## Bridging the Data Gaps for AI and Computing for Science, Education and Society

Invited Talk for the Parallel Data Systems Workshop at Sc24
November 17, 2024 – Atlanta, GA

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Chief Data Science Officer & Division Director, Cyberinfrastructure and Convergence Research, San Diego Supercomputer Center

Founding Fellow, Halicioğlu Data Science Institute

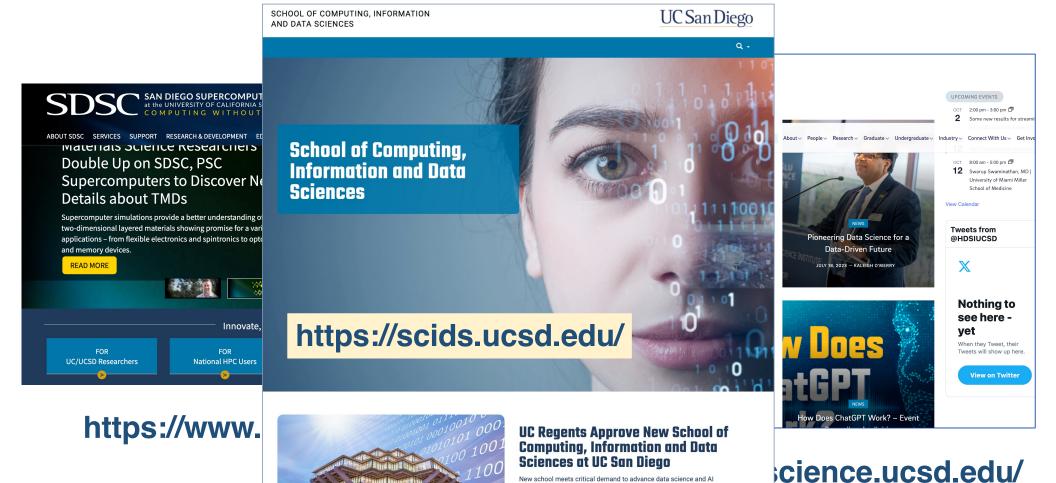
Founding Director, Workflows for Data Science Center of Excellence

Founding Director, WIFIRE Lab

Joint Faculty Appointee, Los Alamos National Laboratory











New school meets critical demand to advance data science and Al

innovations and educate workforce of the future

#### Cyberinfrastructure and Convergence Research Division @SDSC

Translating cyberinfrastructure research for impact at scale

#### CI Methods and Systems

- "Big" Data and Knowledge Systems
- Computational Data Science
- Machine Learning and Al
- **Advanced Computing**

#### Convergence Research

- Collaborative Problem Solving
- **Use-inspired Design**
- Sustainable and Scalable Solutions

Experiential and Classroom Education



Cyberinfrastructure | Convergence Research | Education

































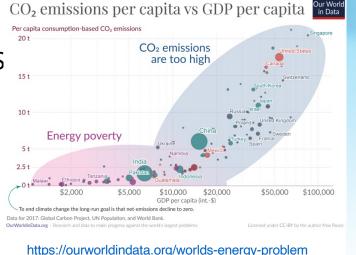


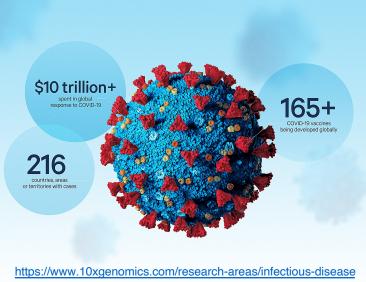












## The biggest challenges of our time are too difficult to solve alone!

https://www.wcrp-climate.org/learn-grand-challenges





#### **Convergence research is:**

driven by a specific and compelling societal problem

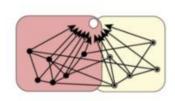
#### and

works towards integrating innovative and sustainable solutions into society









- Stakeholder Participants
- Discipline

- Goal, Shared Knowledge Academic Knowledge
- Thematic Umbrella Conventional Knowledge

Adapted from Wright Morton, L., S. D. Eigenbrode, and T. A. Martin. 2015. Architectures of adaptive integration in large collaborative projects. Ecology and Society 20(4):5.



- Within one academic discipline
- Disciplinary gal setting
- Development of new disciplinary knowledge

#### Multidisciplinary

- Multiple disciplines
- Multiple disciplinary goal setting under one thematic

#### Interdisciplinary

- Crosses disciplinary boundaries
- Development of integrated knowledge

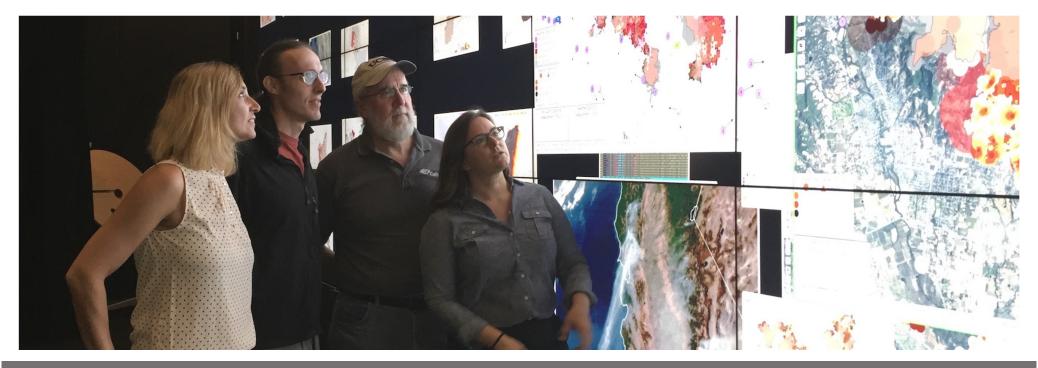


- Crosses disciplinary and sectorial boundaries
- Common goal setting
- Develops integrated knowledge for science and society
- Creates new paradigms



## Translating Research into Impact

through Democratizing Access to Cyberinfrastructure







## **Three Main Components**

Composable Workflows + Collaborative Innovation + Impact Network



https://www.core-institute.org/





#### **CORE Institute Innovation Approach**

#### **Creating Breakthrough Technological Innovations for Complex Societal Challenges**

#### **Use-Inspired Problems**

- 1) Context evaluation: Describe the system(s) within which the problem you are addressing exists and identify important decision-makers and vulnerable communities
- 2) Needs assessment: Clarify the needs of the people you want to help and ensure you are solving the right problem
- 3) Innovation pathways: Sketch out ideas for data and science that could contribute to solving the problem and outline the expertise needed

Use-inspired & iterative

co-production of innovation

with users

## CORE4 Building Blocks

Data & Al

Cutting-Edge
Science &
Engineering

Advanced
Digital
Infrastructure

Cutting-Edge
Science &
Integrated
Workflows

Use-inspired

co-creation of solutions

iterative

with partners

#### **Scalable Solutions**

- 1) Sustainable partnership model: Implement solutions through a model that will allow for sustained use at scale
- 2) Continued iteration: Monitor performance and impact through user feedback and key metrics and be ready to adapt
- **3) Continued innovation:** Create mechanisms to ensure innovation is an ongoing process

From USEFUL



to USABLE



to USED at scale



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## **Translating Fire Research into Impact**



Mission: Develop technologies with the fire management community driven by cutting-edge science and data

Vision: Enable tools that can have an impact at the scale of the environmental challenges we face today



wifire.ucsd.edu





## Where are we headed at WIFIRE Lab?

- Wildfire Response: WIFIRE's Firemap platform in collaboration with CALOES and CAL FIRE through California's Fire Integrated Real-Time Intelligence System (FIRIS) and with partners in Colorado
- Beneficial Fire: WIFIRE's BurnPro3D platform for prescribed burn planning and implementation in collaboration with 3D fuel and fire modeling efforts at USGS, DOD, USFS, and LANL
- Data and Model Sharing: WIFIRE's Wildfire Technology Commons to develop standards, tools
  and techniques to share data and data-driven models to enable scientific workflows and AI
  innovation in collaboration with partners including NIST, CAL FIRE, and SDGE
- Immersive Visualization: Al-readiness of scientific data for new modes of teaching, training, decision-making, and public communication, including 3D outputs from vegetation modeling and fire science simulations and real-world information collected with cameras and sensors







## **Operational Products**

#### **FIREMAP**

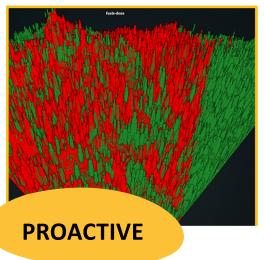
Firemap is currently being used by firefighters in Colorado, in collaboration with Intterra, and firefighters in California through the FIRIS program under the California Governor's Office of Emergency



Services and CALFIRE. FIRIS uses Firemap to provide real-time information on weather conditions and fire ignitions and to monitor and predict direction and speed of fire spread, as well as communities at risk. It has revolutionized initial attack response for the most dangerous fires across California.



In alignment with the nation's goal to increase fuel treatments to reduce wildfire risk, BurnPro3D is designed to support the preparation of burn plans as well as the implementation of prescribed



burns. The interface allows burn bosses to create and visualize high-resolution 3D fire simulations and compare fuel consumption and risk under different weather and ignition scenarios. It uses 3D FastFuels data developed by the US Forest Service and the QUIC-Fire coupled fire/atmosphere model developed at Los Alamos National Lab.











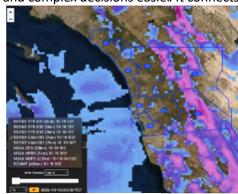




## **Data and Computing Platforms**

#### Wildfire Science and Technology Commons

The Commons enables the development of foundational AI techniques to fuse and learn from data and to make scientific models interpretable and complex decisions easier. It connects next-generation data and





next-generation data and models for anyone interested in developing solutions. For example, it enables an integrated fire weather intelligence platform focused on reducing risk related to power lines for Southern California. A new phase of development was recently supported through congressionally directed spending proposed by California Sen. Padilla, Rep. Vargas, and Rep. Jacobs.

#### Wildfire and Landscape Resilience Data Hub

The Data Hub is a federated data ecosystem for California's Wildfire and Forest Resilience Task Force, providing a "single view" over existing data to fulfill the reporting requirements for California's



Million Acre Strategy to treat 1 million forested acres per year to reduce wildfire risk. It will provide public, open, and fair access to data, analytic tools, and customizable reports via the Data Hub explorer web viewer, as well as access to data through APIs.









## **Additional Grants Fueling R&D**



Evaluation of satellite-based fire detection and fire radiative power applications



Ground sensing and in-situ edge computing for monitoring and decision-making



Open fire models to predict wildfire spread over 3-5 days



Workflows for DOD prescribed fire managers participating in the National Innovation Landscapes Network



Prescribed fire planning and monitoring tools and workforce training for California agencies



Multi-modal data to improve characterization of fuels at large spatial extents and fine spatial scales



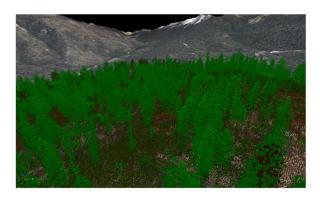
Immersive
visualization of
scientific data for
new modes of
training,
decision-making
and
communication

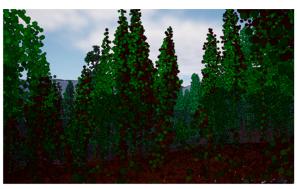


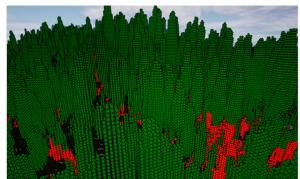


## **Immersive Forest Prototype**











Simulated and LiDAR vegetation data and fire models at Yosemite National Park

#### **Current prototype capabilities**

- Terrestrial LiDAR contextualized with aerial LiDAR for VR
- Georeferenced panoramic projection of terrestrial LiDAR for mobile
- Watch and interact with fire simulations in 3D under a variety of weather conditions
- Move through multiple LiDAR scans across the landscape to compare pre- and post-burn vegetation in 3D

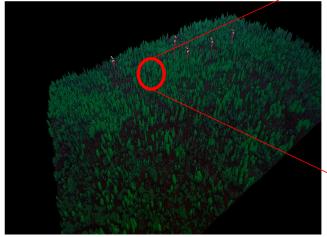






#### Immersive Forest for **Multimodal** Communication







Terrestrial LiDAR contextualized within Aerial scan







(\*WIFIRE\*))

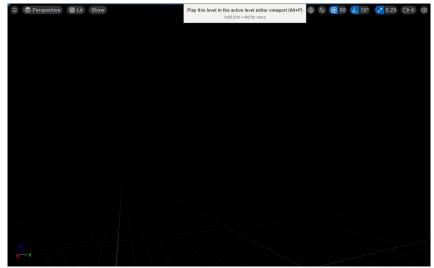
#### **AI in Science Communication**

Visualization of multiple terrestrial LiDAR scans in the Immersive Forest prototype



Immersive Al-integrated visualization of scientific data and simulations for training, decision making, and public communication.

Animations by: Isaac Nealey (left, bottom), Ivannia Gomez (top)

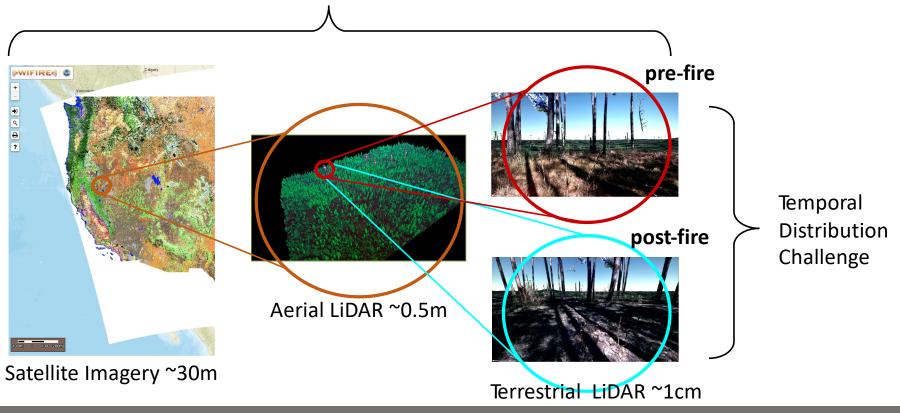






#### Knowledge Representation: Spatiotemporal Data and its Challenges

Multiscale Spatial Challenge





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#### **Knowledge Representation**

#### **Data System**

data model and underlying system for scientific data visualization

efficient query performance

high recall

empirically derived architecture

#### Contextualization Engine

projections & transformations

dimensionality reduction

derivative dataset generation

add semantics and Aldriven insights

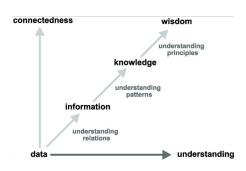
#### **Interactive Scene Generation**

#### Presentation Engine

interactive rendering

dynamic visual storytelling

data system insertion mechanism



Data



Information



Knowledge



**Interpretation and Stories** 





# This type of work needs the CORE4 building blocks.



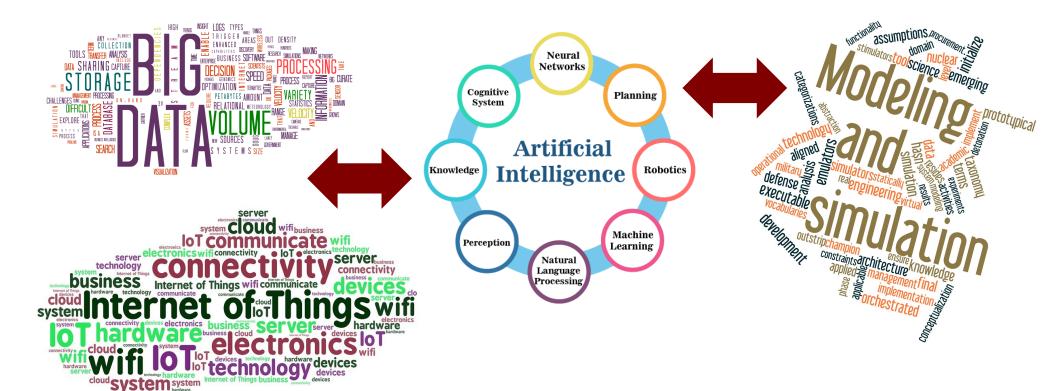
#### **CORE4 Building Blocks**

Data & Al	Cutting-Edge Science & Engineering
Advanced Digital Infrastructure	Integrated Workflows





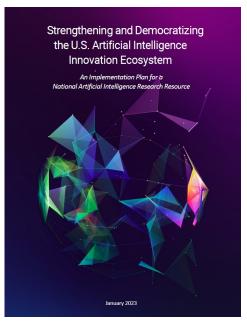
## Al-Integrated Applications at the Digital Continuum















## Al in Science and Research 2023





## Schmidt AI in Science Postdoc Research Schmidt Sciences



Computational microscopy of respiratory viruses in aerosols

> Exploring different models to simulate and visualize the behavior of viruses in the respiratory tract

The relationship between life span of the plant roots microscopy data and wildfire

Deep learning model to estimate life span

AI-Powered analysis of molecular simulations

> High-affinity generative model for target proteins

**Small coronary artery** calcium detectability

> Deep learning model to segment and visualize chambers of the heart

Data-driven development of neural-network potentials from quantum chemistry data

> ML model to be used as a surrogate for expensive highlevel chemistry calculations

**Drug resistance evolution in HIV** patients

> Leverages machine learning system for heterogeneous cryo-EM reconstruction of proteins and protein complexes from single-particle cryo-EM data

#### Earth system modelling

Deep learning model to use data extracted from ECMWF to calibrate earth systems simulation

Brain activity of diving seals reveals short sleep cycles at depth

> Linear regression models to assess the impact of age, recording location and design

#### **Bathymetry from space**

Machine learning model to understand small-scale ocean dynamics

The effect mutations implicated in autism can have in protein oscillation

> Deep learning model to predict the oscillation of protein in cellcell communication





## Al in Science Readiness "not just science + Al methods"

Data federation and hubs

Data quality and volume

Knowledge management

Benchmarks

Workflow managem

Software integration and engineering

Dev ops (also called AI ops and data ops)

Interpretability and explainability

Workforce training and culture/incentive building





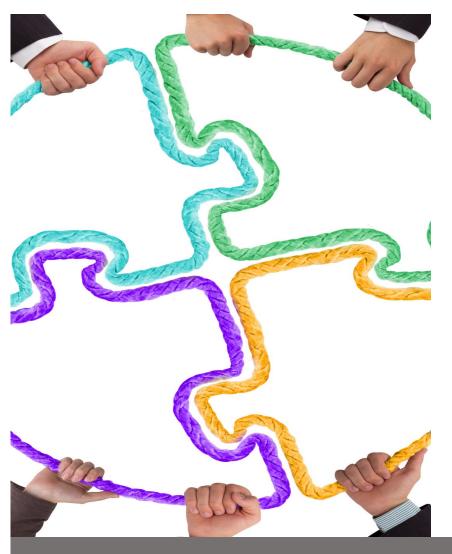


# Systems should enable seamless integration of Al-integrated application workflows by teams!

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İlkay Altıntaş, PhD (ialtintas@ucsd.edu )

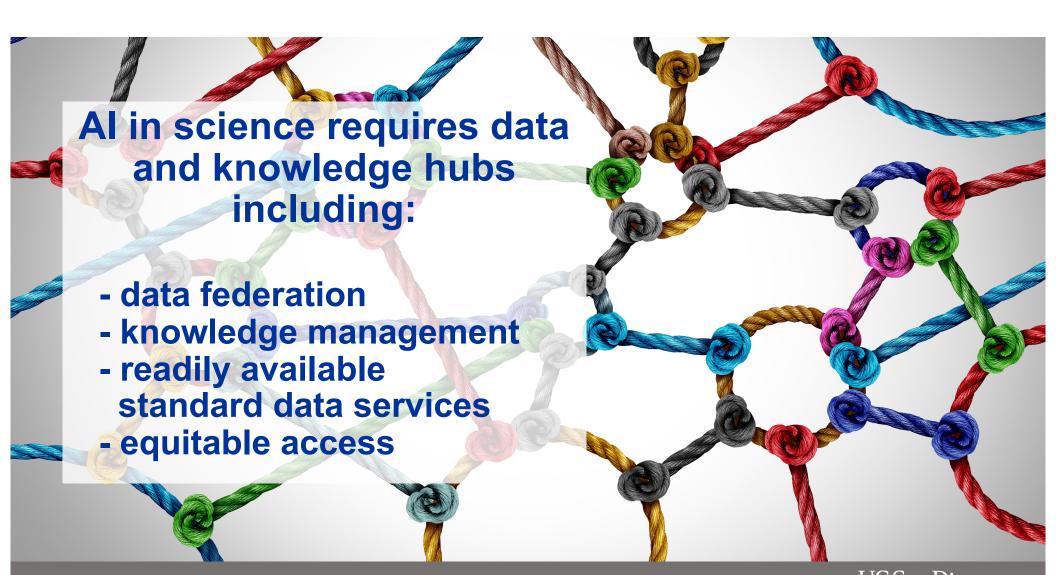


## Workflow integration requires a digital continuum composed through:

- system federation
- reusable capability services
- solutions integrating services







## Integration requirements...



Dynamic composability matters.

Systems and services are useful if groups can integrate them into applications.





Tools that enhance teamwork and use need to be coupled with responsible AI systems.







#### Dynamic composability matters.

#### **COMPOSABLE SERVICES**

e.g., model and data archives, learning and analytics, simulation, training

#### **RESOURCE MANAGEMENT**

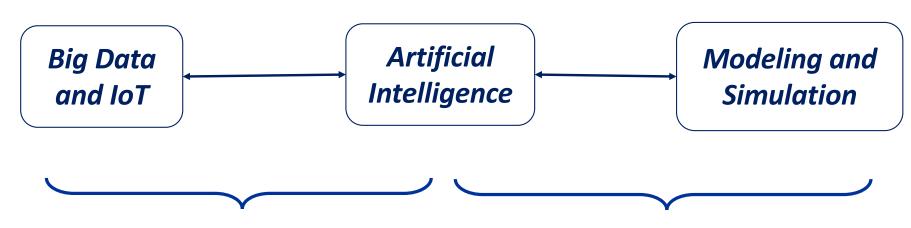
e.g., container orchestration, optimization

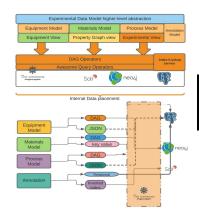
#### **COMPOSABLE SYSTEMS**

e.g., GPU, CPU, Big Data, quantum, neuromorphic, SDN, storage









**Big Data** 

Capability



Capacity



xPU → GPU, CPU, TPU, IPU, QPU,...









Cloud, HPC, Storage



## **Some Composable Systems**









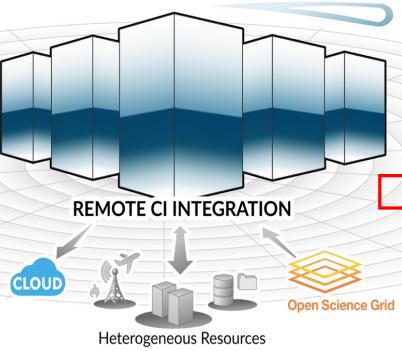
## EXPANSE COMPUTING WITHOUT BOUNDARIES 5 PETAFLOP/S HPC and DATA RESOURCE

#### **HPC RESOURCE**

13 Scalable Compute Units 728 Standard Compute Nodes 52 GPU Nodes: 208 GPUs 4 Large Memory Nodes

#### DATA CENTRIC ARCHITECTURE

12PB Perf. Storage: 140GB/s, 200k IOPS
Fast I/O Node-Local NVMe Storage
7PB Ceph Object Storage
High-Performance R&E Networking



#### LONG-TAIL SCIENCE

Multi-Messenger Astronomy Genomics

Earth Science Social Science

#### **INNOVATIVE OPERATIONS**

**Composable Systems** 

High-Throughput Computing

Science Gateways

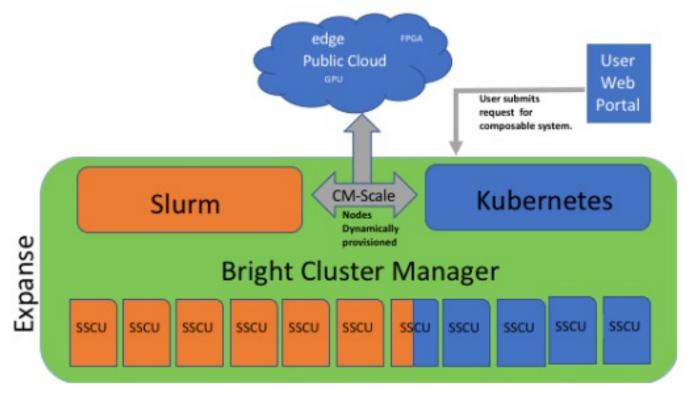
Interactive Computing

**Containerized Computing** 

**Cloud Bursting** 



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Expanse Composable Systems Framework





#### National Research Platform



https://nationalresearchplatform.org/







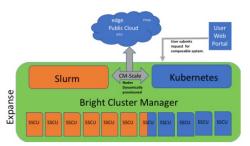
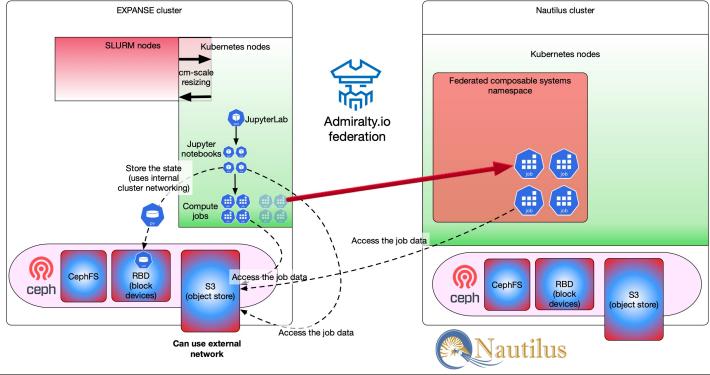


Figure 5.1 Expanse Composable Systems Framework

#### First composable cluster is federated!

EXPANSE (Enthalpy) + CHASE-CI (Nautilus)









#### HPC/Cloud

## Al@Edge and the Digital Continuum

Slide Source: Pete Beckman, ANL





NSF





Leadership Team











**Education & Training** 























Systems and services are only useful if the groups can integrate them into applications.

# **WORKFLOW MANAGEMENT**

e.g., application integration, coordination, optimization, communication, reporting

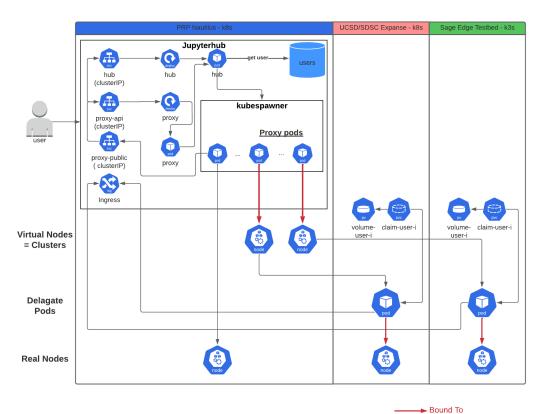
**COMPOSABLE SERVICES** 

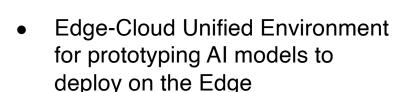
RESOURCE MANAGEMENT

**COMPOSABLE SYSTEMS** 



Integration of NSF EXPANSE, NRP and Sage A Composable System Deployment of JupyterHub





 A user can easily be provided the right environment for developing their AI Edge Application

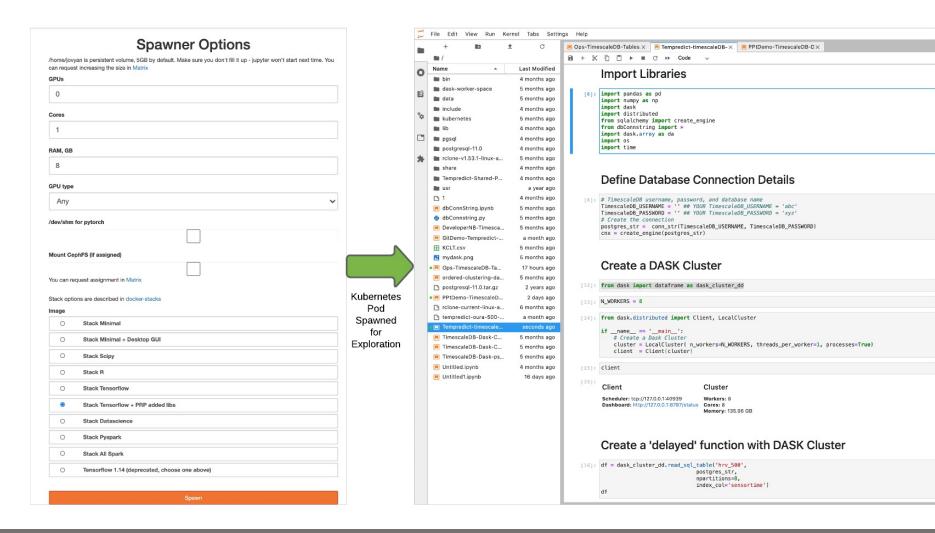
I. Altintas et al., "Towards a Dynamic Composability Approach for using Heterogeneous Systems in Remote Sensing," 2022 IEEE e-Science doi: 10.1109/eScience55777.2022.00047





**PRP Nautilus** 

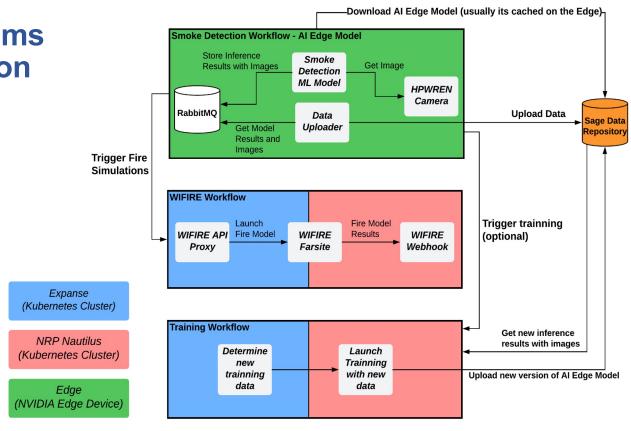
Testbed (k3s)





# Fire Simulations using Composable Systems and Edge Smoke Detection

- Three workflows
  - Smoke Sage Edge App
  - Fire simulator
  - Al Training
- Both the fire simulator and training workflows are can be run on Expanse or Nautilus through the federation layer



I. Altintas et al., "Towards a Dynamic Composability Approach for using Heterogeneous Systems in Remote Sensing," 2022 IEEE e-Science doi: 10.1109/eScience55777.2022.00047





# RESPONSIBILITY e.g., accuracy, privacy, explainability, ethics

# REPRODUCIBILITY TEAM SCIENCE

# **USE-INSPIRED INTERFACES**

e.g., for science, education and scalable practice

Tools that enhance teamwork and use need to be coupled with responsible AI systems.





# e.g., accuracy, privacy, explainability, ethics, equity RESPONSIBILITY

# REPRODUCIBILITY

# SCIENCE TEAM

long-term archives LIFECYCLE MANAGEMENI data reuse services active data repositories, knowledge networks, DATA I

# **USE-INSPIRED INTERFACES**

e.g., for science, education and scalable practice

# **WORKFLOW MANAGEMENT**

e.g., application integration, coordination, optimization, communication, reporting

# **COMPOSABLE SERVICES**

e.g., model and data archives, learning and analytics, simulation, training

# RESOURCE MANAGEMENT

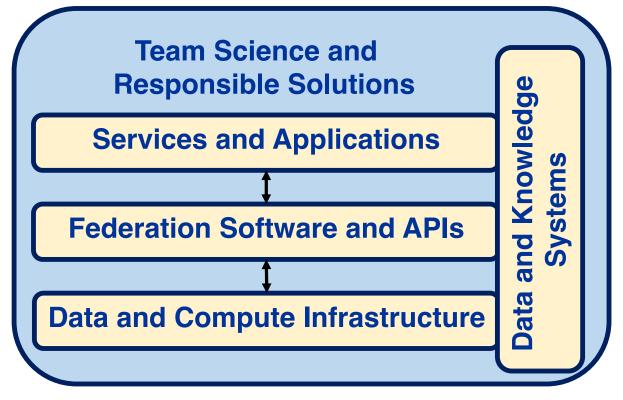
e.g., container orchestration, optimization

# **COMPOSABLE SYSTEMS**

e.g., GPU, CPU, Big Data, quantum, neuromorphic, SDN, storage



# **Use-Inspired Composability from Systems to Services**



- User-centered design and experience
- Improved FAIR data capacity
- Capability-based integration
- Create plug and play microservices
- Run across many systems
- Dynamically measure, manage and provision resources







### EXECUTIVE OFFICE OF THE PRESIDENT OFFICE OF SCIENCE AND TECHNOLOGY POLICY WASHINGTON, D.C. 20502

### August 25, 2022

### MEMORANDUM FOR THE HEADS OF EXECUTIVE DEPARTMENTS AND AGENCIES

Dr. Alondra Nelson

Deputy Assistant to the President and Deputy Director for Science and Society Performing the Duties of Director

Office of Science and Technology Policy (OSTP)

SUBJECT: Ensuring Free, Immediate, and Equitable Access to Federally Funded Research

This memorandum provides policy guidance to federal agencies with research and development expenditures on updating their public access policies. In accordance with this memorandum, OSTP recommends that federal agencies, to the extent consistent with applicable law:

- 1. Update their public access policies as soon as possible, and no later than December 31st, 2025, to make publications and their supporting data resulting from federally funded research publicly accessible without an embargo on their free and public release;
- 2. Establish transparent procedures that ensure scientific and research integrity is maintained in public access policies; and,
- 3. Coordinate with OSTP to ensure equitable delivery of federally funded research results





& strengthening accountability

- Promotes more accountability

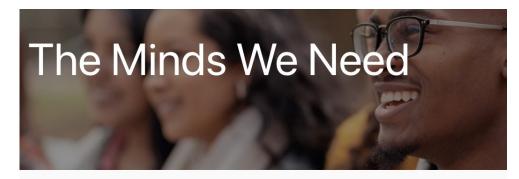


in government agencies

- · Improved policy design

for the economy

· Open data creates value added



Inclusion, Innovation, and Competitiveness | Strengthening Our National Broadband Initiative | Investing in Research and Education Infrastructure | Contributors | Toolkit | Endorsements

# Inclusion, Innovation, and Competitiveness

We are at a crossroads.

https://mindsweneed.org

### Toward Democratizing Access to Facilities Data: A Framework for Intelligent Data Discovery and Delivery

an Rodero 🥦 and Manish Parashar 🤎 University of Utah, Salt Lake City, UT, 84112, USA

Data collected by large-scale instruments, observatories, and sensor networks (i.e., science facilities) are key enablers of scientific discoveries in many disciplines However, ensuring that these data can be accessed, integrated, and analyzed in a democratized and timely manner remains a challenge. In this article, we explore now state-of-the-art techniques for data discovery and access can be adapted to facilitate data and develop a conceptual framework for intelligent data access and



Democratizing Computation and Data to Bridge Digital Divides and Increase Access to Science for Underrepresented Communities

October 3, 2021 NSF OAC 2127459

# **Democratization of CI and Data Access**





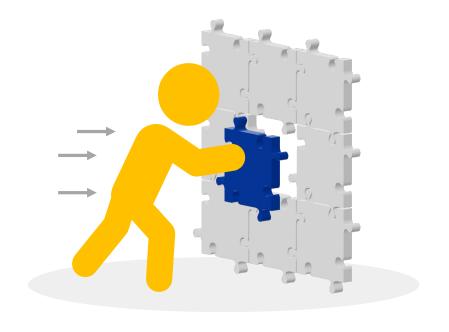
# **Architecting for Collective Data-Integrated Impact**

- Involve diverse users in architecting
- Identify access, use, expertise and education gaps
- Improve the experience of working with data
- Connect data to knowledge systems and services
- Create an ecosystem approach to capacity building
- Incubate use-inspired solutions to scale
- Explore new models of allocation
- Develop and teach models of sustainability and scale





# How do we bridge the data gaps?





















http://www.nationaldataplatform.org



Award abstract: <a href="https://www.nsf.gov/awardsearch/showAward?AWD">https://www.nsf.gov/awardsearch/showAward?AWD</a> ID=2333609



İlkay Altıntaş, PhD (ialtintas@ucsd.edu)



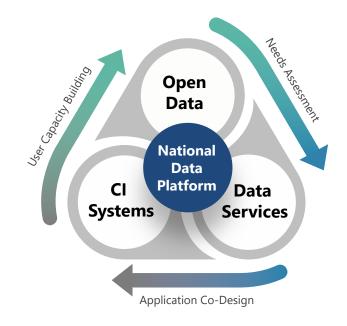
# What is the National Data Platform?



A **broad**, **federated** and **extensible** data ecosystem to promote collaboration, innovation and equitable use of data on top of existing and future national cyberinfrastructure (CI) capabilities.

# **FOCUS AREAS:**

- Data-enabled and Al-integrated research and education workflows
  - Facilitates data registration, discovery and usage through a centralized hub
  - Enhances distributed CI capabilities through distributed points of presence
  - Cultivates resources for classroom education and data challenges
  - Assists research and learning through personalized workspaces
- Partnership pathways to foster scientific discovery, decision-making, policy formation and societal impact



http://www.nationaldataplatform.org

















# **Our Use-Inspired Approach**

Solving data gaps one workflow template at a time...

# Identify Gaps

- Community advisory board
- External community integration plan
- Needs assessments
- Co-design workshops
- Expansion prototypes



# Incubate, Innovate and **Educate**

Use-Inspired Workflows and Interfaces

Data and Knowledge Management



Composable Services

Composable Systems and **Platforms** 

# Sustainable and **Scalable Use**

- Distributed in nature
- Composition as a principle
- Hub-centric services as connection backbone
- Integrates in education systems

Collaboration, Incubation, Allocation and Partnership Models





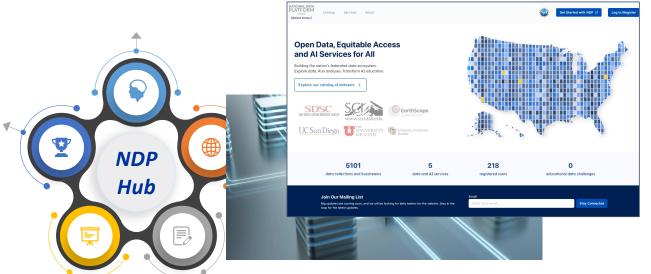














Centralized portal for discovery, access and use workspaces for research and education SDSC San Diego Supercomputer Center





A scalable platform for using, developing and deploying services and application workflows at distributed points of presence





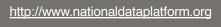




UC San Diego









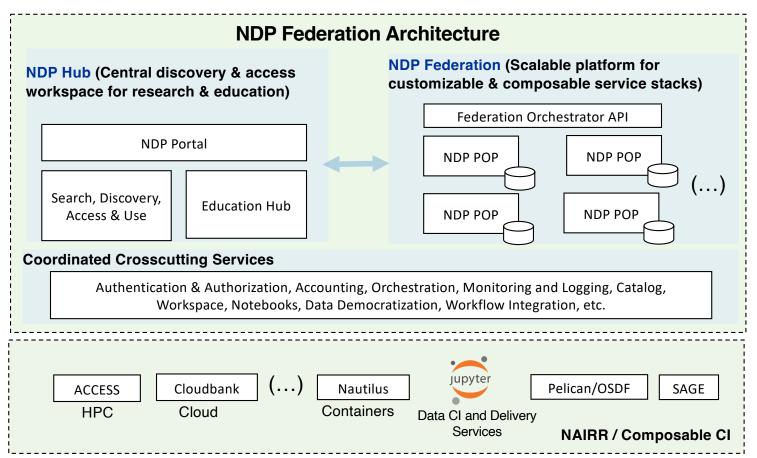
# **Current NDP Overarching Architecture**

### **Data Sources**

NAIRR Datasets, NDC-C, EarthScope, WIFIRE, Nourish, SAGE, etc.

## **External Services**

GitHub, PyPI Hugging Face, DockerHub, etc.



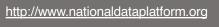






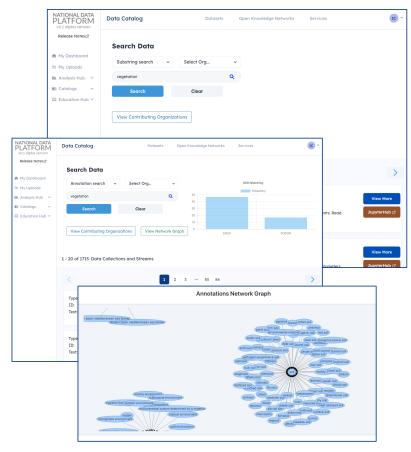








# NDP Hub: Data Search and Discovery



# **Current Capabilities:**

- Search capabilities to include not just text in metadata and ontology concepts but also time and location data.
- Ability to search time and time ranges within the data, such as from "27 September 2020" to "24 January 2021."
- Location-based searches can now be combined using specific location names (e.g., "San Luis Obispo") or boundary polygons.
- Support free-text search across "all metadata" without specifying particular fields.
- Utilize Lucene, a popular search syntax, to improve search functionality.

# **Ongoing Work:**

- Extract entity annotations from the metadata text and integrate them with the ontology to enhance search functionality.
- Create a vector store and develop a search pipeline that handles queries in natural language.
- Optimize the system's performance to ensure fast and accurate retrieval of relevant information.













# NDP Hub: Central discovery & access workspace for research & education

# **NDP Hub**

NDP Portal

Search,
Discovery,
Access & Use

**Education Hub** 

- NDP Portal (point of access)
   https://nationaldataplatform.org
- Metadata registration and indexing
  - Contributing organizations
  - Harvested metadata from NDP POPs
- Data search
  - String and conceptual search
  - Open Knowledge graphs / via LLMs

# **NDP Standard Services**

# **Public:**

- Extensible Data Catalog and Search Services
- Education Hub Informal Learning Modules

# Login-enabled:

- Keycloak Role-Based Access Service
- User Workspaces
- Al Gateway with Custom JupyterHub Service
- Data Catalog and OKN Ingestion
- External Model Ingestion
- Data Exploration Services
- MLFlow Dashboard Service
- Education Hub Classroom
- Education Hub Challenge
- · Democratizing Data Dashboard

# **Hub Capabilities Under Development**

- Sage Data and Edge Code Integration Service
- · Service Catalog and Discovery Service
- Educational Hub Expansion
- · Streaming Data Services
- Pelican Registration Service
- Integrated Workflows

# **Planned Future Work**

- OKN Integration
- Data Curation
- · Data Subsetting
- Data Provenance
- Educational Toolkits
- Open Science Chain Provenance Service
- Gateway Services









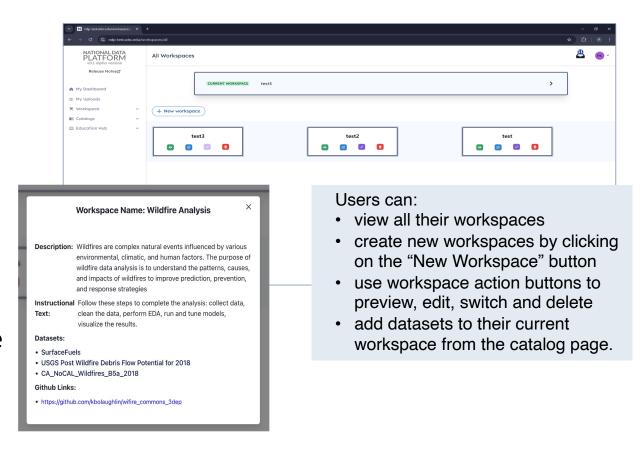




# NDP Workspaces (Version 1 – September 2024)

**Goal:** Craft persistent and customizable workspaces with datasets and services to launch into a sandbox

- Create customized workspaces for varied use cases
- Search and add datasets to use in sandbox (HPC Env)
- Add github links for file access
- Launch packaged workspace into sandbox







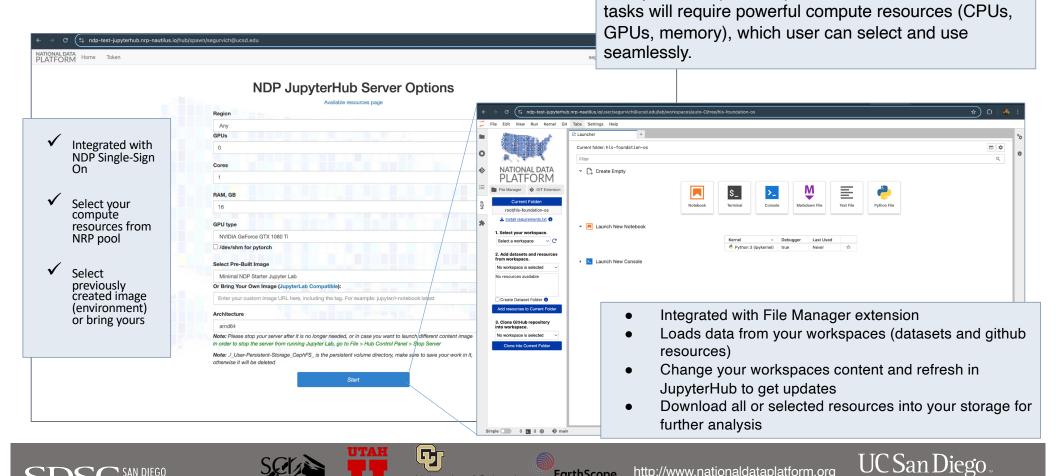








# NDP JupyterHub (Sandbox)



University of Colorado

EarthScope

A compute environment for data analysis, machine

http://www.nationaldataplatform.org

HALICIOĞLU DATA SCIENCE INSTITUTE

learning training or any other computational tasks, built on top of NRP (Nautilus) cluster. Different datasets and

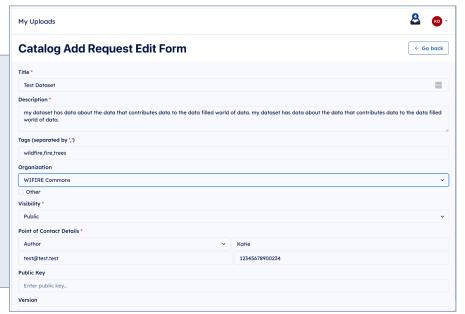
# **NDP Catalog Addition**

**Goal:** Users can add dataset references to either NDP centralized catalog or POP-specific catalog



# **Curated Public Catalog Add Request:**

- Provide all metadata and data access information
- Designated data approvers evaluate dataset quality
- Add or reject datasets for access to community







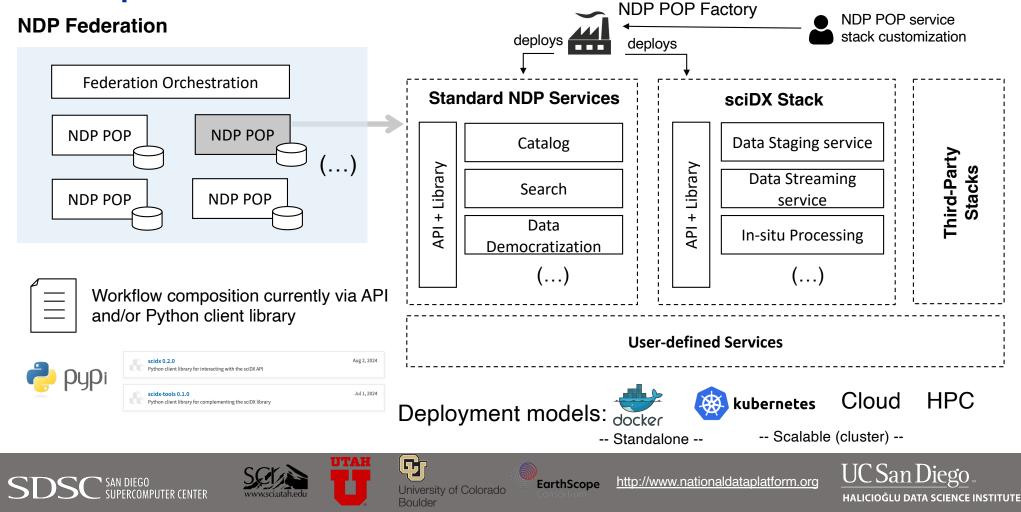








# NDP POP: Distributed Points of Presence with Customizable, Composable Service Stacks



# Science Data Exchanges (sciDX) Services: Data Staging and Streaming Services

Science Data Exchange (sciDX): Customizable software stack for in-situ data access & processing

**Data Staging Service** 

- In-situ (close to the data) data processing and access
- High-performance in-memory processing
- Server-side data transformations (e.g., subsetting, reduction, user-defined analysis, etc.)
- Caching/sharing of data, query results, and data products with user and group isolation

# **Data Streaming Service**

- Streams registration, curation/archival for discovery and access
- User-defined operations on streaming data (semantically specialized abstractions)
- Combine streaming data with archived/playback data
- Mechanism for online data product generation (i.e., new data streams

In-situ AI workflow execution runtime (on staged and streaming data)

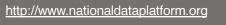










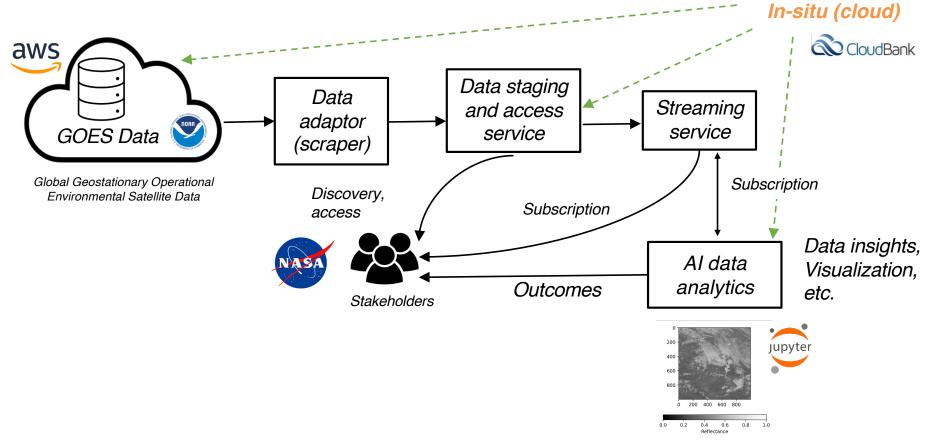




Manish Parashar and Ivan Rodero

# **Example: Fire Detection using NASA GOES Satellite Data**

(under development)



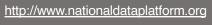














# Typical NDP Workflow with Composable Capabilities







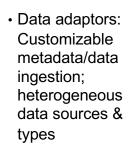




## Data sources:

NAIRR datasets. repositories. instruments. sensors, facilities, etc.

Acquisition



Data



(Meta) data

Curation,

Registration,

Indexing,

Discovery

- engine Recommendation services

Data Access.

Data Staging, Insitu Data **Analytics** 

· High-performance data

optimization (caching,

Leverage Pelican data

origins; data federation

staging & in-situ

processing

Data access

pre-fetching,

recommendation)



Generation, Curation, Sharing, Archival



- Services Gateway (support notebooks)
- Leverage NAIRR/NSF **ACCESS/Cloud** resources.
- Data-driven stream processing

 Data product & re-streamina

Product

 Archival support (including using Pelican)











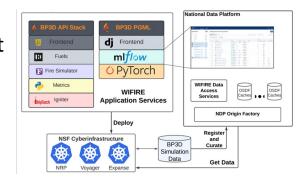


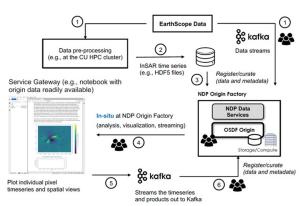


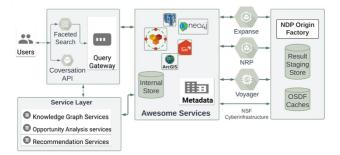


# Case Studies for Generalizable Workflows

- Representative examples of important patterns that exist in science today for working with
  - O large datasets
  - O streaming data from facilities
  - O graph data from open knowledge networks
- Implemented as production-quality specialized value-added services
- Domains of wildland fire, earthquakes, and food security
- Will be generalized for replication by external communities.



















# Planned Extensions for NAIRR (September 2024 – August 2025)



# **NAIRR Data Resource Catalog**

- Ingestion Process for NAIRR Data
- FAIR NAIRR Catalog
- Conversational Search Interfaces

# **NAIRR CloudBank Research Workflows**

- Provisioning and Accounting
- CloudBank Workflow Deployment
- Collaborate with NAIRR science pilots

# **NAIRR Classroom Workflows**

- NAIRR Educator Workflows
- NAIRR Student Workflows
- Community Engagement













# **Example NDP-NAIRR AI in Science Workflow**









Registration, Indexing, Discovery



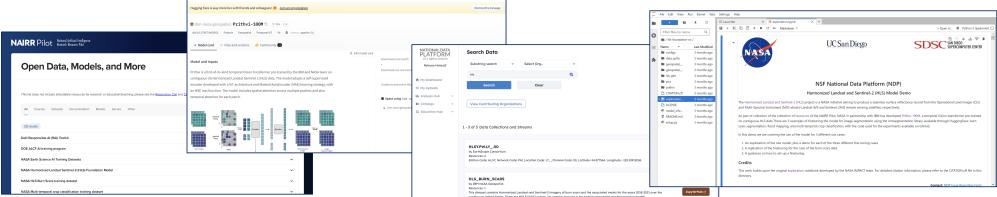
Data-driven, AI/ML-based workflows

**Product** Generation, Curation.

Sharing, Archival



- · Data and Models are identified as part of the Open NAIRR Resources.
- · Resources are collected from HuggingFace
- · Data and Models are registered into NDP catalog (CKAN)
- · Data origin is created in OSDF to optimize data transfer
- · Data and Models are included into user's workspace, along with the necessary libraries, services and files to work on a new project.
- Analysis and Al/ML workflow is supported by Al Gateway (JupyterHub), using NRP's Nautilus.
- High Performance processing for new resource(s) development (Models, Data).
- · Final products pushed to OSDF/HuggingFace/GitHub and registered into NDP's catalog.















# **NDP Data Challenges** for students and researchers



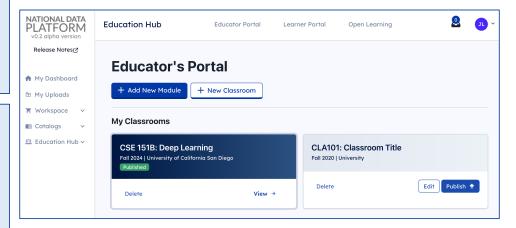
lub to nts access ecosystem

Designed to ensure that we are developing broadly accessible services for equitable education and community building.

The challenge questions require using data and models in an environment that requires computing and big/large data stores, which would typically be unavailable to a student or researcher without the NDP Education Hub.



Data challenge toolkits will be developed after each data challenge so that other institutions can easily design their own data challenges to be run through the NDP Education Gateway.



# **Education and** capacity building through data challenges







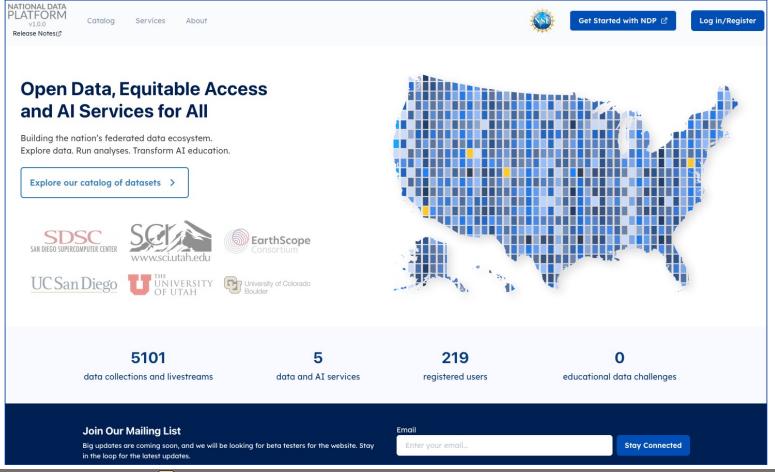








# Any questions? Contact <a href="mailto:ndp@sdsc.edu">ndp@sdsc.edu</a>



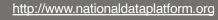














# To sum up...

Emerging new applications require integrated AI in dynamically composed workflows, but there are significant data gaps to be addressed.

Artwork: **Jen Stark, Cosmographic, 2014**, acid-free paper, holographic paper, glue, wood, acrylic paint, 34 x 37 x 4 in.



# Complexity comes at a cost

- Composable systems is not a turnkey functionality
- Requires collaboration with and between infrastructure providers

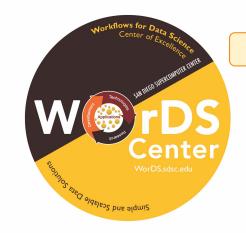
# **Convergence research helps**

- End-to-end data pipelines need to be defined for each application along with microservice execution
- Use-inspired design and translational CS helps to focus the effort





Contact: Ilkay Altintas, Ph.D. Email: <u>ialtintas@ucsd.edu</u>



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