



University of Mary

Cara A. Garcia

NUR: 689

Nursing Informatics Seminar 2

Jessica Alexander

4/21/2024



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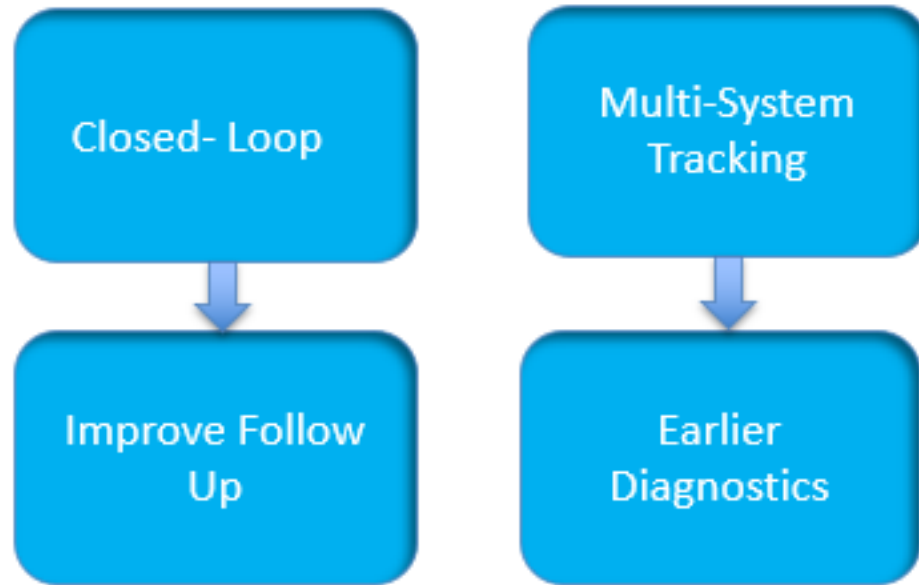
for Life.

DATA ANALYSIS CAPSTONE PROJECT



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PURPOSE STATEMENT



ORGANIZATIONAL IMPACT



- Excited providers
- Attract new patients
- Attract new providers
- > imaging revenue
- < imaging access



IMPLEMENTATION PLAN



- Remote Settings
- So-Cal
- Waves 1-4
- Estimates millions



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FUM ANALYSIS



- Demographics
- AIF data
- Reco data
- Patient responses
- Outreach success
- Outreach failure



Pain Points and Hurdles

	Severity	Issue	Problem	Solution	Owner	Resolved
Week 1	1	Very few studies include follow up date	Dashboard cannot function as intended	Bring to steering committee	Cara	Parking Lot
Week 1	3	ECHOs hitting dashboard	Inflating numbers	Remove ICD code- ECHOs	Cal F.	Week 3
Week 1	3	LCS hitting dashboard	Out of scope	NN sorts	Cal F.	Resolved week 3
Week 1	1	No priority indications on tracker	NN can't assess urgency	Verbiage change; G & E req	Cara and Cal	Week 2
Week 2	3	Many patients not in group	Inflating numbers	NN sorts	PCN	Workaround
Week 2	2	Hedging language	Inflating numbers	Educate rads	PCN	Parking Lot
Week 2	2	Confounding language	Inflating numbers	Educate rads	PCN	In progress
Week 2	2	Confound RAD guidelines	Inflating numbers	Educate rads	PCN	In progress
Week 2	1	Dashboard only allows one NN at same time	System not sustainable	Nuance Repair	Engineers	Red Status Week 4
Week 3	1	Results only route to ordering provider	May not concern ordering provider; safety	NN sorts	Cara	Workaround
Week 3	3	Superfluous inclusion criteria, i.e. "ct" & "up"	Inflating numbers	Remove superfluous search	Cara and Cal	In progress
Week 3	2	Tracking suspension verbiage inadequate	Skewing data; patient safety risk	Change verbiage	Cara and Cal	Resolved week 3
Week 3	2	Surveillance suspension verbiage inadequate	Unlear or improper documentatiom	Change verbiage	Cara and Cal	Resolved week 3
Week 4	2	Many studies with no AIF hitting dashboard	Inflating numbers	RCA	Cal F.	In progress
Week 4	3	Staging studies hitting dashboards	Inflating numbers	NN Sorts	Cara	Workaround
Week 4	2	Patients with risk for LTFU not easily ID'd	Even if low priority AIF, extra attn needed	Verbiage change; G & E req	Cara	Parking Lot
Week 5	2	Findings type dropping after editing dates	We cannot edit without losing data	Nuance Repair	Cal	In progress



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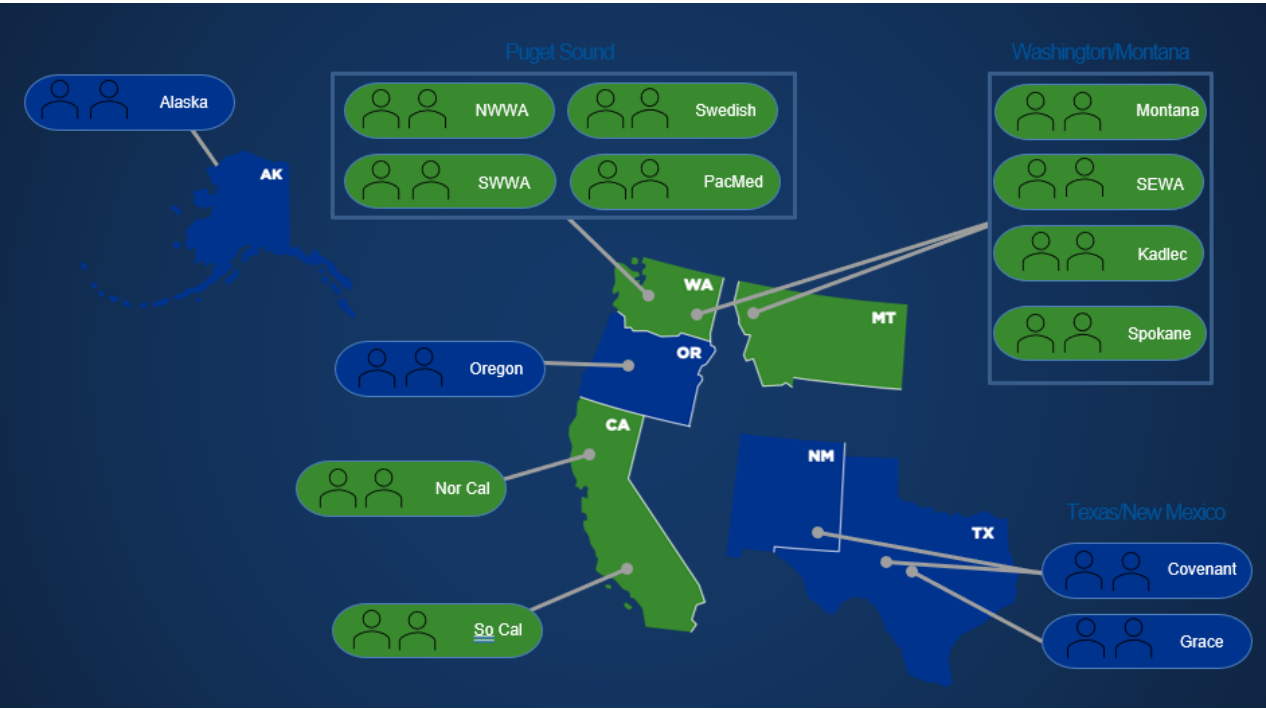
Pain Points and Hurdles

	Severity	Issue
Week 1	1	Very few studies include follow up date
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Week 1	3	LCS hitting dashboard
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Week 4	3	Staging studies hitting dashboards
Week 4	2	Patients with risk for LTFU not easily ID'd



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READY THE PROGRAM



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PROJECT OUTCOME MEASUREMENTS



- Documentation could be modified
- If modified well, instant KPI
- FUM report generation



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IMPLEMENTATION

Alert Board

Track or Reject



Tracker

Monitor or Suspend



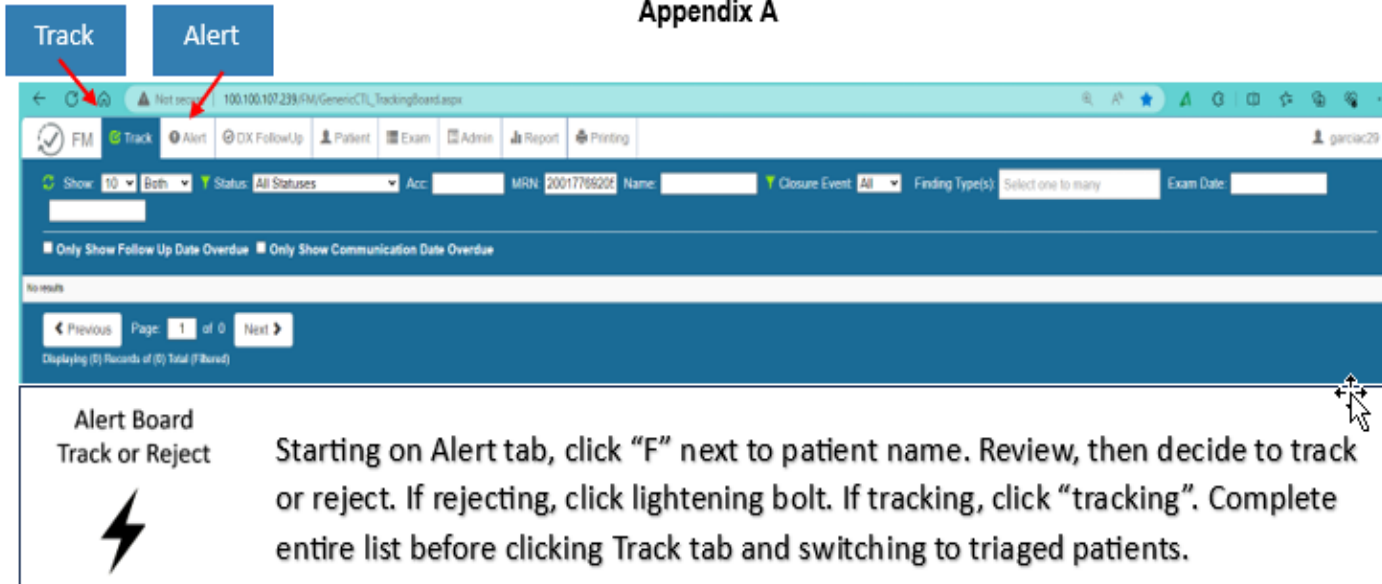
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IMPLEMENTATION

35

Appendix A

Track Alert



Alert Board
Track or Reject

Starting on Alert tab, click "F" next to patient name. Review, then decide to track or reject. If rejecting, click lightning bolt. If tracking, click "tracking". Complete entire list before clicking Track tab and switching to triaged patients.



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IMPLEMENTATION

F/U Interval Given by Rad

Enter communication due date as one day after interval end

F/U Interval Not Indicated

Enter communication due date based on guide below

Priority 1- 7 days:

Pancreatic Findings

New lesions in patients with Hx of cancer

Dissecting aneurysms

Studies with “follow up urgently, immediately, short term attention”

Priority 2- 14 days:

Lung nodules > 6 mm

Multiple new lung nodules

Priority 3 – 30 days

All others



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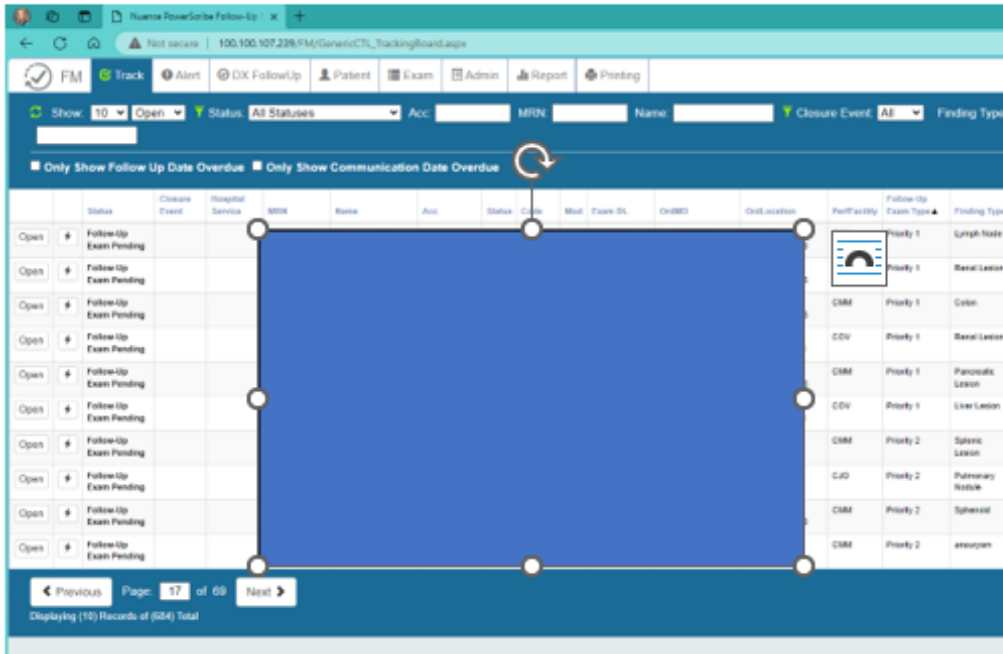
IMPLEMENTATION

Follow-Up Exam Type ▲	Finding Type
Contrast Enhanced CT Abd/PEL	Lymph Node
CT AB/PEL	Liver Lesion
CT AB/PEL	Adrenal Lesion
CT AB/PEL	Adrenal Lesion
CT AB/PEL	Pancreatic Lesion
CT AB/PEL	Pancreatic Lesion
CT AB/PEL	pancrease
ct adrenal	Adrenal Lesion
CT CHEST	Pulmonary Nodule
CT CHEST	Pulmonary Nodule



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IMPLEMENTATION



Follow-Up Exam Type ▲	Finding Type
Priority 1	Lymph Node
Priority 1	Renal Lesion
Priority 1	Colon
Priority 1	Renal Lesion
Priority 1	Pancreatic Lesion
Priority 1	Liver Lesion
Priority 1	Splenic Lesion
Priority 1	Pancreatic Lesion
Priority 1	Liver Lesion
Priority 2	Splenic Lesion
Priority 2	Pulmonary Nodule
Priority 2	Sphenoid
Priority 2	aneurysm



Mission for Life.

IMPLEMENTATION

Free Fluid/Ascites: None .

Vascular Structures: Mild common iliac artery calcified plaquing.

Reproductive Organs: Within normal limits .

Abdominal/Pelvic Wall and Surrounding Tissues: Within normal limits .

IMPRESSION:

There is no evidence of metastatic disease to the abdomen or pelvis.

Surgical changes in the lower back with probable bilateral seromas. This could be confirmed with ultrasound scanning.

Stable probable hepatic cysts.



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IMPLEMENTATION

The top 30 hedge phrases most frequently appearing in the study corpus

Hedge Phrase	Total number of Documents	Hedge Phrase	Total number of Documents
may	24,036	could be	4,739
possible*	23,002	most likely*	4,625
likely*	21,307	appear	4,301
positive	21,126	necessary	4,220
several	14,737	seems	3,882
no evidence of	13,283	probably*	3,836
evidence of	12,350	frequent*	3,580
most	12,293	never*	3,419
consistent with*	11,189	many	3,368
unremarkable	10,374	sure	3,368
few	9,769	suggest	3,328
usual	6,174	apparently	3,302
think	5,352	occasionally*	3,269
possibly*	5,350	possibility of	3,046
potential	5,116	diagnostic*	2,813



*Phrases most frequently explored in research (Hanauer et al., 2012).



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IMPLEMENTATION

FINDINGS: Minimal linear atelectasis or scar right lower lung. Fatty changes seen in the liver diffusely with no definite mass in the liver, spleen and no definite pancreatic mass. There is an area of mildly prominent common bile duct in the pancreatic head of pancreas is somewhat limited by motion artifact as is the abdomen in general. Small fat-containing umbilical region hernia. NG tube is present in the stomach. Parapelvic cysts left kidney. There are no precontrast images. On bolus contrast images, there is RAD contrast in the collecting system such that any kidney stones may be covered by this. No large exophytic renal masses seen. No lymphadenopathy is seen. Bladder RAD has contrast in it on the bolus images. Some free fluid is seen in the pelvis and there is diverticulosis of the sigmoid colon and scattered throughout the colon to lesser degree. Mild stranding seen throughout the mesentery and around the colon making it difficult to exclude mild diverticulitis or colitis but not focally intense area. A normal appendix is not definitely seen. Correlate as to appendectomy. If there is high clinical concern of appendicitis then exam with oral and IV contrast may be helpful for further evaluation given the motion. I do not see an abscess adjacent to the cecum. Stomach is decompressed but there are dilated loops of fluid in air-filled small bowel with differential air-fluid level suggesting possible small bowel obstruction seen involving the upper and mid small bowel. More distally, there are decompressed loops of small bowel that are small and this is suspicious for a mid to distal small bowel obstruction. A well-defined obstructing mass is not seen. There are arthritic changes in the hips and spine,



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IMPLEMENTATION

IMPRESSION:

Extensive colonic diverticulosis. No definite colonic polyps visualized. C1.

Several subcentimeter bilateral **rena** stones. No hydronephrosis.

Moderate sized hiatal hernia.

Note: **CT** colonography has limited detection for diminutive polyps less than or equal to 5 mm in size, the presence or absence of which would likely not change the clinical management of the patient.

C0: Inadequate study. Awaiting prior comparisons, inadequate prep or insufflation, or need for comparison studies.

C1: Normal benign **lesion**, continued screening every 5-10 years. No visible abnormalities of the colon, no polyp greater than or equal to 6 mm lipoma or inverted diverticulum, or non-neoplastic such as colonic diverticula.

C2: Intermediate polyp (6 - 9 mm, < 3 in number) or indeterminate finding. Surveillance at 3 years or colonoscopy **recommended**.

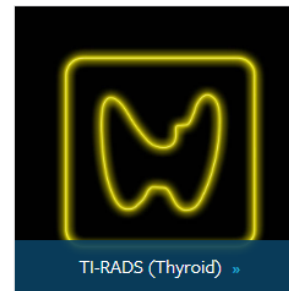
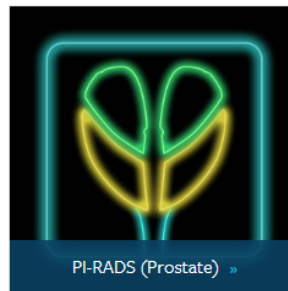
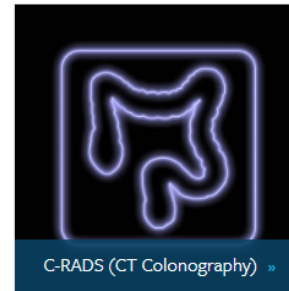
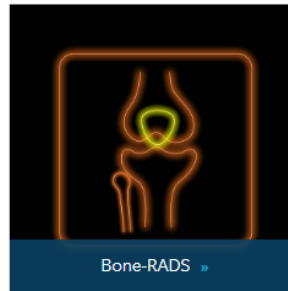
C3: Colonic polyp, possibly advanced adenoma, colonoscopy **recommended**. Colon polyp greater than or equal to 10 mm, 3 polyps each 6-9 mm.

C4: Colonic **mass**, likely malignant, surgical **consultation recommended**.



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IMPLEMENTATION



American College of Radiology. (2020)



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IMPLEMENTATION

IMPRESSION:

No acute pulmonary embolism.

Dilation of the main pulmonary artery can be seen in the setting of pulmonary hypertension.

Severe coronary atherosclerosis.

Possible mild pulmonary edema.

Bronchial wall thickening and mild mosaic attenuation in the bilateral lower lobes, which can be seen in the setting of small airways disease.

Solid pulmonary **nodule** right **upper** lobe measuring 4 mm (series 4, image 46). **Recommend follow-up** of the described **nodule(s)** according to the **following** guidelines:

Fleischner Society **Recommendations** 2017
MacMahon et al. Radiology 2017

Solid **Nodules**-Low Risk Patients:

<6 mm (single or multiple) - No routine **follow-up***

Solid **Nodules**-High Risk Patients:

<6 mm (single or multiple) - Optional **CT** at 12 months*

***Nodules** <6 mm do not require routine **follow-up**, but suspicious **nodule** morphology, **upper** lobe location, or both may warrant 12 month **follow-up**



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MEASUREMENT PLAN



- Post review
- Closed- loop
- Analysis



MEASUREMENT PLAN

Prior State

ACK / UN-ACK + Tracking

Add to Track board

FM

- ✎ Does not meet criteria
- ✎ False positive/No recommendation
- ✎ Incorrect recommendation
- ✎ Hedging language
- ✎ Missing follow up exam details
- ✎ External clinical reasons

Closure Reasons



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MEASUREMENT PLAN

ACK / UN-ACK	+ Tracking	FM
		<ul style="list-style-type: none">Hedging languageConfounding LanguageConfounding RADSNot IncidentalOut of scopeFollow Up not needed per Rad

Add to Track board

Closure Reasons



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MEASUREMENT PLAN

Prior State

Close Finding - Other Reasons - M

Select closure reason ▾

- Diagnosis-Outcome
- Non-compliance
- Resolution

Closure Category

- Lung Cancer Diagnosis
- Other Cancer Diagnosis
- Surgically Treated
- Patient Deceased

Closure Sub Category

- MD Choice
- Patient Request
- Relocated
- Unable to contact patient
- Outside facility

Send Letter

- Stable
- No Follow Up Recommended
- Sufficient documentation in EMR

Submit Cancel



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MEASUREMENT PLAN

Current State

Close Finding - Other Reasons - MPI: / MRI

Select closure reason ▾

- Diagnosis-Outcome
- **Suspending surveillance**
- Resolution

Closure Category

Closure Sub Category

Send Letter

- Active oncology care
- Surgically treated
- Staging study
- Deceased or Gravely Ill

- MD Choice
- Patient Request
- Outside Group or uninsured
- Unable to contact patient

- Stable
- Out of scope
- No Follow Up Recommended
- No Incidental Findings
- Duplicative finding



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MEASUREMENT PLAN

Table 1

Studies sent to Follow Up Manager alert board December 2023 through January 2024- Incidental findings by age range.

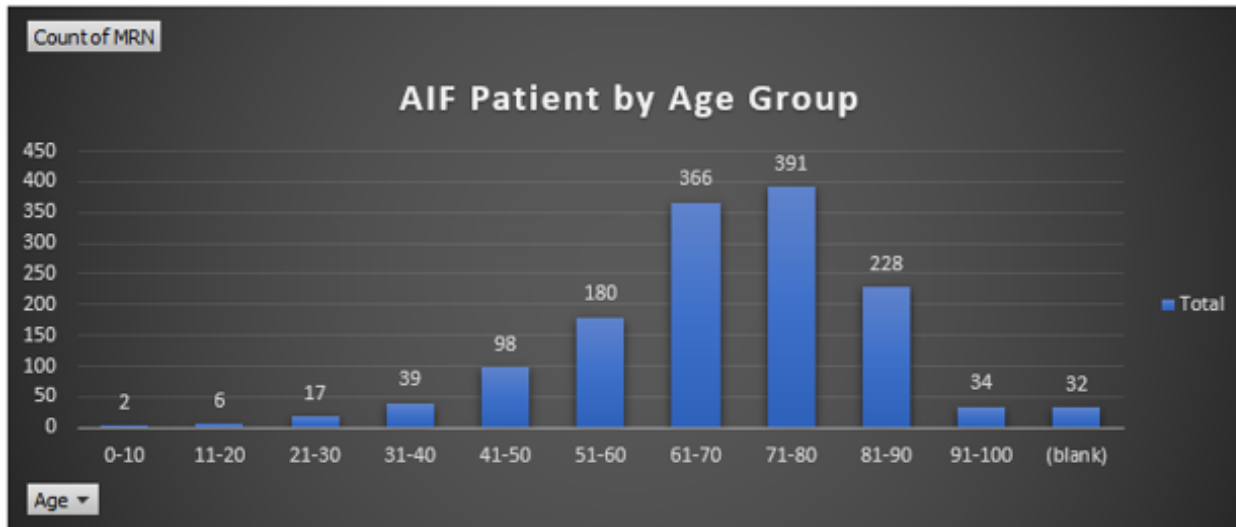
0-10	2
11-20	6
21-30	17
31-40	39
41-50	98
51-60	180
61-70	366
71-80	391
81-90	228
91-100	34
Blank	32
Total: 1399	



MEASUREMENT PLAN

Figure 1

Graphical representation of incidental findings by age table



Note. 32 studies were left "Blank" as they were duplicative studies. 32 duplicative studies, as well as studies of minors, were removed before calculating Table 2.



MEASUREMENT PLAN

Table 2

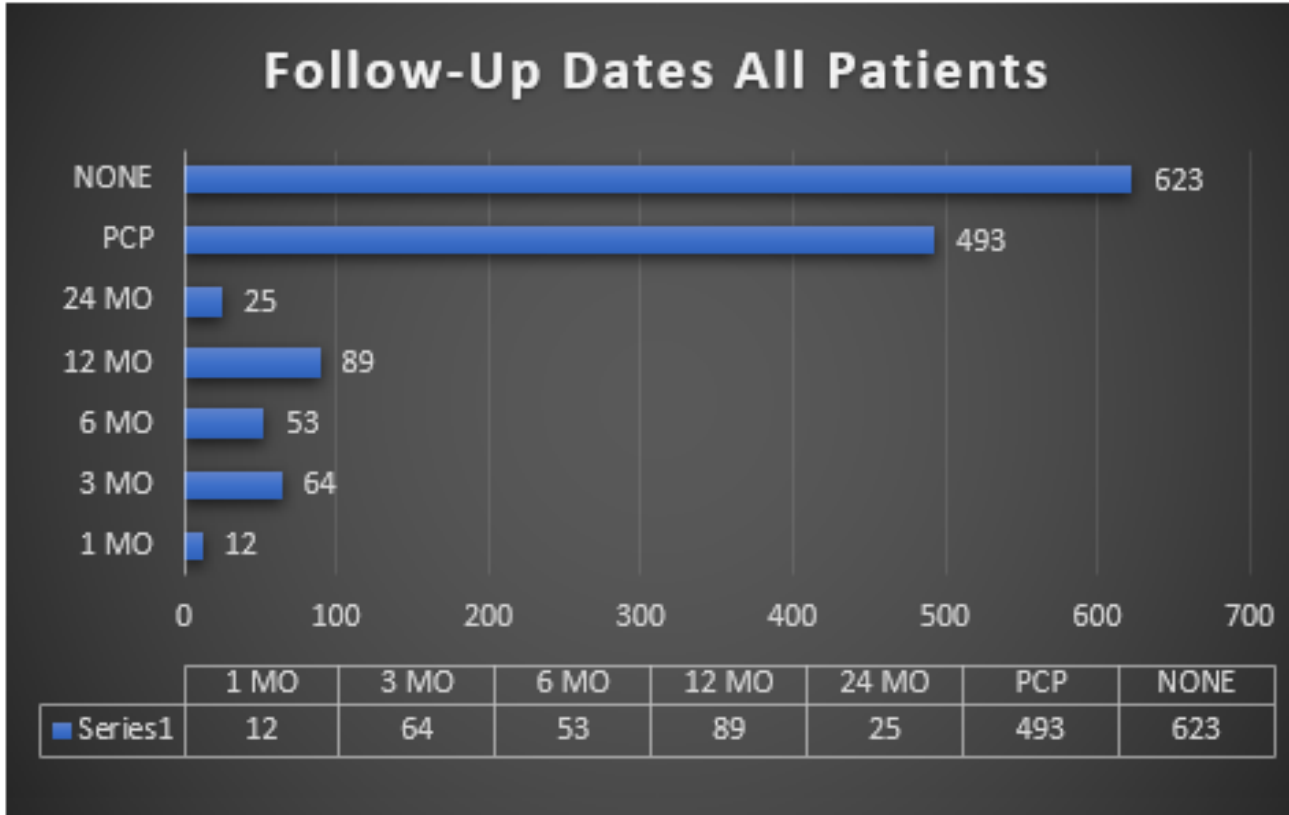
Follow up recommendations for all incidental findings December 2023 through January 2024

1 MO	12
3 MO	64
6 MO	53
12 MO	89
24 MO	25
PCP	493
None	623 = 1359

Note. 1359 patients after removal of minors and duplicative studies.



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MEASUREMENT PLAN

Table 3

Studies sent to Follow Up Manager alert board December 2023 through January 2024

+			
Total Studies Explored			1399
Removal reasons:	Not Pulmonary Finding		-1125
	Duplicate Findings		-32
	Minor		-8
Studies remaining			234
			□

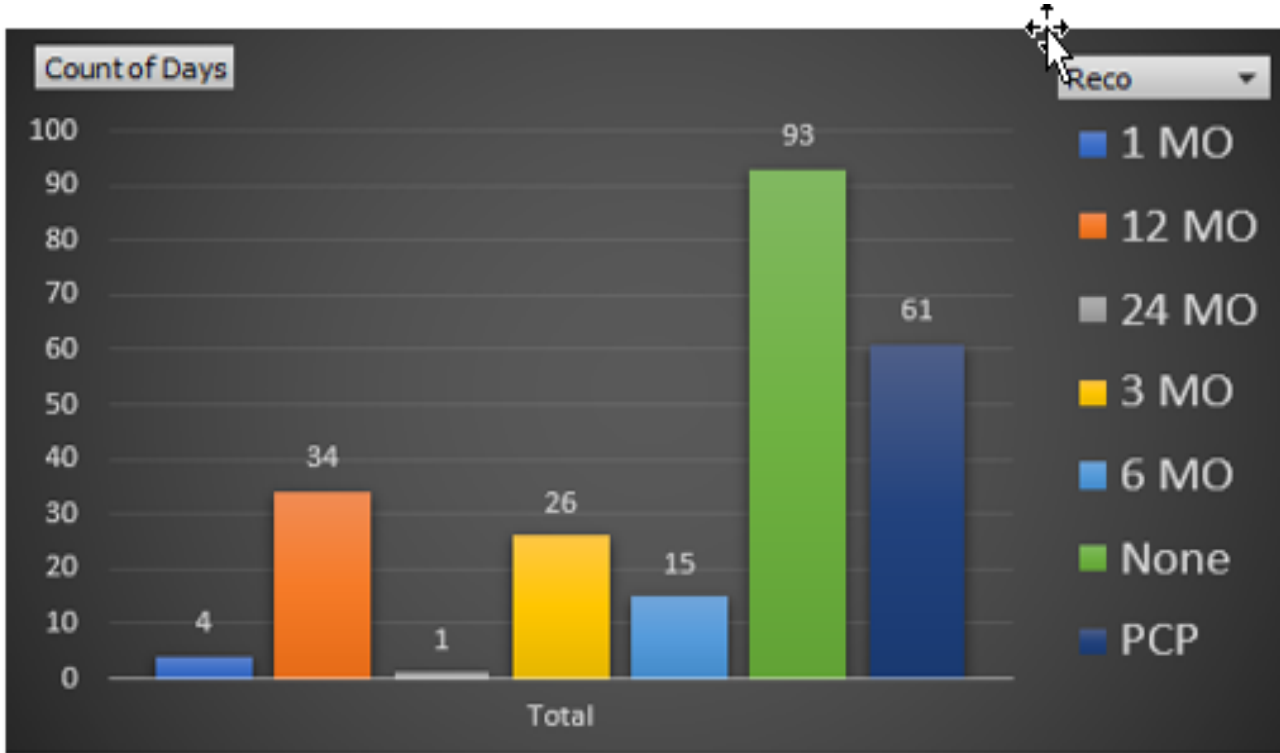
Table 4

Follow up recommendations for pulmonary incidental findings December 2023 through January 2024

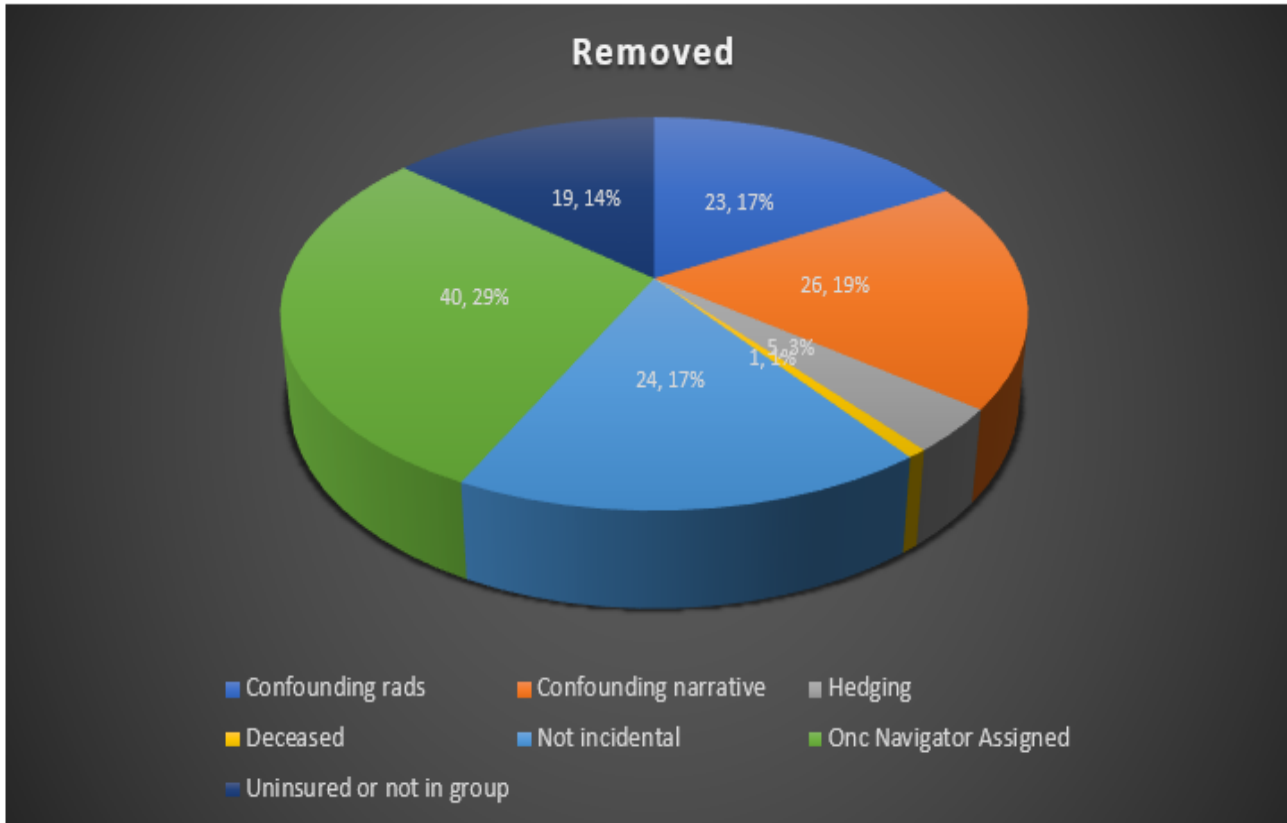
1 MO	4
3 MO	26
6 MO	15
12 MO	34
24 MO	1
PCP	61
None	93 = 234



MEASUREMENT PLAN



MEASUREMENT PLAN



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MEASUREMENT PLAN

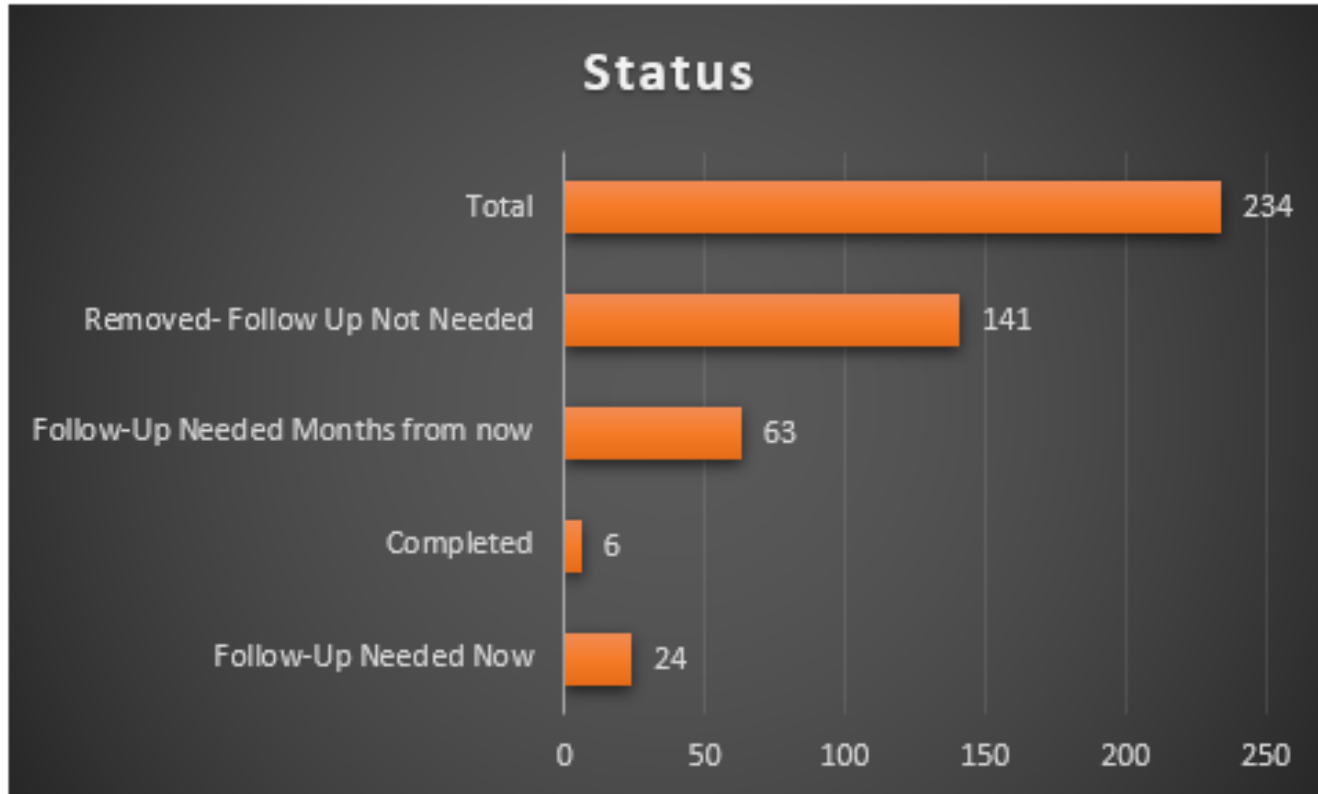
Table 5

Pulmonary findings studies were analyzed for their actionable relevance. If findings are not actionable, they do not meet criteria for being added to the alert board, and should be removed

Completed	6
Follow-Up Needed Now	23
Follow-Up Needed Months from Now	36
Removed- Follow-Up Not Needed	142
Total	234



MEASUREMENT PLAN



MEASUREMENT PLAN

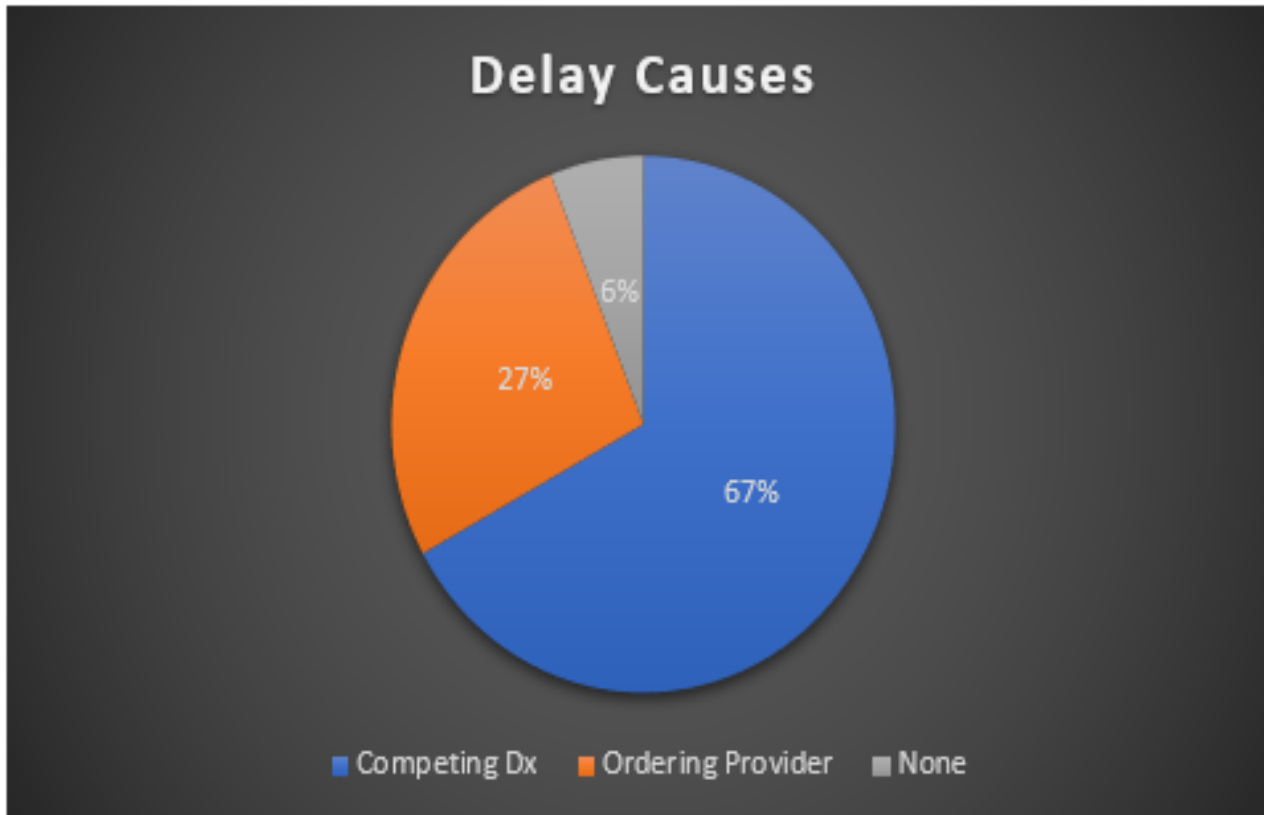
Table 6

Days Taken for Patient to be Notified and Potential Causes

Days Until <u>Notified</u>	Competing Diagnosis	OPA	None
1			
2			
3			
4			
6	3		
7	1		1
8	1		
9		2	
10	3		
14		2	
20	1		
30	1		



MEASUREMENT PLAN



HANDOFF PLAN



- Video-supported slide deck
- Workflow guide.
- Imaging leadership deck
- Guide on running metrics



HANDOFF PLAN



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American Hospital Association. (n.d.).

CONCLUSION



- Capstone refresh
- Problem
- Purpose
- Tools created
- Project issues
- Enhancements
- Data Analysis
- Measurement
- Hand off



QUESTIONS?



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