

# **Science Collaborative for Health disparities** and Artificial intelligence bias REduction



NIH Endorsed Common Data Elements



Think-a-Thons







#### ScHARe is a cloud-based population science data

**platform** designed to accelerate research in health disparities, health and healthcare delivery outcomes, and artificial intelligence (AI) bias mitigation strategies

#### ScHARe aims to fill four critical gaps:

- Increase participation of women & underrepresented populations with health disparities in data science through data science skills training, cross-discipline mentoring, and multi-career level collaborating on research
- Leverage population science, SDoH, and behavioral Big Data and cloud computing tools to foster a **paradigm shift** in healthy disparity, and health and healthcare delivery outcomes research
- Advance Al bias mitigation and ethical inquiry by developing innovative strategies and securing diverse perspectives
- Provide a data science cloud computing resource for community colleges and low resource minority serving institutions and organizations

### ScHARe



#### nimhd.nih.gov/schare



### ScHARe Data Ecosystem

Researchers can access, link, analyze, and export **a wealth of datasets** within and across platforms relevant to research about health disparities, health care outcomes and bias mitigation, including:

 Google Cloud Public Datasets: publicly accessible, federated, de-identified datasets hosted by Google through the Google Cloud Public Dataset Program

**Example**: American Community Survey (ACS)

- ScHARe Hosted Public Datasets: publicly accessible, deidentified datasets hosted by ScHARe
   Example: Behavioral Risk Factor Surveillance System (BRFSS)
- Funded Datasets on ScHARe: publicly accessible and controlled-access, funded program/project datasets using <u>Core Common Data Elements</u> shared by NIH grantees and intramural investigators to comply with the NIH Data Sharing Policy

**Examples**: Jackson Heart Study (JHS); Extramural Grant Data; Intramural Project Data

#### **OVER 240 DATA SETS CENTRALIZED**

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### Datasets are categorized by content based on the CDC **Social Determinants of Health categories**:

- 1. Economic Stability
- 2. Education Access and Quality
- 3. Health Care Access and Quality
- 4. Neighborhood and Built Environment
- 5. Social and Community Context

with the addition of:

- Health Behaviors
- Diseases and Conditions

Users will be able to map and link across datasets

### ScHARe Ecosystem: Google hosted datasets

Examples of interesting datasets include:

- American Community Survey (U.S. Census Bureau)
- US Census Data (U.S. Census Bureau)
- Area Deprivation Index (BroadStreet)
- **GDP and Income by County** (Bureau of Economic Analysis)
- US Inflation and Unemployment (U.S. Bureau of Labor Statistics)
- Quarterly Census of Employment and Wages (U.S. Bureau of Labor Statistics)
- **Point-in-Time Homelessness Count** (U.S. Dept. of Housing and Urban Development)
- Low Income Housing Tax Credit Program (U.S. Dept. of Housing and Urban Development)
- US Residential Real Estate Data (House Canary)
- Center for Medicare and Medicaid Services Dual Enrollment (U.S. Dept. of Health & Human Services)
- **Medicare** (U.S. Dept. of Health & Human Services)
- Health Professional Shortage Areas (U.S. Dept. of Health & Human Services)
- CDC Births Data Summary (Centers for Disease Control)
- COVID-19 Data Repository by CSSE at JHU (Johns Hopkins University)
- COVID-19 Mobility Impact (Geotab)
- COVID-19 Open Data (Google BigQuery Public Datasets Program)
- COVID-19 Vaccination Access (Google BigQuery Public Datasets Program)

### **Data Ecosystem Structure**

FEDERATED PUBLIC DATA 240+ (Population Science/ SDoH / Behavioral)

Hosted by Google & by ScHARe

ScHARe

REPOSITORY

**CDE FOCUSED** 

CDEs enhances Data Interoperability (Aggregation) by using semantic standards and concept codes

Innovative Approach: CDE Concept Codes Uniform Resource Identifier (URI)

### **Components** Terra Interface

#### Intramural & Extramural Resource







### Project & federated dataset mapping of ScHARe CDEs



### PREPARING FOR AI – RESEARCH AND HEALTH CARE USING BIG DATA

### Mapping across cloud platforms with Terra Interface





### **Terra Interface: Data Sets and Access to Data**

Rate: < \$0.01

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### **Analyses**

Tab in **ScHARe** workspace, the notebook 00 List of **Datasets** Available on **ScHARe** lists all of the datasets available in the ScHARe Datasets collection

#### What?

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This notebook is intended to provide a comprehensive list of the datasets available in the SHARe Data Ecosystem for analysis in the SHARe Tata instance. Using the SHARe Data Ecosystem, researchers are able to search, link share, and contribute to a collection of datasets relevant to social science, health outcomes, minority health and health disparities research. The collection is comprised of:

Google Cloud Public Datasets - Publicly accessible, federated, de-identified datasets hosted by Google through the Google Cloud Public Dataset Program. Examples: US Cerous Data: American Community Survey (ACS)
 ScHARe Hosted Public Datasets - Publicly accessible, de-identified datasets hosted by SchaRe Lagraphics Social Winerability Index (SNI), Behavioral Risk Factor Surveillance: System (BPSS)
 Funded Datasets - Publicly accessible and controlled-access. funded program/project datasets shared by NH grantees and intramural investigators to comply with the NH Data Sharing Policy. Example: Jackson Heart Study (JHS).

A detailed list of the datasets available in the ScHARe Data Ecosystem, including links to documentation and other helpful resources for each dataset, is available in the sections below. The datasets are categorized as follows based on their content:

#### A - SOCIAL DETERMINANTS OF HEALTH

- A1 Multiple Categories: Datasets that include data on multiple Social Determinants of Health (SDoH) factors/indicators
- A2 Economic Stability: Datasets that include data on unemployment, poverty, housing stability, food insecurity and hunger, work related injuries, etc.
- A3 Education Access and Quality Datasets that include data on graduation rates, school proficiency, early childhood education programs, interventions to address developmental delays, etc.
- At Health Care Access and Quality Datasets that include data on health literacy, use of health 11 emergency room waiting times, evidence-based preventive healthcare, health screenings, treatment of substance use disorders, family planning envices, access to a primary care provider and high quality care, access to telehealth and electronic exchange of health information, access to health insurance, adequate oral care, adequate prevatal care, STD prevention measures, etc.
- 45 Heighborhood and Built Environment Dataets that include data on access to broadband internet, access to safe water supples, toxic pollutants and environmental risks, air quality, blood lead levels, deaths from motor vehicle crashes, asthma and COPD cases and hospitalizations, noise exposure, smoking, mass transit use, etc.
- A6 Social and Community Context Datasets that include data on crime rates, imprisonment, resilience to stress, experiences of racism and discrimination, etc. For incidence and prevalence of anxiety, depression, and
  other mental health conditions, see section '81 Diseases and conditions' below
- A7 Health Behaviors Datasets that include data on health behaviors

#### B - HEALTH OUTCOMES

Where? Data Tab in ScHARe workspace, data tables help access ScHARe data and keep track of your project data:

- ScHARe workspace, click on the Data tab
- Under Tables, see a list of dataset categories
- Click on a category, to see a list of relevant datasets
- Scroll to the right to learn more about each dataset

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NeighborhoodAndBuiltEnvironment (10)			ECPP_EarlyChildhoodProgramParticip	Education Access and Quality
SocialAndCommunityContext (4)			ECPP_EarlyChildhoodProgramParticip	Education Access and Quality
REFERENCE DATA	v	П	MathematicsAssessments LocalEduc	(

### **Terra Interface: Secure workspace**

/orkspaces 🚯	User email
dicated spaces for you and your collaborators to access and analyze da	Add people or groups ADD
Recently Viewed	Current Collaborators
ScHARe ScHARe Thi Viewed Apr 14, 2023, 11:58 AM ScHARe Thi	n calzonil2@nih.gov Owner ✓ Can share ✓ Can compute
Search by keyword	ScHARe-Contractors@firecloud.org
Name	ScHARe-Read-Only-Access@firecloud.org
🚖 ScHARe	

- Secure workspace
   for self or
   collaborative
   research
- Assign roles: review or admin
- Host own data and code

# Terra Interface: Notebooks for Analytics & Tutorials

### Workflows Modular codes

= 💿	WORKSPA	Workspaces > ScHARe/ScHARe > CES Analyses
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Your An	alyses +	START
Applicat	tion	Name 1
pupyter	Jupyter	00_List of Datasets Available on ScHARe.ipynb
pupyter	Jupyter	01_Introduction to Terra Cloud Environment.ipynb
pupyter	Jupyter	02_Introduction to Terra Jupyter Notebooks.ipynb
, supyter	Jupyter	03_R Environment setup.ipynb
pupyler	Jupyter	04_Python 3 Environment setup.ipynb
pupyter	Jupyter	05_How to access plot and save data from public BigQuery datasets using R.ipynb
upyter	Jupyter	06_How to access plot and save data from public BigQuery datasets using Python 3.ipynb

#### Easy to Use--Cut and Paste Analytics

	Workspaces > SCHARe/ScHARe >
	Suggested Workflows
DASHBUARD DATA ANALYS	haplotypecaller-gvcf-gatk4
Find a Workflow	on a single sample
•	mutect2-gatk4 Implements GATK4 Mutect 2 on a single tumor- normal pair
	processing-for-variant-discovery-gatk4
	Find Additional Workflows
	Dockstore Browse WDL workflows in Dockstore, an open platform used by the GA4GH for sharing Docker- based workflows

- Modular codes developed for reuse
- Adding SAS

# What are Think-a-Thons?





### Think-a-Thons (TaT)

- Monthly sessions (2 1/2 hours)
- Instructional/interactive
- Designed for new and experienced users
- Research & analytic teams to:
  - Conduct health disparities, health outcomes, bias mitigation research
  - Analyze/create tools for bias mitigation
- Publications from research team collaboration
- Networking
- Mentoring and coaching
- Focus:

Types: ✓ Instructional / Tutorial ✓ Collaborative Research Teams ✓ Bias mitigation

### ScHARe

Think-a-Thon

Artificial Intelligence and Cloud Computing Basics

Terra: Datasets and Analytics

**Register:** 



bit.ly/think-a-thons

#### **Think-a-Thon Tutorials** Web: <a href="http://bink-a-thons">bit.ly/think-a-thons</a>

February	Artificial Intelligence and Cloud Computing 101
March	ScHARe 1 – Accounts and Workspaces
April	ScHARe 2 – Terra Datasets
Мау	ScHARe 3 – Terra Google-hosted Datasets
June	ScHARe 4 – Terra ScHARe-hosted Datasets
July	An Introduction to Python for Data Science – Part 1
August	An Introduction to Python for Data Science – Part 2
September	ScHARe 5: A Review of the ScHARe Platform and Data Ecosystem
October	Preparing for AI 1: Common Data Elements and Data Aggregation
November	Preparing for AI 2: An Introduction to FAIR Data and AI-ready Datasets
January	Preparing for AI 3: Computational Data Science Strategies 101
February	Preparing for AI 4: Overview Prep for AI Summary with Transparency, Privacy, Ethics

ScHARe for Educators (Community Colleges & Low Resource MSIs) ScHARe for American Indian / Alaska Native Researchers ScHARe for Coders and Programmers to conduct Research





### Think-a-Thons Training/Mentoring Pipeline



#### Goal: "Upskilling"

- ✓ Data science specialist into health disparities and health outcomes research
- ✓ Health Disparity/Outcomes researchers into using big data and cloud computing

#### Target Audience:

- ✓ Underrepresented populations (women, race/ethnic) users not trained in data scien
- ✓ Data scientist with no or little research experience.
- ✓ Resource & Tool for Community Colleges and Low Resource MSIs and Organizations



### **Research Teams**

Title: Data Science Projects 1 – Health Disparities and Individual SDoH

Description: Exploring the impact of individual Social Determinants of Health on health outcomes: a hands-on session for researchers and students at all levels interested in collaborating on ScHARe to develop innovative research questions and projects leading to publications.

Title: Data Science Projects 2 - Health Disparities and Structural SDoH

Description: Assessing the impact of structural Social Determinants of Health on health outcomes: a hands-on session for researchers and students at all levels interested in collaborating on ScHARe to develop innovative research questions and projects leading to publications.

Title: Data Science Projects 3 – Health Outcomes

Description: Investigating the influence of non-clinical factors on disparities in health care delivery: a hands-on session for researchers and students at all levels interested in collaborating on ScHARe to develop innovative research questions and projects leading to publications.

- Foster a research paradigm shift to use Big Data
- Promote use of Dark Data

- Multi-career (students to sr. investigators)
- Multi-discipline (data scientist & researchers)
- Feature Datasets with Guest Expert Leads
- Secure experts in topic area, analytics, data sources etc. to provide guidance
- Generate research idea decide potential design, datasets & analytics
- Select co-leads to coordinate completion outside of TaT
- Publications

#### Register:



#### bit.ly/think-a-thons

# ScHARe CDE Adoption:

Making Data Interoperable (URI Approach) Concept Code Mapping (Harmonization)





### **Adopted CDEs to:**

- Standardize data for people & computers (human and machine readable)
- Enable data sharing across studies (data interoperability)
- Enhance data interpretation & analysis (semantically defined and standardized coded)
- Simplify collaboration
- Reduces project start-up & results time

#### **BIG DATA AND AI: REQUIRES NEW** APPROACHES FOR COLLECTION, MANAGEMENT, ANALYSIS



Covid revealed the need to have real time data



### **Core Common Data Elements Working Group**

### **NIMHD Extramural**

- Barksdale, Crystal
- Calzoni, Luca\*
- Dinwiddie, Gniesha
- Doose, Michelle
- Duran, Deborah\*
- Linares, Deborah
- Le, Phuong-Tu
- Sidhu, Simrann

### **NIMHD Intramural**

- Choi, Kelvin
- Strassle, Paula

### **NINR Extramural**

- Grason, John
- Hawes, Rebecca

#### **NINR Intramural**

• Steele, Michael

### **CDE and/or Health Disparities Experts:**

- McAuliffe, Matthew (CIT)
- Mendoza-Puccini, Carolina (NINDS)
- Alvidrez, Jennifer (NIH/OD)

# ScHARe "CORE" CDE Development

### **Core Set:**

- Few critical questions required from all studies/sites
- Minimal burden
- Allows for questions to be asked in any way, but reported in a standardized format
- Allows for any number of other questions to be collected as collector chooses

### Criteria:

- PhenX Toolkit first
- Validated source
- Adaptation of a validated source
- Generate new gap area CDE

### ScHARe CDEs Defined and Coded – URI Approach

#### Education

What is the highest level of education you have completed?

<u>Shared Semantics and Concept Code</u>: An indication of the years of schooling completed in graded public, private, or parochial schools, and in colleges, universities, or professional schools. **C17953**  URI approach in data repository uses codes to harmonize data rather than semantics. This improves data interoperability.

\*Survey Questions become CDEs when they are semantically defined by a standardized coding system for shared meaning and in a format that is human and machine readable for ease of reuse

### How a Survey Question Became a CDE

Please select the racial category or <u>categories</u> with which you most closely identify. (select all that apply)

- American Indian or Alaska Native
- Asian or Asian American
- Black or African American
- Hispanic or Latino
- Native Hawaiian or Other Pacific Islander
- Middle Eastern or North African (in current reporting tables will be reported as white)

Survey Questions become CDEs when they are:

- semantically defined by a standardized coding system for shared meaning
- in a format that is human and machine readable for ease of reuse

□ White

### Making of a CDE from a Protocol/Question

Need a standardized defined concept and related code. Source: NCI Thesaurus

**Race/Ethnicity Self-Identification** 

A textual description of a person's race. C17049 |The ethnicity of a person. C16564 | An individual's perspective or subjective interpretation of an event or information. C74528

American Indian or Alaska Native | Asian or Asian American | Black of African American | Hispanic, Latino, or Spanish | Native Hawaiian or Other Pacific Islander | Middle Eastern or North African | White URI approach in data repository uses codes to harmonize data rather than semantics. This improves data interoperability.

### Making of a CDE from a Protocol/Question

- A person having origins in any of the original peoples of North and South America (including Central America) and who maintains tribal affiliation or community attachment. (OMB) C41259 |
- A person having origins in any of the original peoples of the Far East, Southeast Asia, or the Indian subcontinent, including for example, Cambodia, China, India, Japan, Korea, Malaysia, Pakistan, the Philippine Islands, Thailand, and Vietnam. (OMB) C41260
- A person having origins in any of the Black racial groups of Africa. Terms such as "Haitian" or "Negro" can be used in addition to "Black or African American". (OMB) C16352 |
- A person of Cuban, Mexican, Puerto Rican, South or Central American, or other Spanish culture or origin, regardless of race. The term, "Spanish origin" can be used in addition to "Hispanic or Latino". (OMB) C17459
- A person having origins in any of the original peoples of Hawaii, Guam, Samoa, or other Pacific Islands. (OMB) C41219
- Denotes a person having origins in the region of southwest Asia, between the India subcontinent and Europe, including Kuwait, Turkey, Lebanon, Israel, Iraq, Iran, Jordan, Saudi Arabia, lands east of Pakistan or the other countries of the Arabian Peninsula. Also includes people of Jewish ethnicity including Sephardic and Ashkenazic. C77820:
- Denotes a person whose ancestry is in any of the countries of the northern part of the African continent: Algeria, Egypt, Libya, Morocco, Sudan, Tunisia, and Western Sahara. C126529
- A person having origins in any of the original peoples of Europe, the Middle East, or North Africa. (OMB) C41261

### Making of a CDE from a Protocol/Question

Need a standardized defined concept and related code. Source: NCI Thesaurus

American Indian or Alaska Native C41259 Asian or Asian American C41260 Black of African American C16352 Hispanic, Latino, or Spanish C17459 Native Hawaiian or Other Pacific C41219 Islander C43866 Middle Eastern or North African C41261 White



### Matched CDE

Income (Project 1)

Less than \$10,000 | -\$10,000-\$24,999 | -\$25,000-\$34,999 | -\$35,000-\$49,999 | -\$50,000-\$74,999 | -\$75,000-\$99,999 | \$100,000-\$149,999 | \$150,000-\$199,999 | Income (Project 2)

Less than \$10,000 | \$10,000-\$24,999 | \$25,000-\$34,999 | \$35,000-\$49,999 | \$50,000-\$74,999 | \$75,000-\$74,999 | \$100,000-\$149,999 | \$150,000-\$199,999 | \$200,000 or more



Reported this way

Collected this way

### Mappable CDE

Income (Project 1)

Less than \$10,000 | \$10,000-\$24,999 | = \$25,000-\$34,999 | = \$35,000-\$49,999 | = \$50,000-\$74,999 | \$75,000-\$74,999 | \$100,000-\$149,999 | \$150,000-\$199,999 | \$200,000 or more

Reported this way

#### Income (Project 2)

Less than \$10,000 | \$10,000-\$19,999 | \$20,000-\$29,999 \$30,000-\$39,999 | \$40,000-\$49,999 \$50,000-\$59,999 \$60,000-\$69,999 \$70,000-\$79,999 \$80,000-\$89,999 \$90,000-\$99,999 |

\$200,000 or more

Collected this way

# Mapped using algorithms



### ScHARe CDEs in Survey Format





#### For FUNDED PROJECT DATA – Common Data Elements Centralized for Interoperability and Data Sharing

- Age
- Birthplace
- Zip Code
- Race and Ethnicity
- Sex
- Gender
- Sexual Orientation
- Marital Status
- Education
- Annual Household Income
- Household Size

- English Proficiency
- Disabilities
- Health Insurance
- Employment Status
- Usual Place of Health Care
- Financial Security / Social Needs
- Self Reported Health
- Health Conditions (Associated Medications/Treatments)

\*\*NIMHD Framework\*\*Health Disparity Outcomes

(\*\* project level CDE)

### NIH CDE Repository: <a href="https://cde.nlm.nih.gov/home">https://cde.nlm.nih.gov/home</a>

Cross-walked with PhenX SDoH

NIH-endorsed CDEs have been reviewed and approved by an expert panel, and meet established criteria. They are designated with a gold ribbon.





# Thank You

#### **Next Think-a-Thons:**



bit.ly/think-a-thons

**Register for ScHARe:** 





#### bit.ly/join-schare

durande@mail.nih.gov or luca.calzoni@nih.gov