Explainable Artificial Intelligence (XAI): Concepts and Challenges in Healthcare

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The Increasing Prevalence of AI

– Applications across various fields

- Econometrics, Biometry, E-Commerce, Automotives...

– Widely used in Healthcare

- Clinical Decision Support (CDS)
- Medical Imaging Analysis
- Analysis of Pathology and Radiology Reports
- Emerging Applications of LLMs

Importance of XAI in Healthcare

– AI in healthcare presents various challenges

- Bias
- Privacy and Security
- Trust and Accuracy
- Explainable AI (XAI) can mitigate these issues
 - XAI can reveal issues of bias and privacy in training data
 - Transparent models will be more trusted by users

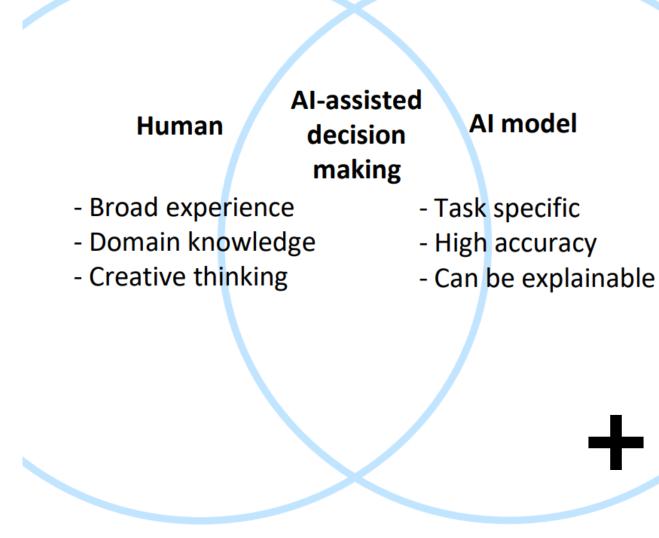
XAI Taxonomy

- Ante-Hoc: Inherently explainable models
 - Simple models (e.g., decision trees)
 - No additional explanation needed
- Post-Hoc: "Black-box" models with layer of added explanation
 - Complex models (e.g., neural nets)
 - May require diverse means of explanation

Black box models	Transparent models
Random forest	Bayesian models Logistic regression
Deep learning Incre	asing explainability Linear regression
Neural networks	Decision trees Rule-based learning
	General additive models
	Post-hoc explanations

Human-XAI Collaboration

- Humans must not be "replaced" by AI at any stage of diagnosis or treatment
- Rather, clinicians and patients should work in tandem with AI to get the most value from it
- XAI enables this collaboration
 - "Explainability allows developers to identify shortcomings in a system and allows clinicians to be confident in the decisions they make with the support of AI"

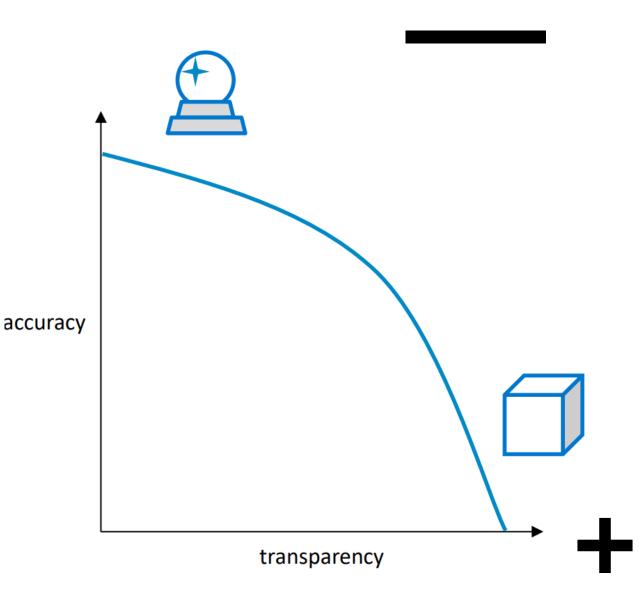


Promising XAI Paradigms for Healthcare

- Scientific XAI
 - Focuses on producing a bona fide scientific explanation, rather than simply describing "how" a model arrived at a medical decision
- Granular Computing (GrC)
 - Information is divided and processed in "granules". This can help connect abstract concepts and decisions to concrete data
- Fuzzy Modeling (FM)
 - Represents a model's decision-making process in a way that is more intuitive and interpretable; useful complement to GrC

Challenges for XAI in Healthcare

- Privacy and security
- Accuracy-explainability trade-off
- "Overtrust" in AI decisions
- Assessing Explainability
- Increasing complexity of models



Discussion

- Do we feel comfortable allowing AI to make predictions and be used in healthcare settings, such as for analyzing scans?
- Will AI remain in a purely supporting role for clinicians, or will it eventually make critical healthcare decisions without human involvement?
- Would you trust a usually accurate but opaque AI to make decisions about your healthcare? Or is explainability a necessity in healthcare?