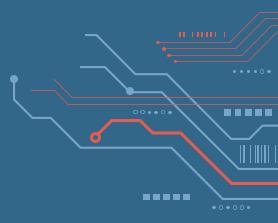


Discussion 5

Ethical considerations of models once deployed



Recap of Case Study

- Your AI model has been deployed in the local hospital's emergency department
- Model automates the ordering of tests (this speeds up and standardizes) how we deliver care
- Model was validated with a 92% accuracy
- Each group has a different model architecture, with different development and validation processes





Deployment Considerations

- Data Drift: Gradual change in data distribution over time in deployed settings
- Model errors how are these identified and reported? Who is liable





Discussion 5 – Questions: Considerations

- How are models monitored overtime?
- What changes in performance are considered noteworthy?
- What responsibilities do developers have? Clinicians?
 Regulators?







TIME TO SHARE WITH THE LARGE GROUP

Share both overall thoughts – as well as those specific to your model's architecture and validation process

LARGE GROUP DISCUSSION

Consider your model type in communicating your thoughts to the group



Non-Generative Model

Model C

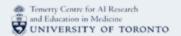
Multimodal Model



Non-generative, Image-based Model



Generative Model

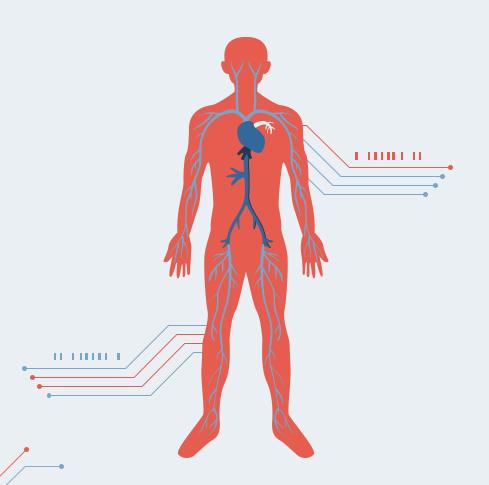






EVIDENCE & RESOURCES

In the following slides, we recommend relevant evidence and resources related to this discussion



Challenges of automation & "human in the loop"

Humans are not good monitors

- If nothing happens, we stop paying attention
- Loss of situational awareness

Loss of critical skills from lack of practice

- Deskilling
- Never-skilling



Bainbridge. Ironies of automation. Automatica, Volume 19, Issue 6,1983, Pages 775-779



Ethical Duties of Various Roles

AMA Framework



Source: https://www.ama-assn.org/practice-management/digital-health/advancing-health-care-ai-through-ethics-evidence-and-equity





RESPONSIBILITY	DEVELOPER	DEPLOYER	PHYSICIAN
PLANNING AND DEVE	LOPMENT		
Ensure the AI system addresses a meaningful clinical goal	0		0
Ensure the AI system works as intended	0		0
Explore and resolve legal implications of the AI system¹ prior to implementation and agree upon appropriate professional and/or governmental oversight for safe, effective, and equitable use of and access to health care AI	0	0	0
Develop a clear protocol to identify and correct for potential bias	0	0	0
Ensure appropriate patient safeguards are in place for direct-to-consumer tools that lack physician oversight	0		
IMPLEMENTATION AND I	MONITORIN	G	
Make clinical decisions such as diagnosis and treatment			0
Have the authority and ability to override the AI system			0
Ensure meaningful oversight is in place for ongoing monitoring		0	0
Ensure the AI system continues to perform as intended through performance monitoring & maintenance	0	0	
Ensure ethical issues identified at the time of purchase and during use have been addressed ²		0	
Ensure clear protocols exist for enforcement and accountability, including a clear protocol to ensure equitable implementation	0	0	0

Al Alone Won't Transform Healthcare

Al can exacerbate existing problems in the healthcare system UNLESS – at the local level – we:

- Revamp incentives compensate AI activities, including those focused on prevention
- 2. Embed AI into medical education and training
- 3. Engage doctors and patients in AI development and use





Avenues to Actualize Al's potential

- 1. Ensuring safe, effective and trustworthy use of Al
- 2. Promoting and development of an AI-competent health care workforce
- Investing in AI research to support the science, practice, and delivery of health and health care
- 4. Promotion of policies and procedures to clarify AI liability and responsibility





Relevant Readings

- 1. Char, D. S., Shah, N. H., & Magnus, D. (2018). *Implementing machine learning in health care—addressing ethical challenges*. New England Journal of Medicine, 378(11), 981–983.
- 2. Leslie, D. (2019). *Understanding artificial intelligence ethics and safety*. The Alan Turing Institute.
- 3. Obermeyer, Z., Powers, B., Vogeli, C., & Mullainathan, S. (2019). Dissecting racial bias in an algorithm used to manage the health of populations. Science, 366(6464), 447–453.









THANK YOU FOR PARTICIPATING

Time for another discussion!

