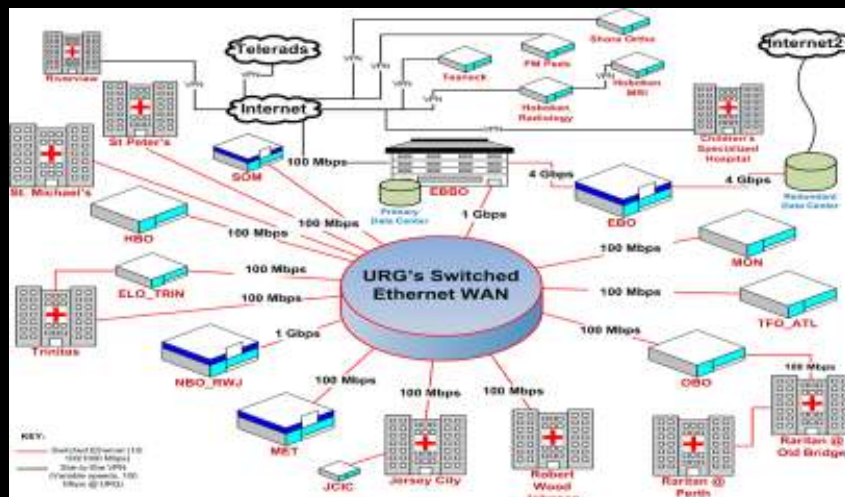
## Three Study Goals:

- ▶ #1: Assess the Workload 24 x 7:
  - ▶ How Many Studies are Being Performed?
  - ▶ When are they Being Performed?
  - ▶ What is the distribution of Studies by Modality?
- ▶ #2: Assess Typical Radiologist Capacity
  - ▶ Studies/Shift by Specialty
- ▶ #3: Devise Strategies to Optimize the Enterprise:
  - ▶ Match Radiologist Staff to Workload

## Data Collection: The Enterprise

- ▶ 24x7 Hospital Inpatient Setting
- ▶ 5 Hospitals
  - ▶ 1 Academic, Level 1 Trauma Center
  - ▶ 4 Community hospitals
- ▶ Sub-Specialized Radiology:
  - ▶ General Diagnostic; Body; IR; MSK; Neuro; Neuro-IR; Nuclear; Pediatrics; Women's Imaging

Studies from multiple hospitals are transmitted to a data center.  
The radiologist can read all sites off a single worklist



## HL7 Order Data

- ▶ 285,981 Consecutive Studies Across the 5 Hospitals
- ▶ 180 Consecutive Days -7/1/11- 12/31/11
  
- ▶ Orders were Analyzed by
  - ▶ Stat Status
  - ▶ Study Completion Time
  - ▶ Study Site
  - ▶ Study Type
  - ▶ Study RVU

## Study Type: Studies Were Assigned to a Subspecialty

- ▶ General Diagnostic: Radiography, Fluoroscopy
- ▶ Body Imaging: CT, MR, US
- ▶ Neuroradiology: CT and MR
  
- ▶ To make things simple/practical we excluded:
  - ▶ Breast Imaging; IR; Neuro-IR; Nuclear Medicine
  - ▶ Not Divided into Adult versus Pediatrics
  - ▶ MSK included in Body Imaging

Study Time: Studies were categorized by when they were performed.

- ▶ 3 Shifts
  - ▶ First shift: 8 am-4 pm
  - ▶ Second shift: 4 pm-12 am
  - ▶ Third shift: 12 am-8 am

### Sample Raw Data: Hospital #1

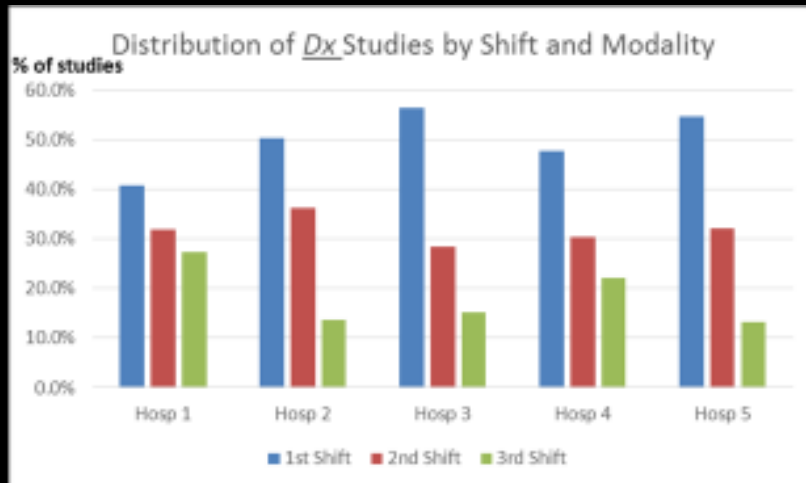
Average RVU per Shift by Radiologist Skillset			
	All Studies		
	<u>General Diagnostic</u>	<u>Body Imaging</u>	<u>Neuroradiology</u>
1st shift	23.99	45.43	59.3
2nd shift	18.83	39.10	55.7
3rd shift	16.11	17.39	27.7

## Sample Shift Distribution: Hospital #1

### Distribution of Studies by Shift

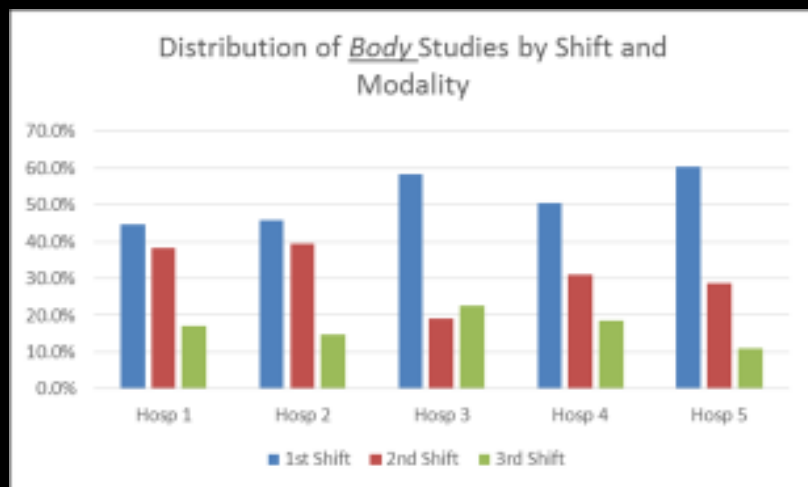
	<u>General Diagnostic</u>	<u>Body Imaging</u>	<u>Neuroradiology</u>
1st shift	41%	46%	42%
2nd shift	32%	38%	39%
3rd shift	27%	16%	19%

## Results: Distribution of Dx Studies by Shift



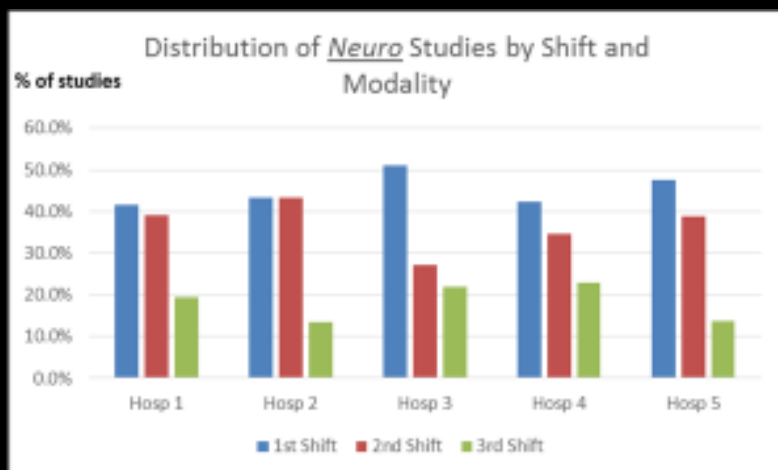
	1st Shift	2nd Shift	3rd Shift
Hosp 1	40.7%	31.9%	27.3%
Hosp 2	50.2%	36.2%	13.6%
Hosp 3	56.3%	28.4%	15.2%
Hosp 4	47.6%	30.4%	22.0%
Hosp 5	54.7%	32.0%	13.3%

## Results: Distribution of Body Studies by Shift



	1st Shift	2nd Shift	3rd Shift
Hosp 1	44.6%	38.4%	17.1%
Hosp 2	45.8%	39.4%	14.8%
Hosp 3	58.4%	19.0%	22.6%
Hosp 4	50.4%	31.1%	18.4%
Hosp 5	60.4%	28.6%	11.0%

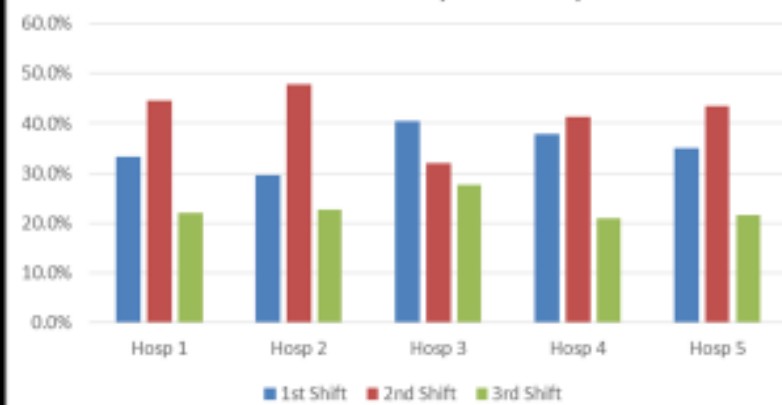
## Results: Distribution of Neuro Studies by Shift



	1st Shift	2nd Shift	3rd Shift
Hosp 1	41.5%	39.0%	19.4%
Hosp 2	43.4%	43.2%	13.5%
Hosp 3	51.1%	27.0%	21.9%
Hosp 4	42.4%	34.7%	22.9%
Hosp 5	47.6%	38.7%	13.8%

## Results: Stat Body Studies by Shift

% of studies Distribution of Stat Body studies by shift and site



	1st Shift	2nd Shift	3rd Shift
Hosp 1	33.3%	44.6%	22.0%
Hosp 2	29.5%	47.8%	22.6%
Hosp 3	40.4%	31.9%	27.7%
Hosp 4	37.8%	41.3%	21.0%
Hosp 5	34.9%	43.6%	21.5%

- 2<sup>nd</sup> shift is busiest for stat cases!
- Same pattern for stat Diagnostic and Neuro

## Study goal #1: Assessing workload

- ▶ Study Distribution is Similar through the 5 Hospital Sites
- ▶ Study Distribution is Similar through the 3 Skillsets
- ▶ All Studies: 1st shift is busiest
- ▶ All Studies: 2<sup>nd</sup> + 3<sup>rd</sup> shift about equal to 1<sup>st</sup> shift
- ▶ Stat Studies: 2<sup>nd</sup> shift is busiest
- ▶ Stat Studies: 2<sup>nd</sup>+3<sup>rd</sup> shift > 1<sup>st</sup> shift



## Study Goal #2: Assess Radiologist Capacity

### Expected Radiologist Daily Production:

DX = 25 RVU/day  
 Body = 40 RVU/day  
 Neuro = 60 RVU/day

RVU per shift

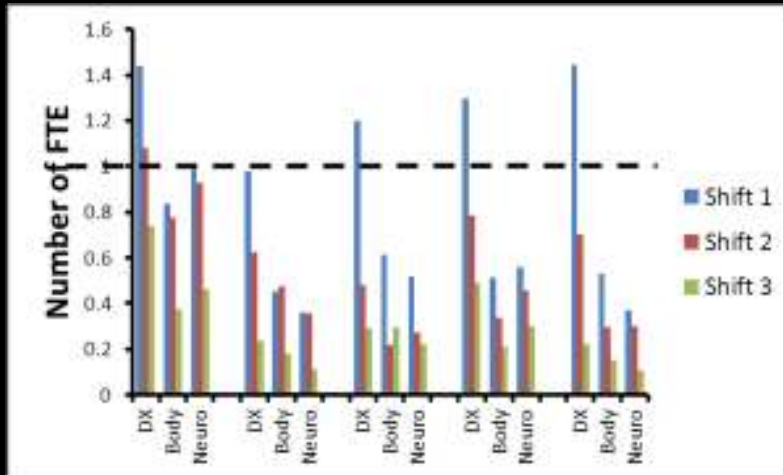
Expected Radiologist Daily Production = # FTEs needed to cover each modality by shift

How many FTEs  
 does each hospital  
 need per shift by  
 modality?

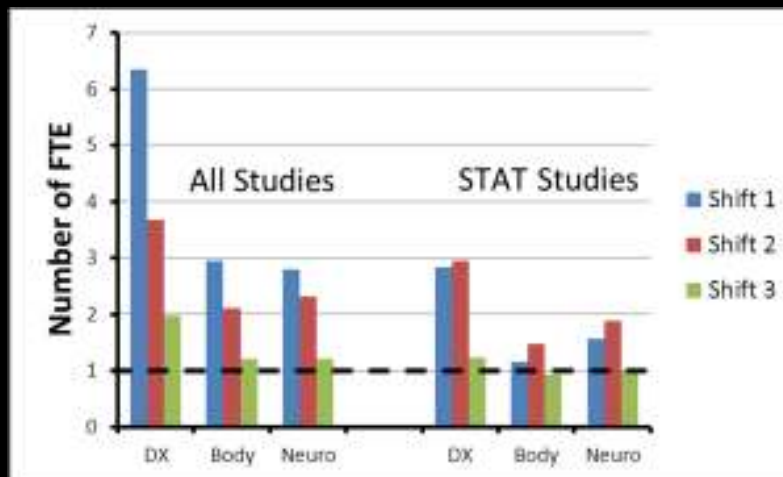
Less than 1 = not enough volume to support a  
 full time subspecialized radiologist

	DX	BODY	NEURO
Hosp 1: 1st Shift	0.96	1.14	0.99
Hosp 1: 2nd Shift	0.75	0.98	0.93
Hosp 1: 3rd Shift	0.64	0.43	0.46
Hosp 2: 1st Shift	0.53	0.73	0.36
Hosp 2: 2nd Shift	0.38	0.63	0.36
Hosp 2: 3rd Shift	0.14	0.24	0.11
Hosp 3: 1st Shift	0.66	0.95	0.52
Hosp 3: 2nd Shift	0.33	0.31	0.27
Hosp 3: 3rd Shift	0.18	0.37	0.22
Hosp 4: 1st Shift	0.62	0.93	0.56
Hosp 4: 2nd Shift	0.40	0.58	0.46
Hosp 4: 3rd Shift	0.29	0.34	0.30
Hosp 5: 1st Shift	0.81	0.92	0.37
Hosp 5: 2nd Shift	0.48	0.44	0.30
Hosp 5: 3rd Shift	0.20	0.17	0.11
Total: 1st Shift	3.58	4.68	2.79
Total: 2nd Shift	2.34	2.93	2.32
Total: 3rd Shift	1.45	1.55	1.20

Same Pattern All 5 Hospitals  
 Not Enough Studies to Subspecialize 24x7



By Aggregating Studies at Multiple  
 Hospitals We Can Subspecialize 24x7!



## Study goal #2: Radiologist Utilization

- ▶ In this study, Individual Hospitals:
  - ▶ Do not have sufficient volume to support subspecialization 24x7.
  - ▶ This even applies to the academic hospital
- ▶ By aggregating the cases from multiple hospitals:
  - ▶ Volume is sufficient to support subspecialization 24x7

## Study goal #3: Match Staffing to Workload Day-to-Day Variation in Volume

### Example 2<sup>nd</sup> Shift Neuro:

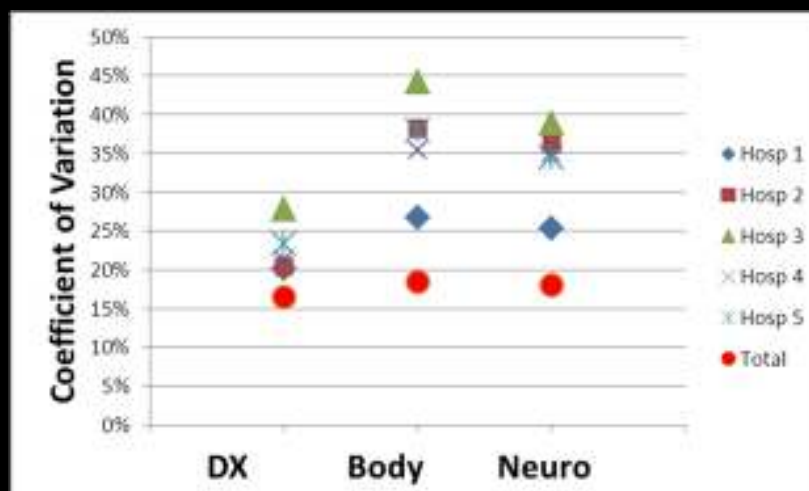
Hosp 1:	55.70	+/-	14.12 RVU
Hosp 2:	21.41	+/-	7.73 RVU
Hosp 3:	16.37	+/-	6.37 RVU
Hosp 4:	27.42	+/-	9.60 RVU
<u>Hosp 5:</u>	<u>18.08</u>	<u>+/-</u>	<u>6.21 RVU</u>
Total:	138.97	+/-	25.05 RVU

## How Do We Measure Variation? Coefficient of Variation = SD/Mean

### Example 2<sup>nd</sup> Shift Neuro:

Hosp 1:	55.70	+/-	14.12 RVU	CV = 25%
Hosp 2:	21.41	+/-	7.73 RVU	CV = 36%
Hosp 3:	16.37	+/-	6.37 RVU	CV = 39%
Hosp 4:	27.42	+/-	9.60 RVU	CV = 35%
<u>Hosp 5:</u>	<u>18.08</u>	<u>+/-</u>	<u>6.21 RVU</u>	<u>CV = 34%</u>
Total:	138.97	+/-	25.05 RVU	CV = 18%

## Aggregating Studies “Smooths” Out the Day-to-Day Variation



## Implications for Radiologist Staffing #1

If you want to read the studies in real time:

At least half your radiologists need to work  
2<sup>nd</sup>/3<sup>rd</sup> shift

## Implications for Radiologist Staffing #2

Single Hospitals (Even Relatively Large):

May Not Have Adequate Volumes to  
Subspecialize 24x7...

But By Aggregating Studies From Multiple  
Hospitals 24x7 Subspecialization is Possible

## Implications for Radiologist Staffing #3

Study Volume Varies Day-to-Day:

Variation Adds an Element of Unpredictability

Aggregation of Sites Decreases Overall Variability

Thank You

Questions?