

EarthCube Town Hall  
AGU  
December 9, 2019



*This work supported through the National Science Foundation award #1928208.*

# Office Transition Sept-October 2019

Thanks to the EarthCube Science Support Office (ESSO)!

*(Welcome back, Lynne Schreiber!)*



# ECO: Vision & Goals



## EC Office that is effective, efficient, transparent, responsive

- Promotes clear communication to stakeholders.
- Ensure goals are reached and metrics tracked.
- Identify synergies between EC and related community activities.
- Translate governance and NSF directives into actions and outcomes.

## Data Access and Discovery activity

- Increased adoption and participation from the community.
- Effective facilitation of the emerging community-defined workbench.
- Increased adoption of EC outputs and integrations.
- Bridging science and technical (builders) for the community needs.

*Benefitting geoscientists and the wider research community through tools, methods, standards, architectures, and community connections.*

ECO Partners: ESIP, NCSA/UIUC, Ronin Institute, SDSC/UC San Diego, University of Hawaii, USGIN

# ECO Team

- Strong links to Geosciences community
- Sustainable coordination mechanisms
- Trust, rapport, shared work experience
- People embedded in EarthCube, committed to vision
- Dedicated Executive Director



# Core EC Office

Christine Kirkpatrick, Rebecca Koskela, Lynne Schreiber



## Specific Attributes

- Full-time Executive Director
- FT Coordinator and PT support staff
- Shared staff for web, event management
- Experienced, dedicated grant and fiscal management staff

# Data Community and Training

Lead: Erin Robinson



## Specific Activity Examples

- Data Fairs
- Data Help Desk at science meetings
- Data Challenges
- Training on demand, workshops
  - (GO) FAIR awareness, specific topics

2019 AGU Data FAIR, booth #1329

Supported by:

*Megan Carter, Samantha Sands*

## Planned Collaborations



# Science Coordination

Cathy Constable, Ouida Meier,  
Karen Stocks



## Specific Activities

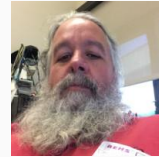
- Work with geoscientists to identify pressing technical needs and bottlenecks
- Coordinate w/ technical team; convey capab. & limit. of avail. solutions from user perspective
- Maintain a collection of use cases and sci-tech success stories across EarthCube
- Communication: Newsletter, Science features, EC & other Tool features, Workflows

# Technical Team

Lead: Kenton McHenry



*Supported by: Ilya Zaslavsky, David Valentine, Melissa Cragin, Steve Richard, Craig Willis*



## Specific Activities

- **Maintain common software support used across projects. Monitor and report EC resource re-use**
- **Support and extend GeoCODES, and EarthCube registries for data, components, and practices**
- **Integrated tool platform support, outreach, integration.**
- **Community standards and best practices: promote and build consensus**
- **Technical resource demonstration and training: demonstrate EC capabilities to geoscientists**
- **EC projects: identify and promote opportunities for interoperability, broker reuse of resources within and beyond EC. Review technical products for documentation and alignment with EC priorities.**
- **Strategic planning: work with committees, ad hoc WGs, surveys from users → technical recommendations**



# Leadership Council Chair Election

Vote December 9-20, 2019

here



Michael Daniels  
Colorado State University  
NCAR



Ken Rubin  
Dept. of Earth Sciences  
Univ. of Hawaii at Manoa



J. Douglas Walker  
Department of Geology  
University of Kansas

# Eva E Zanzlerkia - National Science Foundation

# NSF Opportunities FY2020

Eva Zanzerkia GEO/EAR	Amy Walton CISE/OAC
Colleen Strawhacker GEO/OPP	Eric DeWeaver GEO/AGS
Marc Stieglitz GEO/OPP	Sean Kennan GEO/OCE



# Cyberinfrastructure for the Geosciences-Opportunities

<https://www.nsf.gov/geo/geo-ci/index.jsp>



The screenshot shows the NSF website header with the logo and tagline "National Science Foundation WHERE DISCOVERIES BEGIN". A search bar is located in the top right. Below the header is a navigation menu with categories: Research Areas, Funding, Awards, Document Library, News, and About NSF. A left sidebar contains a menu for "Geosciences (GEO)" with sub-items: Home, About, Programs, Staff, Funding, Awards, News, Events, and Additional Resources. The main content area features the title "Cyberinfrastructure for the Geosciences – Opportunities" and a paragraph describing NSF opportunities for cyberinfrastructure. Below this is a section for "Upcoming Events" with three bullet points. At the bottom of the main content area is a section for "NSF Funding Opportunities".

NSF National Science Foundation WHERE DISCOVERIES BEGIN

Contact | Help

Search

NSB Research Areas Funding Awards Document Library News About NSF

Home » Research Areas » Geosciences

Email Print Share

## Geosciences (GEO)

- Geosciences (GEO) Home
- About
- Programs
- Staff
- Funding
- Awards
- News
- Events
- Additional Resources
- Atmospheric and Geospace

### Cyberinfrastructure for the Geosciences – Opportunities

A variety of NSF opportunities support the development and implementation of cyberinfrastructure for the geosciences. A common goal of these opportunities is to increase public access to data generated through NSF-sponsored research. NSF's strategy for public access to research data is articulated in its [Public Access Plan \(NSF 15-52\)](#), and specific data policies are described in the [Proposal & Award Policies & Procedures Guide \(PAPPG, NSF 18-1\)](#). GEO Divisions and Offices specify additional data policies, and identify cyber resources available to support these policies ([Directorate for Geosciences—Data Policies](#)).

This website provides an overview of the range of NSF opportunities supporting cyberinfrastructure and data sharing in the geosciences. PIs are encouraged to reach out to cognizant Program Officers to learn more about relevant funding opportunities.

#### Upcoming Events

- [EarthCube Town Hall at the AGU Fall Meeting](#) - December 13, 2018, 12:30-1:30 PM EST, Washington, DC
- [Webinar for EarthCube Office solicitation](#): Friday, January 4, 2019: 1 PM EST (see below for details)
- [Webinar for EarthCube core solicitation](#): Friday, January 25, 2019: 1 PM EST (see below for details)

#### NSF Funding Opportunities



# EarthCube NSF 20-520

## Supplement Requests

- Science Adoption
  - Enhance existing science awards through adoption of tools/standards
- Data Resource Adoption
  - Adoption of data standards like GeoCODES by data facilities and resources

## EarthCube RCNs

- Focus/Topic
  - community standards/data management
  - common CI & technology grand challenges
  - Areas convergent with Big Ideas
- EC Participation
- Steering Committee/Participants
- Outcomes



# EarthCube NSF 20-520

## Pilots

- Focus/Topic
  - Demonstration of lightweight and sustainable approaches to interoperability
  - Reuse of existing infrastructure, semantics and APIs
- Use scenarios that cross the geosciences
- Outcomes within 12-18 months

## Science Enabling Data Capabilities

- Specific scientific challenge driven by geoscientists
- Reuse of existing tools/infrastructure
- Sustainability
- Metrics and assessment

Participation in EarthCube Governance



# EarthCube NSF 20-520

Webinar: Monday, January 27, 2019: 1 PM EST

- EarthCube Research Coordination Networks (RCN)  
Target Date March 12, 2019
- EarthCube Science-Enabling Data Capabilities and Pilots  
Due Date March 12, 2019



# Accelerator “Track A1”: HARNESSING THE DATA REVOLUTION



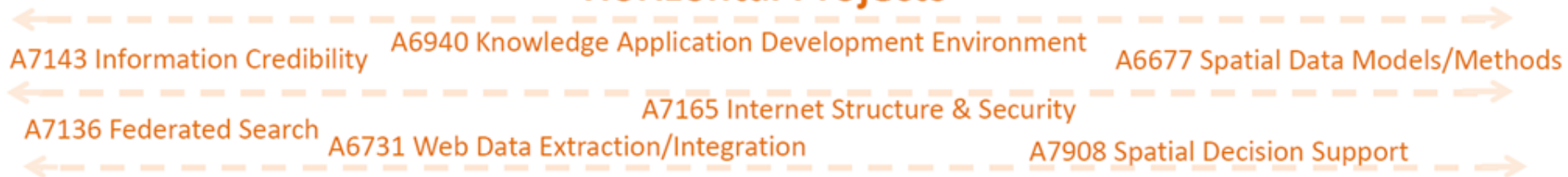
- Advanced science data infrastructure that is interoperable and has an open architecture (makes it easier to access and link heterogeneous data products)
- Open Knowledge Network – an open semantic information infrastructure to discover new knowledge from multiple disparate knowledge sources
- Create a nonproprietary shared knowledge infrastructure, with a particular focus on publicly available U.S. Government and similar public datasets. Challenges include underlying representation of facts, services that perform reasoning tasks, and secured access. Domains include geosciences, education, smart health, and manufacturing.



# Track A1 - Clusters

Open Knowledge Network (21 projects)

## Horizontal Projects



## Vertical Projects



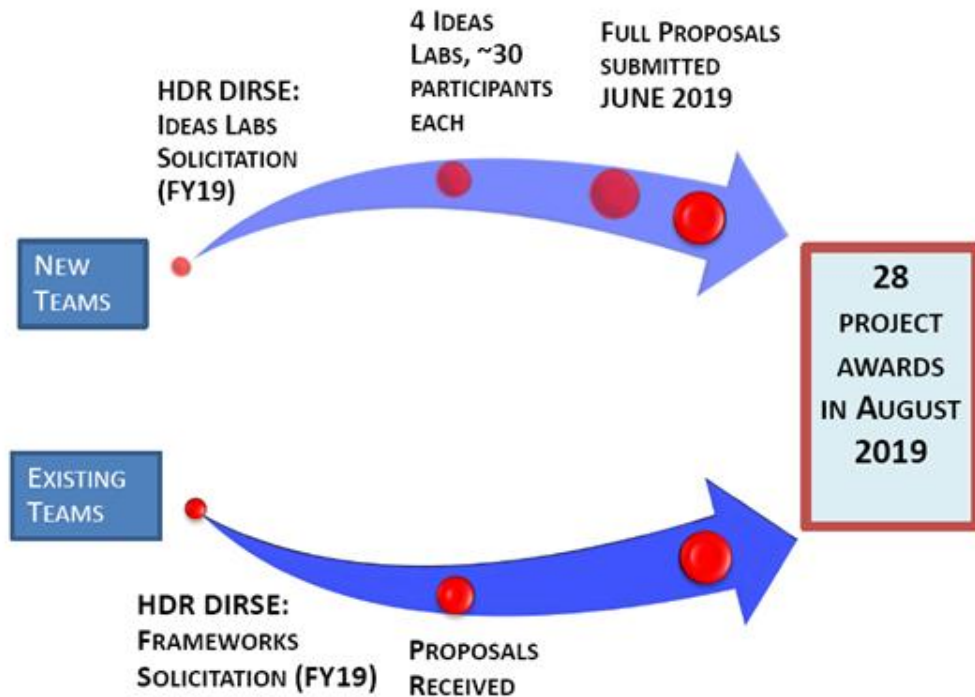
- Projects should seek “track integration”; are required to collaborate with industry; and encouraged to also collaborate / link with other relevant efforts in the community



# HDR Institutes Roadmap

.....HDR INSTITUTES: CONCEPTUALIZATION.....

.....HDR INSTITUTES: CONVERGENCE.....



## 2021 TIMEFRAME

OPEN COMPETITION FOR 4-5  
INSTITUTES THAT BRING TOGETHER  
MULTIPLE SCIENCE AND ENGINEERING  
COMMUNITIES



# National Artificial Intelligence (AI) Research Institutes (NSF-20-503)

This program, a joint effort of NSF, USDA, NIFA, DHS, S&T, DOT, FHWA, and VA, seeks to enable such research through AI Research Institutes. This program solicitation describes two tracks: **Planning and Institute tracks**. Submissions to the **Planning Track** are encouraged in any areas of foundational and use-inspired research appropriate to NSF and its partner organizations. Proposals for the **Institute Track** must have a principal focus in one or more of the following themes, detailed in the Program Description under "Institute Track":

- Trustworthy AI
- Foundations of Machine Learning
- AI-Driven Innovation in Agriculture and the Food System
- AI-Augmented Learning
- AI for Accelerating Molecular Synthesis and Manufacturing
- AI for Discovery in Physics

NSF plans to make 1-6 Institute Awards, and ~ 8 Planning Grants.

**Anticipated Funding Amount:** \$24,000,000 to \$124,000,000

*Proposal Deadlines: January 28, 2020 for Institute proposals  
January 30, 2020 for Planning proposals*



# Ken Rubin – EarthCube Leadership Council

# Ken Rubin, EarthCube Leadership Council Chair

The Leadership Council and other Governance Committees have been working for a couple of years now to refocus EarthCube efforts onto:

- Enabling and Enhancing Geoscientists' Research Workflows
- Promoting science-targeted project developments
- Promoting interoperability
- Promoting collaboration and interaction between funded projects
- Promoting and Educating about Data Stewardship Practices

# Ken Rubin, EarthCube Leadership Council Chair

**Learn more this week about our efforts on the aforementioned initiatives**

- ESIP/AGU Data FAIR, **tue 13:00-14:30** “Learn How EarthCube Plans to Help Scientists Make Full Data Pipelines FAIR & Give Input”
- Talk on **wed 10:50 AM, IN32A-03** “Geoscientific Data Integration Occurs at the Workflow Layer, Requiring FAIR for all Aspects of an Analysis Workflow and More Data Repository Integration: an EarthCube view”
- <https://www.earthcube.org/info/about/earthcube-governance>
- Also, see the “OneGeochemistry” Townhall (Lehnert/Wyborn) **tomorrow at 12:30PM**, to participate in a developing community of practice on these topics

# Ken Rubin, EarthCube Leadership Council Chair

This year, we've opted to forgo the AGU Townhall Governance update to bring you some recent project highlights instead:

Bonnie L Hurwitz - Planet Microbe

Joseph Hamman - Pangeo

Suzanne A Pierce - Is Geo (Intelligent Systems)

Alexander G Kosovichev - Heliophysics

Samira Daneshgar Asl - ICEBERG

Basil Tikoff - StraboSpot

# Bonnie L Hurwitz - Planet Microbe

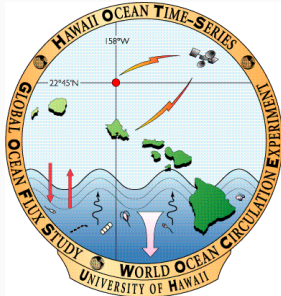
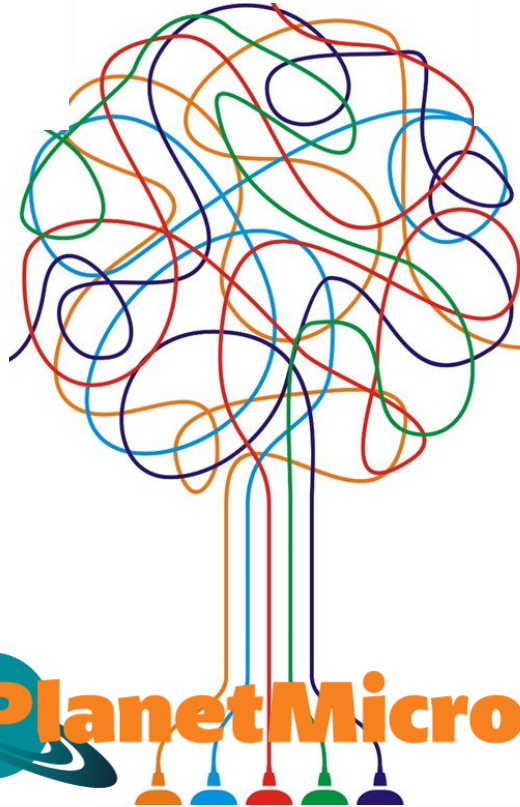


# Planet**Microbe**



Bonnie Hurwitz, University of Arizona





Global ocean 'omics datasets are spread across diverse projects, with varied metadata and semantics

## Project Overview



Reintegration of 'omics data with their environmental context



Standardization of semantics for increased data interoperability

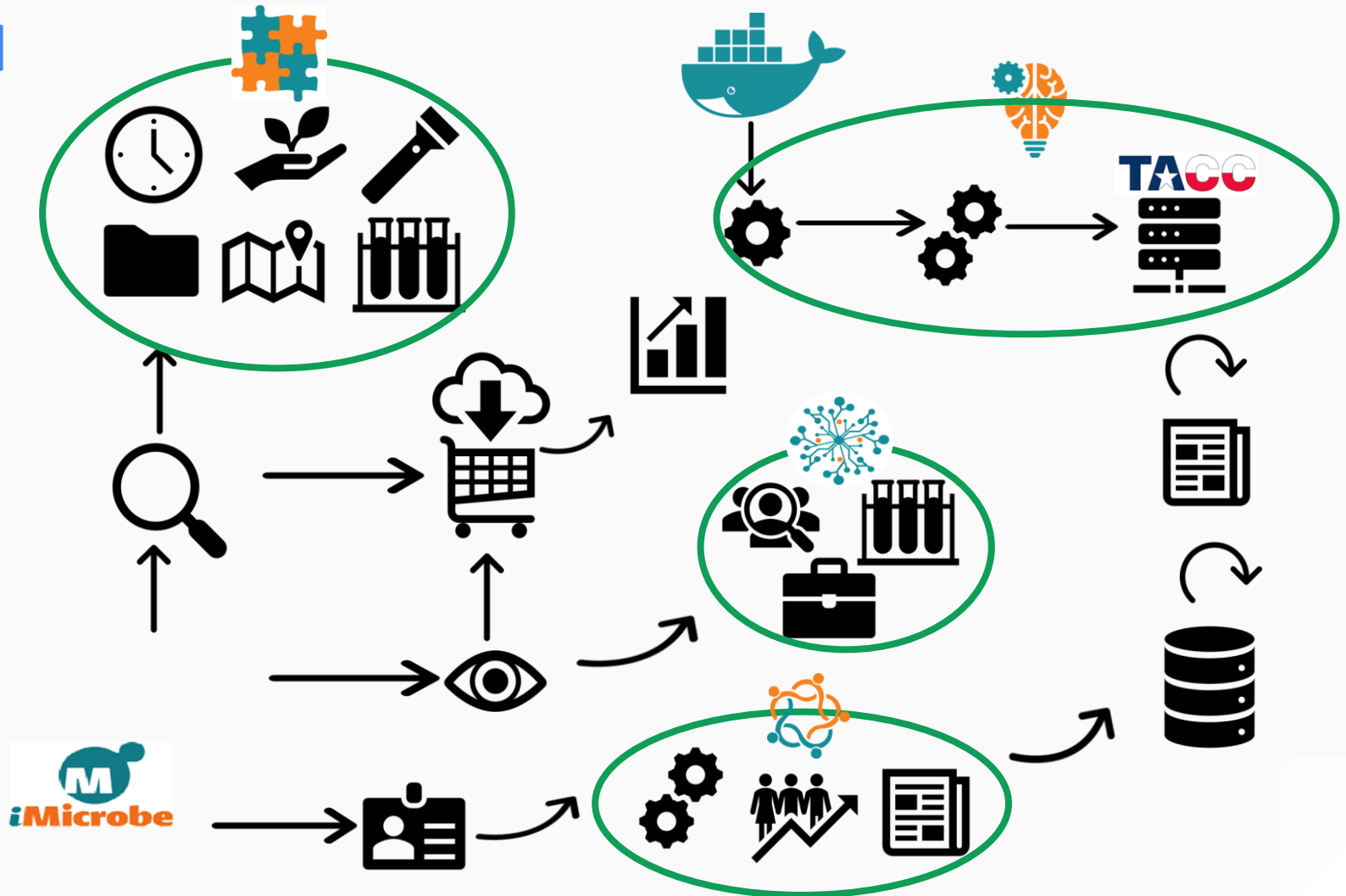


Providing community driven analysis and visualizations tools



Data  
Repository

# Mind Map



# Data containers for dataset interoperability

**Planet Microbe** uses frictionless data packages to make datasets interoperable, as well as shareable between systems.



## FRictionless DATA

### CSV

environmental  
metadata from  
select samples

### JSON

type, unit and  
source information  
about the  
metadata



## Specifications

Lightweight containerisation formats for data that provide a minimal yet powerful foundation for data publication, transport, and consumption.



## Software

Apps and integrations that make it easy to integrate Frictionless Data specifications into your data publication, access, and analysis workflows.

# Map & Sample Search

# Dynamic range-based queries

[Reset](#) | [Advanced Search](#)

Projects   Samples   Files

▼ Time/Space Close Map

Location   lat   lng   radius   Format▼

Depth   min   max   Format▼

Date/Time   start   end   Format▼

▼ Project

- OSD 162
- HOT Chisholm 68
- HOT DeLong 42

▼ Biome X

- Marine biome (ENVO:447) 102
- Ocean biome 68
- Oceanic Mesopelagic Zone 21

[11 More ...](#)

▼ Add Filter

Search parameters ▼



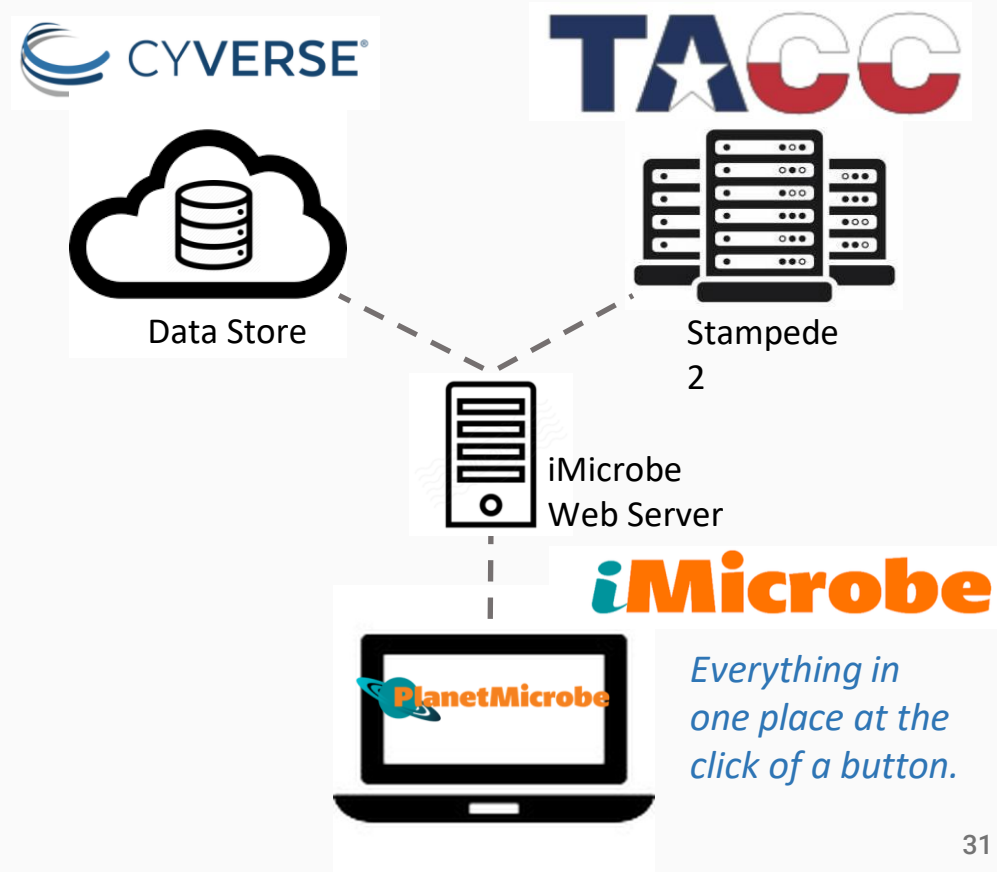
Showing 1 - 20 of 272 samples

Summary	Projects	Samples	Files	Columns
<b>Project Name ▲</b>		<b>Sample ID</b>		<b>Biome</b>
				<b>Cart</b>
HOT Chisholm		SAMN07136999		ocean biome <span>Add</span>
HOT Chisholm		SAMN07137000		ocean biome <span>Add</span>
HOT Chisholm		SAMN07137001		ocean biome <span>Add</span>
HOT Chisholm		SAMN07137002		ocean biome <span>Add</span>
HOT Chisholm		SAMN07137003		ocean biome <span>Add</span>
HOT Chisholm		SAMN07137004		ocean biome <span>Add</span>
HOT Chisholm		SAMN07137005		ocean biome <span>Add</span>
HOT Chisholm		SAMN07137006		ocean biome <span>Add</span>

# Scalable Analytics

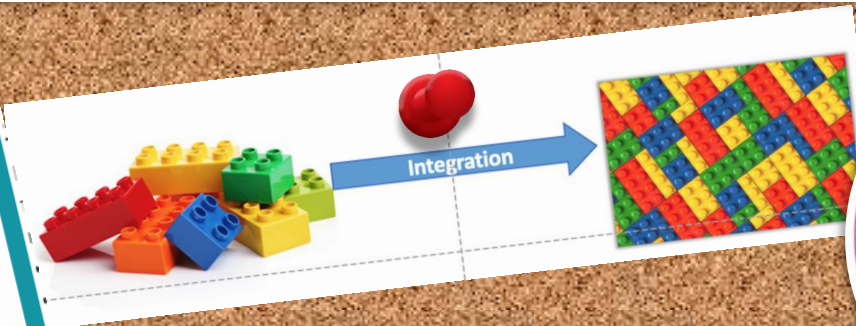
## Cloud Architecture

- Leverages CyVerse & TACC
  - Security
  - Scalability
  - Lower cost of development/maintenance
- Apps (tool containerization)
  - Docker & Singularity
  - Build once, run everywhere



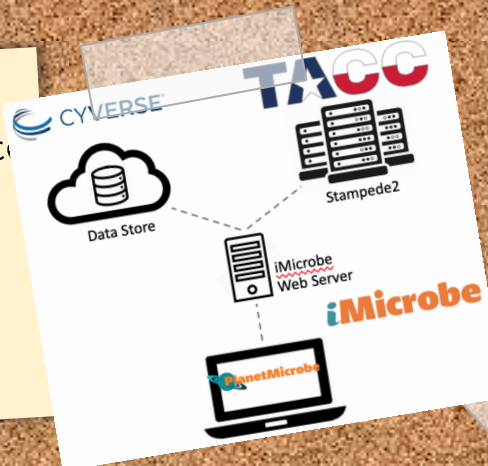
**F** **FRICITIONLESS DATA**

<p>CSV</p> <p>environmental metadata from select samples</p>	<p>JSON</p> <p>type, unit and source information about the metadata</p>
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open and integrative data science systems

- ✓ Standards
- ✓ Quality
- ✓ Integration
- ✓ Access



Main Inputs (0) Parameters (0) Advanced JSON Help

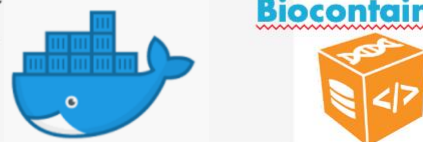
**Add or Update Parameters**

The Appetizer

```

{
  "name": "my_new_app",
  "version": "8.0.1",
  "shortDescription": "",
  "longDescription": "",
  "available": true,
  "checkpointable": false,
  "defaultMemoryPerNode": 192,
  "defaultProcessorsPerNode": 48,
  "defaultMaxRunTime": "12:00:00",
  "defaultNodeCount": 1,
  "defaultQueue": "normal",
  "deploymentPath": "user/applications/app",
  "deploymentSystem": "data.iplantcollaborat",
  "executionSystem": "tacc-stampede2-user",
  "executionType": "HPC",
  "helpURL": "http://google.com",
  "label": "My New App",
  "parallelize": "serial",
  "templatePath": "template.sh",
  "testPath": "test.sh",
  "modules": [
    "tacc-singularity",
    "launcher"
  ],
  "tags": [
    "imicrobe"
  ],
}
    
```

**Biocontainers**





# PlanetMicrobe



**Alise Ponsero, PhD, MS**  
*Post-Doctoral Fellow*



**Matt Bomhoff**  
*Sr. Developer*

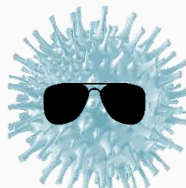


**Ken Youens-Clark, MS**  
*Sr. Developer*



**Kai Blumberg**  
*Graduate Student*

**University of Hawaii**  
*Dr. Ed DeLong*



**Lawrence Berkeley National Lab**  
*Dr. Elisha Wood-Charleson*



**@hurwitzlab @planetmicrobe**

**Demo: Earthcube Booth**  
**Tuesday 2:30-3:30pm**

# Joe Hammam - Pangeo



**PANGEO**

jupyter

Pangeo and Jupyter Meets Earth Project Spotlight

Joe Hamman, NCAR



**EARTH CUBE**  
TRANSFORMING GEOSCIENCES RESEARCH

**AGU100** ADVANCING  
EARTH AND  
SPACE SCIENCE

# PANGEO

*AN OPEN SOURCE BIG DATA CLIMATE SCIENCE PLATFORM*



## RESEARCH USE CASES

- Atmospheric Moisture Budgets
- Convective Parameters for Understanding Thunderstorms
- Climate downscaling for hydrologic modeling
- Statistical analysis of eddy-resolving ocean



## TECH DEVELOPMENT

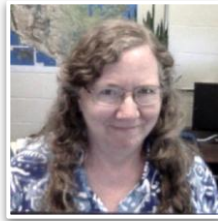
- Integrate existing scientific python ecosystem
- Deploy system on HPC and Cloud Computing Systems
- Benchmark and tune based on real-world workflows
- Document and demonstrate application



Ryan  
Abernathey



Chiara  
Lepore



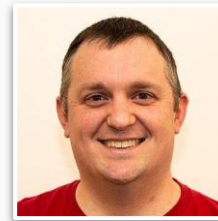
Naomi  
Henderson



Kevin  
Paul



Joe  
Hamman



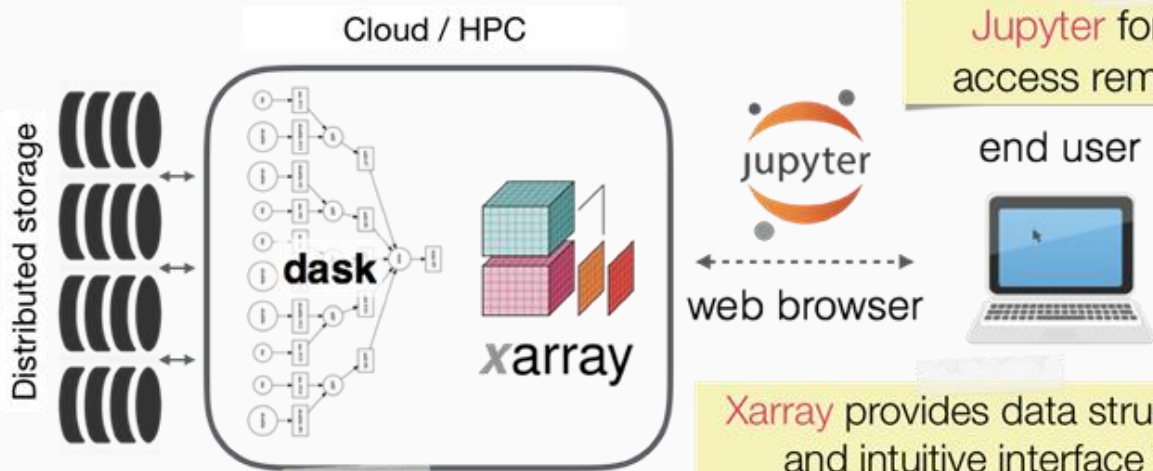
Ryan  
May



Matt  
Rocklin

# PANGEO ARCHITECTURE

"Analysis Ready Data"  
stored on globally-available  
distributed storage.



Jupyter for interactive  
access remote systems

end user

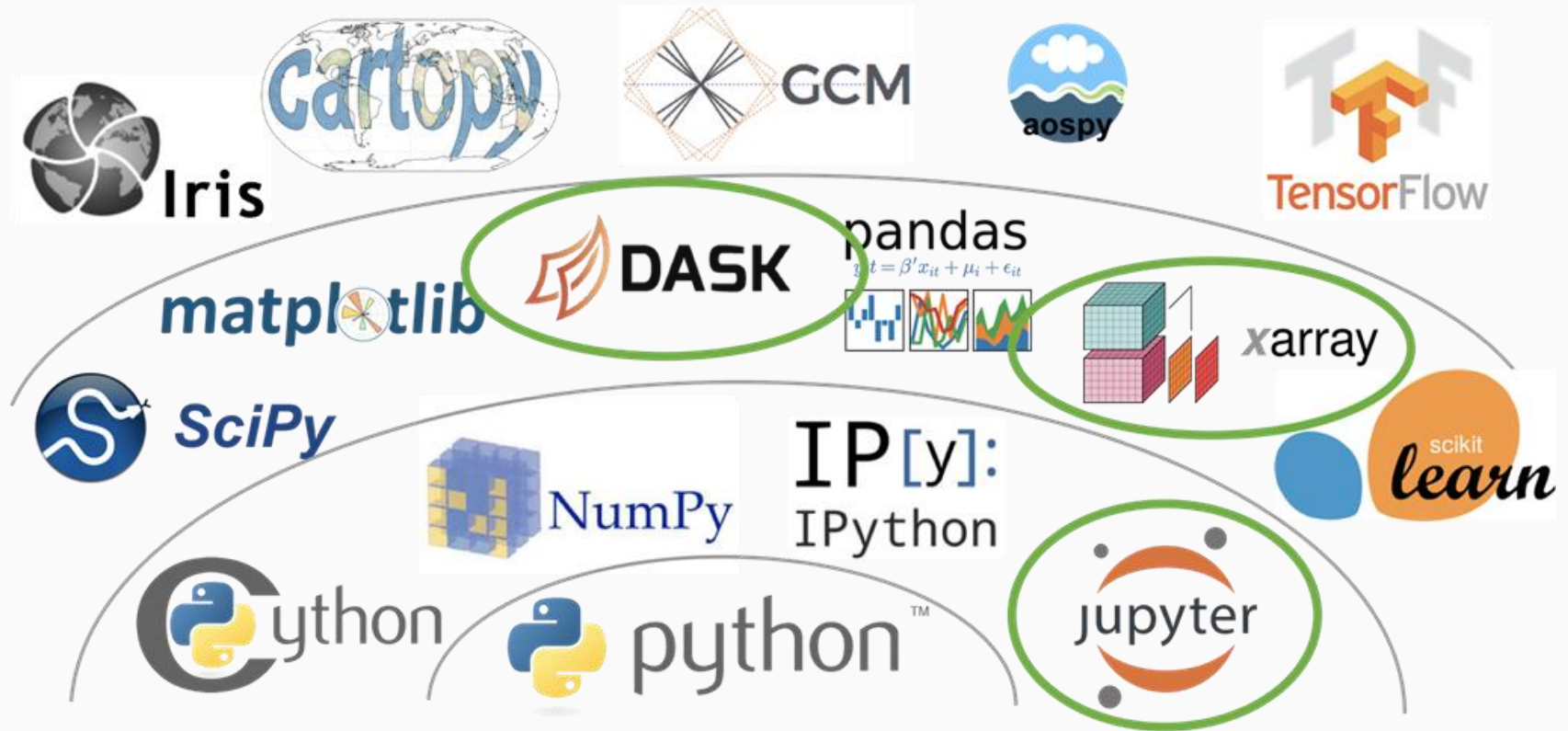
web browser

Xarray provides data structures  
and intuitive interface for  
interacting with datasets

Parallel computing system allows  
users deploy clusters of compute  
nodes for data processing.

Dask tells the nodes what to do.

# INTEGRATION OF THE SCIENTIFIC PYTHON ECOSYSTEM



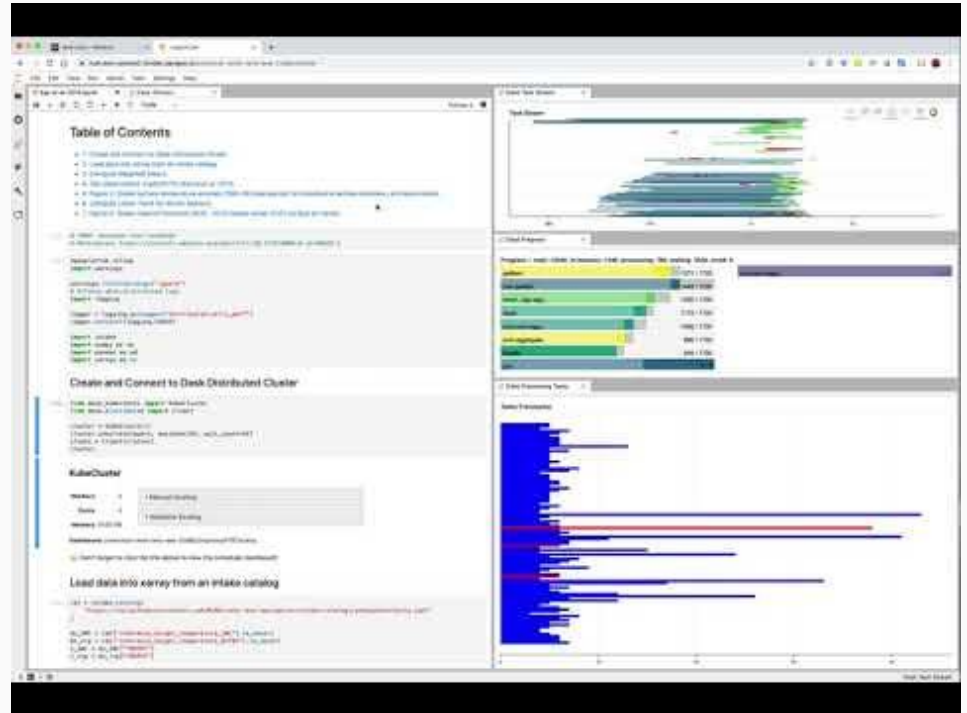
# HIGHLIGHT 1: DISTRIBUTED COMPUTING WITH XARRAY AND DASK

**Xarray:** Labeled N-Dimensional Arrays in Python

**Dask:** Parallel, distributed arrays in Python

- Xarray supports using Dask arrays under the hood
- Integration with Dask-distributed for multi-process reads and write with large computer clusters

**The Result:** massively scalable data analysis on very large multidimensional datasets



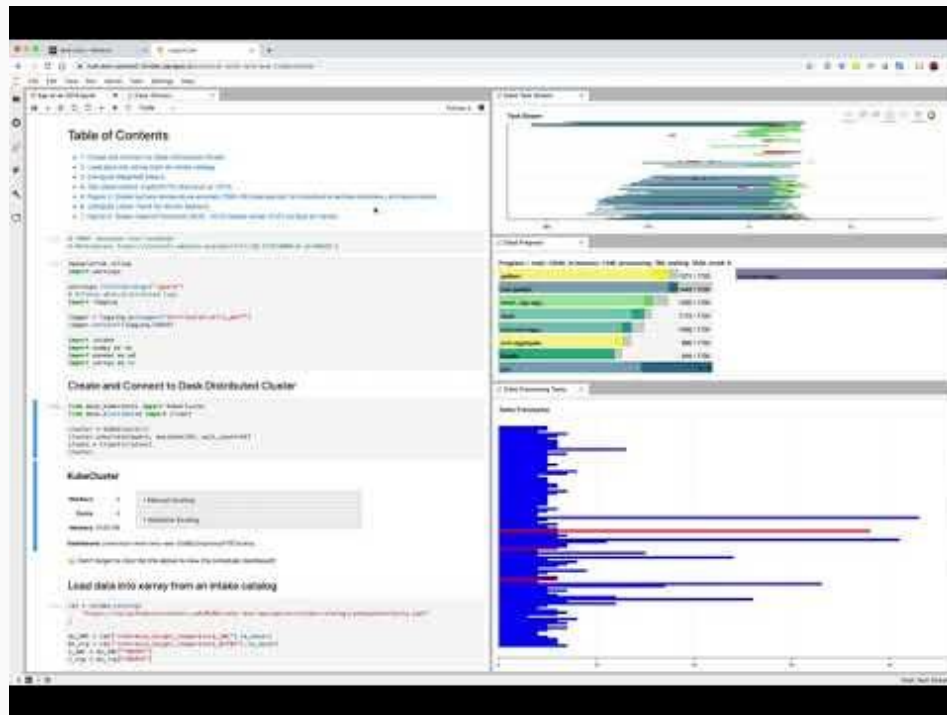
# HIGHLIGHT 2: ACTIVE DEPLOYMENTS ON HPC AND CLOUD PLATFORMS

## HPC

- JupyterHub on Cheyenne Supercomputer  
(<https://jupyterhub.ucar.edu/>)

## Cloud

- JupyterHub deployments on all major cloud providers
  - e.g. [hub.pangeo.io](https://hub.pangeo.io), [binder.pangeo.io](https://binder.pangeo.io)
- New libraries for distributed computing using Dask with Kubernetes
- Integration of Jupyter and Dask software tools (e.g. `dask-labextension`)





# HIGHLIGHT 3: NEW CLOUD OPTIMIZED STORAGE FORMAT FOR NETCDF DATA

We needed a “cloud optimized NetCDF format”.

- Zarr provides chunked compressed, N-dimensional arrays amenable to cloud object storage
- We added support for Zarr in Xarray, effectively creating the first version of cloud-ready NetCDF

```
import xarray as xr

ds = xr.open_dataset('data.nc') # NetCDF
# ...
ds.to_zarr('data.zarr') # Write Zarr
ds_zarr = ds.open_zarr('data.zarr') # Read Zarr
```

- Unidata has adopted this approach. Beta version of NetCDF support for Zarr is imminent
- For more info, Go see Ward Fisher’s poster on Wednesday ([IN31B-0800](#)):

Developers@**Unidata**  
Data Services and Tools for Geoscience

« NCZarr Overview | Main | MetPy Mondays #87 ... »

## NetCDF ZARR Data Model Specification

02 July 2019

### Table of Contents

1. Introduction
2. Notation
3. Data Model
  1. Dataset
  2. Group
  3. Attribute
  4. Dimension
  5. Variable
  6. Dimension Reference
  7. Types
4. Excluded Elements
5. Appendix A. Supporting Lexical Tokens
  1. Fully Qualified Names
6. Appendix B. Supplementary Material
  1. Specifying Context-Sensitive Elements
7. Appendix C. Complete Version of the Abstract Representation Specificati...

### Introduction

This document describes the to-be-implemented NCZarr data model by referen netcdf enhanced) data model. Elements of the enhanced model included in this Elements of the enhanced model not included are listed in a later section.

**Zarr Group: *group\_name***

<code>.zgroup</code>	<code>.zattrs</code>
----------------------	----------------------

**Zarr Array: *array\_name***

<code>.zarray</code>	<code>.zattrs</code>
0.0	0.1
1.0	1.1
2.0	2.1

# HIGHLIGHT 4: RAPID GROWTH OF THE PANGEO COMMUNITY

## Community participation

- Individuals across academia and industry
- New science domains like astronomy and biology

## Working Groups

- Data
- Cloud DevOps
- Machine Learning
- Education and Outreach

## Ways to get involved

- Weekly community telecon  
(<https://pangeo.io/meeting-notes.html>)
- Workshops and conferences  
(<https://pangeo.io/meetings/index.html>)
- Online Discourse forum  
(<https://discourse.pangeo.io/>)



Left: 2019  
Community  
Meeting &  
Hackathon  
(Seattle)



Right: 2018  
Developers  
Meeting  
(Boulder)

<https://medium.com/pangeo/pangeo2019-17f1a2a016e0>

# Jupyter MEETS THE EARTH

*ENABLING DISCOVERY IN GEOSCIENCE THROUGH INTERACTIVE COMPUTING AT SCALE*



## RESEARCH USE CASES

- CMIP6 Climate data analysis
- Large scale hydrological modelling
- Geophysical simulations and inversions



## TECH DEVELOPMENT

- Data discovery through JupyterLab
- Interactivity: Widgets & Dashboards
- JupyterHub: Using and managing shared computational infrastructure



Fernando  
Perez



Joe  
Hamman



Laurel  
Larsen



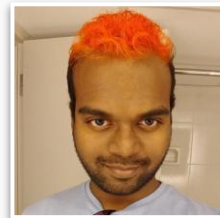
Kevin  
Paul



Lindsey  
Heagy



Chris  
Holdgraf



Yuvi  
Panda

# Suzanne A Pierce - IS Geo



# What is the IS-GEO RCN?



Integrating AI with Earth Sciences to drive discoveries



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TRANSFORMING GEOSCIENCES RESEARCH

@isgeo.community | spierce@tacc.utexas.edu | www.is-geo.org

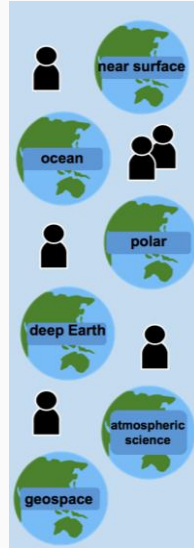
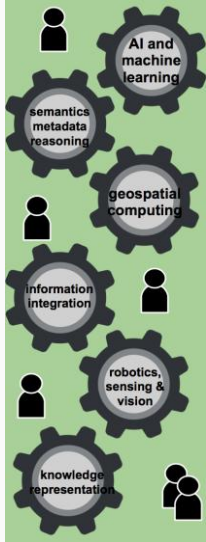
*(Kaplan, 2016)*



# What is the IS-GEO RCN?



Integrating AI with Earth Sciences to drive discoveries



**EARTH CUBE**  
TRANSFORMING GEOSCIENCES RESEARCH

@isgeo.community | spierce@tacc.utexas.edu | www.is-geo.org

*(Kaplan, 2016)*



# What is Artificial Intelligence?



It's much more than Machine Learning



**EARTH CUBE**  
TRANSFORMING GEOSCIENCES RESEARCH



# What is Artificial Intelligence? Because this is the American **Geophysical** Union...

*“The essence of AI*

*– indeed the essence of Intelligence –*

*Is the ability to make appropriate  
generalizations in a timely fashion based on  
limited data.”*

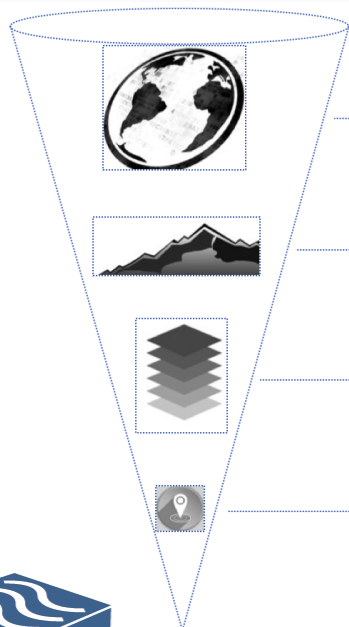


**EARTH CUBE**  
TRANSFORMING GEOSCIENCES RESEARCH





# Beyond ML, meaningful AI in GEO includes...



## Interactive Workspaces

- Synthesis studies
- Wholistic approaches
- High-level research questions

## Theory-Driven Learning

- Large but minuscule datasets
- Extreme events
- Multiple scales

## Information Ecosystems

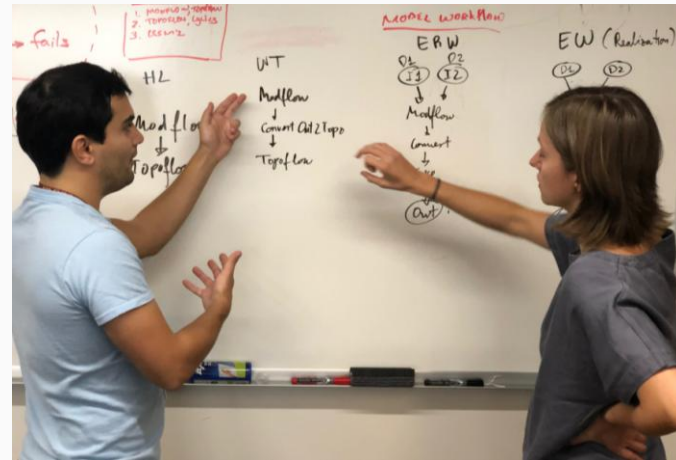
- Many locations & data types
- Georeferenced & curated data
- Discover interlinked events

## Model-Driven Sensing

- Selective data collection
- Inaccessible locations
- Optimize experimental design



**EARTH CUBE**  
TRANSFORMING GEOSCIENCES RESEARCH



- ❖ **Integrated Intelligence,**
- ❖ **Meaningful Interaction,**
- ❖ **Self-Aware Learning**



# What enables IS-GEO?

## Hands-On Workshops



## SME Lectures



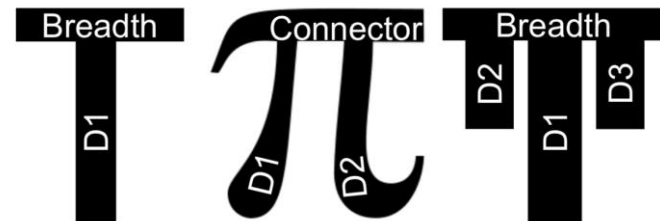
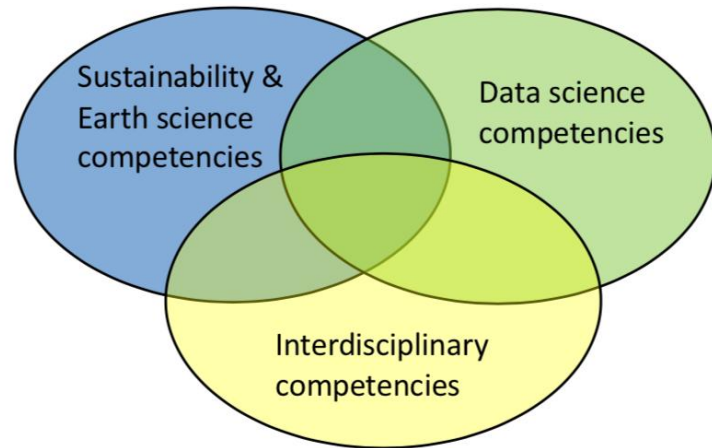
## Digital Tools





# To advance IS-GEO the community needs:

- Access to Data needed - Open Repositories
- SME knowledge for deep reasoning
- Digital Sandboxes to test solutions
- AI and GEO research platforms



T-shaped  
1 person

$\pi$ -shaped  
2+ people

shield-shaped  
1 person

Well-posed science questions



**EARTH CUBE**  
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Integrating from the Edge

## IS-GEO offers hands-on collaborations



*Team: Hack Fast – Fake News, Boulder, CO*



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TRANSFORMING GEOSCIENCES RESEARCH

**We are a community exploring & implementing end-to-end applications!**



## What enables IS-GEO?



*'All the instances of scientific development and practice . . . are as much embedded in politics and cultures as they are creations of the researchers, practitioners, and industries.'*



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(Paraphrased from Heymann, 2010)



# What enables IS-GEO?



The emerging community of researchers in intelligent systems (IS) and Geosciences (GEO).

(just a few of the cats and dogs 😊 engaging in IS-GEO discussions)



# Intelligent Systems and Geosciences Research Coordination Network

National Science Foundation [award number 1632211](#)

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Thank you!

# Alexander G Kosovichev - Heliophysics



# EarthCube Data Infrastructure: Intelligent Databases and Analysis Tools for Geospace Data

Alexander Kosovichev

Gelu Nita, Vincent Oria, Viacheslav Sadykov

*Center for Computational Heliophysics*

*New Jersey Institute of Technology*

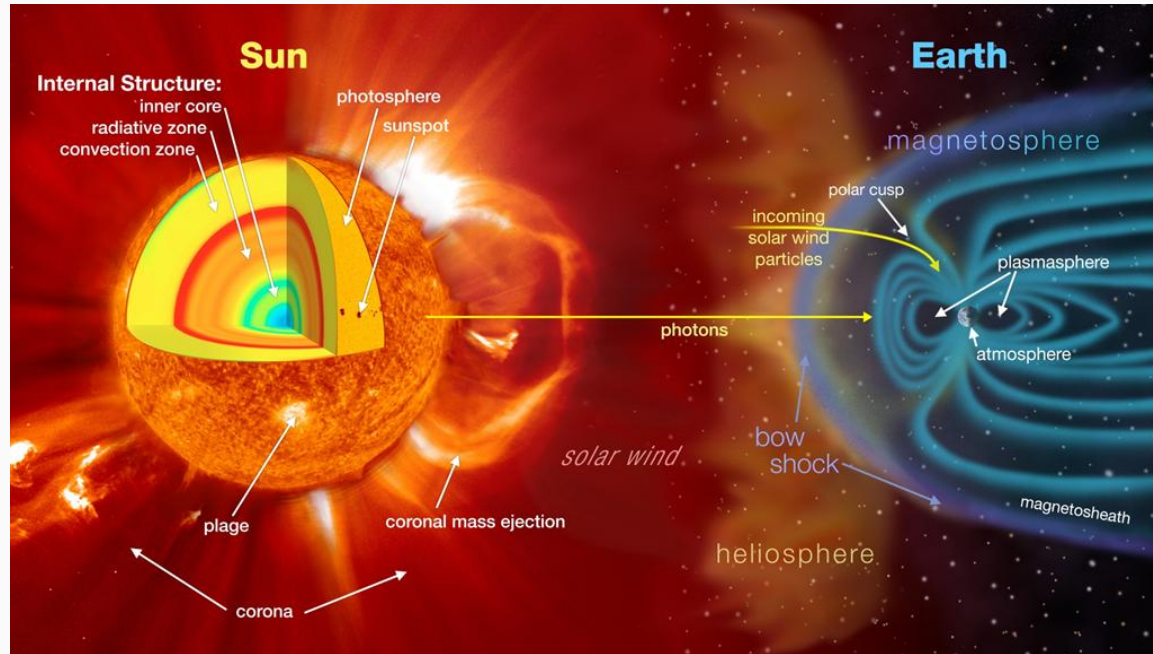
<https://www.earthcube.org/group/intelligent-databases-analysis-tools-geospace-data>

# The project goals:

- 1) **improve access of geoscientists to the geospace data** and modeling products that are mostly relevant to studying the impacts of solar activity on Earth systems and to developing predictive capabilities
- 2) **develop approaches, provisional tools, and working examples of database of extreme solar events** by integrating observational data from several spacecraft and ground-based
- 3) **establish close collaboration and partnership** between solar physicists and computer scientists in the framework of the New Jersey Institute of Technology (NJIT) Center for Computational Heliophysics (CCH), the NASA Earth Exchange (NEX), and the Heliophysics Modeling and Simulations group at the NASA Ames Research Center; use the open NJIT and NASA facilities for on-line access and sustainability of the developed databases and tools
- 3) **promote collaboration between geophysics and geospace scientists**
- 4) **involve students and young scientists** in EarthCube Geospace activities.

# Motivation

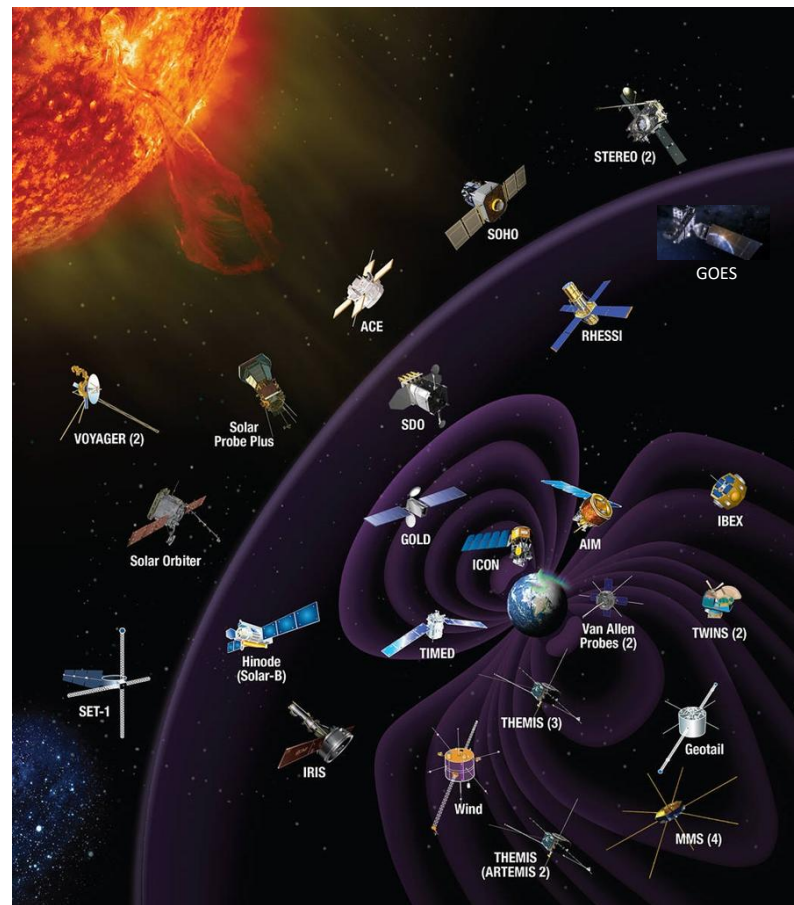
**Solar activity** plays especially important role in the Solar-Terrestrial interactions: it a primary source of global changes of the Earth atmosphere, powerful geomagnetic storms, high-energy radiation and particles that affect the Earth's space environment, technological and biological systems.



# Focus on Understanding Multi-Wavelength Nature of Solar Flares and Eruptions

The solar flares and accompanying events (CMEs and SEPs) greatly impact the Space Weather and terrestrial environment:

- Destroy satellites equipment and disrupt power grids
- Affect radio communications and GPS navigation
- Provide potential danger for space exploration (especially in the perspective of NASA's Moon-by-2024 program)
- Nowadays the solar flares are observed in **multiple wavelengths** by many ground-based and space-based facilities.
- For understanding of the flares it is necessary to perform a **combined multi-wavelength analysis** and classify **large amounts of scientific data**.



Heliospheric Systems Observatory. Credits:

# Research outcome:

- **Developed and implemented the Interactive Multi-Instrument Database of Solar Flares, which integrates data from 15 repositories (including NASA space missions and ground-based observatories)**
  - Integration of flare lists, flare-related event catalogs and observing logs
  - Identification of the uniquely-matched flare events based on time and position information
  - Search for the flare events based on their physical descriptors (automatically calculated)
  - Automatic identification of similar events
  - Automatically updated on the daily basis
- **The Database initiated statistical and machine learning studies that led to discoveries in Space Weather and possibilities for enhancement of Space Weather Operational Forecast**

# Interactive Multi-Instrument Database of Solar Flares

(IMIDSF, <https://heliportal.nas.nasa.gov/>, <https://solarflare.njit.edu/>)

The screenshot displays the IMIDSF website interface. At the top left is the NASA logo. The main title is "Interactive Multi-Instrument Database of Solar Flares" with a sub-link "(Click here to explore further.)". On the top right, there are links for "NAS", "NASA Ames", and "Questions / Feedback". A navigation bar contains "About", "Query Page", "Data Sources", "Data Products", "Contacts", and "Help". The main content area is split into two panels. The left panel, titled "Interactive Solar Flare Database", contains a descriptive paragraph and navigation arrows. The right panel shows a solar image with a legend for "GOES Flares" (red), "RHESSI Flares" (green), and "HEK Flares" (blue). The image is labeled "SDO AIA 1600.0 Angstrom 2011-09-06 01:49:53" and has axes for "X-position [arcsec]" ranging from -900.0 to 900.0. A status bar at the bottom shows five circles, with the third one filled.

**Interactive Solar Flare Database**

The Interactive Multi-Instrument Database of Solar Flares integrates records from various flare lists and catalogs, and allows the user to select the flare events based on their physical characteristics, ...

Legend:  
● GOES Flares ● RHESSI Flares ● HEK Flares

SDO AIA 1600.0 Angstrom 2011-09-06 01:49:53

X-position [arcsec]

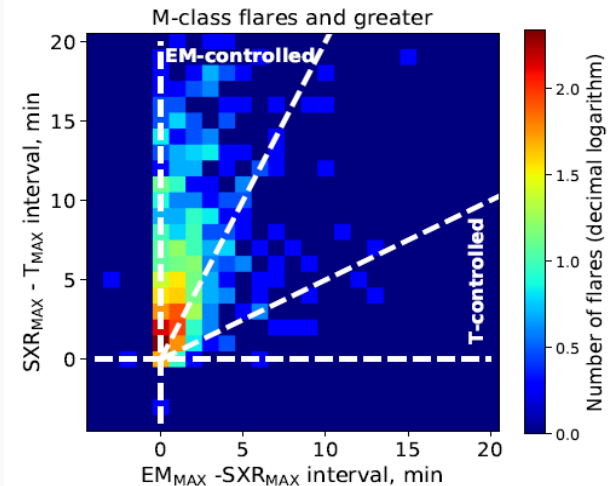
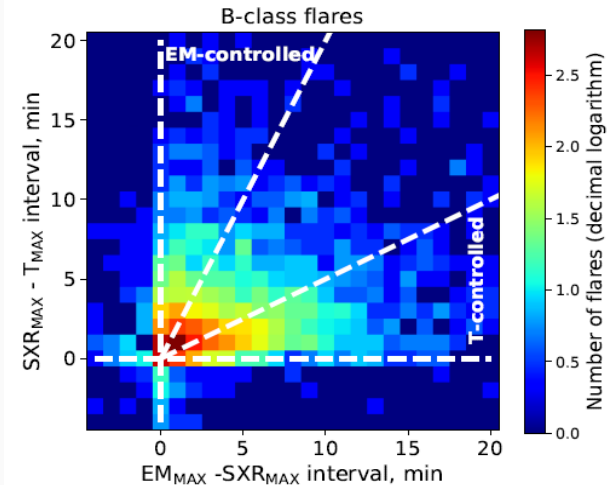
# Discoveries in Space Weather via Statistical Studies

## Statistical Study of Chromospheric Evaporation in Solar Flares. Comparison with Models.

- To connect energy fluxes deposited in solar flares and the properties of the responding solar plasma and compare results with the RHD chromospheric evaporation simulations, **the dataset of flares simultaneously observed by IRIS (here in the fast-scanning regime) and RHESSI is required.** Such dataset was obtained using Heliportal.

## Discovery of two types of flares from GOES Observations.

- The results of the application of TEBBS algorithm (T and EM calculations) for GOES flares detected from 2002 until today **are available as a data product at Heliportal.** The detailed look at timescales between T, SXR, and EM peaks resulted in finding “T-controlled” and “EM-controlled” flares, and determining physical differences between them.



SOLID	GOES class	RHESSI energy range, keV	IRIS mode
SOL2014-02-13T01:32:00	M1.8	6-12	Coarse raster, 8 slits
SOL2014-02-13T02:41:00	M1.0	3-6	Coarse raster, 8 slits
SOL2014-03-29T17:35:00	X1.0	100-300	Coarse raster, 8 slits
SOL2014-06-12T18:03:00	M1.3	25-50	Coarse raster, 8 slits
SOL2014-06-13T00:30:00	C8.5	12-25	Coarse raster, 8 slits
SOL2015-03-11T11:21:00	C5.8	12-25	Coarse raster, 8 slits
SOL2015-11-04T13:31:00	M3.7	50-100	Coarse raster, 16 slits

# Possibility to Enhance Space Weather Operational Forecasts

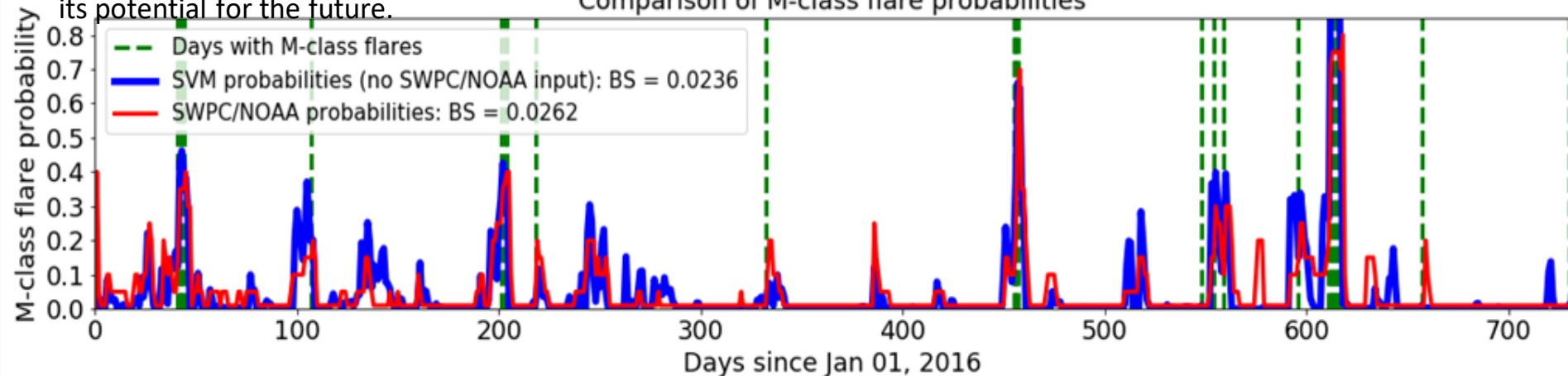
- Heliportal allows the users to request **the statistics of flares for each Active Region (AR)** in one click. Integration of the AR magnetic field descriptors (SHARP and PIL parameters) with flare events is started. It is also possible to request **not only the GOES class but other physical characteristics of solar flares**, and work on the prediction of these characteristics

$$BS = \frac{1}{n} \sum_{i=1}^n (P_i - Q_i)^2 \quad BSS = 1 - \frac{BS}{BS_{clim}}$$

- An attempt to build a probabilistic forecast of M-class flares and close comparison with SWPC/NOAA probabilities reveals higher Brier Skill Scores (BSS) for ML-based forecasts with respect to expert-based ones and demonstrates its potential for the future.

BSS, M flares	ES threshold	SVM RBF	SVM Sigmoid
Expert scores (ES)	<b>0.14±0.04</b>	-	-
ALL + ES	-	0.30±0.03	<b>0.32±0.03</b>
ALL - ES	-	0.30±0.03	<b>0.32±0.03</b>

Comparison of M-class flare probabilities





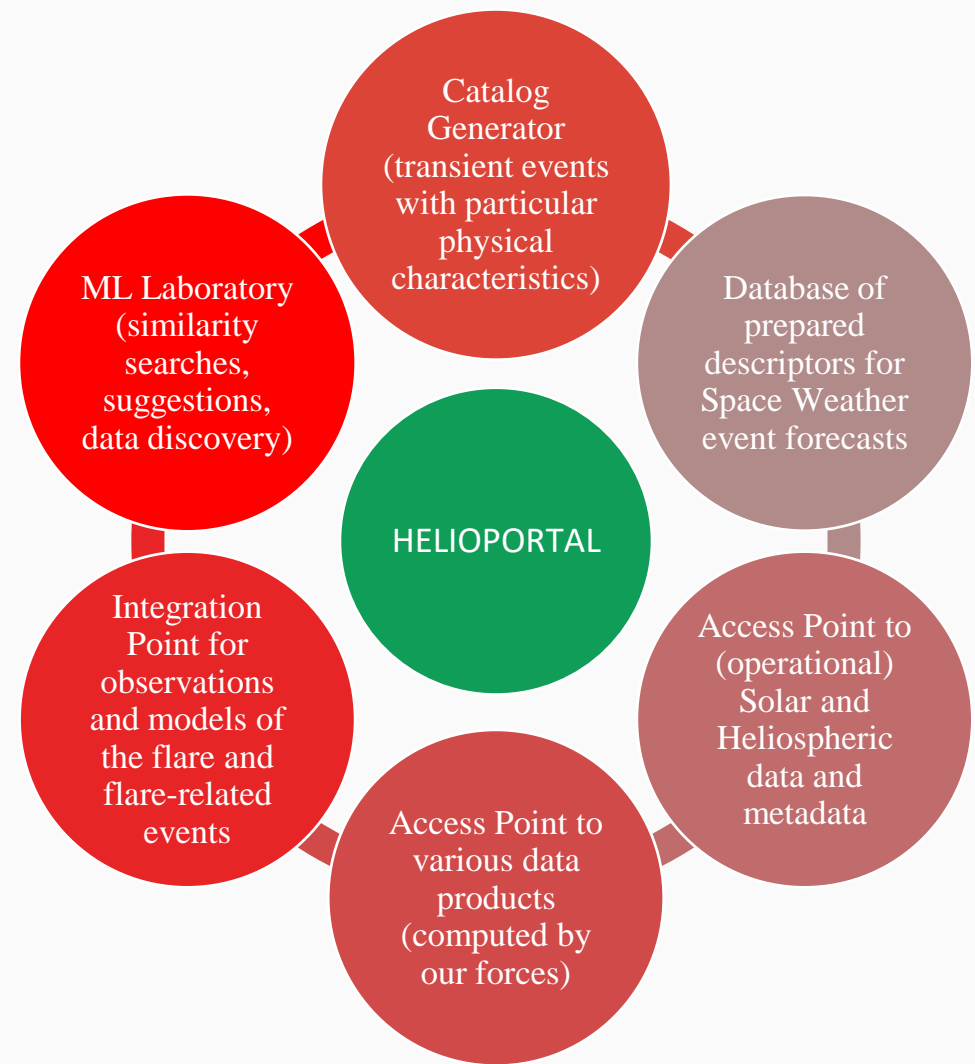
# Broader Impacts: outcome

- **Contributed to two PhD dissertations:**
  - Viacheslav Sadykov (Applied Physics)
  - Sheetal Rajgure (Computer Science)
- **Stimulated new EarthCube projects:**
  - EarthCube RCN: Towards Integration of Heliophysics Data, Modeling, and Analysis Tools (PI G. Nita) – funded 2018
  - EarthCube Data Capabilities: Development and Application of Advanced Machine Learning Tools and Database to Understand the Onset of Solar Eruptions and Advance the Prediction of Space Weather (PI H. Wang) – funded 2019
- **Contributed to NSF Roadmap:**
  - Roadmap for Reliable Ensemble Forecasting of the Sun-Earth System
- **Contributed to new data analysis and visualization tool:**
  - GX Simulator of Active Regions – fully automatic pipeline for 3D data reconstruction and analysis
- **Planned integration with:**
  - NASA-NSF Coordinated Community Modeling Center
  - Lockheed-Martin Heliophysics Event Knowledgebase
- **Contribution to Research and Educational Infrastructure:**
  - NJIT Institute for Space Weather Sciences
- **Technology transfer: platform for new NASA projects:**
  - Interactive Databases of Atmospheric Radiation Dose Rate –funded 2019
  - Employing Machine Learning Methods to Forecast Energetic Proton Events (NASA O2R program in

# Future Plans

Our near-term priorities:

- Processing, integration and visualization of the Solar Energetic Particle (SEP) event data and metadata. Labeling and preparation of these data for the machine learning stage according to current operational forecast needs and requirements
- Reconstruction of 3D structure of solar magnetic fields and subsurface flows, and integration of the descriptors of the magnetic and flow fields in Active Regions (PIL, SHARP, NLFFF, other) into the Heliportal, to enhance physics-guided machine-learning capabilities.



**Samira Daneshgar Asl - ICEBERG**

# ICEBERG

Imagery Cyber-infrastructure and Extensible Building blocks to  
Enhance Research in the Geosciences



Stony Brook University

RUTGERS

THE STATE UNIVERSITY  
OF NEW JERSEY



University of Colorado  
Boulder

UCSB

UNIVERSITY OF CALIFORNIA  
SANTA BARBARA

NORTHERN  
ARIZONA  
UNIVERSITY



<https://iceberg-project.github.io/>

# Science ~~Challenge~~<sup>^</sup> Opportunity

Petabytes of high-resolution satellite imagery

+ New analytical tools (e.g., machine learning)

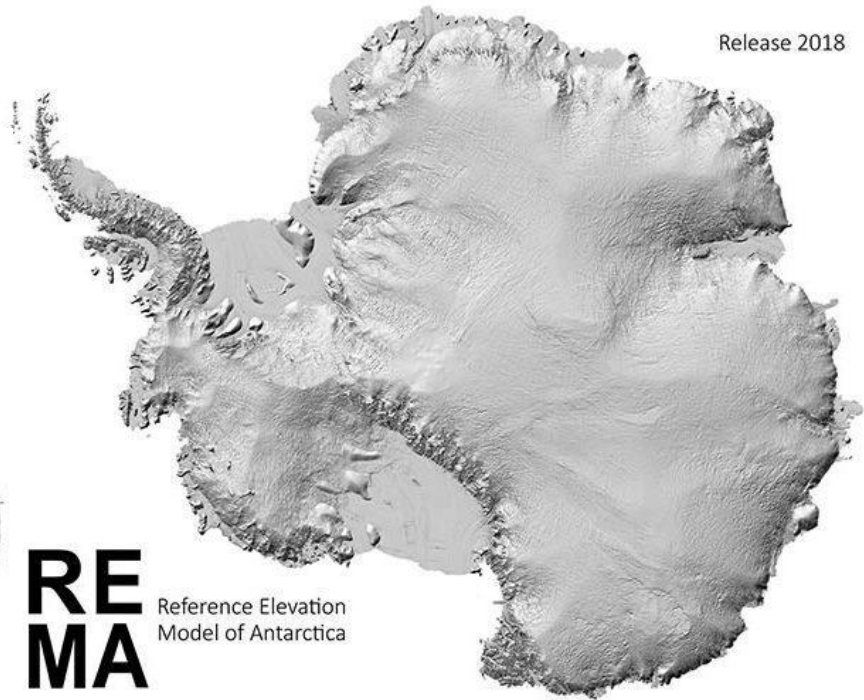
+ High performance and distributed computing resources

= Revolution in imagery-enabled science



- Rapid rise in the use of sub-meter spatial resolution imagery for polar science
- Many pilot demonstrations but few “at scale”
- What’s the barrier to scaling up early successes in imagery-enabled science? Barriers to the flow of data, limited experience with HPDC systems, reliant on commercial software that is difficult to parallelize due to licensing issue

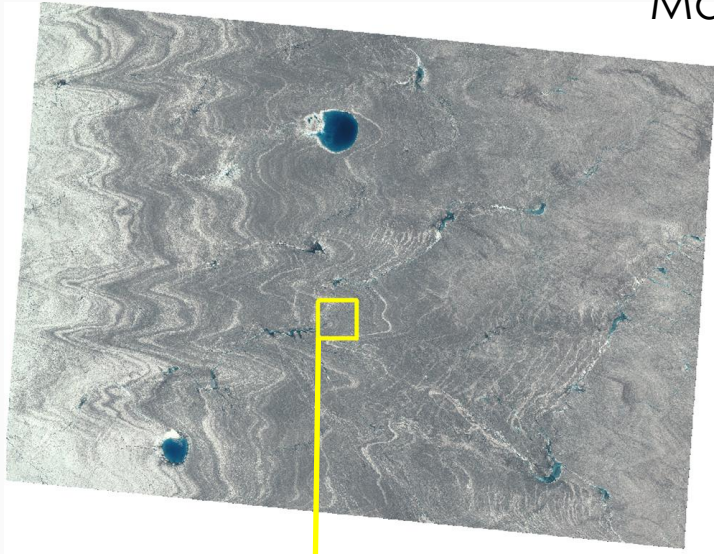
The research objective of this project is to understand the biological, geological, and hydrological functioning of the polar regions **at spatial scales heretofore beyond the reach of individual PIs**, and to **develop tools for imagery-enabled science that can be applied globally**.



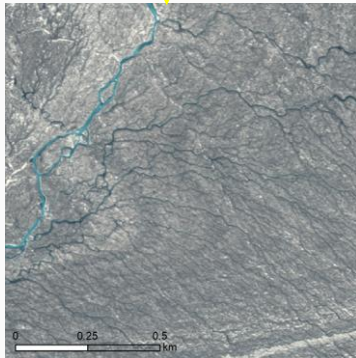
Creating large-scale products, such as the new elevation maps for the Arctic and Antarctic, require new computing tools that are tailor made for efficient deployment on high-performance computers.

Images and figures courtesy of the Polar Geospatial Center

Manual hand annotation of imagery doesn't scale



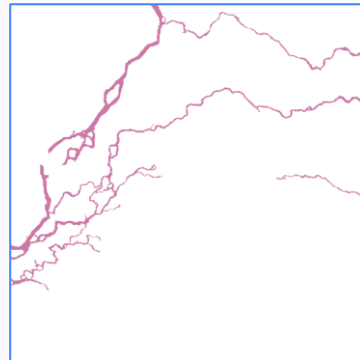
Input Image



Imagery © 2019 DigitalGlobe, Inc.

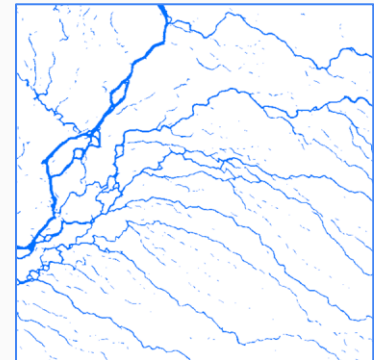
AI & 'deep learning' present new opportunities for imagery interpretation

Ground Truth



Current available data (Smith et al., 2015)

Prediction



# ICEBERG Development Status

- ICEBERG is distributed as a set of Open Source packages:
  - Available through Github (<https://github.com/iceberg-project/>)
  - Released as packages via PyPI for Python, either combined with middleware or standalone.
- Current State of development:
  - Two of four original use cases are fully supported, released, and executed on XSEDE/Bridges (penguins, seals)
  - Rivers detection executes on XSEDE/Bridges. We are refining the training model
  - Continuing code development for other use cases (including applications outside of polar regions)



# Basil Tikoff - StraboSpot

# THE STRABOSPOT DIGITAL SYSTEM FOR GEOLOGICAL FIELD-BASED (STRUCTURAL GEOLOGY, SEDIMENTOLOGY, PETROLOGY), MICROANALYSIS, AND EXPERIMENTAL DEFORMATION DATA

Original PIs: **Basil Tikoff** (UWisc), **Julie Newman** (TAMU), **Doug Walker** (KU)

Programmers: Jason Ash, Jessica Novak, Nathan Novak (KU)

Postdocs & grad students: H. Cunningham & A. Snell (TAMU); R. Williams, Z. Michels, M. Kahn, N. Roberts (UWisc); E. Bunse & C. Rufledt (KU); C. Duncan (Utah)

Sedimentology PIs: M. Chan (Utah), E. Hajek (Penn State), D. Kamola (KU)

Petrology PIs: A. Glazner (UNC), B. Schoene (Princeton), F. Spear (RPI)

Experimental PIs: A. Kronenberg (TAMU), M. Pec (MIT), U. Mok (MIT), P. Skemer (Washington), C. Marone (Penn State)



Check it out at [strabospot.org](http://strabospot.org).



# StraboSpot data system is: -A geologic *and* geographic information system

Reviewer #1: “At last we have a geologic data system, not a geographic information system, with an application that might actually be a huge aid in solving problems.”

**Research Paper**

## GEOSPHERE


GEOSPHERE, v. 15  
<https://doi.org/10.1130/GES02039.1>  
7 figures, 1 supplemental file


CORRESPONDENCE: [jwalker@ku.edu](mailto:jwalker@ku.edu)

CITATION: Walker, J.D., Tikoff, B., Newman, J., Clark, R., Ash, J., Good, J., Burns, E.E., Miller, A., Katz, M., Williams, R.T., Michels, Z., Andrew, J.E., and Ruffled, C., 2019, StraboSpot data system for structural geology *Geosphere*, v. 15, <https://doi.org/10.1130/GES02039.1>

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Associate Editor: Lisa M. Harlan

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OPEN ACCESS



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## StraboSpot data system for structural geology

J. Douglas Walker<sup>1</sup>, Basil Tikoff<sup>2</sup>, Julia Newman<sup>3</sup>, Ryan Clark<sup>4</sup>, Jason Ash<sup>1</sup>, Jessica Good<sup>1</sup>, Emily G. Bunse<sup>1</sup>, Andreas Möller<sup>1</sup>, Maureen Kahn<sup>1</sup>, Randolph T. Williams<sup>1</sup>, Zachary Michels<sup>2</sup>, Joseph E. Andrew<sup>1</sup>, and Carson Ruffled<sup>1</sup>

<sup>1</sup>Department of Geology, University of Kansas, Lawrence, Kansas 66045, USA  
<sup>2</sup>Department of Geoscience, University of Wisconsin-Madison, Madison, Wisconsin 53706, USA  
<sup>3</sup>Department of Geology and Geophysics, Texas A&M University, College Station, Texas 77843, USA  
<sup>4</sup>MapInfo, Washington, D.C., USA

### ABSTRACT

StraboSpot is a geologic data system that allows researchers to digitally collect, store, and share both field and laboratory data. StraboSpot is based on how geologists actually work to collect field data; although initially developed for the structural geology research community, the approach is easily extensible to other disciplines. The data system uses two main concepts to organize data: spots and tags. A spot is any observation that characterizes a specific area, a concept applicable at any spatial scale from regional to microscopic. Spots are related in a purely spatial manner, and consequently, one spot can enclose multiple other spots that themselves contain other spots. In contrast, tags provide conceptual grouping of spots, allowing linkages between spots that are independent of their spatial position.

The StraboSpot data system uses a graph database, rather than a relational database approach, to increase flexibility and to track geologically complex relationships. StraboSpot operates on two different platform types: (1) a field-based application that runs on iOS and Android mobile devices, which can function in either internet-connected or disconnected environments; and (2) a web application that runs only in internet-connected settings. We are presently engaged in incorporating microstructural data into StraboSpot, as well as expanding to include additional field-based (sedimentology, petrology) and lab-based (experimental rock deformation) data. The StraboSpot database will be linked to other existing and future databases in order to provide integration with other digital efforts in the geological sciences and allow researchers to do types of science that were not possible without easy access to digital data.

### INTRODUCTION

Structural geology stands at a crossroads. For more than a century, practitioners in the field have collected data with pencil, paper, and analog tools. The discovery of original data was almost impossible, and without firsthand knowledge of the geologist who collected the data, it was difficult to divine the intent and competence of that person from published work. This approach

will not work in the future. Structural geology data must be collected in or converted to a digital format to become widely available and profitably used in the future. One approach is to simply render digitally our field notebooks and streamline our data collection, meeting data archiving requirements solely by posting spreadsheets to servers of uncertain lifetime. Instead, we have opted to use the critical analog-to-digital transition as an opportunity to reimagine how data collection and archiving could work with modern computational tools that have become available in the last few decades. We present here a new paradigm—StraboSpot—for field data collection that is designed for structural geologists but is easily extensible to other disciplines.

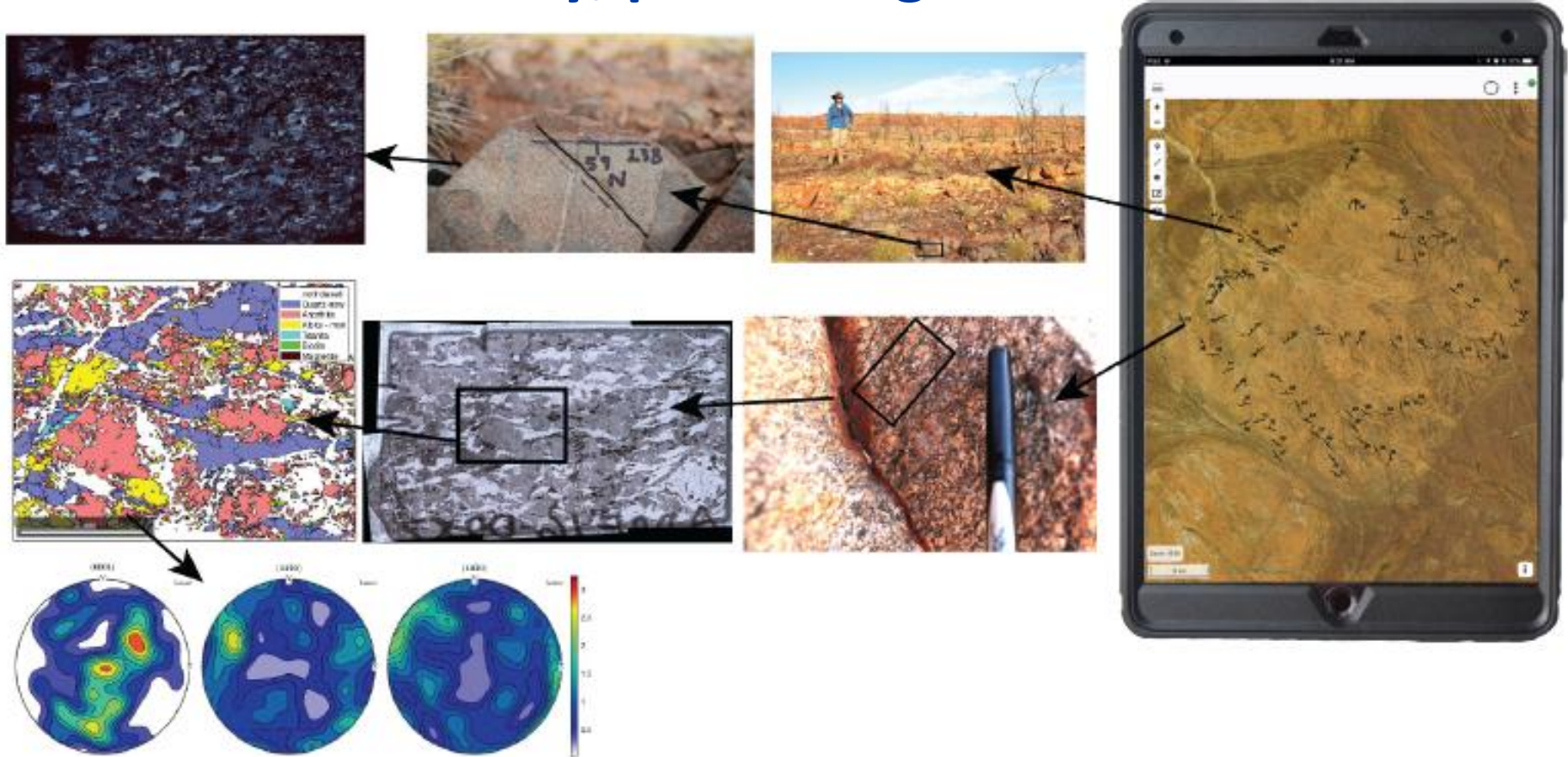
StraboSpot is an attempt to reconceptualize field data collection, allowing the structural geology community to digitally collect, store, and share both field and laboratory data (<https://strabospot.org>). The current work was motivated by the recognition that field scientists had not yet joined the EarthCube<sup>1</sup> (<https://earthcube.org>) effort to transform science through the development of infrastructure enabling sharing of data, because the field sciences lack community databases and have minimal reporting standards. This situation was confirmed by the U.S. structural geology and tectonics community (<http://earthcube.org/document/2012/structural-geology-tectonics-end-user-workshop-report/>). The primary reason is the inherent nature of field data; they are heterogeneous, sparse, and—importantly—not instrumentally collected, making them notoriously difficult to digitize (e.g., Laxton and Becken, 1996; Walker et al., 1996).

The StraboSpot digital data system is an attempt to build a geologic data system, not a geographic information system (GIS), to address the difficulties of digitizing field-based data. This paradigm of a geologic data system is based on how geologists actually work, rather than trying to shoehorn their workflows into poorly fitting computational templates. As such, it requires the introduction of a few key concepts. The spot concept is foundational to the StraboSpot data system, as it captures the scale-dependent and hierarchical data collected by geologists. A spot is an observation with a location and area of significance. Spots are inherently spatial, so we group them into nests that accommodate the hierarchical nature of geologic observations while giving them real-world coordinates. Conceptually related spots may be linked through tags, a flexible and powerful way to apply geologic attributes to any observation (spot,

<sup>1</sup>Now at Department of Earth Sciences, University of Minnesota—Twin Cities, Minneapolis, Minnesota 55455, USA  
<sup>2</sup>EarthCube is a National Science Foundation program to engage computer and Earth scientists in building a cyberinfrastructure for the sciences.

Walker et al. | StraboSpot

# The goal: To track geological information from the field to laboratory, preserving orientation and scale



# StraboSpot data system is: -A geologic and geographic information system -A community-directed data system

Reviewer #2: Your introduction stinks.  
Here, let me rewrite it for you...

“...we have opted to use (the) momentous transition to digital as an opportunity to reimagine how data collection and archiving... We present here a new paradigm for field data collection that is designed for structural geologists but is easily extensible to other disciplines. This paradigm is based on how geologists actually work, rather than trying to shoehorn their workflows into poorly fitting computational templates...”

**Research Paper**

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Science Editor: Raymond M. Russo  
Associate Editor: Jessi M. Hurtado

Received 20 July 2018  
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Accepted 20 January 2019

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**INTRODUCTION**

Structural geology stands at a crossroads. For more than a century, practitioners in the field have collected data with pencil, paper, and analog tools. The discovery of original data was almost impossible, and without firsthand knowledge of the geologist who collected the data, it was difficult to divine the intent and competence of that person from published work. This approach will not work in the future. Structural geology data must be collected in or converted to a digital format to become widely available and profitably used in the future. One approach is to simply render digitally our field notebooks and streamline our data collection, meeting data archiving requirements solely by posting spreadsheets to servers of uncertain lifetime. Instead, we have opted to use the critical analog-to-digital transition as an opportunity to reimagine how data collection and archiving could work with modern computational tools that have become available in the last few decades. We present here a new paradigm—StraboSpot—for field data collection that is designed for structural geologists but is easily extensible to other disciplines.

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**THE GEOLOGICAL SOCIETY OF AMERICA**

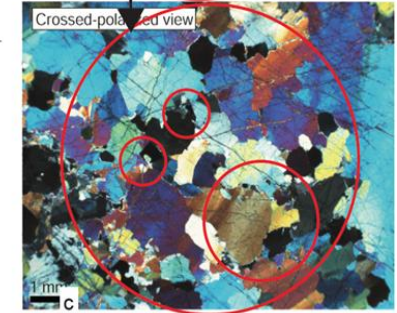
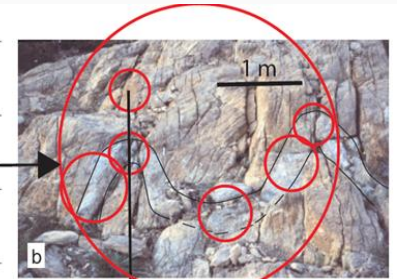
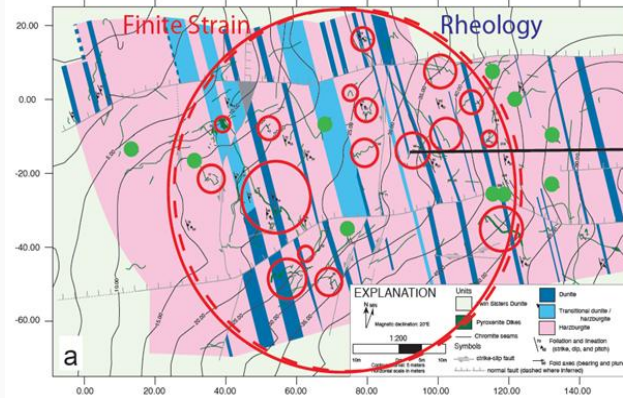
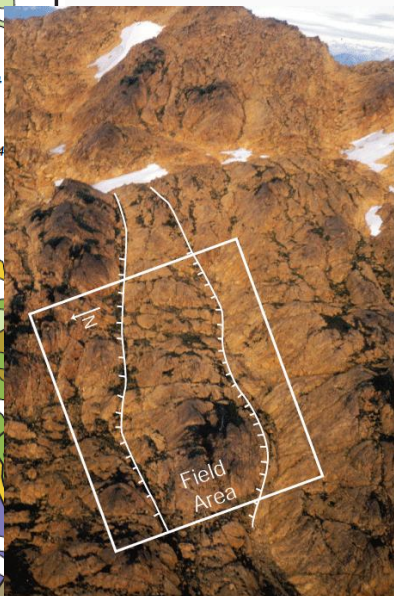
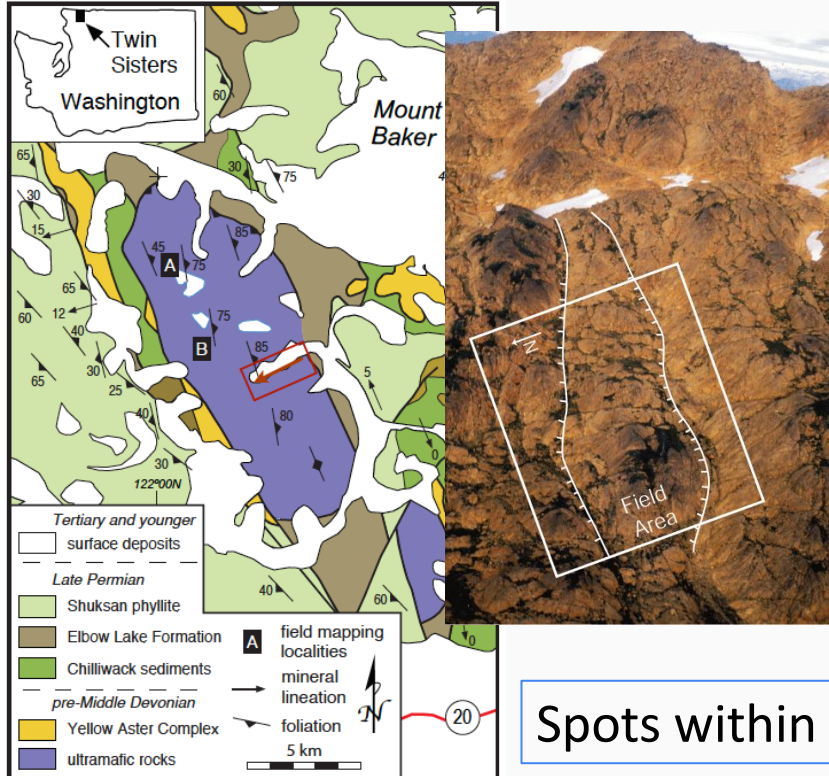
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!EarthCube is a National Science Foundation program to engage computer and Earth scientists in building a cyberinfrastructure for the science.

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# The approach: Use “spots” as an organizational principle to allow both spatial and conceptual grouping

A spot is an area which can be characterized by a particular attribute. It is a way of organizing data collected at different spatial scales



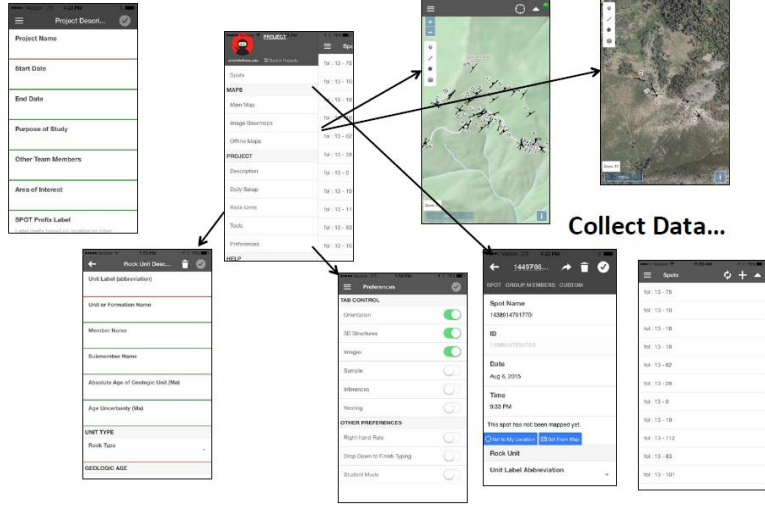
Spots within spots inherently tracked

## **StraboSpot data system is:**

- A geologic and geographic information system**
- A community-driven data system**
- Is expanding through the geological community**
  - Currently includes structural geology, sedimentology, petrology, experimental rock deformation, microanalysis**
  - Working to include geomorphology, active tectonics, tephra stratigraphy**

Setup...

# StraboSpot App



# STRABOSPOT Desktop

HOME ABOUT ACCOUNT API HELP



## Mobile App:

- iOS or Android
- Location services
- Used at fieldcamps

## Open Source Codebase and Public API

- Anyone can write external modules to leverage Strabo
- Tailor new applications to query, upload, and download data
- Design plug-ins for GIS platform

## Desktop:

- Flexible, web-based interface
- Import/Export data for your favorite analysis software
- Choose which data you want to share publicly

# Strabospot.org