

# Key Performance Indicators in Radiology

*The Future of Medical Imaging: Trends and Perspectives*  
*ISSSR Rotterdam, November 10, 2018*

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# Business Intelligence

Entails assembling financial and non-financial metrics that help guide an organization in achieving its mission and goals

Critical to managing a practice or department



# Turning Data Into Business Intelligence

- What metrics are most important in managing and measuring success?
- I.e., what are the Key Performance Indicators (KPIs) for the organization?
- How are these metrics best presented ?
- How can these KPIs be used to help close the gap between the current state and organizational goals?



Q#1: Are the terms “Business Intelligence” and “KPIs” used in your organization?

# KPI Process Steps

Determine what to monitor and measure i.e., What are the KPIs?

Define KPI criteria and assign responsibilities

Define goals- what does success look like?

Identify data sources

Determine frequency of KPI measurement

Obtain data

Measure and monitor KPI performance over time

Develop methods for KPI data presentation

Use KPI information to help bring about change to achieve strategy and goals



# Step #1: Determine What To Measure-- Key Performance Indicators (KPIs)

- KPIs should reflect what is important to the organization
- Engage stakeholders to identify KPIs
- Focus on areas where there are:
  - Known gaps between performance and strategic goals
  - Ongoing compliance requirements
  - Clear organizational expectations
    - Financial performance
    - Service
    - Quality and safety
    - ...
- Recognize that it is impractical, if not impossible, to measure everything or even too many things simultaneously

# Step #1: Typical Categories Of Indictors

- **Quality and safety**
- **Stakeholder satisfaction**– patients, employees, referring physicians
- **Operations**– efficiency, utilization, timeliness
- **Finance**

# Step #1: Functional Types Of Indicators

- **Structure** (context)—physical facilities, equipment, staffing levels, staff training
- **Process** (transactions) – steps in the care process: diagnostic and therapeutic
- **Outcome** (effects) – change in health status, complications, stakeholder satisfaction

*The Donabedian Model of Care Evaluation*

Donabedian, A. The quality of care: How can it be assessed? JAMA 1988; **260** (12): 1743–8



# Examples of Functional KPIs For Radiology

- **Structure**

- Installed equipment base by type
- Age of equipment
- Number of FTEs
- Level of specialization
- Licensure and certification

- **Process**

- Incident reporting rates
- Equipment utilization rates
- Report turnaround times
- Compliance with hand hygiene policies
- Procedure volume
  - By day, week, month
  - Trended over time by month, year
- Billed charges versus budget
  - MTD
  - YTD

- **Outcome**

- Operating margin
- Error rates
- Complication rates, accidents
- Patient satisfaction
- Employee satisfaction



# MGH KPI Stakeholder Brainstorming

Strategic Focus		Factor Affecting Strategic Focus	Key Performance Indicators	Details	Descriptor
Operations Management <i>Efficient provision of services</i>	Core Functions	Clinical performance	Individual division success rates		Division specific success criteria a
			Audit of protocols used		
			Audit of sample reports		False positive and false negative in divisions]
			Survey of patients receiving pre-appointment exam information and education		Agreement rate of peer review aorc
			Measure of waiting time: Arrive to begin		Rate of unnecessary recommenda (recommendations without findings
			Measure of Appointment Delay: Scheduled begin to begin		Quality of emergent and non-emerg physicians
			Results turnaround to Patient/Referrer: Scheduled Begin to Finalized		Rate of compliance with standardiz
			Appt availability: 4-8-8 scores and percent open slots for the next 30 days		Compliance with report quality stan
			Number of incidents resulting in patient injury		Quality of patient education prior tc
			Inpatient Reporting Turnaround Time: Time scheduled to Finalized Report		How long outpatients had to wait tc
Operations Management <i>Efficient provision of services</i>	Core Functions	Patient Experience (service level)	Inpatient Imaging Turnaround Time: Time scheduled to complete		Delay in starting outpatient exams
			???		How long it takes to get results bac
			Percentage of machine time unavailable due to unscheduled downtime		How long it takes to provide a preli
			Begin to Complete divided by working hours (hours room utilized divided by		How difficult it is to get an outpatie
			Professional Staff productivity		Rate of patient injury
			Technical Staff productivity		How long it takes to image inpatient
			Knowledge, skills, abilities		???
			Reports (RVU) generated per professional FTE (Radiologist)		How often machines break down
			Exams (RVU) per staff category FTE (per tech, tech aide)		To what degree rooms and imaging
			Percent of jobs with competency based assessment		How well equipment is staffed
Operations Management <i>Efficient provision of services</i>	Enabling Functions	Employee Development	Percent of staff that have completed competency assessments		How productive professional staff
			Percent of staff that meet or exceed CME/ CEU's		How productive technical staff are
			Percent of staff licensed (AART, Nuc Med, etc)		Job descriptions with defined comp
			Percent of staff with Masters' level degrees		Number of employees having their
			Percent of Departments with Tech III levels		Number of employees meeting req
					Proportion of staff that meet licens
					Proportion of staff with advanced e
					Percents of modalities with defin

Multi-functional teams asked to identify KPIs in each important area of activity

# MGH KPI Stakeholder Brainstorming

<b>Financial Management</b> <i>Make money for the hospital</i>		<b>Net Income</b>	<b>Revenue</b>	Measure of total dollar amount billed	How much the department has earned
				Measure (or estimate) of total dollar amount reimbursed	
			<b>Expenses</b>	Measure of fixed (overhead) costs	How much the department has spent
				Measure of variable costs (correlated with number of exams)	
				Measure of costs due to errors (including litigation, repeat exams, wrong exams)	How much the department loses due to
		<b>Variance to budget</b>	<b>Revenue</b>	Variance in revenue billed against budget	How accurate the revenue budget is
					the expense estimate is
					y efficient the labor force is
					y the department utilizes its
					revenue the department loses
					ective the precertification pr
<b>Patient Safety &amp; Quality of Care</b> <i>Providing safe quality care</i>					quality and safety projects i
					it the department is with JC
					it the department is with HIF
					it the department is with its
					ve quality and safety policie

- 143 potential KPIs identified by the teams in the original brainstorming process
- Modified Delphi process used to prioritize and decrease the list

Q#2: What is an example of an important KPI in your practice or company?

## Step #2: Define KPIs And Goals: Assign Responsibilities

- Define all terms
  - All percentages must have a defined numerator and denominator
- Identify person responsible for the curation and validation of each KPI
- Assign each KPI to a major category—Finance, stakeholders, operations, Q&S
- Identify end users accountable for each KPI E.g.:
  - Financial—Hospital Executives, Department Chair, Department Administrators, Operations managers
  - Physician productivity— Division or Section Heads, Chairman
  - Equipment utilization— Modality lead physician, Department administrators, Operations managers, Service engineers

## Step #2: Goals and Benchmarks

- Identify/ establish goals related to each KPI– what constitutes success?
  - Financial– do better than plan
  - Hand hygiene >90% compliance, Universal protocol compliance—100%
  - Stakeholder satisfaction– positive trend
  - Complications– do better than bench marks with decreasing trend
- Identify benchmark sources for comparison, if available
  - Society of Chairmen of Academic Radiology Departments surveys for physician productivity
  - Literature reports
  - Joint Commission standard
  - Industry standards—computer up time

Hand Hygiene

Definition:	The usage of hand hygiene before and after patient contact
Owner:	Karen Miguel
Accountability:	QSC; SO; Ops Manager
Metric Source:	Joint Commission NPSG
Units:	% Compliant
Norm:	Straight Line Monthly 90%
Target:	90%
Numerator:	Sum of Compliant Observations
Denominator:	Sum of Observations
Data Source:	CQS
Reporting Cycle:	Monthly

Massachusetts General Hospital template for defining KPIs, setting goals and assigning responsibilities

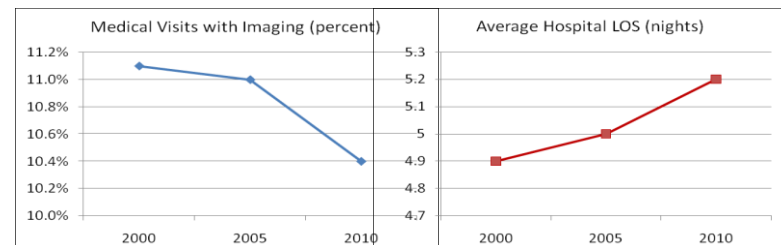
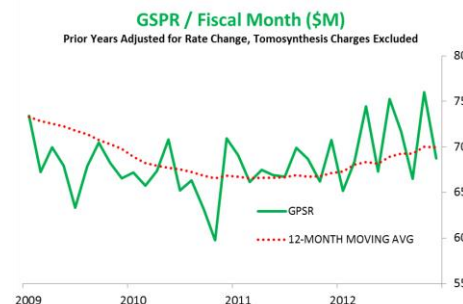
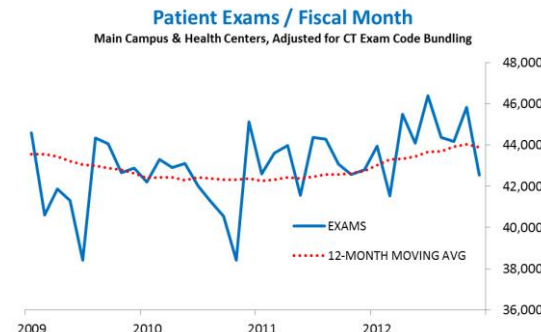
Q#3: Is there a standard process in your organization for defining KPIs and assigning responsibility?



Q#4: Does your organization have a template for defining KPIs?

# Step #3: Identify Sources Of Data

- EHR
  - Patient demographics
  - Patient diagnoses
- RIS
  - Appointment availability
  - Procedure volume
  - Report turn-around times
  - Equipment utilization rates
  - Patient waiting times
  - Physician productivity
  - Unread case volumes
- PACS
  - Images/case
- Per event reporting
  - Morbidity and mortality conference
  - Complications
  - Deaths
- Direct observation
  - Hand hygiene



# Step #3: Identify Sources Of Data

- Surveys
  - Patient satisfaction
  - Employee satisfaction
  - Referring physician satisfaction
- Hospital safety reporting system
  - Incident reporting– slips and falls
- Administrative compliance record reviews
  - Universal protocol adherence
  - Standardized reporting issues
- Hospital administrative and Human Resource systems
  - Educational module compliance
  - Licensure
  - CME compliance
  - Vaccination compliance
- Financial systems
  - Billings and collections
  - Resource utilization by category
  - Operating margin



# Step4: Develop Presentation Methods

- Charts, spreadsheets, graphs
- Heatmaps
- Dashboards
- Balanced Scorecards
  - Summary of multiple parameters
- Trend indicators
  - Arrows for short term versus goal
  - Graphs for long term
- Color coding
  - Green- meets goal
  - Yellow- close to goal
  - Red- not meeting goal
- Drill down/Roll up capability

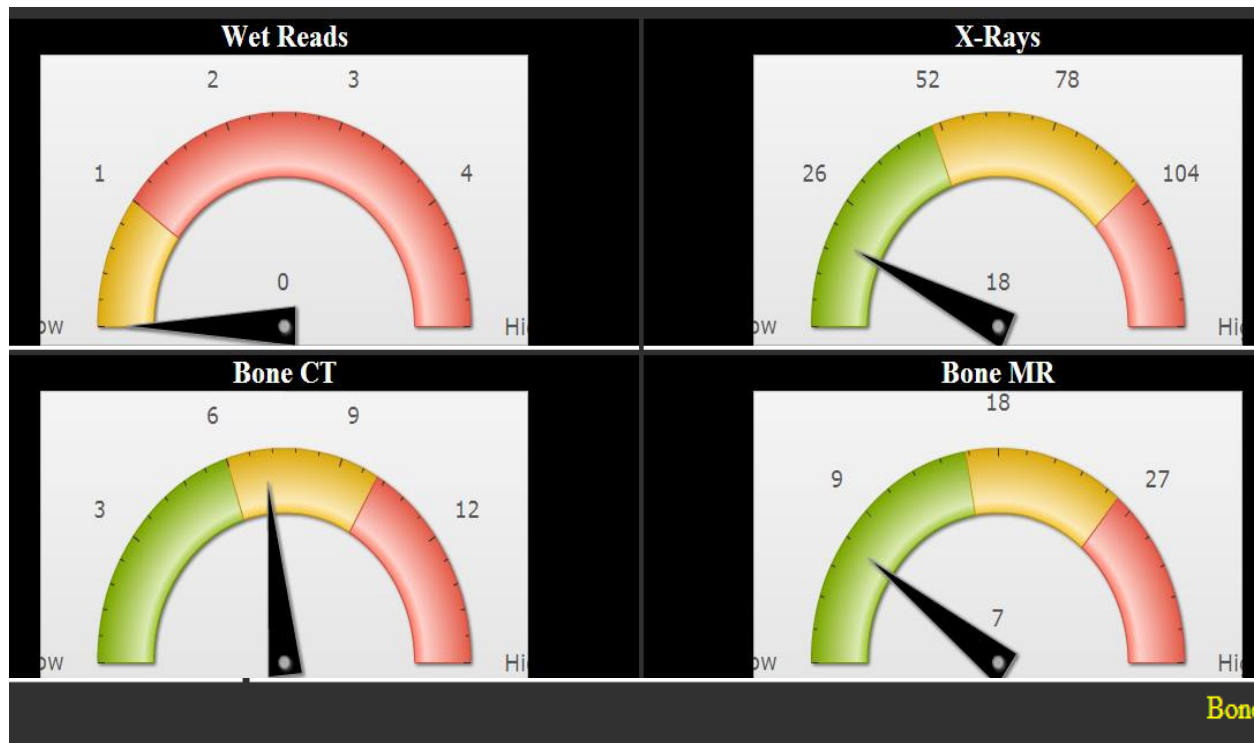
Use of KPIs is most effective when users can see what they need to know at a glance and easily drill down

# Step #3 Determine Frequency of Measurement (Reporting Cycle) and Trending

- Real-time
  - Unread case volume by division, by modality
  - Time to next exam
- Daily
  - Case volume by type,
  - Appointment availability
- Monthly
  - Financial indicators
  - Compliance with hand hygiene and universal protocol
  - Case complications
- Yearly
  - Annual financial results
  - Physician productivity
  - Patient satisfaction

The value and use of data are highly influenced by the timing of its availability

# Real-time Monitoring of Work



Unread exams in MSK division- for different modalities

Allows on-line rebalancing of radiologists deployment

# Real-time monitoring of predicted outpatient wait times

Tuesday, September 25, 2018 2:40 PM

## Walk-In Patients

Modality	Location	Patients Waiting	Anticipated Wait
X-ray	Yawkey 6	0	3 min

## Scheduled Appointments

Modality	Location	Anticipated Delay
CT	Yawkey 6	5 min
MRI	Yawkey 6	4 min
Ultrasound	Yawkey 6	5 min
Procedures	Yawkey 6	On Time

Your actual wait time may vary based on the complexity of the previous exam and resource availability.

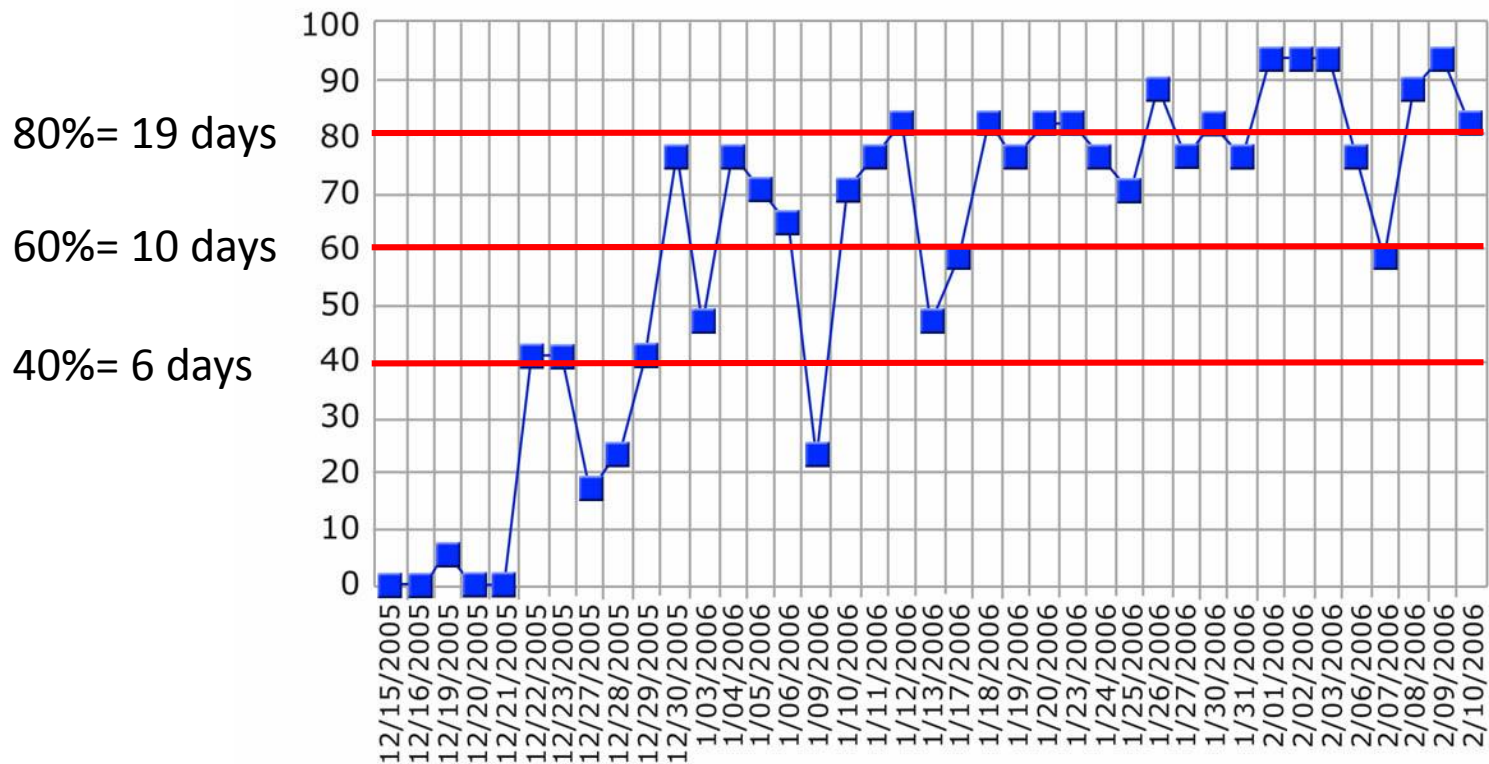
Information provided to patients on monitors in waiting rooms

Available in real-time to managers throughout department via intranet

Powered by an AI program that takes into account multiple parameters

# Daily Reporting of Outpatient Appointment Availability; Days to 40%, 60%, 80%

**% of Free Slots by Business Day - NUC MED**





View By

Division

Final Signer

Massachusetts General Hospital  
Imaging

Heat Calendar

Finalized | Completed

NUCMED

Total

Heat Calendar

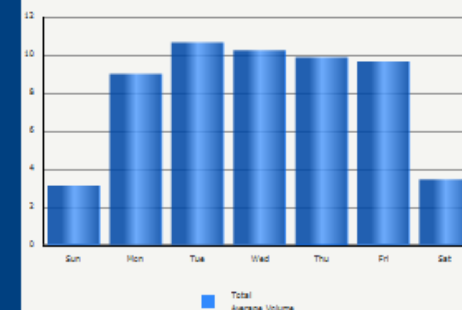
Exam Volume

Definition: Total # of Exams

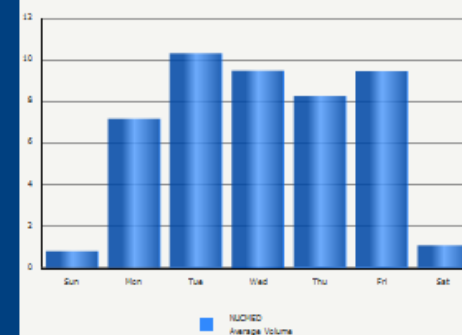
Source: IDXRad

Reporting Cycle: Daily

Final Signer Daily Average



Division Daily Average



Jan							Feb							Mar						
Sun Day	Mon Day	Tue Day	Wed Day	Thu Day	Fri Day	Sat Day	Sun Day	Mon Day	Tue Day	Wed Day	Thu Day	Fri Day	Sat Day	Sun Day	Mon Day	Tue Day	Wed Day	Thu Day	Fri Day	Sat Day
				1	2	3	1	2	3	4	5	6	7	1	2	3	4	5	6	7
4	5	6	7	8	9	10	8	9	10	11	12	13	14	8	9	10	11	12	13	14
11	12	13	14	15	16	17	15	16	17	18	19	20	21	15	16	17	18	19	20	21
18	19	20	21	22	23	24	22	23	24	25	26	27	28	22	23	24	25	26	27	28
25	26	27	28	29	30	31								29	30	31				

Apr							May							Jun						
Sun Day	Mon Day	Tue Day	Wed Day	Thu Day	Fri Day	Sat Day	Sun Day	Mon Day	Tue Day	Wed Day	Thu Day	Fri Day	Sat Day	Sun Day	Mon Day	Tue Day	Wed Day	Thu Day	Fri Day	Sat Day
			1	2	3	4						1	2		1	2	3	4	5	6
5	6	7	8	9	10	11	3	4	5	6	7	8	9	7	8	9	10	11	12	13
12	13	14	15	16	17	18	10	11	12	13	14	15	16	14	15	16	17	18	19	20
19	20	21	22	23	24	25	17	18	19	20	21	22	23	21	22	23	24	25	26	27
26	27	28	29	30			24	25	26	27	28	29	30	28	29	30				
							31													

Jul							Aug							Sep						
Sun Day	Mon Day	Tue Day	Wed Day	Thu Day	Fri Day	Sat Day	Sun Day	Mon Day	Tue Day	Wed Day	Thu Day	Fri Day	Sat Day	Sun Day	Mon Day	Tue Day	Wed Day	Thu Day	Fri Day	Sat Day
			1	2	3	4							1			1	2	3	4	5
5	6	7	8	9	10	11	2	3	4	5	6	7	8	6	7	8	9	10	11	12
12	13	14	15	16	17	18	9	10	11	12	13	14	15	13	14	15	16	17	18	19
19	20	21	22	23	24	25	16	17	18	19	20	21	22	20	21	22	23	24	25	26
26	27	28	29	30	31		23	24	25	26	27	28	29	27	28	29	30			
							30	31												

Oct							Nov							Dec						
Sun Day	Mon Day	Tue Day	Wed Day	Thu Day	Fri Day	Sat Day	Sun Day	Mon Day	Tue Day	Wed Day	Thu Day	Fri Day	Sat Day	Sun Day	Mon Day	Tue Day	Wed Day	Thu Day	Fri Day	Sat Day
				1	2	3	1	2	3	4	5	6	7			1	2	3	4	5
4	5	6	7	8	9	10	8	9	10	11	12	13	14	6	7	8	9	10	11	12
11	12	13	14	15	16	17	15	16	17	18	19	20	21	13	14	15	16	17	18	19
18	19	20	21	22	23	24	22	23	24	25	26	27	28	20	21	22	23	24	25	26
25	26	27	28	29	30	31	29	30						27	28	29	30	31		

Less than 10 exams

Between 10 and 25 exams

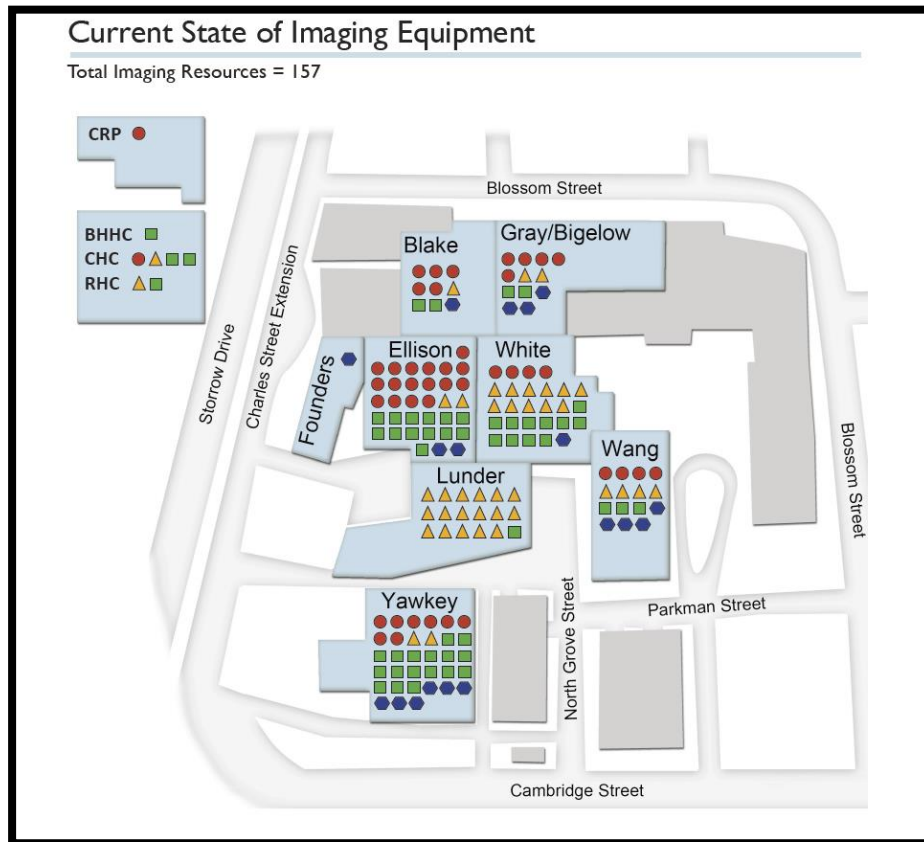
between 25 and 75 exams

More than 75 exams

“Heat” Calendar-- Division

# Heat Map of Equipment Age/Useful Life

## Annual Summary In Departmental Capital Request



- More than 3 years of useful life 53/157
- Will be beyond useful life guidelines within 3 years 41/157
- Beyond useful life per guidelines 43/157
- 18/157 approved replacements

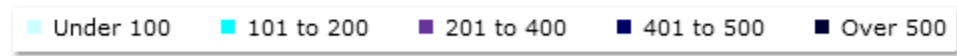
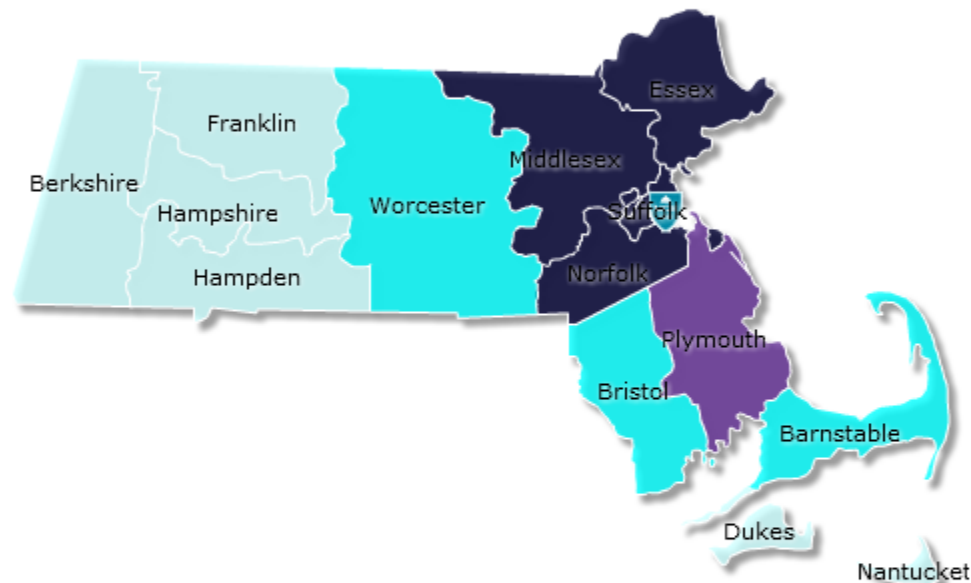
- = Beyond useful life per Lifecycle Guidance
  - ▲ = Beyond useful life in next 3 years per Lifecycle Guidance
  - = Over 3 years of useful life remaining per Lifecycle Guidance
  - = Approved replacement
- Calculation based on approval as of 06/30/16  
Four more devices have been installed between 07/01/16 and 10/31/16



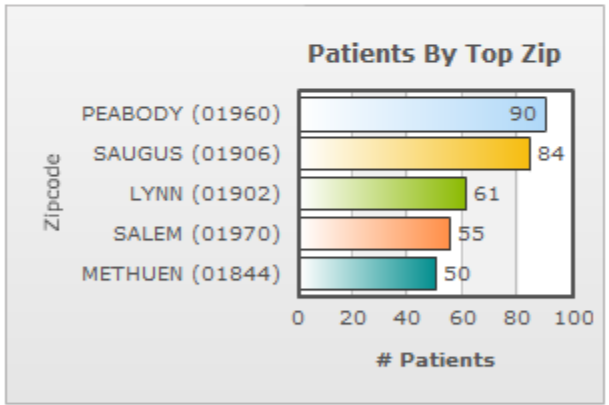
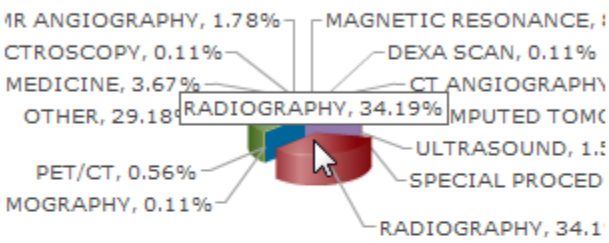
## MGH Radiology Heatmap - Patient Volume Last Week

Patient Exams | [Doctor Refe](#)

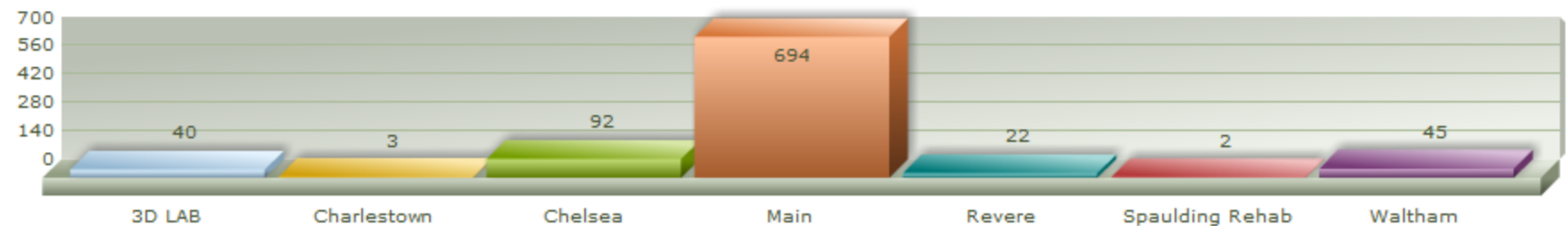
[ [Show All MGH Centers](#) ]



### Exams By Type - Essex County

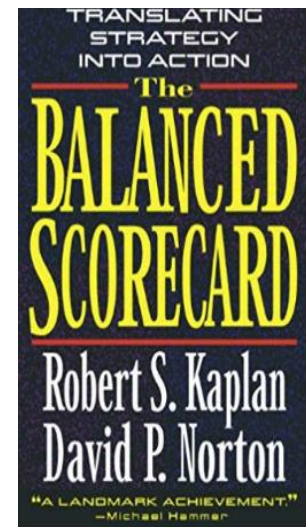


### Patient Volume By Center - Essex County

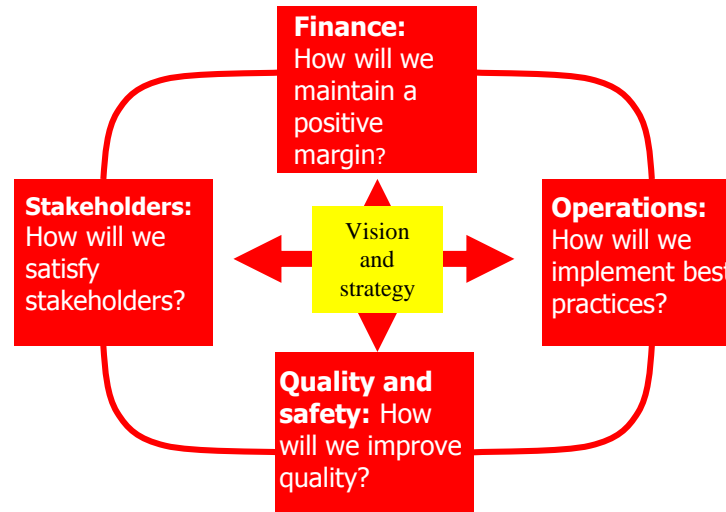


# Balanced Scorecards

- Both a management concept and a data presentation method
- Designed to link data presentation to strategy and goals
- Hierarchical presentation with “drill down” capability—summary level to granular detail
- Should be tailored to each organization’s needs
  - KPIs that reflect success factors for the business that link to strategic direction
  - “Gap-to-goal” data at a glance




Kaplan and Norton. *The Balanced Scorecard*.  
Harvard Business Review Press, Boston, MA  
1996



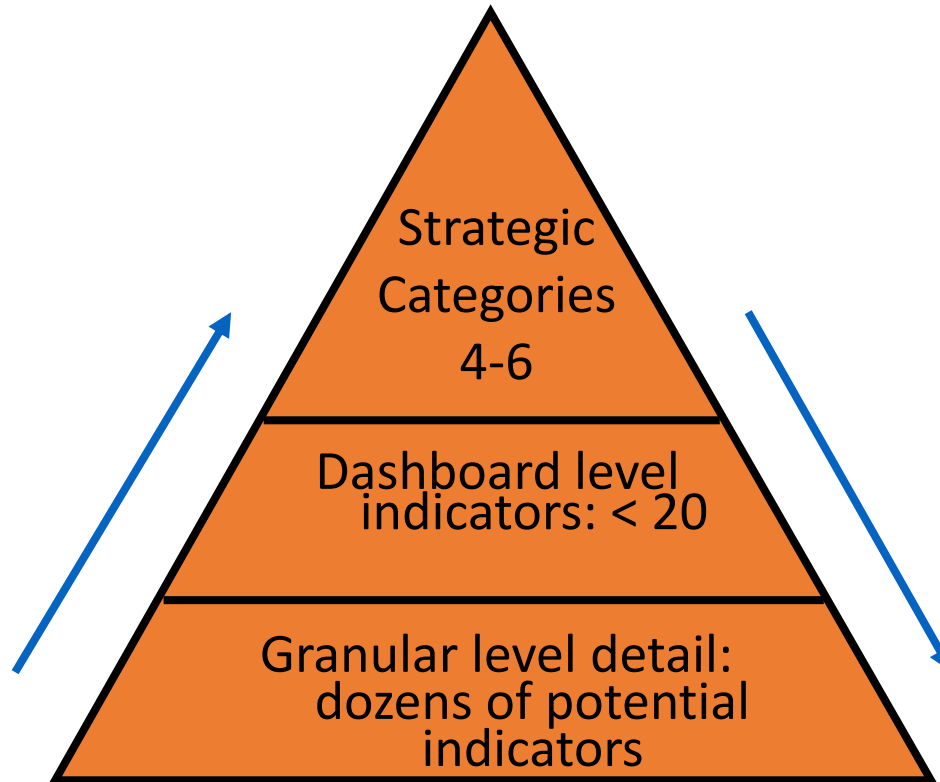
Adapted and modified from Kaplan and Norton.  
*The Balanced Scorecard and Strategy Maps*,  
Harvard Business Review Press, Boston, MA

Q#5: Does your organization have a business intelligence dashboard or Balanced Scorecard?

# MGH Departmental Primary Dashboard (Balanced Scorecard) Using The 6 US National Academy of Medicine Categories of Quality And 18 Roll Up KPIs

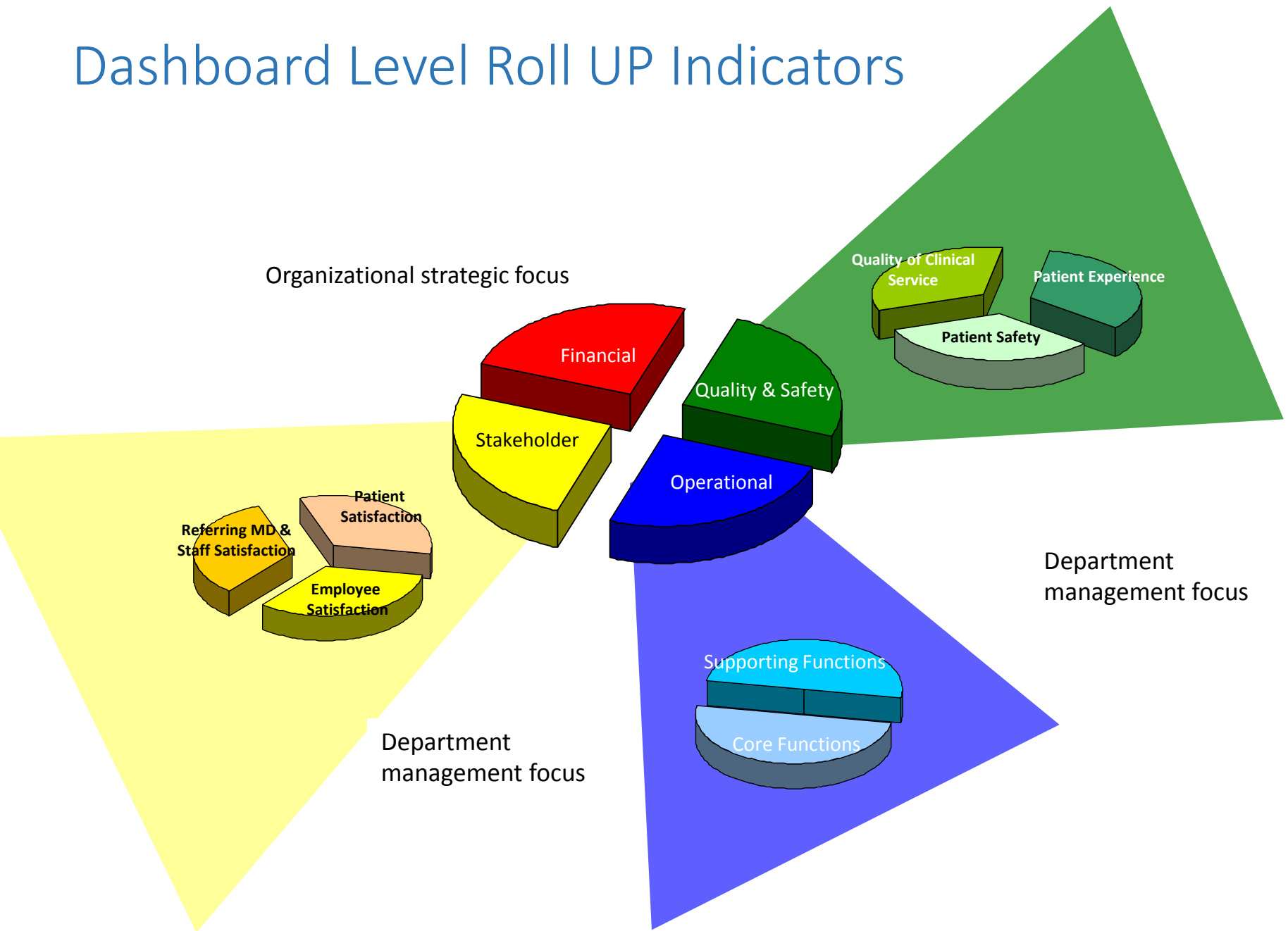
 MASSACHUSETTS GENERAL HOSPITAL RADIOLOGY						
				Department	Modality	Division
	Period	Goal	Status	Units	Trend	
<b>Safe</b>						
<a href="#">Hand Hygiene</a>	Last Month	90.00	● 97.07	%	→	
<a href="#">Universal Protocol Audit</a>	Last Month	90.00	● 99.23	%	↗	
<a href="#">Critical Test Results</a>	Last Month	90.00	◆	%	→	
<b>Timely</b>						
<a href="#">Radiologist Throughput</a>	Last Month	27.00	● 12.78	Hrs	↗	
<a href="#">Exam Length</a>	Last Week	33.09	● 19.82	Min	↗	
<a href="#">Exam Delay</a>	Last Week	3.05	● -23.36	Min	↗	
<a href="#">Patient Wait</a>	Last Week	36.63	▲ 31.24	Min	→	
<a href="#">Inpatient Turnaround</a>	Last Week	12.00	● 0.00	Min	→	
<b>Effective</b>						
<a href="#">ROE DS Red Rate</a>	Last Month	0.15	● 0.01	Hrs	↗	
<a href="#">PACS Transmission Time</a>	Last Week	25.00	● 11.29	Min	↗	
<a href="#">Duplicate Exam Warning</a>	Last Month	N/A	◇ N/A	N/A	□	
<b>Efficient</b>						
<a href="#">Appointment Availability</a>	Last Month	7.00	● 8.71	Days	↗	
<a href="#">Exam Volume</a>	Last Week	12,789	◆ 11,893	Count	↗	
<a href="#">Financial Indicators</a>	Last Month	68,432,721	◆	\$	↗	
<a href="#">Slot Utilization</a>	Last Month	80.00	● 133.74	%	↗	
<b>Equitable</b>						
<a href="#">Radiology Heat Map</a>	Last Month	N/A	◇ N/A	N/A	□	
<b>Patient Centered</b>						
<a href="#">Customer Satisfaction Survey</a>	Last Year	95.00	● 99.00	%	□	
<a href="#">Employee Satisfaction Survey</a>	Last Year	61.10	● 68.47	%	□	

# Hierarchical Presentation Of Business Intelligence Data: Role Up And Drill Down

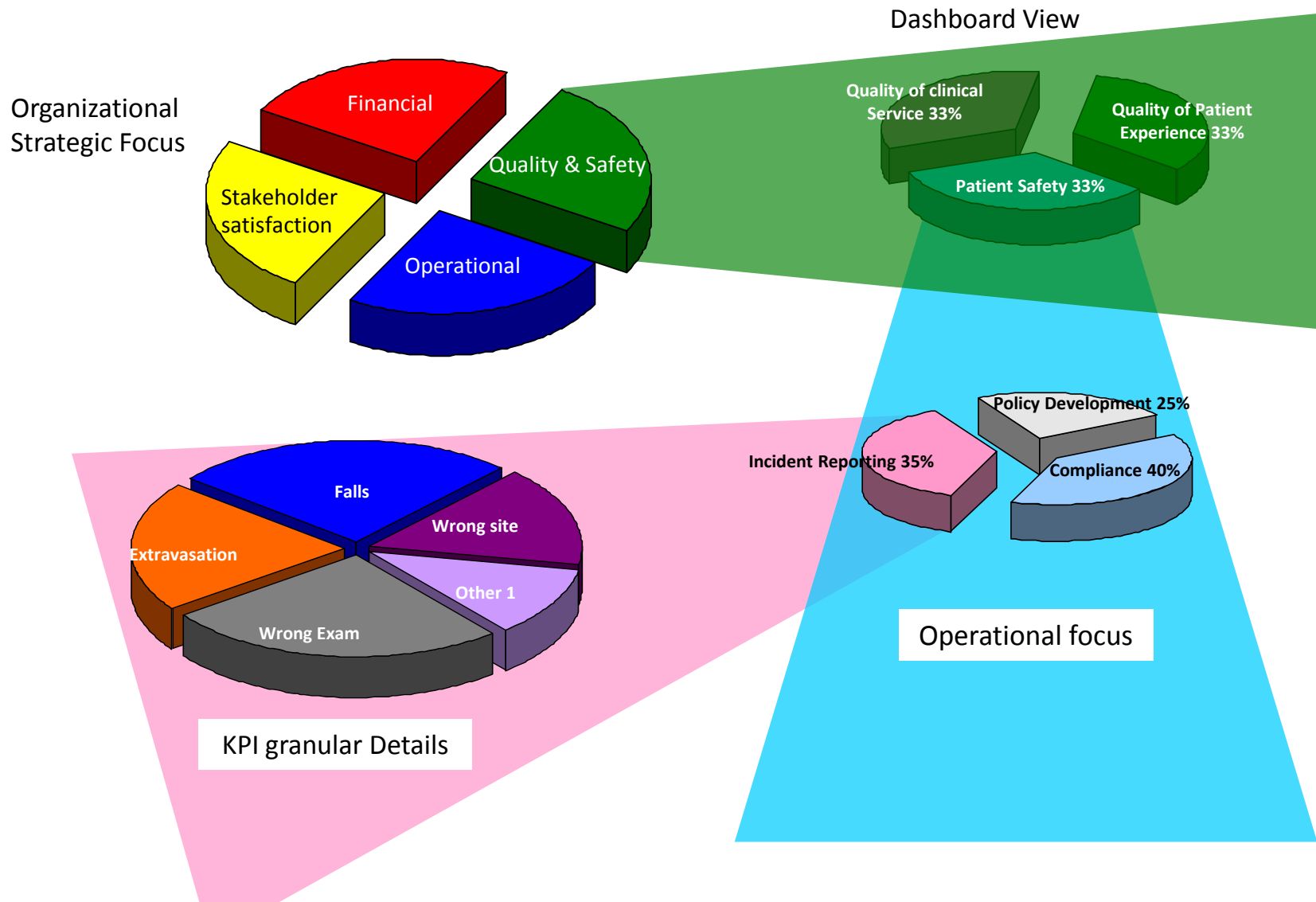





# Dashboard Level Roll UP Indicators



# KPI Granular Level Indicators



# Drill Down Example: Hand Hygiene

 <b>MASSACHUSETTS GENERAL HOSPITAL</b> <b>RADIOLOGY</b>						
				<a href="#">Department</a>	<a href="#">Modality</a>	<a href="#">Division</a>
	Period	Goal	Status	Units	Trend	
☐ <b>Safe</b>						
<a href="#">Hand Hygiene</a>	Last Month	90.00	● 97.07	%	➡	
<a href="#">Universal Protocol Audit</a>	Last Month	90.00	● 99.23	%	➡	
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☐ <b>Timely</b>						
<a href="#">Radiologist Throughput</a>	Last Month	27.00	● 12.78	Hrs	➡	
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<a href="#">Customer Satisfaction Survey</a>	Last Year	95.00	● 99.00	%	□	
<a href="#">Employee Satisfaction Survey</a>	Last Year	61.10	● 68.47	%	□	

Department level summary

## Scorecard - Hand Hygiene

	Value	Target/Status	Trend
3D LAB		90	
CT	97.79	90	
MAMMOGRAPHY	99.03	90	
MRI	93.00	90	
NUCLEAR CARDIOLOGY	96.81	90	
NUCLEAR MEDICINE	99.22	90	
NUCLEAR MEDICINE-PET	99.87	90	
ULTRASOUND	98.41	90	
VASCULAR RADIOLOGY	91.66	90	
X-Ray	96.71	90	

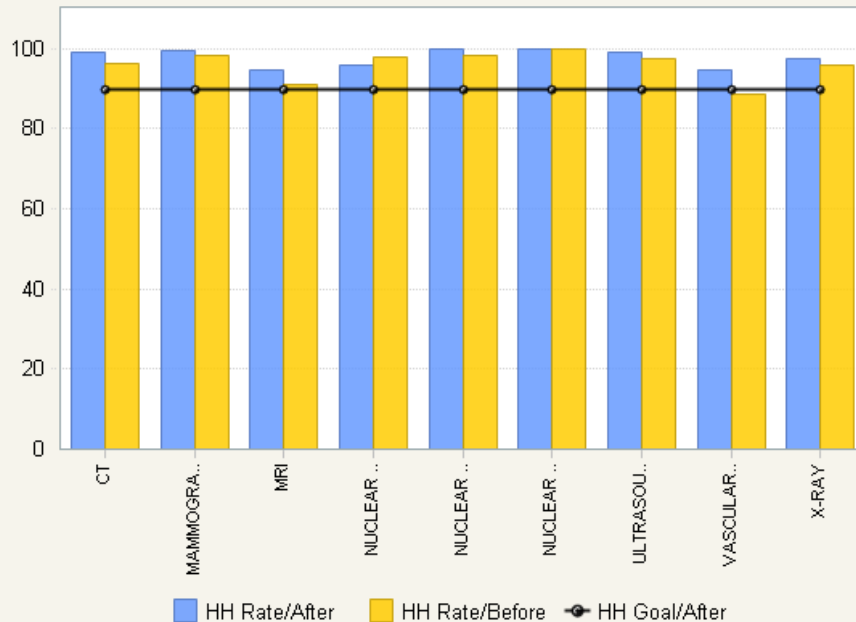
## Hand Hygiene

<b>Definition:</b>	The usage of hand hygiene before and after patient contact
<b>Owner:</b>	Karen Miguel
<b>Accountability:</b>	QSC; SO; Ops Manager
<b>Metric Source:</b>	Joint Commission NPSG
<b>Units:</b>	% Compliant
<b>Norm:</b>	Straight Line Monthly 90%
<b>Target:</b>	90%
<b>Numerator:</b>	Sum of Compliant Observations
<b>Denominator:</b>	Sum of Observations
<b>Data Source:</b>	CQS
<b>Reporting Cycle:</b>	Monthly

## Hand Hygiene Bar by Modality Group

MEM Time Month: All

HH by Modality



## Hand Hygiene Grid by Title and Group

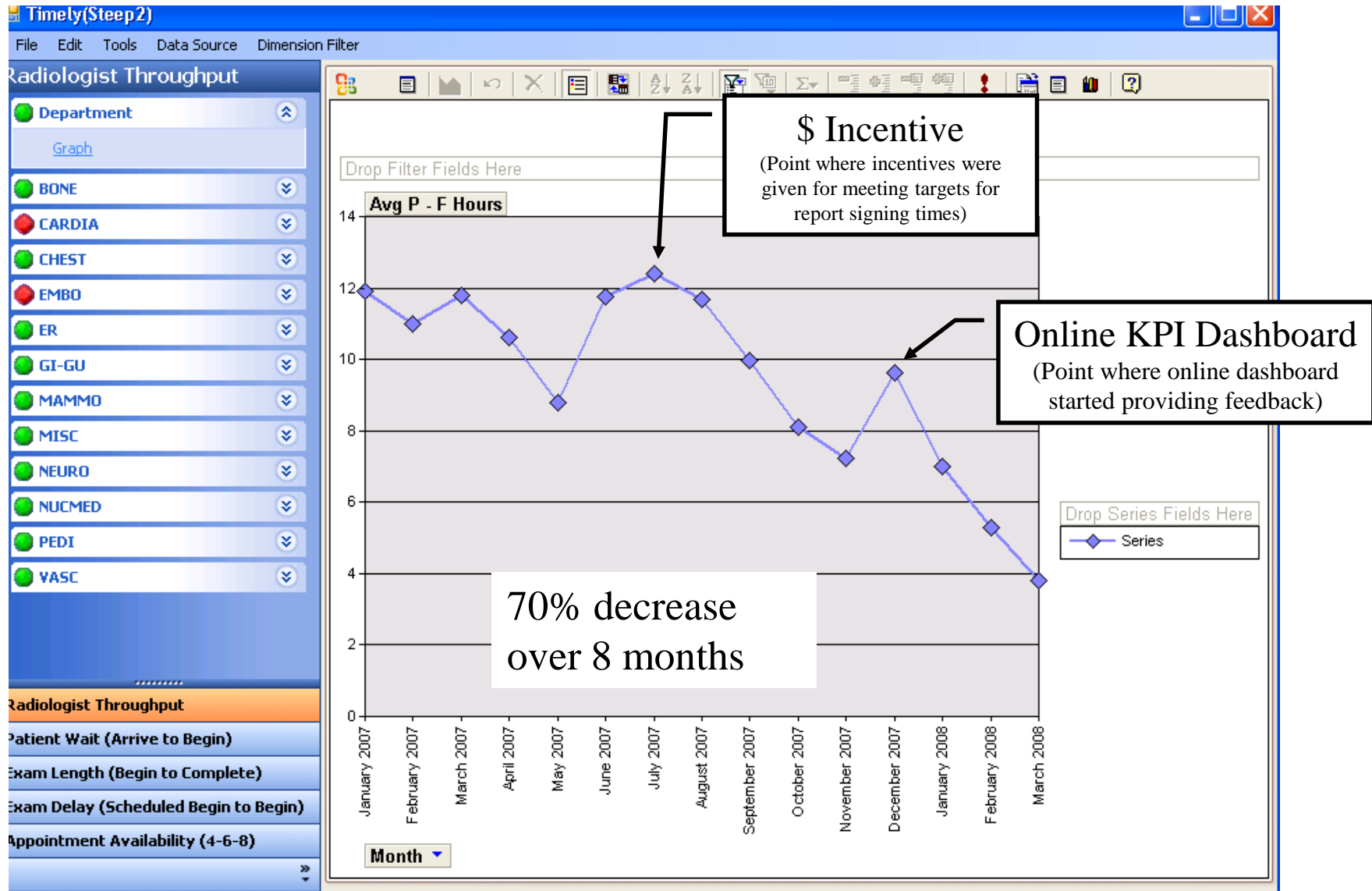
MEM Time Month: All

↑	Rate Before	N Before	Rate After	N After	HH Goal
MD	85.5	553.0	95.1	732.0	90.0
Nurse	95.9	997.0	96.3	1069.0	90.0
Other	81.4	92.0	92.0	149.0	90.0
RSR	86.6	304.0	97.9	417.0	90.0
Tech	97.9	6636.0	98.7	7104.0	90.0
Tech Asst	97.3	587.0	99.2	623.0	90.0
Transporter	87.9	211.0	97.8	480.0	90.0

Drill Down Example:  
Hand Hygiene  
Compliance KPI In Each  
Practice Unit

## Steps 5: Use KPIs To Improve Performance

# Report Turn-Around-Time



Q7: Have you improved a process through use of KPIs?

Share an example...

Dos and Don'ts



# Do

- Prioritize the most important KPIs
- Use KPIs to obtain actionable business intelligence
- Periodically review the importance of each KPI
  - Areas needing attention change over time
- Try to mitigate the burden of data collection
  - automate data collection as much as possible
- Hold people accountable for them and to them
  - Training is key
    - Interpretation
    - Cause and effect relationships

# Don't

- Try to measure everything all the time
- Overwhelm the organization with too many KPIs
- Create an overly expensive and time wasting system for KPIs
- Rely on KPIs out of larger context
  - Common sense trumps numbers every time

# Pitfalls

- KPI process becomes regarded as just another pro forma administrative burden and not used for intended purposes
- Missing what's important to measure what is easy to measure
  - “Not everything that counts can be counted, and not everything that can be counted counts” Sociologist, William Bruce Cameron-- 1963
- Misinterpreting KPI results
  - Productivity between high RVU versus low RVU subspecialties--pediatrics versus neuroradiology
  - Not correcting costs to reflect variances in volume

# Pitfalls

- Failure to understand balance between KPIs
  - Patient satisfaction versus quality of care – on line mammography versus accuracy of interpretations
- Reliance on KPIs can result in unintended consequences
  - Physician productivity and performance,
    - Cherry picking of easier cases
    - Avoidance of risky procedures to reduce incidents requiring reporting
  - Adverse resource management to meet expense budget
    - Understocking with “stock outs”

# Conclusions

- Used correctly KPIs can help in achieving organizational goals
- KPIs should be adapted to each organization's situation
- The benefits of KPI use must be balanced against the time and cost to acquire and analyze them
- Leaders and managers should be trained in how to turn KPI based business intelligence into action but...
- KPIs are ultimately just another management tool and should be placed in context