

Ice Breaker:

Discuss the hypothetical below with your neighbors:

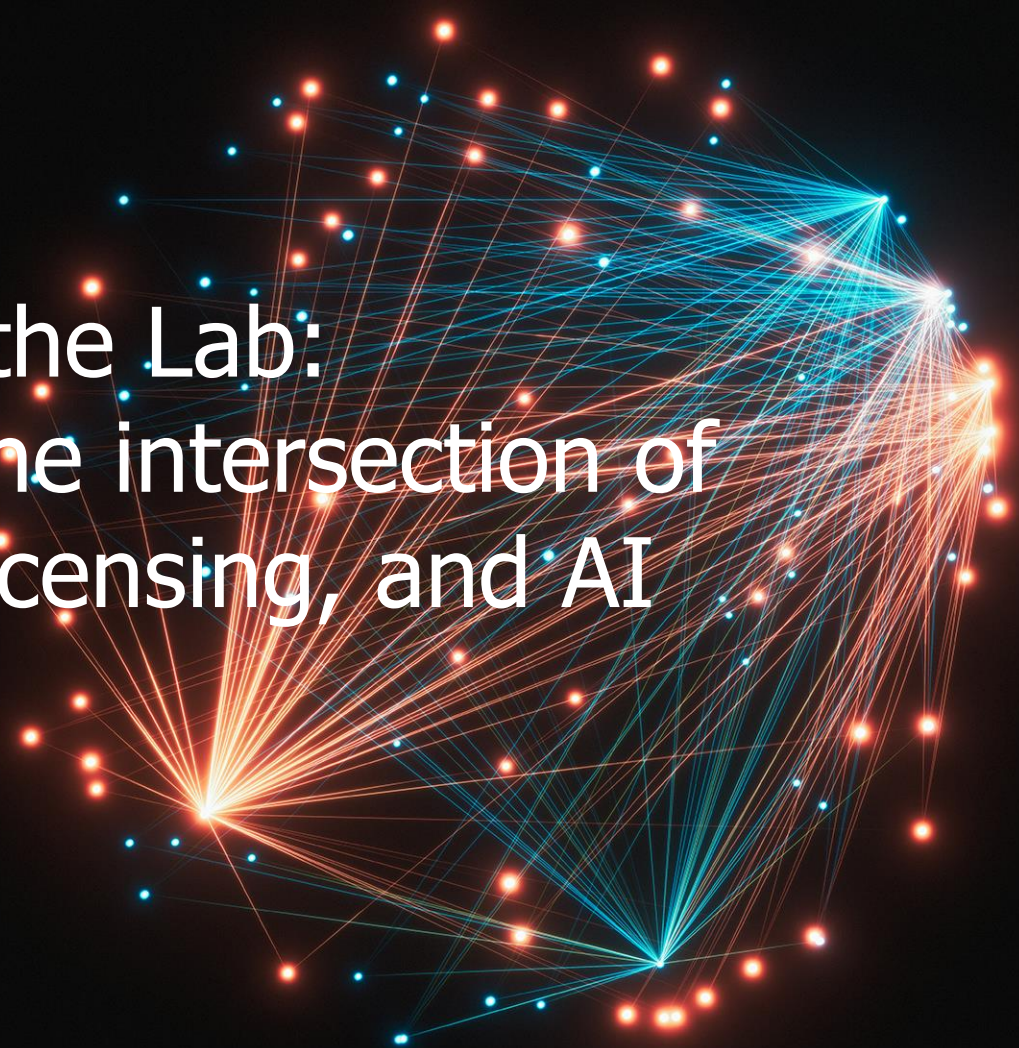
Your company owns a large amount of clinical trial data collected from a diverse patient population. This data is highly desirable to researchers.

What would you like to do with that data?

Morgan Lewis

Thinking Outside the Lab: Opportunities at the intersection of healthcare data, licensing, and AI

Jianbai “Jenn” Wang – Morgan Lewis

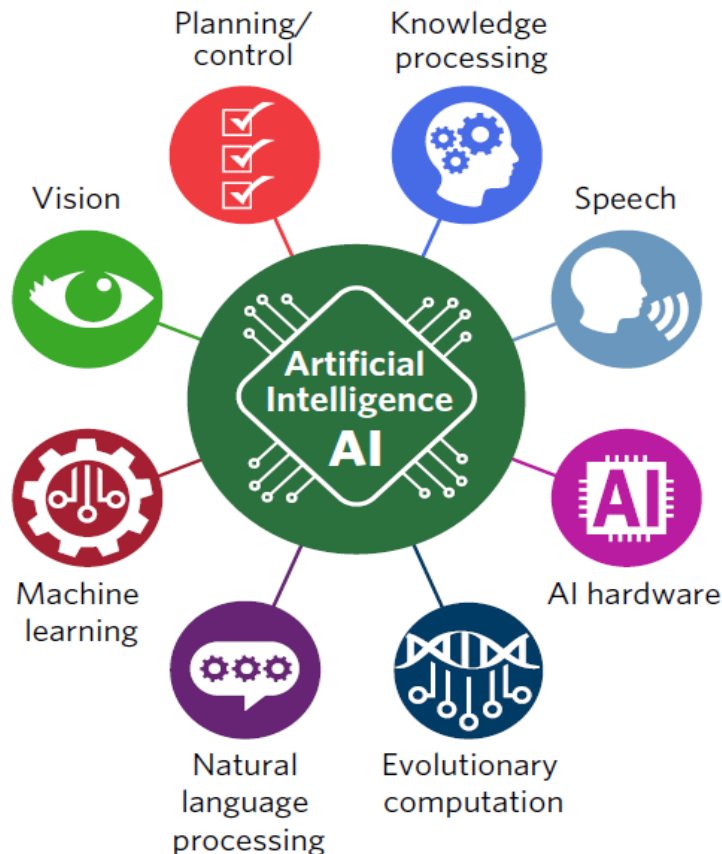


Background in Artificial Intelligence

The term “Artificial Intelligence” is very broad.

Table 1: The three components of learning algorithms.

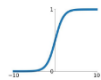
Representation	Evaluation	Optimization
Instances	Accuracy/Error rate	Combinatorial optimization
<i>K</i> -nearest neighbor	Precision and recall	Greedy search
Support vector machines	Squared error	Beam search
Hyperplanes	Likelihood	Branch-and-bound
Naive Bayes	Posterior probability	Continuous optimization
Logistic regression	Information gain	Unconstrained
Decision trees	K-L divergence	Gradient descent
Sets of rules	Cost/Utility	Conjugate gradient
Propositional rules	Margin	Quasi-Newton methods
Logic programs		Constrained
Neural networks		Linear programming
Graphical models		Quadratic programming
Bayesian networks		
Conditional random fields		



Background in Artificial Intelligence – Neural Network (NN)

- Applications: (non-abstract idea)
 - ❑ Image, Audio, Video, Text Processing
 - Autonomous Driving
 - Extended reality (augmented reality)
 - Real time translation
 - ❑ Prediction and forecasting (weather, stock market)

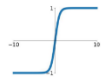
Sigmoid
 $\sigma(x) = \frac{1}{1+e^{-x}}$



Leaky ReLU
 $\max(0.1x, x)$



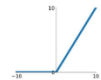
tanh
 $\tanh(x)$



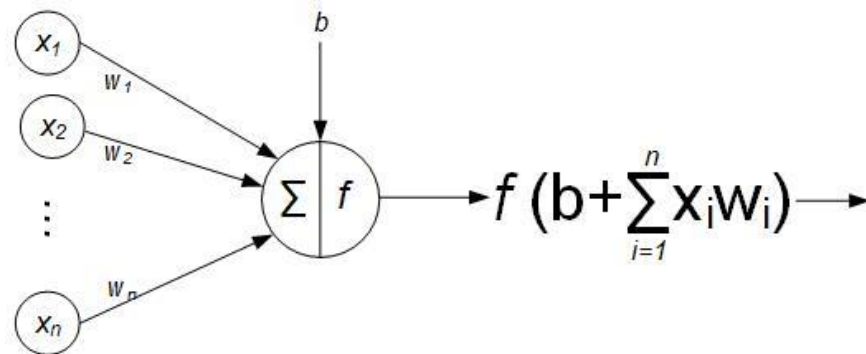
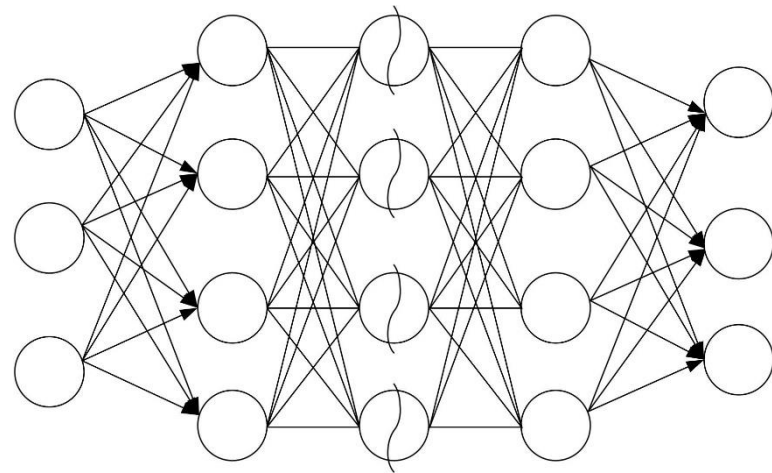
Maxout
 $\max(w_1^T x + b_1, w_2^T x + b_2)$



ReLU
 $\max(0, x)$

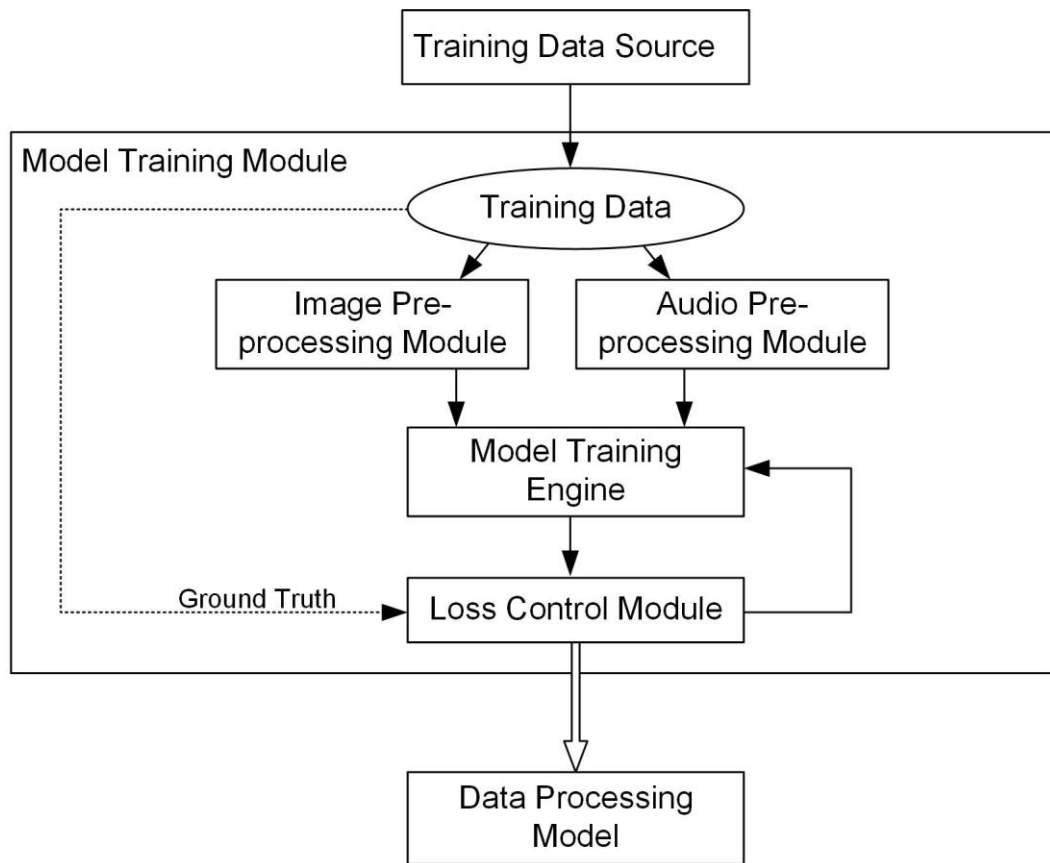


ELU
 $\begin{cases} x & x \geq 0 \\ \alpha(e^x - 1) & x < 0 \end{cases}$



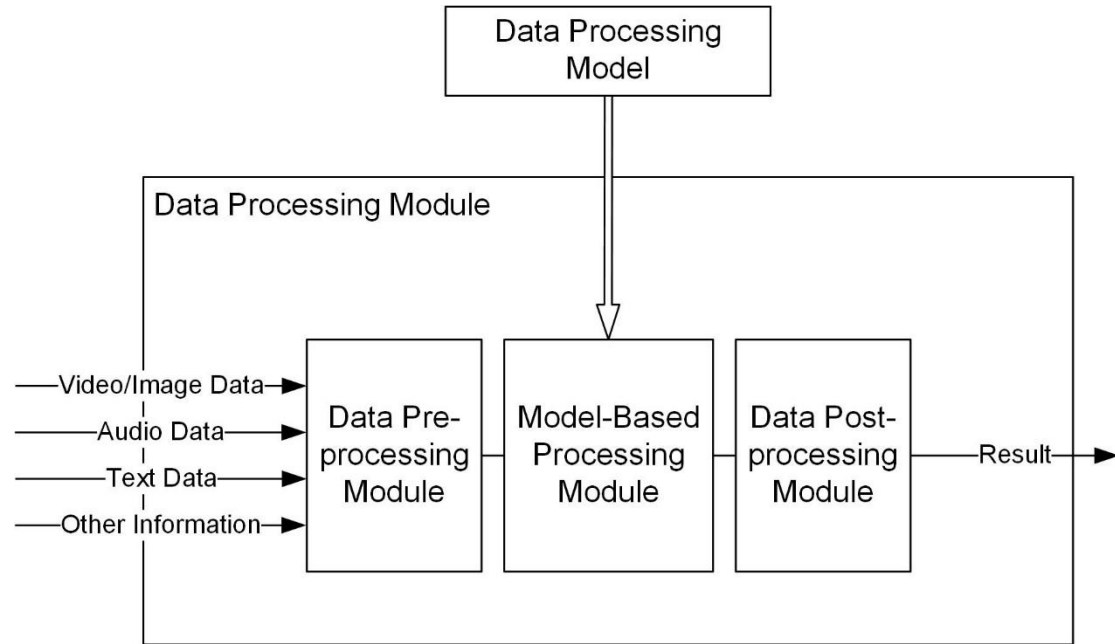
Background in Artificial Intelligence - Training

- Takes place on (1) a server, (2) electronic device, or (3) both
- Supervised, semi-supervised, or unsupervised training
- Examples of inventive ideas that achieve efficient training and accurate NN model:
 - **Training data augmentation**
 - Special loss function
 - Ground truth management
 - Model pruning and quantization



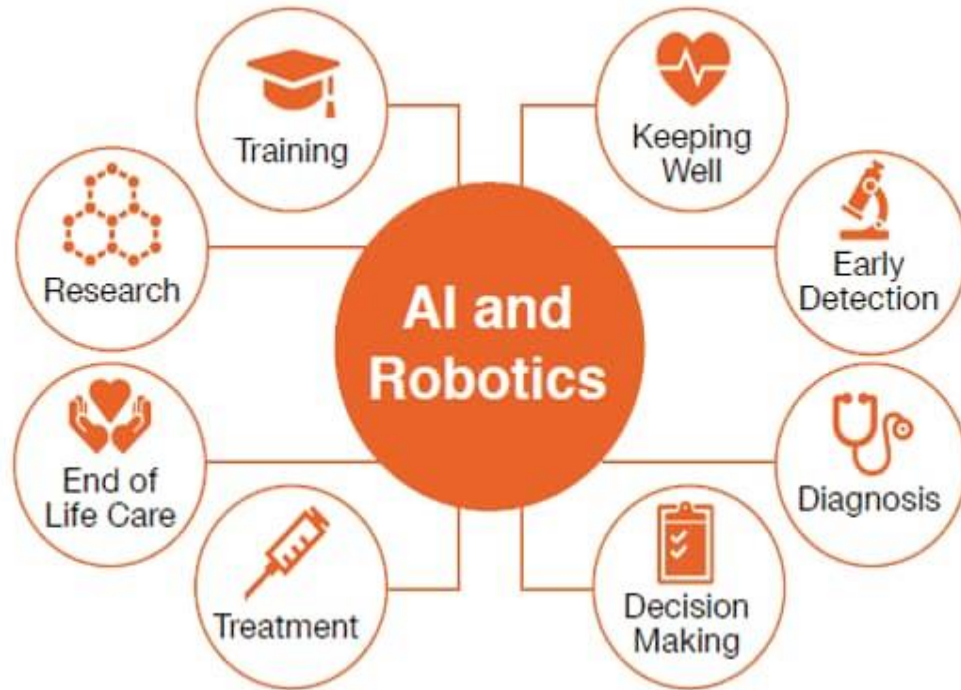
Background in Artificial Intelligence - Inference

- Takes place on (1) an electronic device, (2) a server, or (3) both
- Examples of inventive ideas:
 - Input data structure (e.g., 3 successive images or a sequence of images, or an image + keywords extracted from a prior audio item)
 - Data pre-processing (e.g., divide an input into tiles)
 - Novel application of a type of NN model in a specific context
 - Modification of NN for a context (e.g., skip connection redefined for U-Net)
 - Pull out intermediate data of NN to add additional cross-channel processing
 - Data post-processing (e.g., combine with the input image before processing with an output layer, or organize translated text adaptively)



Trends in Adoption of AI in Healthcare

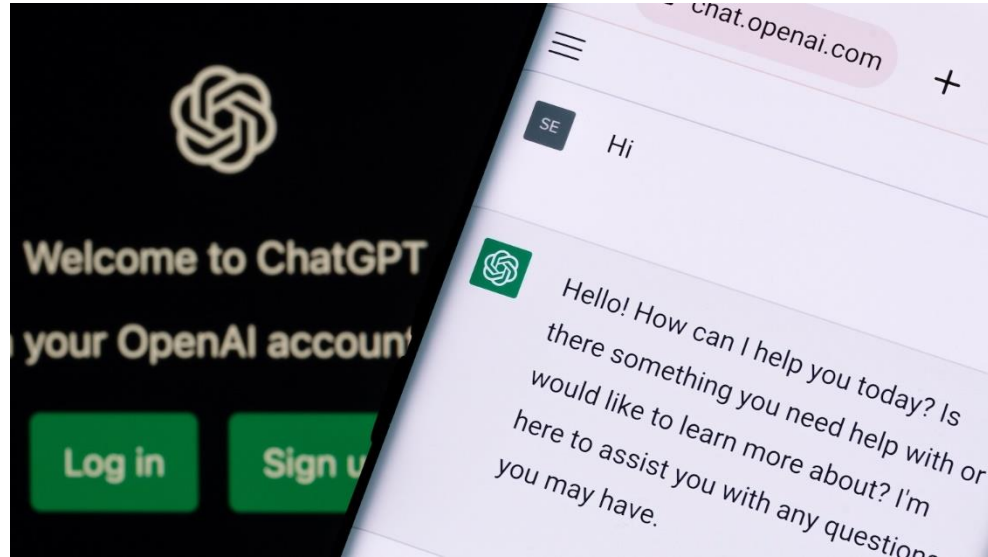
- 90% of U.S. Hospitals and Insurance companies will implement some type of AI System by 2025
 - **Examples of AI Systems:** Medical image analysis, digital image processing, pattern recognition solutions, machine learning platforms, automated patient guidance and engagement solutions



ChatGPT and Related Issues

- Generative Pre-trained Transformer (GPT) has two parts: (1) Understanding the context of the input chat by human and (2) Generating reactionary answer back to the human
- Training: (1) 1-year unsupervised learning using huge amounts of text data from the Internet up to 2021 and (2) 6-month supervised learning guided by human judges
- Between version releases, no update on neural network.
- Massive amounts of GPU and electrical power to train.

Morgan Lewis



Types of IP Protection Relevant to Data Models

- Patent
 - Novelty may exist in any of the multiple phases of the model-making process
 - Typically, model weights/parameters are not suited to patent protection
- Trade Secret
 - Must take measures “reasonable under the circumstances” to maintain the information’s secrecy
- Protection of Data
 - Copyright
 - Contract
 - Privacy

Relevant Legislation on AI Governance / Privacy

- EU
 - EU Artificial Intelligence (AI) Act
 - European Data Act
 - General Data Protection Regulation (GDPR)
- US
 - Proposed federal and state legislation
 - Blueprint for an AI Bill of Rights (<https://www.whitehouse.gov/ostp/ai-bill-of-rights/>)
 - Health Insurance Portability and Accountability Act of 1996 (HIPAA)
 - California Privacy Rights Act (CPRA) and similar state AI-related laws and proposed laws

Morgan Lewis

Panel Discussion: Thinking Outside the Lab: Opportunities at the intersection of healthcare data, licensing, and AI

September 19, 2023

Doug Crisman – Morgan Lewis

Eric Lin – Genentech

Duane Valz – Former Insitro

Chitra Kalyanaraman – Moderator, Johnson & Johnson

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