

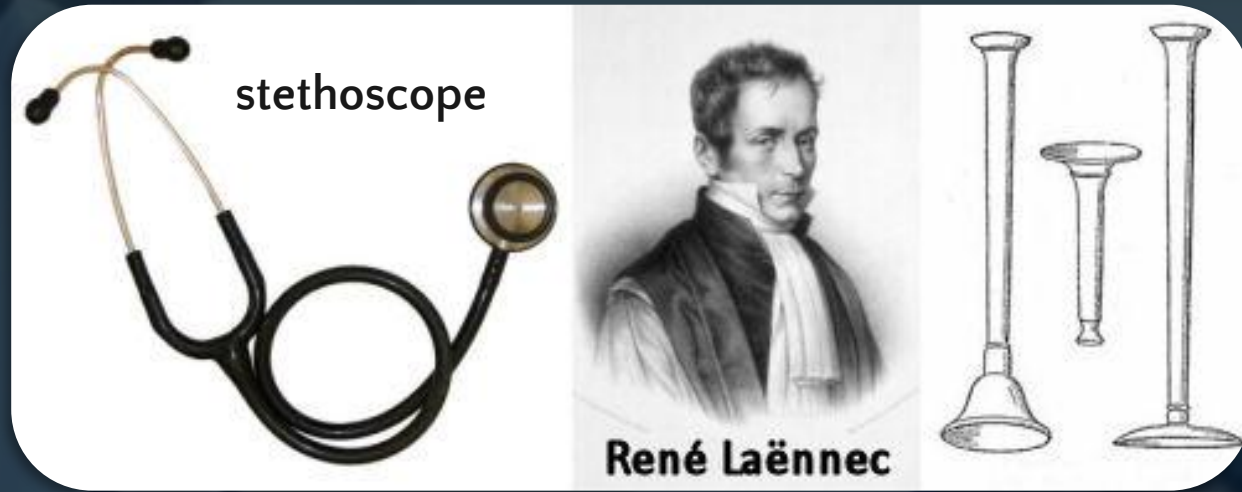


# Harnessing AI for Multimodal Data Analytics

PRACTICAL APPLICATIONS IN HEALTH,  
SCIENCE, AND RESEARCH

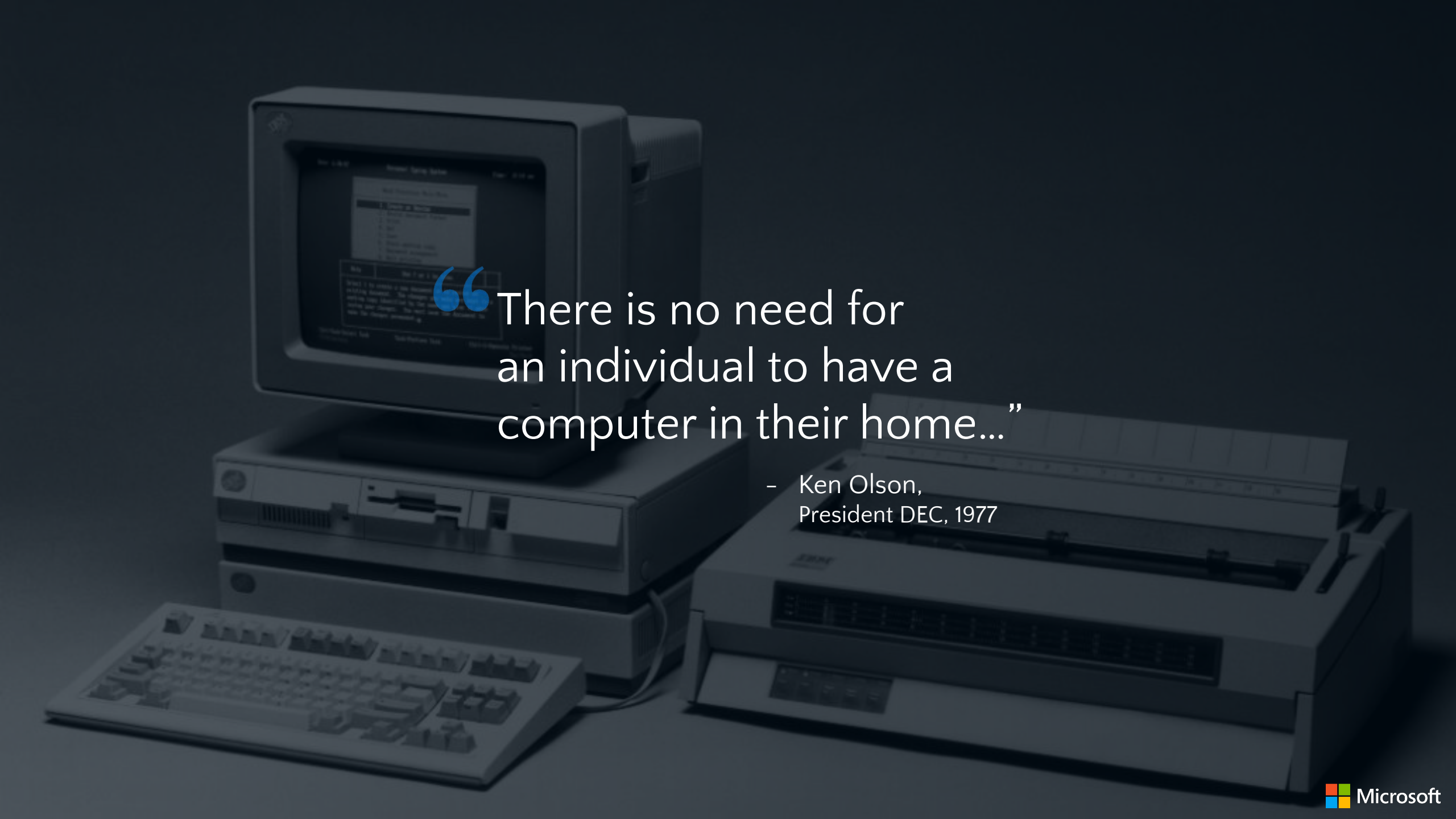
Helia Mohammadi, PhD  
Chief AI & Precision Health Officer  
WW Health & Life Sciences  
Microsoft





“... That it will ever come into general use, notwithstanding its value, I am extremely doubtful; because its beneficial application requires much time, and gives a good deal of trouble both to the patient and the practitioner; and because its whole hue and character is foreign, and opposed to all our habits and associations.”

John Forbes MD, 1821



“There is no need for  
an individual to have a  
computer in their home...”

– Ken Olson,  
President DEC, 1977

# The Era of Copilots and Agents is Here

The potential of AI is clear

75%

of health systems see **generative AI** as reshaping the industry

98%

Health and life sciences organizations report having an **AI strategy in place**, or are planning one

For every \$1 a company invests in AI, it is realizing an average **return** of

\$3.7

13 months

Average time it takes for organizations to **realize a return** on their AI investment. Average implementation time is less than 8 months

Natural language

Universal Interface

Reasoning & Planning

Memory & Context

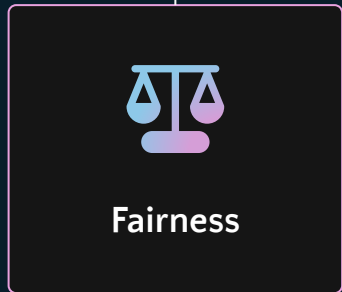


Ask me anything...



# Responsible AI Principles

Guard against biases in training data  
(e.g., demographic biases)



Patient data used during training or  
fine-tuning can't be revealed



Ensure that AI is accessible and  
sensitive to all population segments

Clinical information is from  
verifiable sources and auditable



Ensure results are accurate  
e.g., patient chart summarization

Legal, regulatory compliance, along  
with fairness, safety, and so on

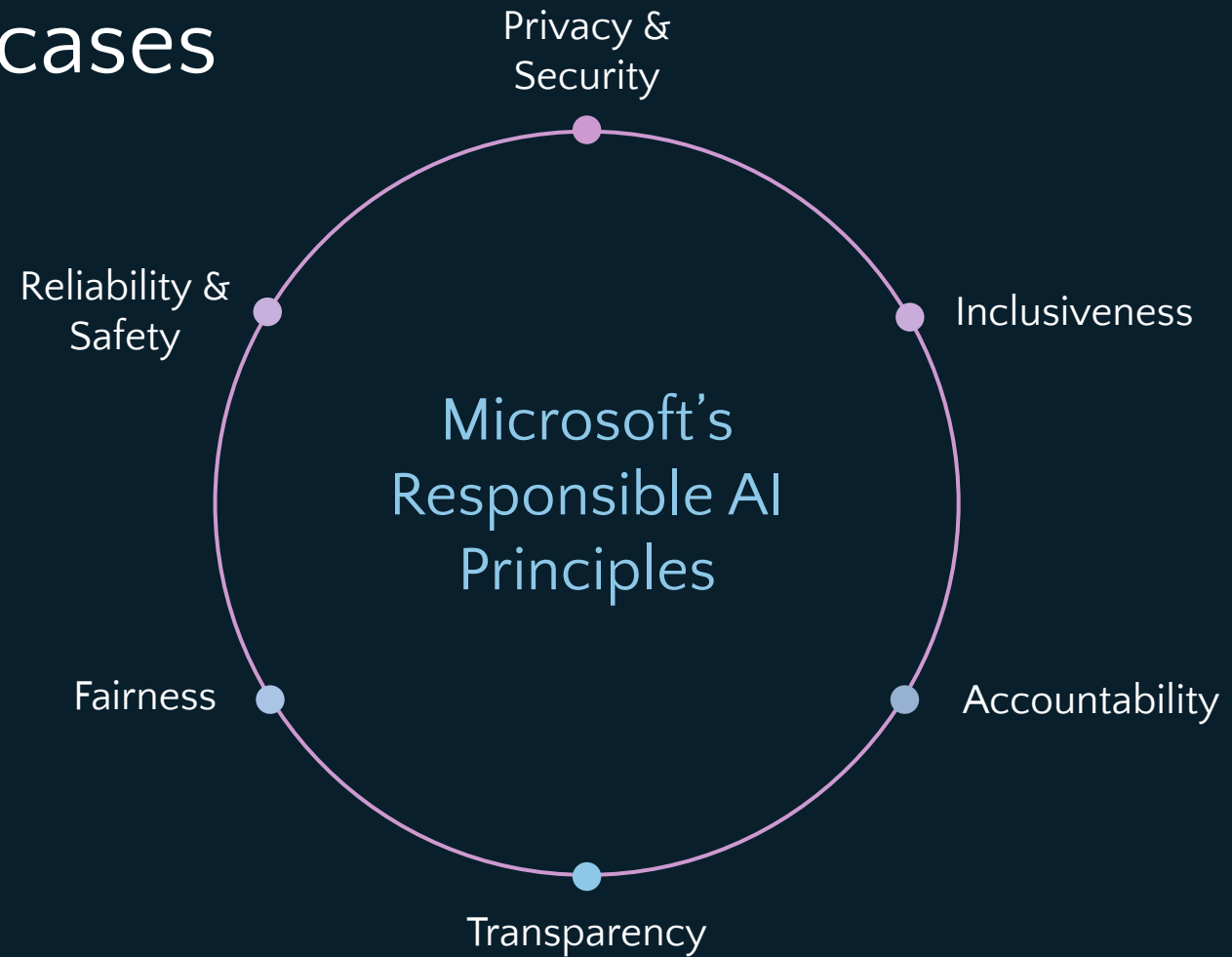
Microsoft Cloud:

- Your data is **your** data
- Your data is **not** used to train the OpenAI foundation models without permission

# Evaluating AI for health use cases

## Use case ideation

- **Regulatory:** Regulated or not?  
(e.g., *Clinical Decision Support, Software as a Medical Device*)
- **Liability:** What could go wrong and who bears responsibility?
- **Reputational:** Building and keeping the trust of industry participants, patients, regulators, and policymakers
- **Accuracy vs. creativity:** Techniques graded and evaluated.



## Building blocks to enact principles



Tools and processes



Training and practices



Rules

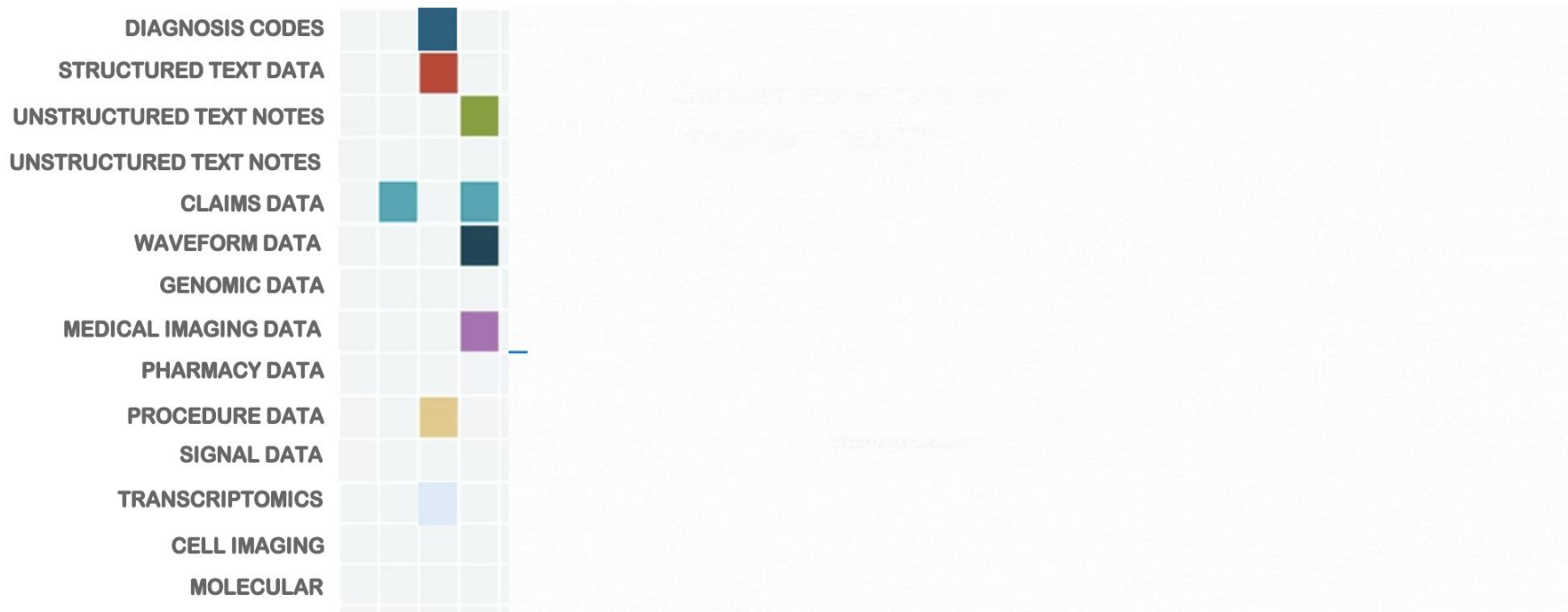


Governance

# Multimodal Healthcare Data

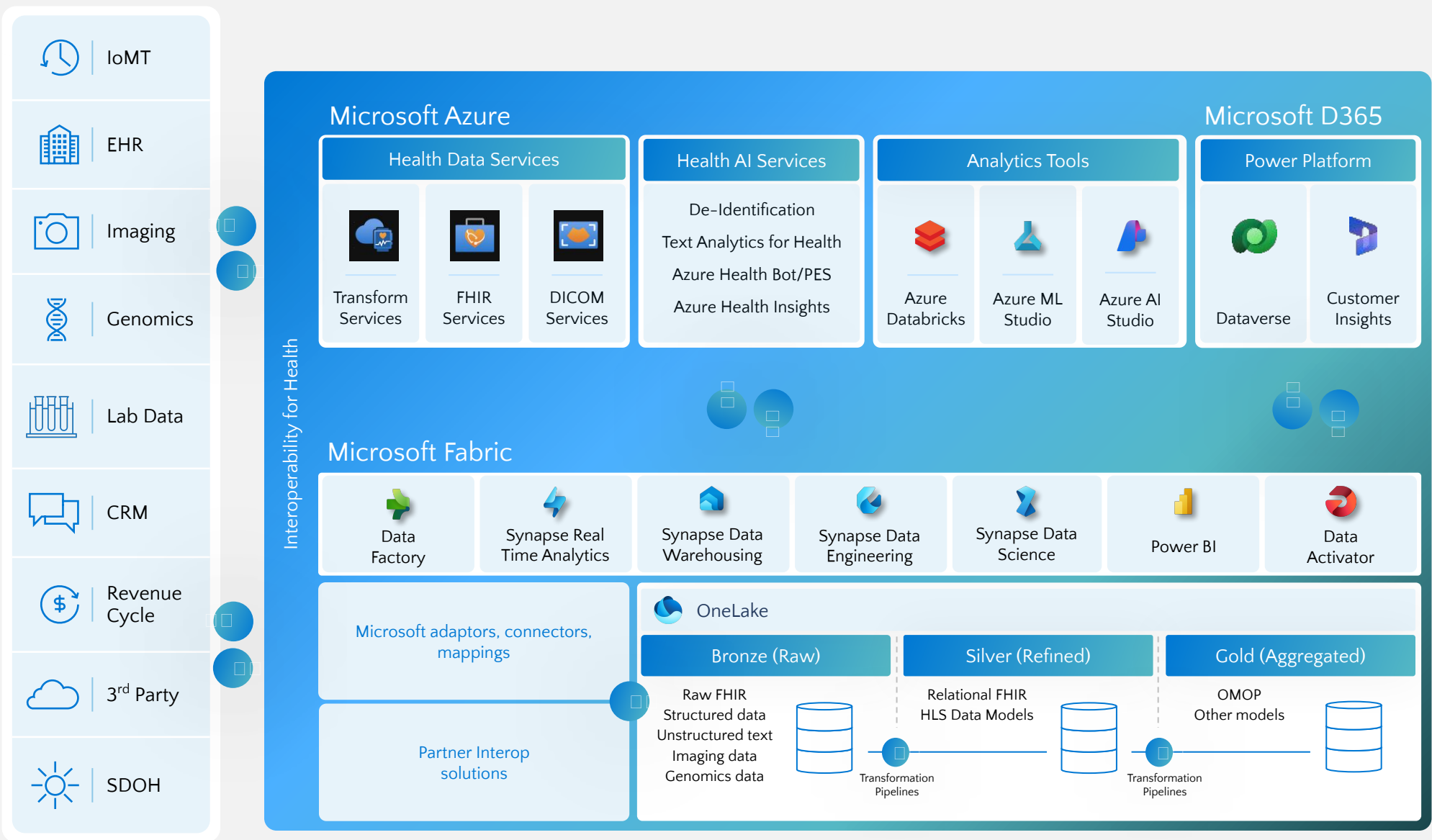
More than 95% of health data is unstructured (non-text) multimodal data

Understanding and Predicting Patient Health and Disease State requires Multiple Modalities



- Out of the box multimodal foundation models struggle with non-text multimodal health data
- Most multimodal health data is not easily available and siloed across many organizations
- Building pretrained multimodal medical foundation models is resource intensive and existing models have limited use to research

# Health Digital and AI Transformation Architecture



## Interoperability for Health

Interoperability for HLS specific systems with re-useable Microsoft and Partner components.

## OneLake

Data stored in raw form and transformed to industry common models using both Microsoft, partner, and custom transformation pipelines.

## Data Governance

Microsoft Purview provides data governance across the entire data estate.

## Health Data Services

FHIR and DICOM Services built on the Data Lake foundations

## Health AI Services

Data is infused with AI services to enrich the data and also provide layer of intelligence interaction with consumer.

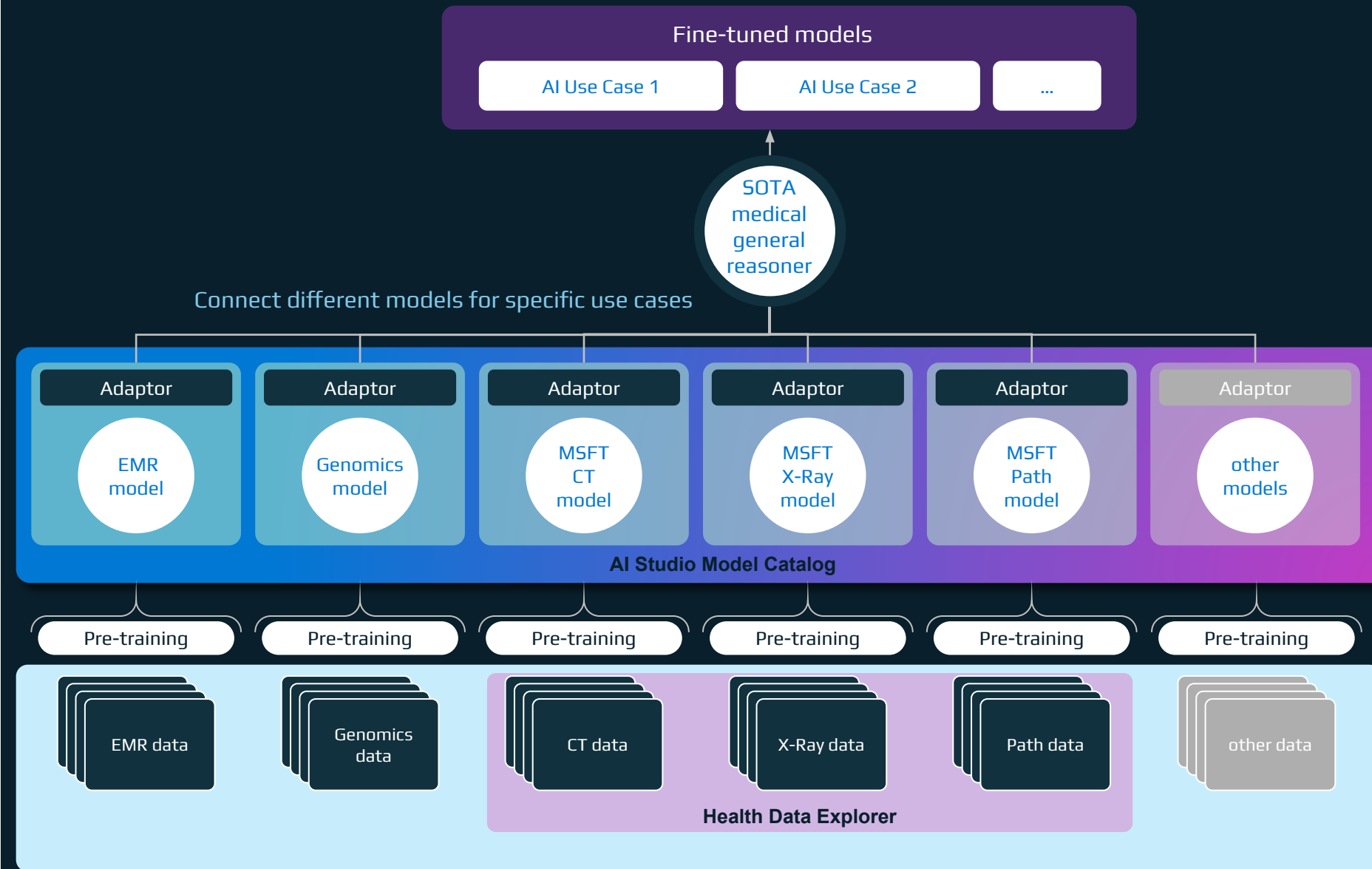
## Power Platform

Apps can access and update data using a low-code/no code platform.

Some information relates to pre-released product which may be substantially modified before it's commercially released. Microsoft makes no warranties, express or implied, with respect to the information provided here.



# Implement a Frontier Research Ecosystem



Instead of trying to build a single multimodal medical model, **build an ecosystem**

Microsoft leading with SOTA specialized medical foundation models alongside partners to cover all modalities

Use AI Studio with tools that connect key models across modalities (via adaptors) to a SOTA medical general reasoner even with limited cross-modality data

Microsoft HLS is building Health Data Explorer with Fabric for healthcare data

# Multimodal models will accelerate HLS discovery, development & delivery

Tasks

## Discovery

- Biomarker identification
- Therapeutic response optimization
- Synthetic controls
- Molecular property prediction
- Disease mechanism discovery
- Protein structure prediction and optimization
- Drug repurposing
- Phenotypic screening and cellular imaging
- Cohort development
- ...

## Development

- Cohort development
- Clinical trials matching, simulation, recruitment
- Virtual trials
- Label expansion
- Molecular tumor board
- Predictive drug toxicology
- Adaptive trial protocols
- ...

## Delivery

- Find similar patients
- Exam routing
- Earlier screening and quality control
- Image to report generation
- Personalized disease progression
- Personalized treatment suggestions
- Personalized screening suggestions
- Adverse effect likelihood
- Payer coverage decisions
- Prior authorization
- ...



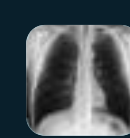






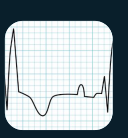

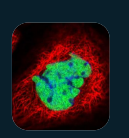


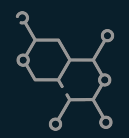
General Reasoner



Are there any signs of early-stage breast cancer or abnormalities 

Task Adapter

Embedding FMs



ChemProtCellMolGeneEEGDerm\*Opt\*Endo\*U/SCT/MR IMamX-RayPat hText

# Introducing: Multimodal Healthcare AI Models in Azure AI Studio

Find the right model to build your custom AI solution

Announcements

All filters X Collections Industry: Health and Life Sciences Deployment options Inference tasks Fine-tuning tasks Licenses Clear all

Search

microsoft-MedImageInsight  
Embeddings

Prism  
Zero-shot image classification

prov-gigapath  
Image feature extraction

UFNLP-gatortron-base  
Text generation

microsoft-biogpt  
Text generation

microsoft-biomedCLIP-PubMedBERT\_2...  
Text generation

BioMistral-7B  
Text generation

microsoft-CXRReportGen  
Findings generation

Virchow2  
Image feature extraction

m42-health-Llama3-Med42-70B  
Text generation

microsoft-biomednlp-pubmed...  
Fill mask

microsoft-biogpt-large-pubme...  
Text generation

medical-ai-clinicalBERT  
Text generation

microsoft-MedImageParse  
Segmentation

Virchow  
Image feature extraction

microsoft-biomednlp-pubmed...  
Fill mask

microsoft-biomednlp-pubmed...  
Fill mask

microsoft-biogpt-large  
Text generation

stanford-crfm-BioMedLM  
Text generation

Filter by

Collections

Deployment options

Managed compute
Serverless API

Industry

Health and Life sciences
Manufacturing
Finance
Mobility
Agriculture

Inference tasks

Fine-tuning tasks

Licenses

Models 19

Derm\*

Opt\*

Endo\*

U/S

CT/MRI\*

Mam

X-Ray\*

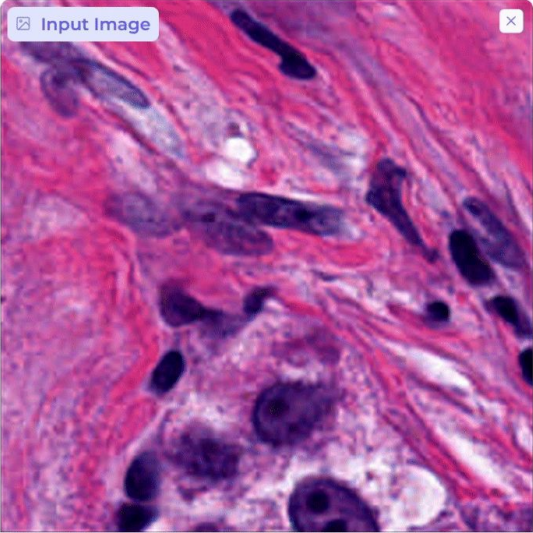
Path\*




\*State Of The Art (SOTA) MSFT or Partner Model in Model Catalog on 10/20/24

- Curated collection of Microsoft and partner healthcare models that are state of the art across multiple imaging modalities
- Easy to deploy and trial models in a secure environment
- Library of open-source models for full customization and adaptation to specific use cases


# Microsoft MedImageParse

Input Image



Parsing Results

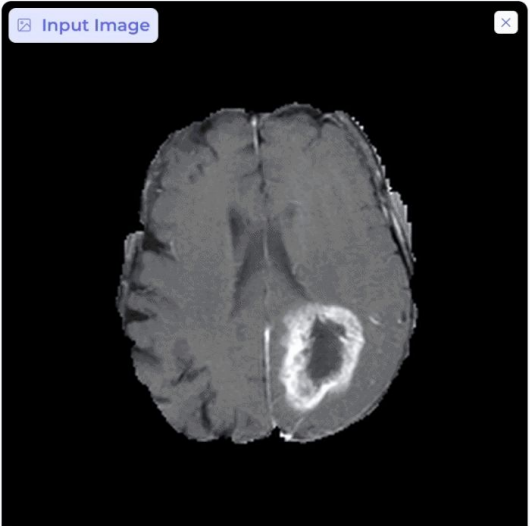





Text prompt

Output text


Go!

Input Image



Parsing Results



Text prompt

Output text

Go!



Derm\*



Fund/OCT\*



U/S



CT/MRI\*



Mam



X-Ray\*



Path\*

# Radiology Report Generating with Provenance

Azure AI Studio | All hubs / HLTH\_2024 / Chat playground

Chat playground

Export View code Prompt flow Evaluate Deploy Import Prompt samples

Configure

Deployment \* MedReportGen

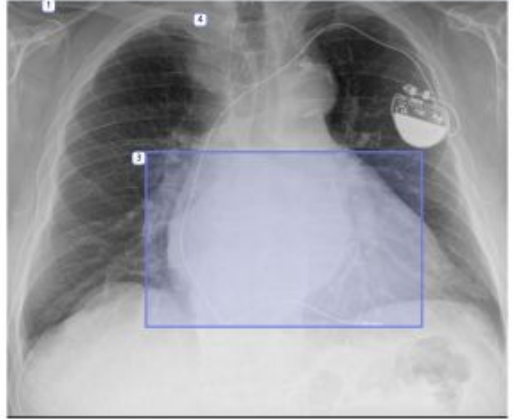
Prompt Add your data Parameters

System message 1

You are an AI assistant that helps radiologist by creating a draft report.

+ Add section

Clear chat Chat capabilities Show JSON



Findings:

The bony structures are intact. 1.) There are degenerative changes of the spine. 2.) Bones are demineralized. The lungs show no acute infiltrate or mass. There is no effusion. The pulmonary interstitial markings are normal. The diaphragm is smooth. 3.) The cardiac size is moderately enlarged. 4.) There is marked uncoiling of the aorta. 5. Calcification is noted within the aortic knob. There is no chf. Pacemakers are noted in the right atrium and ventricle. There is no hilar or mediastinal adenopathy.

Describe what you'd like to do or use / to reference files, people, and more

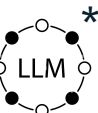
0/8000 tokens to be sent



X-Ray\*



Pixel Insights

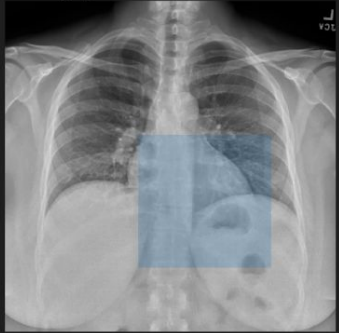


LLM\*

# Find patients like mine with MedImageInsight

Search

filename.jpeg



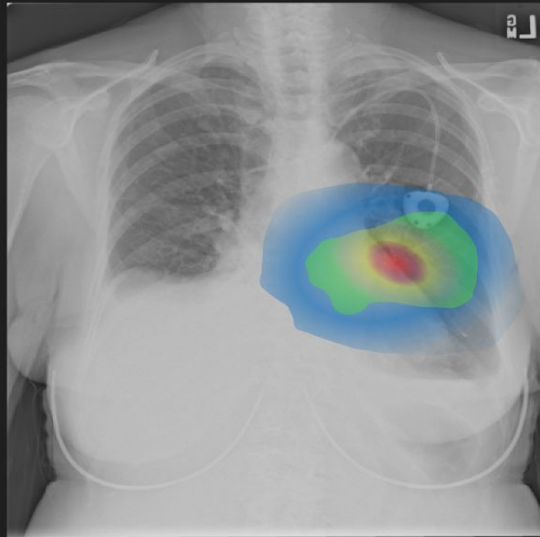
New search

## Summary

Out of 30 images, 60% of images have been diagnosed with mild cardiomegaly.

Common symptoms have been:

- abdominal bloating
- abnormal heart rhythms, known as arrhythmia
- chest pain
- coughing, especially when lying down
- dizziness
- swelling, or edema, especially in the ankles, feet, and legs



Chest - longer series description

CR | Images: 1/3 | Series: 2

Development of moderate to large right and small left pleural effusion with basilar atelectasis or pneumonia.

Is this image relevant?

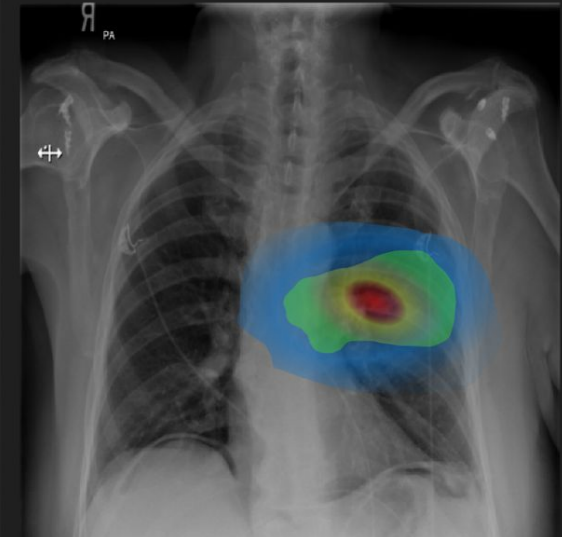


Chest - longer series description

CR | Images: 1/3 | Series: 2

Minimal left basilar subsegmental atelectasis. No consolidation.

Is this image relevant?



Chest - longer series description

CR | Images: 1/3 | Series: 2

No acute cardiopulmonary disease is apparent. This document was created using voice recognition. If errors are found, they need to be taken into context.

Is this image relevant?



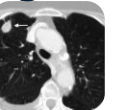
Derm\*



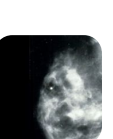
Opt\*



U/  
S



CT/MRI



Ma  
m



X-Ray\*



Path\*



\*State Of The Art

(SOTA)

Lab Results

Prompt

Extract the key information into a table

Prompt

Rewrite it for a patient at a 5<sup>th</sup> grade reading level

Result

The doctors took a small sample from your bone marrow, which is the soft tissue inside your bones. They found that your bone marrow is normal and healthy, and they didn't see any unusual cells. They also did some tests to look for specific changes in your genes, but they couldn't get one of the results. They didn't find any signs of a blood condition called polycythemia vera. However, they think it's important to keep checking and do more tests if needed, especially since you have a history of having too many red blood cells and a lung condition. They can do these tests using a sample of your blood.

RTX: AFSJLH SEQ: W12B

Accession No. [REDACTED] Chart No. [REDACTED] Sex [REDACTED] D.O.B. [REDACTED] Page 1 of 4

Patient Name [REDACTED] Collected 08/17/22

Requesting Physician [REDACTED] Received 08/18/22

Referring Physician [REDACTED] Reported 08/21/22

Indications For Study [REDACTED]

FINAL DIAGNOSIS

Bone Marrow

SUMMARY REPORT

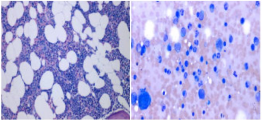
BONE MARROW, BIOPSY AND ASPIRATE:  
- NORMOCELLULAR MARROW (CELLULARITY 40%, BLASTS <1%) WITH TRILINEAGE HEMATOPOIESIS  
- NEGATIVE FOR EXCESS BLASTS  
- NEGATIVE FOR OVERT DYSPLASIA  
- NEGATIVE FOR ATYPICAL MEGAKARYOCYTIC HYPERPLASIA  
- MOLECULAR TEST OF BCR-ABL1: NEGATIVE  
- MOLECULAR TEST OF JAK2 V617F: UNABLE TO OBTAIN RESULTS  
- PLEASE SEE COMMENT

DETAILED MOLECULAR RESULTS ARE REPORTED UNDER A SEPARATE COVER.

Comment  
Clinical history of polycythemia and chronic obstructive lung disease is noted. Polycythemia can be seen in both secondary conditions (such as hypoxic disease, high altitude, iatrogenic, dehydration, altered oxygen sensing and certain solid tumor) and myeloproliferative neoplasm (polycythemia vera). There is no specific morphologic features of polycythemia vera in the current marrow specimen, and serum erythropoietin level is normal (4.4 mIU/mL, Reference interval 2.6-18.5 mIU/mL, 8/4/2022). Secondary etiologies need to be excluded. Correlation with pertinent clinical and laboratory findings, and pending molecular test is recommended.

Addendum  
BCR-ABL1 gene rearrangement is not detected by molecular test. Molecular test of JAK2 V617F has been attempted, and is unable to obtain results. Repeated test is unsuccessful. Molecular test of JAK2 V617F, Rfx CALR/JAK2 Exon12-15/MPL, can be performed on a fresh peripheral blood specimen if clinically warranted.

PHOTOMICROGRAPH

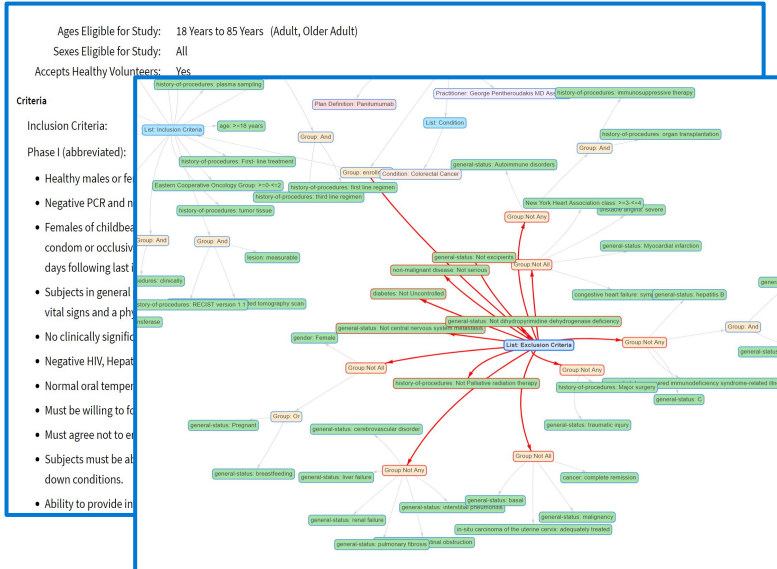


1 - Bone marrow biopsy (200 x)  
2 - Marrow aspirate (500 x)

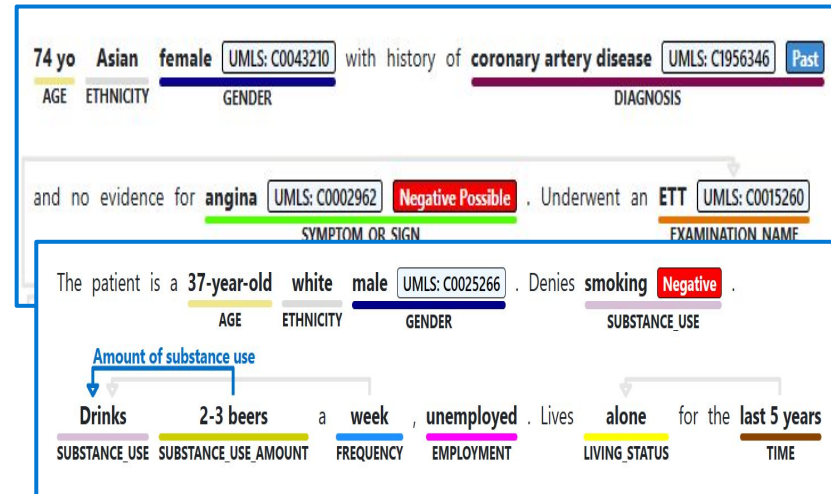
Section	Information
1. Specimen Details	Bone marrow biopsy and aspirate were conducted on the patient.
2. Tissue Description	The bone marrow core measured 0.7 cm in length x 0.2 cm in diameter and was homogeneous.
3. Microscopic Description	The marrow was normocellular (40% cellularity) with trilineage hematopoiesis, and blasts were below 1%. No overt dysplasia, atypical megakaryocytic hyperplasia, or excess blasts were observed. Molecular tests showed BCR-ABL1 was negative, but JAK2 V617F results could not be obtained.
4. Diagnosis	The bone marrow specimen was benign, with no specific morphologic features of polycythemia vera. Secondary etiologies should be considered.
5. Diagnosis (for GYN report)	N/A
6. Abnormalities (for FLOW and BONE MARROW reports)	No significant abnormalities were detected.
7. Synoptic Report/Summary	The bone marrow biopsy and aspirate showed normocellular marrow with trilineage hematopoiesis, negative for excess blasts, overt dysplasia, and atypical megakaryocytic hyperplasia. BCR-ABL1 was negative, but JAK2 V617F results were not obtained.
8. Comments	The clinical history of polycythemia and chronic obstructive lung disease is noted. Correlation with pertinent clinical and laboratory findings and pending molecular tests is recommended. Further molecular testing of JAK2 V617F, Rfx CALR/JAK2 Exon12-15/MPL can be performed on a fresh peripheral blood specimen if clinically warranted.
9. Sampling Differences	N/A

# Clinical Trials Matching

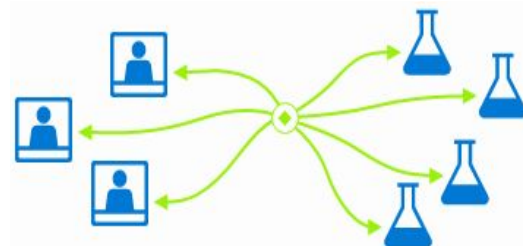
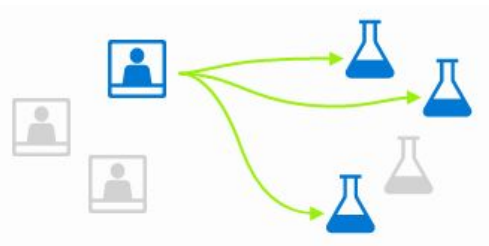
## Trial Eligibility Criteria



## Patients Records



## Matching Patients to Clinical Trials



## BY THE NUMBERS: CLINICAL TRIALS AWARENESS

**11%** OF SITES FAIL TO ENROLL EVEN A SINGLE PATIENT

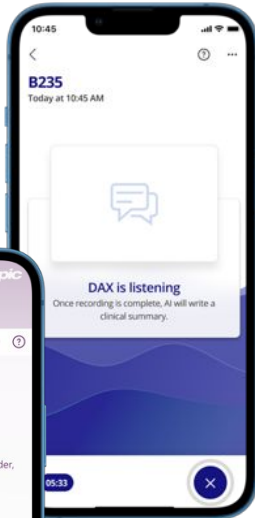
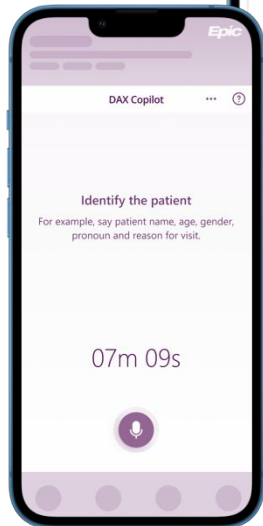
**37%** OF SITES DO NOT MEET THEIR ENROLLMENT GOALS

**40%** OF SURVEYED ADULTS DON'T UNDERSTAND CLINICAL TRIALS

**32%** OF SURVEYED ADULTS SAY THEY'D CONSIDER PARTICIPATING—AFTER THEY UNDERSTAND WHAT A CLINICAL TRIAL IS

# Dragon Copilot – A New Approach to Today’s Challenges

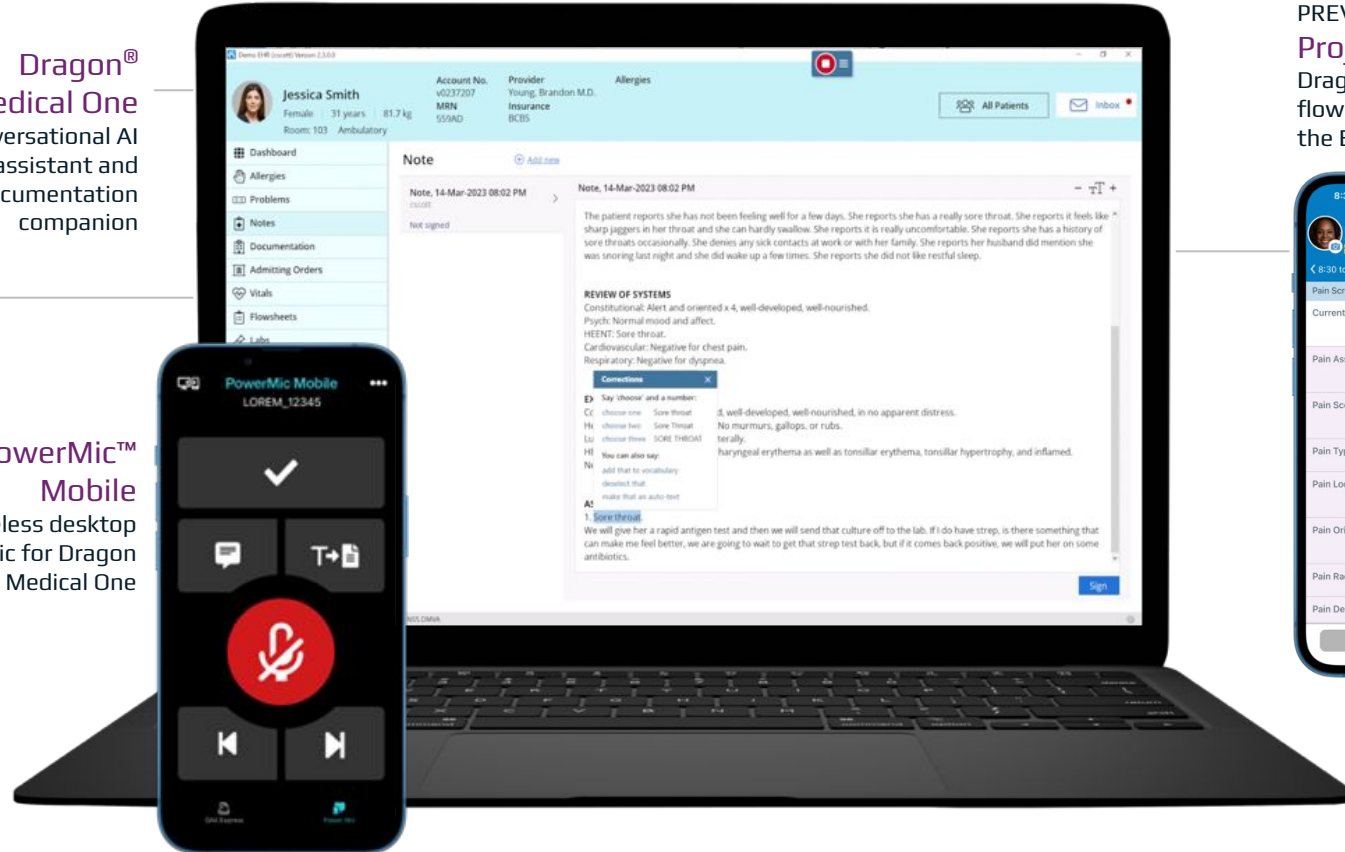
**DAX™ Copilot**  
AI notes,  
automated tasks,  
and mobile  
editing



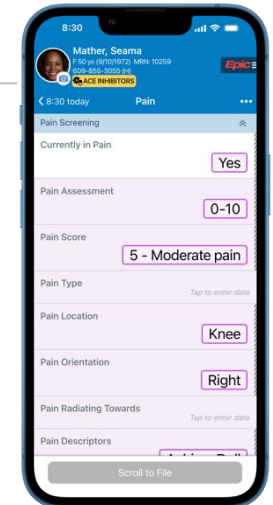
**DAX™ Copilot for Epic**  
AI notes and task  
automation  
embedded in the  
Epic workflow

**Dragon® Medical One**  
Conversational AI  
workflow assistant and  
documentation  
companion

**PowerMic™ Mobile**  
Wireless desktop  
mic for Dragon  
Medical One

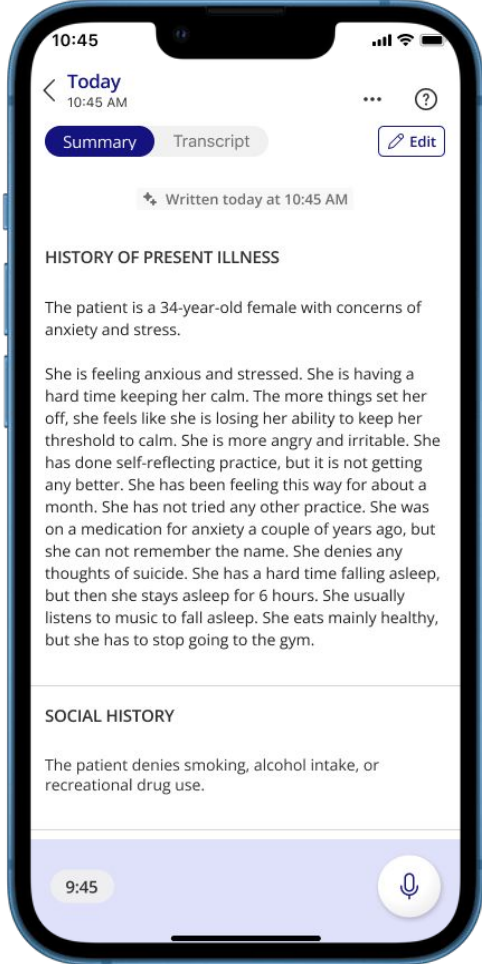


**PREVIEW**  
**Project Nursing**  
Dragon-based ambient  
flowsheet capture in  
the EHR



**Fully automated, workflow-integrated** clinical documentation that delivers a draft patient note for **clinician review, editing, and signature**

# Outcomes delivered at scale with text LLMs: DAX CoPilot



## Operational efficiency

5 min saved per clinician per encounter on average<sup>1</sup>

13-26 additional appointment slots, per provider, per month<sup>1</sup>

70% say it improves work-life balance, and reduces feelings of burnout and fatigue<sup>1</sup>

## Clinician satisfaction

80% say it reduces feelings of cognitive burden<sup>1</sup>

75% say it improves patient experience<sup>1</sup>

62% say they are less likely to leave medicine and their organization<sup>1</sup>

## Patient experience

100M fewer clicks per day saves thousands of hours<sup>4</sup>

93% of patients say their physician is more personable and conversational<sup>2</sup>

90% say they spend less time on the computer<sup>2</sup>

85% say their clinician is more focused<sup>2</sup>

## Financial outcomes

\$50-500K incremental revenue potential per provider, per year<sup>3</sup> (varies by specialty)

77% say it improves documentation quality<sup>1</sup>



## CANARY SPEECH



**92%**

92% of expected MCI cases remained undiagnosed.



**\$7.9T**

Early diagnosis of Alzheimer's and dementia can save up to \$7.9 trillion in medical and care costs in the U.S. alone.



**13M**

The number of Americans aged 65 and older with Alzheimer's is expected to double from 6.7 million today to 13 million by 2050.



**21%**

21% of adults are experiencing a mental illness (50m Americans).



**30%**

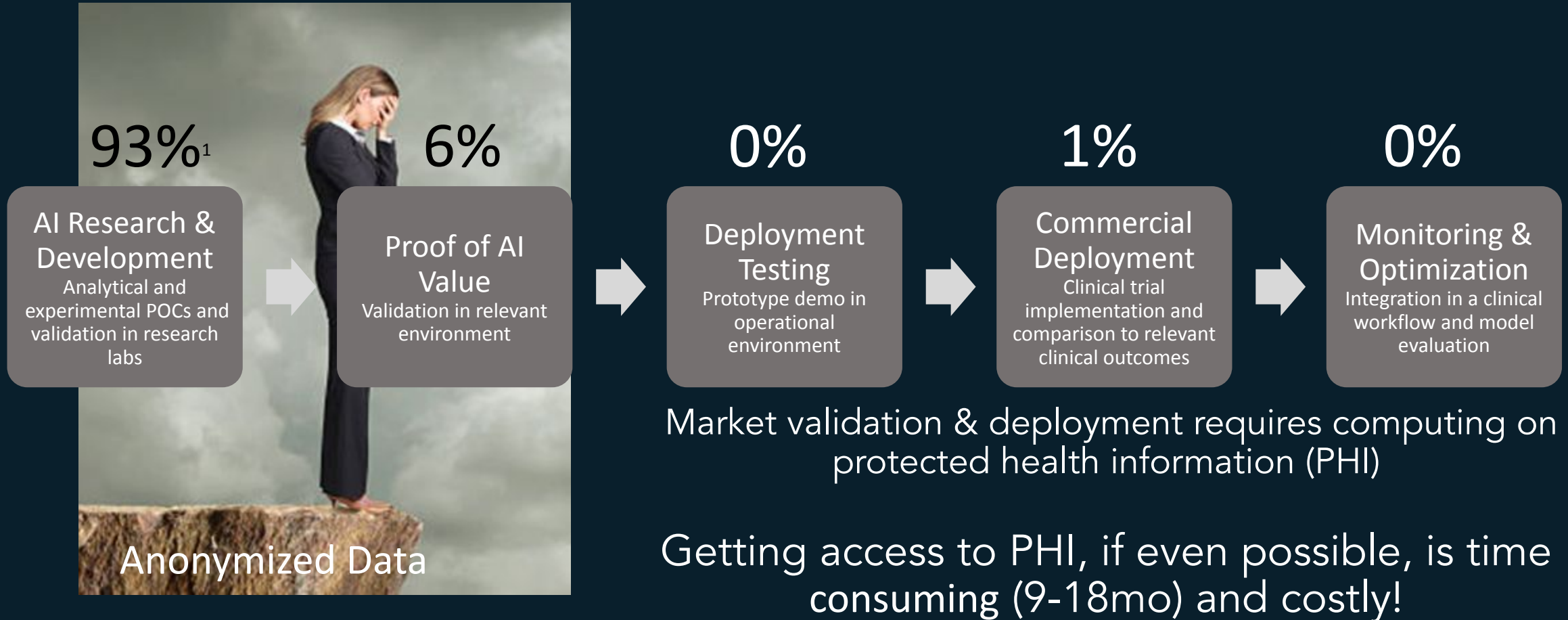
Early detection and treatment of anxiety and depression can reduce hospital admissions by up to 30%.



**\$3,109**

Early treatment of anxiety and depression can help reduce overall health costs by as much as \$3,109 per person over a 2 year period.

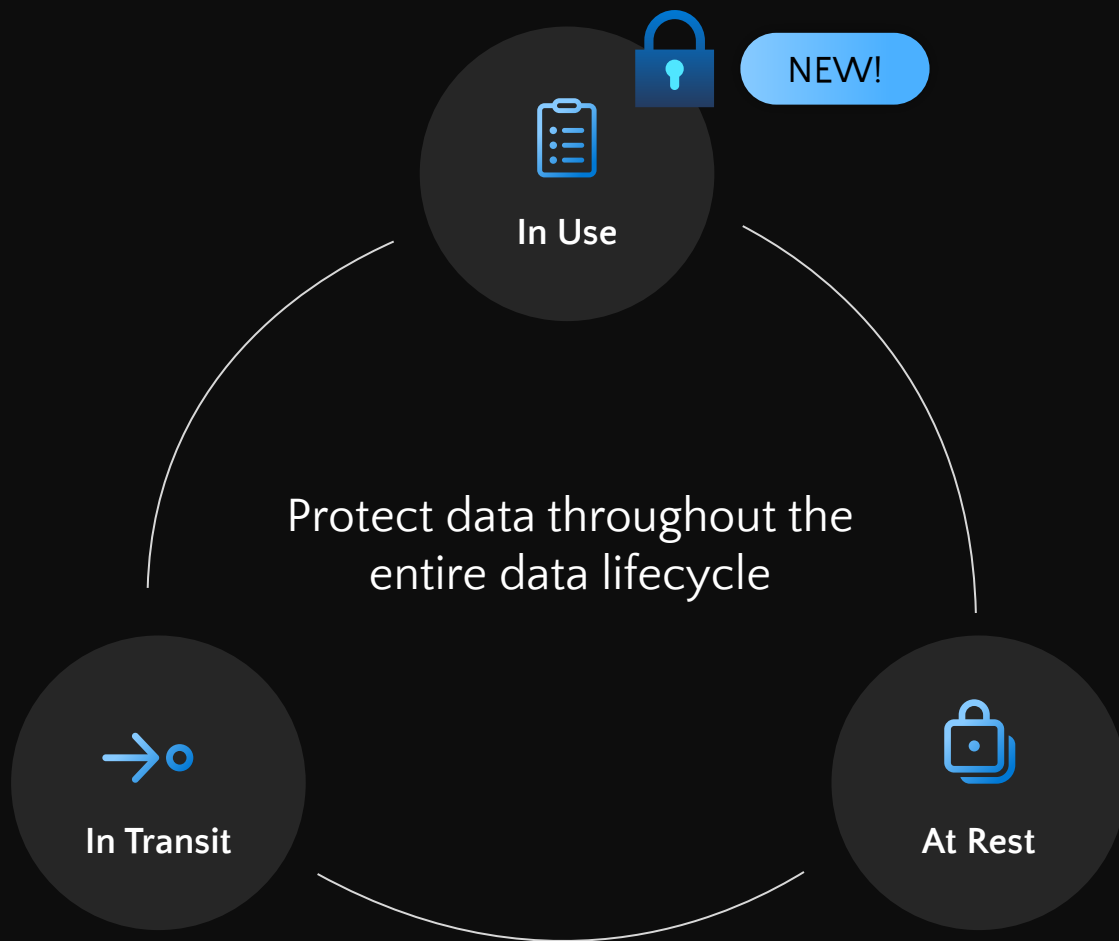
# The challenge facing AI models in healthcare and research



<sup>1</sup>Fleuren, L., et al. (2020). Machine learning in intensive care medicine: ready for take-off? *Intensive Care Medicine*, 46(7), 1486–1488. <https://doi.org/10.1007/S00134-020-06045-Y>



# Azure Confidential Computing



## Privacy

Migrate highly sensitive workloads to Azure

## Unlock Value

Enable insights from multi-party data while maintaining data privacy

## Be Compliant

Meet increasingly stringent privacy and security requirements

## Trust and Verify

Data is processed only after the cloud environment is verified

# EscrowAI confidential workflow

US Patents #11,531,904 & #11,748,633 (confidential federation)

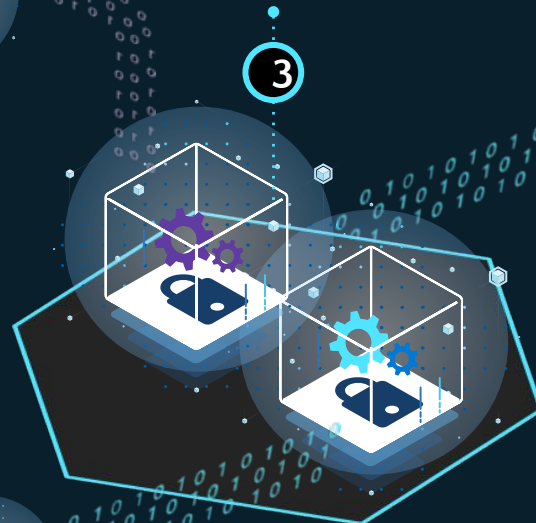
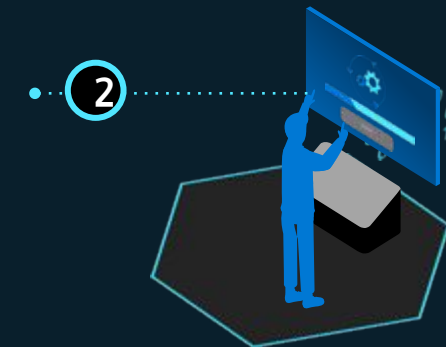
Model Developer submits an encrypted model to EscrowAI where it is wrapped in a secure computing container.

The model container moves into the Data Steward's secure cloud where it is merged with the encrypted data in an attested Trusted Execution Environment (TEE).

Within the (TEE), the data set and model are decrypted, the model runs, and a confidential performance report is created.



Data Steward curates a data set to the algorithm requirements, encrypts it, and uploads it to blob storage within their secure, HIPAA compliant cloud.



If no additional runs are required, the enclave is decommissioned.

The Model Developer's report is checked to ensure no PHI leaves the computing enclave and is delivered.

If computing artifacts are required, they are moved into blob or cold storage.





Thank you