

Quantitative Imaging Research and Artificial Intelligence Lab

Data Management Pipeline for AI Research in Radiation Oncology

Background:

To build AI for health care, data is required

Data has to be accessible, complete and privacy-preserved.

Radiation Oncology department has vast amounts of data

However, data is in multiple silos, sometimes in non-minable formats

We need processes to ensure data quality, mechanisms to manage data from multiple sources and privacy-preserved for AI research.

Presenter: Dr Balu Krishna S,

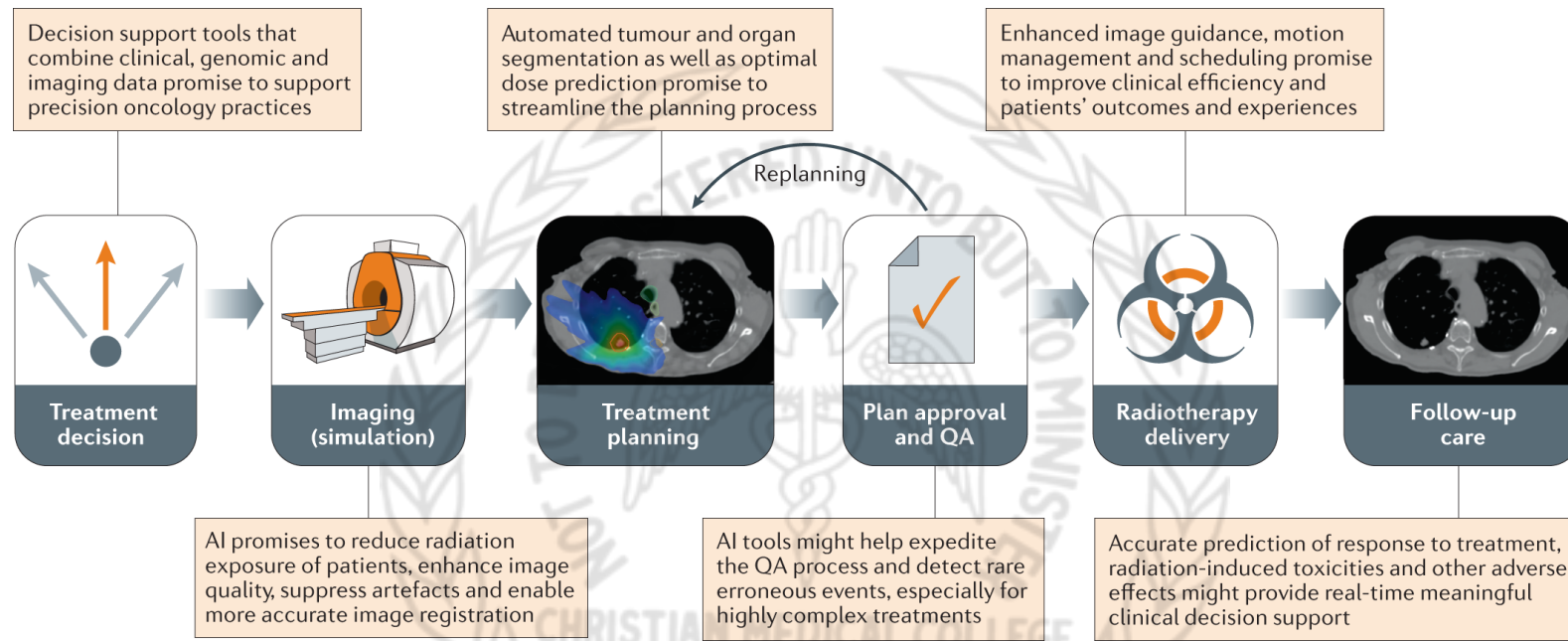
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CMC Vellore

AI in Radiation Oncology



https://media.springernature.com/full/springer-static/image/art%3A10.1038%2Fs41571-020-0417-8/MediaObjects/41571_2020_417_Fig1_HTML.png

PROJECT GOALS

- Develop a robust data preparation pipeline tailored for AI integration in Radiation Oncology.
- Integrate the pipeline seamlessly within existing clinical workflows.
- Ensure high-quality data curation, annotation, and storage for AI research.
- Use open-source solutions in processes for wider applicability and sustainability.
- Provide practical insights and frameworks tailored to specific contexts.

ROADMAP

2019

1. Research question

- Define research objectives specific to radiation oncology
- Consider prevalent cancer types and treatment from Indian context
 - Identify relevant AI techniques to address the question
 - Disease classification, outcome prediction, risk stratification?

2. Build an interdisciplinary team

- Leverage diverse expertise
- E.g. Radiation oncologists, medical physicists, radiation therapists, AI experts, and data scientists

3. Infrastructure and Resources

- High-performance computing systems (Workstations, GPU, cloud computing), storage solutions (on -premise, cloud), and software tools tailored for specific project.

4. Data Collection and Curation

- Diverse and comprehensive datasets
- Data anonymization, privacy protection, and compliance with Indian data protection laws

2021

5. AI Model Development

- Use appropriate machine learning, deep learning, and image analysis algorithms to develop AI models

2022-23

6. Validation and Clinical Integration

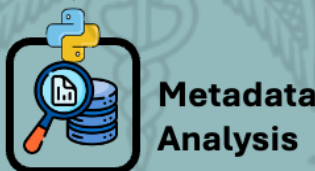
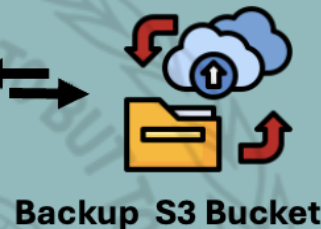
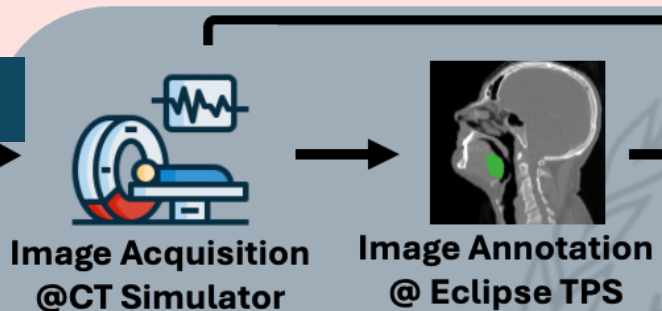
- Validate the models using external multi-centric data
- Assess impact on patient outcomes through prospective studies and clinical trials.

First use case: Head and Neck cancers

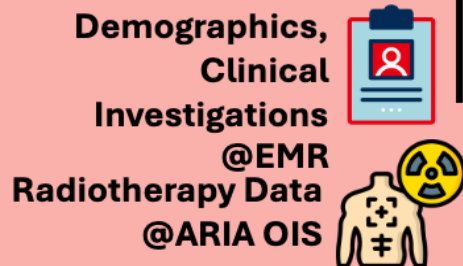
Clinical Environment

Research Environment

Imaging Data



Patient Consent



Clinical Data

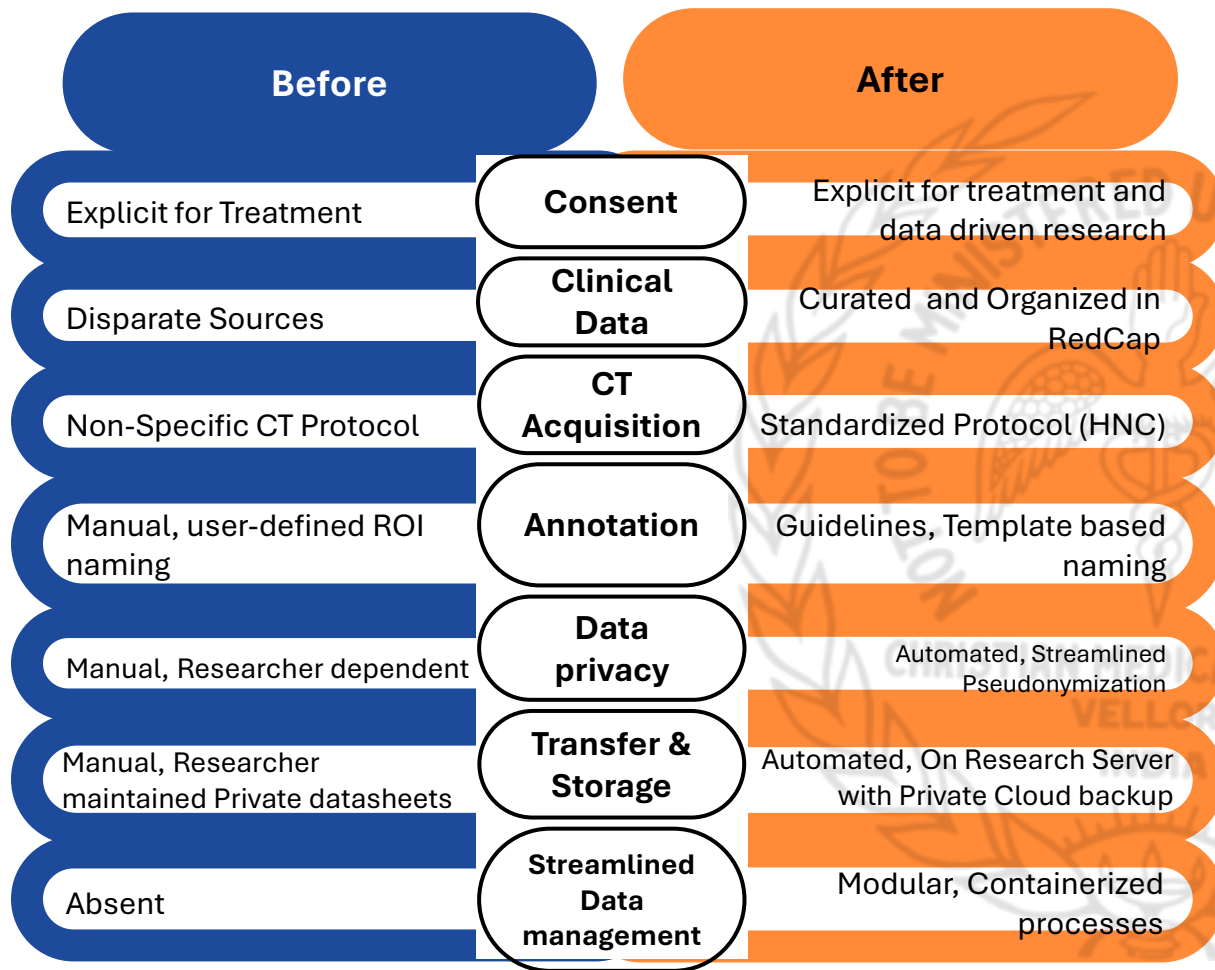
Data Curation

De-Identification

Storage

AI models





- The CT imaging protocol for HNC was standardized in 2020
- 1100+ patients were imaged since.
- 400+ eligible patients for AI - based prediction of LRC have comprehensive Clinical data curated in Redcap and imaging data on the Research Server.

OUTCOMES

- **Modularization** of the processes into distinct, self-contained modules
- Allows standardization and low complexity
- Possibility of customization for each project and situational needs.
- **Containerization** facilitates faster deployment of the modules required for each project.
- **Sustainable by design:** Integration with the clinical environment is achieved through open-source platforms like Orthanc DICOM server and XNAT
- **Collaborative:** Good data and easy-to-use processes facilitated newer projects.
- **Scalable :** Allows deployment for multiple projects.

8 + Projects
5 + Collaborations
10 + publications

Journal of Gastrointestinal Cancer
Can Pretreatment MRI and Planning CT Radiomics Improve Prediction of Complete Pathological Response in Locally Advanced Rectal Cancer Following Neoadjuvant Treatment?
Jeba Karunya Ramireddy, A. Sathya, Balu Krishna Sasidharan, Amal Joseph Varghese, Arvind Sathyamurthy, Neenu Oliver John, Anuradha Chandramohan, Ashish Singh, Anjana Joel, Rohin Mittal, Dipti Masih, Kripa Varghese, Grace Rebekah, Thomas Samuel Ram & Hannah Mary T. Thomas
Journal of Gastrointestinal Cancer (2024)

Acta Neurochirurgica
Is radiomics a useful addition to magnetic resonance imaging in the preoperative classification of PitNETs?
Sathya A, Abhijit Goyal-Honavar, Ari G Chacko, Anitha Jasper, Geeta Chacko, Devadhas Devakumar, Joshua Anand Seelam, Balu Krishna Sasidharan, Simon P Pavamani & Hannah Mary T Thomas
Acta Neurochirurgica (2024)

Journal of Gastrointestinal Cancer
Can pre-treatment MRI and CT radiomics improve prediction of complete pathological response in locally advanced rectal cancer following neoadjuvant treatment?
Jeba Karunya Reddy, A Sathya, Amal Joseph Varghese, Arvind Sathyamurthy, Neenu Oliver John, Anuradha Chandramohan, Ashish Singh, Anjana Joel, Rohin Mittal, Dipti Masih, Kripa Varghese, Thomas Samuel Ram, Hannah Mary T Thomas
This is a preprint (2024)

Applied Sciences
Reproducibility in Radiomics: A Comparison of Feature Extraction Methods and Two Independent Datasets
Hannah Mary T. Thomas, Helen Y. C. Wang, Amal Joseph Varghese, Ellen M. Donovan, Chris P. South, Helen Saxby, Andrew Nisbet, Vineet Prakash, Balu Krishna Sasidharan, Simon Pradeep Pavamani, Devakumar D., Manu Mathew, Rajesh Gunasingam Isiah and Philip M. Evans
Applied Sciences (2023)

phiRO
Multi-centre Radiomics for prediction of recurrence following Radical Radiotherapy for Head and Neck Cancers: Consequences of feature selection, machine learning classifiers and batch-effect harmonization
Amal Joseph Varghese, Varsha Gouthamchand, S. Balu Krishna, Leonard Wee, Sharief K. Sidhique, Julia Priyadarshini Rao, Andre Dekker, Frank Hoebbers, D. Devakumar, Aparna Irodi, Timothy Peace Balasingh, Henry Finlay Godson, T. Joel, Manu Mathew, Rajesh Isiah, Simon Pavamani, T. Hannah Mary Thomas
Physics and Imaging in Radiation Oncology (2023)

IEEE
Quantum of Corneal Scarring Calculation by Image Analysis of Anterior Segment OCT Images
Cassandra D Solomons, Ammu Anna Mathew, Karthikeyan V, Vivekanandan Shanmugasundaram, Hannah Mary Thomas, A Sathya, Jeyanth Rose
IEEE (2022)

Discover Oncology
Radiation and immune checkpoint inhibitor-mediated pneumonitis risk stratification in patients with locally advanced non-small cell lung cancer: role of functional lung radiomics?
Hannah M. T. Thomas, Daniel S. Hippe, Parisa Forouzannezhad, Balu Krishna Sasidharan, Paul E. Kinahan, Robert S. Miyaoka, Hubert J. Vesselle, Ramesh Rengan, Jing Zeng & Stephen R. Bowen
Discover Oncology (2022)

Journal of Gastrointestinal Cancer
Utility of Mid-treatment DWI in Selecting Pathological Responders to Neoadjuvant Chemoradiotherapy in Locally Advanced Esophageal Cancer
Neenu Oliver John, Aparna Irodi, Hannah Mary T. Thomas, Vijay Abraham, Balu Krishna Sasidharan, Subhashini John & Simon P. Pavamani
Journal of Gastrointestinal Cancer (2022)

International Journal of Radiation Oncology - Biology - Physics (IJOB)
Can CBCT-Based Delta Radiomics Predict Normal Lung Toxicity during Thoracic Radiation?
N. Jose, A.J. Varghese, H.M. Thomas, A. Irodi, J.C. Paul, M. Mathew, R. Isiah, S. John, H.F. Godson, T.B. Peace, S.P. Pavamani, D. Devadhas, B.K. Sasidharan
International Journal of Radiation Oncology - Biology - Physics (IJOB) (2022)

<https://qirail.cmcvellore.edu.in>



How can CAHO partner/impact?

- **QIRAIL is initiating a consortium for**
- **Creating Privacy Preserving data**
- **Federated learning based model development**

- **How can we expand and provide at scale? CAHO network**
 - **Collaborate on clinical questions**
 - **Collaborate with us on technology and infrastructure**
 - **Be external validation partners for our models**
 - **Raise Funds for specific use cases**
 - **Technology interns for stipulated time or specific projects to work on real world data**

