Development of an In-House CT Dose Monitoring and Management System Using Open-Source Resources – Pearls and Pitfalls

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The Hidden Dangers of Medical Sca

Content of This Talk

- Motivation and design of an in-house CT dose monitoring system
- Steps of implementing such a project
- Pitfalls we went through and lessons we learned

Background: Dose Concerns and Regulatory Requirements

The rise of concerns of medically induced radiation

- CT: #1 dose contributor
- Waves of articles in lay media
- Requirements from ACR accreditation (effective Dec/



JC Requirements

- In a brief summary, hospitals need to
 - <u>Review protocols</u> periodically and keep protocols current with input from interpreting radiologist, medical physicist and lead imaging technologist.
 - <u>Bench mark dose levels</u> with external references.
- <u>Set up dose thresholds</u> specific to individual exam types.
- These are non-trivial tasks!

Challenges: Highly Fragmented Data

- An extreme example from a workhorse GE CT750
- 18 mo. of data, 16587 exams
- 708 protocols in exam records
- on average 23.4 exams/protocol
- A disaster to manually analyze the data
- Protocols fine-tuned & individualized for
 Advanced features, e.g., dual energy CT, MAR
 -
- Patient size/ageClinical indication: baseline vs. follow up
- Mixture of old and new data in the exam records
- Fleet of scanners from different vendors and models

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Challenges: The Clash of Names

- Synonyms, abbreviations, and typos exist in protocol names, e.g.,
 - Abdomen/Pelvis, ABP, Abd/Pel, Abd-Pel
 - Cancer Follow Up, CA FU, CA-FU, CAFU, CA F/U
 - Above 300 lbs, > 300 lbs, 300+ lbs, above 300
 - Without contrast, I-, C-, NON-CON, W/O
 - Thorax vs. Chest, etc.



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Opportunities

- Great opportunity to solve these problems and to make innovations
- Radiation Dose Structured Report (RDSR) became widely available, thanks to the MITA XR29 initiative MITA SMART INITIATIVE



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Motivation and the Planning Phase

Motivation

- Geeks with enthusiasm in informatics and desire to demonstrate value
- High level of desired flexibility of the system
- Supportive department Open source software resources!
- Top level design: two subsystems
- A light-weight dose information collection system with simple user interface A flexible and evolving data analysis framework for dose tracking and protocol management
- Figure out what data to collect from PACS and other hospital IT systems

A Good Wealth of Dose Info from PACS

•	F	our possible sources of CT dose info from PACS
		Radiation Dose Structured Report (RDSR)

 Ea	sy to p	arse		

- Contain info of the entire exam and of individual scan series
- Dose summary images
- Scout images Axial images
- Logic Ottom Nation Nation Nation CTS-re CTS-re LCOST CTS-re LCOST Nation CTS-re LCOST Small-footprint data collection
- RDSR + scout images + dose summary images
- Several megabytes per exam

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CT Dose Info in RDSR from Multiple Vendor/Models

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CT Dose Info <u>Not</u> Globally Available

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Steps of Implementation: Data Collection



Implementation of major sub-systems



- Data mining
- Exam level vs. Event level
- Event level: about individual scans
 E.g., kVp, mAs, per-series CTDIv
- Exam level: about the entire exam
- E.g., total DLP, total mAs, etc.









HTML-Based User Interface of the Data Collection System

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Need for Automated Data Selection

 With the wealth of data (5000+ exams per month at my institute), how to smartly select the right data to answer various questions is the key.



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Data Mining: Cleansing, Validation, and Classification

- Data cleansing and validation against
 - Non-patients CT scans
 - Duplicated records
- Parse and normalize protocol names
- To solve the "clash of names"
- To build classifiers for the dose data
- To group data for presentation

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Candidates of Standardized Imaging Procedure Names

Scan protocol names

- The protocols that techs can choose on scanners
- The targets for the protocol review
- E.g., C- Chest, AAA, LYMPH/GEN ABD/PEL
- Study description
 - Orderables or billing code names
- Pulled by CT from RIS/ordering system
- Available on all scanners
- □ E.g. CT CHEST W/CONTRAST, CT 3D RENDERING W/POST PROCESSING
- ACR-DIR allows both as local exam names to be mapped to standardized exam names (RadLex Playbook or ACR Common)

Data Mining: Protocol Name Normalization

- A protocol name usually contains
 - The "core protocol name", i.e., text representing the essential meaning of the protocol
 - Many descriptive phrases
 - Some can be removed without losing essential information
 - E.g. revision date/time
 - You can decide what other parts to be included in the normalized names



Protocol Decomposition

Protocol names can be decomposed automatically:





Protocol Decomposing Results

Result: each long protocol name is decomposed into the core part and various descriptors



Zhang, D., Savage, C.A., Li, X. 26Uu, B., 2015. Data-Driven CT Protocol Review and Management rai of the American College of Radiology, 10(3), pp. 267-272.

Key Points of Implementing the Data Mining Framework

- Make use of established building blocks.
 - Find/extend the right wheelsRe-invent the wheels



NumPy

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- Selected building blocks in Python toolchain
- Numpy: numerical calculation and array support
- Matplotlib: data presentation
 Matplotlib
- Python's built-in regular expression module
 Pandas: data handling, aggregation, and selection

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Key Points of Implementing the Data Mining Framework

- Modular design (OOP) of data selection and presentation
- Script-driven
 - Explore data interactively
 - Prepare for data presentation in batch-processing
- Build flexible data selection criteria using regular expressions for including and excluding desired patterns
 - (inclusion_regex, exclusion_regex), (INC, EXC), (INC, EXC), ...



Some Results: Interactive Exploration of Dose Data

- Example: tentative search for "Chest Pain"
 - Results include protocols covering diff body parts
 - $\hfill\square$ I want to exclude the ABP exams in this search





Some Results: Interactive Exploration of Dose Data

- A refined search of "chest pain"
 Excluded all "ABP" exam types
- Note the script driven query and processing
- Easy to run in batch mode



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Graphical Exploration of Dose Data: Histogram

Histogram: checking consistency of dose behavior across multiple CTs

Messy with too many scanners' data





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Graphical Exploration of Dose Data: Histogram

- Similar distribution observed from 3 GE 750 scanners
- Size-specific protocols: 3 BMI groups, 3 peaks



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Graphical Exploration of Dose Data: Histogram

Histogram also helps avoid errors in protocol classification













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Graphical Exploration of Dose Data: Scatter Plot

- Scatter plot of DLP vs. CTDIv gives sense of total scanned length (and repeated scans)
- Approximately, DLP/CTDIv ~ scan length



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Graphical Exploration of Dose Data: Scatter Plot

- Scatter plot of scan events and "irradiation" events gives sense of how many radiation events are made
 - NON GATED CHEST PAIN Irradiation Events vs. CTDI Events E.g., most exams of Non-Gated Chest Pain
 - 1 true CT scan
 - 4-5 total irradiation events
 - CT scan Scout views
 - Monitoring phases

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Note: marker size **c** # of occurrence



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Graphical Exploration of Dose Data: Box Plot

- Boxplots is very useful for comparison across CT scanners
 - $\hfill \hfill \hfill$ Compare against ACR DIR



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Graphical Exploration of Dose Data: Box Plot

- Boxplots can also be used to show the changes over time
 - ABD/PEL exam from one scanner
 Combined result from 8 protocols
 - CT-5 CTDV vs ACR DIR for: Abd Pel CTDV vs ACR DIR for: Abd Pel

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Graphical Exploration of Dose Data: Run Chart

Run-charts can also be used to show the changes over time, across scanners













Graphical Exploration of Dose Data: Run Chart of Volume

When combining all protocols from many scanners together



Graphical Exploration of Dose Data: Pie Chart

 Pie charts for evaluating the complexity of the protocol space Milton-New-CT



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From Pie Chart to Cumulative Percentage





Graphical Exploration of Dose Data: Pie Chart

Pie charts also useful to show the coverage of a protocol review session
 CTQA review for a satellite facility, percentage of coverage: 86%



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Conclusions/Comments

- With freely available software and some local expertise, a highly flexible and usable dose management system can be configured.
- There are non-trivial challenges in terms of data fragmentation, non-standard lexicon, and inconsistencies in the adoption of RDSR capabilities across vendors and platforms.
- The data-rich review process can be very helpful for CT dose and protocol optimization.

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Thank you for your attention!