

# Proto-OKN Workshop @ KGC 2024 9:00 AM ET on Tuesday May 7, 2024

Chaitan Baru & Jemin George Directorate for Technology, Innovation and Partnerships (TIP) U.S. National Science Foundation

# Workshop Agenda

## Introduction

• Chaitan Baru & Jemin George, TIP Directorate, National Science Foundation

## Presentation by Theme 1 Groups focusing on

- Environment
  - Lilit Yeghiazarian, University of Cincinnati
- o Biology & Health
  - Sergio, Baranzini, University of California, San Francisco (UCSF)
- Justice
  - Adam Pah, Georgia State University (GSU)
- Technology & Manufacturing
  - Farhad Ameri, Arizona State University (ASU)

## Presentation by Theme 2: Proto-OKN Fabric

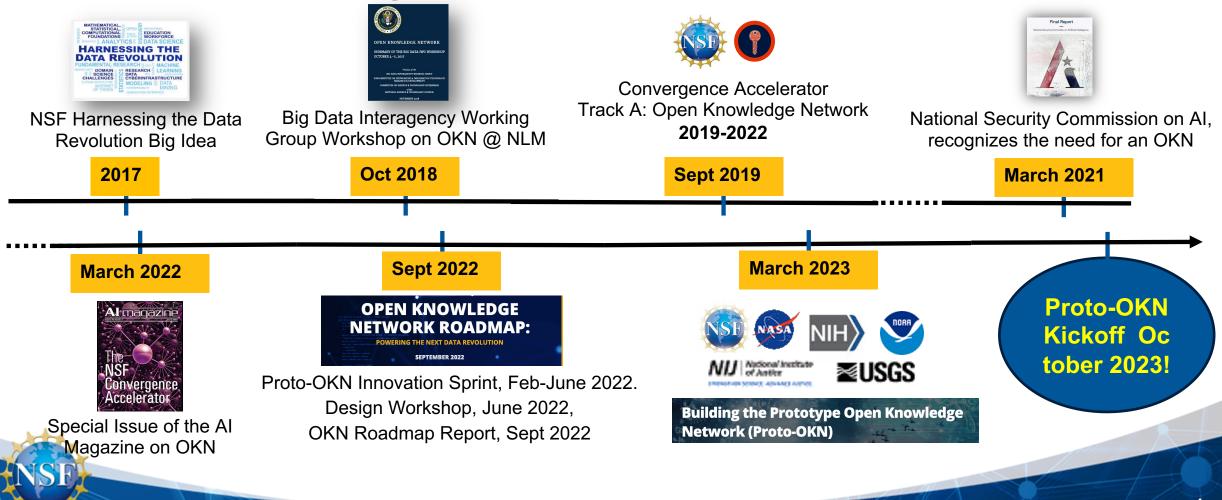
• Chris Bizon, University of North Carolina at Chapel Hill (UNC) & Patrick Grinaway, Onai

## Presentation by Theme 3: Proto-OKN Education and Public Engagement

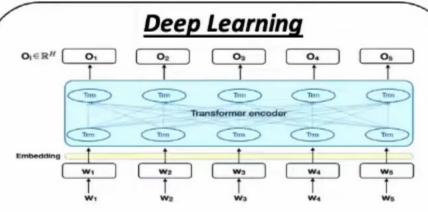
• Cogan Shimizu, Wright State University

# The OKN Vision: Where we came from

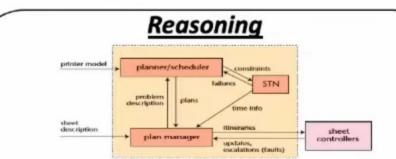
An interconnected network of knowledge graphs build on public data to address various societal challenges.



## **Three Current Revolutions in Al**



- With massive data, can do classification and other tasks in low-risk settings
- Uses: Speech recognition, facial recognition, etc.



 Finds solutions to large problems, finds flaws in engineered systems, real-time control, diagnosis, and workarounds Knowledge Graphs

Kenneth D For...

- Massive (10<sup>6</sup>-10<sup>10</sup> fact) symbolic relational representations used by Google, Microsoft, Facebook, Spotify, etc.
- Uses: Higher-precision web search, webscale question answering, better recommendations

Each revolution is: Built on 4+ decades of AI research

Fueled by massive increases in computational power and available data over the last two decades

"Comments by Prof. Ken Forbus, Northwestern University, at the National Science Board session on AI, May 1, 2024, <u>https://www.youtube.com/watch?v=LqwL3CFVG8I&t=4009s</u>"

## **Proto-OKN Program Goals**

- Build a prototype version of an integrated data and knowledge infrastructure called the Open Knowledge Network (OKN)
- Create a platform that would empower government and nongovernment users — fueling evidence-based policymaking, continued strong economic growth, and game-changing scientific breakthroughs, while addressing complex societal challenges from climate change to social equity.

# Proto-OKN Team: Multiagency Effort

• Core partner agencies



• Other stakeholder agencies



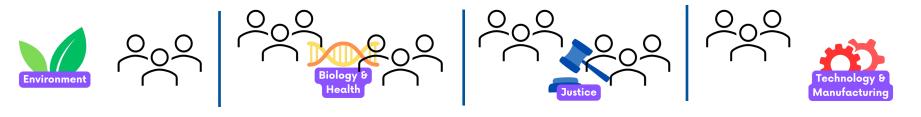
- AFRL
- DARPA
- CDO DOC
- NCATS
- NIEHS
- NIJ
- NIST
- NREL
- Joint Staff J6
- USAFRICOM
- USDA
- VA

Monthly sync-ups and coordinated outreach activities & sustainability talks

## **Proto-OKN Program Structure**

## Theme 1: Use Case Projects (15)

Focus on the creation of knowledge graphs to address **specific societal challenges** 



**Theme 2: Proto-OKN Fabric Projects (2)** 

Develop and deploy a platform to interconnect KGs and create a cloud-based infrastructure

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Theme 3: Education and Outreach Project (1)

Proto-OKN FABRIC

Develop education and outreach resources for a variety of stakeholders

## All 18 projects are required to work together as a single cohort

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## Presentation by Theme 3: Proto-OKN Education and Public Engagement

• Cogan Shimizu, Wright State University

Water-Energy Nexus OKN (WEN-OKN) Lilit Yeghiazarian, U. Cincinnati

Wildlife Management (KN-Wildlife) Xiangliang Zhang, Notre-Dame U.

Safe Agricultural Products and Water Graph (SAWGraph) Torsten Hahmann, U. Maine

Soil Carbon Data Modeling (SOCKG) Chengkai Li, U. Texas - Arlington

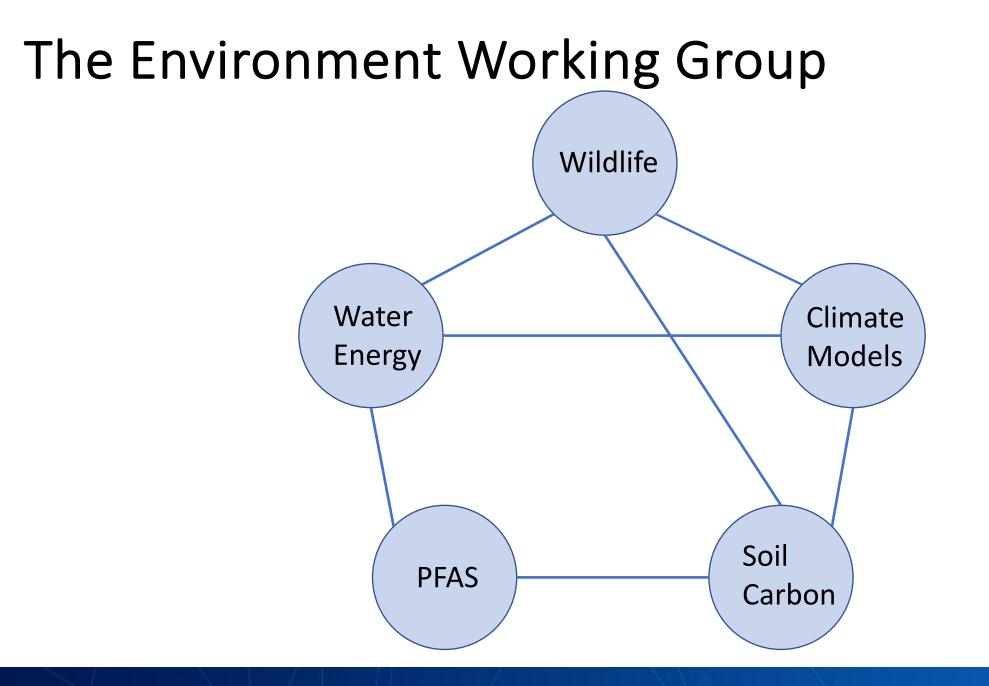
Knowledge Graph to Support Evaluation and Development of Climate Models Eduard Dragut, Temple U.





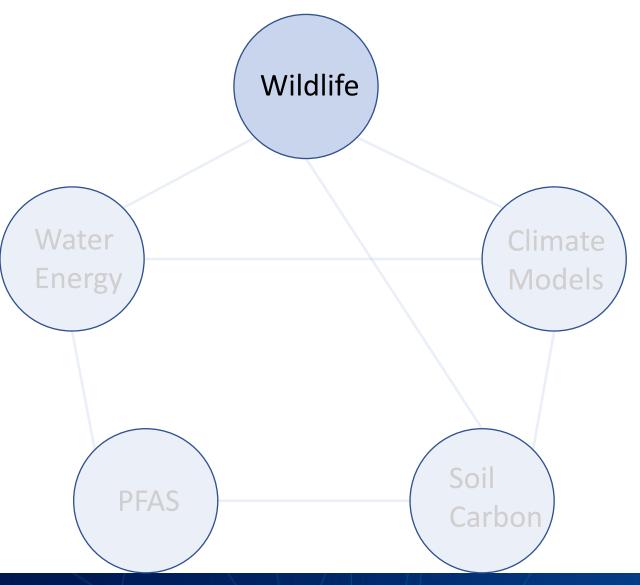
Supported by:







# Wildlife Management OKN



### • **Objective**:

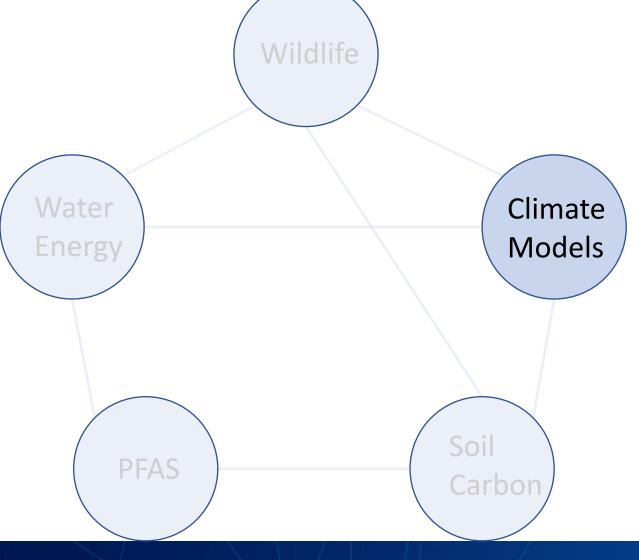
- Support wildlife management in the context of climate change
- Focus on invasive, threatened, and human-healthrelated species

### $\circ$ Queries:

- Which threatened species in Florida are impacted by rising temperatures?
- Which invasive species are relevant to the transmission of West Nile virus?
- Predict the distribution of West Nile virus
- Users: Stakeholders for wildlife management, USGS, K-12 education
- Data: GBIF, IUCN Red list, NEON, USGS.



# ClimatePub4KG: Knowledge Graph to Support Evaluation and Development of Climate Models



• **Objective:** Multimodal KG of salient aspects of climate modeling (data, mechanistic and AI climate models).

### $\circ$ Queries:

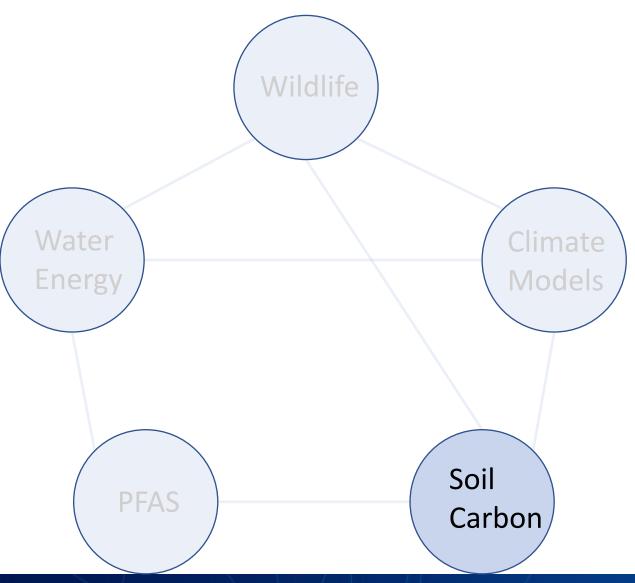
- How is volcanic ash related to hydrology?
- Which climate models are used to predict the ocean temperature on the east coast?
- Which climate models are used for long-term rainfall predictions?
- Which projects/tasks use a specific data and model?

### $\circ$ Users:

- NOAA (National Oceanic and Atmospheric Administration)
- CMIP (Coupled Model Intercomparison Project)
- Data: Climate scientific literature, GCMD (Global Change Master Directory)



# Soil Carbon Data Modeling (SOCKG)



• Objective:

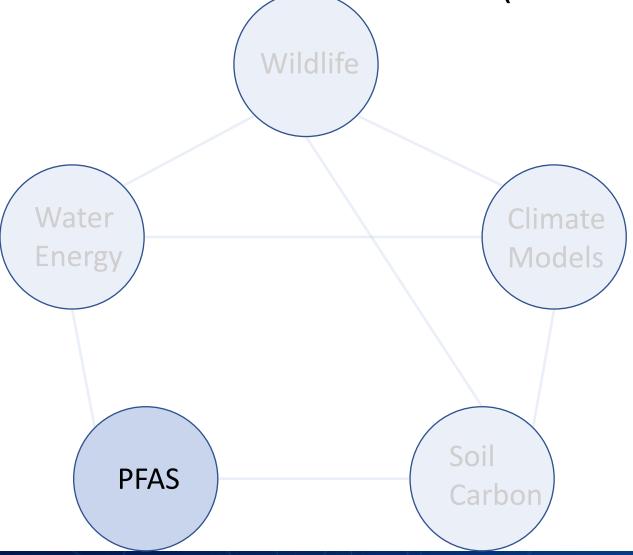
- Provide access to soil organic carbon (SOC) data
- Predict SOC change
- Attribute that change to agricultural practices

### $\circ$ Queries:

- Which management treatment results in the greatest amount of SOC storage?
- What management combinations maximize SOC storage?
- Is there a relationship between crop yield and SOC storage?
- Users: USDA scientists, policy makers, and modelers of soil carbon
- Data: Soil property measurements, rotation and management information from USDA experiments



# Safe Agricultural Products and Water Graph (SAWGraph)



 Objective: One-stop information hub to answer questions around PFAS contamination

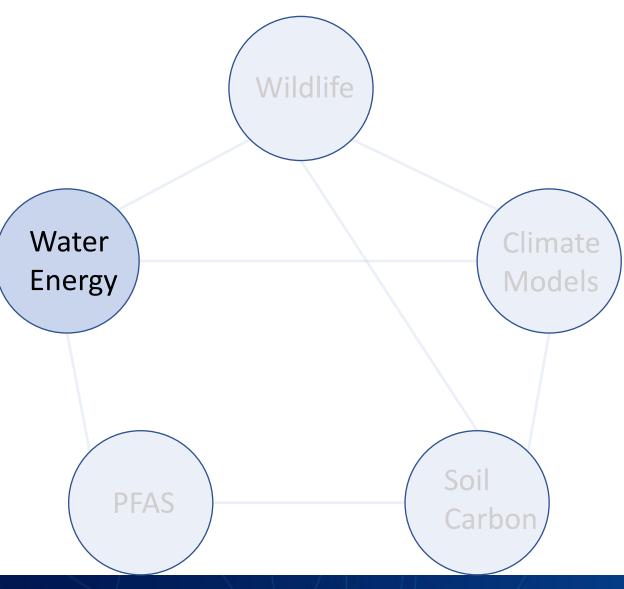
- Connect test results, contamination impacts
- Facilitate decision making around testing, regulations and remediation

### $\circ$ Queries:

- Where have we tested?
- Where are gaps in testing?
- Who is impacted the most?
- Where are known sources concentrated?
- Where may the contamination in this well originate from?
- Users: Federal and state environmental protection and other agencies (USDA, FDA, USGS)
- Data: Contamination test results, locations from EPA, state agencies, USGS, FDA



# Water-Energy Nexus OKN



• **Objective:** Connect water-energy data to

- Answer questions at the Nexus
- Help align policies, rules, regulations

### $\circ$ Queries:

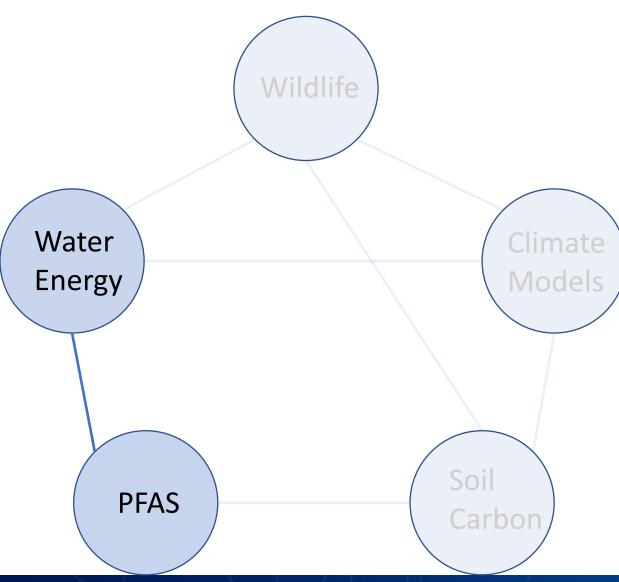
- What are current and future threats to water availability for water and energy needs?
- How much water and energy is being used, where and for what purpose?
- What are the current and future threats to water and energy infrastructure?
- Which rules/regulations support integrated management of water and energy nexus?

 $\circ$  **Users:** USGS, USACE, USEPA, DoE

o Data: USGS, NOAA, DoE



# Water Energy and PFAS joint use case



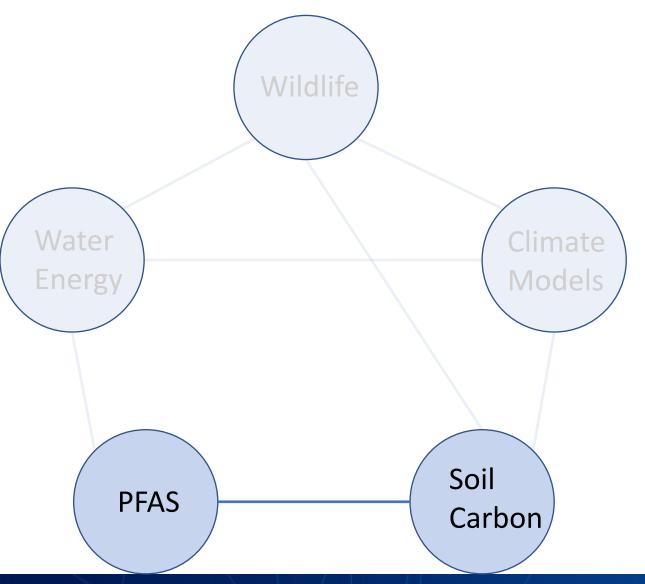
 Environmental Justice in Clean Water Availability (quantity and quality)

### $\circ$ Competency Questions

- How much water is available to community X for specific use?
- Is water contaminated in community X?
- Is there *potential* for water contamination in community X?
- Is remediation necessary? Where?
- Rank communities according to threat level and vulnerability
- $\odot$  Shared data and concepts
  - Federal facilities and industries
  - Hydrologic upstream-downstream relationships



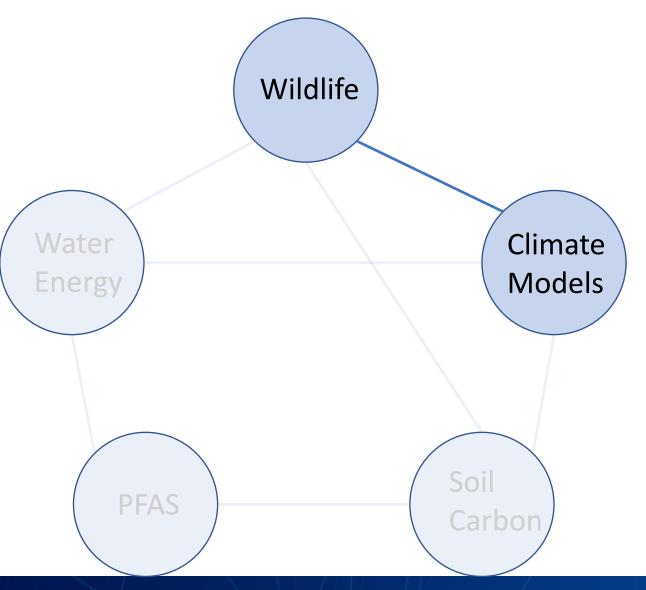
# Soil Carbon and PFAS joint use case



- $\odot\,$  Relationship between bioavailability of PFAS and soil carbon
  - PFAS binds to soil carbon, which reduces
    - PFAS uptake by crops
    - PFAS percolation into groundwater
- Shared Data and Concepts: Samples and measurements
  - Representation of spatial and temporal aspects
  - What is sampled (chemicals)
  - Metadata such as testing methods or lab information



# Climate models and Wildlife joint use case

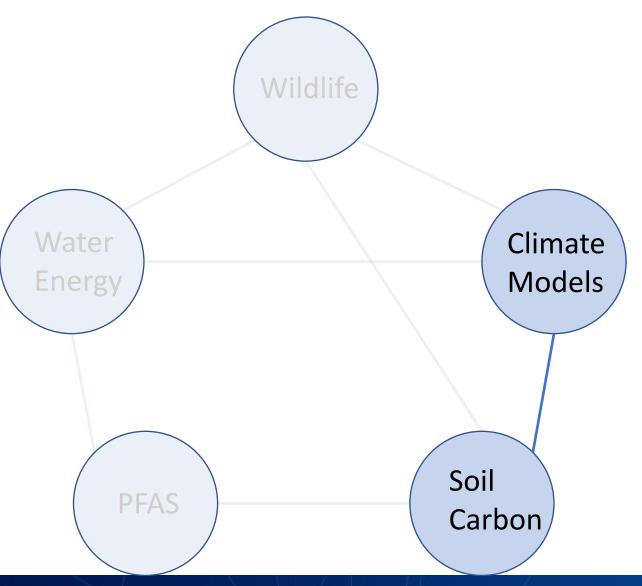


• Connection points

- How do changes in precipitation and temperature affect survival and distribution of species?
- What are the projected impacts of climate change on wildlife habitats and biodiversity hotspots?



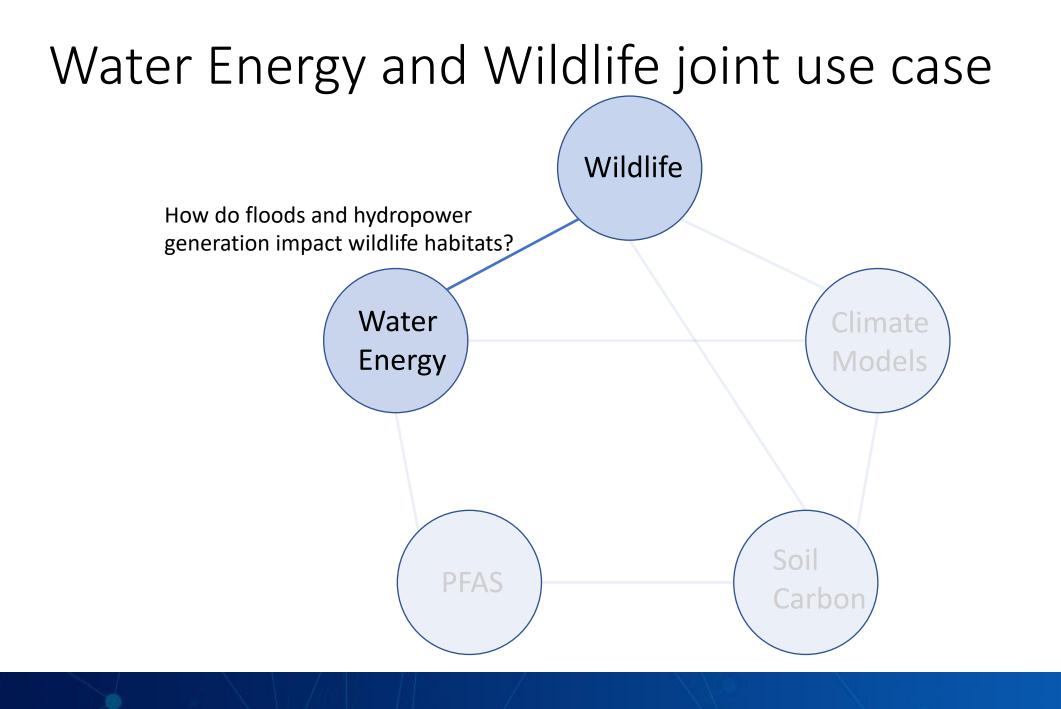
# Climate models and Soil carbon joint use case



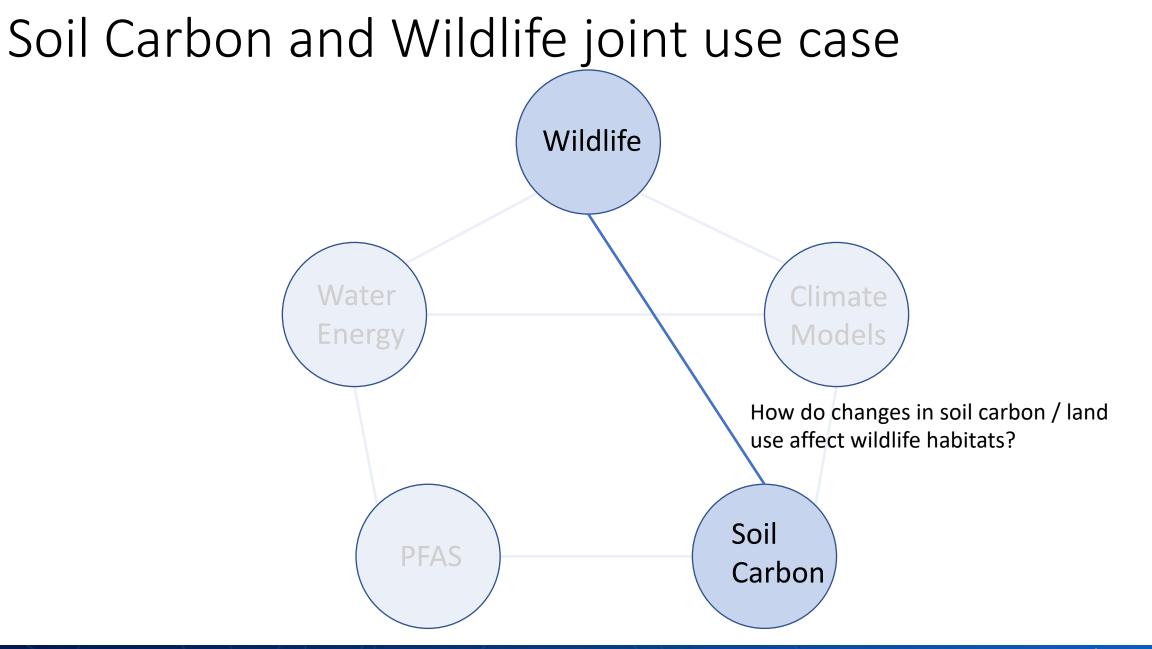
• Connection points

- How do climate variables and parameters from CMIP models correlate with soil carbon stocks and fluxes?
- Are there specific CMIP experiments or scenarios that directly impact soil carbon dynamics?
- What are the policy implications derived from the integration of climate model projections and soil carbon data, especially in terms of carbon credits quantification and sustainability farming practices?

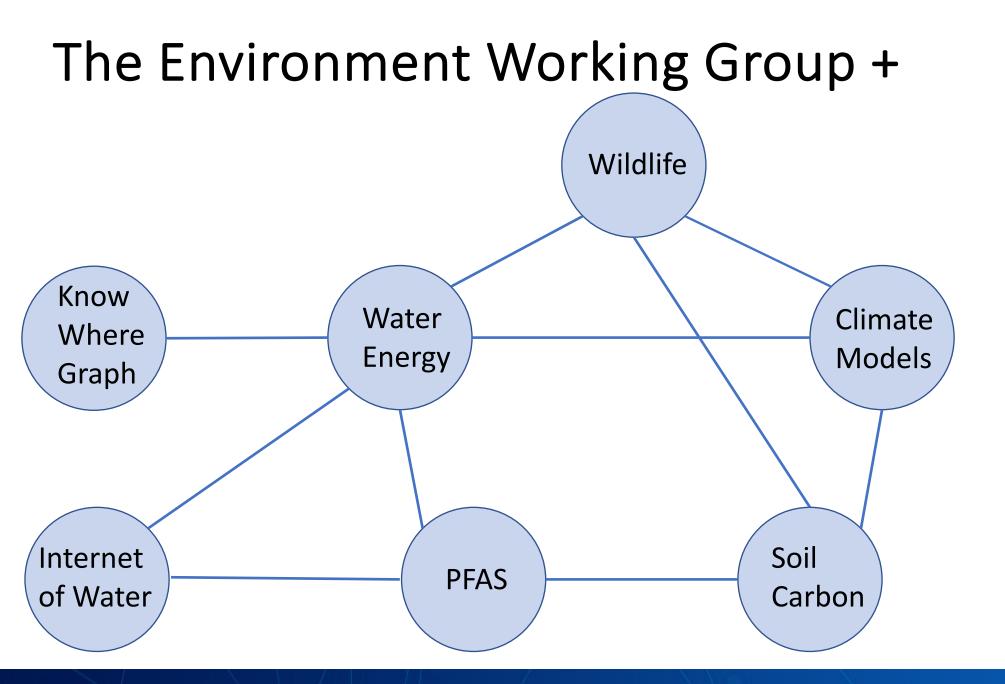








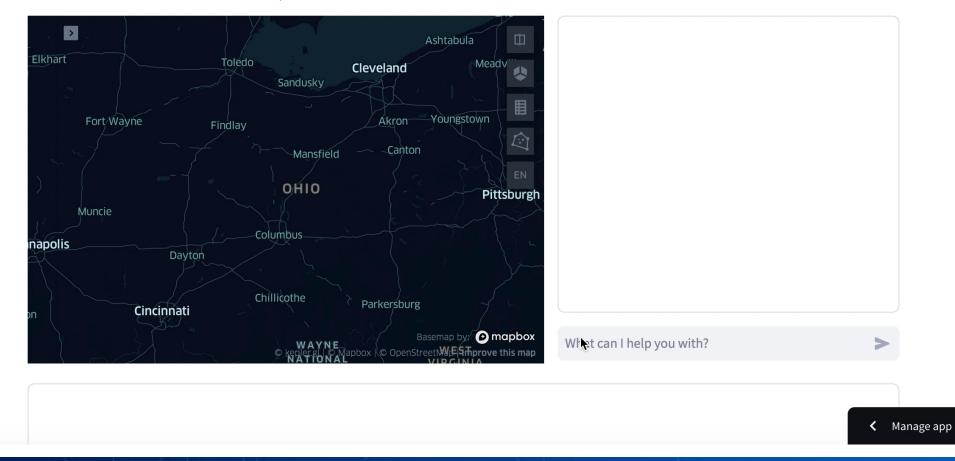






# Demonstration of federated GeoSparql queries

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WEN-OKN: Dive into Data, Never Easier



## **Biology and Health**

Project 1: SPOKE for space (S. Baranzini) Project 2: Bio-Health-OKN (A. Zhang) Project 3: Biobricks (T. Luechtefeld)



Supported by:







## Project 1: Connecting Biomedical information on Earth and in Space via the SPOKE knowledge graph

### Sergio Baranzini, Ph.D.

Professor of Neurology University of California, San Francisco



Supported by:





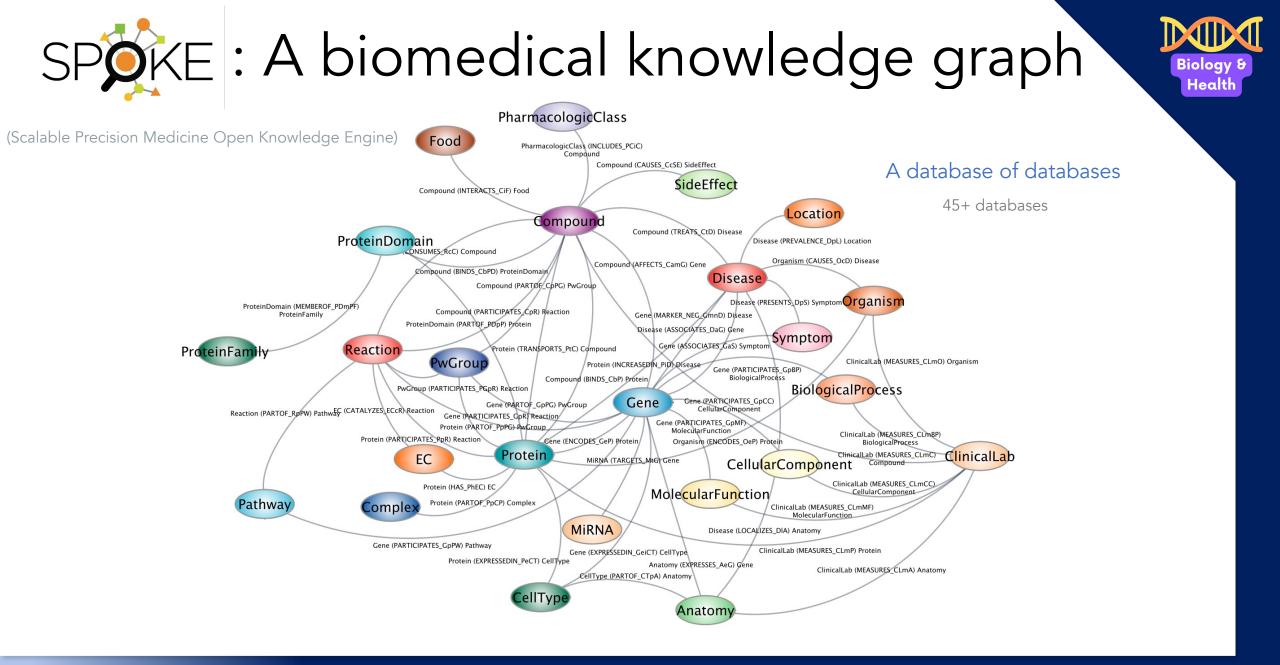




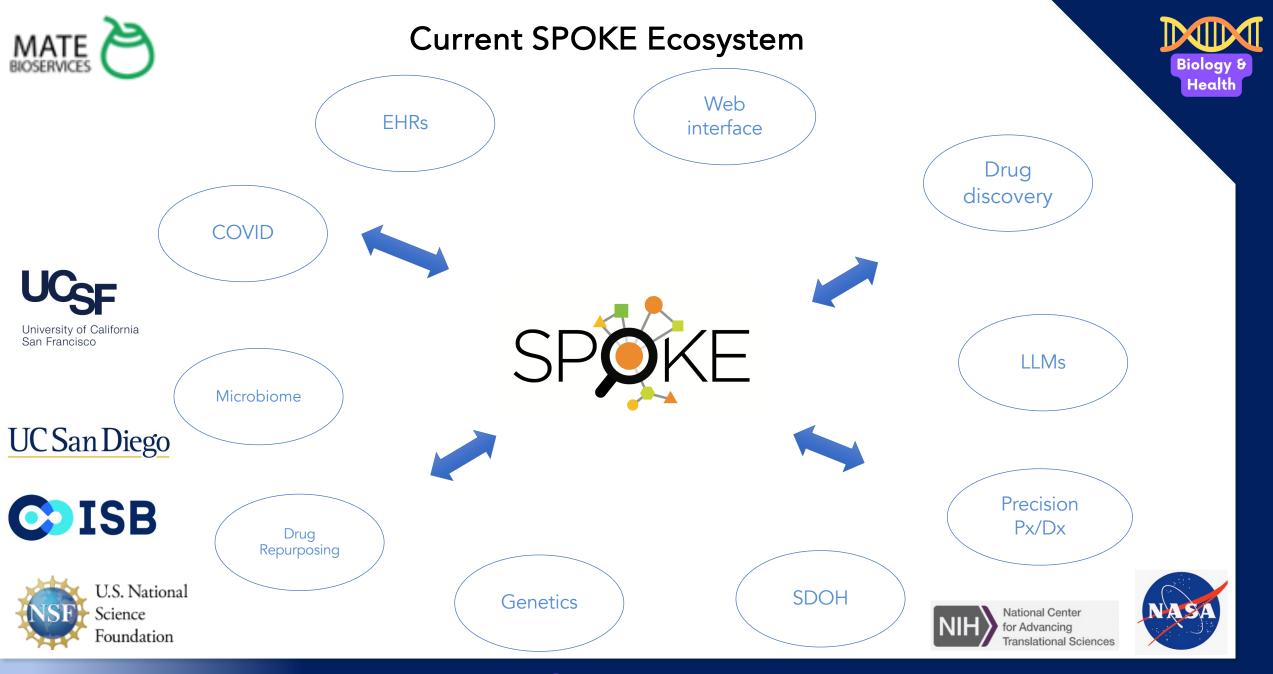
Peter Rose Sui Huang Karthik Soman Ebru Akbas Scooter Morris Sylvain Costes Lauren Sanders Sam Gebre Aenor Sawyer Charlotte Nelson

UC San Diego ISB UCSF UCSF UCSF Biology & Health









PI

**Proto-OKN** 

TYPE Original Research PUBLISHED 12 May 2023 DOI 10.3389/fmed.2023.1081087

Journal of the American Medical Informatics Association, 29(3), 2022, 424–434 https://doi.org/10.1093/jamia/ocab270 Advance Access Publication Date: 16 December 2021 Research and Applications



Biology

Health

### Check for updates

#### OPEN ACCESS

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### Early detection of Parkinson's disease through enriching the electronic health record using a biomedical knowledge graph

Karthik Soman<sup>1</sup>, Charlotte A. Nelson<sup>1</sup>, Gabriel Cerono<sup>1</sup>, Samuel M. Goldman<sup>2</sup>, Sergio E. Baranzini<sup>1</sup> and Ethan G. Brown<sup>1\*</sup>

<sup>1</sup>Department of Neurology, Weill Institute for Neurosciences, University of California, San Francisco, San Francisco, CA, United States, <sup>2</sup>Division of Occupational and Environmental Medicine, University of California, San Francisco, San Francisco, CA, United States

### **Research and Applications**

Embedding electronic health records onto a knowledge network recognizes prodromal features of multiple sclerosis and predicts diagnosis

Charlotte A. Nelson<sup>1,2</sup>, Riley Bove D<sup>3</sup>, Atul J. Butte<sup>2,4</sup>, and Sergio E. Baranzini D<sup>1,2,3</sup>

<sup>1</sup>Integrated Program in Quantitative Biology, University of California San Francisco, San Francisco, California, USA, <sup>2</sup>Bakar Computational Health Sciences Institute, University of California San Francisco, San Francisco, California, USA, <sup>3</sup>Department of Neurology, UCSF Weill Institute for Neurosciences, University of California San Francisco, San Francisco, California, USA, and <sup>4</sup>Department of Pediatrics, University of California San Francisco, San Francisco, California, USA





### Article

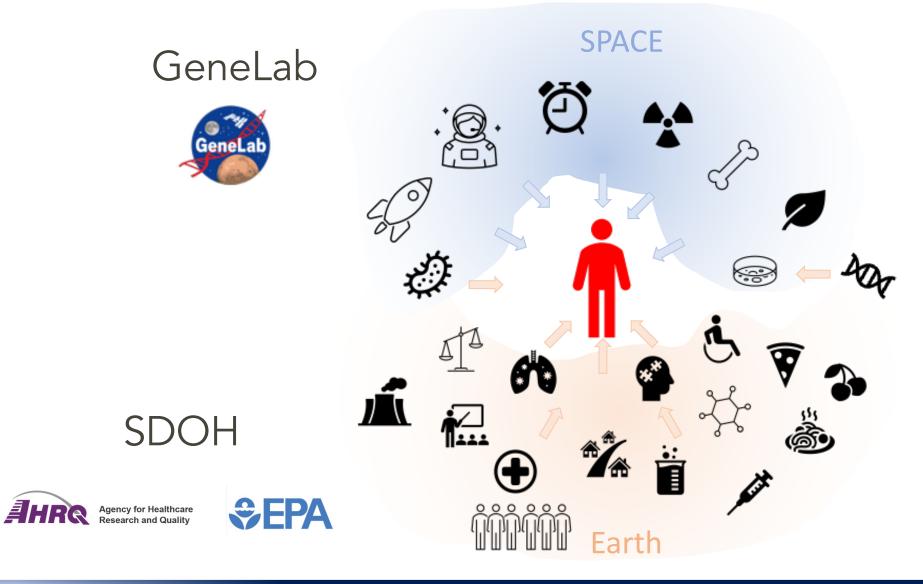
Knowledge Network Embedding of Transcriptomic Data from Spaceflown Mice Uncovers Signs and Symptoms Associated with Terrestrial Diseases

Charlotte A. Nelson <sup>1</sup><sup>[0]</sup>, Ana Uriarte Acuna <sup>2,3</sup>, Amber M. Paul <sup>2,4</sup><sup>[0]</sup>, Ryan T. Scott <sup>2,3</sup><sup>[0]</sup>, Atul J. Butte <sup>5,6</sup><sup>[0]</sup>, Egle Cekanaviciute <sup>2</sup><sup>[0]</sup>, Sergio E. Baranzini <sup>1,5,7,\*</sup><sup>[0]</sup> and Sylvain V. Costes <sup>2,\*</sup><sup>[0]</sup>



# **Proto-OKN Project overview**

Biology & Health







## **Open Science Data Repository**

>|

of space environments. Due to the limited resources for

conducting biologic...

Biology & Health

	NASA Open S	Science for Life in Spa	ace Home At	bout y Data & Tools y	Research & Resc	ources 🗸 Working Groups 🗸 Help 🗸
General Search Filters						
Data Source	Open Sci	ience Data Re	epository Searc	ch		
GeneLab	Search Datase	ets		٩		Sort By: Accession (Ascending)
NIH GEO EBI PRIDE ANL MG-RAST						Items per page: 25 ▼ 1 - 25 of 449  < < > >
		Expression data	from drosophila m	elanogaster		
Data Type		Organisms	Factors	Assay Types	Release Date	Description
Study Experiment Subject Biospecimen	Study OSD-1	Drosophila melanogaster	Spaceflight Infection	transcription profiling	11-Dec-2013	Space travel presents unlimited opportunities for exploration and discovery, but requires a more complete understanding of the immunological consequences of long-term exposure to the conditions of spa
Payload Mission		Highlights: cgene				
Hardware						
		Rodent Researc	h-1 (RR1) NASA Va	lidation Flight: Mouse e	ye transcriptomi	c and epigenomic data
Study Search Filters		Organisms	Factors	Assay Types	Release Date	Description
Project Type	Study	Mue musculus	Spaceflight	DNA methylation	28-Eeb-2017	NASA's Rodent Research (RR) project is playing a critical role in advancing biomedical research on the physiological effects

Ground Spaceflight

High Altitude

OSD-100

Mus musculus

Highlights: cgene

transcription profiling

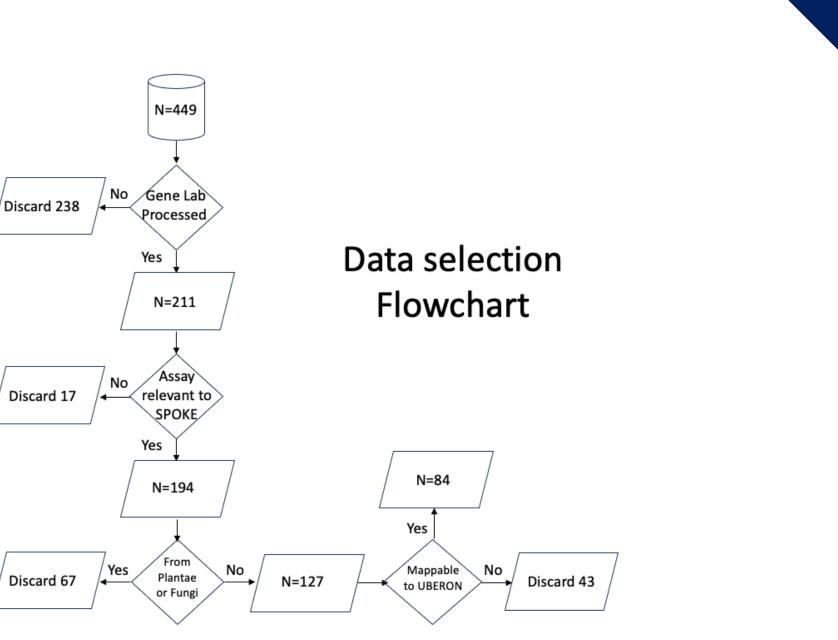
profiling

Spaceflight



28-Feb-2017





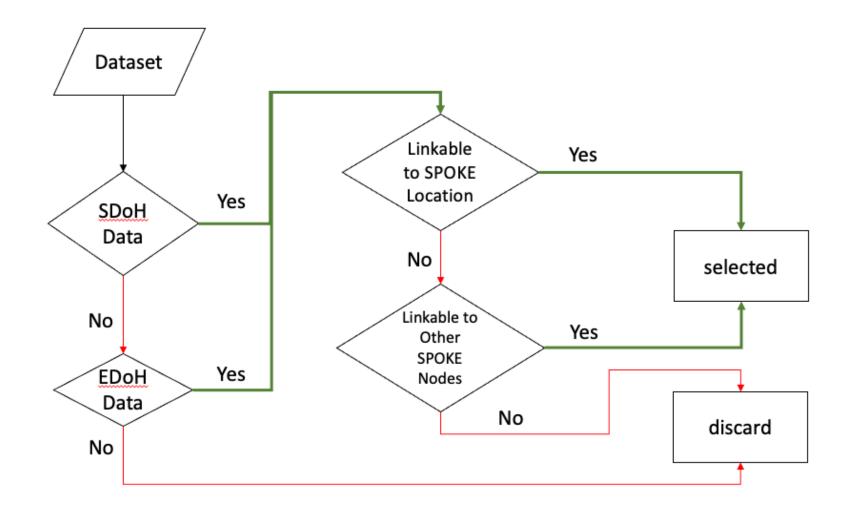
Biology & Health





Biology & Health

**S**EPA

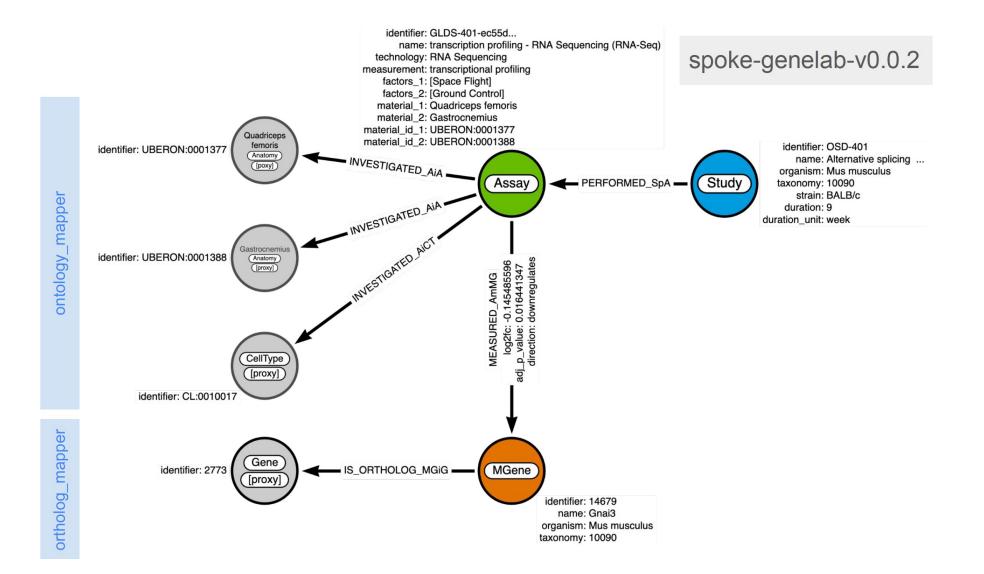






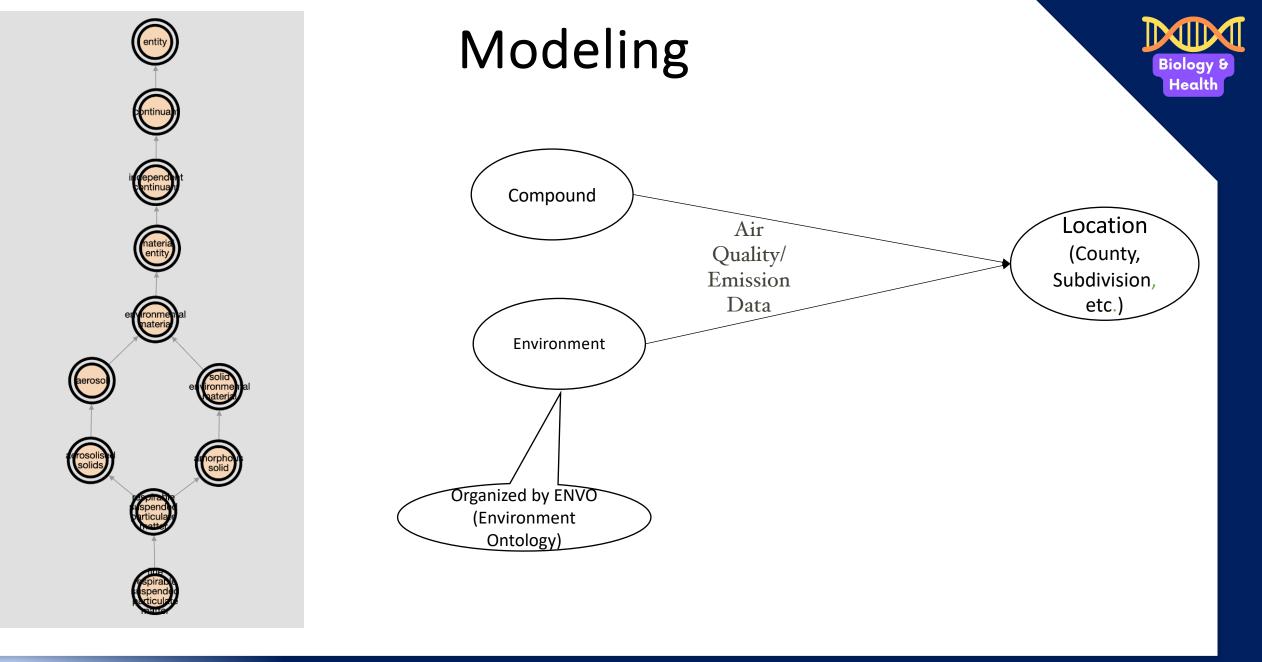
## SPOKE fabric for NASA

Biology & Health





**Proto-OKN** 

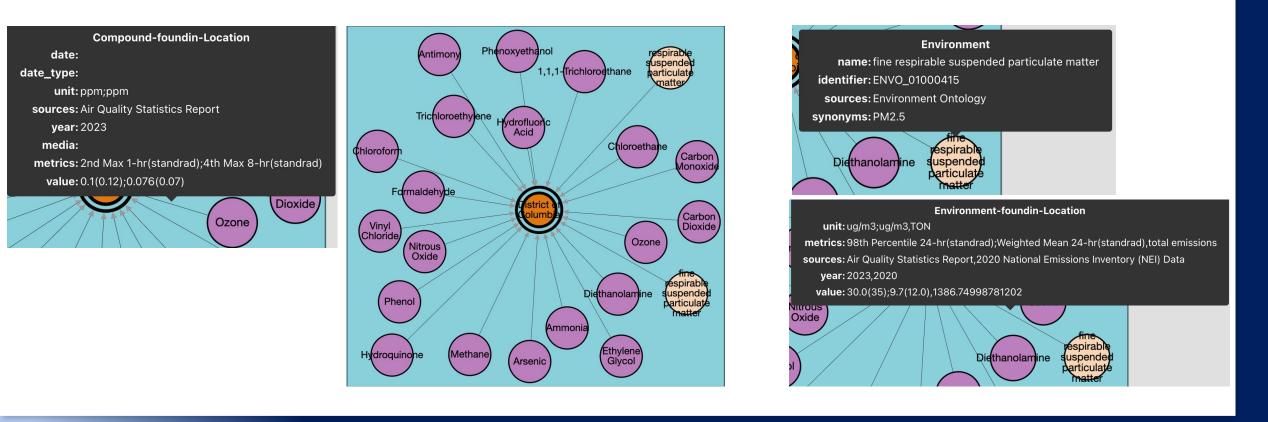




# Air Quality and Emission Data in US

### $\,\circ\,$ Two data sources from EPA

- Air Quality Statistics Report
- 2020 National Emissions Inventory (NEI) data
- $\,\circ\,$  Connect Compounds/Environments to US counties



Biology Health



Project 2: A Dynamically-Updated Open **Knowledge Network for Health: Integrating Biomedical Insights with** Social Determinants of Health (Bio-Health-OKN)

PI: Aidong Zhang (UVA)

Co-PIs: Cathy Wu (UD), Kishlay Jha (Ulowa)

Stefan Bekiranov (UVA), Rahmat Beheshti (UD)

Senior Personnel: Melissa Little (UVA), Tom Powers (UD), Chuming Chen (UD)

Agency Partners: Suzanne Milbourne (VA), Tim Burke (VA)



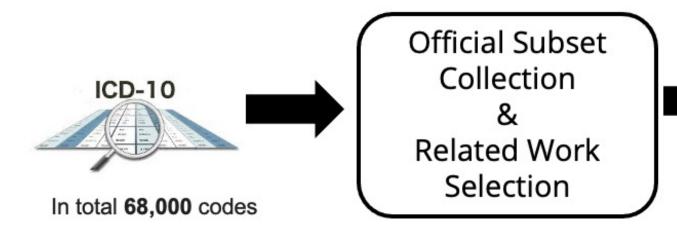


Supported by:





### SDoH Labels & Data Collection Pipeline



#### Data Sources:

(i) International Classification of Diseases, Tenth Revision (ICD-10),

(ii) Medical Information Mart for Intensive Care (MIMIC) - IV

(iii) Assessment of Use of ICD-9 and ICD-10 Codes for Social Determinants of Health in the US, 2011-2021



**326** SDoH relevant ICD-10 codes, **16,822** discharge summaries (containing 129 SDoH relevant ICD-10 codes) Biology 8 Health







 $\leftarrow$ 

F43.9: Reaction to severe stress, unspecified <u>Concept</u> <u>Unique</u> Identifier

C4042925



Trauma and Stressor Related Disorders



### **SDoH Extraction Modeling**



### Tool Used:

□ MetaMap, a biomedical entity extraction model developed by UMLS.

### **Experiments**:

□ Concatenated the semantic types extracted by MetaMap to the actual text of the data.

### Gindings:

- The addition of semantic types can significantly supplement the textual information in short texts.
- □ Submitted findings to the AMIA 2024 Annual Symposium for peer review and discussion.







PI: Thomas Luechtefeld (InSilica)



Supported by:







#### NSF Award #2333836 <u>Creating a Cross-Domain Knowledge</u> <u>Graph to Integrate Health and Justice</u> <u>for Rural Resilience</u>

PI: Jiaqi Gong, University of Alabama Co-PIs: James Geyer, Xiaoyan Hong, Matthew Hudnall, Hee Yun Lee

NSF Award #2333790 <u>A Knowledge Graph Warehouse for</u> Neighborhood Information

Pl: Jing Gao, Purdue University Co-Pls: Fenglong Ma, Jingbo Shang, Daniel Semenza NSF Award #2333703 **DREAM-KG: Develop Dynamic**, **Responsive, Adaptive, and Multifaceted Knowledge Graphs to Address Homelessness With Explainable AI** 

NSF Award #2333803

Charlotte Alexander

Data Silos

IJP: An Integrated Justice Platform to

**Connect Criminal Justice Data Across** 

PI: Adam Pah, Georgia State University;

Website

PI: Yuzhou Chen, Temple University Co-PIs: Ying Ding, Chiu Tan, Huanmei Wu

# Justice

#### Supported by:





### The problem:

A fragmented data system with human costs

Police

Courts

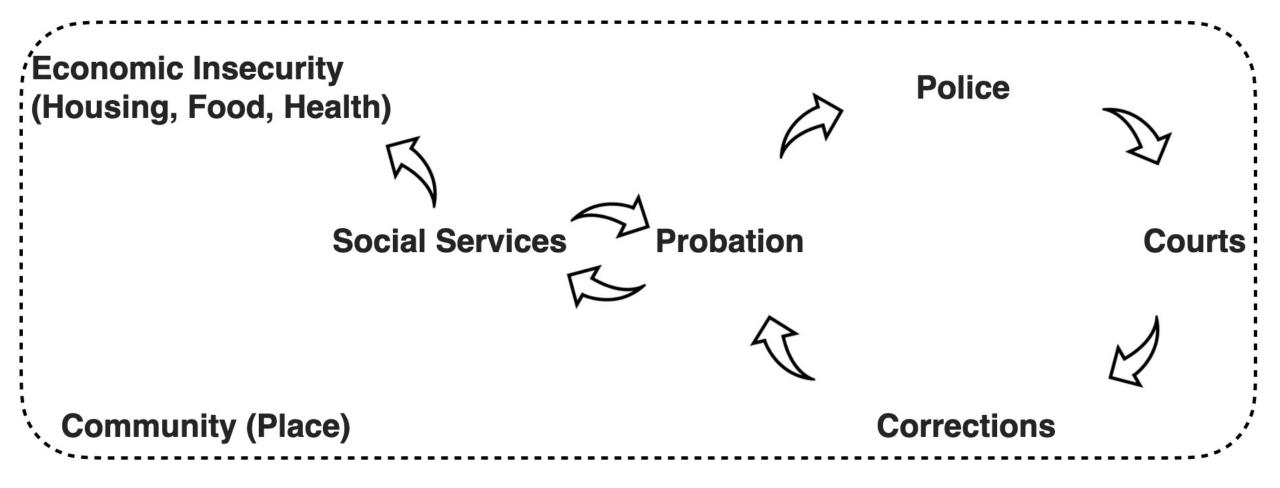
Corrections

Probation

**Social Services** 



## The problem: A fragmented data system with human costs



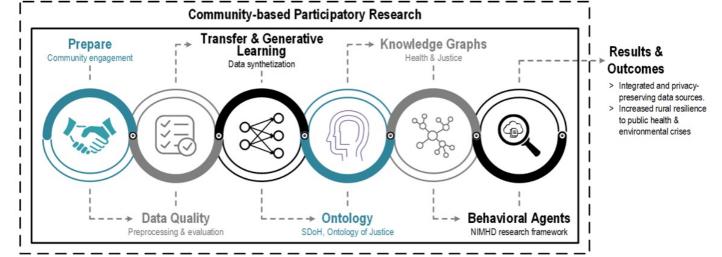


NSF Award #2333836 Creating a Cross-Domain Knowledge Graph to Integrate Health and Justice for Rural Resilience

Pl: Jiaqi Gong, University of Alabama Co-Pls: James Geyer, Xiaoyan Hong, Matthew Hudnall, Hee Yun Lee

> Integrate, depict, and link previously isolated health and justice datasets, offering a robust resource for researchers, practitioners, and educators to enhance their insights into risk landscapes in rural areas and strengthen their resilience.



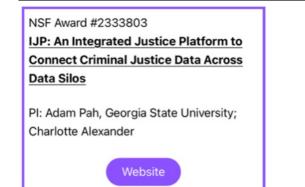




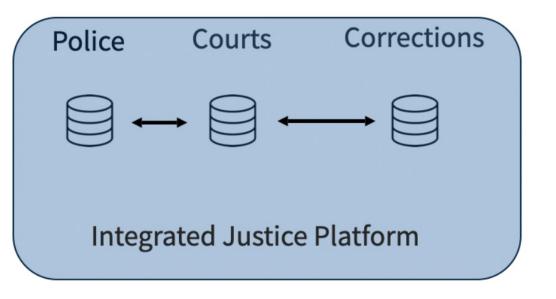
### Current Project Status: Datasets

- · What we accessed:
  - ScHARe: Diseases and Conditions, Economic Stability, Education Access and Quality, Health Behaviors, Health Care Access and Quality, Multiple Categories, Neighborhood and Built Environment, and Social and Community Context
  - **PLACES/500 cities:** 29 measures, including: 13 for health outcomes, 9 for preventive services use, 4 for chronic disease-related health risk behaviors, and 3 for health status.
  - Social determinants of health (SDOH): social context (e.g., age, race/ethnicity, veteran status), economic context (e.g., income, unemployment rate), education, physical infrastructure (e.g, housing, crime, transportation), and healthcare context (e.g., health insurance).
  - Behavioral Risk Factor Surveillance System (BRFSS): health-related risk behaviors, chronic health conditions, health-care access, and use of preventive services from the noninstitutionalized adult population.
  - National Incident-Based Reporting System (NIBRS): administrative, offense, property, victim, offender, and arrestee.
  - National Survey on Drug Use and Health (NSDUH): use of tobacco, alcohol, and drugs; substance use disorders; mental health issues; and receipt of substance use and mental health treatment among the civilian.
- What we have integrated thus far:
  - ScHARe: Economic Stability: American Housing Survey (AHS) National Public Use File (PUF) (2015, 2017, 2019, 2021)
  - National Incident-Based Reporting System (NIBRS): administrative, offense, property, victim, offender, and arrestee.





The Integrated Justice Platform harmonizes criminal justice data and makes it public and analyzable



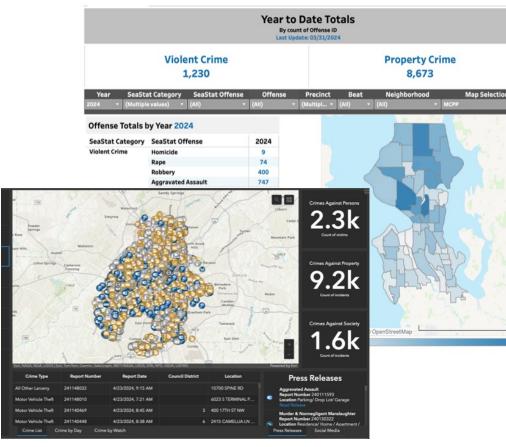
Probation

on Community Reintegration

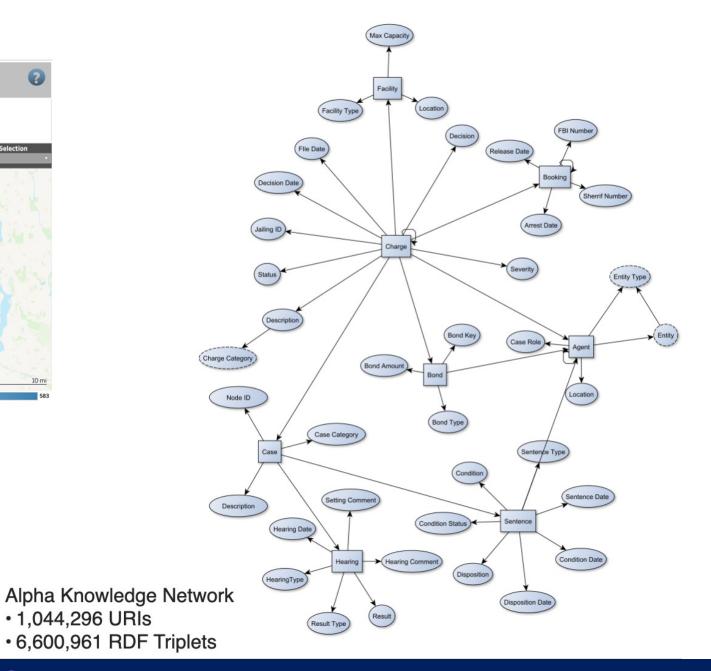
Case study approach to **build infrastructure** and **pilot pipelines** 



### Seattle, WA



### Atlanta, GA



**Proto-OKN** 

• 1,044,296 URIs

0

NSF Award #2333790 <u>A Knowledge Graph Warehouse for</u> Neighborhood Information

Pl: Jing Gao, Purdue University Co-Pls: Fenglong Ma, Jingbo Shang, Daniel Semenza

shooting.csv: <u>https://opendataphilly.org/datasets/shooting-victims/</u>

Details of the shootings,

including the date, exact

time, age, sex, etc.

date_	time	race	sex	age	wound	officer_in	vol offender	inji offender	_declocation	latino	point_	د I	point_y	dist	inside	outside	fatal		lat	Ing	Block Group	Census track
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2021-03-29 (	17:05:00	В	M		21 Chest	N	N	N	1400 BLOCK		0 -74.9	9364	40.0866439		8	1	0	1	40.0866439	-74.959364	1	36301
2021-05-15 (	8:48:00	В	F		33 Buttocks	N	N	N	8600 BLOCK		0 -75.0	3539	40.0457315		8	0	1	0	40.0457315	-75.013539	2	34900
2021-06-02 (	1:30:00	В	M		22 Back	N	N	N	2800 BLOCK		0 -75.0	3909	40.0572187		8	0	1	0	40.0572187	-75.033909	3	34702
2021-05-31 (	12:44:00	В	M		22 Multiple/Hea	N	N	N	500 BLOCK N		0 -75.1	4533	39.963546		9	0	1	1	39.963546	-75.164533	1	13300
2021-07-15 (	1:03:00	В	M		29 Abdomen	N	N	N	BROAD & CH		0 -75.	6386	39.9508656		9	0	1	0	39.9508656	-75.16386	2	901
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2021-11-01 (	2:25:00	В	M		22 Back	N	N	N	1400 BLOCK		0 -75.1	0042	39.9689999		9	0	1	1	39.9689999	-75.160042	2	13300
2021-11-01 (	2:25:00	в	M		28 Multiple	N	N	N	1400 BLOCK		0 -75.1	0042	39.9689999		9	0	1	0	39.9689999	-75.160042	2	13300
2021-10-30 (	11:24:00	в	M		29 Leg	N	N	N	4200 BLOCK		0 -75.02	4766	40.0409227		8	0	1	0	40.0409227	-75.024766	1	32900
2021-12-09 (	5:45:00	w	M		31 Buttocks	N	N	N	4600 BLOCK		1 -75.0	2655	40.0436776		8	0	1	0	40.0436776	-75.012655	2	34900
2021-02-18 (	4:10:00	В	M		16 Chest	N	N	N	2900 BLOCK		0 -75.2	3291	39.9135905		12	0	1	1	39.9135905	-75.233291	3	6100
2021-01-01 (	1:48:00	в	F		22 Arm	N	N	N	2100 BLOCK		0 -75.1	7121	39.9511359		9	0	1	0	39.9511359	-75.177121	1	401
2021-01-24 (	19:58:00	w	M		18 Multiple	N	N	N	1400 BLOCK		0 -75.1	4482	39.9535539		9	0	1	0	39.9535539	-75.164482	2	402
2021-03-10 (	22:25:00	В	M		34 Leg	N	N	N	1400 BLOCK		0 -75.10	0849	39.97032		9	0	1	0	39.97032	-75.160849	2	14000



### Implementation details - UI design (now)





NSF Award #2333703 DREAM-KG: Develop Dynamic, Responsive, Adaptive, and Multifaceted Knowledge Graphs to Address Homelessness With Explainable AI

PI: Yuzhou Chen, Temple University Co-PIs: Ying Ding, Chiu Tan, Huanmei Wu

- Objective: to create a knowledge graph (KG) system (i.e., Dynamic, REsponsive, Adaptive, and Multifaceted Knowledge Graph (DREAM-KG)) that will
  - provide a comprehensive understanding of the social, economic, and political factors that contribute to homelessness
  - triage existing services and resources to support people experience homelessness (PEH)
  - provide an automated end-to-end knowledge graph/graph AI pipelines that simplifies and standardizes the process of data loading, experimental setup, and model evaluation

#### Homelessness-Related Service Data Collection and Preprocessing

#### Findhelp (Signed Data Use Agreement):

- 1. Main service
- 2. Other service



- 4. Phone number
- 5. Official website
- 6. Eligibility

3. Serving

- 7. Availability
- 8. Description
- 9. Languages
- 10. Cost
- 11. Facebook/Twitter URLs
- 12. Coverage
- 13. Opening hours
- 14. Geolocation
- 15. Physical address
- 16. Zip code

#### Google Maps (Open Source):

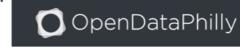
- 1. Reviewer ID
  - 2. Review summary (rate)
  - 3. Review text
  - 4. Review link
  - 5. Review likes



- 6. Review timestamp
- 7. Satellite image
- 8. Resolution (1200 × 800)
- 9. Zoom level (20)

#### OpenDataPhilly (Open Source):

- 1. Crime incidents from the Philadelphia Police Department, including violent offenses such as aggravated assault, rape, arson, simple assault, prostitution, gambling, fraud, and other
  - non-violent offenses, etc.
- 2. Dispatch date



- 3. Police service area (PSA)
- 4. Geolocation
- 5. Physical address

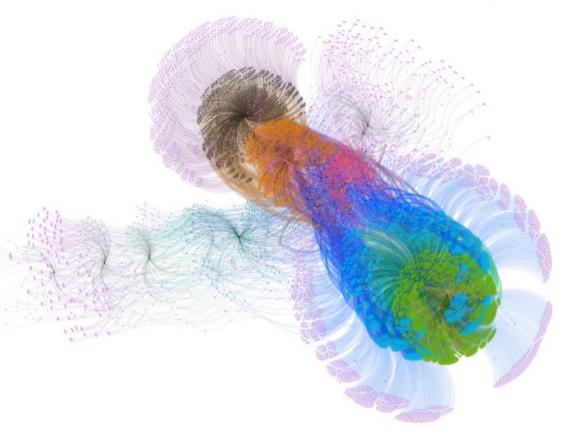




### DREAM-KG Construction

#### Service types: emergency food, temporal shelter, mental health

- 1. Create a spreadsheet containing information about the individual homelessness service providers, such as the name, services provided, contact information, address, geospatial coordinates, opening/closing hours, languages, target audiences, eligibility criteria, and google reviews.
- Converted this spreadsheet to resource description framework (RDF) triples using PostgreSQL, Ontop VKG, and Schema.org ontology.
- 3. Once the triples are generated, we also convert the RDF into a tab-separated value (TSV) format for use in the further downstream tasks.
- 4. Provide SPARQL for query and Gephi tool for visualizations.
- 5. DREAM-KG: 16,286 entities, 35 relations, and 41,633 RDF triples.



Overview of health-related homelessness service knowledge graph. Green and light blue represent user reviews, dark blue and red represent service information, and orange and black represent questions and answers about the services.





Proto-OKN Technology & Manufacturing Working Group

> **CollabNext** PI: Lew Lefton, Georgia Tech

#### **Software Supply Chain**

PI: Tianyi Zhang, Purdue University

Supply and Demand Open Knowledge Network PI: Farhad Ameri, Arizona State University



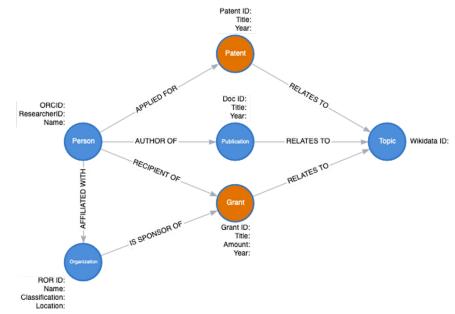




### **CollabNext: A Person-Focused Metafabric for Open Knowledge Networks**

<u>Objective:</u> We will develop a knowledge graph of **People**, **Organizations and Research Topics**. We are adopting an **intentional design approach which initially prioritizes HBCUs and emerging researchers** in a deliberate effort to counterbalance the <u>Matthew effect</u>: an accumulated advantage of well-resourced research organizations.

<u>Data:</u> We use open science data sources. <u>Current proof-of-</u> <u>concept CollabNext tool</u> uses <u>OpenAlex</u> (formerly Microsoft Academic Graph) and is integrating institutional data from <u>MUP:</u> <u>Measuring University Performance</u>. Additional data sources will be added.









Center for Measuring University Performance





**Proto-OKN** 

### **CollabNext: A Person-Focused Metafabric for Open Knowledge Networks**

<u>Users:</u> Researchers, Sponsored Program Officers, Journal Editors, University Administration and Leadership, Students, Librarians, Industry Professionals

#### Example Use Cases:

As a principal investigator (or industry partner), I want to **identify and contact colleagues (at HBCUs/MSIs** or at well-resourced institutions) with interest and expertise in a specific research areas, so that I can build a stronger research team and increase collaborative research efforts.

As a sponsoring agency program officer (or journal editor), I want to **identify faculty researchers who specialize in certain areas** to serve as reviewers so I can **expose more researchers to** what **successful submissions** look like.

As a program or conference organizer I want to **curate a diverse panel of knowledgeable experts** so that my event will engage a broader audience.



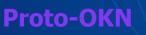


**Collaborators:** Fisk University, Georgia Tech, Morehouse College, Texas Southern University, University at Buffalo

Schema will connect **Person** and **Topic** entities using OpenAlex and other data including: **Publications** (Articles, Books, Preprints, Theses, Conference Proceedings), **Grants/Awards**, **Patents**.

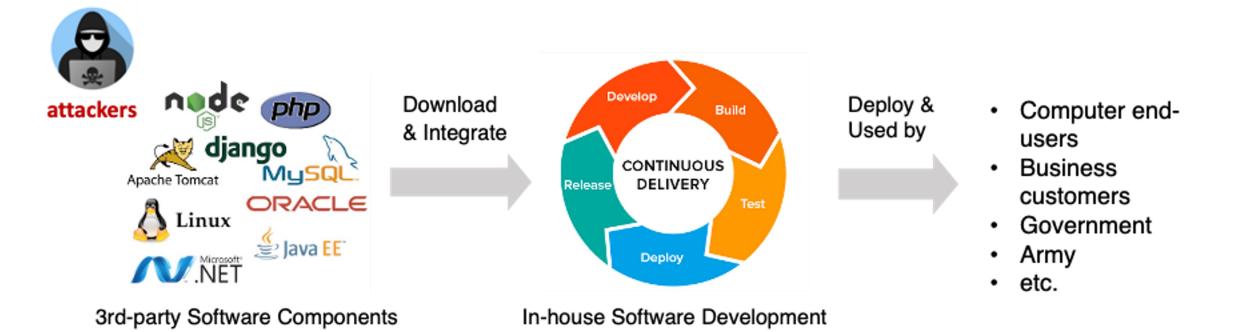
Leverage consistent state-of-the-art algorithms for entity resolution (eg name disambiguation), topic classification, LLM integration for Natural Language Interface







<u>Objective</u>: Develop a knowledge graph to continually track and assess vulnerability propagation in software supply chains



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<u>Objective</u>: Develop a knowledge graph to continually track and assess vulnerability propagation in software supply chains

### Supply Chain Attack: Major Linux Distributions Impacted by XZ Utils Backdoor

Urgent security alerts issued as malicious code was found embedded in the XZ Utils data compression library used in many Linux distributions.

### The Untold Story of the Boldest Supply-Chain Hack Ever

The attackers were in thousands of corporate and government networks. They might still be there now. Behind the scenes of the SolarWinds investigation.





WIRED

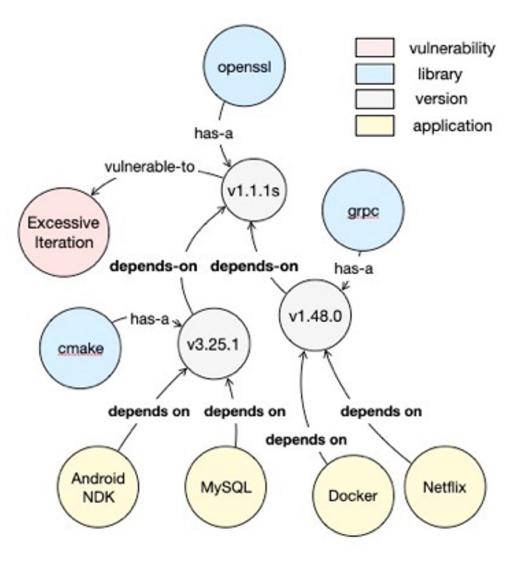
3rd-

**Proto-OKN** 

### <u>Users</u>: IT managers, security analysts, software developers, computer end-users

### Use Cases:

- IT managers and security analysts can query the KG to check whether any of the software in their companies depends on a vulnerable 3<sup>rd</sup> party component
- End-users can check whether any of the software on their computers are affected by any recently discovered vulnerabilities
- Developers can check the security of the libraries they use to build the software and also rely on the KG to generate a comprehensive and precise Software Bill of Materials





### <u>Data</u>:

 <u>The Libraries.io dataset</u>: open-source software libraries and applications from 33 package managers and 3 source code hosting platforms.

### ○ GitHub repositories

OCVE List: publicly disclosed cybersecurity vulnerabilities.

<u>• The Hacker News</u>: the latest vulnerability reports from many sources







### Supply and Demand Open Knowledge Network(SUDOKN)

### **Challenge:**

- There are about 400,000 small and medium-sized manufacturers in the U.S
- Due to the lack of comprehensive and accurate information about their capabilities, supplier discovery is a lengthy and resource-intensive process.

Monterrey

### **Objective:**

 Prototype an integrated data and knowledge infrastructure representing the capabilities of US manufacturers.

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### Impact:

- Improving the findability and visibility of SMMs.
- Improving the resilience of manufacturing supply chains.



Use Case: Supplier Discovery



Use Case: Capacity scale-up and capability extension



Ottawa Montréi

### Supply and Demand Open Knowledge Network(SUDOKN)

**Users:** Supply chain managers, manufacturers, OEMs, MEP Centers, Economic developers

### Example Use Cases:

- As a supply chain manager, I need to find a company for pipe bending that is certified for 3D bending for oxygen pipes in a submarine.
- As a precision machine shop in northern California, I need to know what unique capabilities I have that differentiate my company from the peer companies in this area.

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 As an economic developer, I need to identify technological gaps in Nevada in the semiconductor manufacturing.

### Supply and Demand Open Knowledge Network(SUDOKN)

### $\odot$ Data Sources:

- Company websites
- Online Directories
- Manufacturing Marketplaces
- DHS Geospatial Management Office

Evaluation Models

Triplet Extraction

Pre-trained Models with Prompts

### $\odot$ Data Ingestion Pipeline:

Ontology

Thesaurus

Compani Websit

Supplier

directories

• Formal ontologies (BFO-complaint), SKOS Thesaurus, LLM

LLM

Entity Normalization

API: Scraper

Entity Normalization

Models

CSV

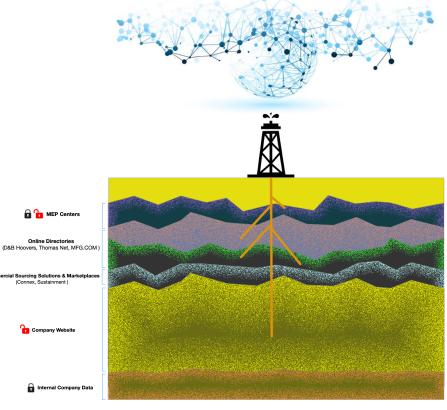
name

industry

1

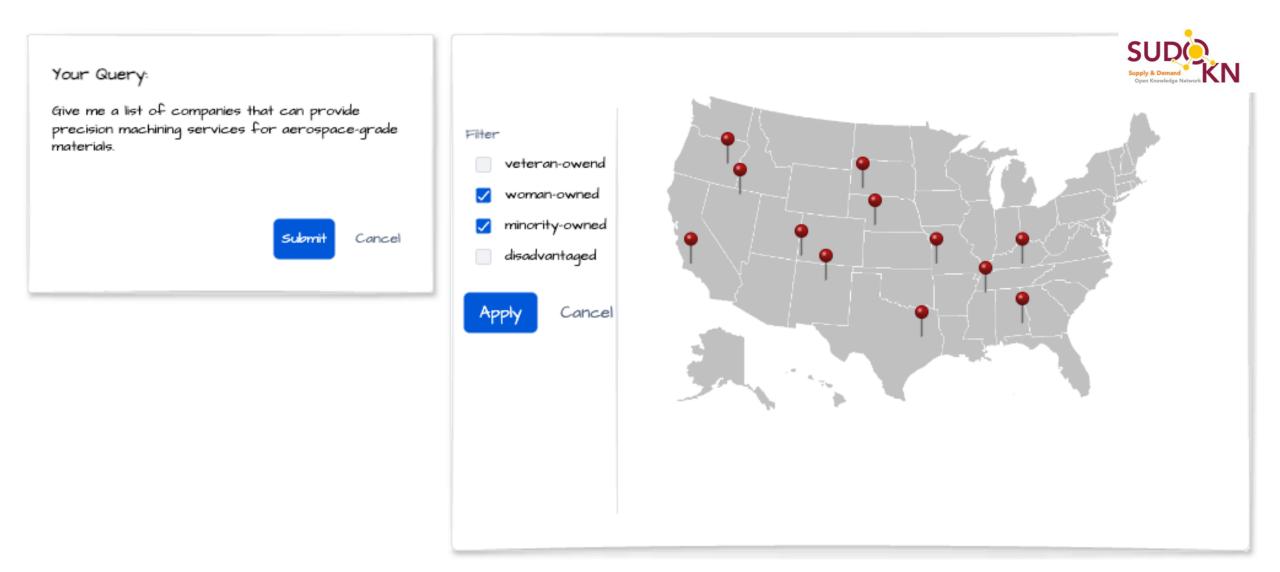
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3 ID





### **Natural Language Queries**







### Workshop Agenda

### 

• Chaitan Baru & Jemin George, TIP Directorate, National Science Foundation

### **Presentation by Theme 1 Groups focusing on**

Environment

• Lilit Yeghiazarian, University of Cincinnati

Biology & Health

• Sergio, Baranzini, University of California, San Francisco (UCSF)

o Justice

- Adam Pah, Georgia State University (GSU)
- Technology & Manufacturing
  - Farhad Ameri, Arizona State University (ASU)

### **Presentation by Theme 2: Proto-OKN Fabric**

o Chris Bizon, University of North Carolina at Chapel Hill (UNC) & Patrick Grinaway, Onai

### **Presentation by Theme 3: Proto-OKN Education and Public Engagement**

• Cogan Shimizu, Wright State University





FRINK: FabRic Integrating Networked Knowledge



Supported by:





### Many Theme 1s will create Knowledge Graphs





# The Open Knowledge Network is formed by the integration of these graphs.





# Themes 2 and 3 provide the fabrics supporting this integration

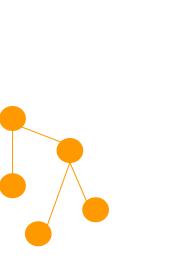
- A Social Fabric: Building a community across members to establish a shared vision for the Proto-OKN.
- A Knowledge Fabric: Creating the standards and methods for graph interoperability.
- A Technical Fabric: The common cloud-based infrastructure in which the Proto-OKN will exist.

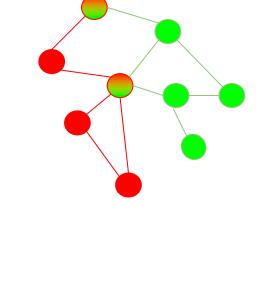




### Knowledge Fabric: Interoperability

- Graphs will be created using a variety of
  - Formats
  - Data modeling styles
  - Naming conventions
- We will establish standards, drawing on **pre-existing community approaches** to allow these graphs to interoperate
- Graphs will sometimes connect naturally, but not always.

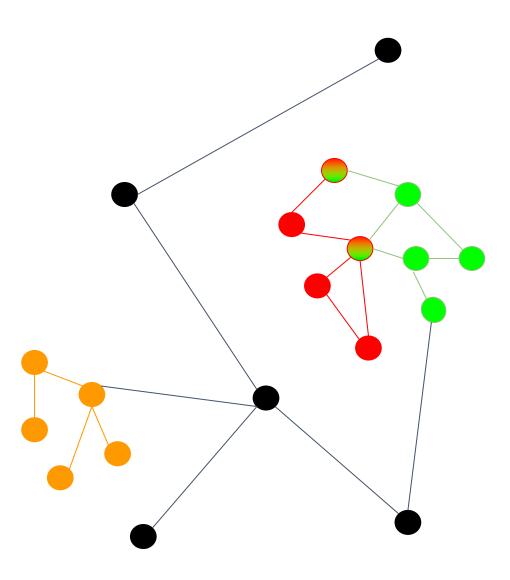




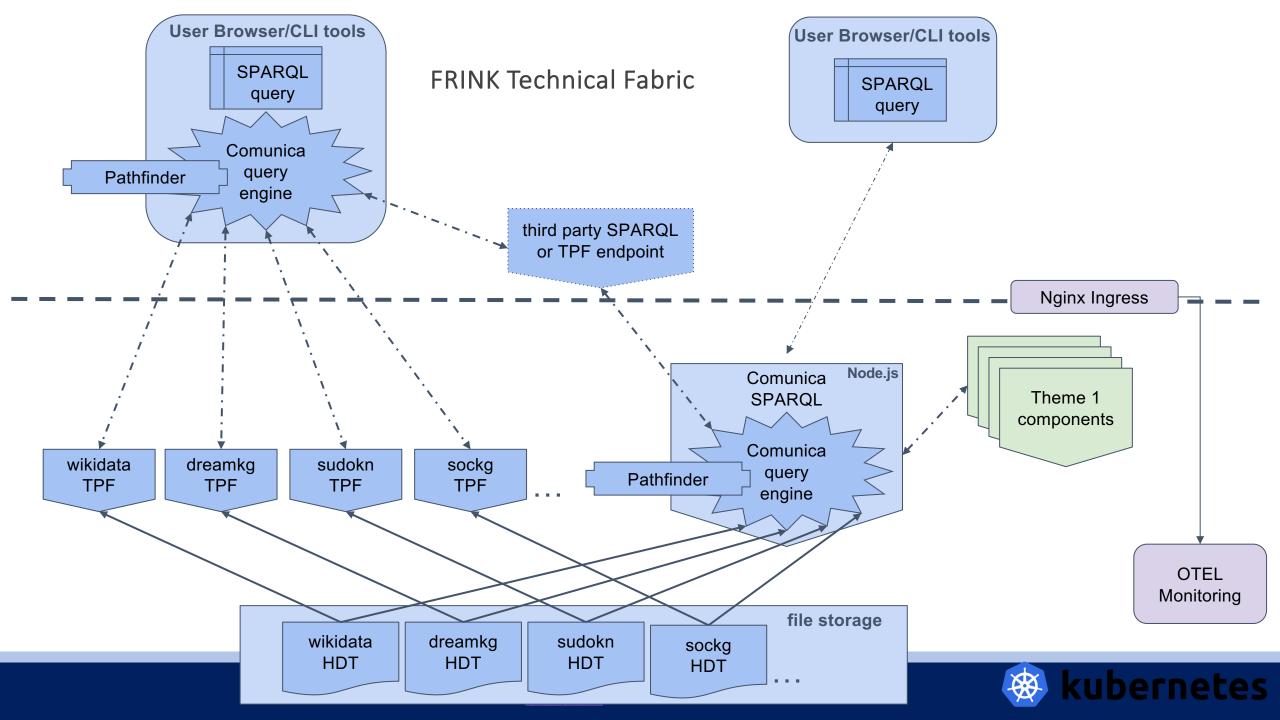


### Knowledge Fabric: Wikidata

- We will rely on the pre-existing open-source Wikidata as a knowledge substrate.
- Wikidata covers a wide range of knowledge at a lower density than the specific graphs created for Proto-OKN







# **Scalable Public** Infrastructure for Distributed Entity **Relationships**

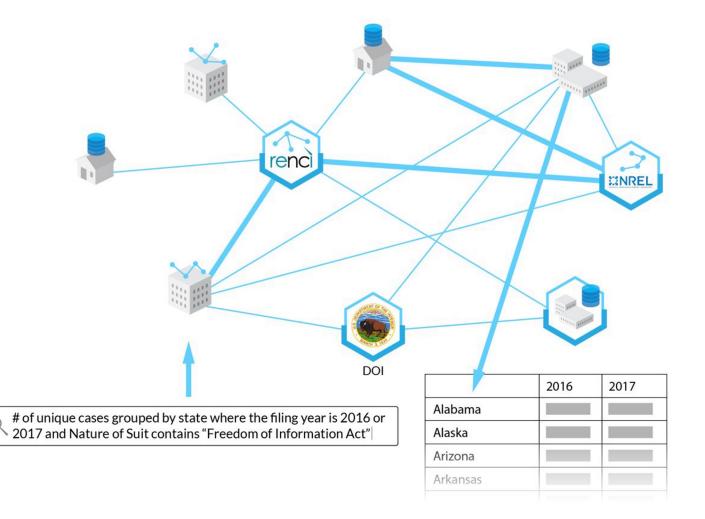
info@onai.com

Supported by:





### **SPIDER Project Overview**



**Objective:** 

Scalable federated infrastructure for distributed knowledge graphs, enabling powerful queries, artificial intelligence models, and more.





# **Desired Attributes**

- accessible open participation,
- rapid response time,
- automated interoperability across domains, formats, and nomenclature,
- ever-improving support for cutting-edge AI,
- individualized confidence scores on results,
- scalability to large numbers of (sub-)graphs and large sizes for individual subgraphs,
- ability to leverage sensitive data while provably maintaining confidentiality,
- decentralization across premises and clouds,
- ease of use for nonexpert users via a natural language interface, and
- an emphasis on transparent ethics and governance.





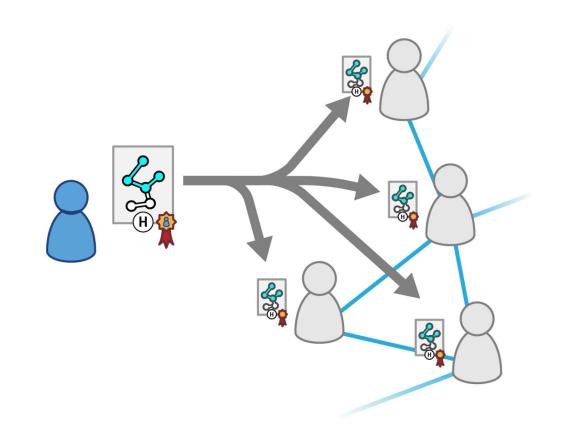
# **Distributed Architecture**

Each location participating in the distributed network as a subgraph storage site runs an instance of the software agent, which listens for queries and participates in responding to queries.

Graphs produced by the Theme 1 participants—and in future others—can reside at disparate locations. Support for decentralized hosting facilitates ease of onboarding of new datasets and redundancy.

Popular subgraphs will be cached in the primary cloud-based instance (FRINK) to ensure there are always live instances with those subgraphs.

Computation occurs locally at each instance.



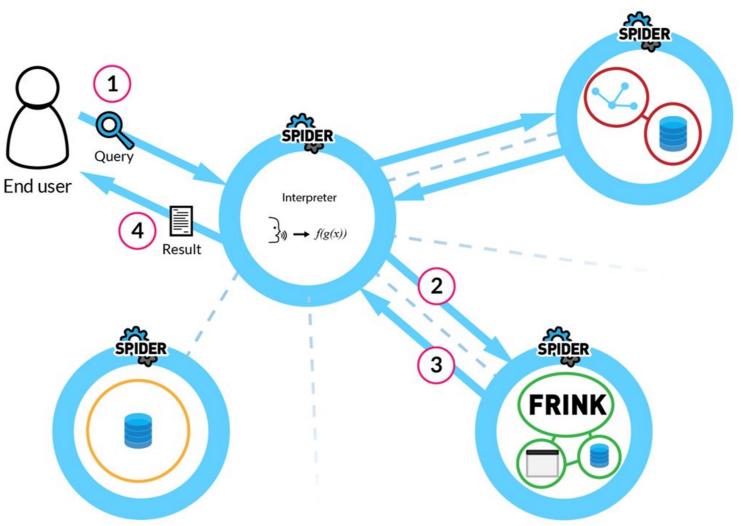




**Proto-OKN** 

# Query Interpretation

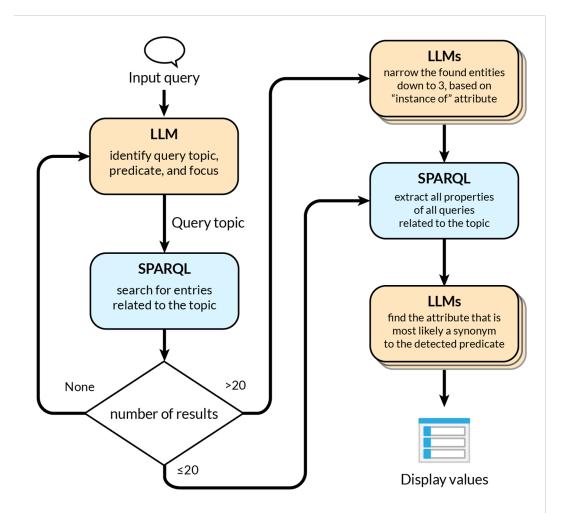
- Query sent to an "Interpreter" node, which leverages an LLM to convert the query to specific actions
- Interpreter invokes functionality at relevant instances
- 3. Response is returned for presentation preparation
- 4. Result presented to user







# KG Query Translation



Go from query to SPARQL to correct answer from KG

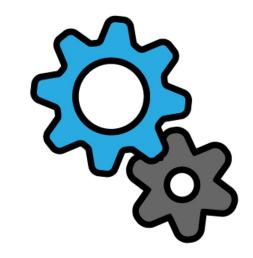
# Don't let the LLM use its own knowledge!

Not just an algorithmic/AI challenge, but also engineering



# **Computational Extensibility**

- Containerized capabilities can be disseminated to all network participants.
- Executed locally in a sandboxed environment.
- Easily create new format translation, querying, inference, or other functionality.
- Secondary goal is to help drive rapid prototyping.





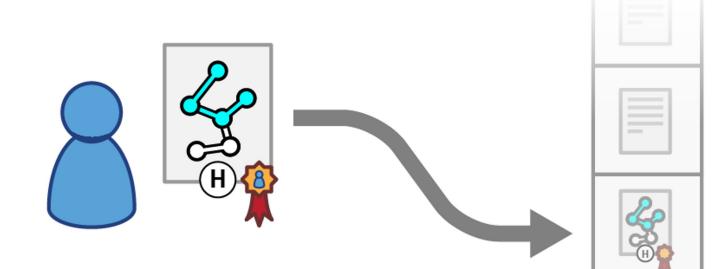


# Commitments / Provenance

A signed cryptographic commitment (hash) of a subgraph is committed to a blockchain / distributed ledger.

This allows anyone to verify, and prove, they are operating with authentic data (even if using a cache) and allows for versioning.

Commitments can also be made to processed outputs of data.

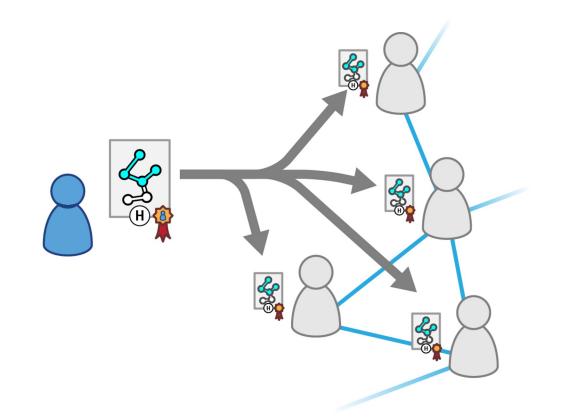




## Zero-Knowledge Proofs

Zero knowledge (ZK) proofs are a cryptographic technique through which a verifier can rapidly confirm that a computational result was produced by given code on given inputs, without needing to repeat the entire computation.

ZK proofs can allow efficient verification that a given graph query result is the correct result obtained from performing the requisite computation on authentic registered subgraphs that were signed and committed by their creators.

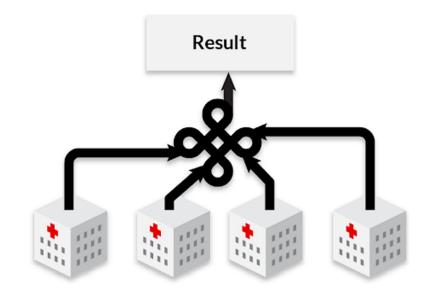




# Private/Confidential Data

For sensitive data, utilize cryptographic techniques that allows multiple parties to jointly perform computations without revealing their respective inputs to other participants or third parties.

We can even enable graph neural network training such that confidential subgraphs may contribute to a result while residing in a secure location, and without leaking sensitive information.

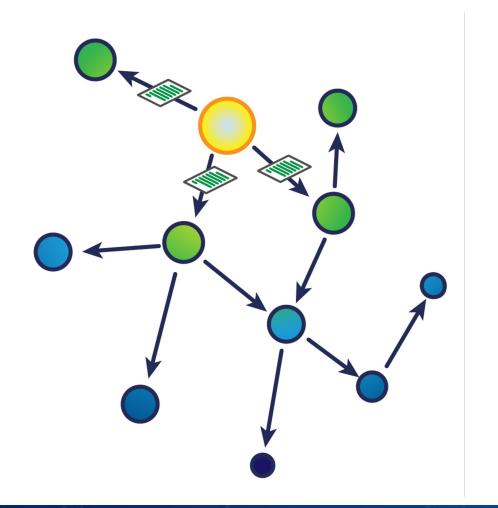


We have previously utilized MPC for healthcare data.





## Trust



Instead of having a central authority judge the reliability of each piece of information introduced to the system, instead focus on transparency and empowering users to judge source reliability.

Minimize the barrier to new participants providing data to the system, as we do not require a rigid gatekeeping process in order to prevent the new data from polluting overall results.



# Workshop Agenda

### 

• Chaitan Baru & Jemin George, TIP Directorate, National Science Foundation

### **Presentation by Theme 1 Groups focusing on**

Environment

- Lilit Yeghiazarian, University of Cincinnati
- Biology & Health
  - Sergio, Baranzini, University of California, San Francisco (UCSF)

o Justice

- Adam Pah, Georgia State University (GSU)
- Technology & Manufacturing
  - Farhad Ameri, Arizona State University (ASU)

### **Presentation by Theme 2: Proto-OKN Fabric**

o Chris Bizon, University of North Carolina at Chapel Hill (UNC) & Patrick Grinaway, Onai

### **Presentation by Theme 3: Proto-OKN Education and Public Engagement**

**Proto-OKN** 

• Cogan Shimizu, Wright State University



# EduGate: The Education Gateway to the Proto-OKN



Supported by:





# Our Team









<u>Cogan Shimizu</u> Antrea Christou Brandon Dave <u>Pascal Hitzler</u> <u>Hande Küçük</u> <u>McGinty</u> Joseph Zalewski <u>Florence Hudson</u> Lauren Close Emily Rothenberg <u>François Scharffe</u> <u>Thomas Deeley</u> Hugo Sureau Maru Wilson



# Overview

- Act as the entry point to the Proto-OKN
- Provide uniform access to richly integrated educational material, spanning
  - Technical concepts
  - Technology stacks (e.g., tutorials)
  - Individual use case documentation
- Engage stakeholders with detailed learner
   profiles that are optimized for different needs

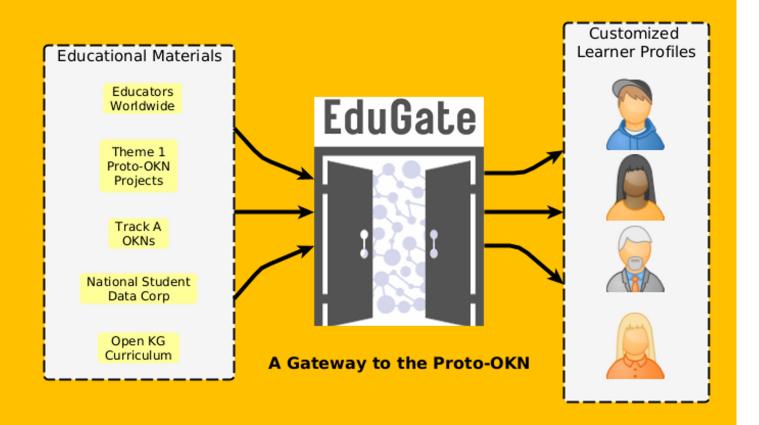




# Overview

EduGate is collecting education, training, outreach, and learning materials from:

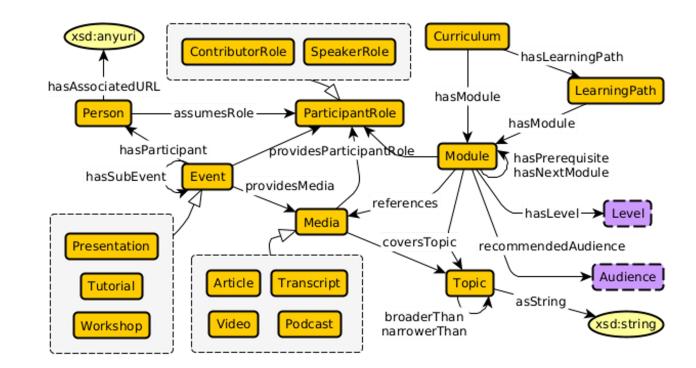
- educators around the world,
- our (Proto-)OKN colleagues,
- internal initiatives,
- our agency partners.





# Overview

- The Education Gateway will be organized through its own KG
  - That connects people and teams
  - To their educational material
  - And retains proper licensing and provenance
- Syllabi to videos to slidedecks are all easily incorporated





# Learner Profiles

### **Enthusiast**

#### **Contributor**

I am a graduate student pursuing my thesis. My research is in biomedical engineering, but my research path requires the use of Knowledge Graphs! However, I currently lack the background needed to implement the KG part of my research. I need something that can teach me the basics, but also fit into my busy research schedule.

At my organization, I am tasked with training junior data scientists; however, my organization uses a KG. I need to know how to standardize integration in the organization so junior data scientists can continue to grow out an existing knowledge graph as new data is gathered.

### **Developer**

I am a Data Scientist/ Engineer currently taking a new position where I need to know about KGs! As a developer, I am already proficient in the basics. While taking this new role in this project, I must add to my skills and preliminary knowledge to familiarize myself with KGs both in theory and in practice.

### **Executive**

I am the CTO for my organization, in charge of the overall technical direction of the applications and any R&D. I need rapid insights, e.g., regarding functionality and tradeoffs, into whether or not this technology is worth pursuing for our applications, and therefore worth investing time and funds for an optimal outcome.



# **Current & Future Working Groups**

WGs consist of a chair and liaison	<u>Census Data</u>	<b>Geospatial</b>	<u>LLMs</u>
Most meet biweekly	<ul> <li>Common representation and integration of demographic data</li> </ul>	<ul> <li>Common representation and integration of geospatial data</li> <li>Incorporating KWG data</li> </ul>	<ul> <li>Using LLMs with KGs</li> <li>Common set of UI/UX Patterns and Library</li> </ul>
Additional Groups will be founded on	Agency Bridge	Data & Al Ethics	Data Privacy



# Thanks!

Please direct offline questions to <a href="mailto:edugate@wright.edu">edugate@wright.edu</a>







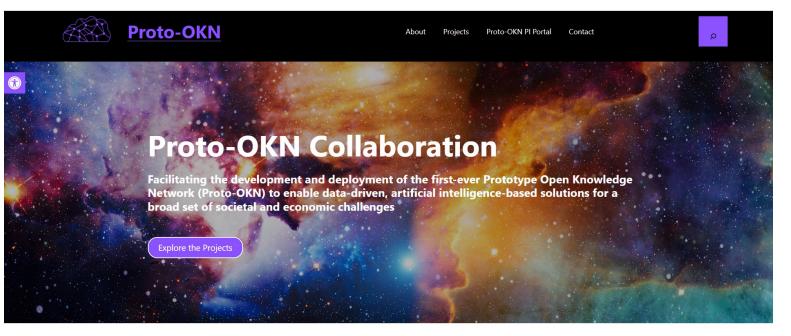




# Program Site: proto-okn.net

#### How to get involved?

- Attend any of the following:
- Outreach activities such as conferences/workshops
- Join one of the Working Groups
- o Join Slack channel





NSF invests \$26.7 million in building the first-ever prototype open knowledge network

okn@nsf.gov

Read the full NSF Press Release



