Explainability for Artificial Intelligence in Healthcare

Lifang He, Ph.D.

Dept. of Computer Science & Engineering

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Outline

- Introduction
- Explainable AI for Healthcare
 - What is Explainability in AI?
 - Why is Explainability Important in Healthcare?
 - Challenges in Explainability
 - Methods for Achieving Explainability
- Future Directions



Importance of Healthcare

- Quality of Life
- Life Expectancy
- Social and Economic Impact



Role of AI in Healthcare

- Diagnosis and Treatment Personalized Medicine
- **Drug Discovery**

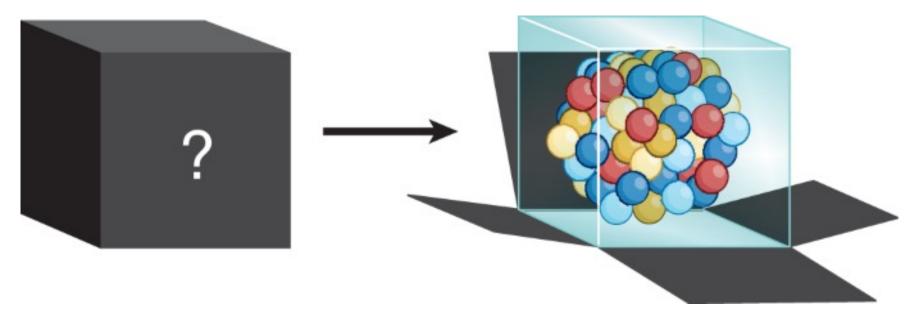
- Operations and Logistics



Explainable AI for Healthcare

What is Explainability?

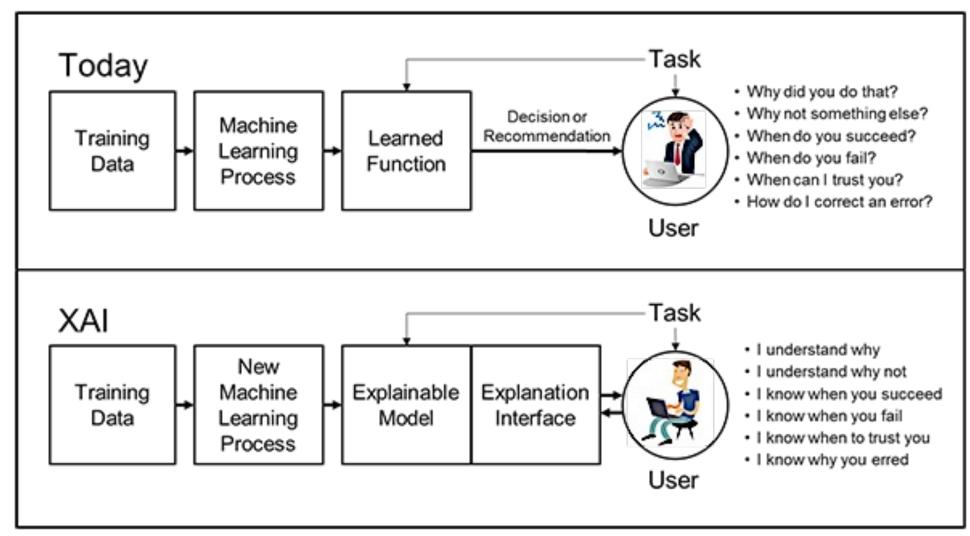
 Explainability in the context of AI refers to the ability of a model to provide understandable and interpretable outputs or decisions.



Black Box AI

Explainable AI (XAI)

Al vs. Explainable Al

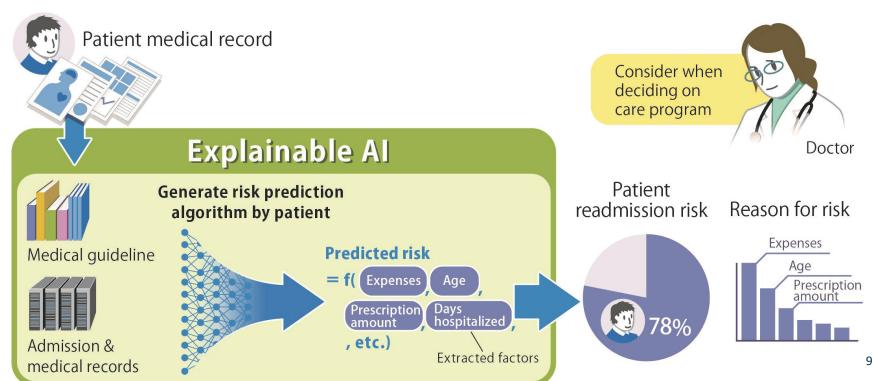


Why is Explainability Important in Healthcare?

Transparency

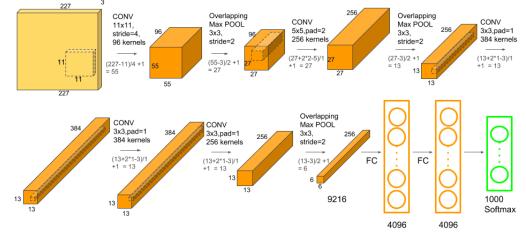
Trust

- Accountability
- Medical Ethics and Legal Compliance
- Reducing Impact of Model Biasing



Challenges in Explainability

- Trade-off between Performance and Explainability
- Complexity of Models



Linear Regression

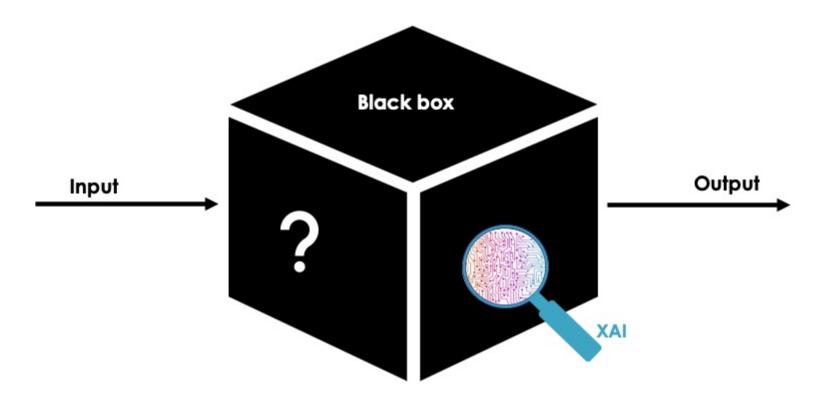
(3 parameters)

AlexNet

(62.3 million parameters)

Methods for Achieving Explainability

- Post-hoc Analysis
- Interpretable Models
- Visual Tools

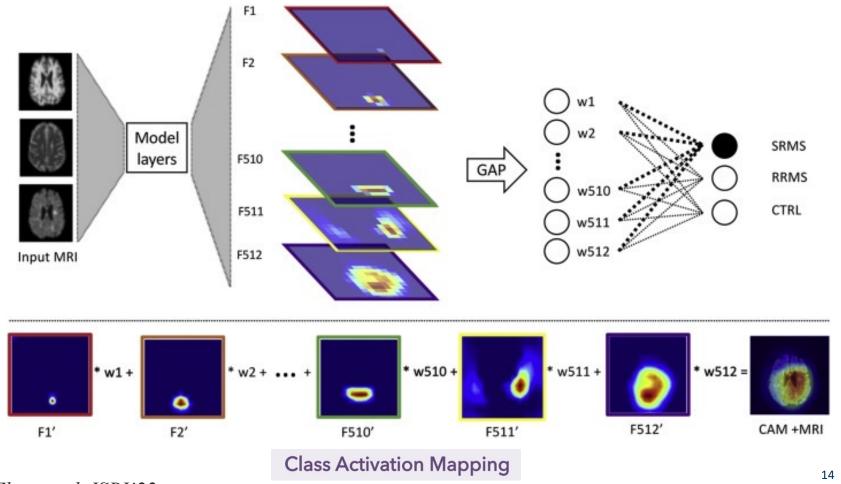


Examples of Explainable AI in Healthcare

- Case Study 1 Post-hoc Analysis
- Case Study 2 Interpretable Models
- Case Study 3 Visual Tools

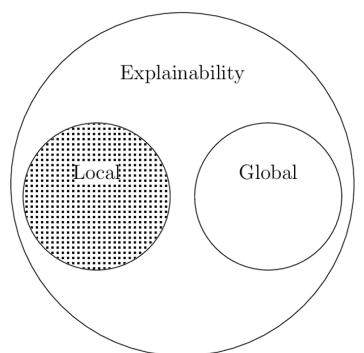
Case Study 1 - Post-hoc Analysis

Gradient-weighted Class Activation Mapping (Grad-CAM)



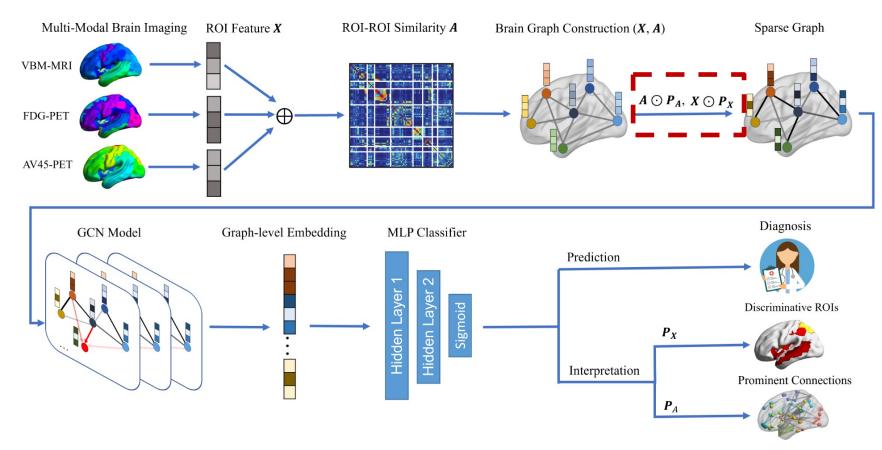
Case Study 1 - Post-hoc Analysis (Cont'd)

- Local Explainability (e.g., LIME): Understanding a specific decision made by the model.
- Global Explainability (e.g., SHAP): Understanding the entire model and how it makes decisions.



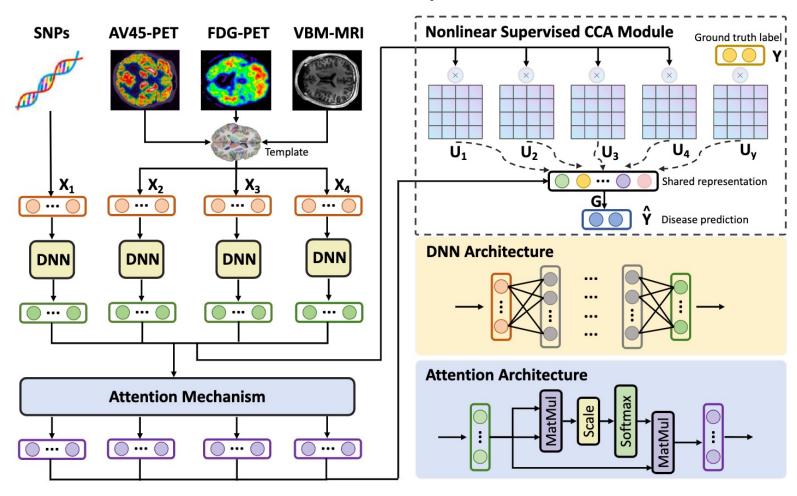
Case Study 2 - Interpretable Models

Sparsity for Explanation



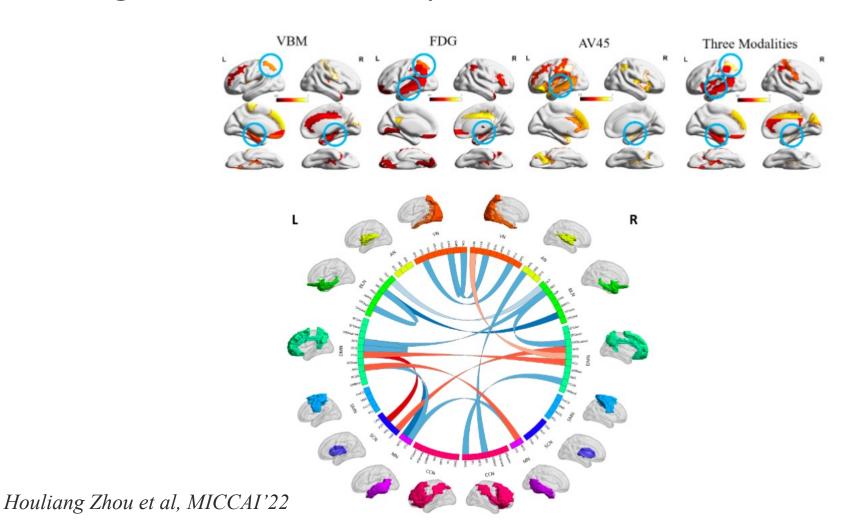
Case Study 2 - Interpretable Models (Cont'd)

Attention Mechanisms for Explanation



Case Study 3 - Visual Tools

Region and Connectivity Visualization for Brain Network

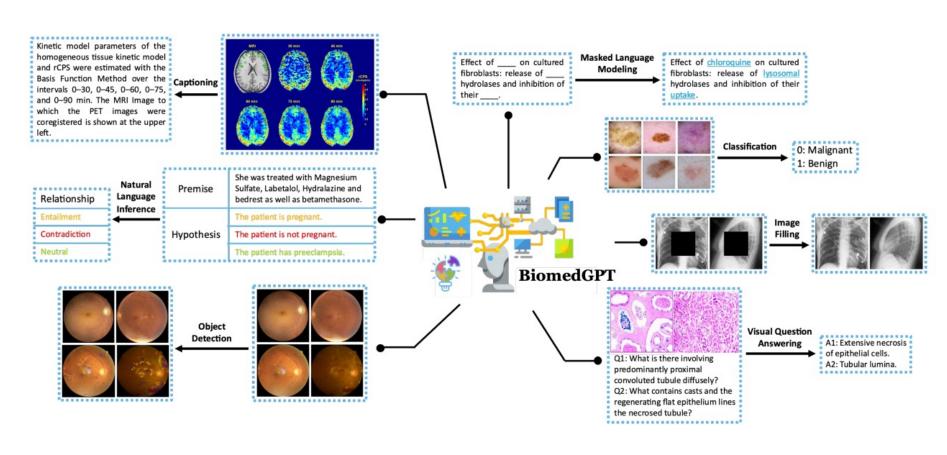


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Future Directions

Future Trend in Healthcare

Harnessing Medical Data Variety and Other Technologies



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Research and Development

- Real-world Validation: instead of controlled environments.
- Explainability Metrics: standardized metrics to evaluate XAI.
- Human-Al Collaboration: how Al can augment human decision-making in healthcare, rather than replace it.
- Ethical AI: creating AI models that are not just accurate but also ethical, unbiased, and just.
- Interdisciplinary Research: collaboration between healthcare professionals and AI researchers.

Policy Considerations

- Regulatory Frameworks: developing robust regulatory frameworks that can adapt to AI.
- Data Privacy: policies that protect patient data and ensure that it is used responsibly.
- Transparency Standards: policies that disclose how the AI models work.

Q&A

Lifang He, Ph.D.

lih319@lehigh.edu

