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MPI, PGAS and Hybrid MPI+PGAS Library



# Designing Next-Generation Intelligent CyberInfrastructure: An Overview of the NSF-AI ICICLE Institute

NIRTD MAGIC Seminar Series (June '22)

by

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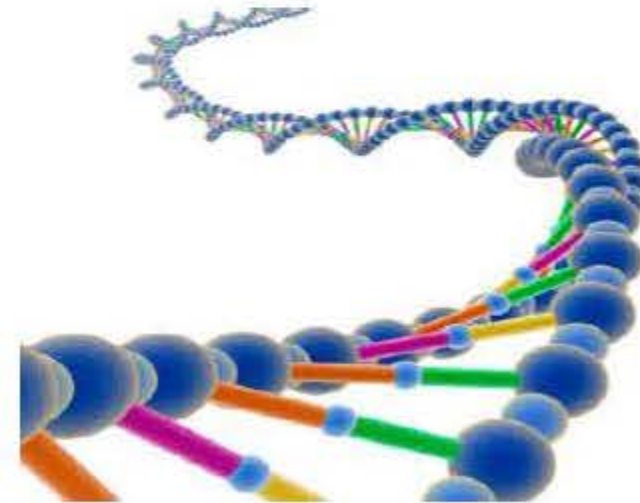
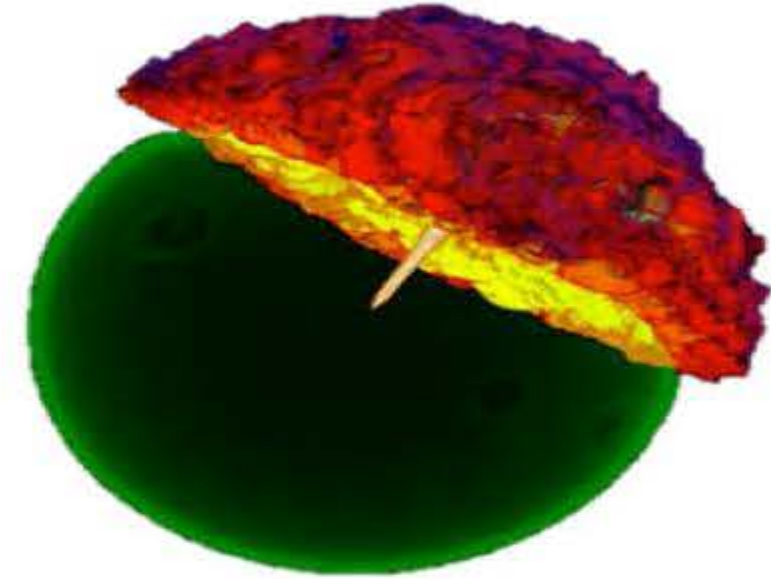
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High-End Computing (HEC) has been evolving over the last three decades with multiple **stages**



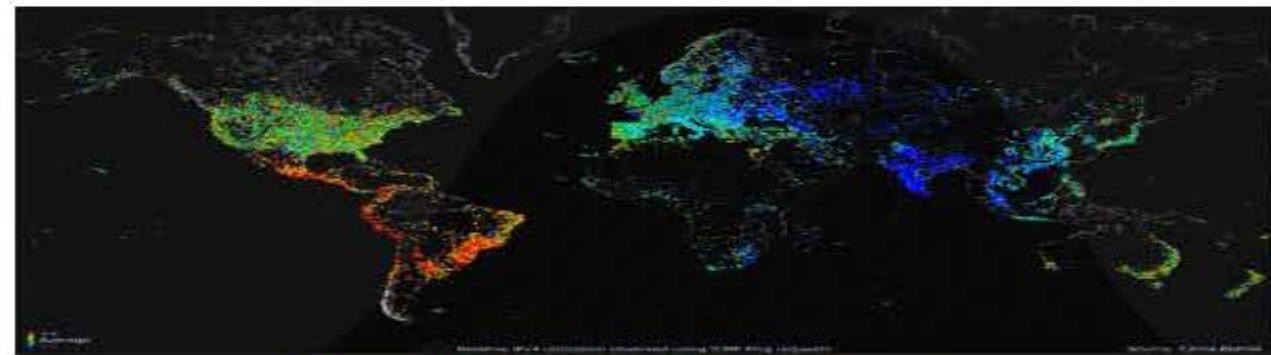
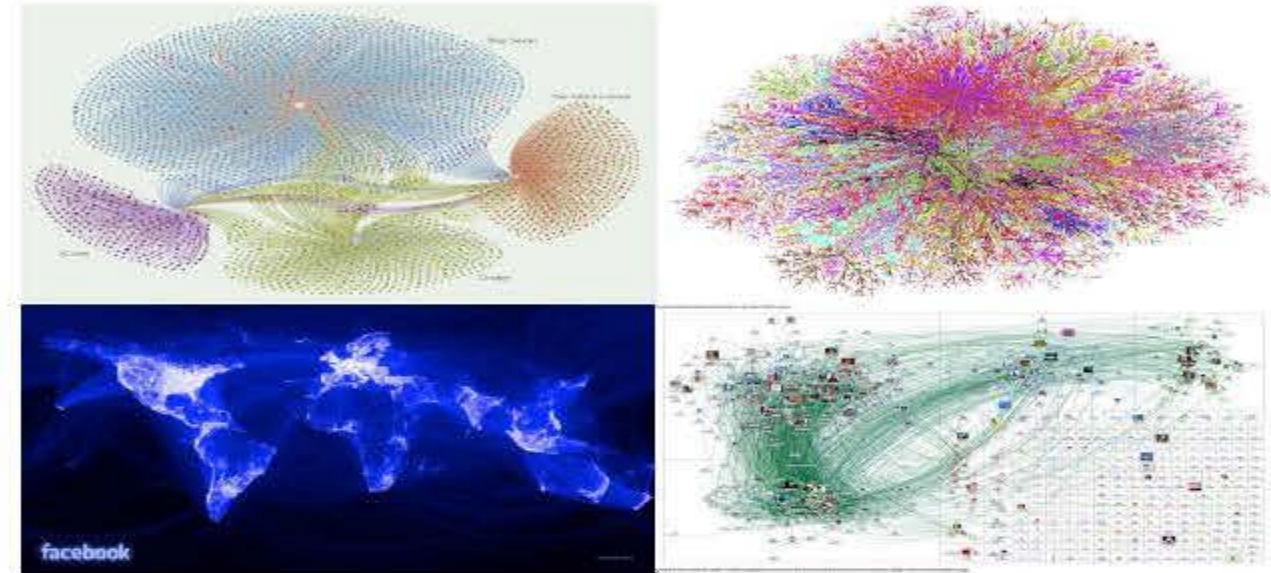
# Stage 1 (1975 - ): Scientific Computing with Supercomputing/High-Performance Computing (HPC)



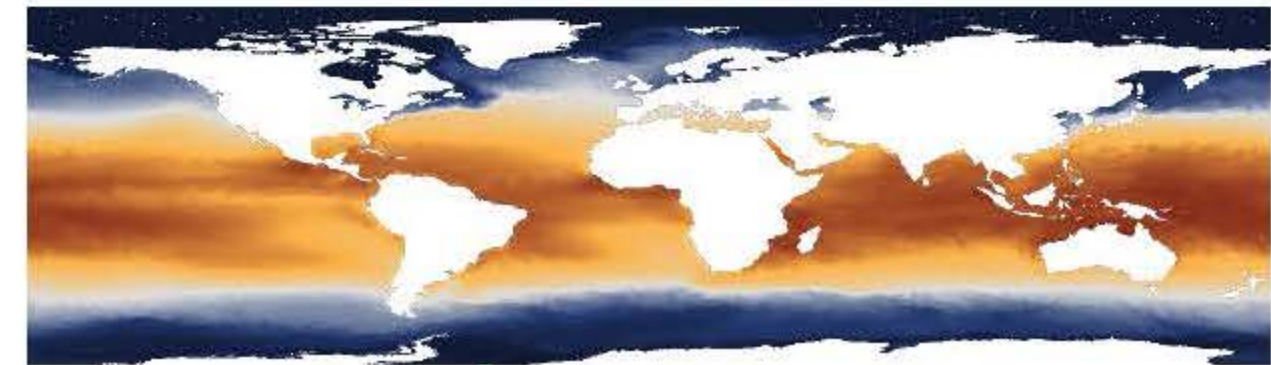


# Stage 2 (2000 - ): HPC + Big Data Analytics

- **Big Data** changed the way people understand and harness the power of data, both in the business and research domains
- Big Data and High-Performance Computing (**HPC**) started **converging** to meet large scale data processing challenges
- Running High Performance Data Analysis (**HPDA**) workloads in the **cloud** has been gaining popularity
  - According to the latest OpenStack survey, **27%** of cloud deployments are running HPDA workloads
- Has evolved into **Data Science**



<http://www.coolinfographics.com/blog/tag/data?currentPage=3>

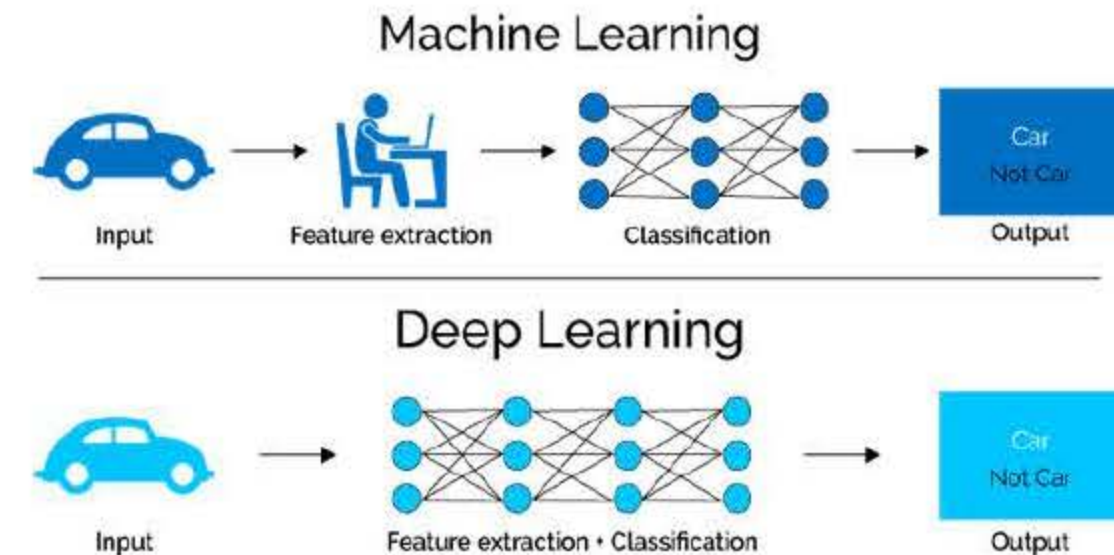
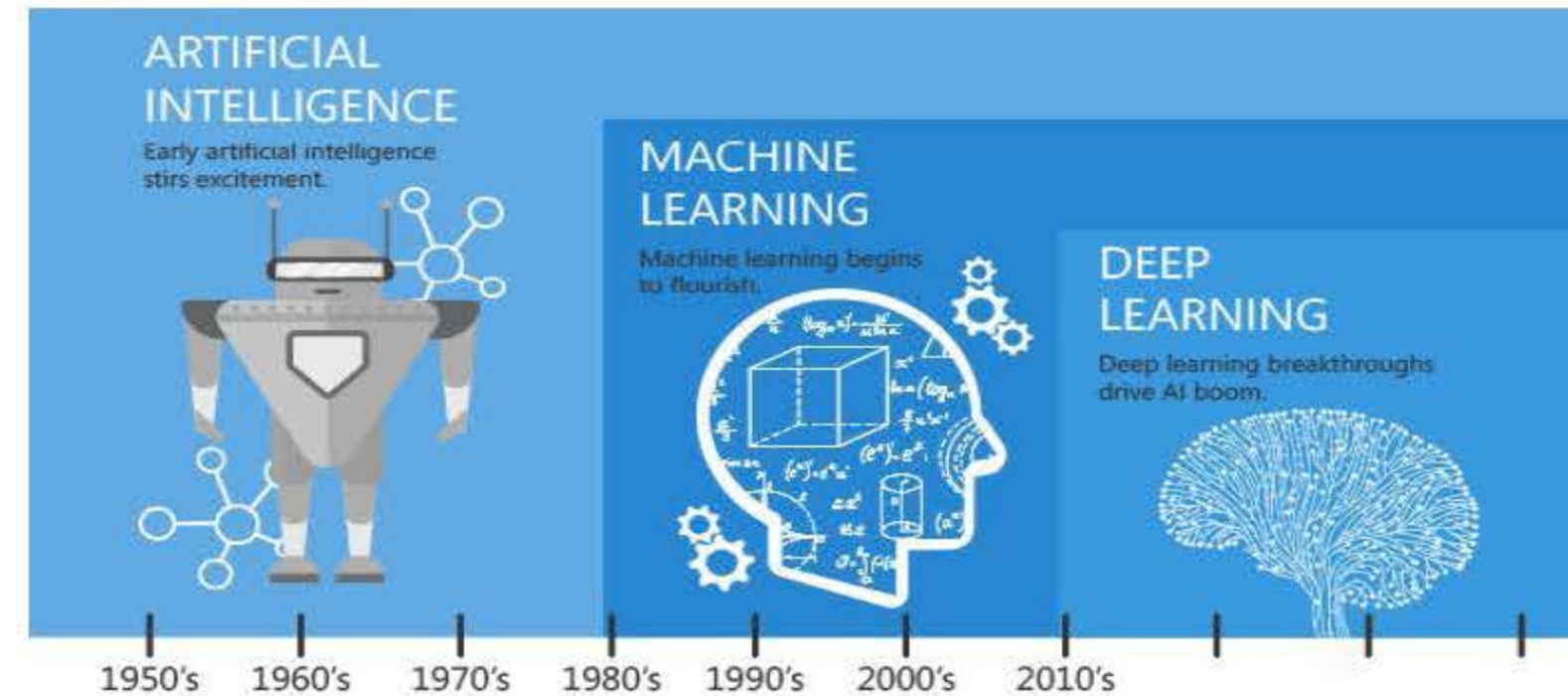


<http://www.climatecentral.org/news/white-house-brings-together-big-data-and-climate-change-17194>



# Stage 3 (2010 - ): HPC + AI (Machine Learning/Deep Learning)

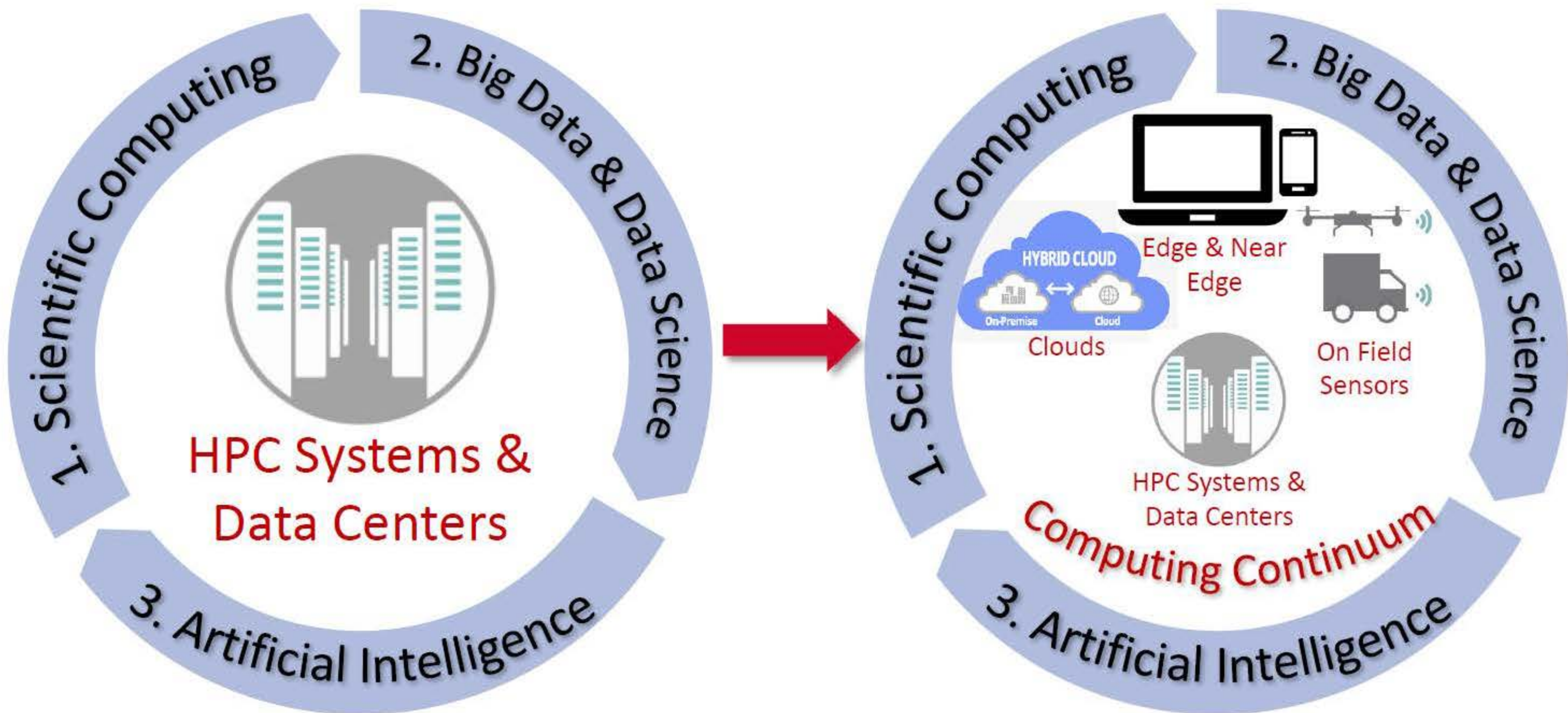
- Machine Learning (ML)
  - “the study of computer algorithms to improve automatically through experience and use of data”
- Deep Learning (DL) – a subset of ML
  - Uses Deep Neural Networks (DNNs)
  - Perhaps, the most revolutionary subset!
- Based on learning data representation
- DNN Examples: Convolutional Neural Networks, Recurrent Neural Networks, Hybrid Networks
- **AI-Enabled Science, Arts, Health, and Business**



**Courtesy:** <https://hackernoon.com/difference-between-artificial-intelligence-machine-learning-and-deep-learning-1pcv3zeg>, <https://blog.dataiku.com/ai-vs.-machine-learning-vs.-deep-learning>, [https://en.wikipedia.org/wiki/Machine\\_learning](https://en.wikipedia.org/wiki/Machine_learning)

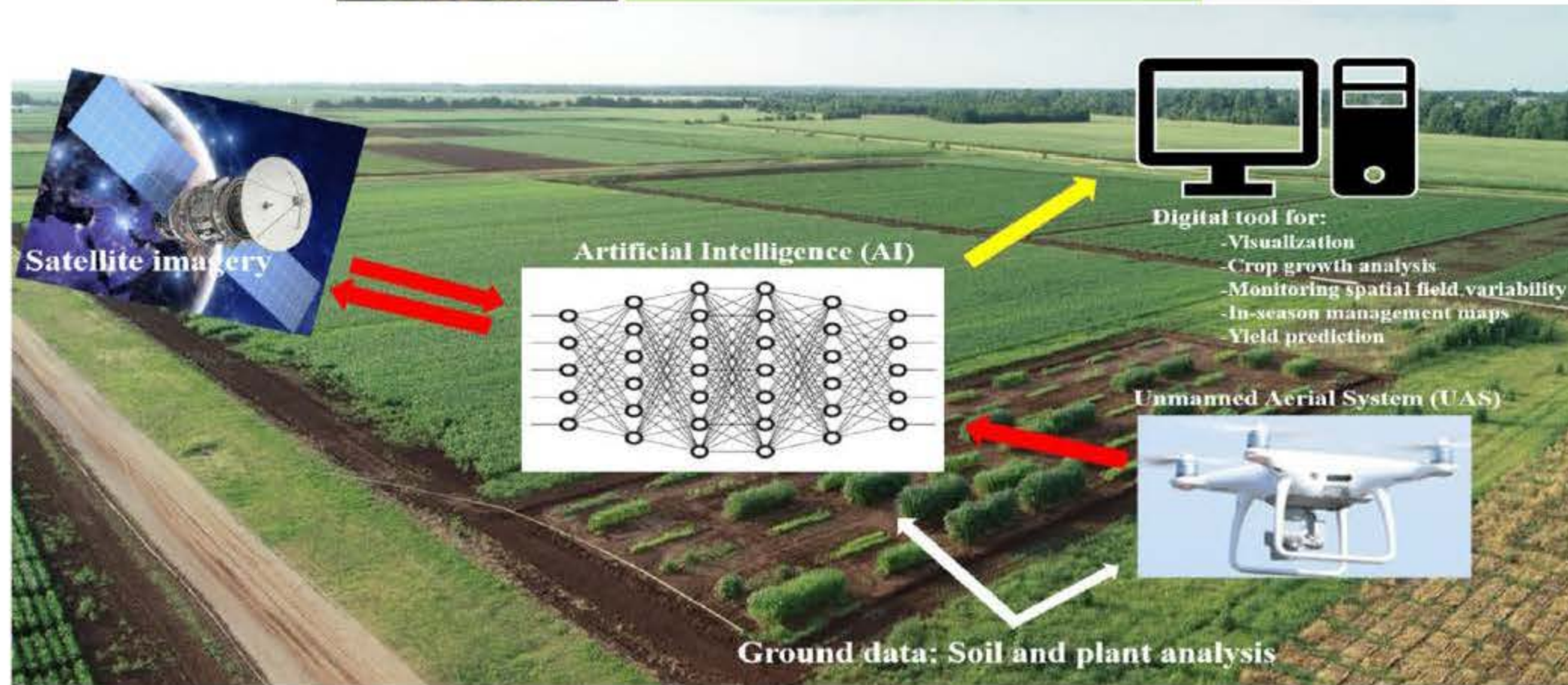


## Stage 4 (2015 - ): Emergence of the Computing Continuum





# AI-Driven Precision Agriculture

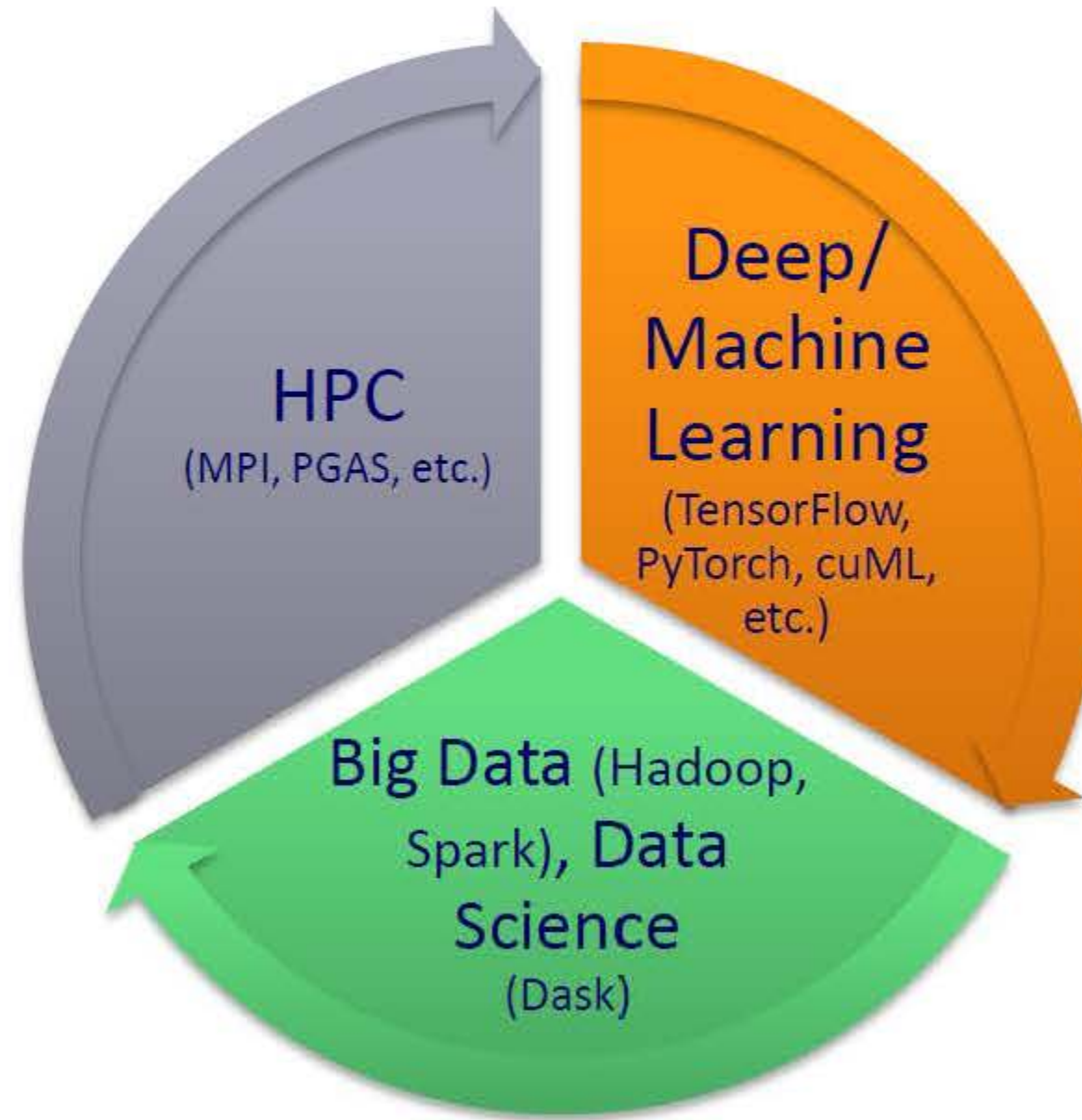


<https://ccag.tamu.edu/research-project/digital-agriculture/>

<https://medium.datadriveninvestor.com/artificial-intelligence-in-agriculture-62f71f8f6ae6>



# Increasing Usage of HPC, AI, and Data Science in multiple Disciplines with Distributed Data and Heterogeneous Computing



**Convergence of HPC,  
Deep/Machine Learning,  
and Data Science!**

**Increasing Need to Run these  
applications on the Cloud!!**



## Broad Challenge:

*How to design next-generation intelligent cyberinfrastructure with plug-and-play capabilities to handle societal problems while taking advantage of heterogeneous (CPU + GPU) High Performance Computing (HPC) and Cloud resources?*



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**@icicleai**



<http://icicle.ai>

**NSF-Funded AI Institute  
(\$20M USD for Five Years)**



**Intelligent CyberInfrastructure  
With Computational Learning  
in the Environment (ICICLE)**



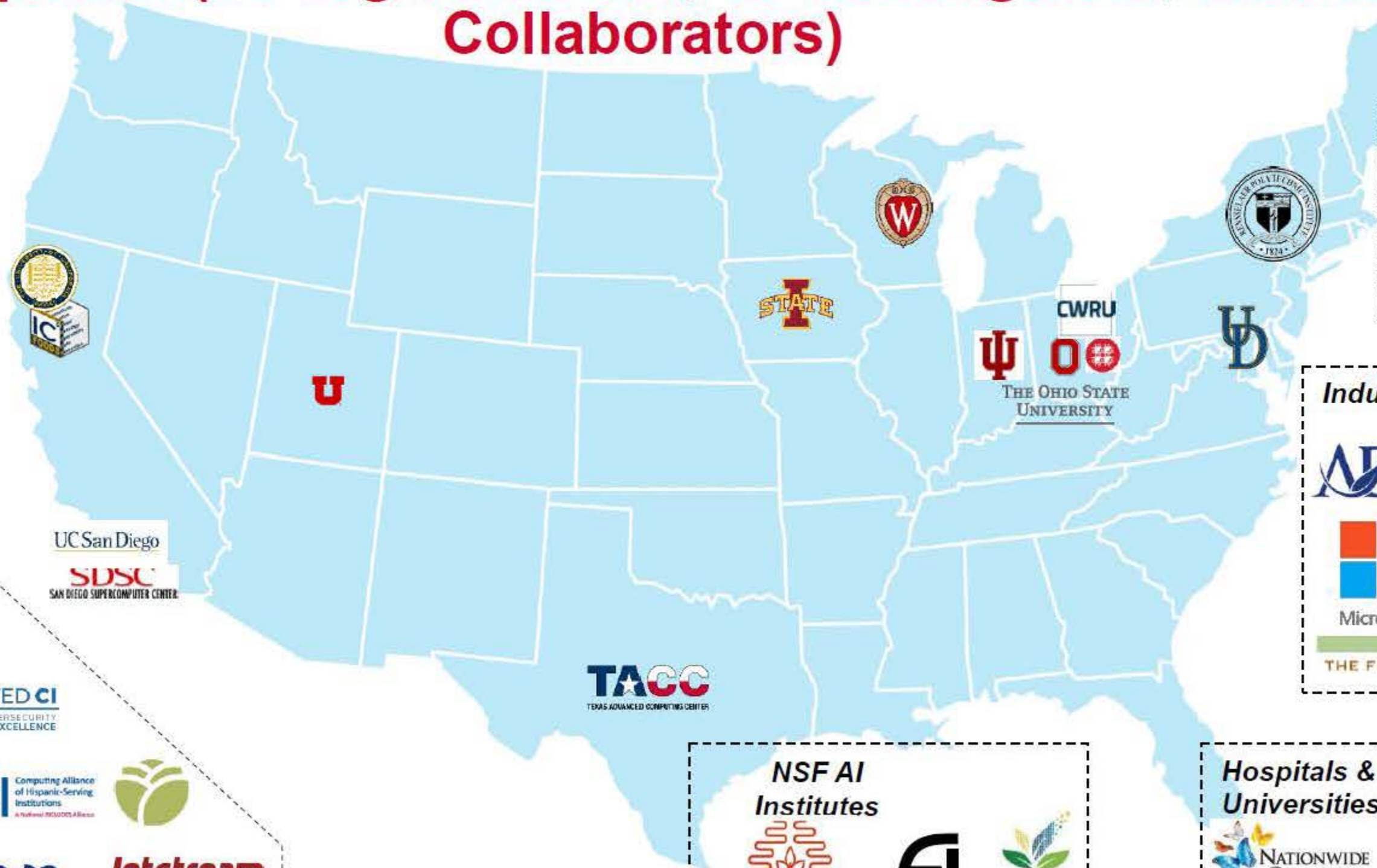
# The Vision

A **national infrastructure** that enables AI at the flick of a switch, ICICLE will:

- **Democratize AI** through **integrated plug-and-play AI**.
- Catalyze **foundational AI/CI** and transform application domains.
- **Transparent and trustworthy** infrastructure for AI-enabled future,
- Address **societal problems** (conservation, food insecurity) and **national priorities**
- Grow **new generations of workforce** and Incubate **sustainable and inclusive** communities



# Participation (14 Organizations, 46 Investigators, and many Collaborators)





# ICICLE Leadership Team

## OVERALL LEADS



## EDUCATION & WORKFORCE DEVELOPMENT



Lange  
(IC-FOODS)

## FOUNDATIONAL SYSTEMS AI



Fosler-Lussier  
(OSU)



Su  
(OSU)

## CO-DESIGN FOR USE INSPIRED SCIENCE



Berger-Wolf (OSU)



Hoy (OSU)



Shearer (OSU)

## BROADENING PARTICIPATION IN COMPUTING



Biggers  
(IU)



Thomas  
(SDSC)

## INTELLIGENT CYBERINFRASTRUCTURE

### CI FOR AI



Blanas (OSU)



Zhang (TACC)

### AI FOR CI-FOR-AI



Chaudhary  
(CWRU)



Eigenmann  
(UDeI)

### SOFTWARE ARCHITECTURE AND DESIGN



Stubbs (TACC)



Zhang (TACC)

### VISUAL ANALYTICS FOR CI AND AI EXPLAINABILITY



Machiraju  
(OSU)



Shen  
(OSU)

### PRIVACY, ACCOUNTABILITY AND DATA INTEGRITY



Ayday  
(CWRU)



Plale  
(IU)

## COLLABORATION & KNOWLEDGE TRANSFER



Lange  
(IC-FOODS)



Ramnath  
(OSU)

## CI DEVELOPMENT FOR INTEGRATION WITH SHARED RESEARCH FACILITIES



Majumdar  
(SDSC)



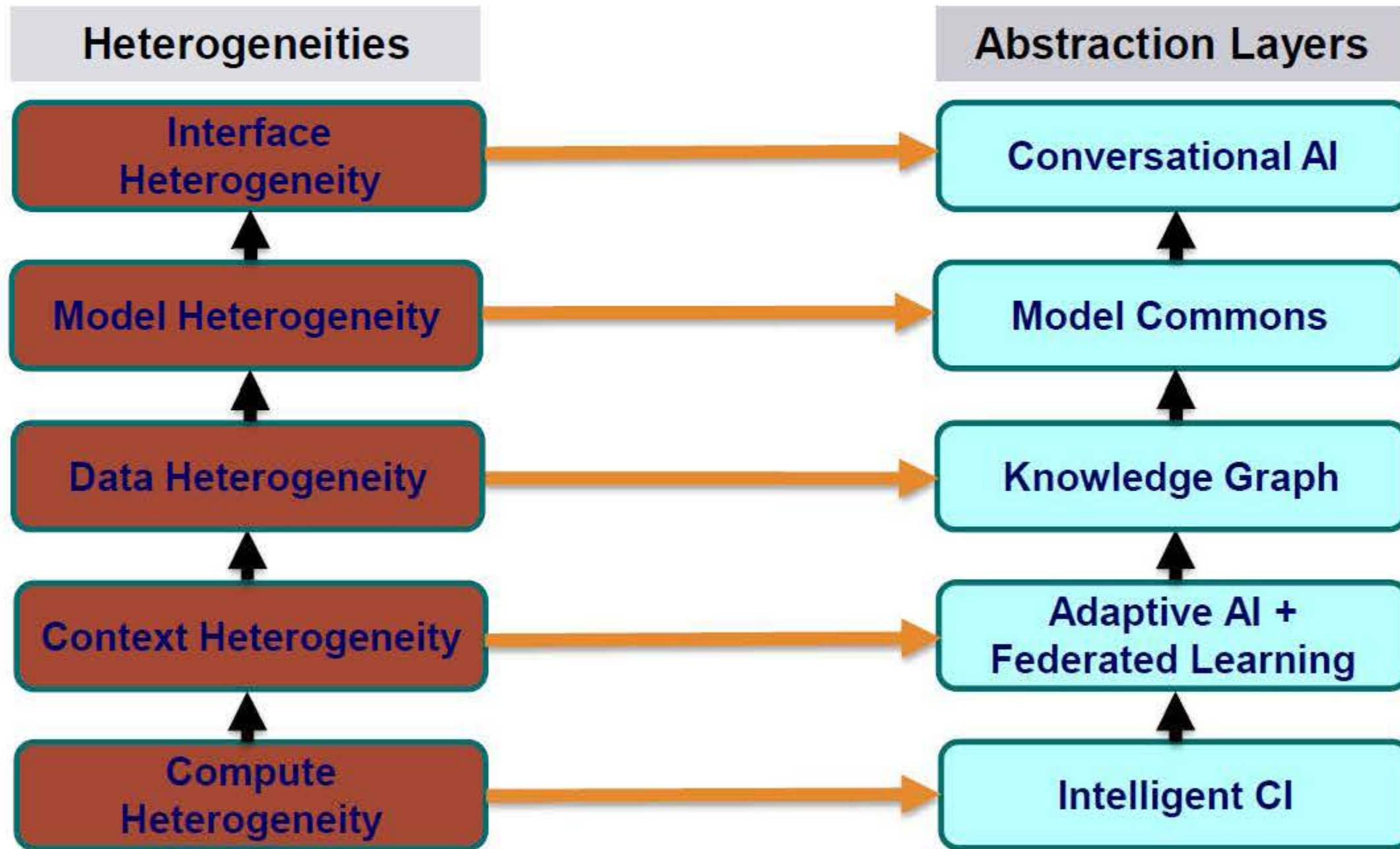
Tomko  
(OSU)







# Research Plan: Overall Vision

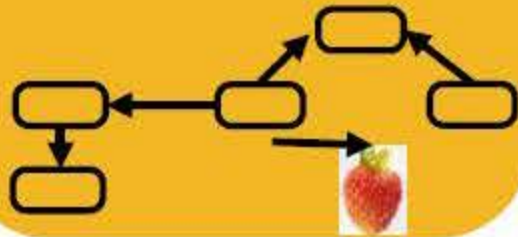




# The DNA: Foundational Systems AI

## Knowledge Graphs

- Multimodal
- Spatio-temporal
- Auto construction
- Knowledge-based reasoning and pre-training



## Model Commons

- KG-supported
- Precise profiling
- Flex Composition
- Versioning and provenance

**Crop Yield Model**  
Midwest  
Corn, Strawberry...

## Adaptive AI

- Context-aware
- Interactive
- Continual learning
- Distillation-based compression



## Federated Learning

- Heterogeneity
- Applicability to a variety of models
- Context-aware
- Privacy-preserving and robustness



## Conversational AI

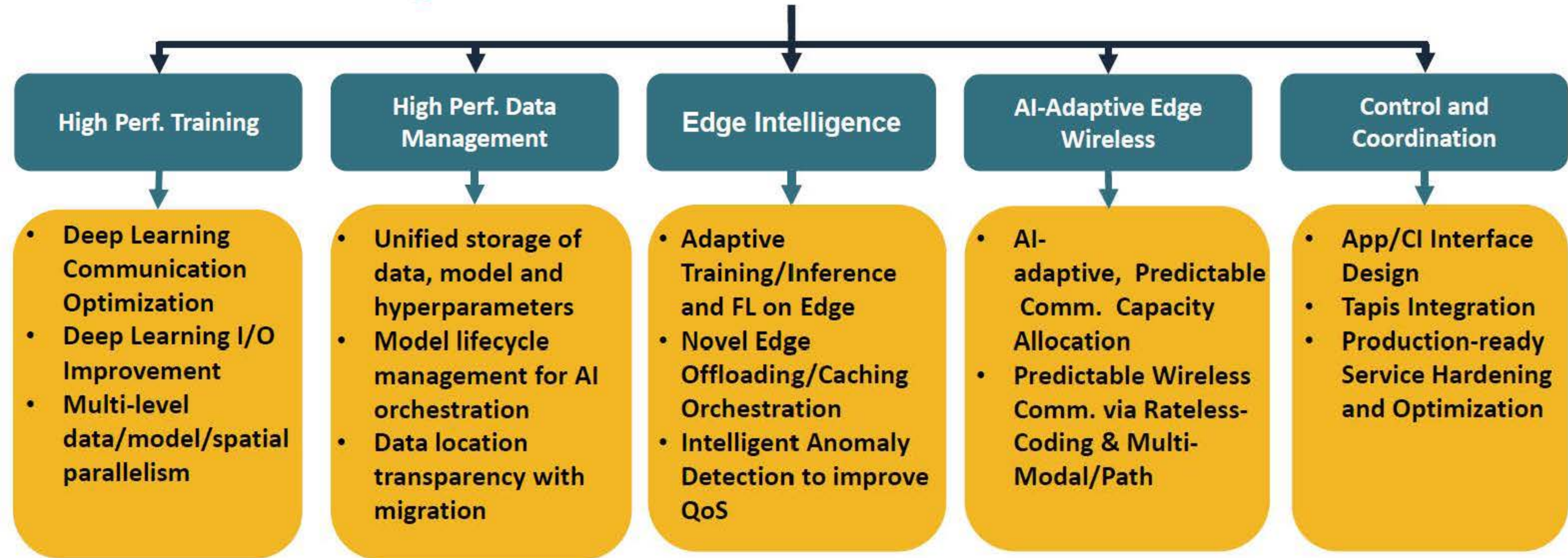
- KG- and model-commons-aware
- Bootstrapping and adaptivity
- Multimodal contextual response



<https://pixabay.com/photos/strawberry-field-fruit-plant-3630814/>  
[https://commons.wikimedia.org/wiki/File:Strawberry\\_field\\_at\\_Bedugul.jpg](https://commons.wikimedia.org/wiki/File:Strawberry_field_at_Bedugul.jpg)

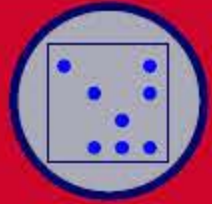


# The Enabler@Edge: CI4AI





# The Enabler@Scale-and-@Edge: AI4CI



**Intelligent Primitives (sparse/dense)**

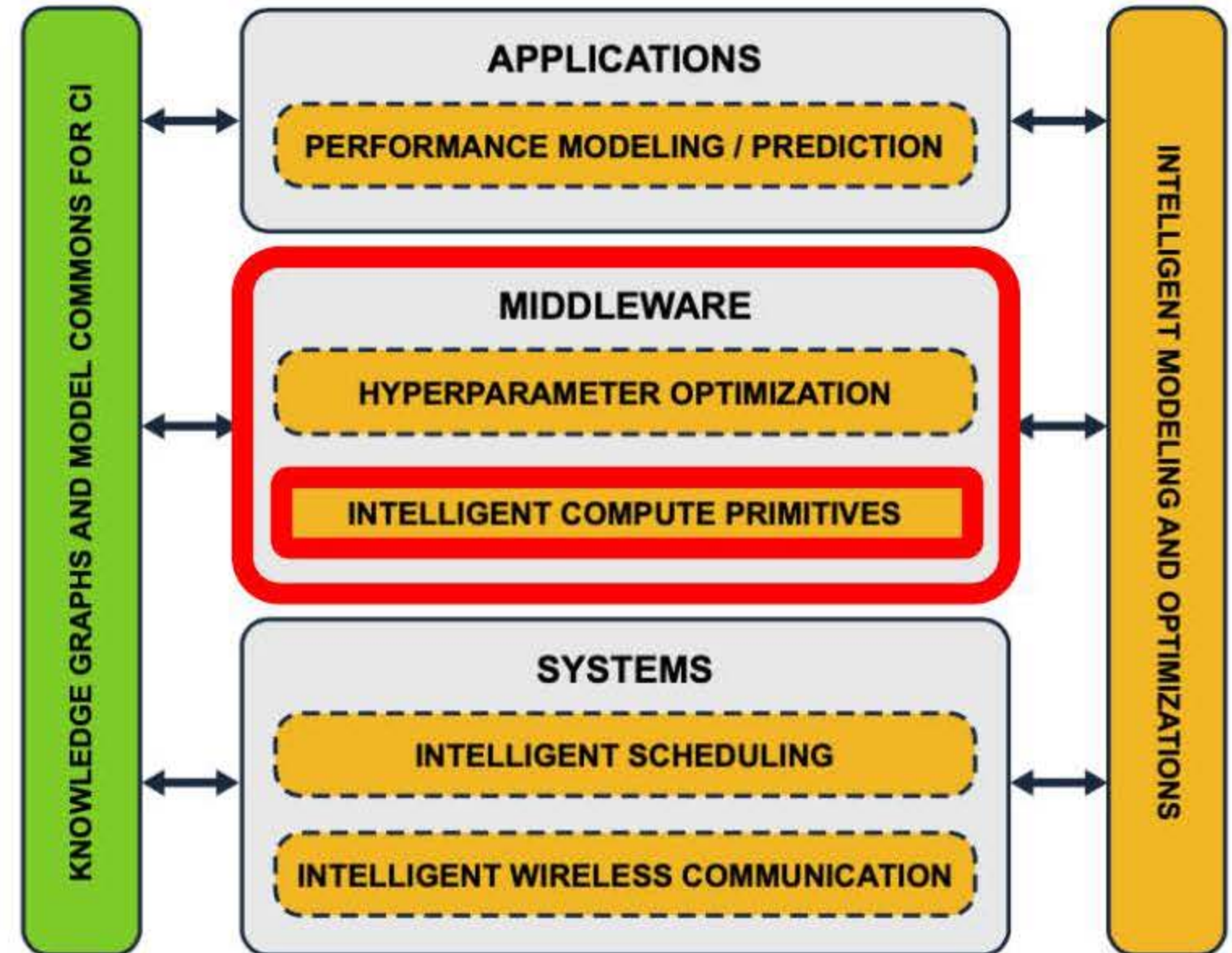
**Product: High Performance Library**

(Powered by AI to maximize the utilization of CI)

**Innovation:** **Learn** from hardware (e.g., SIMD width), network (e.g., bandwidth/latency), and data sparsity to **extract best attainable performance**

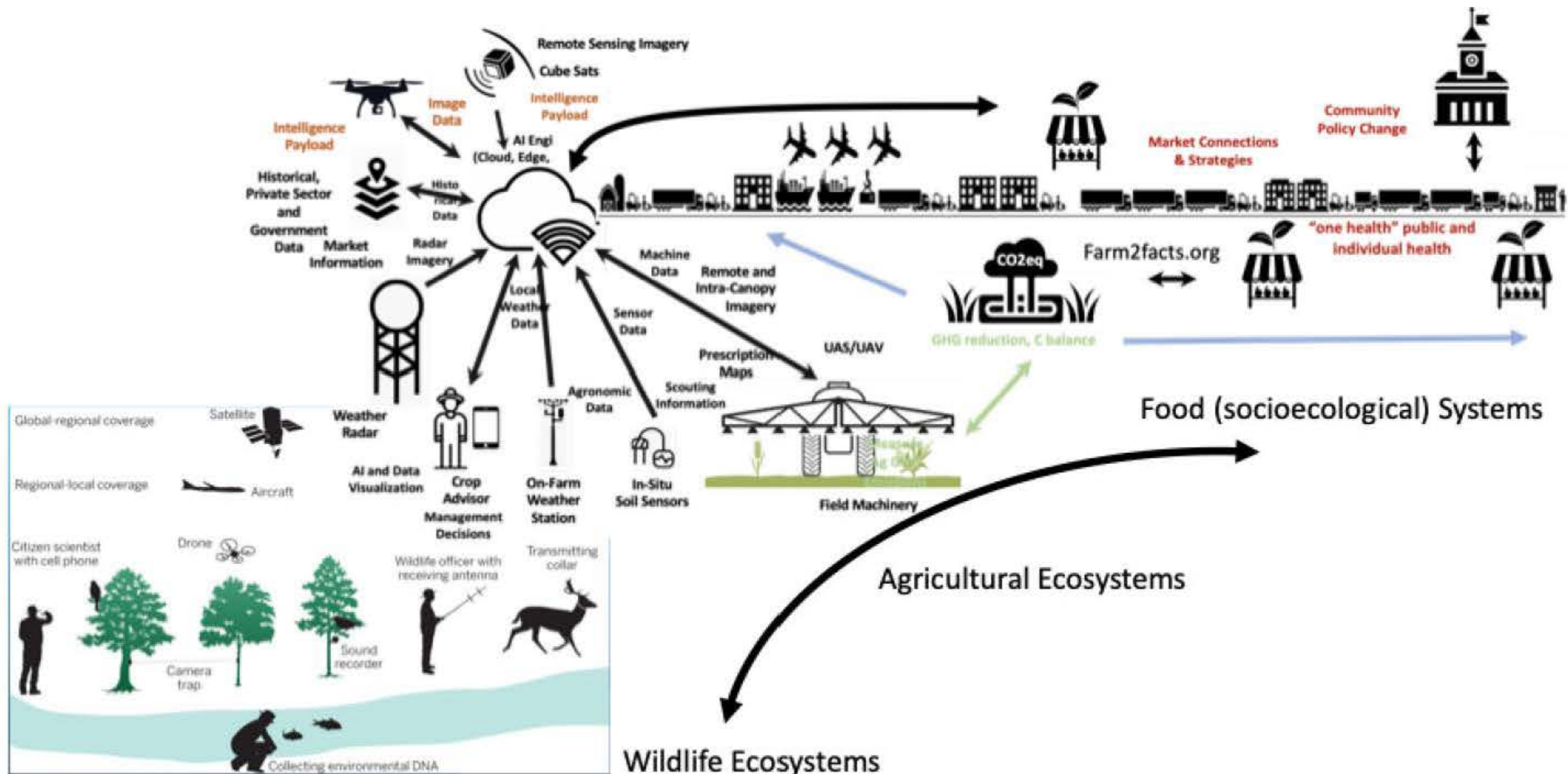
**Utility:** (1) **Portable** high performance on diverse HPC systems (2) **Usable** at the backend of any other AI system

**Heterogeneous and rapidly evolving platform**  
(CPUs, GPUs, Supercomputers, edge devices)





# Research Plan: Use-Inspired Science





# Crop Care: Nutrient and Pest Management

*Demonstrate swarms of small unmanned aerial systems to study crop stressors, such as insect infestations, nutrient stress, disease, etc. and produce crop and soil maps that improve agricultural productivity*

- Edge computing setup to speed up AI model training (NSF Funded Tapis@Texas Adv. Comp. Center)
- SoftwarePilot, open-source software developed for ICICLE at OSU, will be used to pilot sUAS
- Produce crop and soil maps that improve agricultural productive
- Demonstrate use-cases on multiple crops (e.g., corn, soybean, wheat) via novel neural network models
- Feedback control for automation of agricultural field machinery (e.g., targeted pesticide application etc.).
- Extraction of actionable information from machine and agronomic data to support cropping decisions.

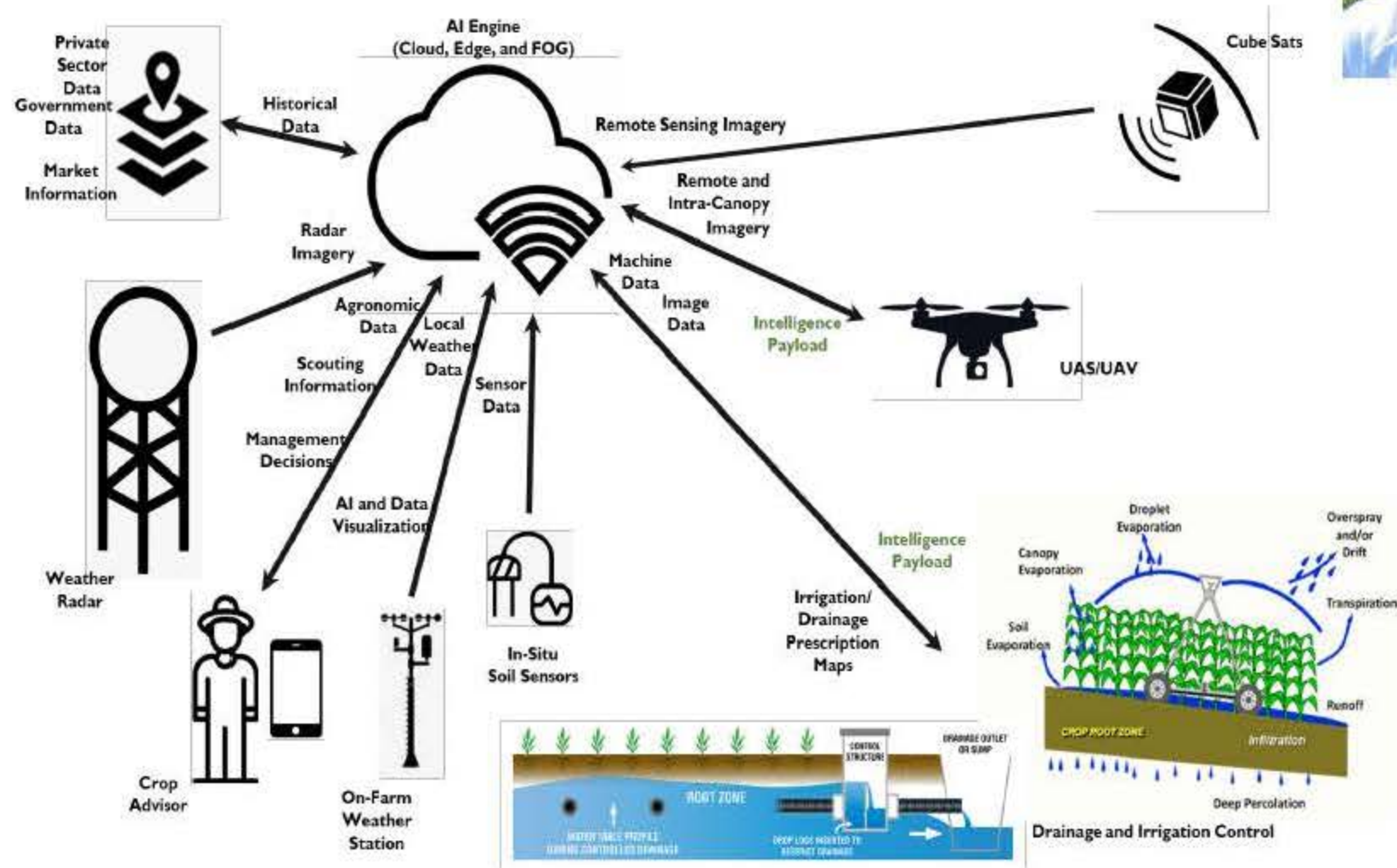




# Crop Care: Water Management and Quality

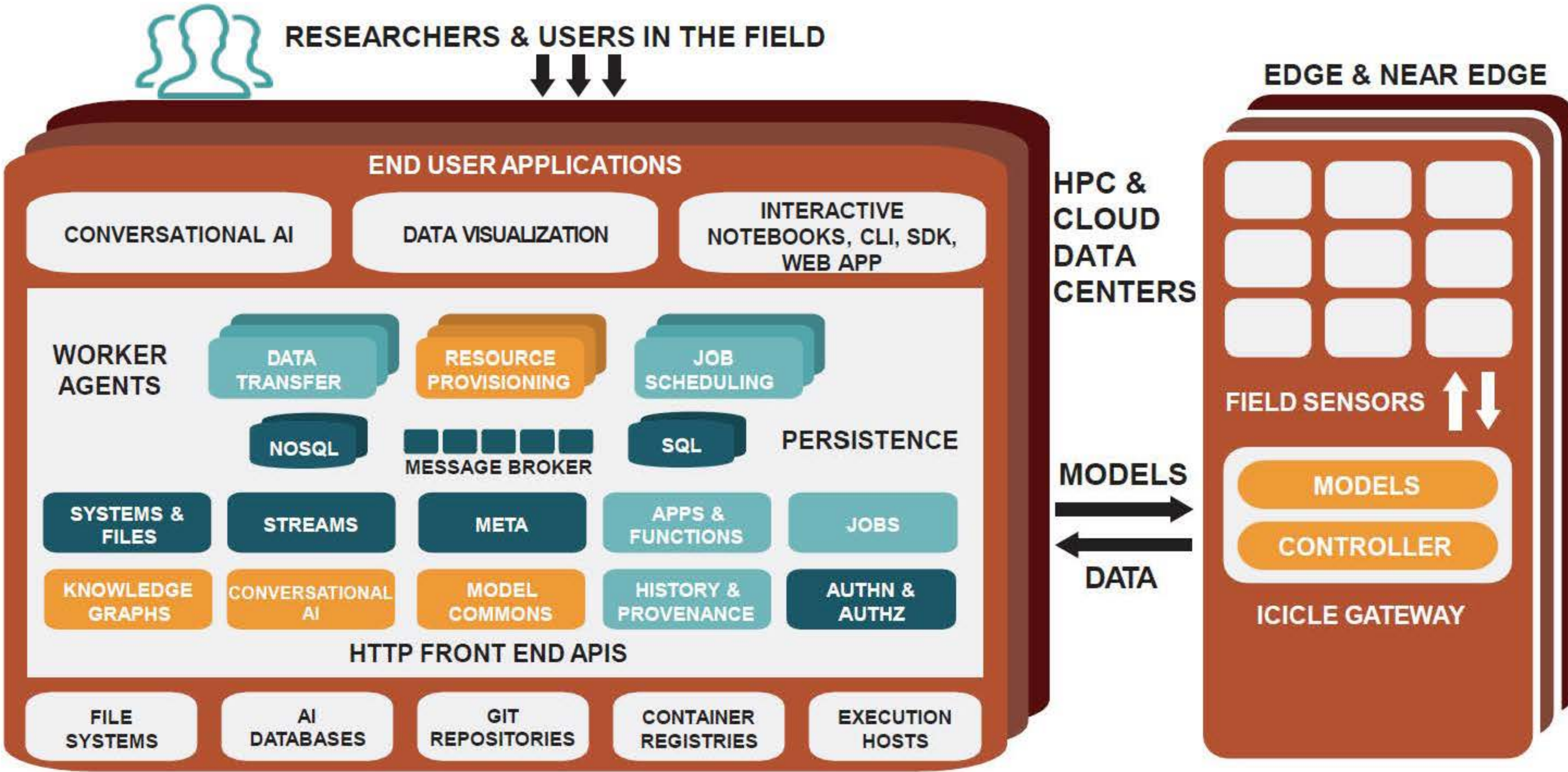
*Capture nutrient stress and moisture deficit in corn and soybean field and provide feedback control for automation of agricultural field machinery, e.g., controlled drainage, robotic irrigation, etc.*

- Extraction of actionable information from machine and agronomic data to support water management
- Adaptive AI deployed on edge, IoT and in-field devices will boost efficacy
- Target irrigation scheduling and water table level
- Discharge water quality via controlled drainage



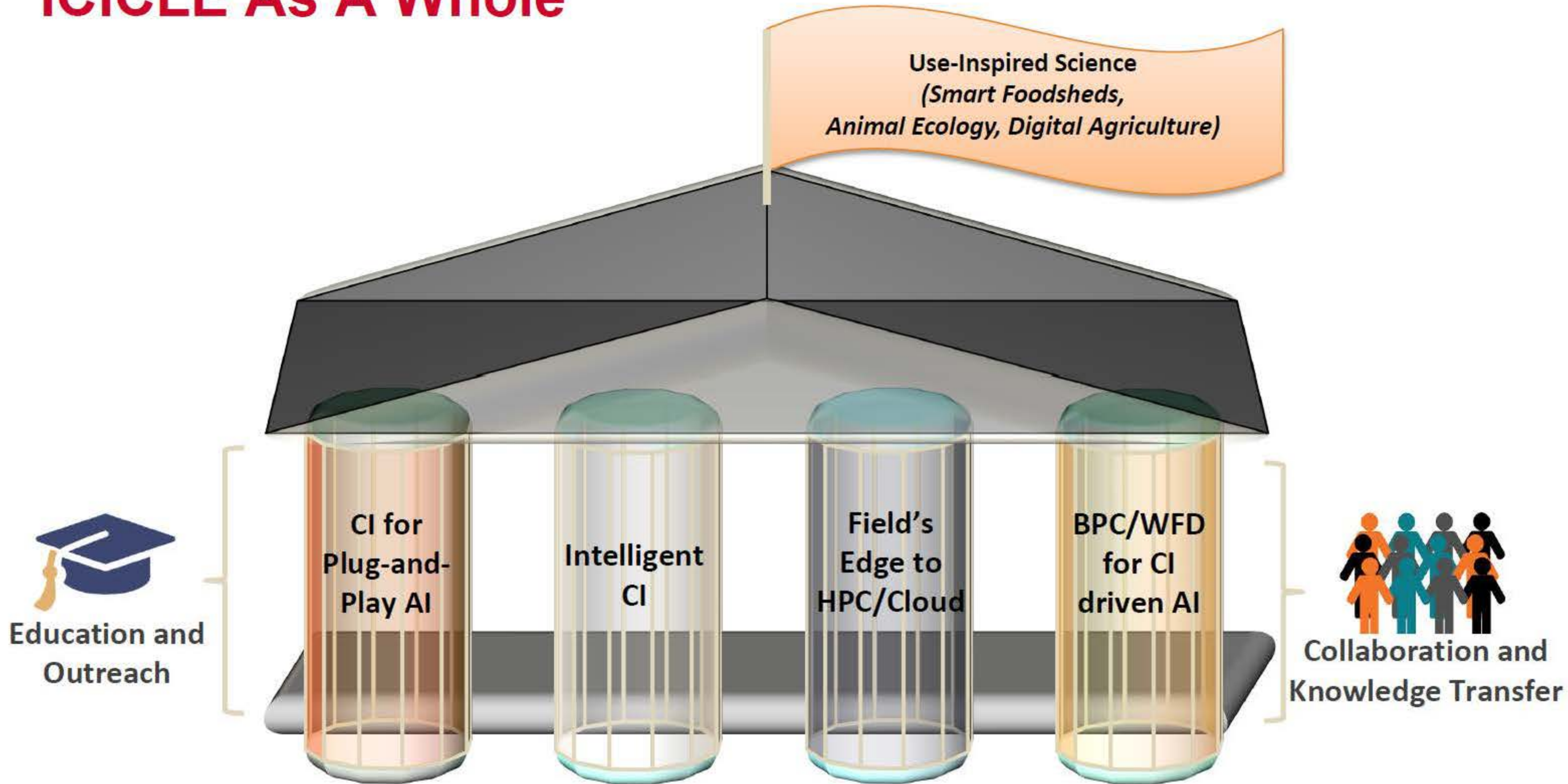


# A Deliverable: The ICICLE Software Architecture



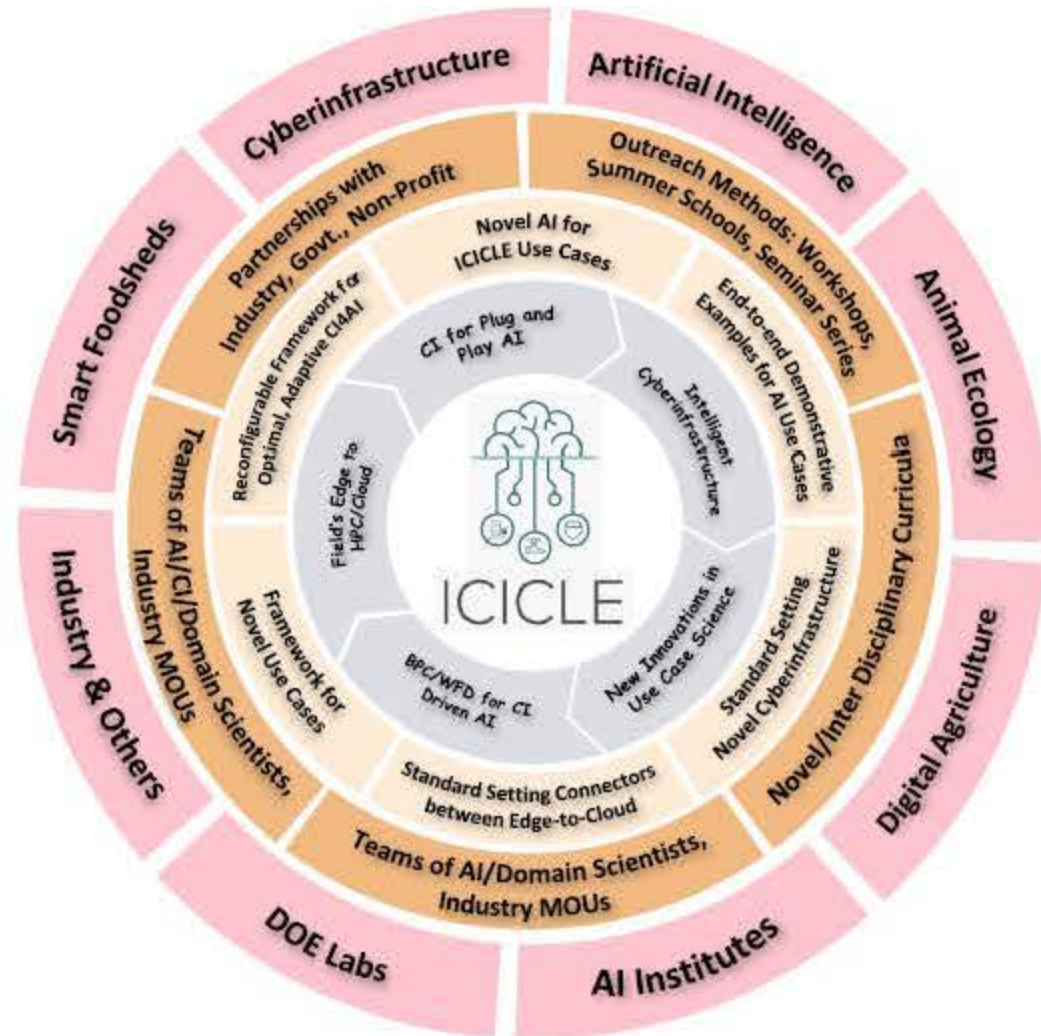


# ICICLE As A Whole





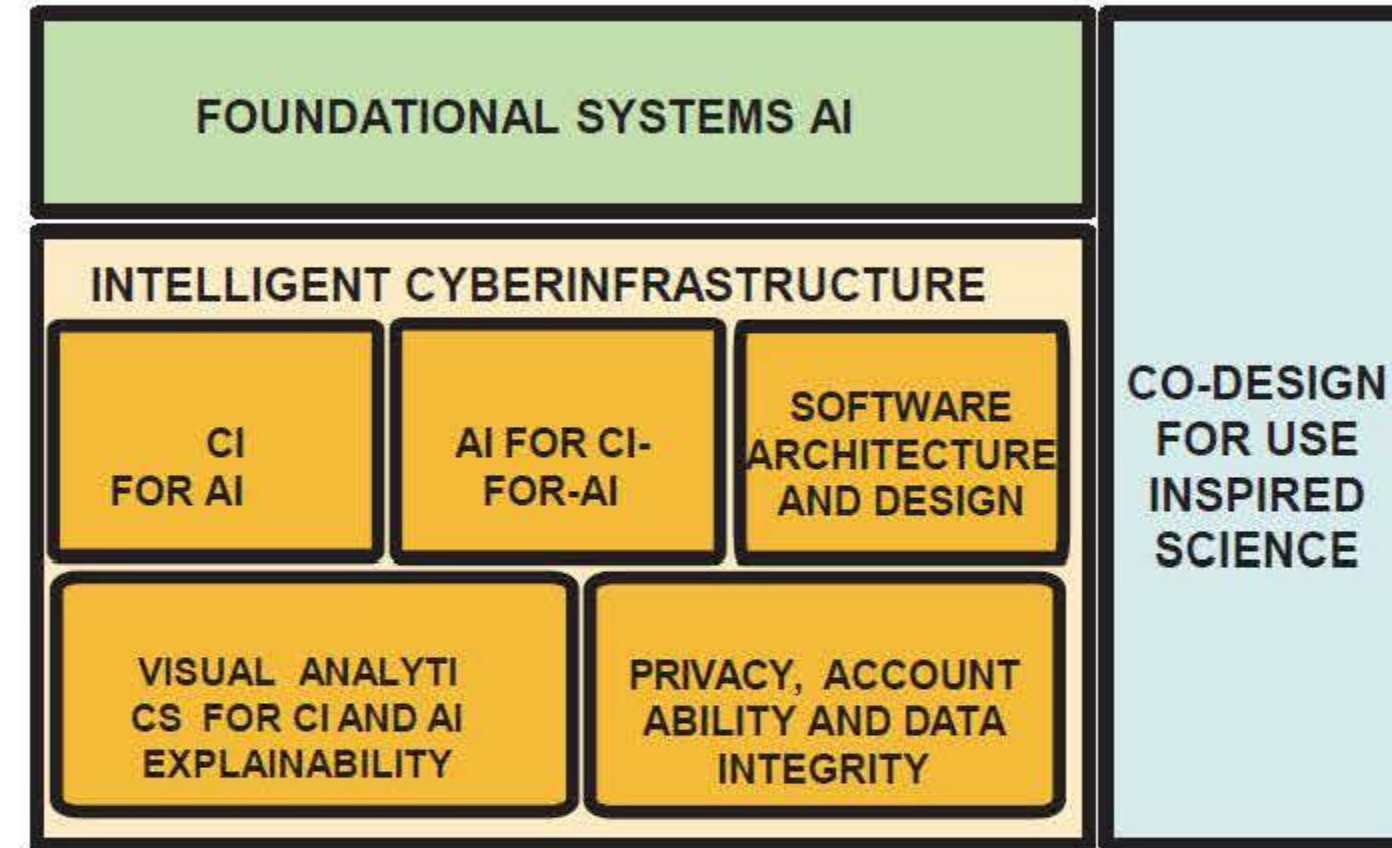
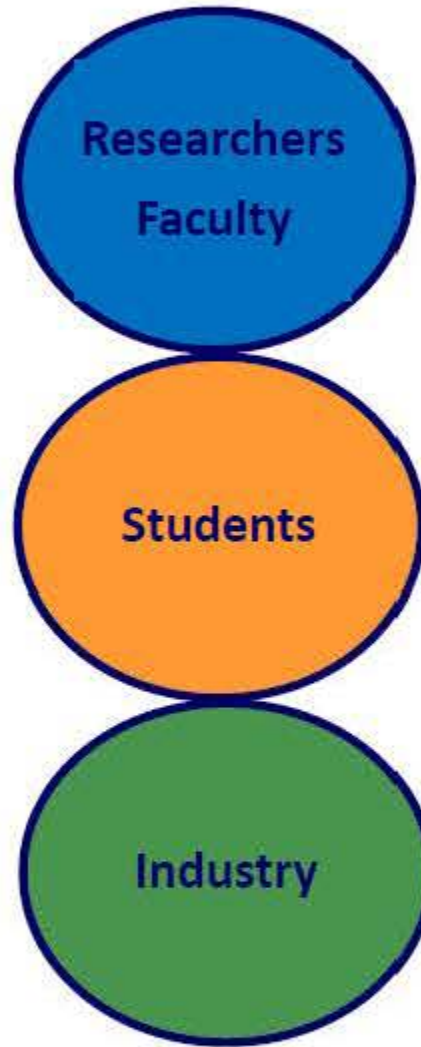
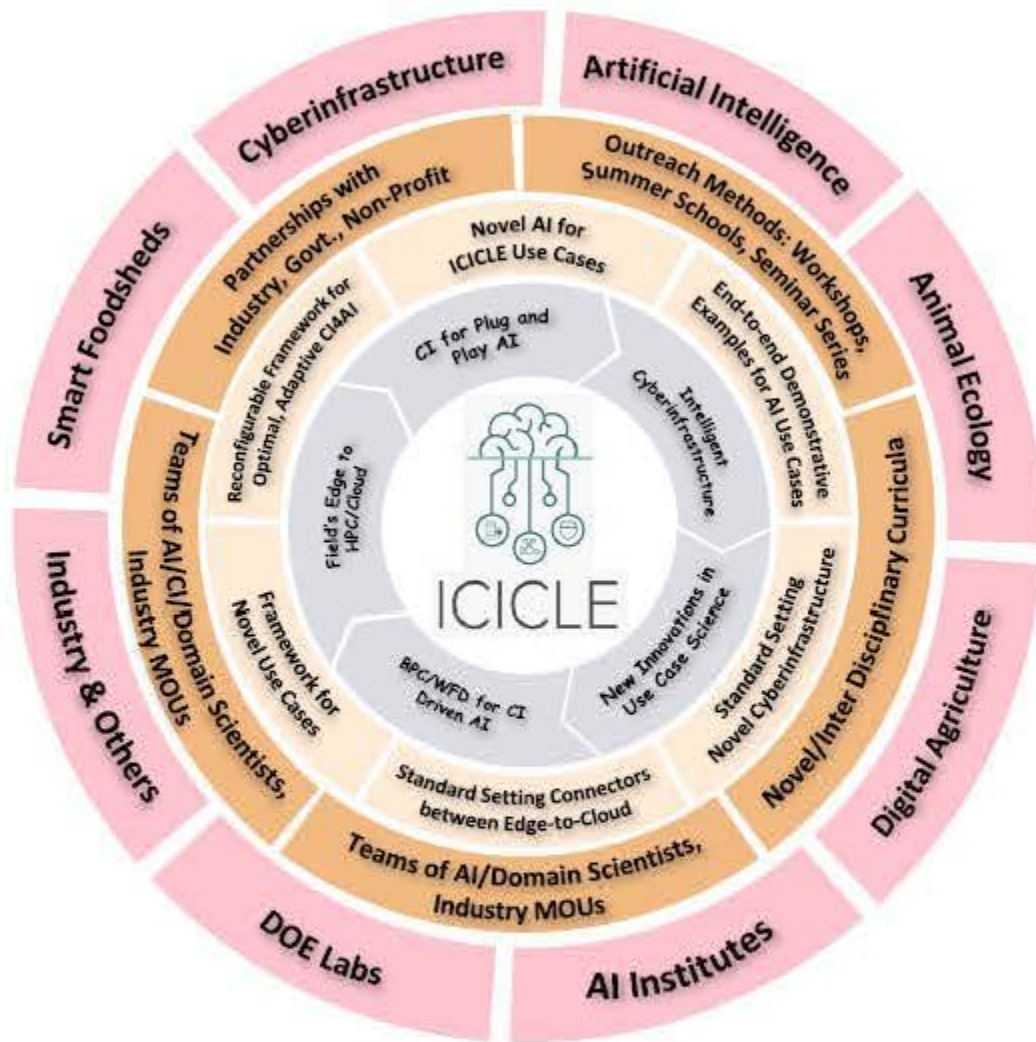
# ICICLE Enables Global AI leadership



- Integrate into the National CI Ecosystem
- Integrative and Interoperable
- Leverages existing recognized capabilities
  - Centers of Excellence, AI Institutes, Large Facilities
- Collaborative
- Sustainable
  - Workforce Development, Broadening Participation, Collaboration and Knowledge Transfer
  - Benefits other institutes, large facilities, and all sciences beyond lifetime of award



# Engaging With ICICLE



**Co-develop & Adopt ICICLE developed CI!**

Contact: [panda@cse.ohio-state.edu](mailto:panda@cse.ohio-state.edu)



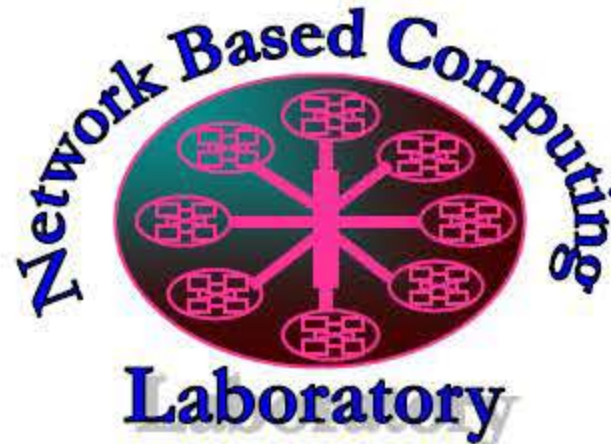
# Conclusions

- AI solutions can help to solve many societal problems
- Increasing use of HPC, AI and Data Science with heterogeneous resources
- Need for plug-and-play-based AI solutions which can democratize AI
- The new ICICLE NSF-AI Institute aims to establish next-generation cyberinfrastructure to provide comprehensive AI-driven solutions to many societal problems



# Thank You!

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Network-Based Computing Laboratory

<http://nowlab.cse.ohio-state.edu/>



The High-Performance MPI/PGAS Project  
<http://mvapich.cse.ohio-state.edu/>



The High-Performance Big Data Project  
<http://hibd.cse.ohio-state.edu/>



The High-Performance Deep Learning Project  
<http://hidl.cse.ohio-state.edu/>



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