

# Welcome to the

## 22<sup>nd</sup> PIA REGULATORY CONFERENCE



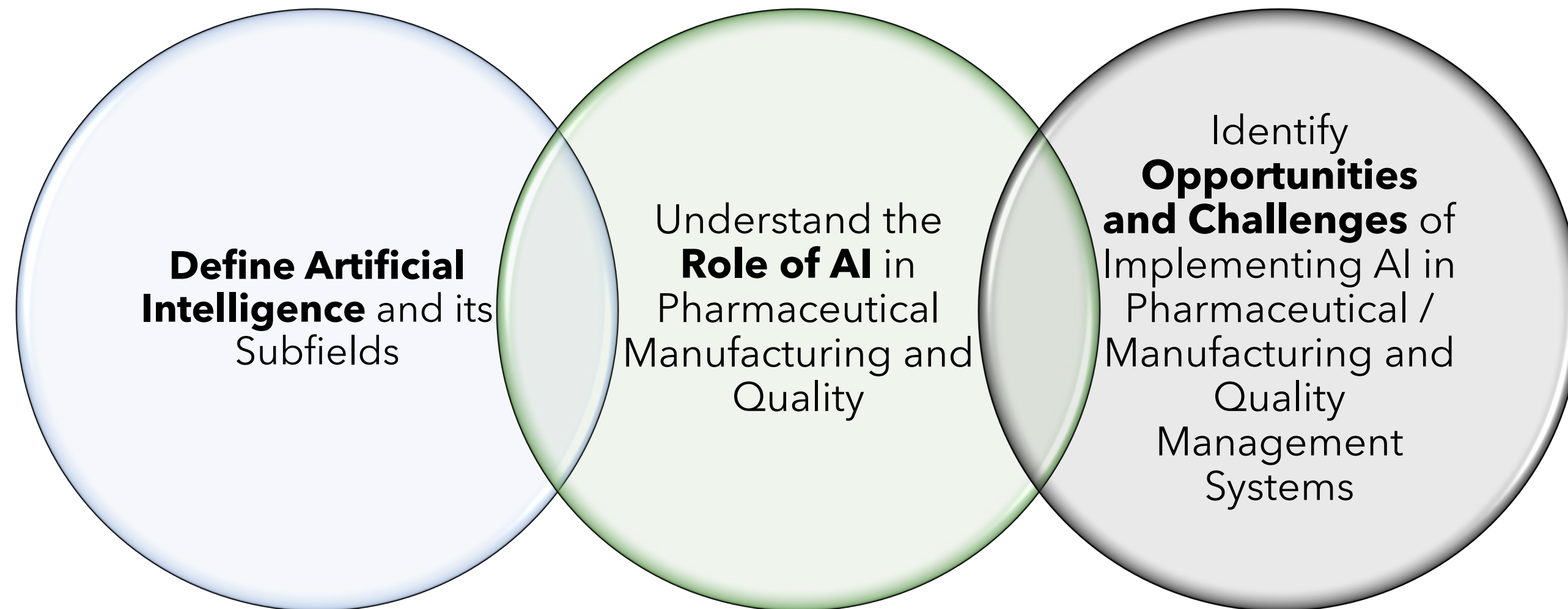
THE FUTURE  
IS NOW  
AI IN QUALITY



# Understanding Artificial Intelligence

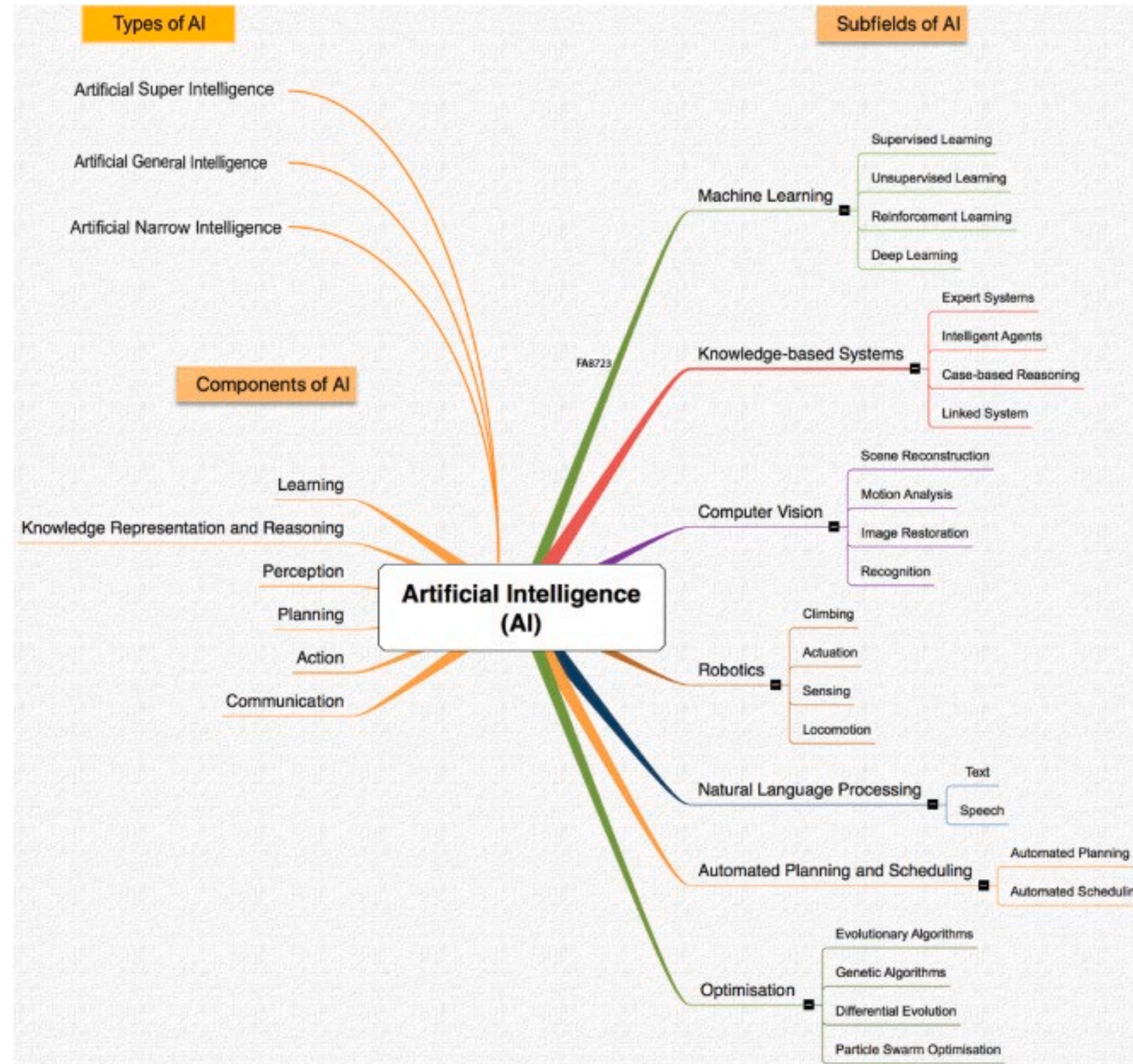
**Angel Benitez, MD, MBA, MHSH, MEng**

# Objectives



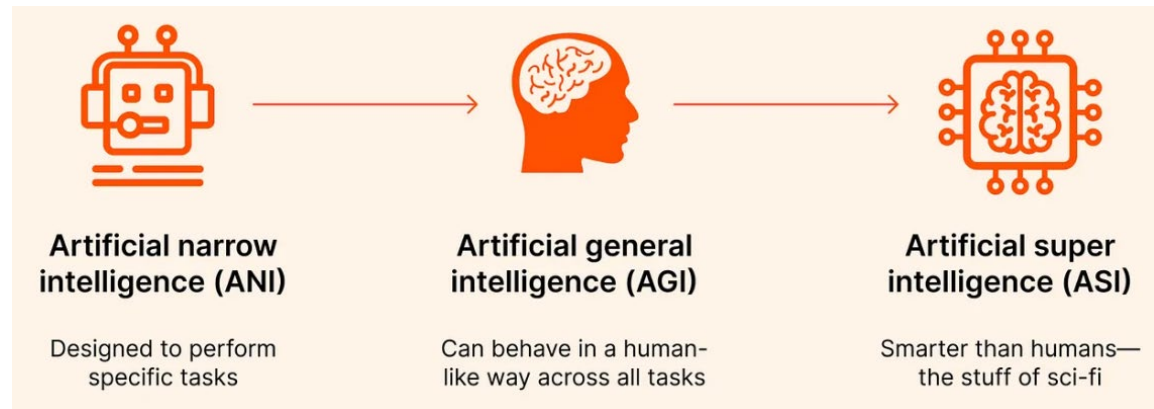


# Types, Components, and Subfields of AI

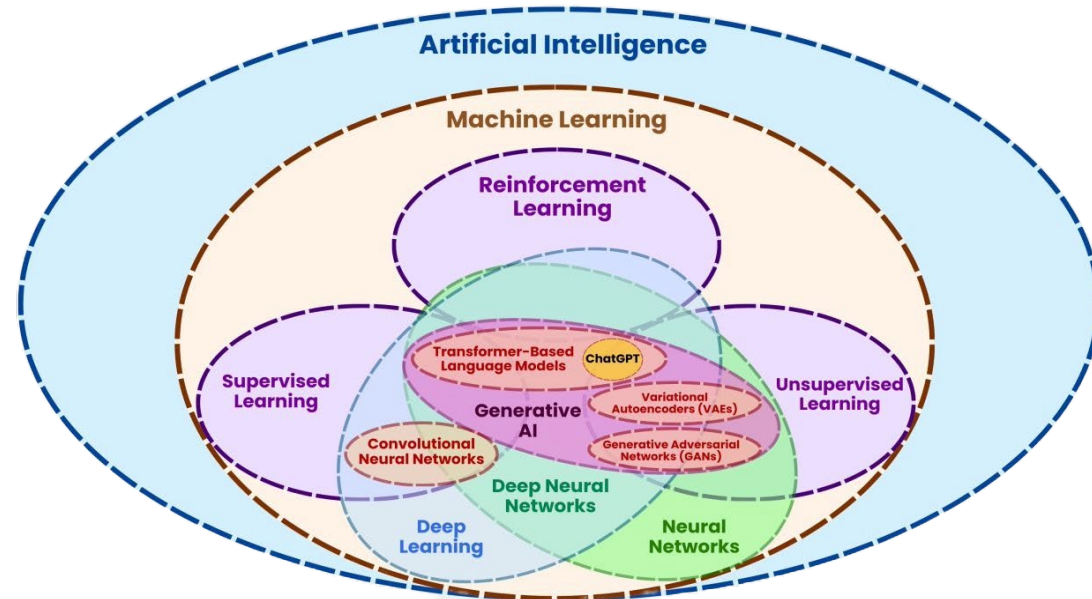




# Artificial Intelligence



A branch of computer science, statistics, and engineering that uses algorithms or models that exhibit behaviors such as learning, making decisions, and making predictions.



<b>Artificial Intelligence (AI)</b> Creating machines capable of intelligent behavior, including reasoning, learning, and perception.	<b>Deep Learning</b> Uses multi-layered neural networks to model complex patterns in large datasets.	<b>Generative AI</b> Creates new data similar to training data, using GANs and VAEs.
<b>Machine Learning (ML)</b> Algorithms that allow computers to learn from data and make predictions. <b>Supervised Learning:</b> Trains models on labeled data for tasks like classification. <b>Unsupervised Learning:</b> Models identify patterns and relationships in unlabeled data, like clustering. <b>Reinforcement Learning:</b> Agents learn by performing actions and receiving rewards or penalties.	<b>Deep Neural Networks (DNNs)</b> Multi-layered networks modeling complex patterns, essential for deep learning.	<b>Transformer-Based Language Models</b> Specialized architectures for natural language processing, like ChatGPT.
	<b>Neural Networks</b> Brain-inspired models used for pattern recognition and predictions in deep learning.	<b>Convolutional Neural Networks</b> A Convolutional Neural Network (CNN) recognizes images by detecting patterns.



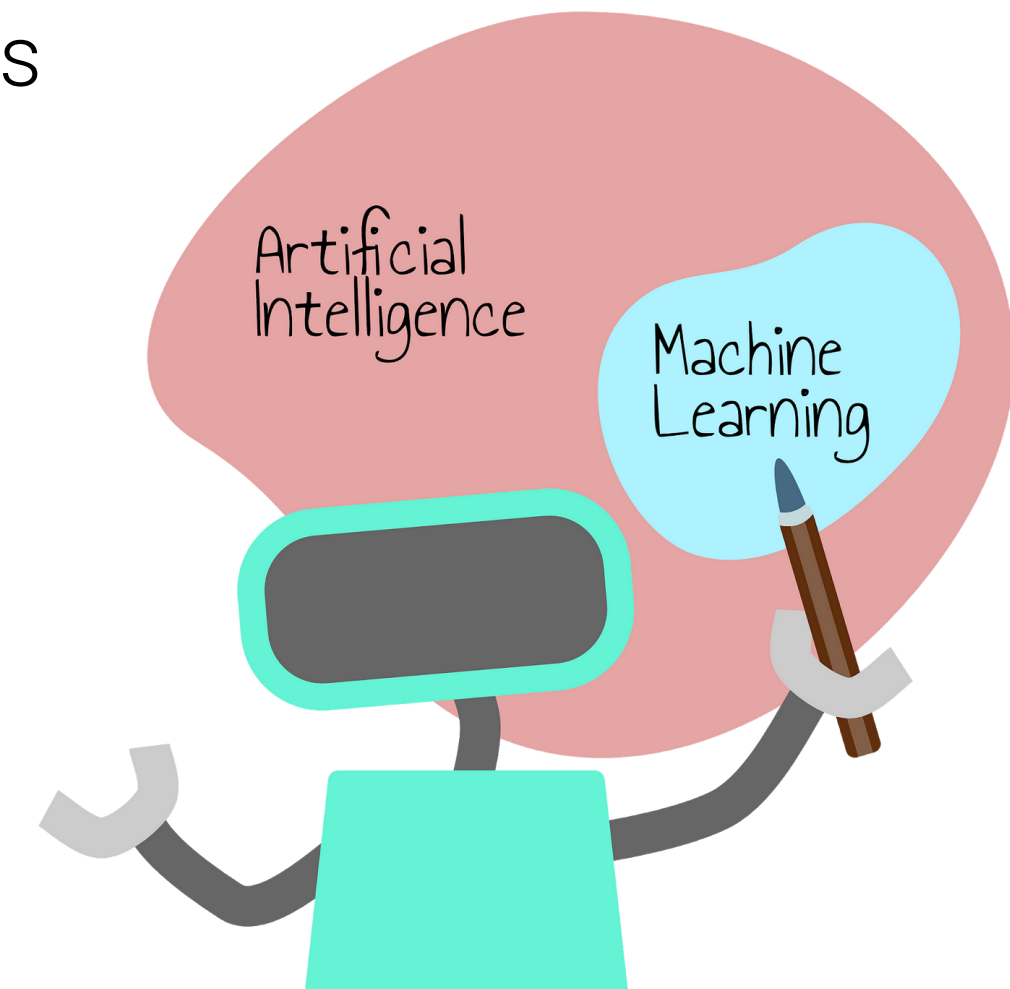
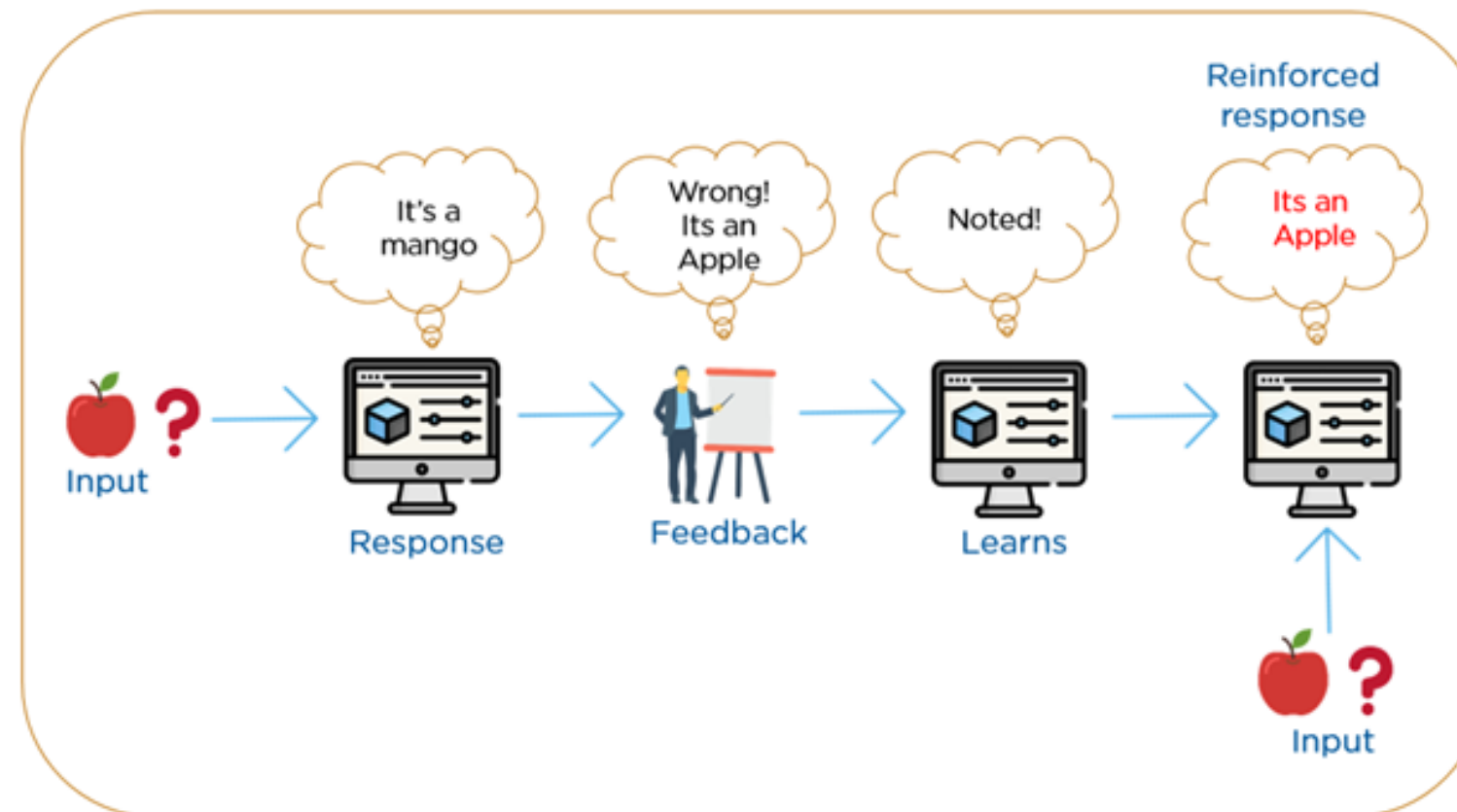
# Machine Learning

## Definition

Machine learning involves computer systems that can **learn and make decisions by themselves** by **recognizing patterns in data**, without being explicitly programmed on what to do.

## Possible Applications

- Predicting equipment maintenance
- Risk Management
- Investigations
- Audit Preparedness





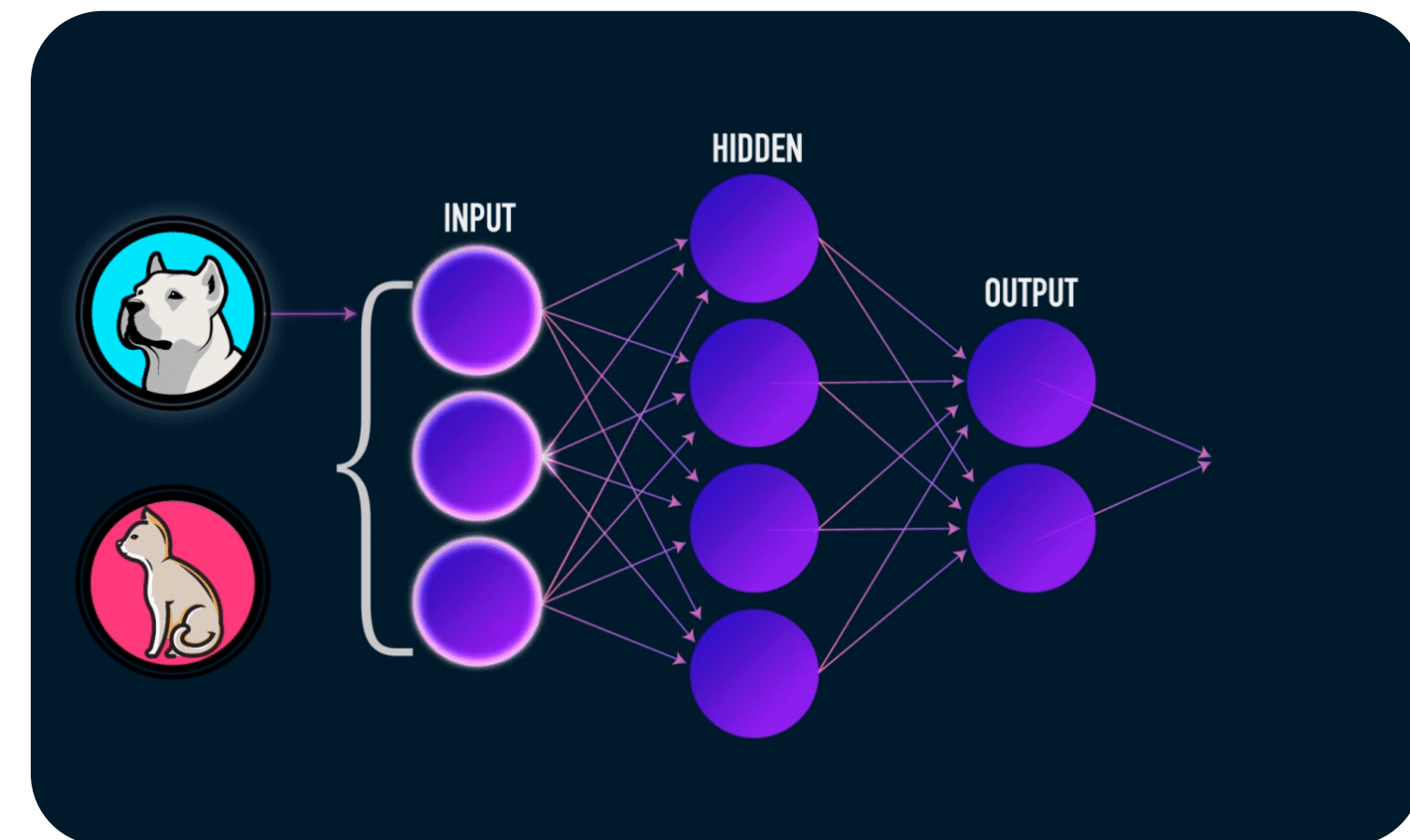
# Deep Learning

## Definition

A specialized branch of machine learning that uses **neural networks** with many layers to **analyze complex data**.

## Applications

- Drug discovery / Identify potential compounds
- Enhance quality control through advanced image analysis
- Precise Investigations



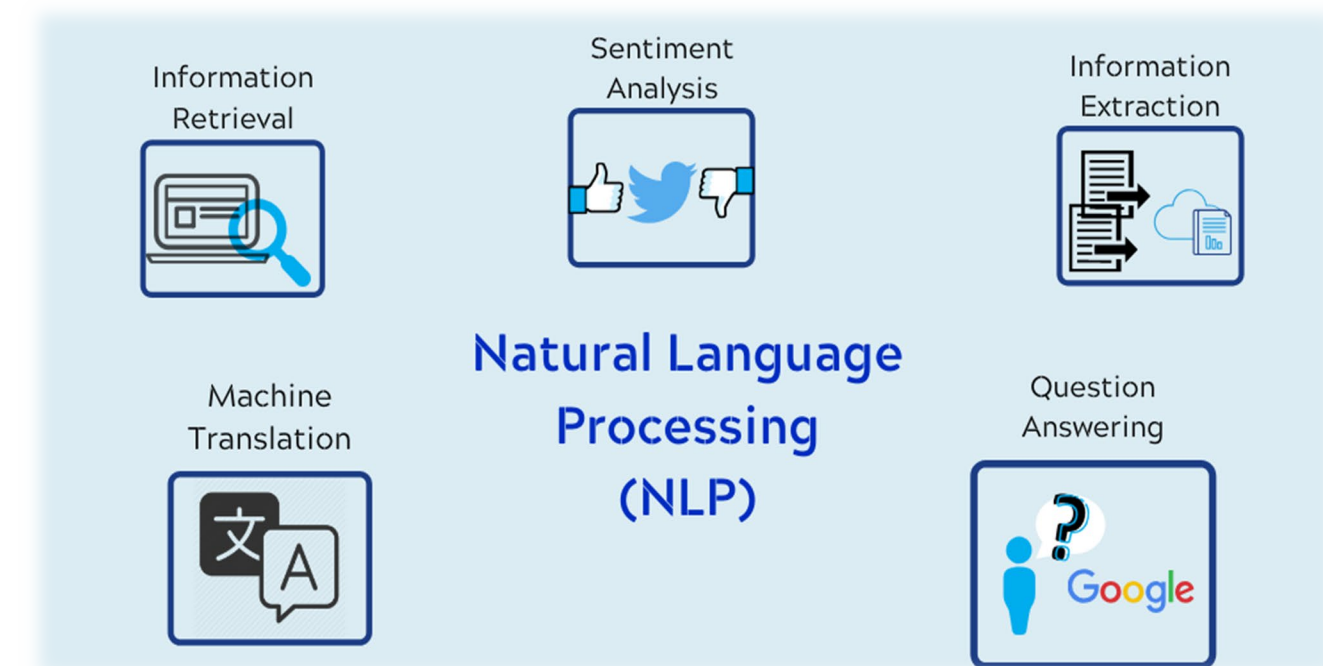
# Natural Language Processing

## Definition

A field of AI focusing on the **interaction between computers and human language**, enabling machines to understand, interpret, and generate human language.

## Possible Applications

- **Automated Creation:** Enhances the drafting process of SOPs and regulatory documents, ensuring accuracy and compliance with FDA standards.
- **Information Extraction:** Pulls key data automatically from existing documents.
- **Content Categorization:** Sort and file documents based on their content.
- **Document Organization:** Arrange all documents for easy access and reference.
- **Continuous Updating:** Keeps documents current by integrating new information as it becomes available.





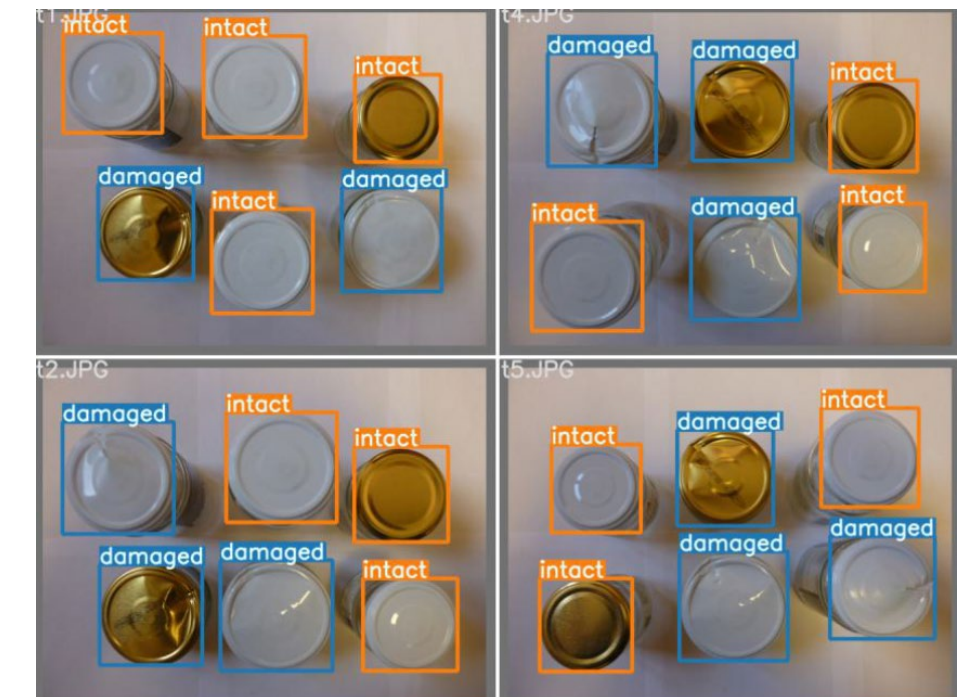
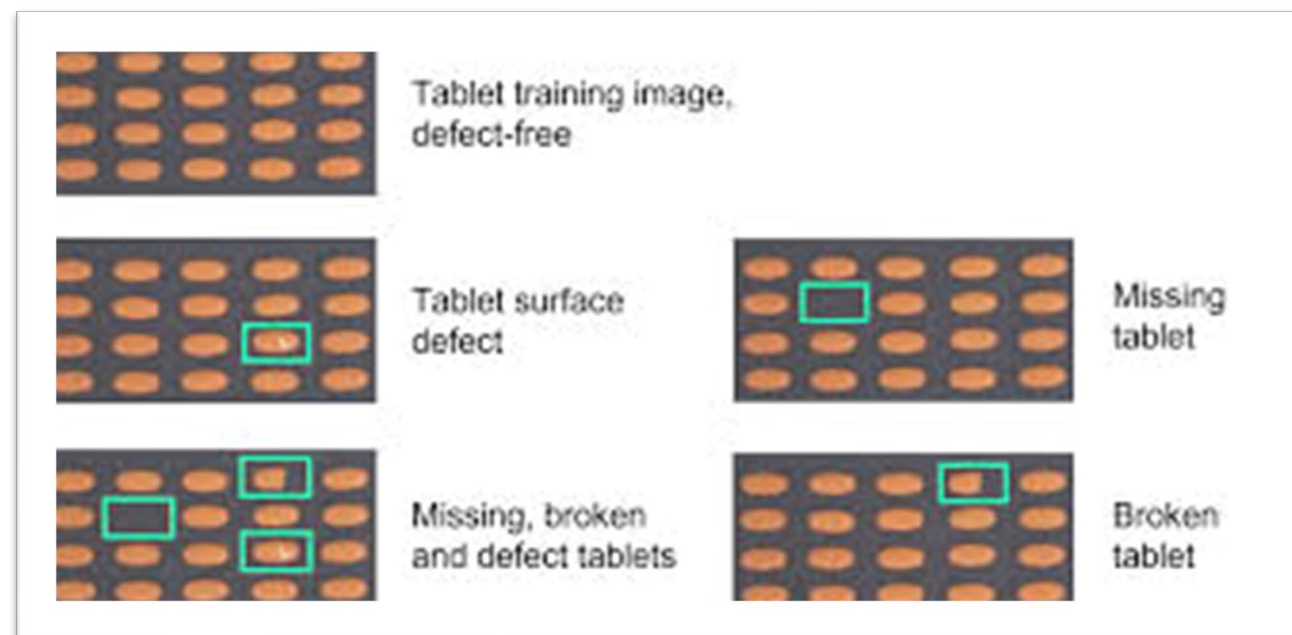
# Computer Vision

- Definition

- A technology that allows computers to interpret and make decisions based on **visual input** from the physical world.

- Possible Applications

- Defects or contamination inspection
- Packaging Quality Assurance



# Latest AI Technology Trends



# Generative Models

Algorithms designed to generate new data based on the patterns it learns from input data, such as images and text.

Uses a combination of neural networks, including GANs, RNNs, VAEs, Deep Reinforcement Learning, Transformer Models, and others, to simulate and innovate within data-driven environments.



Gemini

## Applications:

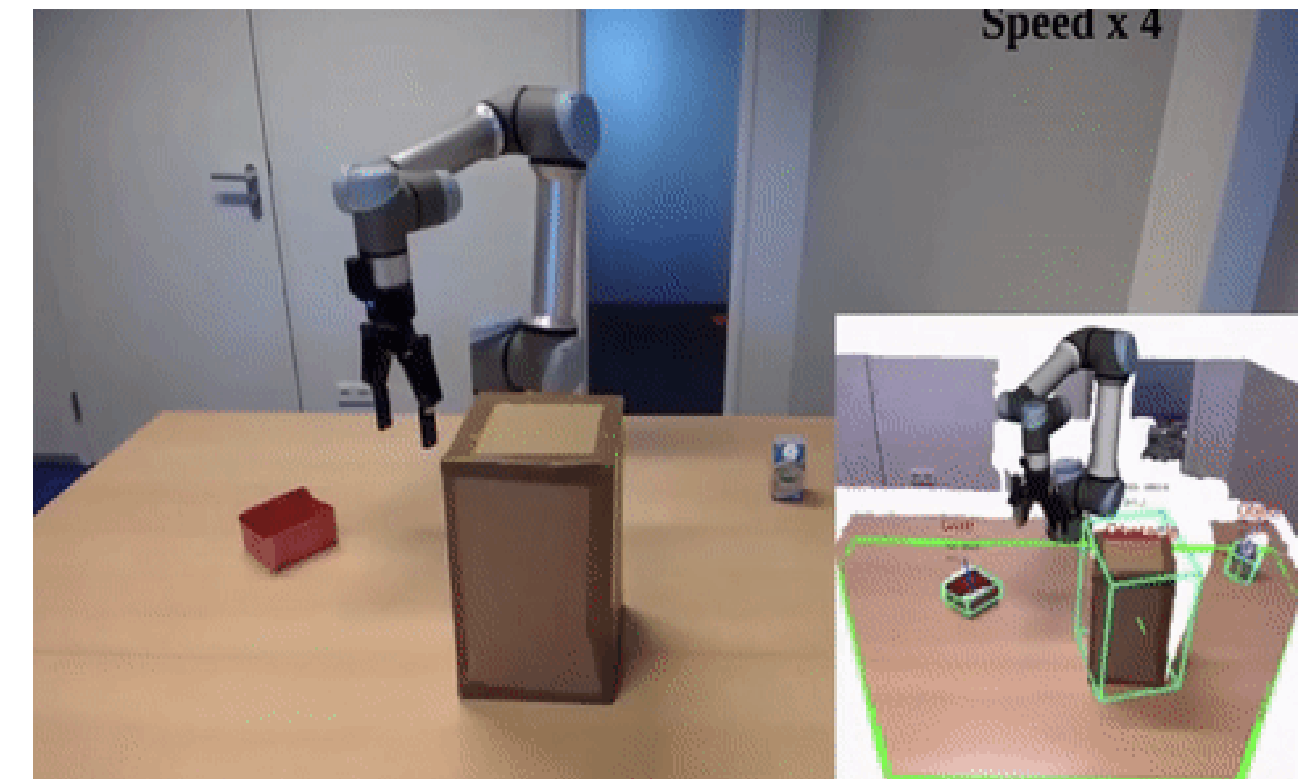
- Drug Discovery, Design and Speed to Market
  - Accelerated Identification: Use generative models to quickly predict new drug molecules.
  - Enhanced Precision: Improve drug-target interaction predictions to cut screening time and cost.
- Personalized Medicine
  - Customized Therapies: Predict individual responses for tailored treatments.
  - Gene Therapy: Design targeted therapies for genetic profiles.
- Manufacturing Optimization
  - Process Simulation: Optimize processes for better quality and yield.
  - Material Innovation: Create new formulations for improved stability and delivery.

# Reinforcement Learning

A branch of machine learning focused on how agents **take actions in an environment** to maximize cumulative reward.

## Applications:

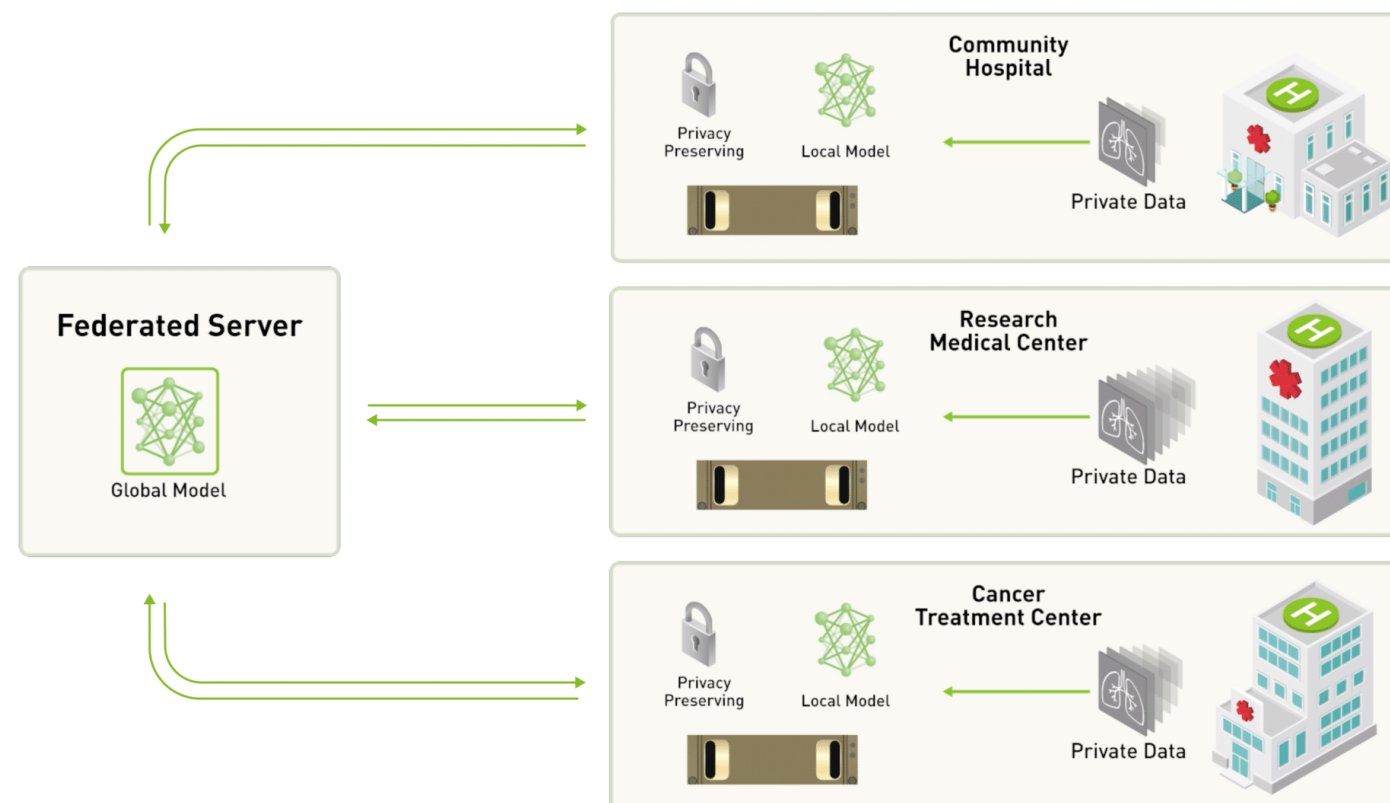
- Optimize production processes
- Supply chain management
- Robotic arms for precise packaging of delicate vials and ampoules
  - Precision Handling: Train robotic arms to handle and package fragile vials
  - Adaptive Movements: Learn to optimize movements based on real-time grip pressure, speed, and placement accuracy feedback.
  - Real-Time Adjustments: Dynamically adjusts the grip force and movement trajectories to handle different packaging scenarios.





# Federated Learning

Collaborative machine learning approach that allows multiple organizations to train AI models using shared knowledge without sharing their proprietary information.



## Enhanced Data Security:

- Protect sensitive information while benefiting from diverse data sources for robust model training.

## Enables Knowledge Management.

## Application:

- ✓ Improve predictive models for patient outcomes without compromising patient data privacy.
  - Cell & gene therapy
  - Personalized medicine

# Explainable AI (XAI)

Set of techniques and methods that make the decision-making processes of AI models **transparent** and **understandable**, enabling users to comprehend and trust the AI's outputs.

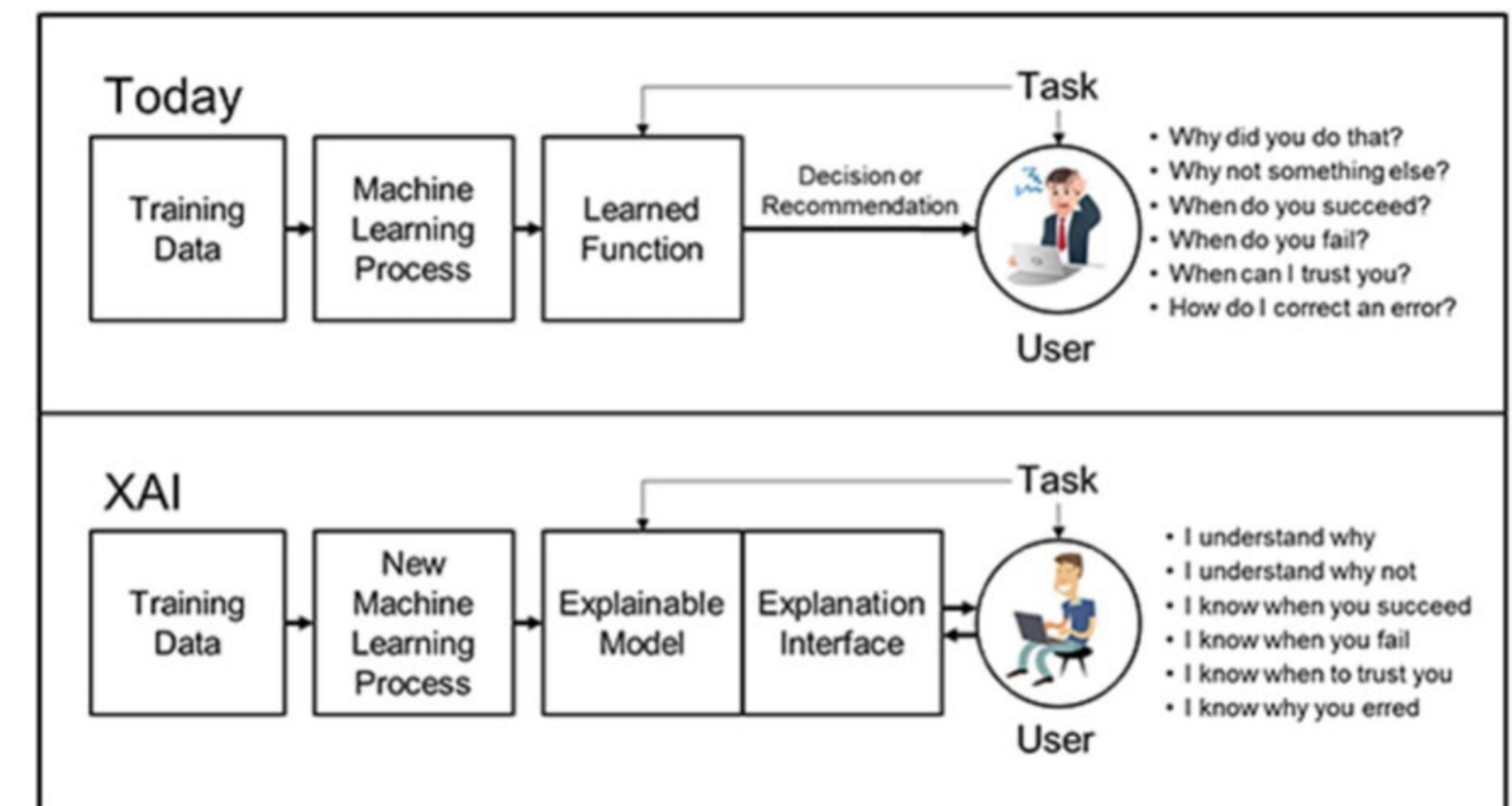
- Why is XAI crucial in Pharma Manufacturing and Quality?

- Transparency and Trust:

- **Clear Explanations:** XAI provides clear, understandable explanations for AI decisions, which is essential for **building trust among users and stakeholders** in the pharmaceutical industry.
    - **Enhanced Decision-Making:** By understanding the rationale behind AI outputs, operators and quality assurance teams can make more informed and accurate decisions.

- Compliance and Accountability:

- **Regulatory Standards:** XAI provides **detailed justifications for AI systems**, ensuring they meet stringent regulatory standards.
    - **Accountability:** XAI models are **accountable** for their actions, making tracing and validating decisions easier, essential for maintaining compliance and ensuring patient safety.





# Edge vs Cloud vs Hybrid Computing

## Edge AI

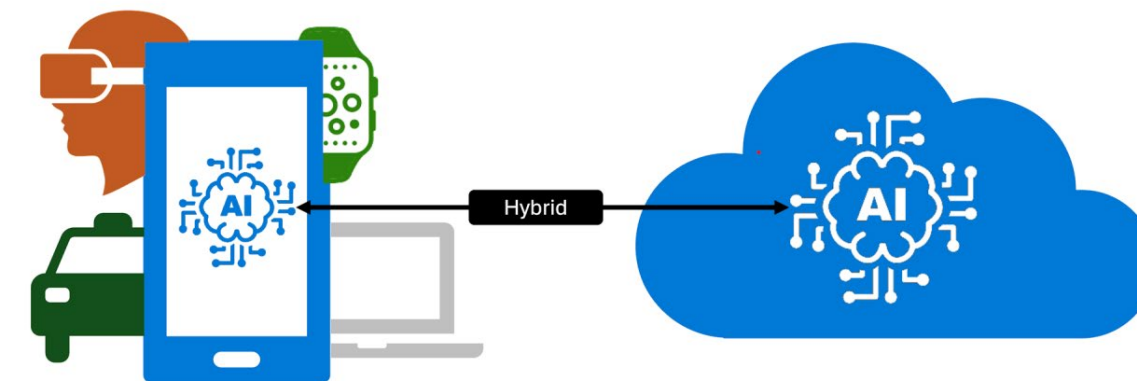
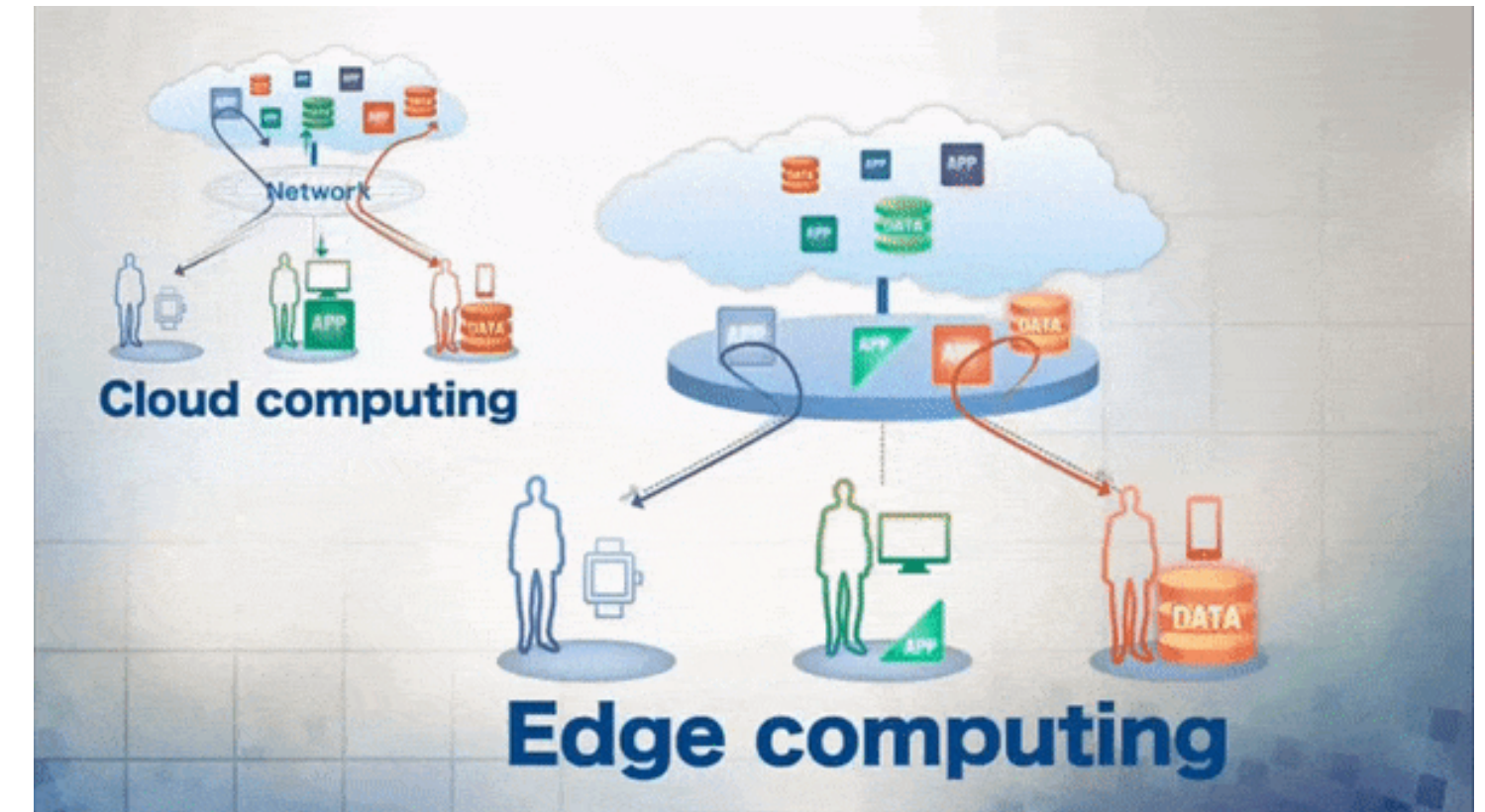
- Involves processing data locally on devices at the network's edge, reducing latency and enhancing real-time data processing capabilities.

## Cloud AI

- Leverages massive cloud computing resources to perform more complex analyses and store larger datasets than edge devices can handle alone.

## Hybrid computing

- Combines edge and cloud computing, utilizing local and remote processing to optimize performance and cost. It processes critical data on the edge for lower latency and leverages cloud resources for scalability. This approach supports real-time analytics and sensitive data handling, providing flexibility and enhanced security for diverse computing needs.





# AI for Cybersecurity

## Proactive Defense:

- AI systems detect and respond to cyber threats in real time, enhancing security measures.

## Predictive Analysis:

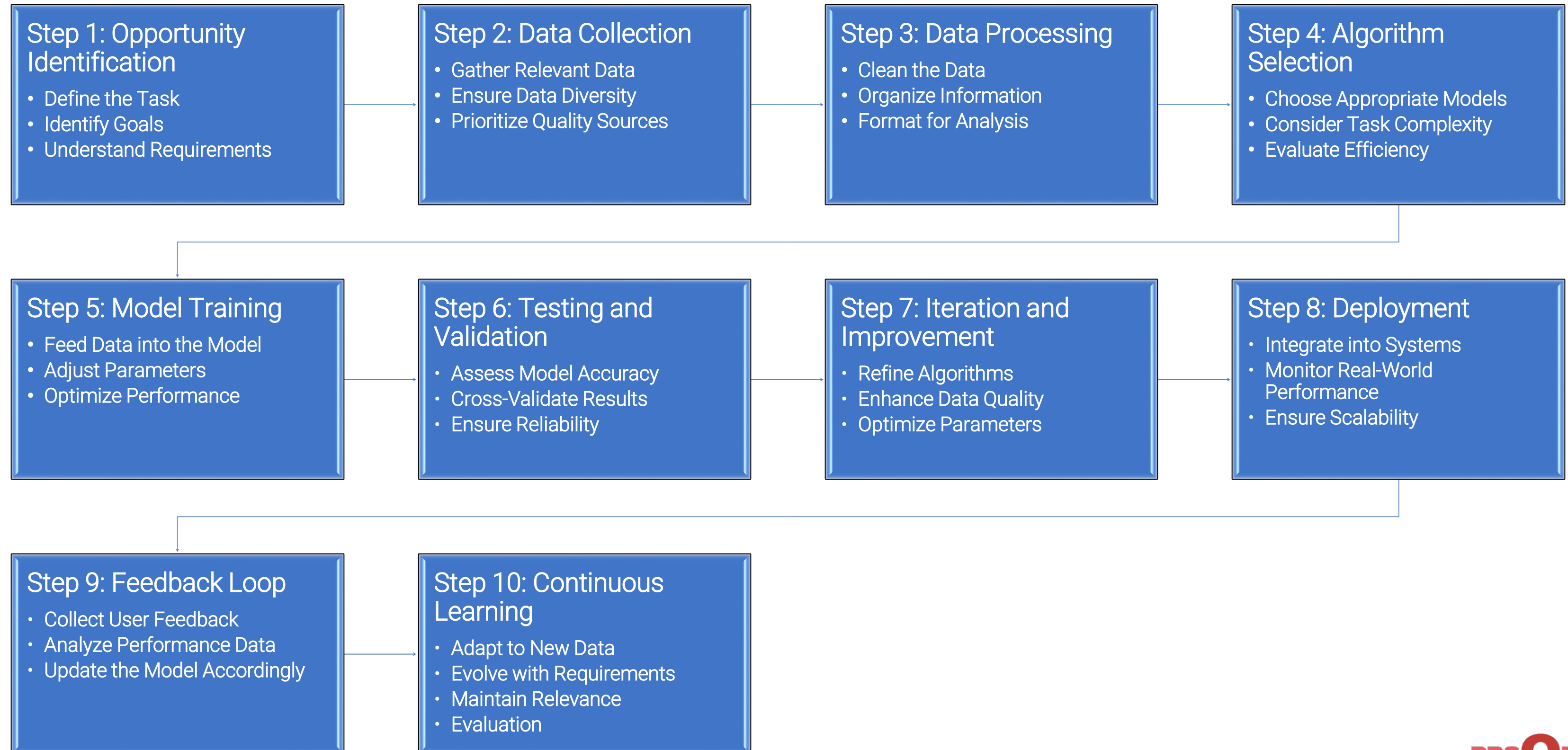
- Use AI to predict and prevent potential security breaches before they occur.

## Application:

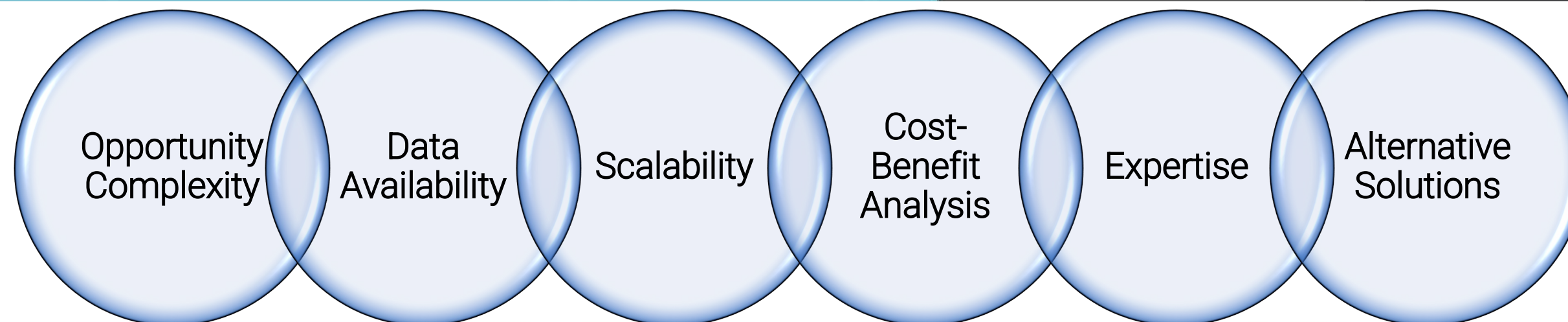
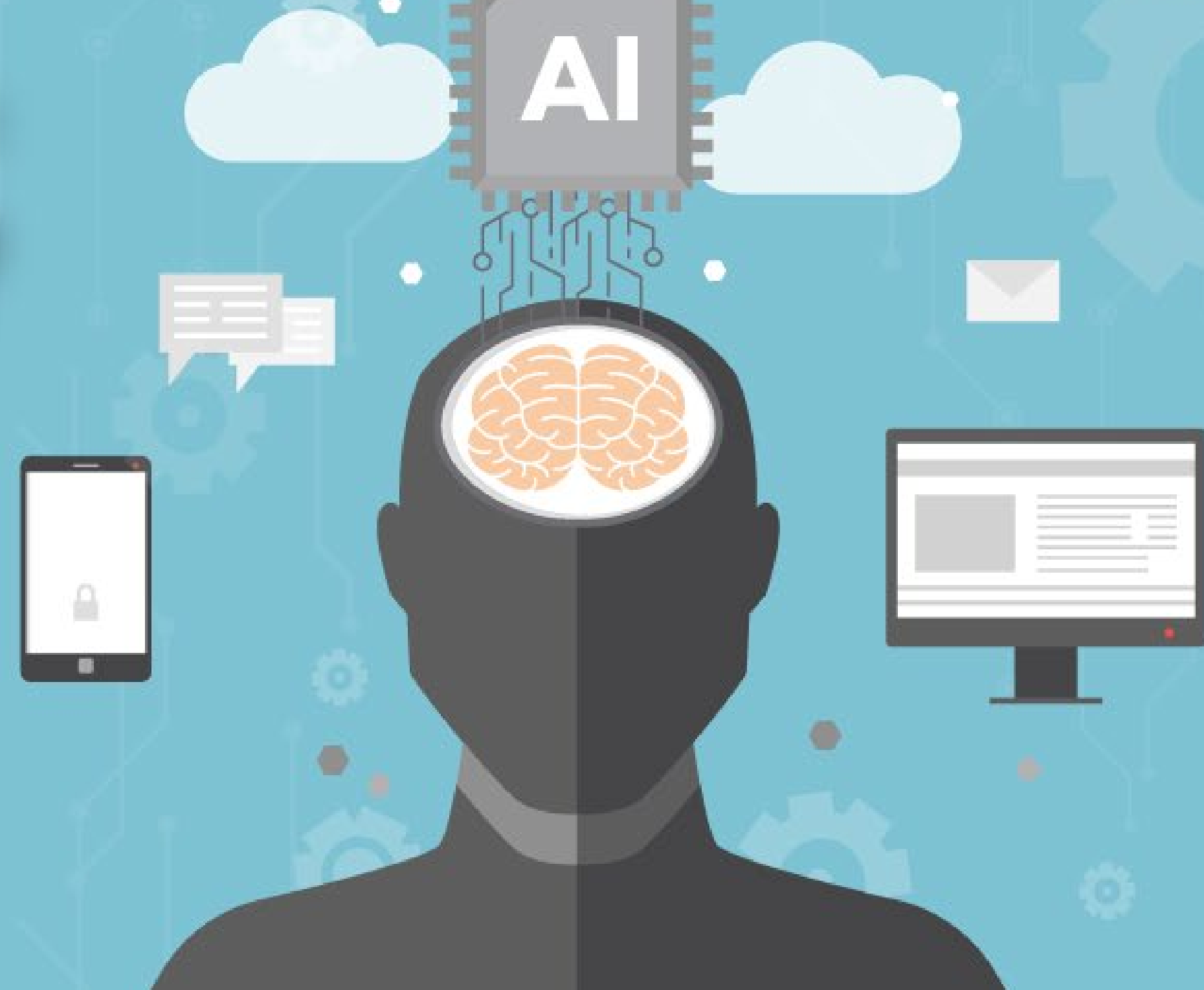
- Protecting sensitive pharmaceutical research and patient data from cyber threats by proactively identifying and mitigating potential breaches.



# Basics of AI: From Data Collection to Results



# Artificial Intelligence **DO I NEED IT?**





# Opportunities Of AI Within Pharma



## Manufacturing and Production

- **Process Optimization:**
  - Automate and streamline workflows to enhance productivity and equipment effectiveness.
- **Quality Control:**
  - Real-time inspections to detect defects.

## Innovation in Manufacturing Processes

- **Accelerate Development:**
  - Analyze data to optimize manufacturing processes and reduce production times.
- **Scheduling:**
  - Implement smart scheduling to minimize downtime and improve resource allocation.

## Quality and Compliance

- **Consistency in Operations:**
  - Adjust processes in real time to maintain high-quality standards.
- **Regulatory Compliance:**
  - Help generate detailed compliance reports for each manufacturing step.

## Safety and Maintenance

- **Predictive Maintenance:**
  - Monitor equipment to anticipate maintenance needs and avoid failures.
- **Workplace Safety:**
  - Enhance safety through AI monitoring and assistive technologies for handling heavy tasks.

## Supply Chain Management:

- **Forecasting and Logistics:**
  - Predicts demand accurately and optimizes stock levels and logistics, preventing drug shortages.

## Document Control

- **SOPs, Compliance and Investigations:**
  - Manage and update SOPs efficiently using AI to ensure compliance.

# Challenges of AI

## Data Quality and Integration

- High-Quality Datasets
  - AI needs accurate, complete, and relevant data.
- System Integration
  - Integrating AI with existing IT systems is complex.

## Regulatory Compliance

- AI must comply with strict pharmaceutical regulations.
- Regular checks are essential for AI accuracy and safety

## Ethical Considerations

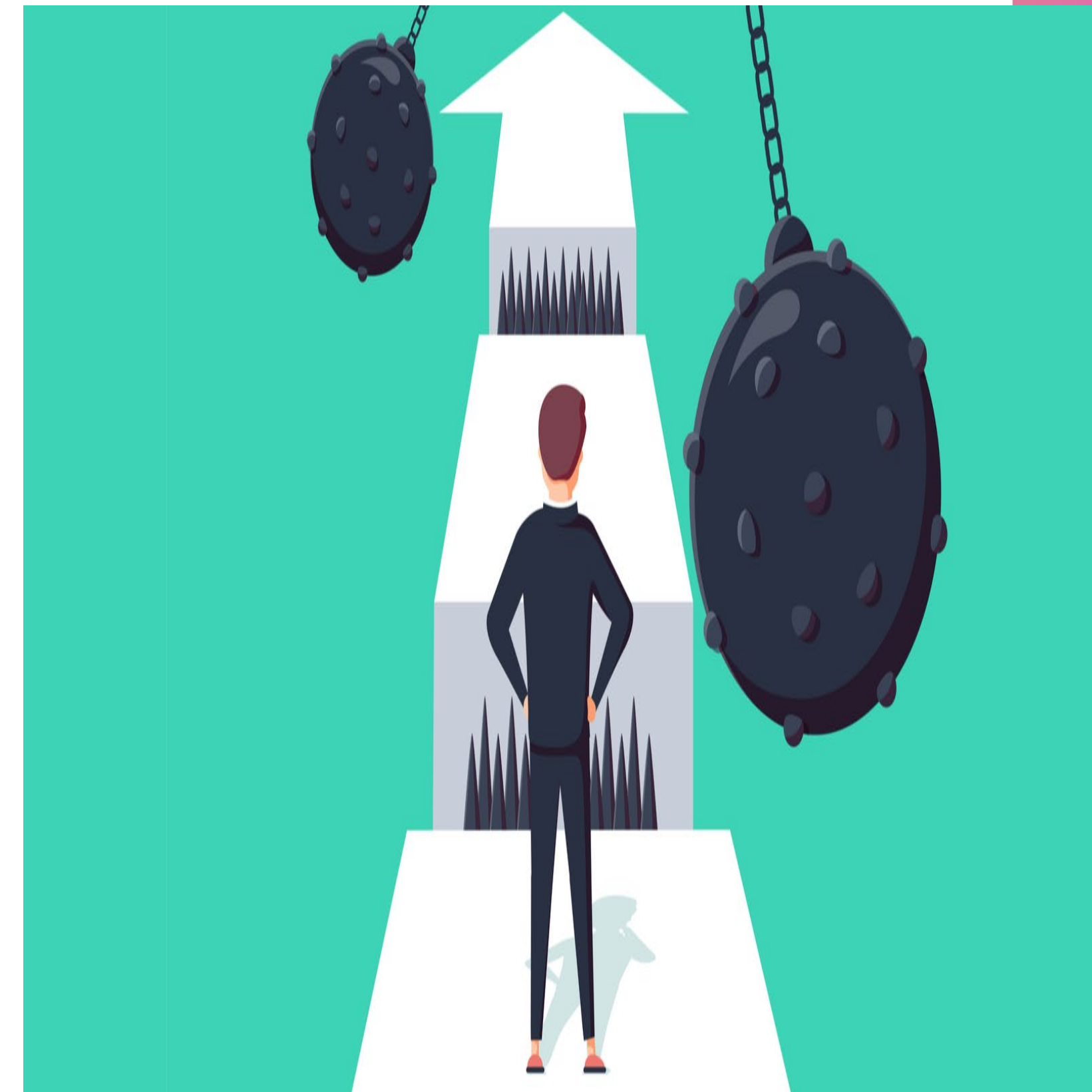
- Data Privacy and Fairness
  - Protect patient data and ensure fair AI outcomes.
- Transparency & Accountability
  - Ensure understandable and traceable AI decisions.

## Scalability and Interoperability

- As AI applications expand, ensuring that systems can scale efficiently is critical.
- Managing larger datasets or integrating AI across global operations.

## Human-AI connection

- Cultural Resistance (AI as a tool, not as a replacement)
- Adaptation and Training
- Trust in AI Decisions





# AI Ethics and Potential Implications in Pharma

## Ensuring Fairness and Equity

**Non-Discrimination:** Ensuring AI systems do not discriminate.  
**Accessibility:** Designing AI tools to be accessible to all.

## Implications for Workforce

**Human Oversight:** Maintaining a balance between automation and human involvement.  
**Training and Education:** Continuous training programs for employees.

## Data Privacy and Security

**Safeguarding Patient Data:** Implementing strict data privacy measures.  
**Cybersecurity Measures:** Deploying robust cybersecurity protocols.

## Trust and Acceptance

**Building Trust:** Establishing transparent AI systems.  
**Engagement with Stakeholders:** Involving stakeholders in AI development and deployment.



# AI Governance

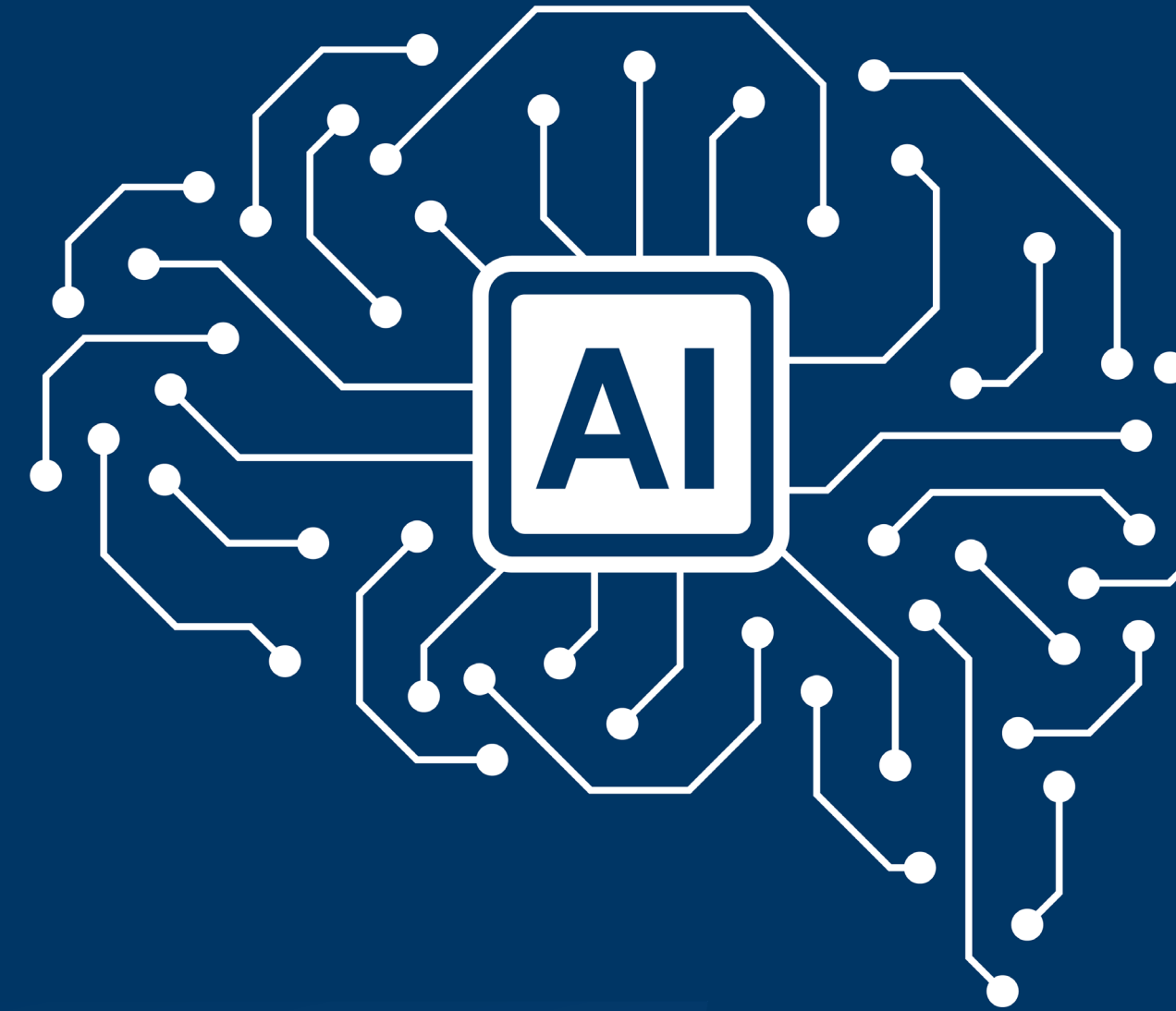
## Internal Governance Programs

- Data Privacy and Security:
  - Protect sensitive information.
- Ethical AI Frameworks:
  - Ensure transparency, fairness, and accountability.
- Accountability and Oversight:
  - Define clear roles and responsibilities.
- Guidelines:
  - Provide responsible AI use guidelines.
- Implementation:
  - Training, continuous monitoring, and regular reporting.
- Multidisciplinary Teams:
  - Combine AI, IT, and operations expertise.
- Algorithm Inaccuracies:
  - Identify biases through rigorous testing.
- Success Thresholds:
  - Establish performance metrics.

## Third-Party Collaboration:

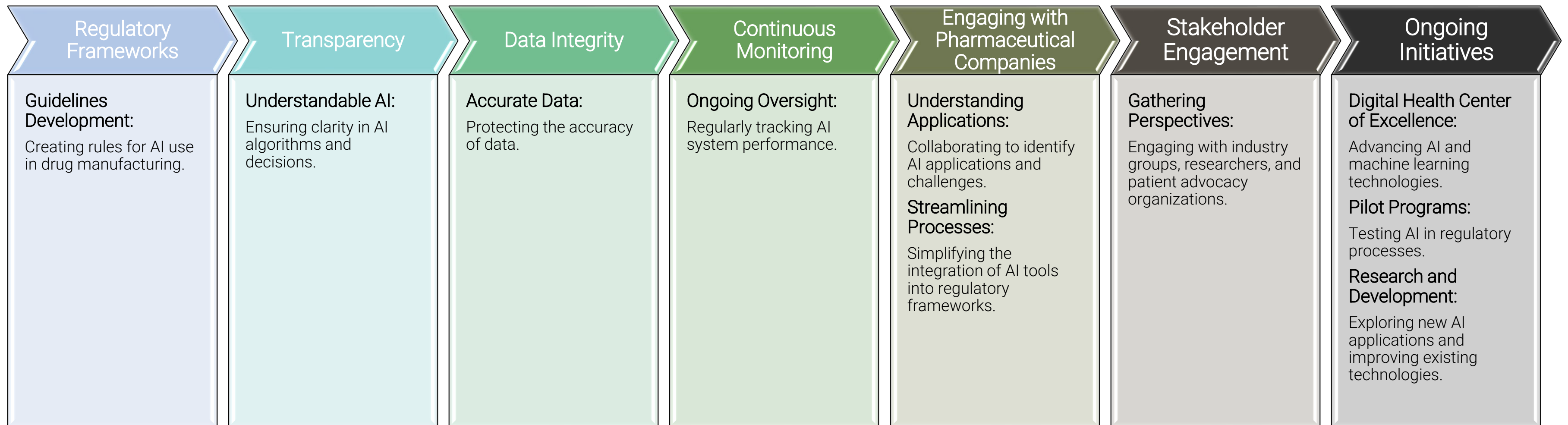
- Unbiased evaluation of AI systems
- Independent Verification like Auditors and Third-Party Experts
  - Conduct independent verification and validation for assurance
- Benchmarking
  - Use industry-standard benchmarks and protocols to test AI systems.





# What Does The FDA Say About AI?

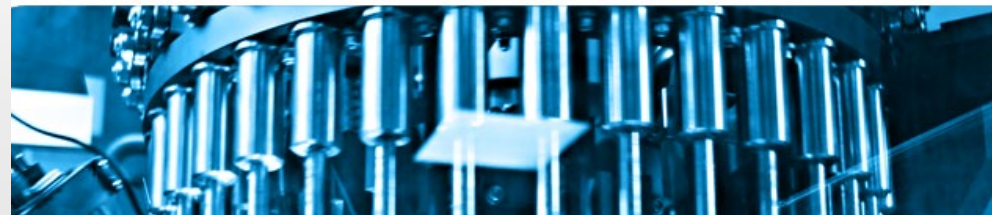
# FDA's Role in AI for the Pharmaceutical and Medical Device Industries





CENTER FOR DRUG EVALUATION AND RESEARCH

# Artificial Intelligence in Drug Manufacturing



U.S. FOOD & DRUG  
ADMINISTRATION

## Proposed Regulatory Framework for Modifications to Artificial Intelligence/Machine Learning (AI/ML)- Based Software as a Medical Device (SaMD)

*Discussion Paper and Request for Feedback*



FDA U.S. FOOD & DRUG  
ADMINISTRATION

## Artificial Intelligence & Medical Products: How CBER, CDER, CDRH, and OCP are Working Together

FDA U.S. FOOD & DRUG  
ADMINISTRATION

### Good Machine Learning Practice for Medical Device Development: Guiding Principles October 2021

The U.S. Food and Drug Administration (FDA), Health Canada, and the United Kingdom's Medicines and Healthcare products Regulatory Agency (MHRA) have jointly identified 10 guiding principles that can inform the development of Good Machine Learning Practice (GMLP). These guiding principles will help promote safe, effective, and high-quality medical devices that use artificial intelligence and machine learning (AI/ML).

Artificial intelligence and machine learning technologies have the potential to transform health care by deriving new and important insights from the vast amount of data generated during the delivery of health care every day. They use software algorithms to learn from real-world use and in some situations may use this information to improve the product's performance. But they also present unique considerations due to their complexity and the iterative and data-driven nature of their development.

These 10 guiding principles are intended to lay the foundation for developing Good Machine Learning Practice that addresses the unique nature of these products. They will also help cultivate future growth in this rapidly progressing field.

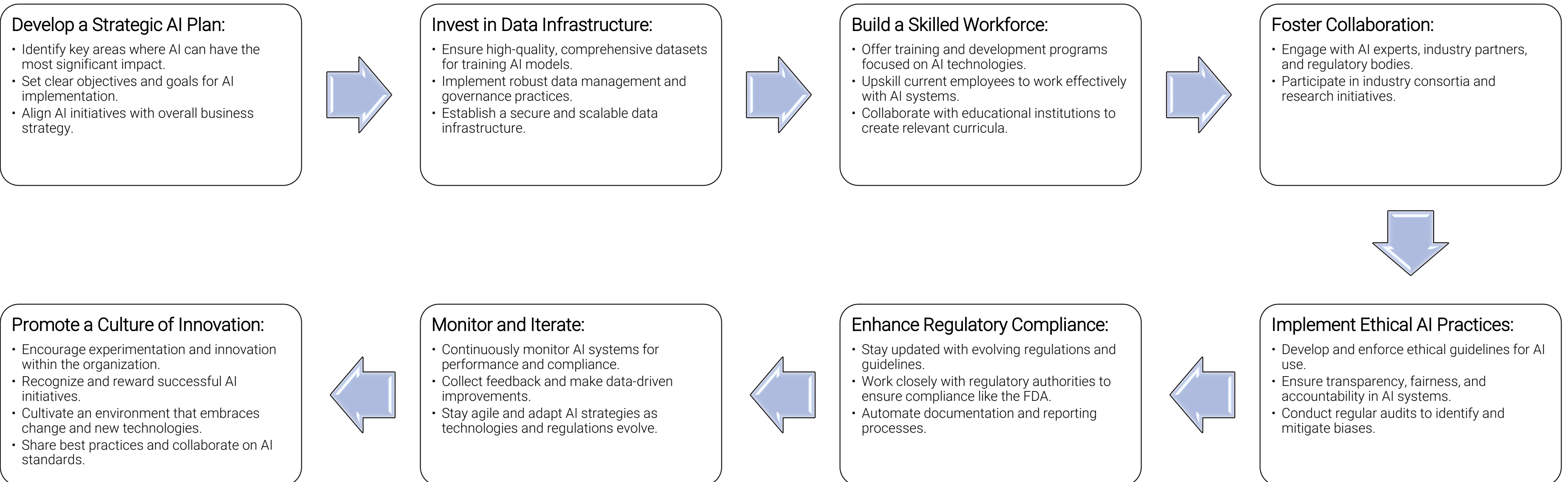
Good Machine Learning Practice for Medical Device Development: Guiding Principles	
Multi-Disciplinary Expertise Is Leveraged Throughout the Total Product Life Cycle	Good Software Engineering and Security Practices Are Implemented
Clear Goals, Participants and Roles Are Representative of the Intended Patient Population	Training Data Sets Are Independent of Test Sets
Selected Reference Datasets Are Based Upon Real-World Data	Model Design Is Tailored to the Available Data and Reflects the Intended Use of the Device
Model Is Validated on the Performance of the Human-At-Large	Testing Demonstrates Device Performance During Clinically Relevant Conditions
Users Are Provided Clear, Essential	Deployed Models Are Monitored For







# Steps for Implementing AI



# Conclusion

AI is here to stay.

AI is a tool that **augments** human decision-making and enables risk management – it does not replace humans.

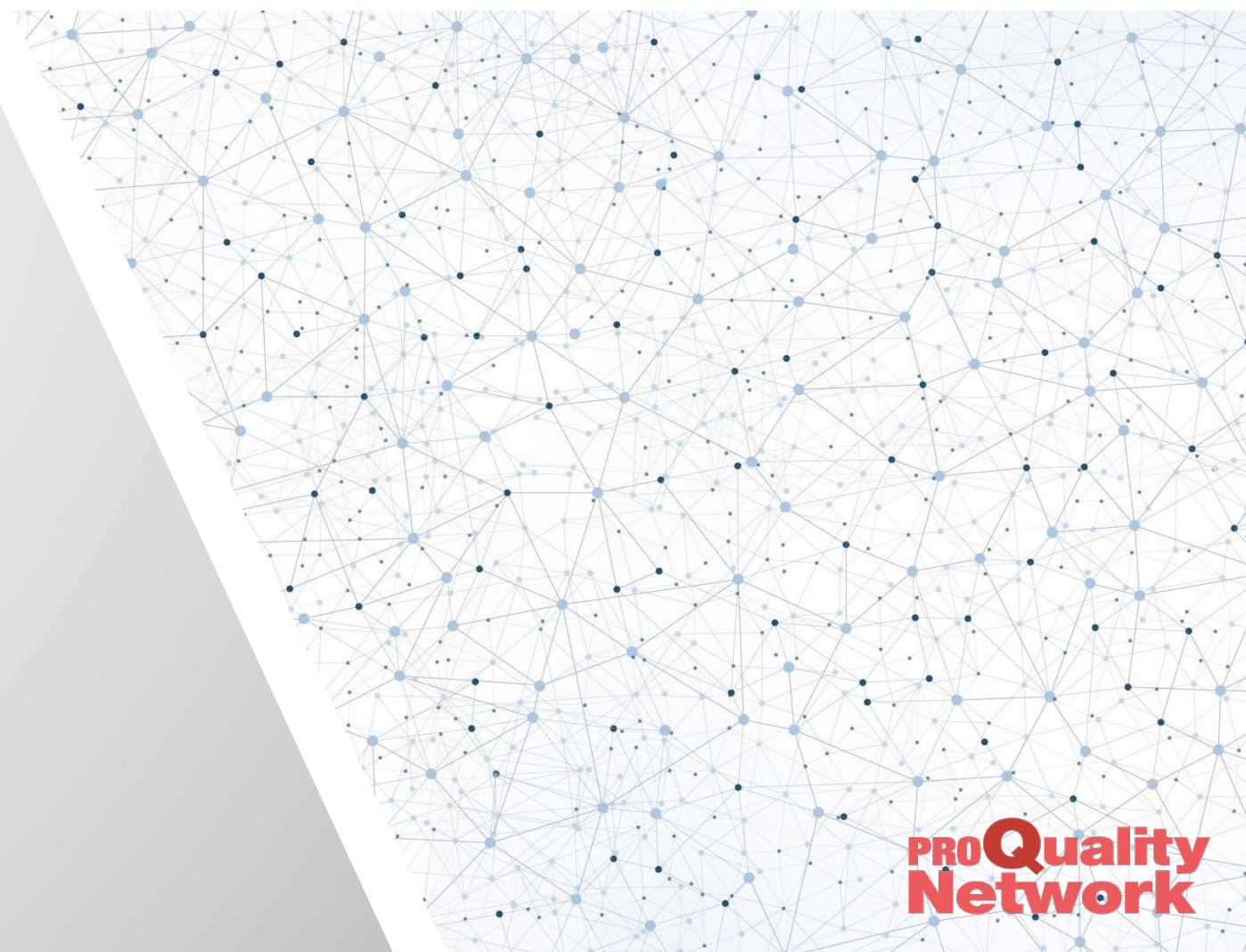
Companies embracing AI systems will have a **competitive advantage**.

AI implementation is not just a technological upgrade but a **strategic necessity**.

We need to embrace the future with AI because the future is now.









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**Scan to connect**