

*CMSS Presents:*

# **Deploying Cloud-based Platforms and Analytic Tools to Support Covid-19 and Beyond**

August 6, 2020 | 12:00 – 1:30 pm ET



CMSS WEBINAR SERIES

Advancing Clinical Registries to Support Pandemic Treatment and Response



CMSS WEBINAR SERIES

## Advancing Clinical Registries to Support Pandemic Treatment and Response

The series will address key questions related to the rapid development, deployment and implementation of Covid-19 focused clinical registries and clinical repositories by specialty societies and academia.

SUMMER 2020 | FREE TO ATTEND

### About the Series:

---

- Made possible with funding from the Gordon and Betty Moore Foundation
- To foster collaboration between specialty societies and academia, we are grateful to collaborate with the Association of Academic Medical Colleges

### Continue the Conversation:

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- Use #COVIDRegistries when tweeting about the webinar series
- Follow @CMSSMed and visit [CMSS.org](https://www.cmss.org) for frequent updates



CMSS WEBINAR SERIES

Advancing Clinical Registries to Support Pandemic Treatment and Response

Today's Webinar:

Deploying Cloud-based  
Platforms and Analytic  
Tools to Support Covid-19  
and Beyond

Moderator:



**William J. Marks, Jr**  
**MD, MS-HCM**

Head of Clinical Science & Head of  
Neurology, Verily Life Sciences;  
Adjunct Clinical Professor of  
Neurology & Neurological  
Sciences, Stanford University  
School of Medicine

Panelists:



**David Glazer**  
Engineering Director  
Verily Life Sciences



**Andrea Ramirez, MD**  
Assistant Professor of Medicine,  
Vanderbilt University of  
Medicine

Host:



**Helen Burstin, MD, MPH, MACP**  
Chief Executive Officer  
Council of Medical Specialty  
Societies (CMSS)



**Chris Trembl**  
Director of Operations, Data  
Science Institute, American  
College of Radiology



# Biomedical Analysis in the Cloud

multi-modal, multi-source, multi-tool, multi-use

David Glazer, Verily Life Sciences  
CMSS Webinar, 6-aug-2020





**Surveys**



**Images**



**Sensors**



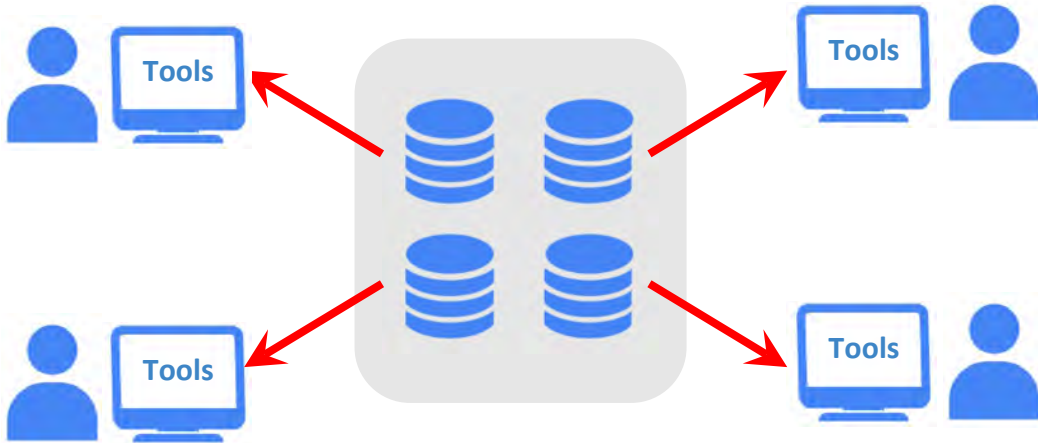
**Clinical**



**Molecular**

# Traditional approach

Bring data to researchers

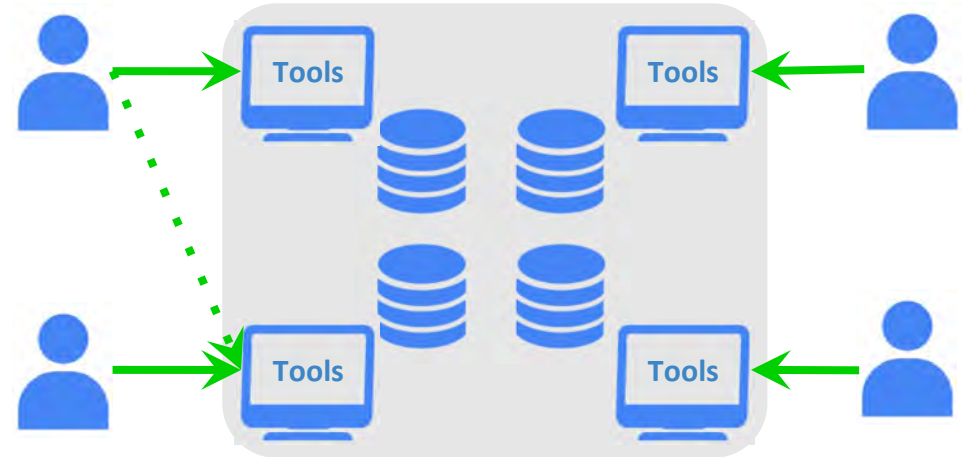


## Discourages shared research

- “Weakest link” security
- Huge infrastructure needed
- Pay for multiple copies
- Bespoke & unsupported tools

# Cloud-centric approach

Bring researchers to data



## Facilitates collaboration

- Centralized security controls
- Accessible to all researchers
- Decreased cost of storage
- Shared tool ecosystem

# Uniting the biomedical ecosystem



[DataBiosphere.org](http://DataBiosphere.org)

## Vision

---

Enable the next generation of collaborative biomedical research

## Principles

---

### Modular

composed of functional components with well-specified interface

### Community driven

created by many groups to foster a diversity of ideas

### Open

open-source licenses, software, arch to enable extensibility & reuse

### Standards based

consistent with standards developed by coalitions such as GA4GH



Terra is a scalable  
& secure  
platform for  
biomedical researchers  
to access data,  
run analysis tools,  
and collaborate.

# Terra's Value Proposition

---

## Integrated **data**

Platform enables the integration and secure access of disparate data types and datasets, reducing data latency, costs, quality issues, and inefficiencies associated with fragmentation

---

## Integrated **tools**

Platform integrates proprietary and third-party tools to run leading batch and interactive analysis, reducing the challenges associated with multiple systems and frameworks

---

## Collaborative **workspaces**

Platform enables rich collaboration with sophisticated provenance, security controls, and compliance for faster and more effective analysis within and across organizations

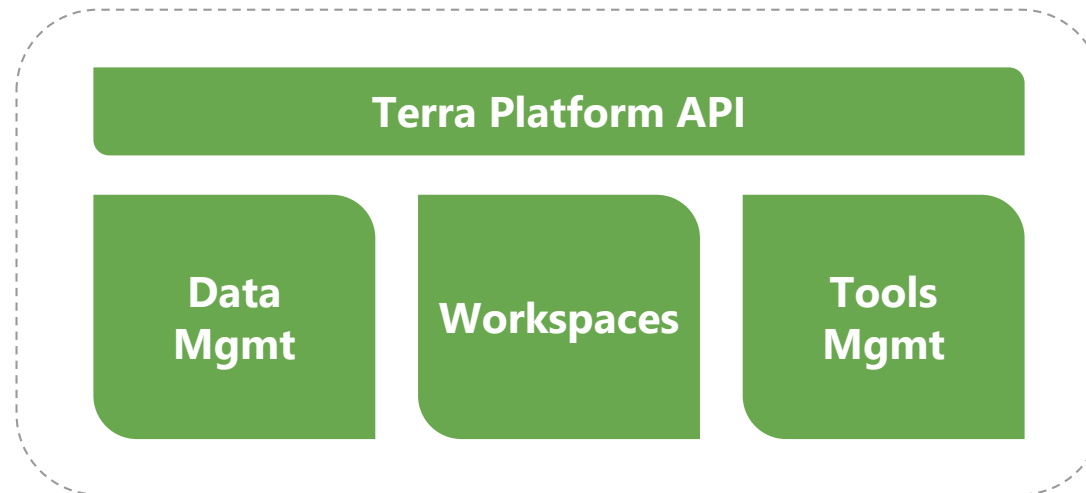
# Terra's architecture primarily serves 3 roles



**Biomedical  
Researchers**



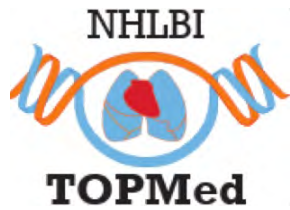
**Data  
Generators**



**Tool  
Developers**



# Partners & Datasets



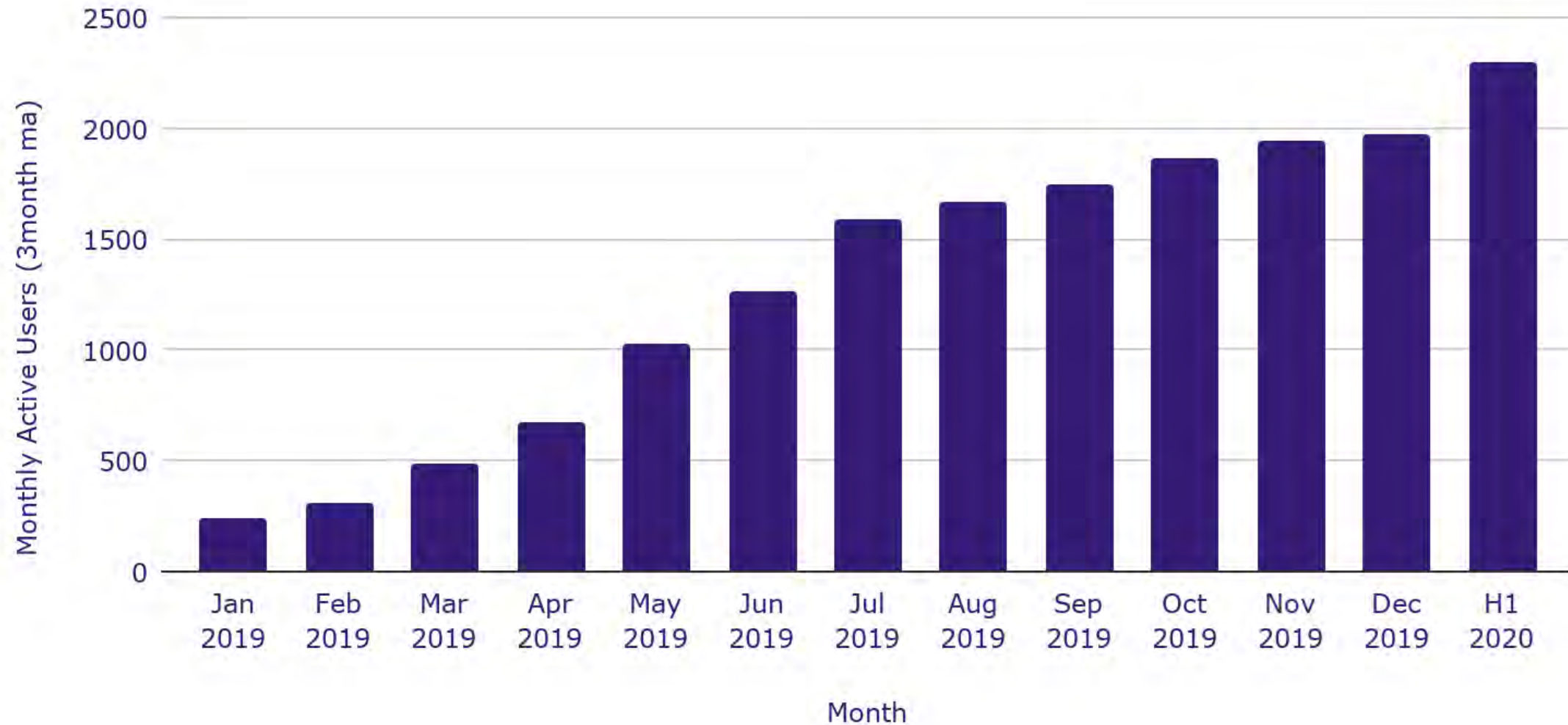
# Tools currently available in Terra



Cromwell



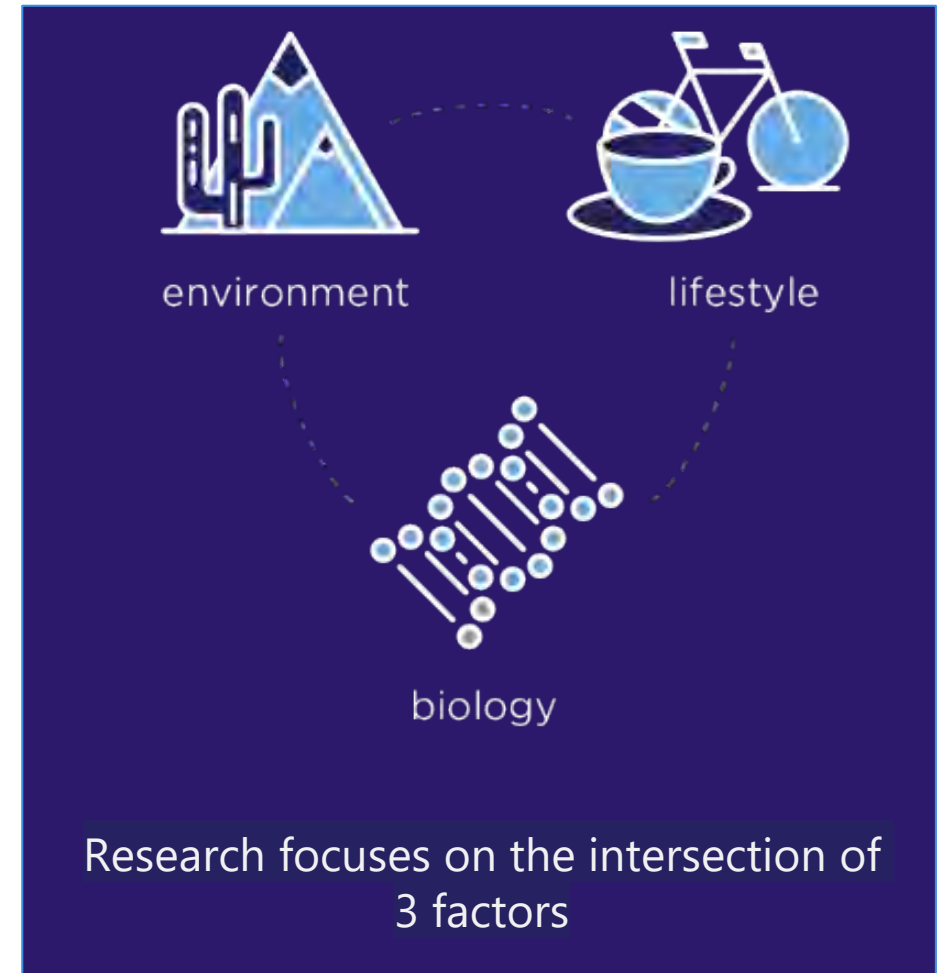
# Thousands of researchers use Terra every month to analyze biomedical data



**Terra use case:**  
***All of Us* Research Program**

# All of Us Research Program

- Engage **1,000,000 or more** U.S. research participants
- Share **tissue** samples, **genetic** data, **lifestyle** information, electronic **health records**
- Pioneer a new model of research that emphasizes **engaged research participants, responsible data sharing, and privacy protection**

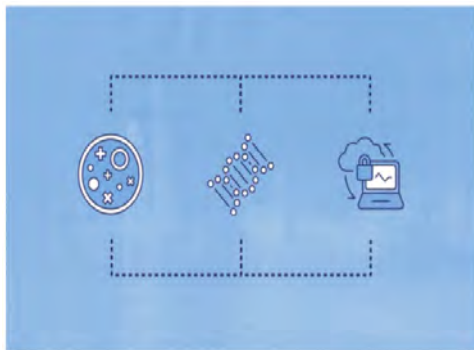




# All of Us Program Components



Health Care Provider Organizations



Genome Centers



Data and Research Center

VANDERBILT UNIVERSITY  
MEDICAL CENTER



Biobank



Participant Technology Systems Center

# Data Curation Process



DATA SOURCES



DATA HARMONIZATION



DATA REFINEMENTS



CURATED DATA REPOSITORY



DATA DICTIONARY

# All of Us Research Program Begins Beta Testing

May 27, 2020

## Researchers Invited to Give Feedback on Initial Dataset and Tools

Español

In partnership with our participants—now nearly 350,000 and counting—we're working to build one of the world's largest and most diverse datasets to advance health research. Today, I'm happy to announce that we've opened our research platform, the *All of Us Researcher Workbench* [↗](#), for beta testing. Now, researchers can begin using our initial dataset and tools in studies and tell us what's working and what we can improve. This moment is an important step in our effort to accelerate new discoveries.



**350,000+**

Participants



**211,000+**

Electronic Health Records



**277,000+**

Biosamples Received



# Research Hub → Researcher Workbench



PUBLIC



RESTRICTED



[Data Browser >](#)



[Survey Explorer >](#)



[Help Desk >](#)



**REGISTERED  
RESEARCHERS >**

## RESEARCHER WORKBENCH



[Data Dictionary >](#)



[Cohort Builder >](#)



[Notebooks >](#)

[...and more! >](#)

# Welcome to the Workbench

The screenshot displays the All of Us Researcher Workbench interface. At the top left is the logo "All of Us RESEARCHER WORKBENCH". Below it, a welcome message reads "Welcome to the RESEARCHER WORKBENCH" followed by "The secure platform to analyze All of Us data" and three circular icons representing data, people, and research. The main content area is divided into three sections: "Workspaces" with a plus icon, "Recently Accessed Items", and "Quick Tour and Videos".

**Workspaces** (+)

- Featured Workspace: Dementia (OWNER, Last Changed: 02/11/20, 07:32 PM)
- All of Us Survey Codebook and Frequency Distributions (OWNER, Last Changed: 02/11/20, 07:51 PM)
- Featured Workspace: Depression (OWNER, Last Changed: 02/11/20, 07:50 PM)
- Featured Workspace - Type 2 Diabetes (OWNER, Last Changed: 02/11/20, 07:50 PM)

**Recently Accessed Items**

- Case 1 Notebook (Notebook, Last Modified: Mar 06 2020)
- Dementia Analysis from Cohort Builder (Notebook, Last Modified: Feb 04 2020)
- Ischemic Heart Disease Analysis (Notebook, Last Modified: Feb 04 2020)
- Dementia Analysis (Notebook, Last Modified: Feb 04 2020)
- Type 2 Diabetes Analysis (Notebook, Last Modified: Feb 04 2020)
- Ischemic Heart Disease Analysis (Notebook, Last Modified: Jan 31 2020)

**Quick Tour and Videos**

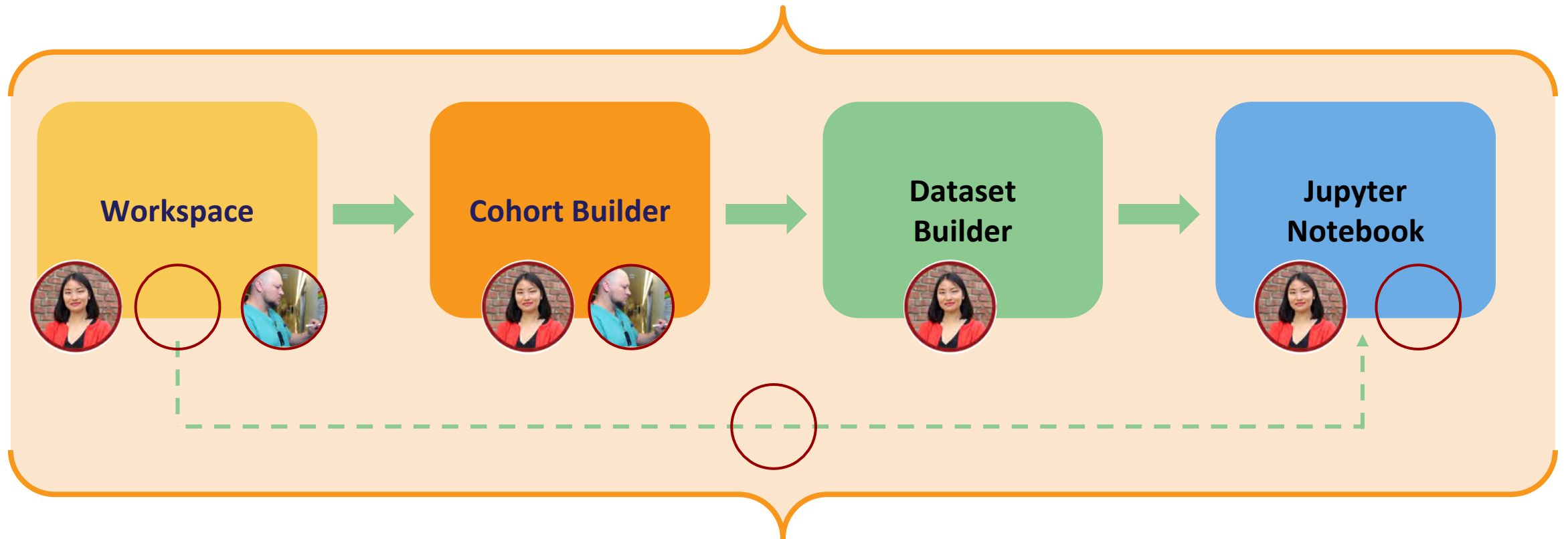
- Workbench Quick Tour (3:01)
- Cohorts Overview (3:01)
- Notebooks Overview (3:07)

**Footer:** All of Us RESEARCH PROGRAM | The Precision Medicine Initiative | RESEARCHER WORKBENCH | Copyright ©2018 | Privacy Policy | Terms of Service

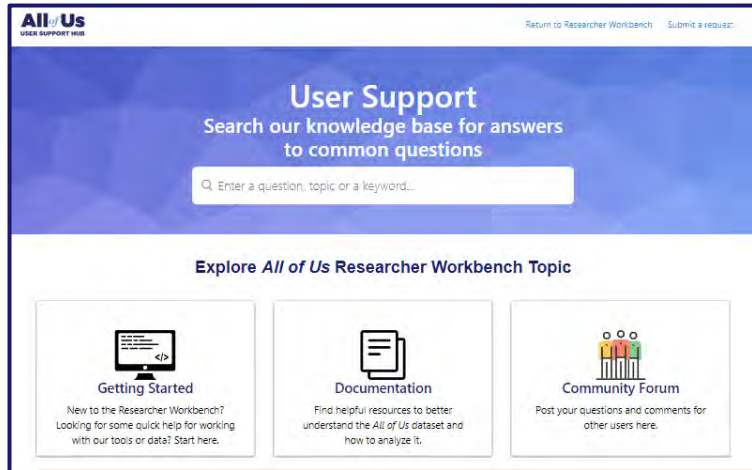
The Workbench *contains* the tools researchers need to learn about, access and analyze *All of Us* data.

# Collaborative Workspaces

Within the Researcher Workbench, researchers run analyses, individually or collaboratively, in “Workspaces.”



# Researchers have access to integrated support



**All of Us**  
USER SUPPORT HUB

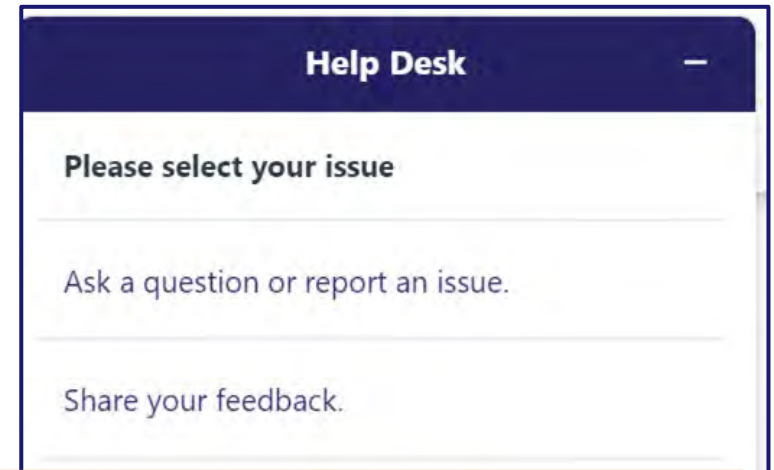
Return to Researcher Workbench | Submit a request

## User Support

Search our knowledge base for answers to common questions

Explore *All of Us* Researcher Workbench Topic

- Getting Started**  
New to the Researcher Workbench? Looking for some quick help for working with our tools or data? Start here.
- Documentation**  
Find helpful resources to better understand the *All of Us* dataset and how to analyze it.
- Community Forum**  
Post your questions and comments for other users here.

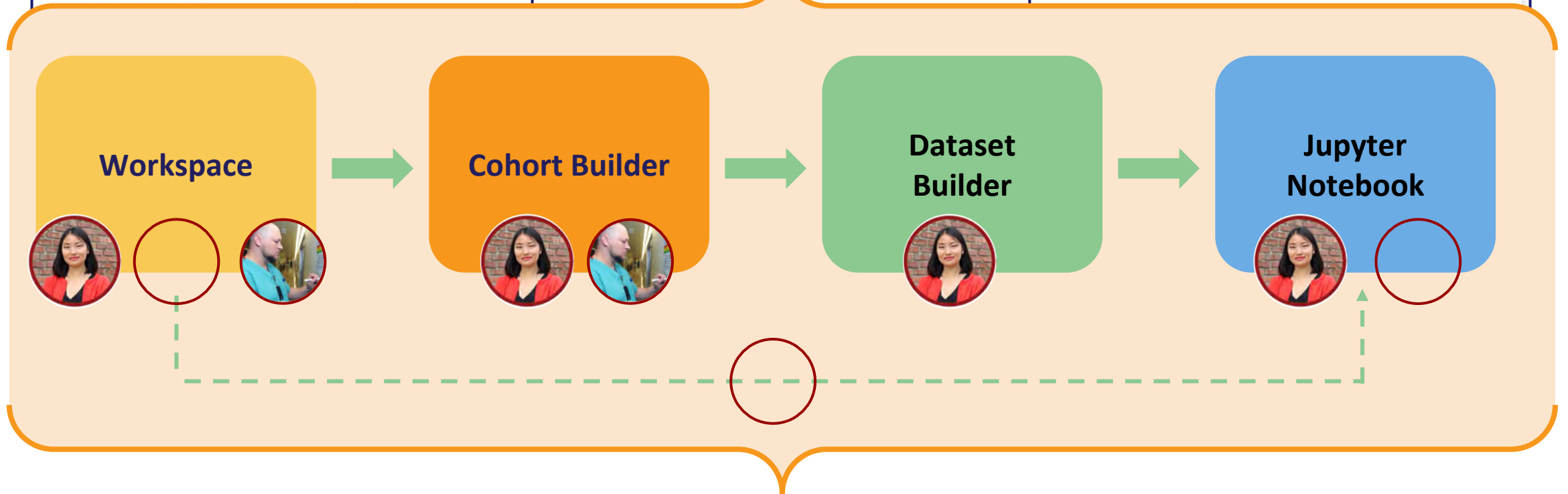


## Help Desk

Please select your issue

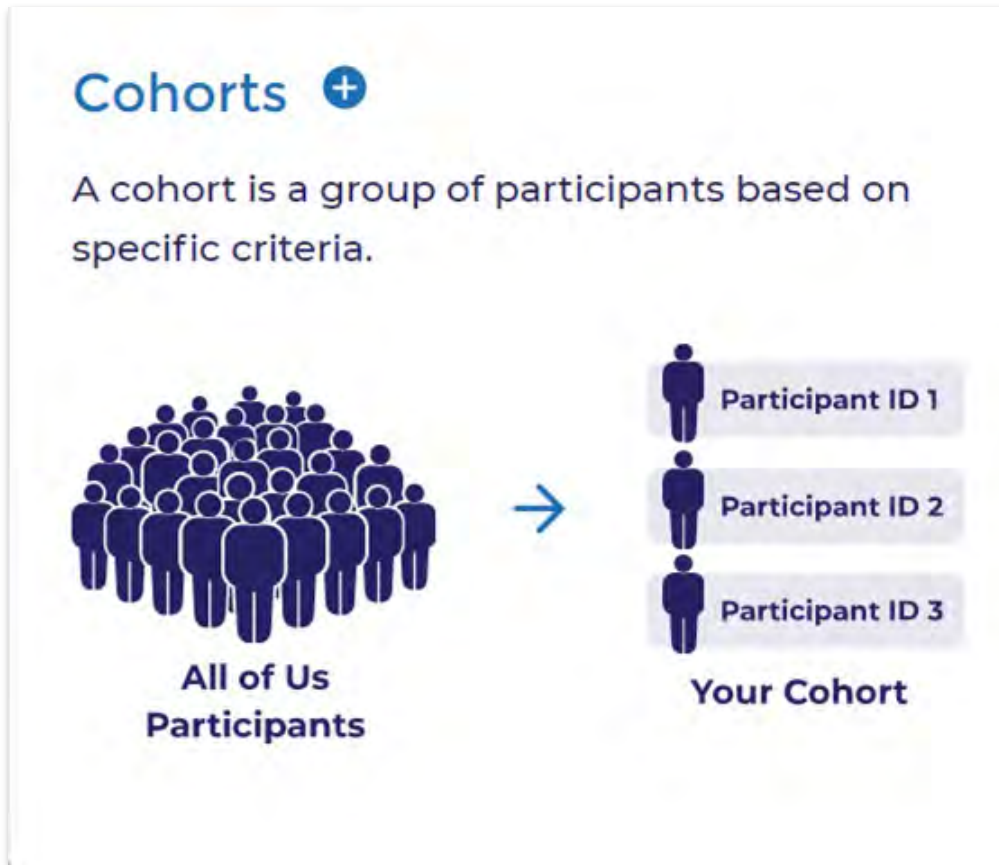
Ask a question or report an issue.

Share your feedback.



# Cohort Builder: Select Participant Groups

- Once you create your workspace, you can create a cohort for your study using Cohort Builder, where you will select participants to include or exclude from your study based on criteria of interest for your research



**Cohort Name**  
Mental Health Cohort

**Date created**  
2020-04-16

**Created By**  
alphaparrottstable@stable.fake-research-aou.org

**Dataset**  
Synthetic Dataset v2

**Cohort Definition**

Drugs | RXNORM | 36437  
OR  
Conditions | SNOMED | Parent 370143000

**EXCLUDING**

Demographics | Gender | Gender Identity - MALE  
OR  
Demographics | Race | Race - American Indian or Alaska Native

**Charts**

Demographics \* synthetic data

**Demographics**

Demographic	Count
FEMALE 18-44	~400
FEMALE 45-64	~1700
FEMALE > 65	~600

The screenshot shows the configuration panel for a cohort. It includes fields for Cohort Name, Date created, Created By, and Dataset. The Cohort Definition section shows inclusion criteria: Drugs | RXNORM | 36437 OR Conditions | SNOMED | Parent 370143000. The EXCLUDING section shows exclusion criteria: Demographics | Gender | Gender Identity - MALE OR Demographics | Race | Race - American Indian or Alaska Native. Below the configuration is a 'Charts' section with a 'Demographics' chart. The chart is a horizontal bar chart showing the distribution of participants by age group: FEMALE 18-44, FEMALE 45-64, and FEMALE > 65. A tooltip for the FEMALE 45-64 group indicates a count of 797 for 'White' participants. A note '\* synthetic data' is present next to the chart title.

Workspace



Cohort Builder



# Cohort Review -> Dataset Creation

- After creating your cohort, you can check your work using a Cohort Review Set

## Cohort Saved Successfully

The cohort [Major Depression Cohort](#) has been saved.

### What Next?

#### Create another Cohort

Create another cohort for your analysis.

[CREATE ANOTHER COHORT](#)

#### Create Review Sets

The review set feature allows you to select a subset of your cohort to review participants row-level data and add notes and annotations.

[CREATE REVIEW SETS](#)

#### Create a Dataset

Create an analysis ready dataset that can be exported to notebooks.

[CREATE A DATASET](#)

Workspace



Cohort Builder

# Cohorts + Concept Sets + Values = Datasets

- Once you have your cohort, you can start to put together your dataset.
- Your dataset is made up of a cohort, a concept set, and selected values.

## Datasets

Build a dataset by selecting the variables and values for one or more of your cohorts. Then export the completed dataset to Notebooks where you can perform your analysis

The screenshot displays the 'Dataset Builder' interface with three main sections highlighted by orange boxes:

- 1 Select Cohorts (Participants)**: Includes 'Prepackaged Cohorts' (All Participants) and 'Workspace Cohorts' (Major Depression Cohort).
- 2 Select Concept Sets (Rows)**: Includes 'Prepackaged Concept Sets' (Demographics) and 'Workspace Concept Sets' (Mental Health Concept Set).
- 3 Select Values (Columns)**: Includes a 'Survey' section with selected variables: person\_id, survey\_datetime, and survey. A 'Deselect All' button is also present.

A 'SAVE AND ANALYZE' button is located at the bottom right of the interface.

Workspace



Cohort Builder



Dataset  
Builder

# Dataset Builder: Preview and Export

- Once you select your cohort, your concept set(s), and values, you now have your dataset
- Now you can preview your dataset before saving it and exporting it to a notebook for analysis

4 Preview Dataset A visualization of your data table based on concept sets and values you selected above. Once complete, export for analysis [View Preview Table](#)

PERSON		SURVEY				
person_id	survey_datetime	survey	question_concep...	question	answer_concept...	answer
899995	2015/03/19 18:27:31	Overall Health	1585729	In general, how would you rate your mental health, including your mood and your ability to think?	1585733	Fair
887483	2016/01/15 13:46:36	Overall Health	1585729	In general, how would you rate your mental health, including your mood and your ability to think?	1585733	Fair

**SAVE AND ANALYZE**



**Save Dataset**

Dataset Name:

Export to notebook

**SEE CODE PREVIEW**

(Create a new notebook)

Notebook Name:

Programming Language:

Python

R

**CANCEL** **SAVE AND ANALYZE**

\* synthetic data

Workspace

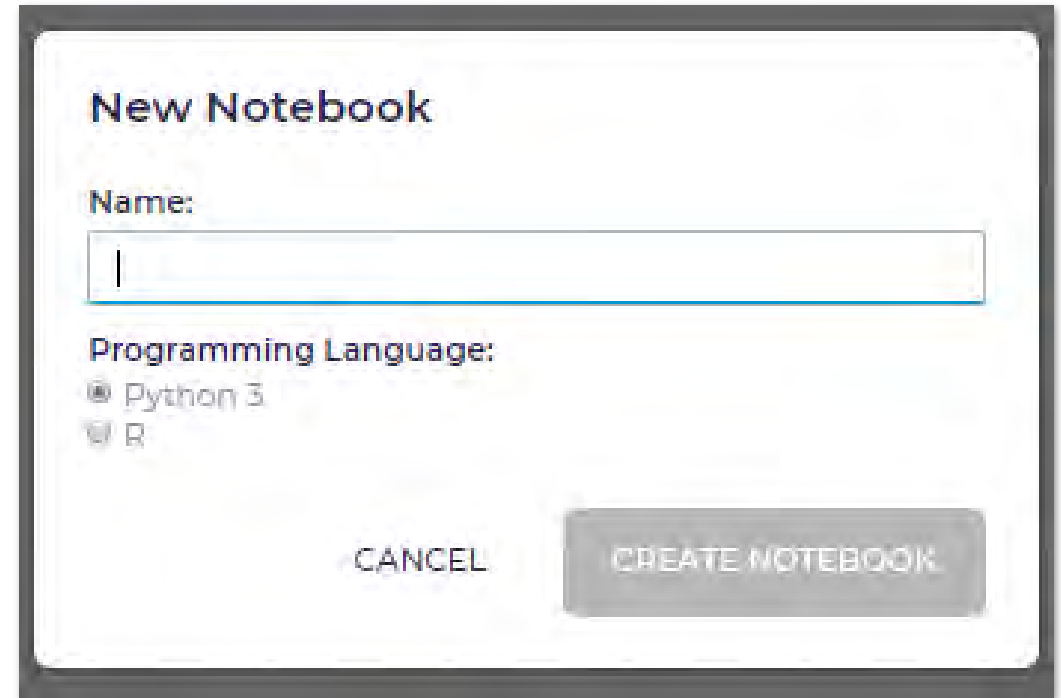
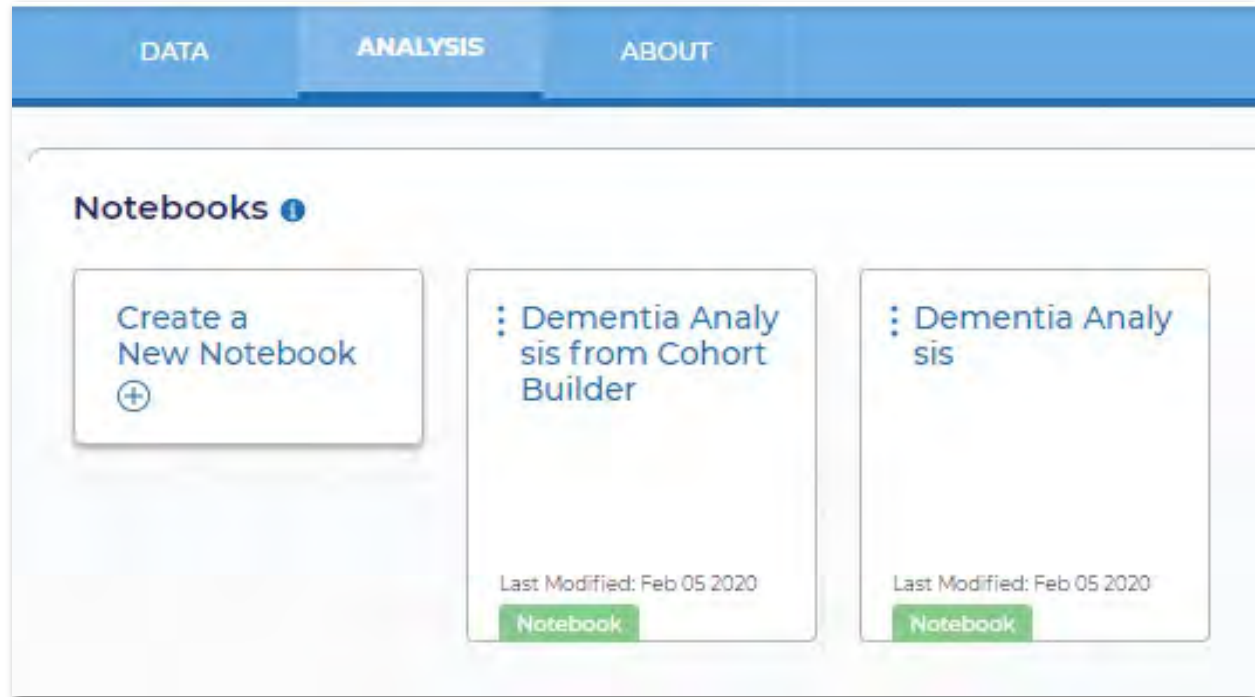


Cohort Builder



Dataset  
Builder

# Data Analysis: Jupyter Notebooks



- Jupyter Notebooks can be used for analysis in **R and Python**
- Notebooks come with ready-made code that can be inserted called “Snippets”
- Each user gets a virtual machine (computing system) per workspace





# Tools@Beta: Powerful, Flexible Tools for Reproducible Science

**All of Us**  
RESEARCHER WORKBENCH

K Kelsey Mayo

- Home
- Your Workspaces
- ★ Featured Workspaces**
- User Support
- Contact Us

**All of Us**  
RESEARCHER WORKBENCH

Workspaces > Medications pathway (sequences) - Phase 1 > Notebooks >  
**Medication Sequences Code**

Jupyter Medication Sequences Code

File Edit View Insert Cell Kernel Navigate Widgets Help Snippets

Contents

- 1 Medication Sequences
  - 1.1 Authors:
- 2 Introduction
  - 2.1 Demonstration Goals
  - 2.2 Background: Medication Sequencing
  - 2.3 Background: All of Us Data Sources
  - 2.4 Methods: Tools
  - 2.5 Methods: Phenotype Case and Control D
  - 2.6 Methods: Exposure Variable Definition
- 3 Analysis Setup
  - 3.1 Study Variables
  - 3.2 Define Functions for use in Downstream
- 4 Type 2 Diabetes Medication Sequencing
  - 4.1 Define OMOP ancestor concept codes us
  - 4.2 Extract participants with T2D codes and a
  - 4.3 Extract the ATC5th and ATC4th classes c
  - 4.4 Data Use Agreement Disclaimer
  - 4.5 Suburst plot for type 2 diabetes sequen
- 5 Depression Medication Sequencing
  - 5.1 Define OMOP ancestor concept codes ar
  - 5.2 Extract the ATC5th and ATC4th classes c
  - 5.3 Extract the depression medications sequi
  - 5.4 Data Use Agreement Disclaimer
  - 5.5 Suburst plot for depression sequences**
- 6 Hypertension Medication Sequencing
  - 6.1 Define OMOP ancestor concept codes ar

In the following Sunburst plot, we only show the first two medications only.

```
In [61]: fig = px.sunburst(filling_up_seq_df, path=['Med1', 'Med2'], values='count')  
fig.show()
```

labels=Selective serotonin reuptake inhibitors  
count=8734  
parent=Selective serotonin reuptake inhibitors

Workspace

Cohort Builder

Dataset  
Builder

Jupyter  
Notebook



# Presented on Behalf of the Data and Research Center (DRC)

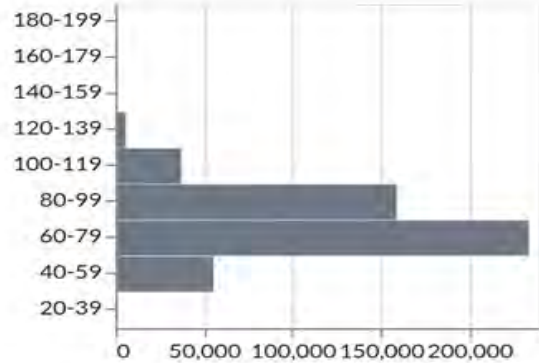


# Terra use case: UK Biobank



Search to add a facet. Try "cancer", "icd" or "flow"

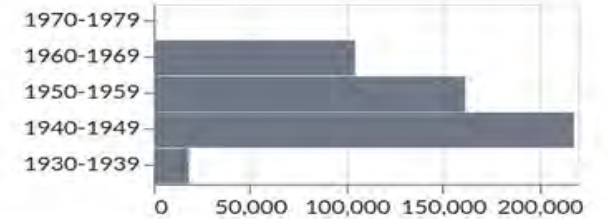
**Weight** 492414  
u23098\_0\_0



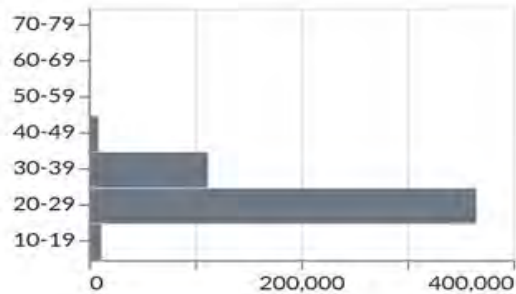
**Sex** 502543  
u31\_0\_0 - Uses data-coding 9 comprises 2 Integer-valued members in a simple list.



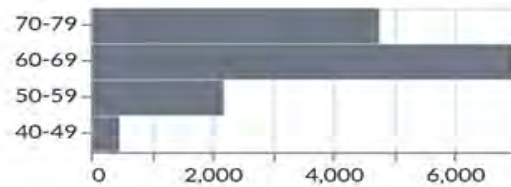
**Year of birth** 502543  
u34\_0\_0



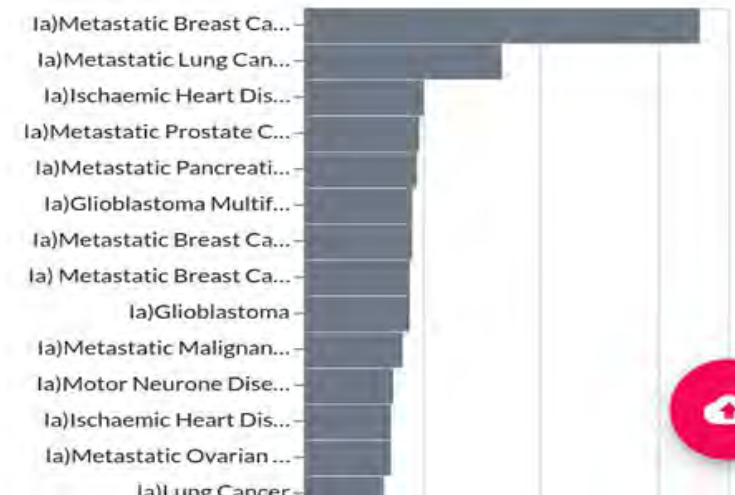
**BMI** 499438  
u21001\_0\_0 - Body mass index



**Age at death** 14421  
u40007\_0\_0



**Description of cause of death** 3679  
u40010\_0\_0







BETA

WORKSPACES

SEARCH WORKSPACES

WORKSPACES

Filter by access levels

Filter by project

Cards

List

Create a New Workspace



AMP PD - Beta 1 - Getting Started

AMP PD - Beta 1 - Getting Started

The purpose of this workspace is to provide getting started information and notebooks for researchers



Last changed: 9:03 PM



AMP PD Demographics

Sample workspace for notebooks on top of AMP PD demographics data.

The workspace is access controlled using the amp-pd-researchers



Last changed: Aug 23



Baseline Health Study

This workspace contains sample notebooks for analyzing Baseline Health Study data.

You may view notebooks in this



Last changed: Feb 7



Kathiresan Lab UK Biobank

Overview We reproduced on Terra a subset of the analyses in:

> Haas, ME et al. (2018) \*\*Genetic



Last changed: Feb 7



Kathiresan Lab UK Biobank deflaux copy

Overview We reproduced on Terra a subset of the analyses in:

> Hass, ME et al. (2018) \*\*Genetic



Last changed: Jan 22



dG copy -- Baseline Health Study

This workspace contains sample notebooks for analyzing Baseline Health Study data.

test

No description added

try-saturn

A workspace for trying out Terra functionality as it evolves.



BETA

WORKSPACES

Workspaces &gt;

uk-biobank-sek/Kathiresan Lab UK Biobank

Notebook Runtime  
STOPPED (\$0.01 hr)

DASHBOARD

DATA

NOTEBOOKS

TOOLS

JOB HISTORY



## ABOUT THE PROJECT

# Overview

We reproduced on Terra a subset of the analyses in:

Haas, ME et al. (2018) **Genetic Association of Albuminuria with Cardiometabolic Disease and Blood Pressure**. AJHG volume 103, issue 4, p461-473. [doi:10.1016/j.ajhg.2018.08.004](https://doi.org/10.1016/j.ajhg.2018.08.004)

At a high level:

- researchers[1] have taken most columns from the raw UK Biobank phenotypes and run GWAS
- in this paper, mhaas et. al. have combined several phenotypes into one that is clinically robust
- they then performed GWAS against that derived phenotype, generating very good results

For additional overview, please see mhaas' [slide deck](#) from a lab meeting while the research was in progress.

# Analysis Artifacts

Notebooks are collaboratively written in this Terra workspace.

## R environment setup

Install R packages and notebook extensions specific to this set of analyses. Each time the user starts a new Leonardo instance (such as when resizing) the user must run this notebook to set up.

- [notebook](#)
- [html version of notebook](#)

## Curation - Load UK Biobank provided data to Cloud Platform

Wrangle the data provided by UK Biobank in to Cloud Storage and/or BigQuery as appropriate for the expected usage patterns.

## WORKSPACE INFORMATION

CREATION DATE  
9/5/2018LAST UPDATED  
2/7/2019SUBMISSIONS  
0ACCESS LEVEL  
WriterEST. \$/MONTH  
\$0.00

## AUTHORIZATION DOMAIN

Collaborators must be a member of all of these [groups](#) to access this workspace.

Kathiresan\_UKBB

[Google bucket](#)





BETA

WORKSPACES

Workspaces &gt; uk-biobank-sek/Kathiresan Lab UK Biobank &gt;

Notebooks - Analysis - Albuminuria GWAS.ipynb

Notebook Runtime  
RUNNING (\$0.20 hr)

jupyter Analysis - Albuminuria GWAS Last Checkpoint: 01/09/2019 (autosaved)

File Edit View Insert Cell Kernel Widgets Help

Not Trusted

PySpark 2



Markdown

## Perform the linear regression

```
In [22]: covar_cols = ['sa.pheno.age', 'sa.covar.array', 'sa.covar.PC1',
                    'sa.covar.PC2', 'sa.covar.PC3', 'sa.covar.PC4', 'sa.covar.PC5', 'sa.covar.PC6',
                    'sa.covar.PC7', 'sa.covar.PC8', 'sa.covar.PC9', 'sa.covar.PC10']
```

```
In [23]: # For the original analysis, the destination was
# gs://ukbb_v2/projects/mhaas/ACR/UKB.v2.n382500.lnACRAdjs.021618.tsv
result_destination = '/'.join([
    'gs://uk-biobank-sek-data-us-east1/gwas-results/lnACR',
    timestamp,
    '.'.join([
        'UKB.v2.n382446.lnACRAdjs',
        datestamp,
        'tsv'])]])

result_destination
```

```
Out[23]: 'gs://uk-biobank-sek-data-us-east1/gwas-results/lnACR/20181121_194957/UKB.v2.n382446.lnACRAdjs.20181121.tsv'
```

```
In [24]: vds_linassoc = (vds
    .linreg3(['sa.pheno.lnACRAdjs'],
            covariates=covar_cols,
            use_dosages=True,
            variant_block_size=10)
    .drop_samples()
    )

print('Starting linear regression:')
vds_linassoc.export_variants(
    result_destination,
    'Variant = v, bgen.snpid = va.varid, rsid = va.rsid, INFOscore_QCTOOL = va.INFOscore_QCTOOL, '
    + 'vCallRate = va.qc.callRate, phWE = va.qc.phWE, Cohort_AC = va.qc.AC, Cohort_AF = va.qc.AF, '
```



BETA

WORKSPACES

Workspaces > uk-biobank-sek/Kathiresan Lab UK Biobank >

Notebooks - Exploration - Albuminuria GWAS resu...



Notebook Runtime  
RUNNING (\$0.20 hr)

jupyter Exploration - Albuminuria GWAS results (autosaved)



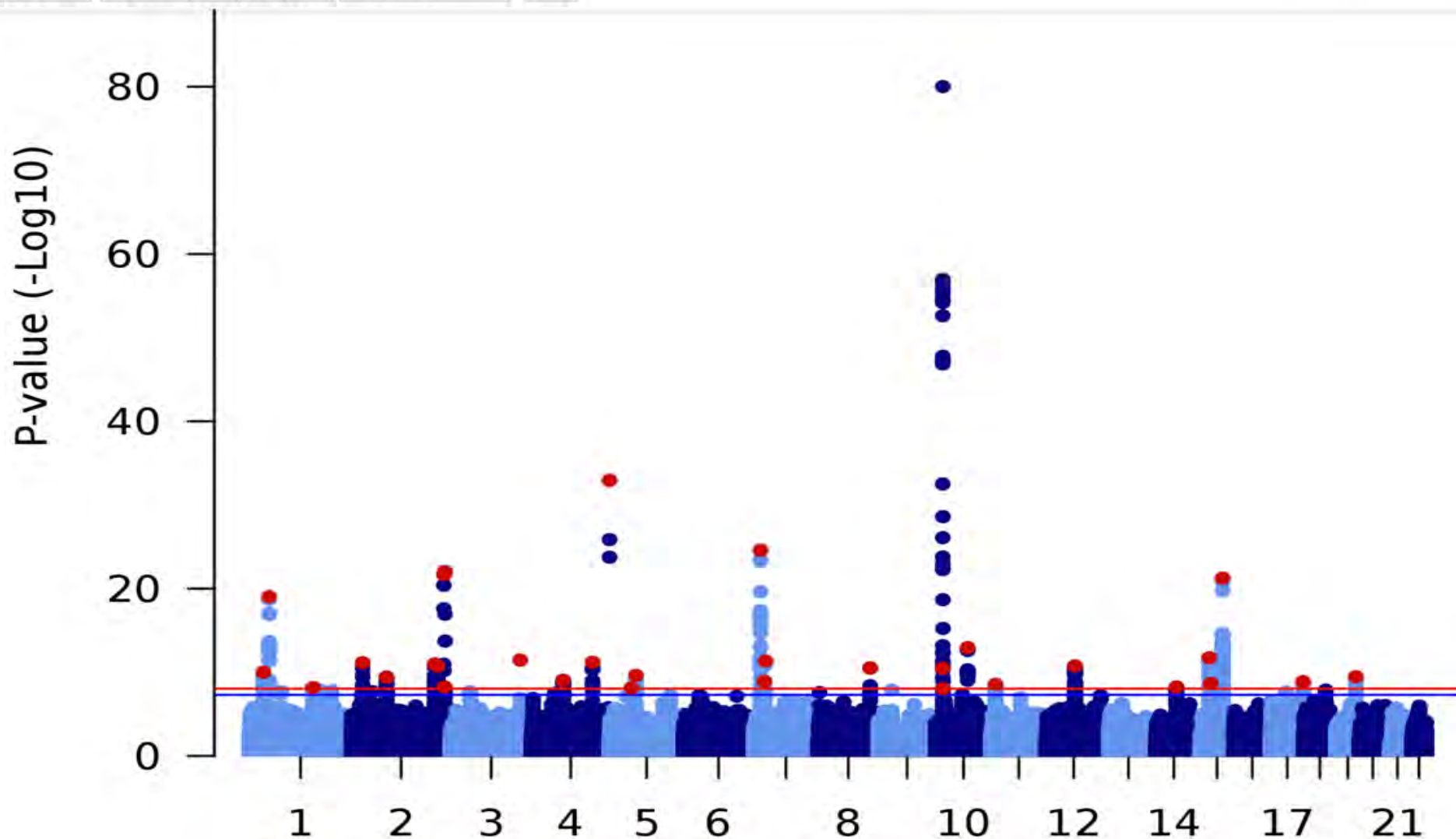
File Edit View Insert Cell Kernel Widgets Help

Not Trusted

R O

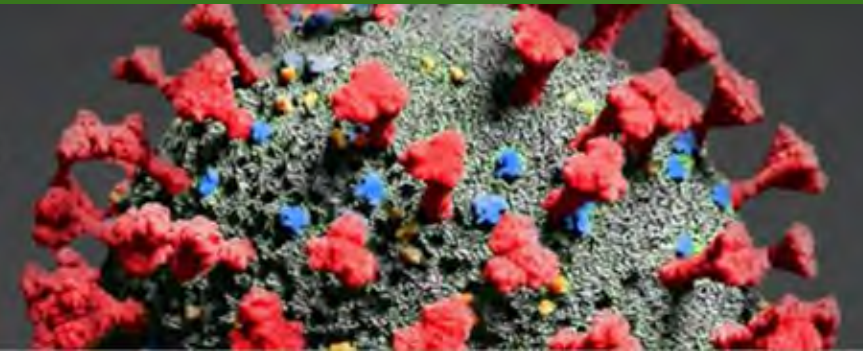


Run Markdown




# Terra use case: COVID-19 Research

Data & Tools for COVID-19/SARS CoV2 analysis  
[See this article](#) for a summary of available resources.





# Terra showcase

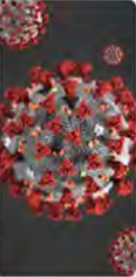
 **BETA**  
**LIBRARY**

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### New and interesting

**COVID-19\_Broad\_Viral\_NGS**

Massachusetts has been severely impacted by the COVID-19 pandemic, with 101,163 cases and 7,085 deaths as of June 2, 2020. Seventy percent of the state's 6.9 M population lives in the city




### Featured workspaces

**Introduction-to-TCGA-Dataset**

# Workspace Overview

Practice accessing and analysing controlled-access TCGA data with example analysis Tools. Data processing




### GATK4 example workspaces

**Germline-CNVs-GATK4**

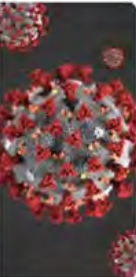
### GATK Best Practices for Germline Copy Number Variation

An analysis to detect germline copy number variants in exome sequence



### COVID-19


This workspace contains COVID-19 genomic data and workflows that will enable you to perform viral genomic analysis. This workspace will be routinely updated with new, additional data as it



### DNA-methylation-preprocessing

### DNA-methylation-preprocessing


Suite of tools to conduct methylation data analysis. Methods from this workspace can be used for alignment



### Variant-Functional-Annotation-With-Funcotator

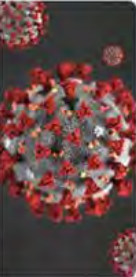
### GATK Best Practices for Funcotator

\*\*Funcotator\*\*(FUNCTIONal annotATOR) analyzes variants for their function and writes the analysis to a specified output file.




### COVID-19\_cross\_tissue\_analysis

The COVID-19 pandemic, caused by the novel coronavirus SARS-CoV-2, underscores the urgent need to identify molecular mechanisms that mediate viral entry, propagation, and tissue



### Bioconductor


Explore common Bioconductor packages that can be used to perform bulk RNA differential expression analyses or manipulate single-cell RNA-seq data



### Variant\_Calling\_Spark\_Multicore

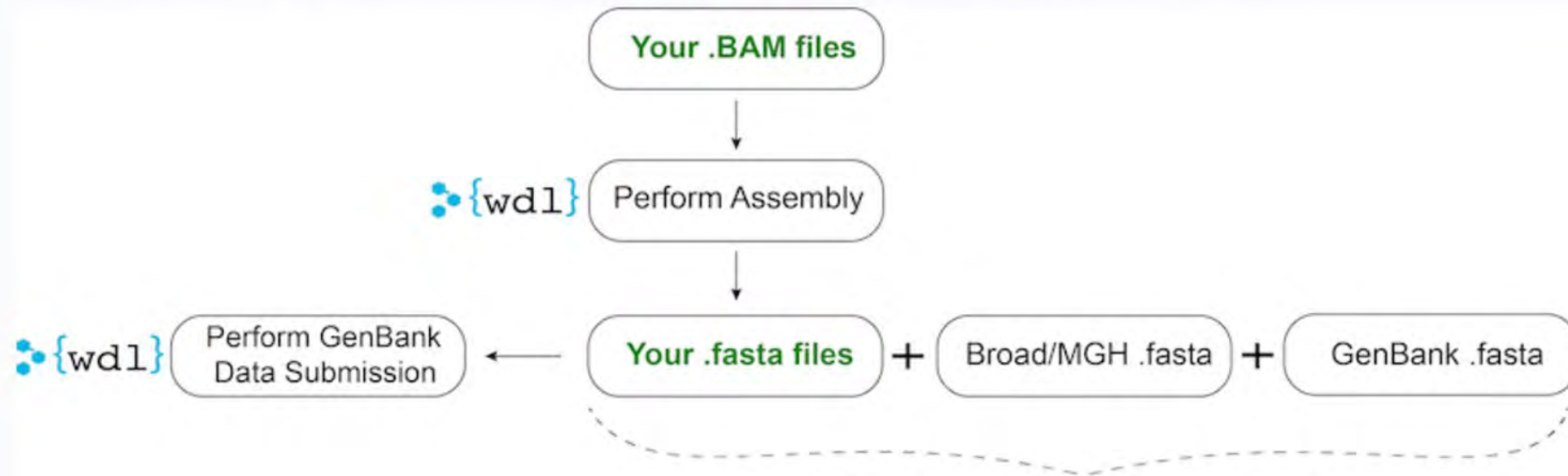
### GATK Best Practices for Variant Calling with Spark on a Multicore Machine

This workspace highlights a pipeline for



# COVID-19 Viral Genomics

## From .BAM to NextStrain Tree and GenBank Data Submission



2019-2020 COVID-19 Samples

Maintained by Broad Institute

Showing 210 of 274 genomes created between Dec 2019 and May 2020



# COVID-19 Cross Tissue Analysis



**bioRxiv**

THE PREPRINT SERVER FOR BIOLOGY

**Integrated analyses of single-cell atlases reveal age, gender, and smoking status associations with cell type-specific expression of mediators of SARS-CoV-2 viral entry and highlights inflammatory programs in putative target cells**

Muus et al., bioRxiv 2020.04.19.049254; doi:  
<https://doi.org/10.1101/2020.04.19.049254>

## **METHODS: Code availability**

Data and an interactive analysis examining the co-expression of genes across datasets can be accessed via the open-source data platform, Terra at [https://app.terra.bio/#workspaces/kco-incubator/COVID-19\\_cross\\_tissue\\_analysis](https://app.terra.bio/#workspaces/kco-incubator/COVID-19_cross_tissue_analysis).

## **ABOUT THE WORKSPACE**

The COVID-19 pandemic, caused by the novel coronavirus SARS-CoV-2, underscores the urgent need to identify molecular mechanisms that mediate viral entry, propagation, and tissue pathology in distinct cell types across organs. The surface receptor angiotensin-converting enzyme 2 (ACE2) and the associated proteases, transmembrane protease serine 2 (TMPRSS2) and Cathepsin L (CTSL), were previously identified mediators of SARS-CoV cellular entry.

## **Experimental Overview**

We use single-cell RNA-seq (scRNA-seq) across diverse tissues to assess the cell-type-specific expression of ACE2, TMPRSS2, and CTSL. We identify specific subsets of respiratory epithelial cells as putative targets of viral infection, including subsets of epithelial cells in the nasal passages, lung and airways. Additionally, we detect expression in other tissues that may serve as routes of viral transmission, including the gut and corneal epithelia, and in cells potentially associated with COVID-19 clinical pathology including cardiomyocytes, olfactory sustentacular cells, and renal epithelial cells.

For more details about the resources presented in this Terra Workspace, please use [this link](#) to refer to the official manuscript hosted on Biorxiv.



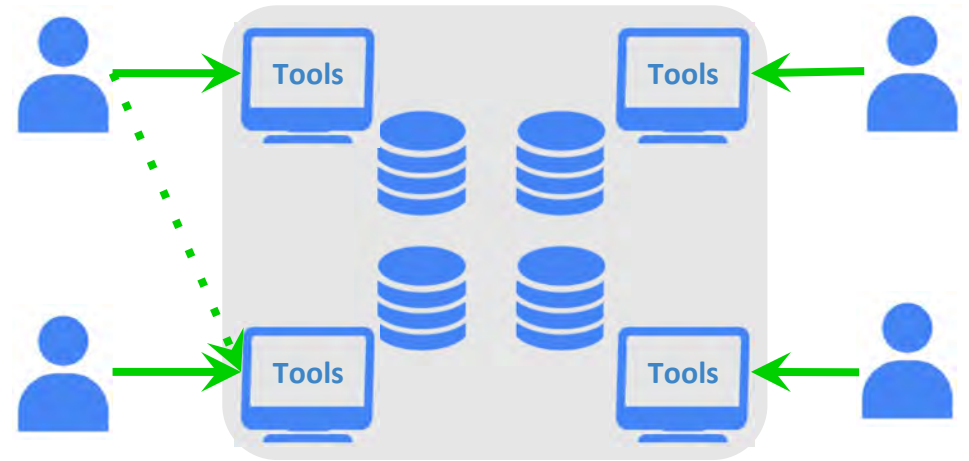
**Platforms  $\Rightarrow$  Rapid Response**

## How do we prepare for the unexpected?

- Collaborative platforms allow fast sharing of new tools, knowledge, and data.
  - Example: COVID-19 viral genomics and tissue expression workspaces
  - Example: *All of Us* COPE surveys
- General-purpose platforms allow fast special-purpose analysis.
  - Example: UK Biobank surveyed their participants about COVID-19, and provided some of the first strong evidence about genetic factors in disease susceptibility and severity.
  - Example: *All of Us* is running serology assays on biosamples collected in early 2020, to look for early COVID-19 exposure patterns.

## Cloud-centric approach

Bring researchers to data



**Facilitates collaboration**

Centralized security controls

Accessible to all researchers

Decreased cost of storage

Shared tool ecosystem

**Thank you!**

A petri dish containing various bacterial cultures, held by a hand wearing a blue nitrile glove. The background is a blurred laboratory setting.

Chris Trembl  
American College  
Radiology

# Novel Partnerships and Research Tools to Support Covid-19



# Who We Are

- Member based organization
  - ~40,000 members
- Center for Research and Innovation
  - Over 140 staff
  - 2 million+ images process annually

# ACCR<sup>®</sup>



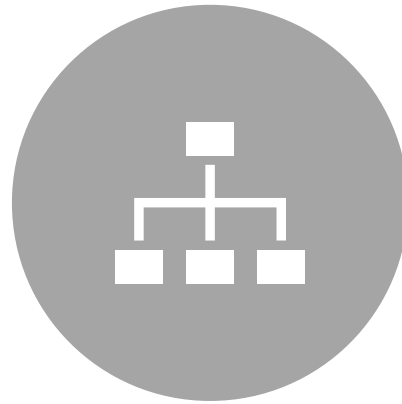


# Operating Partnership Types

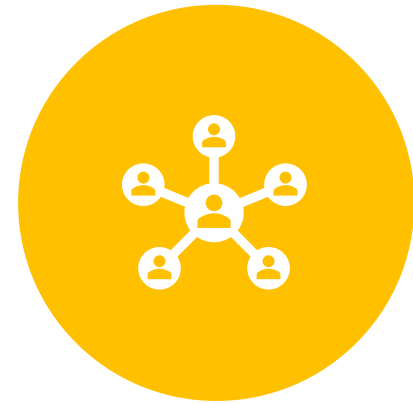




SINGLE PARTY



PRIMARY /SECONDARY



FEDERATED



# Single Party



**SIMPLE**



**WIDELY USED**



**CONTROL**



# Primary/Secondary



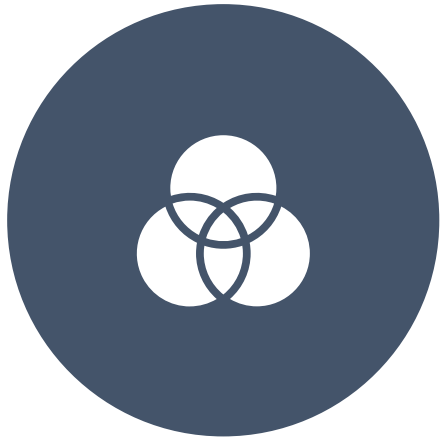
“SUB-CONTRACTOR”



COMPLEMENTARY  
EXPERTISE



MID COMPLEXITY

 Federated

MULTI-ENTITY



SCALABLE



HIGH COMPLEXITY





MIDRC





# MIDRC

- Virtual registry
- >40 data elements collected
- Groups
  - NIBIB
  - Gen3
  - ACR
  - RSNA
  - AAPM
  - TCIA



# MIDRC

- Independence on collection
- Top level abstraction layer
- Governance
  - Unifying data elements
  - Unifying subject IDs
  - Site enrollment
  - Timelines
- NIBIB

- Unrestricted Public Access
- Integrated Search
- API

# NIBIB COVID-19 Public Portal

## Access Gateway

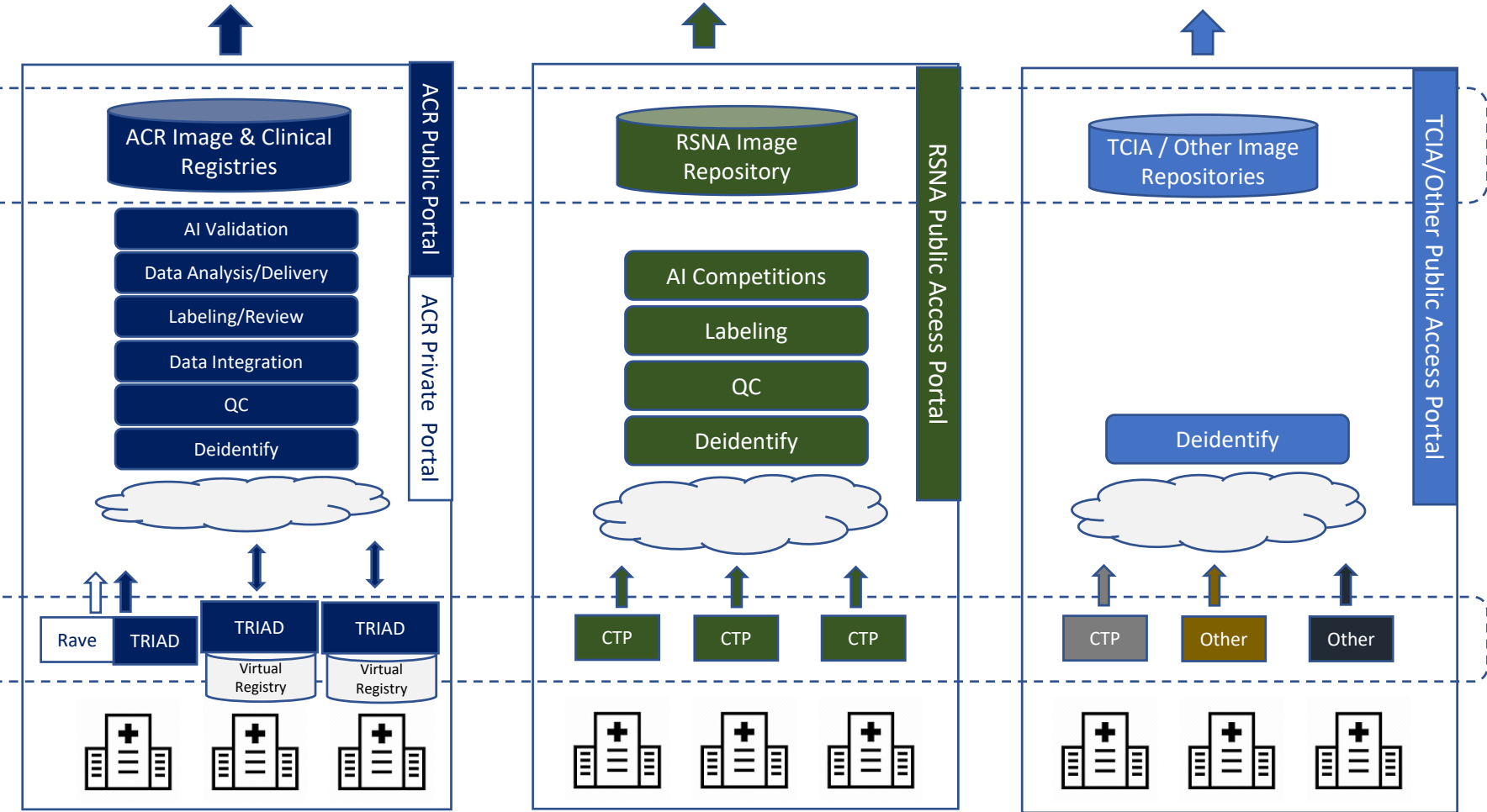
Gen3

Common Data Model  
(Local Mappings)

Common QC Protocols  
(Augment local workflow)

Protocols for acquisition and De-Identification

Data Types:  
DICOM, EMR, Lab, ...



- Integrated Registry (images and clinical data)
- Real-time Upload & Federated Queries
- Real-world Testing of AI

- Image Repository and limited clinical data
- Retrospective Batch Upload
- AI Competitions

- Image Repository for NCI-funded trial activity



# MIDRC

- >40 data elements collected
- Demographics
- Vitals
- Labs
- Images
- Diagnosis
- Repeatable
- Single Instance

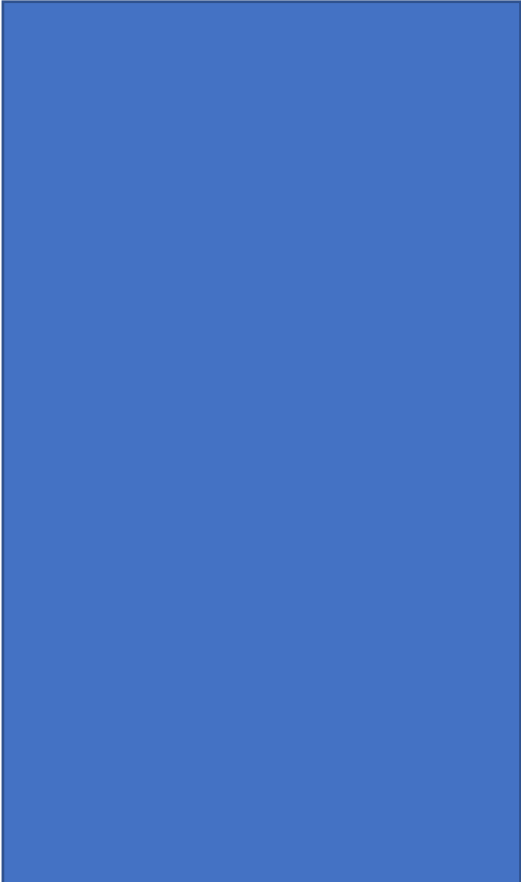
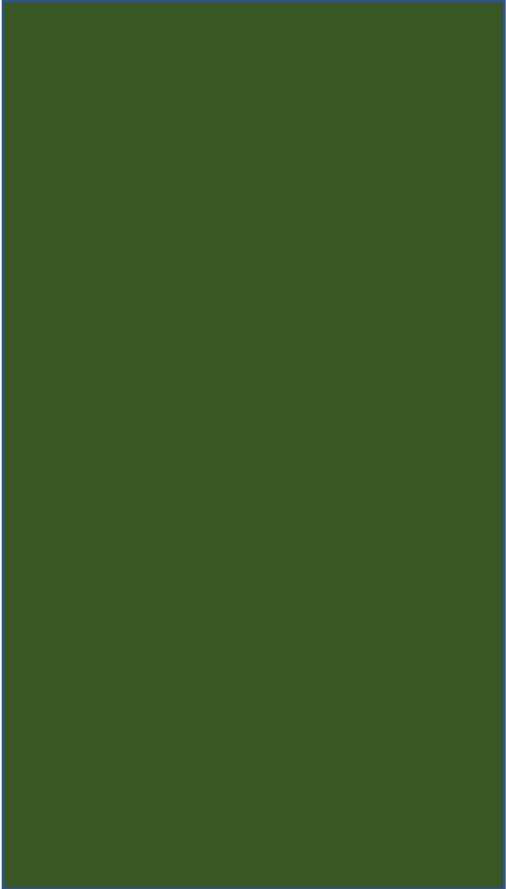




**CONNECT**

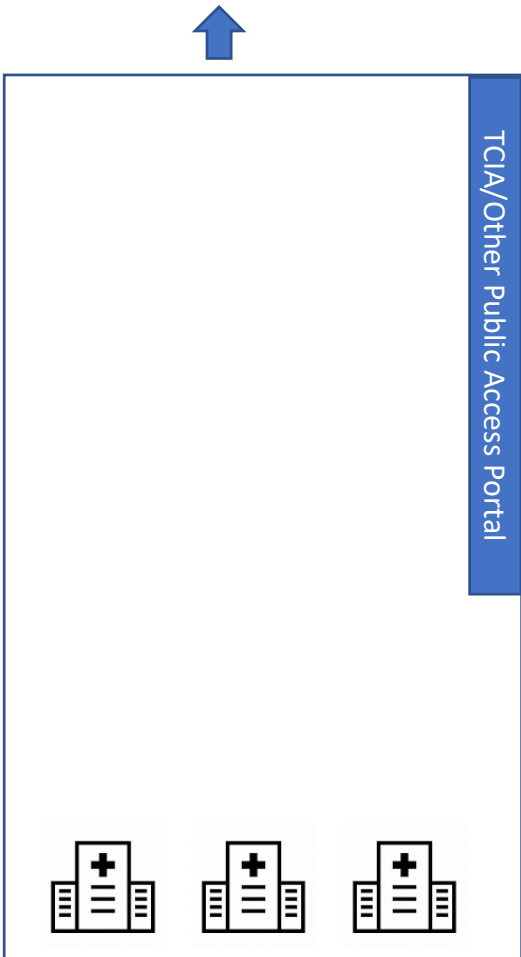
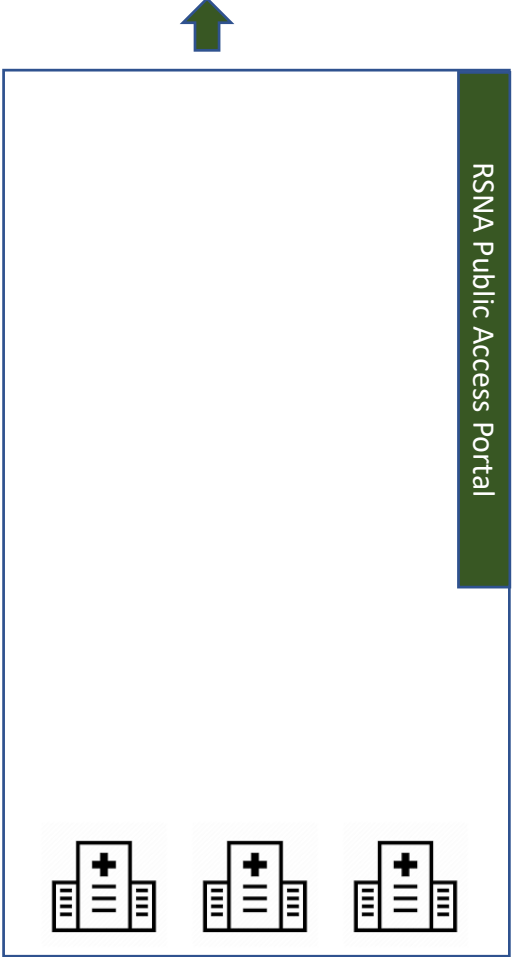
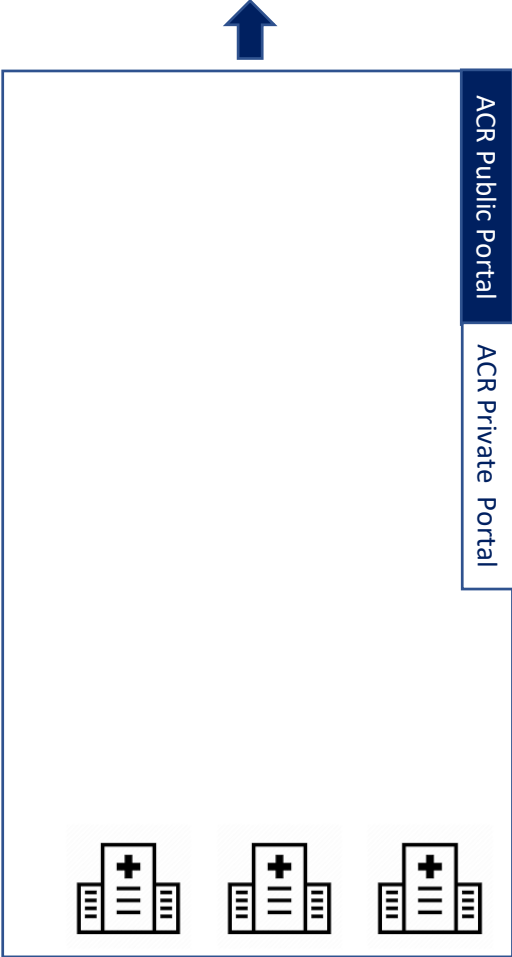
NIBIB COVID-19 Public Portal

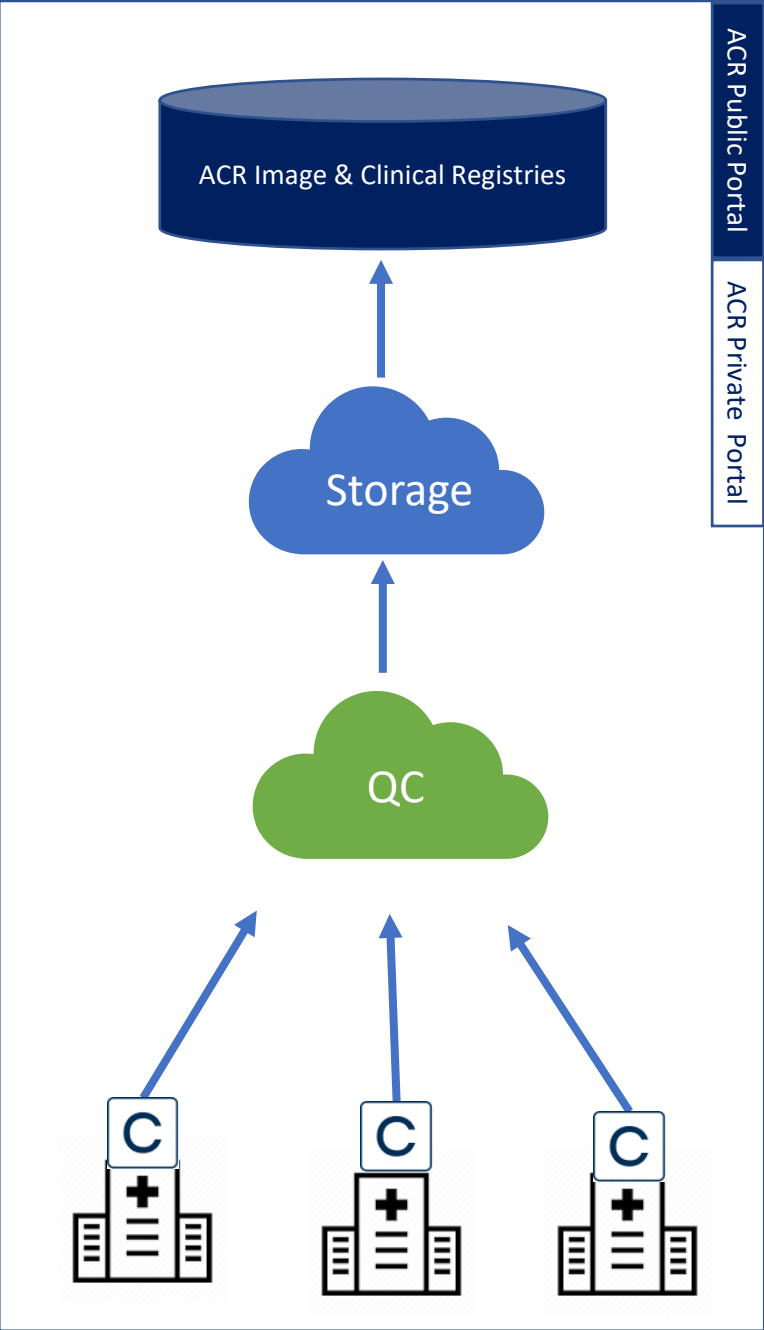
Access Gateway

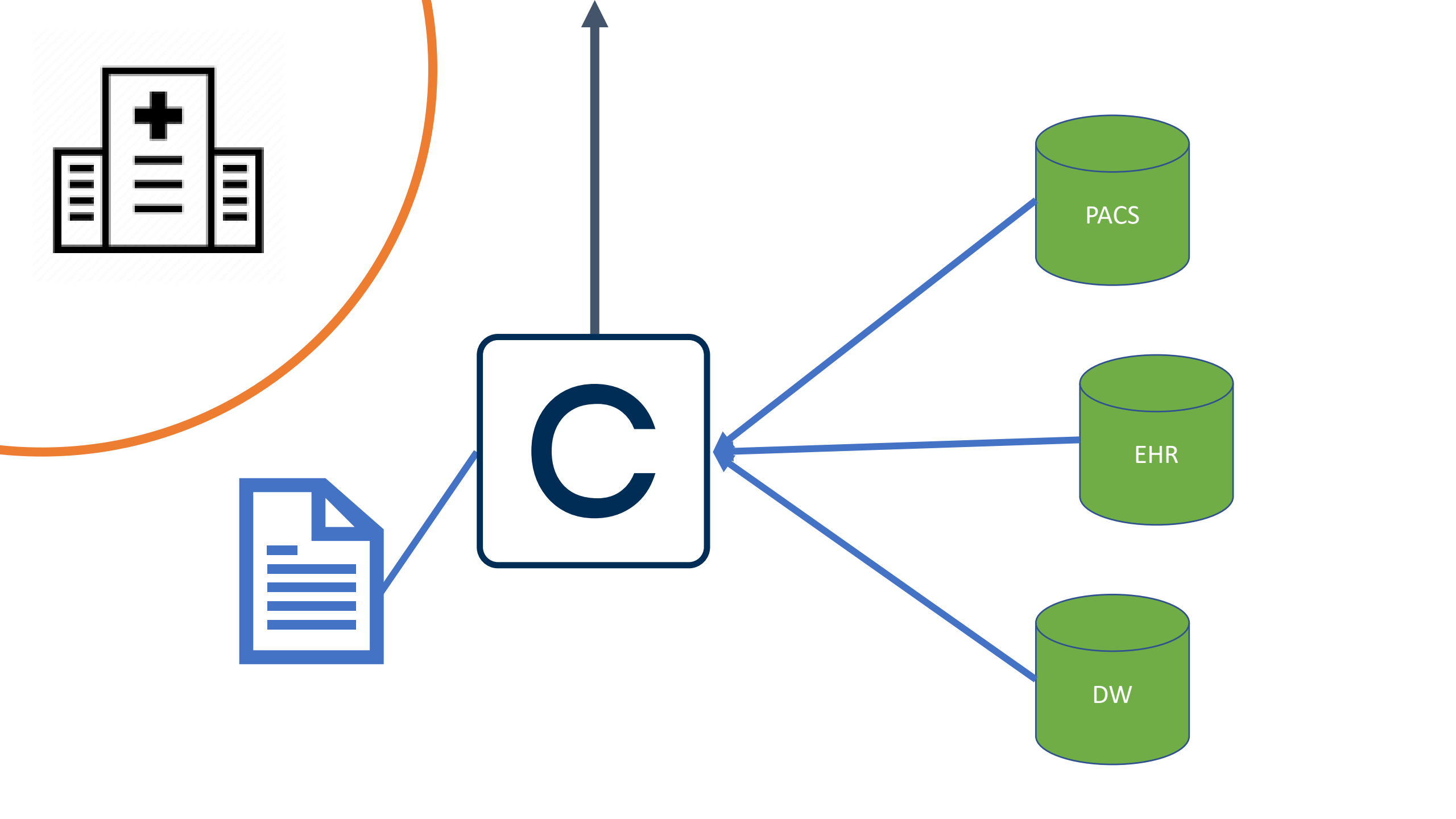
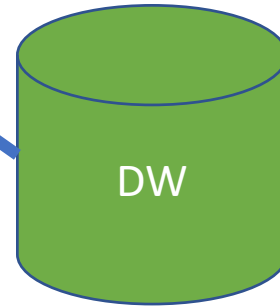
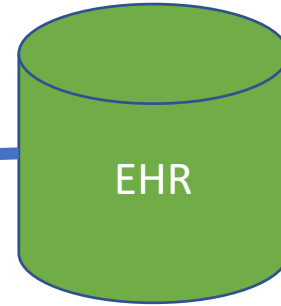
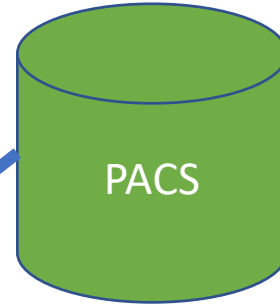
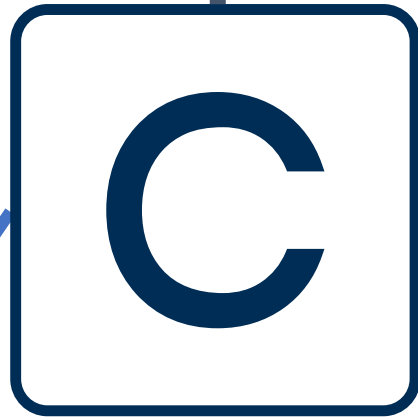
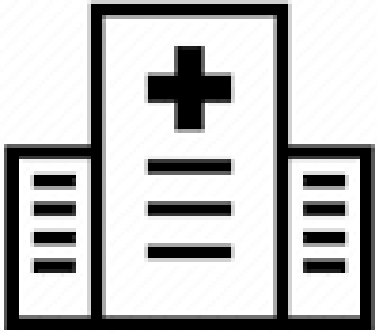


NIBIB COVID-19 Public Portal

Access Gateway Gen 3



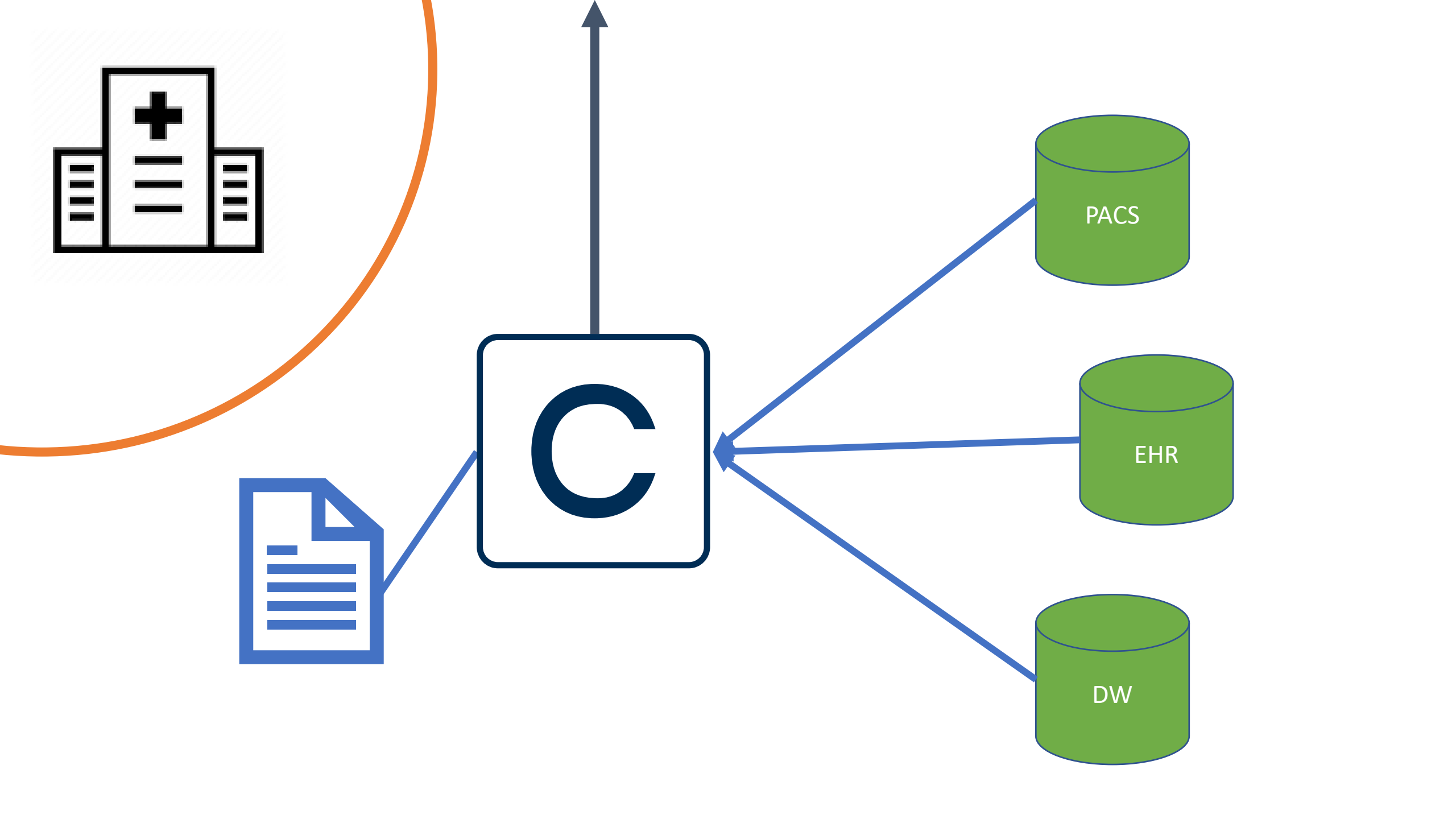
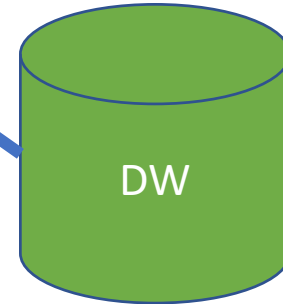
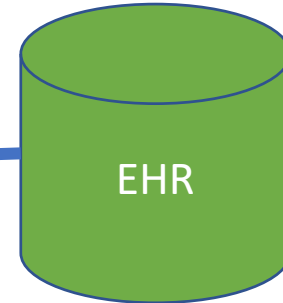
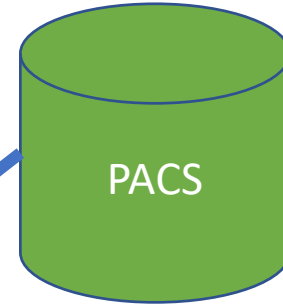
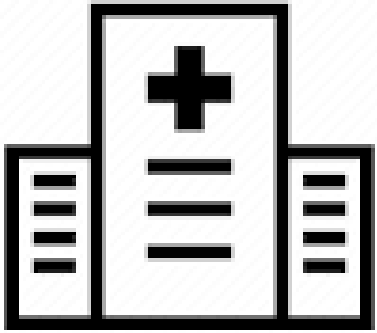


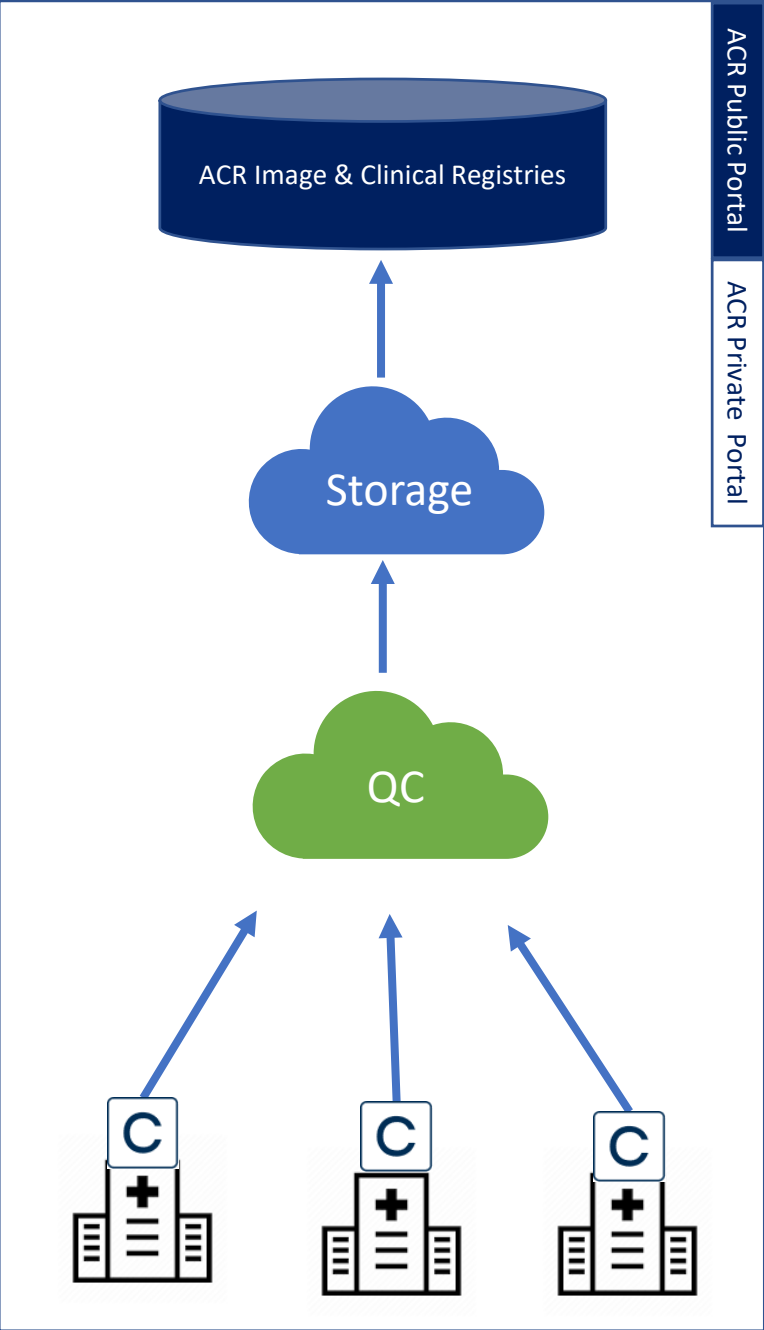






- Anonymization
- QC
- Mapping
- Automatic abstraction
- Local control

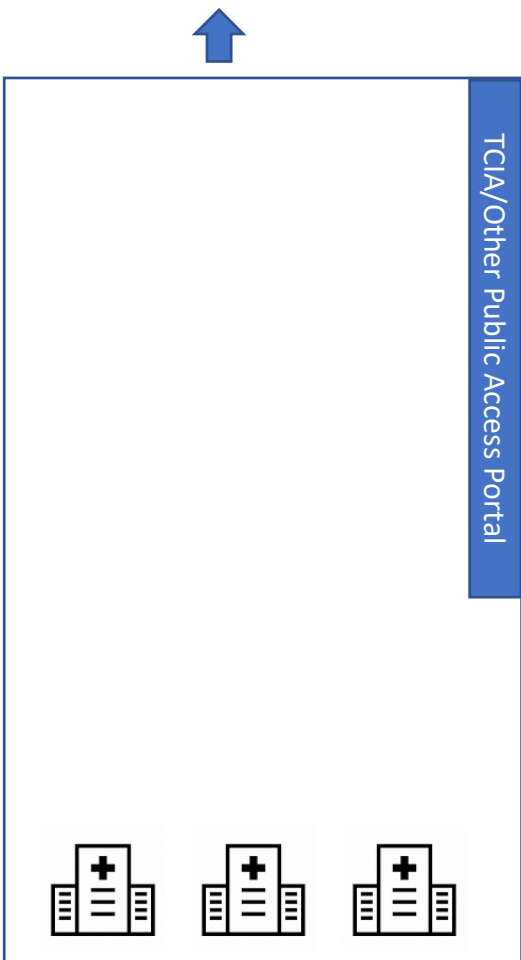
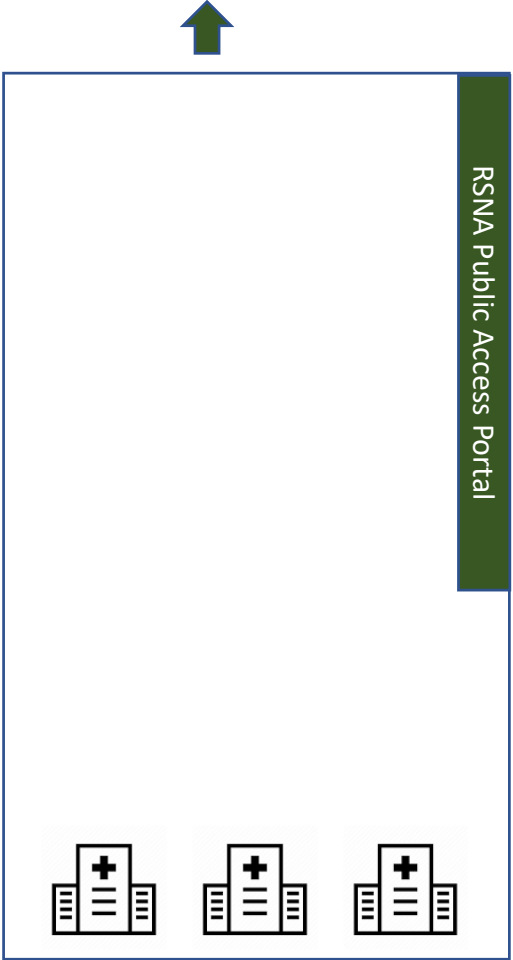
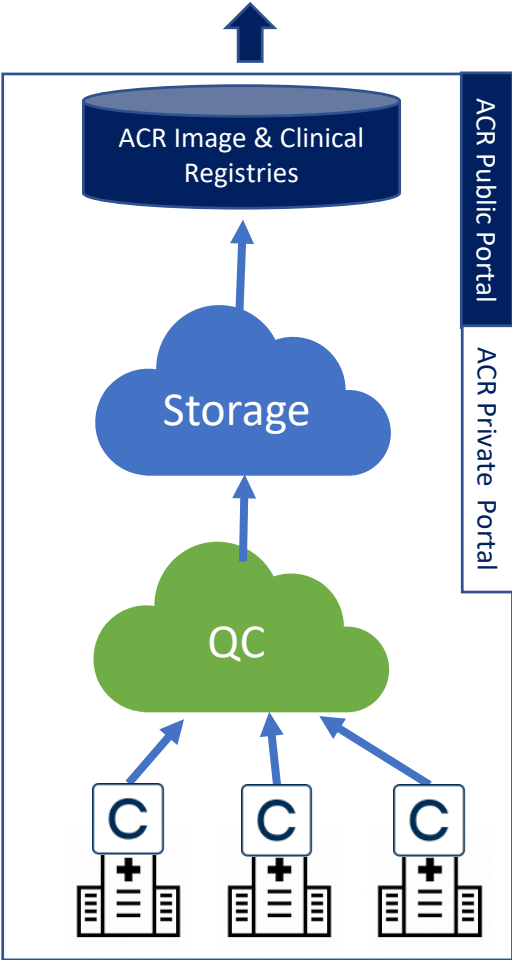




# NIBIB COVID-19 Public Portal

## Access Gateway

Gen 3





# Wrapping up

- Different partnership models, different benefits
  - Single, Primary/Secondary, Federated
- COVID-19 presenting areas for high scalability
  - MIDRC example
- ACR Connect
  - Last mile platform for data gathering



# *All of Us* Researcher Workbench

CMSS Webinar: Deploying Cloud-based Platforms and Analytic  
Tools to Support Covid-19 and Beyond  
August 6, 2020

Andrea H Ramirez, MD, MS  
Vanderbilt University Medical Center  
[andrea.h.ramirez@vumc.org](mailto:andrea.h.ramirez@vumc.org)

@AndreaRamirezMD

**All of Us**  
DATA & RESEARCH CENTER

## What is the NIH *All of Us* Research Program?

---



The *All of Us* Research Program is a historic, longitudinal effort to **gather data from one million or more people** living in the United States **to accelerate research and improve health**. By taking into account individual differences in **lifestyle, socioeconomics, environment, and biology**, researchers will uncover paths toward delivering **precision medicine – or individualized prevention, treatment, and care – for all of us**.

***“All of Us is among the most ambitious research efforts that our nation has undertaken!”***

***NIH Director Francis Collins, M.D., Ph.D.***

**The *All of Us* Research Program is part of the broader Precision Medicine Initiative.**

# On behalf of the Data and Research Center team!



VANDERBILT UNIVERSITY  MEDICAL CENTER

**verily**

 **BROAD**  
INSTITUTE



COLUMBIA UNIVERSITY  
MEDICAL CENTER



National Institutes of Health  
*All of Us Research Program*



# The *All of Us* Research Program

## Nurture relationships

with **one million or more** participant partners, from all walks of life, for decades

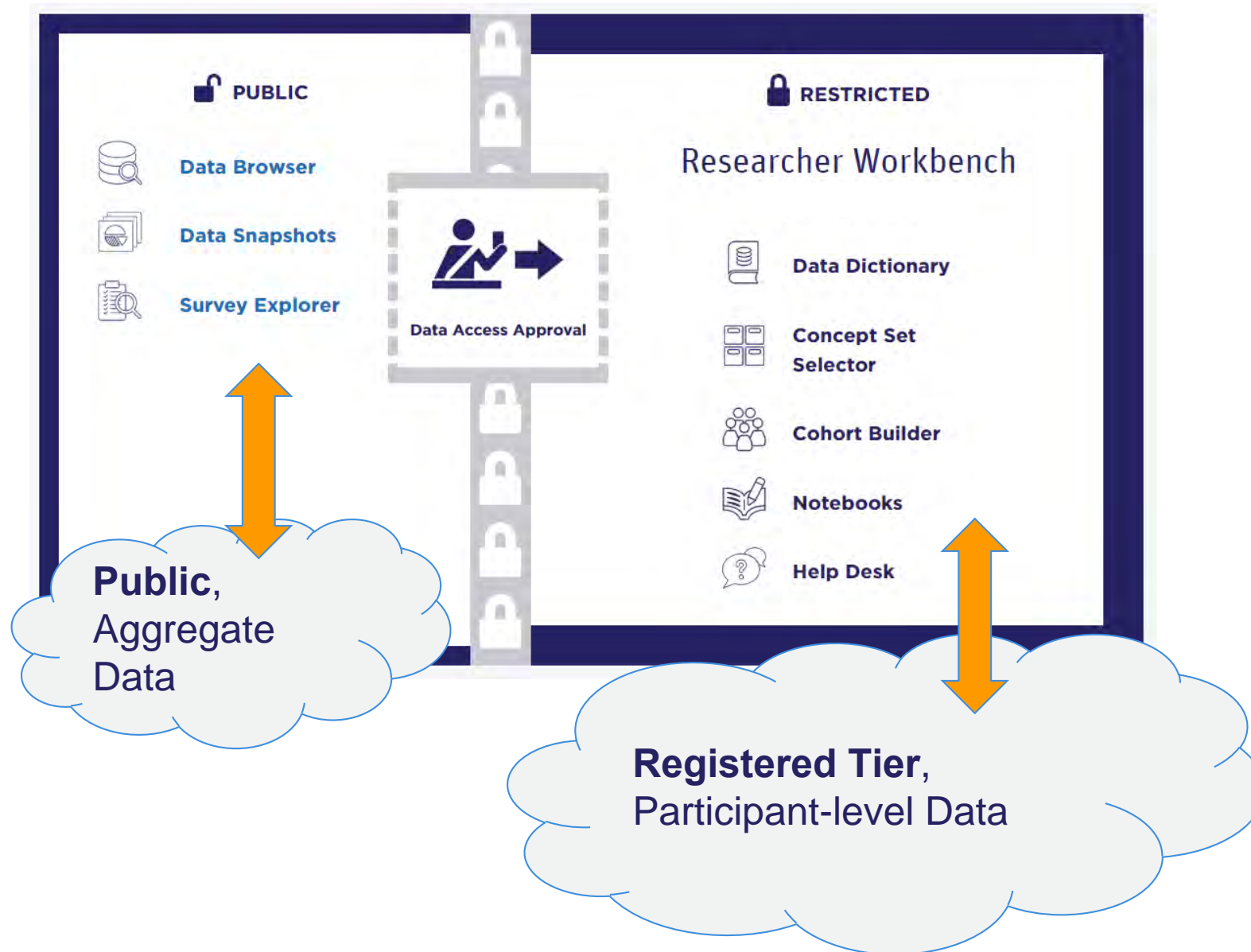
**Catalyze a robust ecosystem** of researchers and funders hungry to use and support it



**Deliver the largest, richest biomedical dataset**

that is easy, safe, and free to access

# The Research Hub: Access & Analyze *All of Us* Data





# Research Hub: Public Tools for Browsing Aggregate Data

**Search Across Data Types**

Keyword Search

Data based on Curated Data Repository (CDR) dated 2/11/2020 with 225,360 total participants.

[FAQs](#)
[Introductory Videos](#)
[User Guide](#)

**EHR Domains:**

<b>Conditions</b> 20,782 medical concepts 113,280 participants in this domain <a href="#">View Top Conditions</a>	<b>Drug Exposures</b> 20,955 medical concepts 104,580 participants in this domain <a href="#">View Top Drug Exposures</a>	<b>Labs &amp; Measurements</b> 10,050 medical concepts 109,180 participants in this domain <a href="#">View Top Labs &amp; Measurements</a>	<b>Procedures</b> 20,549 medical concepts 102,220 participants in this domain <a href="#">View Top Procedures</a>
--	--	--	--

← **Data Browser**

**Data Snapshots**

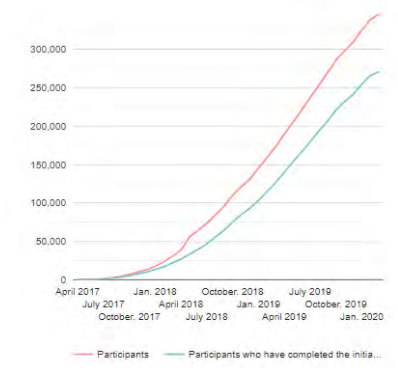


**Participants at a Glance**

**Enrollment Numbers**

This graph represents participants (individuals who have consented to join the program) and participants who have completed all initial steps of the program (i.e., those who have consented, agreed to share their electronic health records, completed the first three surveys, provided physical measurements, and donated at least one biospecimen stored at the biobank).

The following numbers are approximated to protect participants' privacy. Numbers are updated as of April 16, 2020.



← **Survey Explorer**

<p><b>The Basics</b></p> <p>This core survey (required for participation) asks basic demographic questions including questions about a participant's work and home.</p> <p> <a href="#">&gt; View English version</a>  <a href="#">&gt; View Spanish version</a> </p> <p><b>EXPLORE SOURCE MATERIAL</b></p>	<p><b>Lifestyle</b></p> <p>This survey asks questions about a participant's use of tobacco, alcohol, and recreational drugs.</p> <p> <a href="#">&gt; View English version</a>  <a href="#">&gt; View Spanish version</a> </p> <p><b>EXPLORE SOURCE MATERIAL</b></p>
<p><b>Overall Health</b></p> <p>This survey collects information about a participant's overall health including general health, daily activities, and women's health topics.</p> <p> <a href="#">&gt; View English version</a>  <a href="#">&gt; View Spanish version</a> </p> <p><b>EXPLORE SOURCE MATERIAL</b></p>	<p><b>Personal Medical History</b></p> <p>This survey collects information about past medical history, including medical conditions and approximate age of diagnosis.</p> <p> <a href="#">&gt; View English version</a>  <a href="#">&gt; View Spanish version</a> </p> <p><b>EXPLORE SOURCE MATERIAL</b></p>

# Research Projects Directory Mock

## Research Projects Directory

This list, updated 3/31/2020 shows how researchers are using *All of Us* data.

\*Note: Researcher Workbench users fill out their research project information independently. Any views, opinions, or other comments made in the Directory belong to the relevant research project team. These views, opinions, or comments do not necessarily represent the *All of Us* Research Program's beliefs.

\*\*Information in the Research Projects Directory is also cross-posted on [Allofus.gov](https://allofus.gov) in compliance with the 21st Century Cures Act.

There are currently **1,657 active workspaces**. This information was updated on **4/6/2020**.

**SORT BY TITLE:**      **ABC | DEF | GHI | JKL | MNO | PQR | STU | VWX | YZ | 0-9**

---

a



PROJECT PURPOSE(S)

- Population Health ...

a

PROJECT PURPOSE(S)

- Population Health

SCIENTIFIC QUESTIONS BEING STUDIED

d

SCIENTIFIC APPROACHES

Not available.

ANTICIPATED FINDINGS

d

DEMOGRAPHIC CATEGORIES OF INTEREST

Not available.

RESEARCH TEAM

Owner: Oscar Carlton - PI

<https://www.researchallofus.org/research-projects-directory/?section=stu>

# Research Hub → (Beta) Researcher Workbench



# What to Expect as a Beta Researcher



**1.** Currently, an institutional agreement & eRA Commons account must be in place.



**2.** Feedback is welcome.



**4.** The program cohort is actively growing, and so is our data.



**3.** The tools are continuing to evolve.



**5.** The goal is to be a true game changer for understanding health.



**What data are available now?**

---





# Our Data Is Growing. Here are the Current Data Types



## Enroll, Consent and Authorize EHR

- Recruiting 18+ years old initially; plan to include children in future
- Online, interactive consent
- Includes authorization to share Electronic Health Record (EHR) data



## Answering Surveys

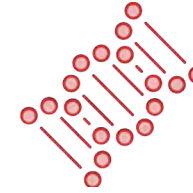
- Initial surveys: The Basics, Overall Health, Lifestyle, Health Care Access & Utilization, Family Medical History, Personal Health History
- Additional surveys will be released on an ongoing basis.



## Physical Measurements\*

- Blood pressure
- Heart rate
- Height
- Weight
- BMI
- Hip circumference
- Waist circumference

*\*Based on diverse sampling and capacity*



## Provide Biosamples\*

- Blood (or saliva, if blood draw is unsuccessful)
- Urine specimen
- Biosamples will be stored at the program's biobank

*\*Based on diverse sampling and capacity*



## Wearables and Digital Apps

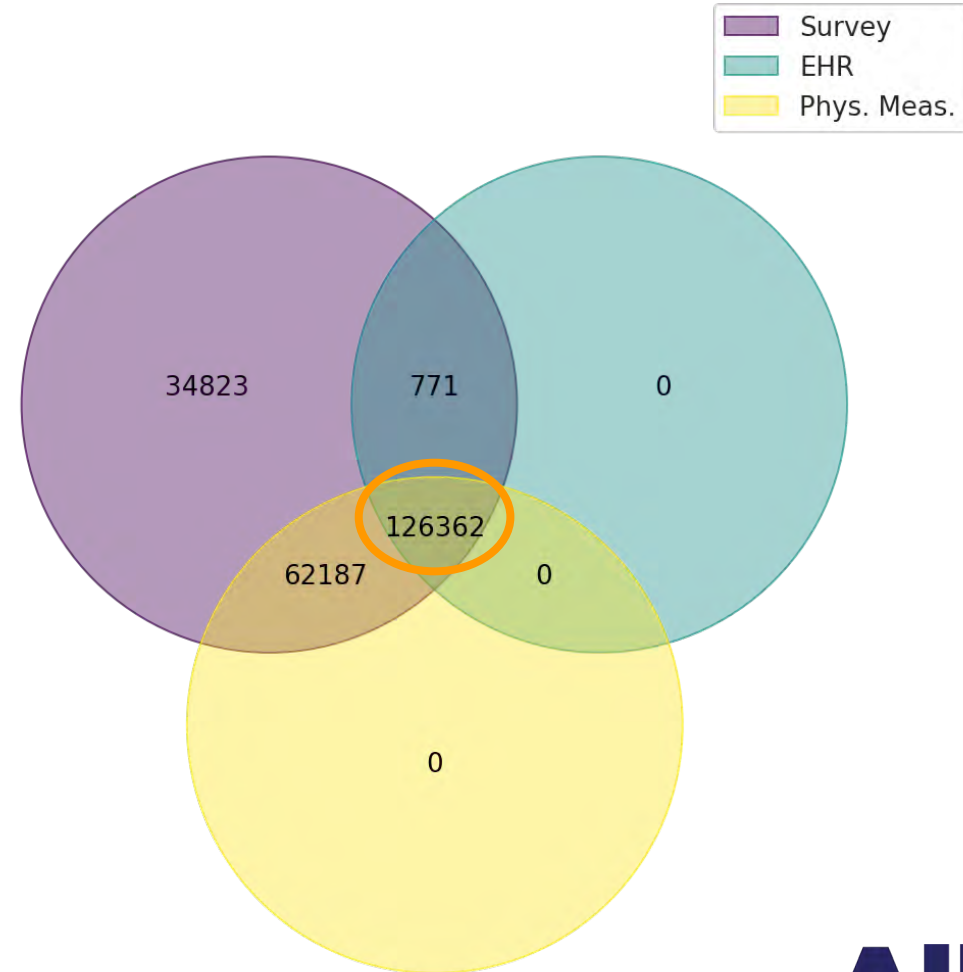
- Share data from wearable fitness devices, starting with Fitbit
- More integrations to come. E.g., integrated apps to track mood & cardio-respiratory fitness

Available in the Current Dataset

# Research Data Available Now

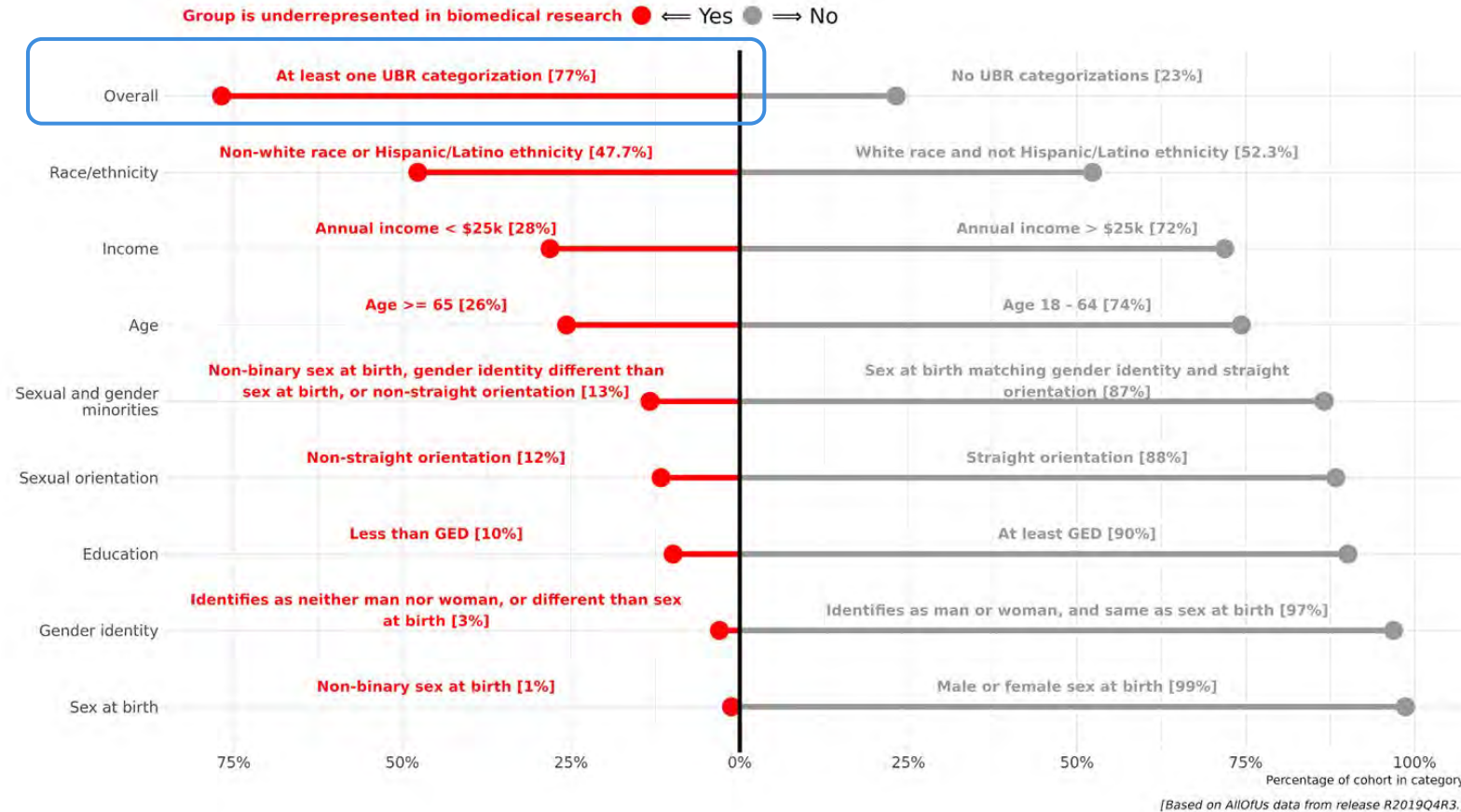
Data Type	Participant Count
Survey	>224,000
Physical Measurement	>188,000
Electronic Health Record	>127,000

Count of participants with multiple data types



## Cohort diversity: underrepresented groups in biomedical research

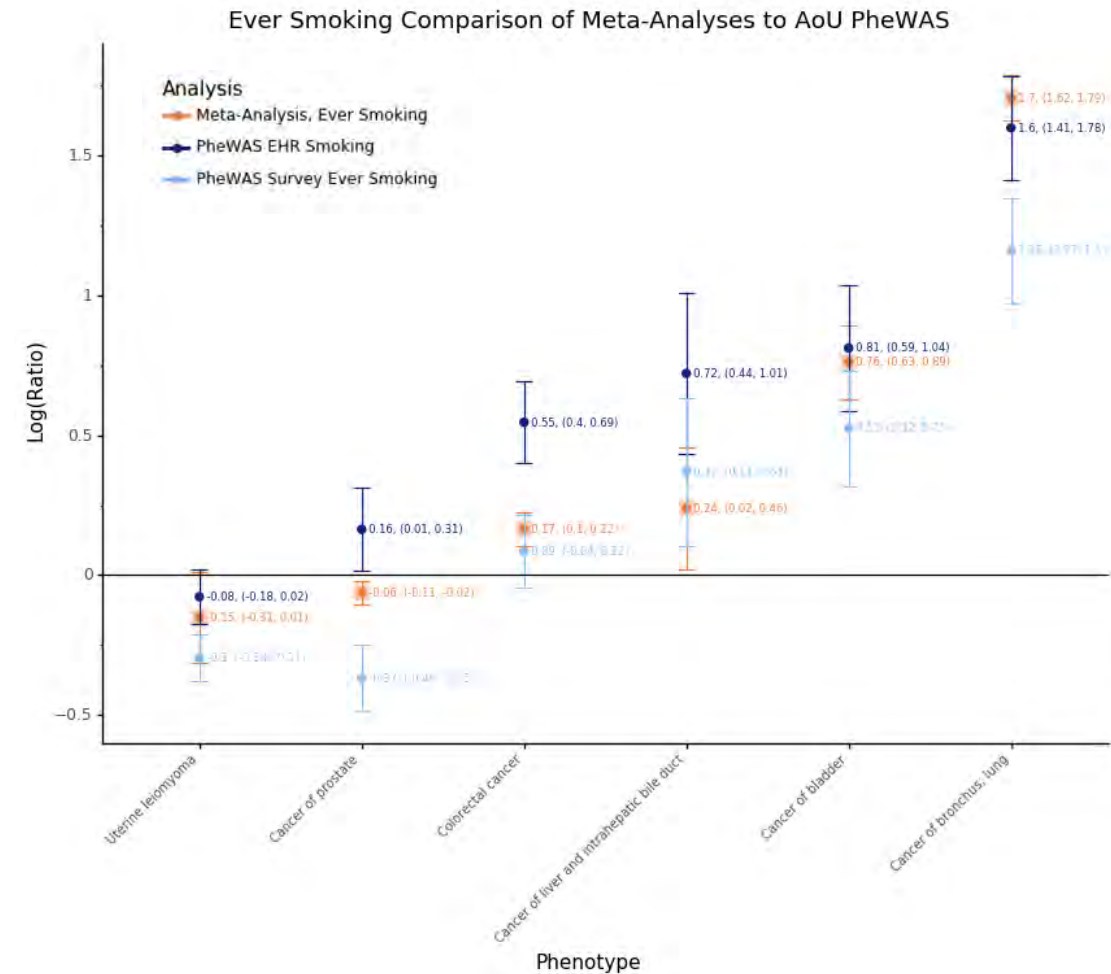
Categorizations based on explicit responses to survey questions.



A. Ramirez, L. Suleiman, D. Schlueter, et al., *The All of Us Research Program: data quality, utility, and diversity*, medRxiv 2020.05.29.20116905; doi:

# Data@Beta: Data Quality

Description	EHR Ever Smoking OR (95% CI)	Survey Ever Smoking OR (95% CI)
<b>Top 3 Increased risk effects</b>		
Cancer of the bronchus; lung	4.94 (4.11, 5.95)	3.19 (2.65, 3.84)
Cancer within the respiratory system	4.94 (4.12, 5.92)	3.15 (2.62, 3.78)
Malignant neoplasm of bladder	2.36 (1.87, 2.98)	1.76 (1.42, 2.18)
<b>Top 3 Decreased risk effects</b>		
Vascular hamartomas and non-neoplastic nevi	0.51 (0.42, 0.62)	0.55 (0.48, 0.64)
Nevus, non-neoplastic	0.52 (0.43, 0.64)	0.57 (0.49, 0.66)
Benign neoplasm of skin	0.53 (0.49, 0.58)	0.62 (0.58, 0.66)



A. Ramirez, L. Suleiman, D. Schlueter, et al., *The All of Us Research Program: data quality, utility, and diversity*, medRxiv 2020.05.29.20116905; doi:

# Want to learn more?

The screenshot shows the medRxiv preprint server interface. At the top, there are logos for medRxiv, CSH Cold Spring Harbor Laboratory, BMJ, and Yale. A search bar is visible on the right. The main title of the preprint is "The All of Us Research Program: data quality, utility, and diversity". Below the title, there is a list of authors including Andrea H Ramirez, Lina Sulieman, David J Schlueter, Alese Halvorson, Jun Qian, Francis Ratsimbazafy, Roxana Loperena, Kelsey Mayo, Melissa Basford, Nicole Deflaux, Karthik N Muthuraman, Karthik Natarajan, Abel Kho, Hua Xu, Consuelo Wilkins, Hoda Anton-Culver, Eric Boerwinkle, Mine Cicek, Cheryl R Clark, Elizabeth Cohn, Lucila Ohno-Machado, Sheri Schully, Brian K Ahmedani, Maria Argos, Robert M Cronin, Christopher O'Donnell, Mona Fouad, David B Goldstein, Philip Greenland, Scott J Hebbbring, Elizabeth W Karlson, Parinda Khatri, Bruce Korf, Jordan W Smoller, Stephen Sodeke, John Wilbanks, Justin Hentges, Christopher Lunt, Stephanie A Devaney, Kelly Gebo, Joshua C Denny, Robert J Carroll, David Glazer, Paul A Harris, George Hripcsak, Anthony Philippakis, and Dan M Roden. A disclaimer states: "This article is a preprint and has not been peer-reviewed [what does this mean?]. It reports new medical research that has yet to be evaluated and so should not be used to guide clinical practice." Navigation options include Abstract, Info/History, Metrics, and a Preview PDF button.

The screenshot shows the mobile application interface for the All of Us Researcher Workbench. The top navigation bar includes the user's name "Kelsey Mayo" and a dropdown arrow. Below this, a menu lists several options: Home, Your Workspaces, Featured Workspaces (highlighted with an orange box), User Support, and Contact Us. The main content area shows a "WORKBENCH" header and a card for analyzing All of Us data. A "Feedback" section is partially visible at the bottom right.

A. Ramirez, L. Suleiman, D. Schlueter, et al., *The All of Us Research Program: data quality, utility, and diversity*, medRxiv 2020.05.29.20116905; doi:



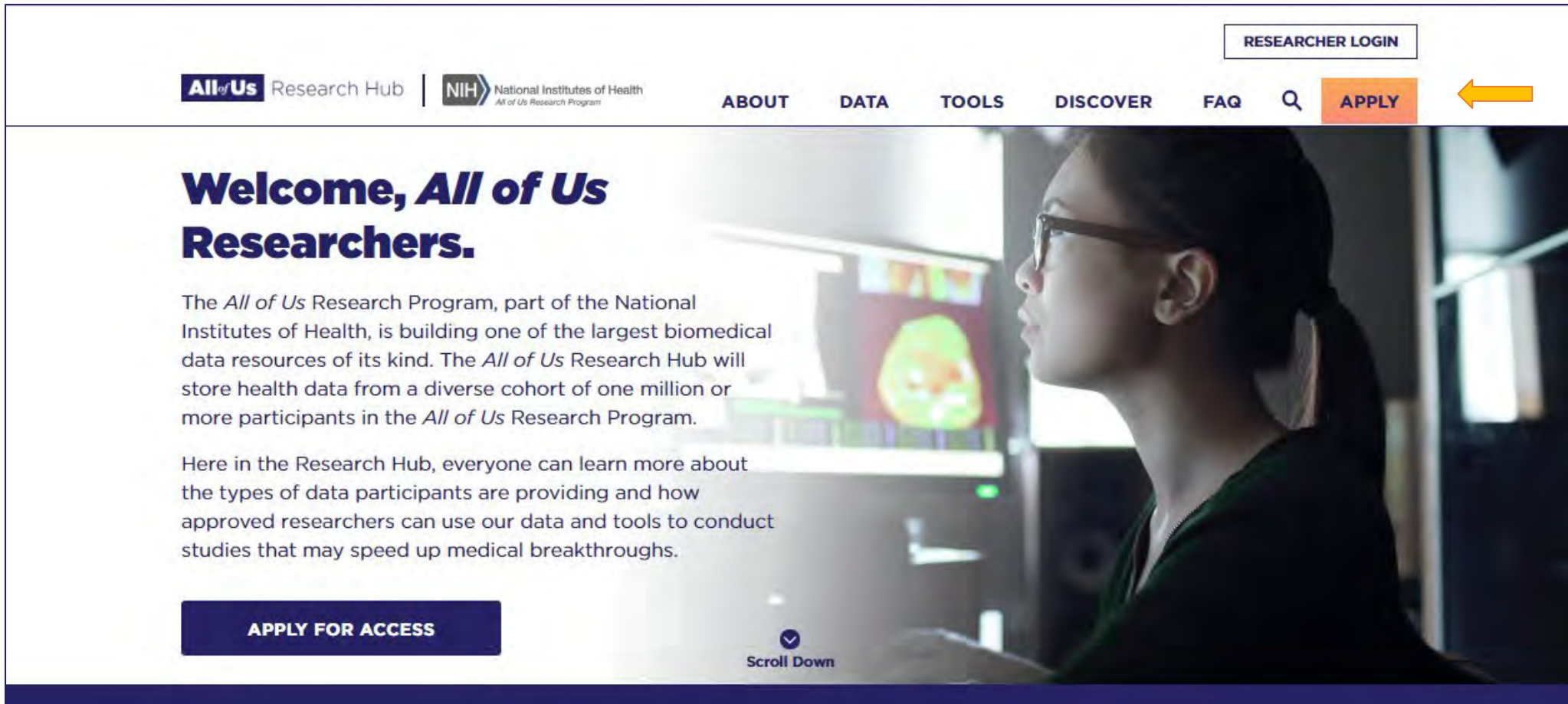
**How do you get access?**

---



# Interested in becoming a Beta Researcher?

Visit [researchallofus.org](https://researchallofus.org) to apply!



The screenshot shows the top navigation bar of the All of Us Research Hub website. The navigation menu includes links for ABOUT, DATA, TOOLS, DISCOVER, and FAQ, followed by a search icon and a prominent orange 'APPLY' button. A yellow arrow points to the 'APPLY' button. Above the navigation bar is a 'RESEARCHER LOGIN' button. The main content area features a large heading 'Welcome, All of Us Researchers.' and two paragraphs of introductory text. A dark blue 'APPLY FOR ACCESS' button is located at the bottom left of the main content area. At the bottom center, there is a 'Scroll Down' indicator with a checkmark icon.

RESEARCHER LOGIN

All of Us Research Hub | NIH National Institutes of Health All of Us Research Program

ABOUT DATA TOOLS DISCOVER FAQ **APPLY**

## Welcome, *All of Us* Researchers.

The *All of Us* Research Program, part of the National Institutes of Health, is building one of the largest biomedical data resources of its kind. The *All of Us* Research Hub will store health data from a diverse cohort of one million or more participants in the *All of Us* Research Program.

Here in the Research Hub, everyone can learn more about the types of data participants are providing and how approved researchers can use our data and tools to conduct studies that may speed up medical breakthroughs.

**APPLY FOR ACCESS**

Scroll Down

# How the Application Process Works



## CHECK FOR YOUR INSTITUTION'S AGREEMENT

[Check that your institution has signed the Data Use and Registration Agreement](#). If you do not see your institution listed, please [fill out the form](#) to initiate the process.



## REGISTER AS A RESEARCHER

Complete your researcher profile, sign Terms of Services, and agree to the the Privacy Policy. Please note, a Data Use and Registration Agreement must be in place, and you must have an eRA Commons account.



## CONNECT eRA COMMONS

Connect your eRA Commons account upon applying to the Researcher Workbench.



## COMPLETE *All of Us* RESPONSIBLE CONDUCT OF RESEARCH TRAINING

Understand more about our privacy safeguards and the ethics surrounding the use of participant data.



## SIGN AUTHORIZED USER CODE OF CONDUCT

Each user must agree and sign an Authorized User Code of Conduct

<https://www.researchallofus.org/institutional-agreements/>

# Institutional Agreements

Currently, 165 institutions are in the access pipeline with 110 having completed agreements!



## *Institutions are Diverse:*

- Non-profit Orgs
- Federally Qualified Health Centers
- Historically Black Colleges & Universities
- R2 Public Universities
- Major Academic Medical Centers
- Disease Advocacy Groups
- *And growing....*

**Ok now what?**

---





# Welcome to the Researcher Workbench



Welcome to the  
**RESEARCHER WORKBENCH**

The secure platform to analyze *All of Us* data



## Workspaces +

Featured Workspace: Dementia

OWNER

Last Changed: 02/11/20, 07:32 PM

All of Us Survey Codebook and Frequency Distributions

OWNER

Last Changed: 02/11/20, 07:51 PM

Featured Workspace: Depression

OWNER

Last Changed: 02/11/20, 07:50 PM

Featured Workspace - Type 2 Diabetes

OWNER

Last Changed: 02/11/20, 07:50 PM

## Recently Accessed Items

Case 1 Notebook

Notebook

Last Modified: Mar 06 2020

Dementia Analysis from Cohort Builder

Notebook

Last Modified: Feb 04 2020

Ischemic Heart Disease Analysis

Notebook

Last Modified: Feb 04 2020

Dementia Analysis

Notebook

Last Modified: Feb 04 2020

Type 2 Diabetes Analysis

Notebook

Last Modified: Feb 04 2020

Ischemic Heart Disease Analysis

Notebook

Last Modified: Jan 31 2020

## Quick Tour and Videos

Workbench Quick Tour

3:01

Cohorts Overview

3:07

Notebooks Overview

3:07

The Researcher Workbench contains the tools researchers need to learn about, access and analyze participant-level *All of Us* data.



# Searchable Knowledge Base, Community Forums, and Help Desk

All of Us  
USER SUPPORT HUB

[Return to Researcher Workbench](#) [Submit a request](#)

## User Support

Search our knowledge base for answers to common questions

Q Enter a question, topic or a keyword...

### Explore All of Us Researcher Workbench Topic



#### Getting Started

New to the Researcher Workbench? Looking for some quick help for working with our tools or data? Start here.



#### Documentation

Find helpful resources to better understand the All of Us dataset and how to analyze it.



#### Community Forum

Post your questions and comments for other users here.



#### Frequently Asked Questions

Look for answers on Workspaces, Concepts and everything in between



#### Announcements

Get the latest All of Us news and announcements

### Have a question or would like to make a request?

Send us specific questions or requests

[SUBMIT A TICKET](#)



## Help Desk

### Please select your issue

Ask a question or report an issue.

Share your feedback.

Tell us about a recent publication.

Request additional billing credits.

Report a data privacy concern.

zendesk

# All of Us Phenotype Library



Phenotype Library

Tutorial Workspaces

## RESEARCHER WORKBENCH WORKSPACE LIBRARY

### Phenotype Library

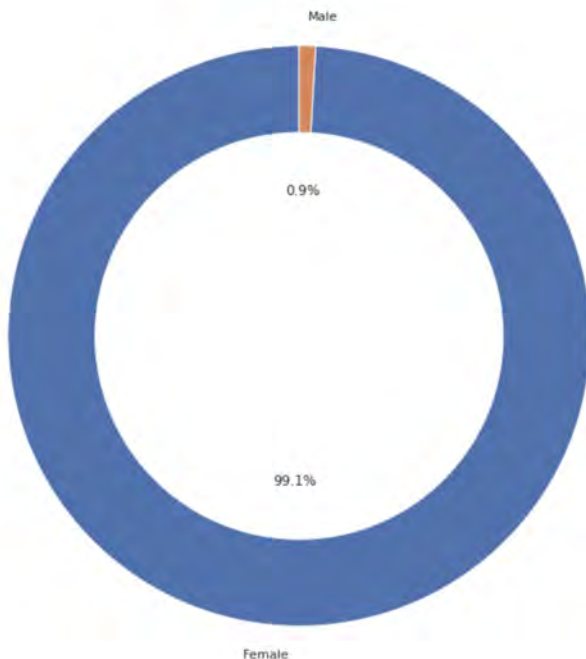
These workspaces demonstrate how computable electronic phenotypes can be implemented within the *All of Us* dataset using examples of previously published phenotype algorithms. You can open the workspaces to view them or "duplicate" the workspaces to edit and execute the algorithms.

A workspace card for 'Dementia Phenotype'. It features a vertical ellipsis icon in the top left, the title 'Dementia Phenotype', an 'OWNER' button, and the text 'Last Changed: 03/30/20, 02:10 PM'.	A workspace card for 'Depression Phenotype'. It features a vertical ellipsis icon in the top left, the title 'Depression Phenotype', an 'OWNER' button, and the text 'Last Changed: 03/30/20, 02:12 PM'.	A workspace card for 'Ischemic Heart Disease Phenotype'. It features a vertical ellipsis icon in the top left, the title 'Ischemic Heart Disease Phenotype', an 'OWNER' button, and the text 'Last Changed: 03/30/20, 02:14 PM'.	A workspace card for 'Type 2 Diabetes Phenotype'. It features a vertical ellipsis icon in the top left, the title 'Type 2 Diabetes Phenotype', an 'OWNER' button, and the text 'Last Changed: 03/30/20, 02:07 PM'.
--	--	--	--



# Phenotype Library Example: Breast Cancer

Breast Cancer Cases



Example Query of ICD Codes in notebook:

```
query = ("""
SELECT distinct person_id, condition_start_date as date
FROM
  (SELECT DISTINCT person_id, condition_source_concept_id, condition_source_value, condition_start_date
   FROM ~~~~~+prefix+""". """+ str(CDR_version) +""".condition_occurrence`) AS cond
  INNER JOIN
  (SELECT DISTINCT concept_id, concept_name, concept_code, vocabulary_id
   FROM ~~~~~+prefix+""". """+ str(CDR_version) +""".concept`
   where (concept_code in ('233.0')
   and vocabulary_id = 'ICD9CM')) as concept
  on concept.concept_id = cond.condition_source_concept_id
""")
pd.read_gbq(query, dialect="standard")
```

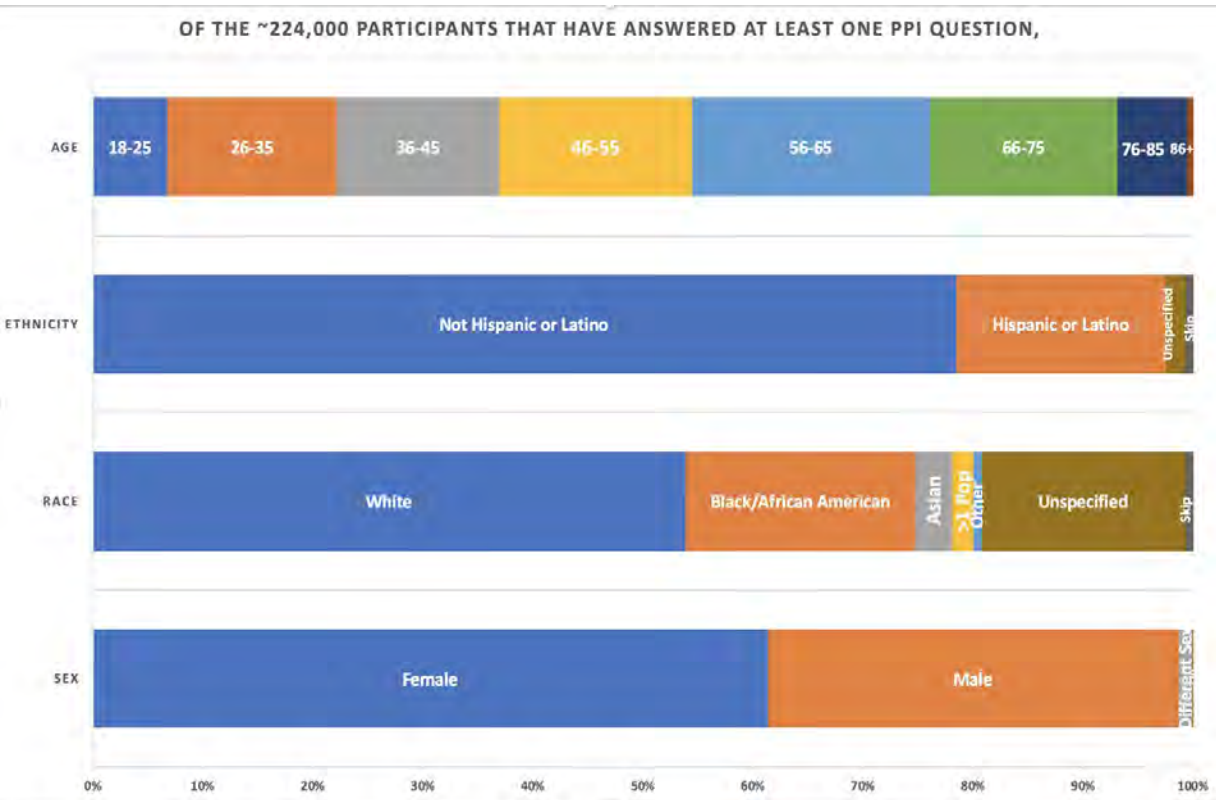
We implemented a validated phenotyping algorithm for breast cancer from eMERGE network.

1. We found 3748 total breast cancer cases
  - a. 3714 female cases (99.1%)
  - b. 34 male cases (0.9%)
2. Algorithm utilized diagnosis/history codes in the OMOP observation and condition occurrence tables
3. This algorithm will be made available to researchers as part of the Phenotype library
  - a. Cohort builder implementation and notebook query implementation match

## **Issues encountered:**

1. Be careful about how you specify certain codes in cohort builder vs. notebooks

# Tutorial Workspace Example: Working with Survey Data



## Ex. How to query survey data

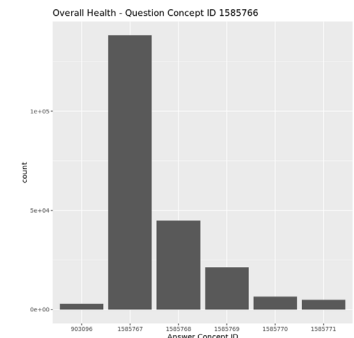
1. View a pdf of the **Overall Health Survey** using [Survey Explorer](#)
2. Identify question of interest:  
How confident are you filling out medical forms by yourself?  
 Extremely / Quite a bit / Somewhat / A little bit / Not at all / Skip
1. Go to [OHDSI ATHENA](#) to find the associated ID, Code, and Name

Question	Question ID (ID)	Question Code (CODE)	Question Name (NAME)	Data Type (CLASS)	Data Source (VOCAB)
How confident are you filling out medical forms by yourself?	1585766	OverallHealth_MedicalFormConfidence	Overall Health: Medical Form Confidence	Question	PPI

1. In a Notebook, query the *All of Us* custom `DS_SURVEY` table  
**WHERE** `question_concept_id = 1585766`

1. Output frequency table of answers
6. Plot counts of responses

Medical Form Confidence: Extremely	138210	63.1
Medical Form Confidence: Quite A Bit	44894	20.5
Medical Form Confidence: Somewhat	21420	9.8
Medical Form Confidence: A Little Bit	6586	3.0
Medical Form Confidence: Not At All	5040	2.3
PMI: Skip	2865	1.3
<b>Total</b>	<b>219015</b>	<b>100.0</b>



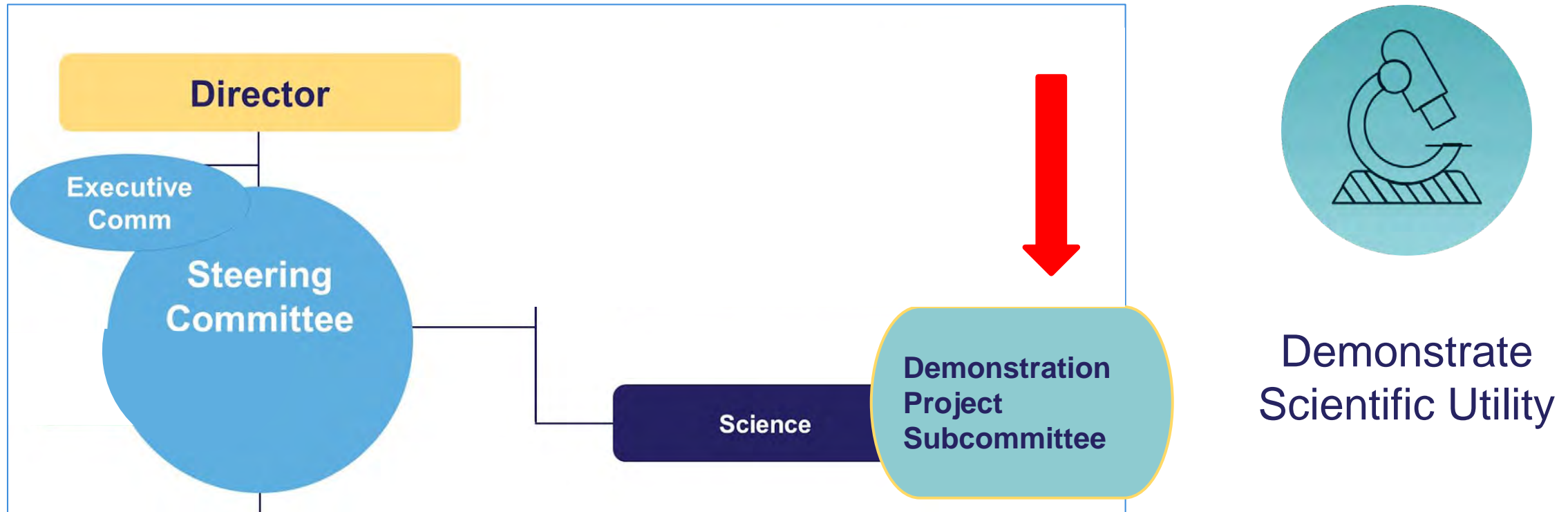
## Issues Encountered

- Data is formatted **long**
- “**Child questions**” are not always answered by the intended participants
- Several tables contain survey information [`DS_SURVEY`, `CONCEPT`, `OBSERVATION`, `OBSERVATION_EXT`] and **field names may vary**
- May be joined together, but that takes **computational time**



## All of Us Demonstration Project Subcommittee

*The DRC AoU Demonstration Projects will use Research Hub tools to characterize and validate the AoU cohort and data in order to demonstrate the quality, utility, and diversity of AoU data and tools. AoU Demonstration Projects will replicate known, previously published findings, and will not aim to discover new disease classifications, relationships, or risk associations -- **our role is to support the community's use of data, not to make first discoveries.***



**Members:** Andrea Ramirez (Chair), Kelly Gebo, Cheryl Clark, Elizabeth Cohn, Lucila Ohno-Machado, Mine Cicek, Eric Boerwinkle, Sheri Schully, Steve Mockrin



# AoU Science Committee: Demonstration Projects Subcommittee



**Goal: Fully executed research projects demonstrating the utility and validity of AoU data timed to publish at data platform launch, not novel discovery work.**

## Phase 1

*[DRC] Description, Replication, Utility Assessment*

## Phase 2

*[Consortium] Expanded Description, Replication, Utility Assessment*

## Phase 3

*[Consortium] Future Preceding new data types*

# Engaging a large consortium, covering broad health areas

<i>All of Us</i> Awardee	No. of Approved Projects
Trans-American Consortium for the Health Care Systems Research Network (TACH)	4
NYC Precision Medicine Consortium	4
The Participant Center	5
Asian Health Coalition	2
University of Arizona	4
New England Precision Medicine Consortium	4
California Precision Medicine	2
Stanford University	1
Illinois Precision Medicine Consortium	5
South East Enrollment Center (SEEC)	4
Data and Research Center (DRC)	3

Health Areas	No. Projects in Health Area
Cardiovascular Disease	7
Cancer	5 (2 overlaps with other area)
Diabetes and Obesity	6 (3 overlap with other areas)
Mental Health	2
Wellness	2
Opioids and Pain	2
Chronic Kidney Disease	1
Chronic lower respiratory disease	1
Neurodegenerative condition and cognition	1
Other areas: Environmental exposures, Health disparities, Infectious disease, Body temperature, Women's health, Pediatric data description, Hematologic disorders	13
Gap addressing projects: Ophthalmology Compare Census and CDC data in AoU Rare diseases	3

## D38: Exploration of Pediatric Data from *All of Us* -Is there pediatric data in AoU?

---



About

Get Involved

Funding and Program Partners


Protecting Dat

[All of Us](#) > [Get Involved](#) > **Participation**

## Participation

Participants are partners in the *All of Us* Research Program. They have access to their information, and by taking part, they have a chance to support new discoveries that may help their families and communities.

### Who Can Join

People over the age of 18 who are living in the United States can join the *All of Us* Research Program. You can sign up directly through [JoinAllofUs.org](https://JoinAllofUs.org) or at a participating [health care provider organization](#) .

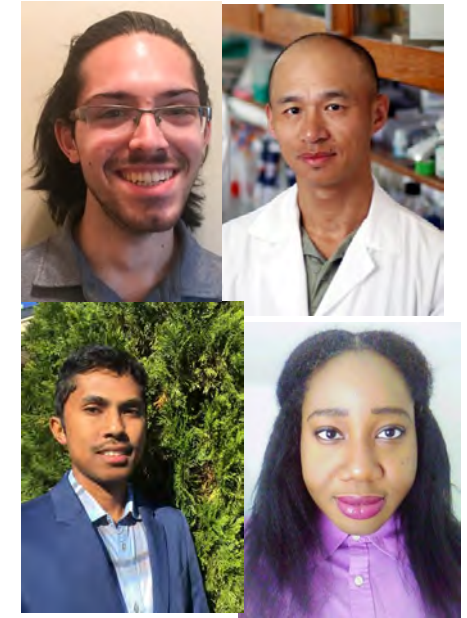
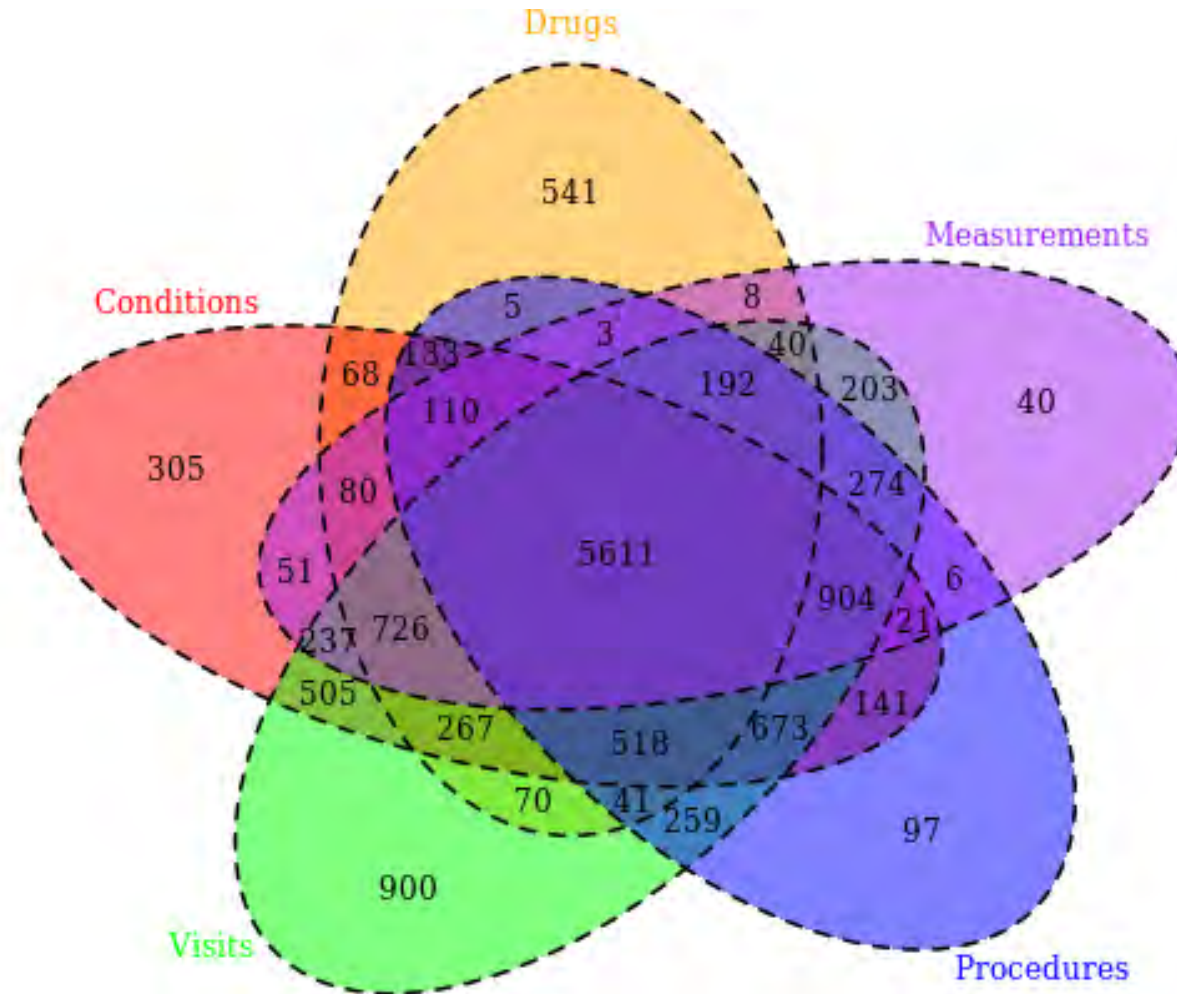
- When patients enroll, EHRs from childhood may come along
- Questions:
  - How much data is there?
  - What data types are there?
  - Can the data be used for pediatric research?

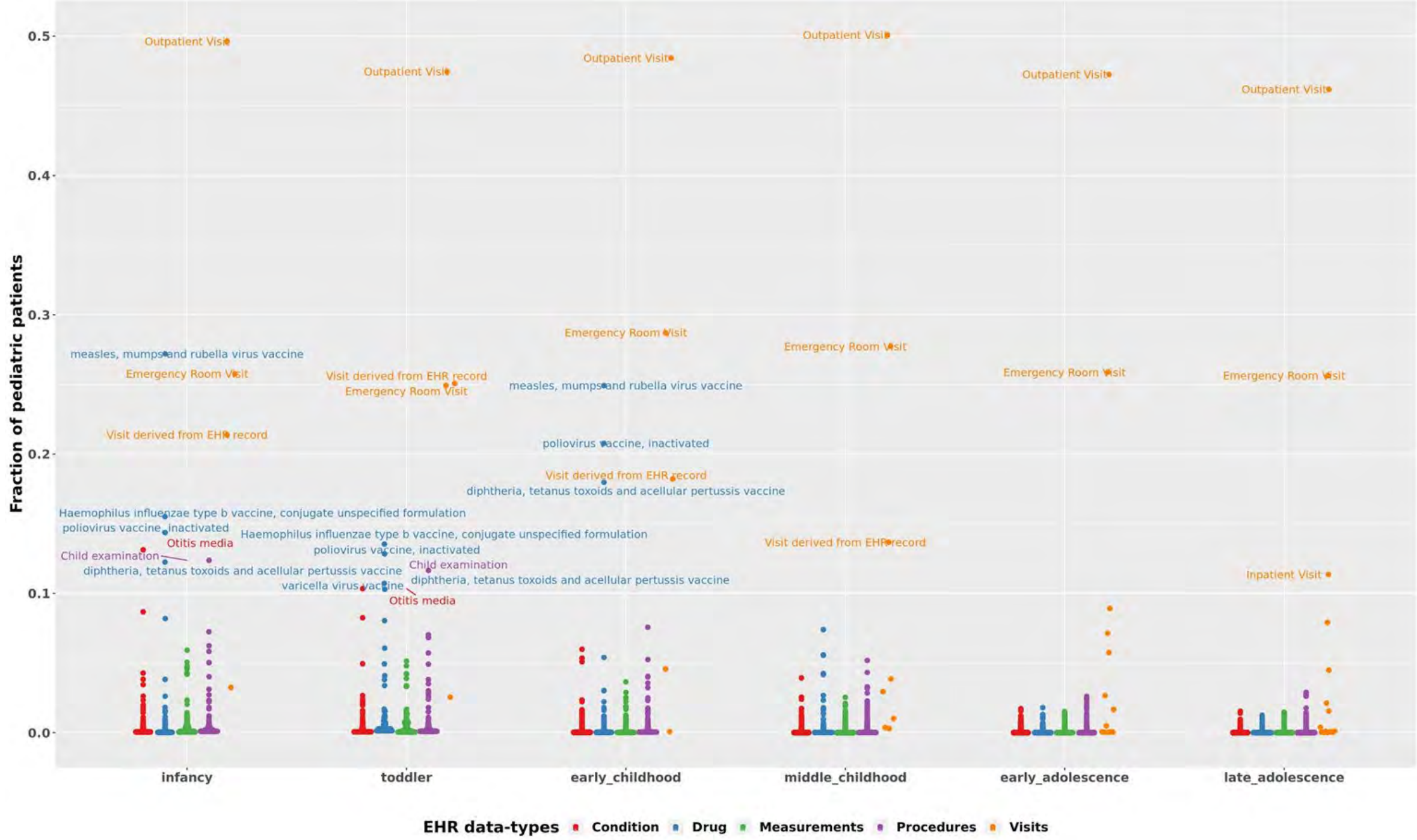


# D38: Exploration of Pediatric Data from *All of Us*

Patients with:

- Drugs: 4070
- Conditions: 4865
- Visits: 5718
- Procedures: 4537
- Measurements: 3633







# D43: Phenotype Risk Score (PheRS) Implementation

---

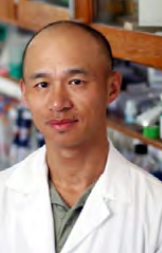
**Goal:** To replicate PheRS approach for three mendelian diseases including cystic fibrosis (CF), hereditary hemochromatosis (HH) and sickle cell (SC) anemia in allofus (AOU) cohort.

Contributors:

Jun Qian, Lisa Bastarache, David Schlueter, Janey Wang, Andrea Ramirez  
Vanderbilt University Medical Center

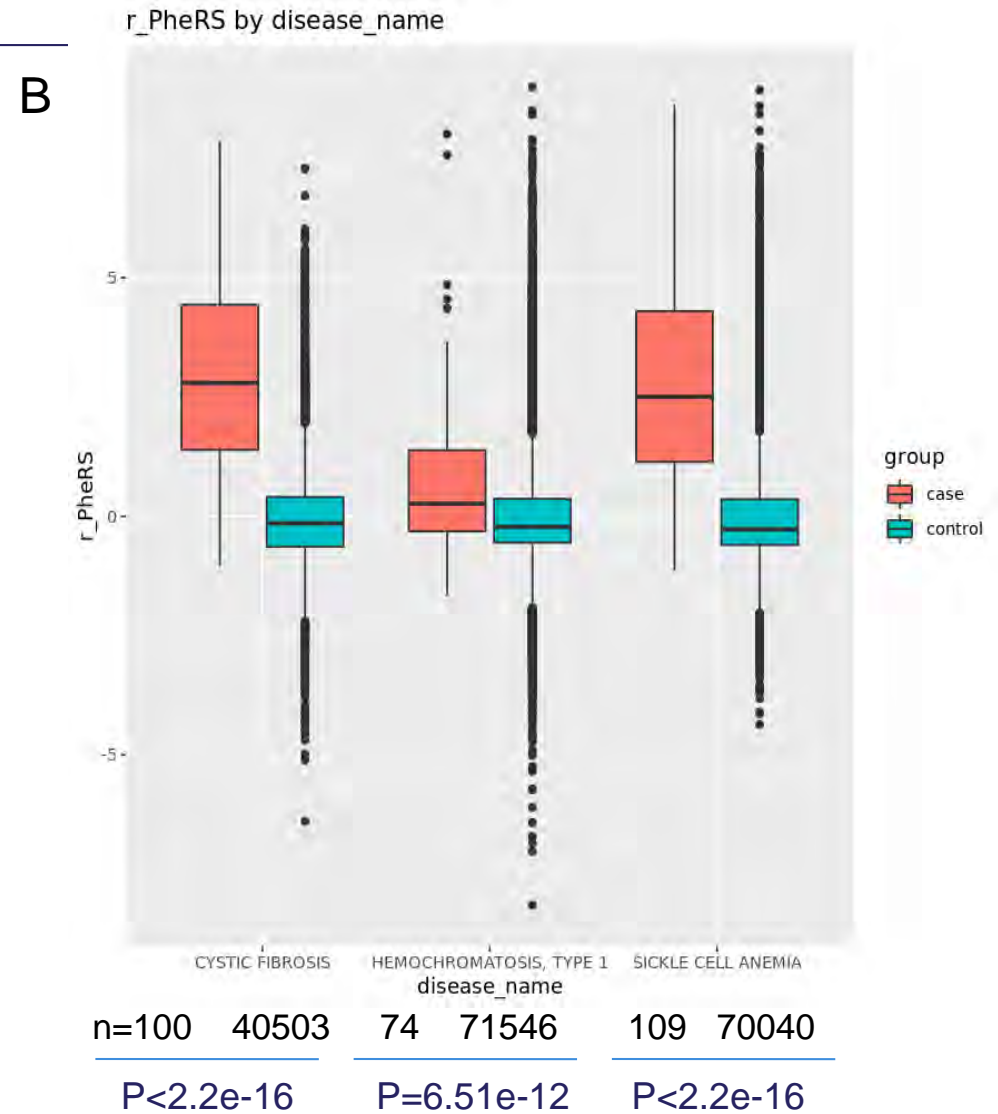
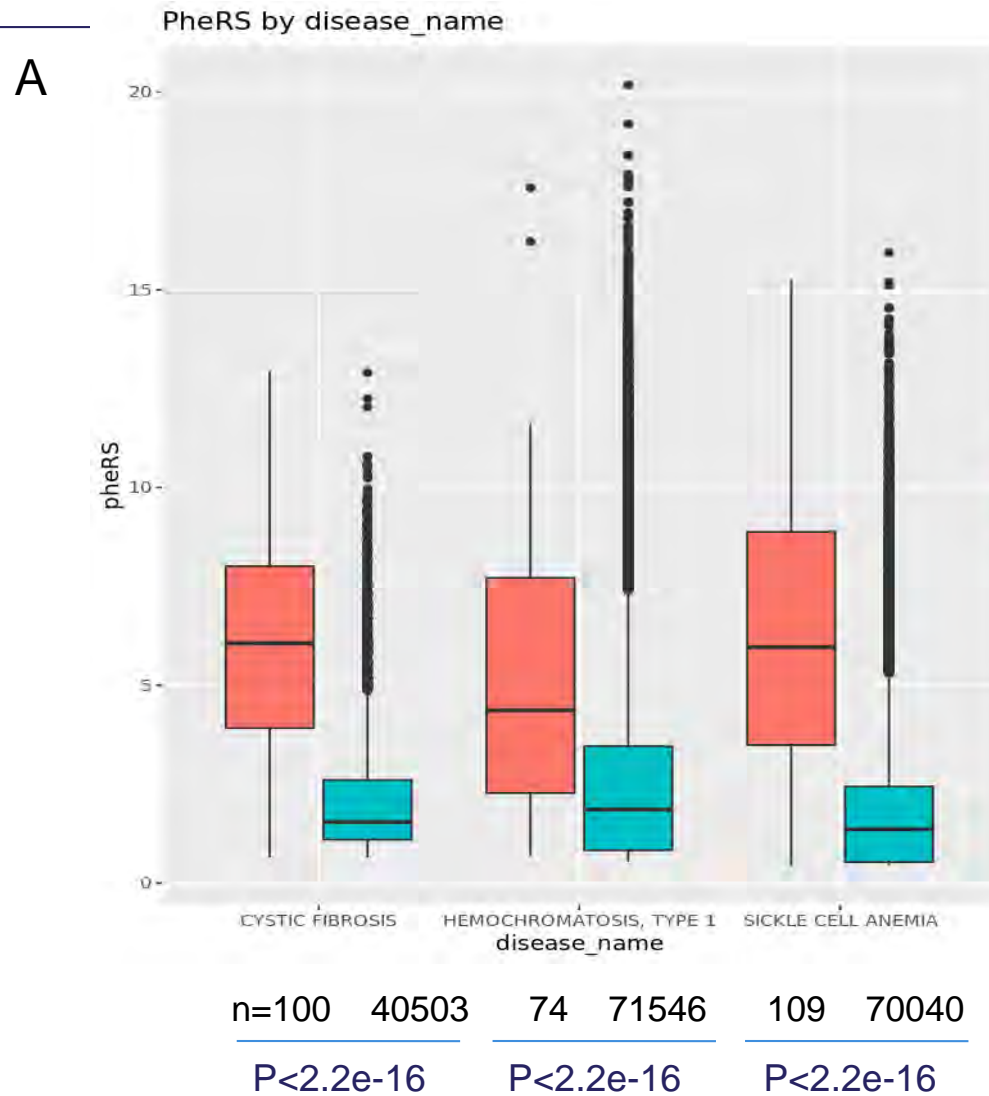
Ref: Lisa Bastarache, et al. **Phenotype risk scores identify patients with unrecognized Mendelian disease patterns.** *Science* 2018, 359 (6381), 1233-1239.  
DOI: 10.1126/science.aal4043

Improving the phenotype risk score as a scalable approach to identifying patients with Mendelian disease. *J Am Med Inform Assoc.* 2019 Dec 1;26(12):1437-1447.



# D43 PheRS Implementation

\*Initial results, analysis still in progress

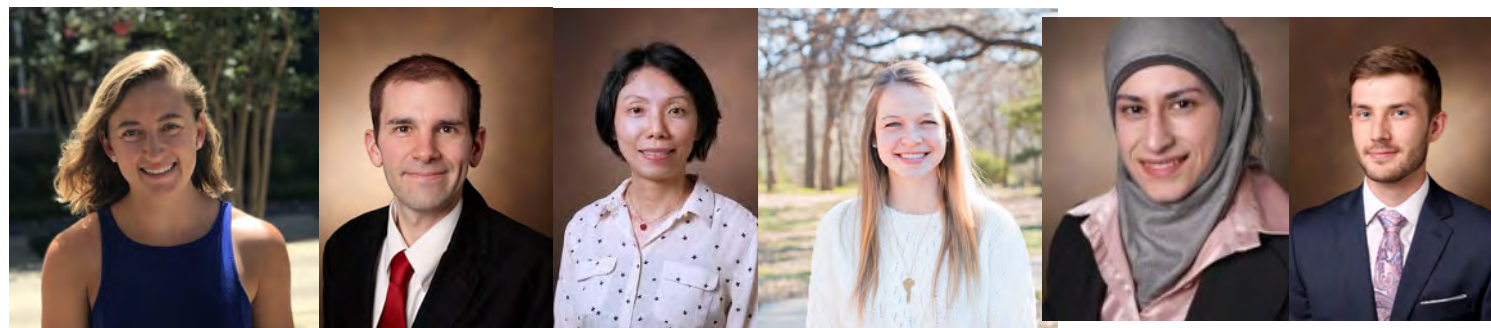


Raw PheRS (A) and studentized residuals of the raw PheRS (B) for three diseases in AOU EHR data. The regression model,  $\text{PheRS} \sim \text{bs}(\text{age}) + \text{sex} + \text{race} + \text{unique\_encounter\_years}$  was used for the  $r\_PheRS$  calculation (B). P values were calculated using Wilcoxon rank sum test.

## D44: Comparison of family health history gathered in survey and electronic health records in *All of Us* Registered Tier Data

- **Background and Methods**
  - **Family health history** is integral to clinical care and important to integrated precision medicine care
  - Prior studies show gaps in data from Electronic Health Record (**EHR**) structured fields
  - Prior studies have been assisted by **free text extraction**
  - Surveys have shown great promise using common data models

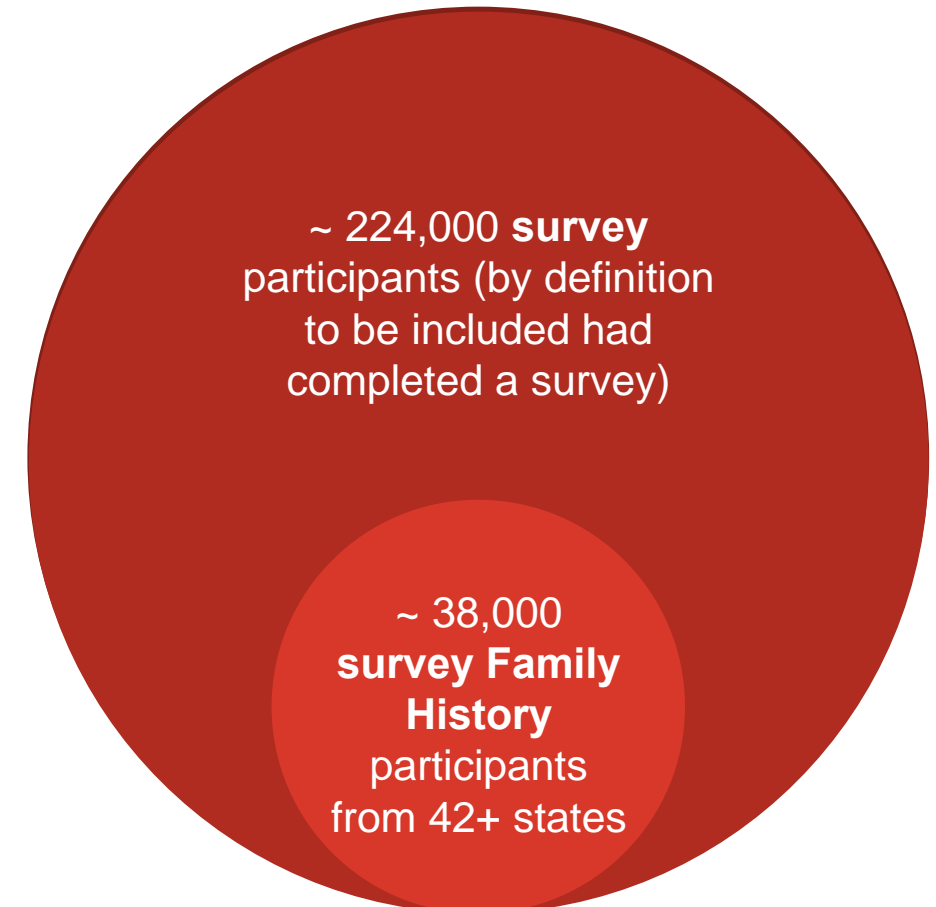
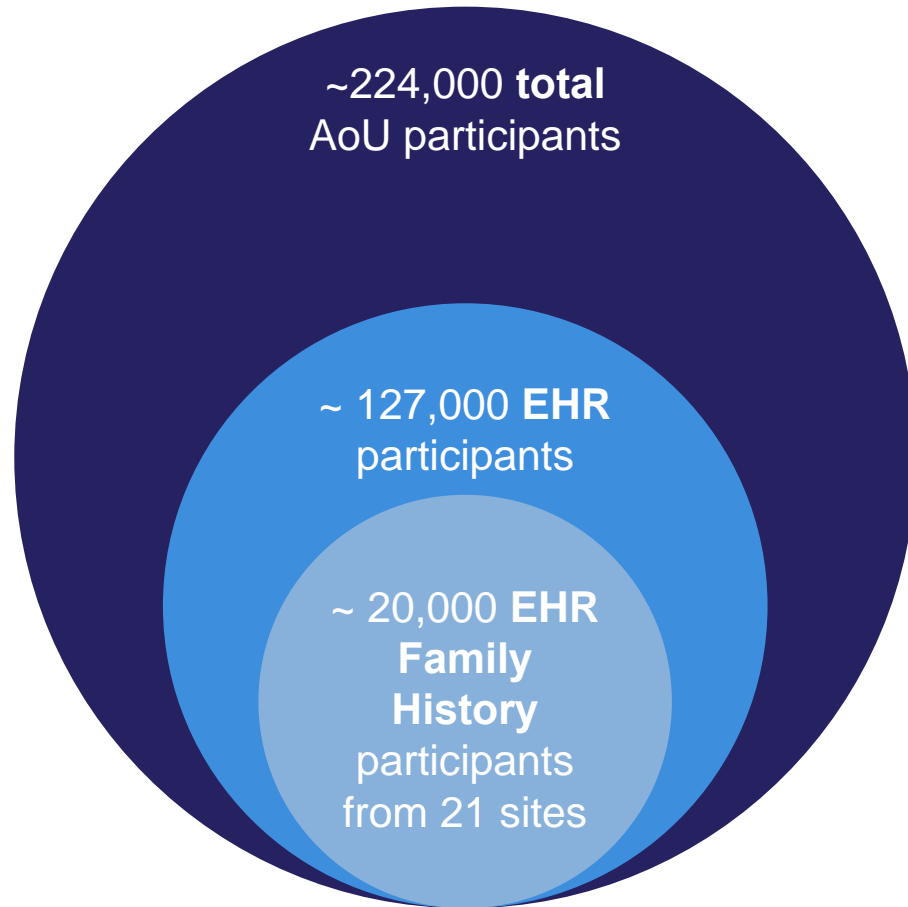
All of Us has **both** data sources for family health history information.



# Data and Research Center – Family History in EHR vs. Surveys

EHR

Surveys



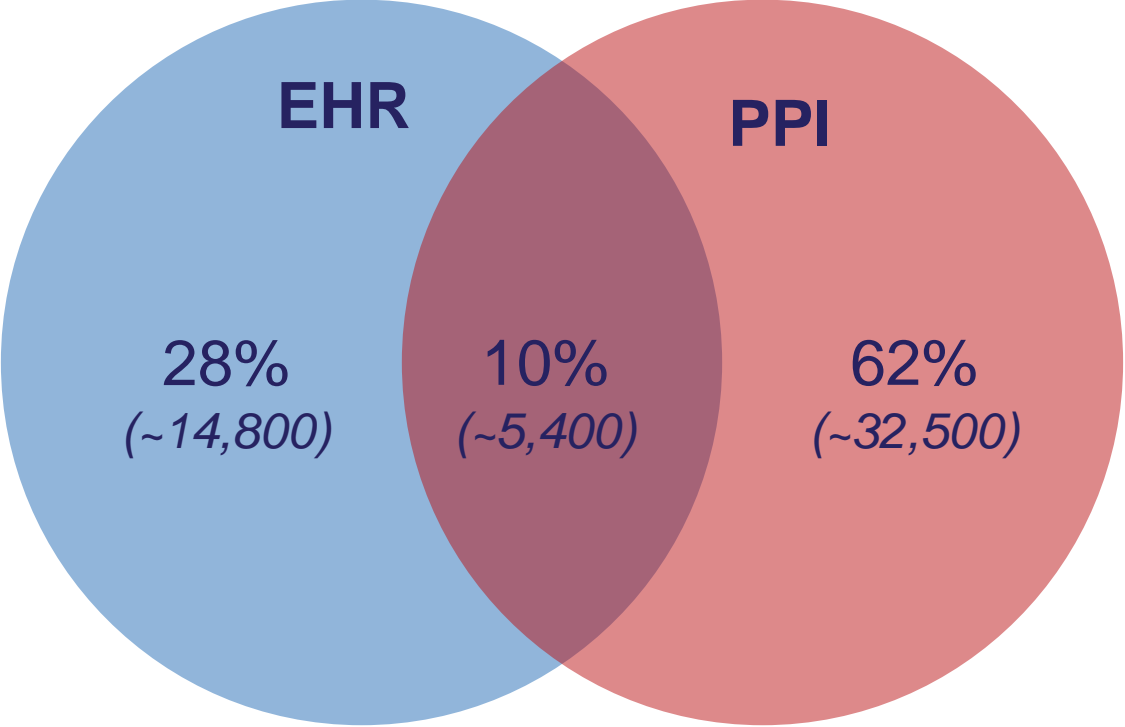
Is EHR confirming what we already knew from surveying participants? Or are we getting new information?

# Data and Research Center – Family History in EHR vs. PPI

---

- Results and Conclusions

*Participants with any Family History data*  
**Total: ~52,700**





## Phase II Demo Project Culmination Meeting

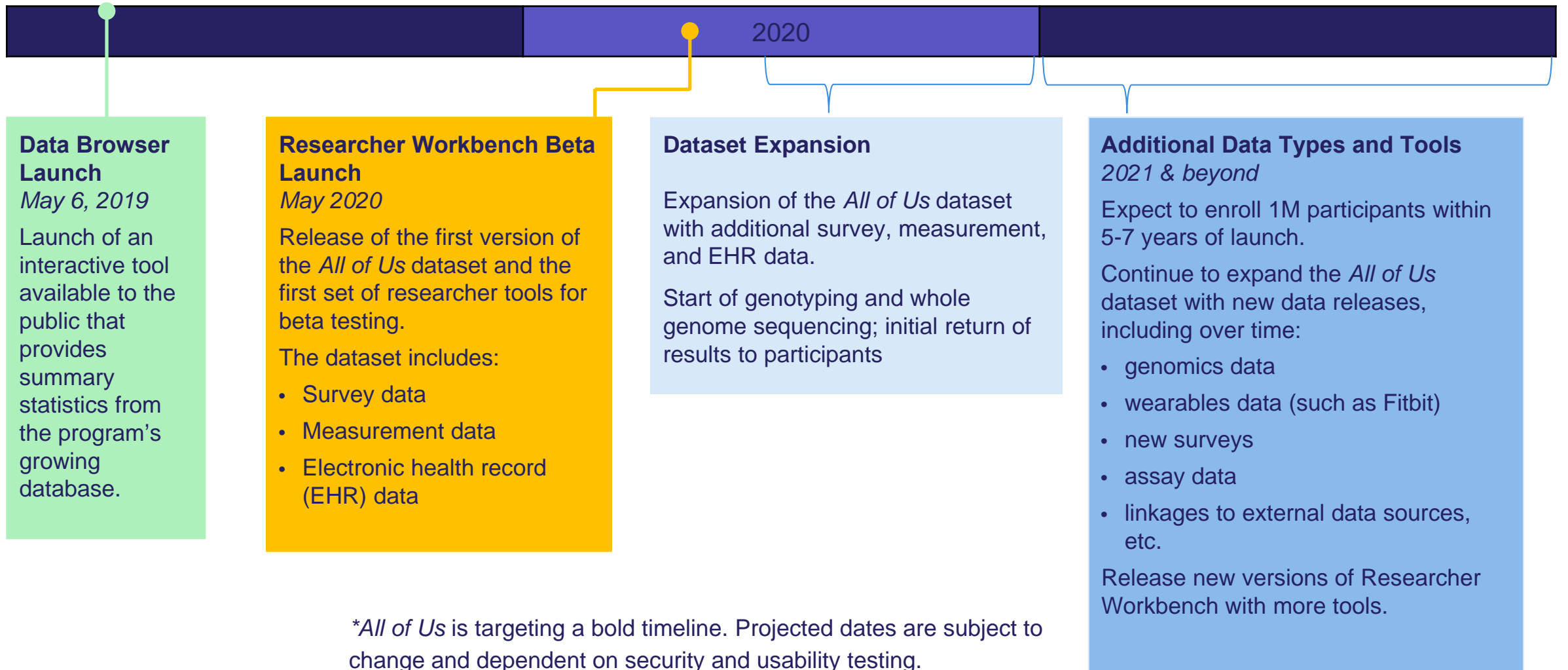
---

- 50 overall attendees, 26 demo project team members
- 9 out of 11 Consortium Awardees represented
- 22 different projects presented both on-site and remotely (of 38 total)
- Discussions around feedback mechanism and new beta features
- Discussions around authorship and alpha access next steps and publication of projects internally in Featured Workspaces

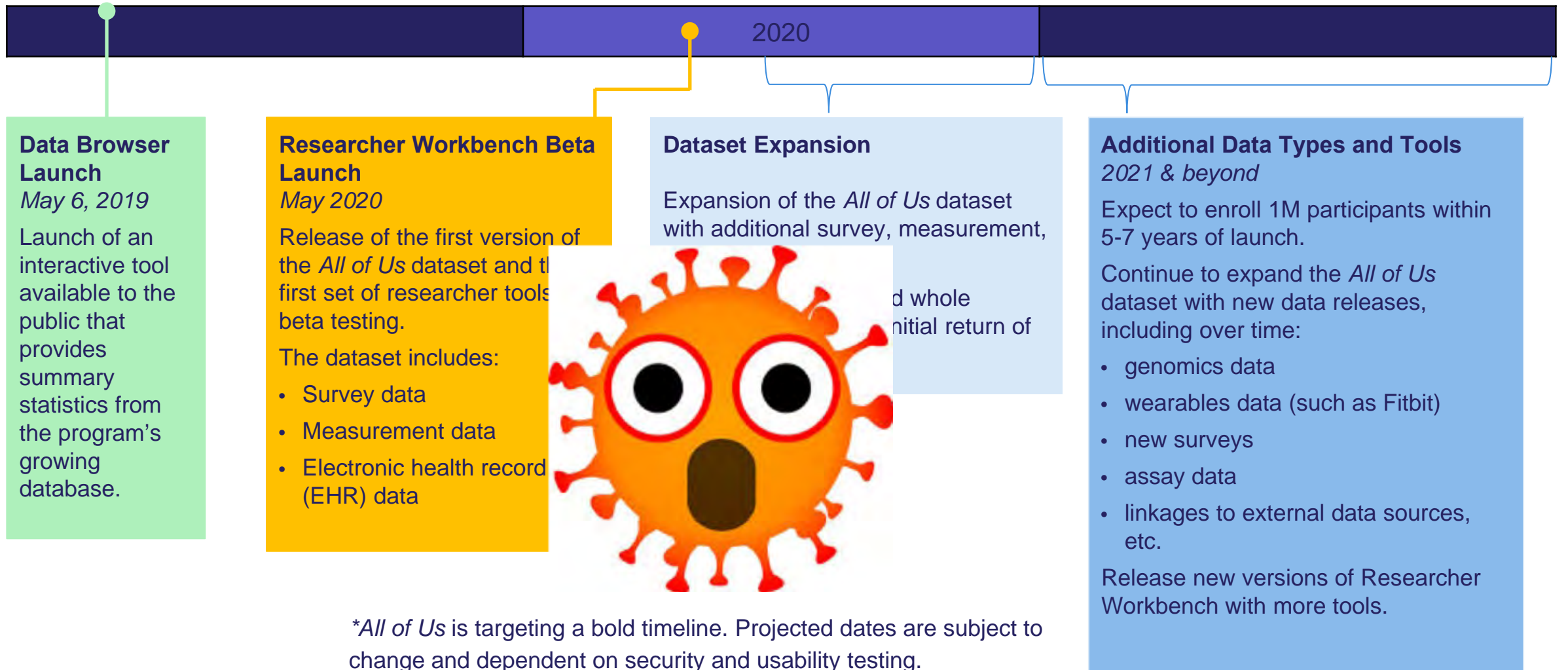
**JANUARY 2020**



# Data Release Timeline



# Data Release Timeline



\**All of Us* is targeting a bold timeline. Projected dates are subject to change and dependent on security and usability testing.



# NIH's All of Us Program Joins Fight Against COVID-19

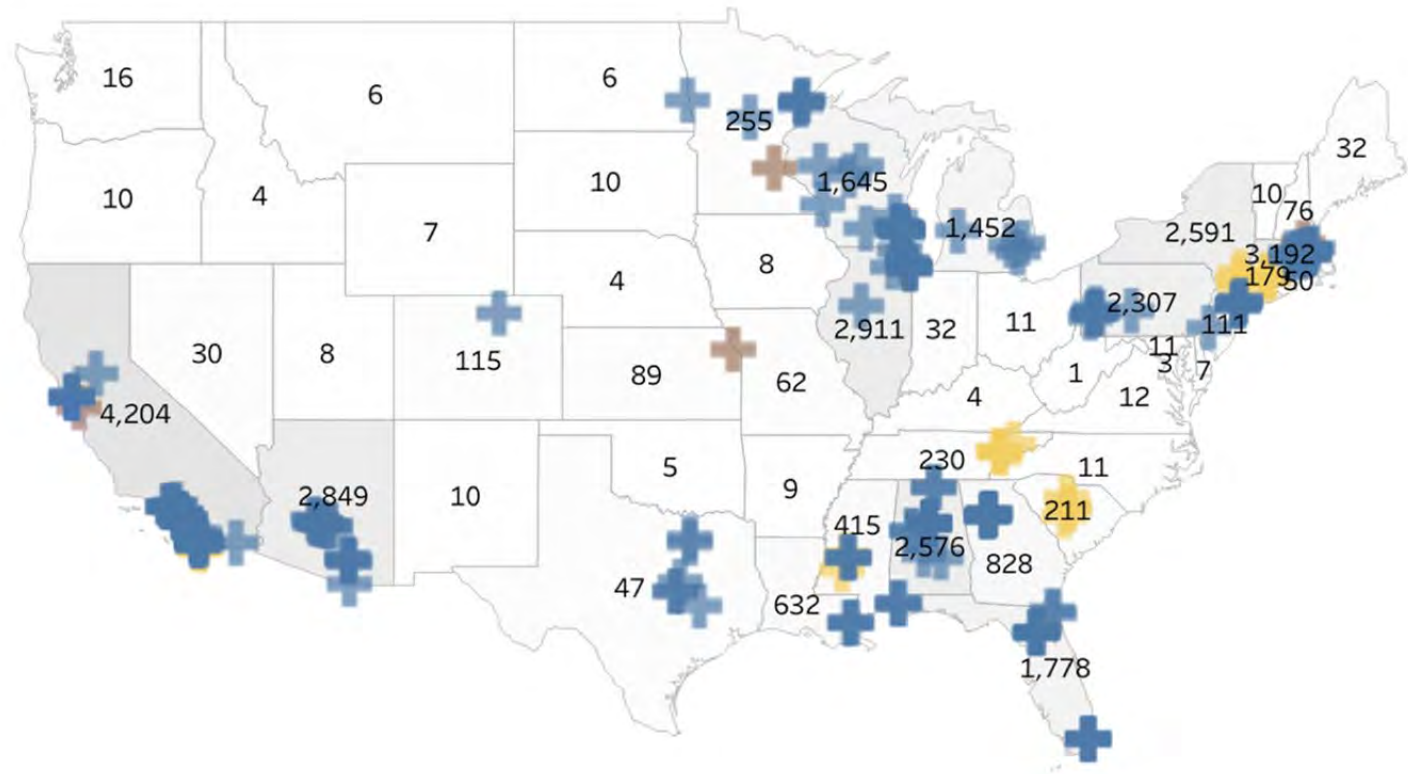
Posted on June 16th, 2020 by Dr. Francis Collins



We've learned so much about coronavirus disease 2019 (COVID-19), but there's still much more that we need to learn in order to defeat this devastating pandemic. Among the critical questions: why do some young people who

## Pivot to COVID-19

0. Enrollment paused in March
1. Serology study (see map)
2. EHR curation effort
3. New survey: longitudinal collection on health and well being

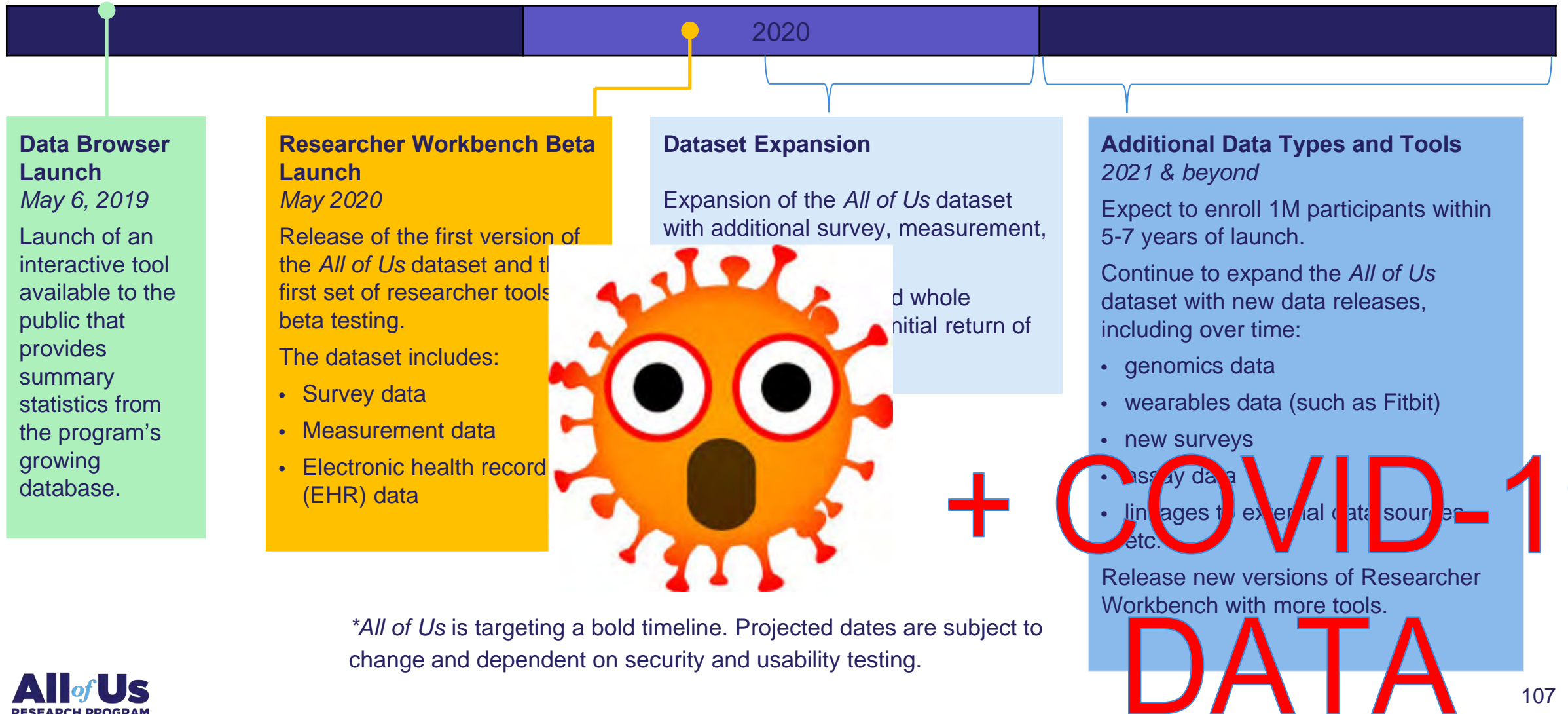


“Aside from physical health concerns, the pandemic may be stressful to many of us. It can be difficult to cope with fear and anxiety, changing daily routines, a general sense of uncertainty, financial and economic hardships, social isolation, and/or stigmatization. I join you in acknowledging there are other unforeseen effects stemming from this global health pandemic.

*Francis Collins, M.D., Ph.D., Director*

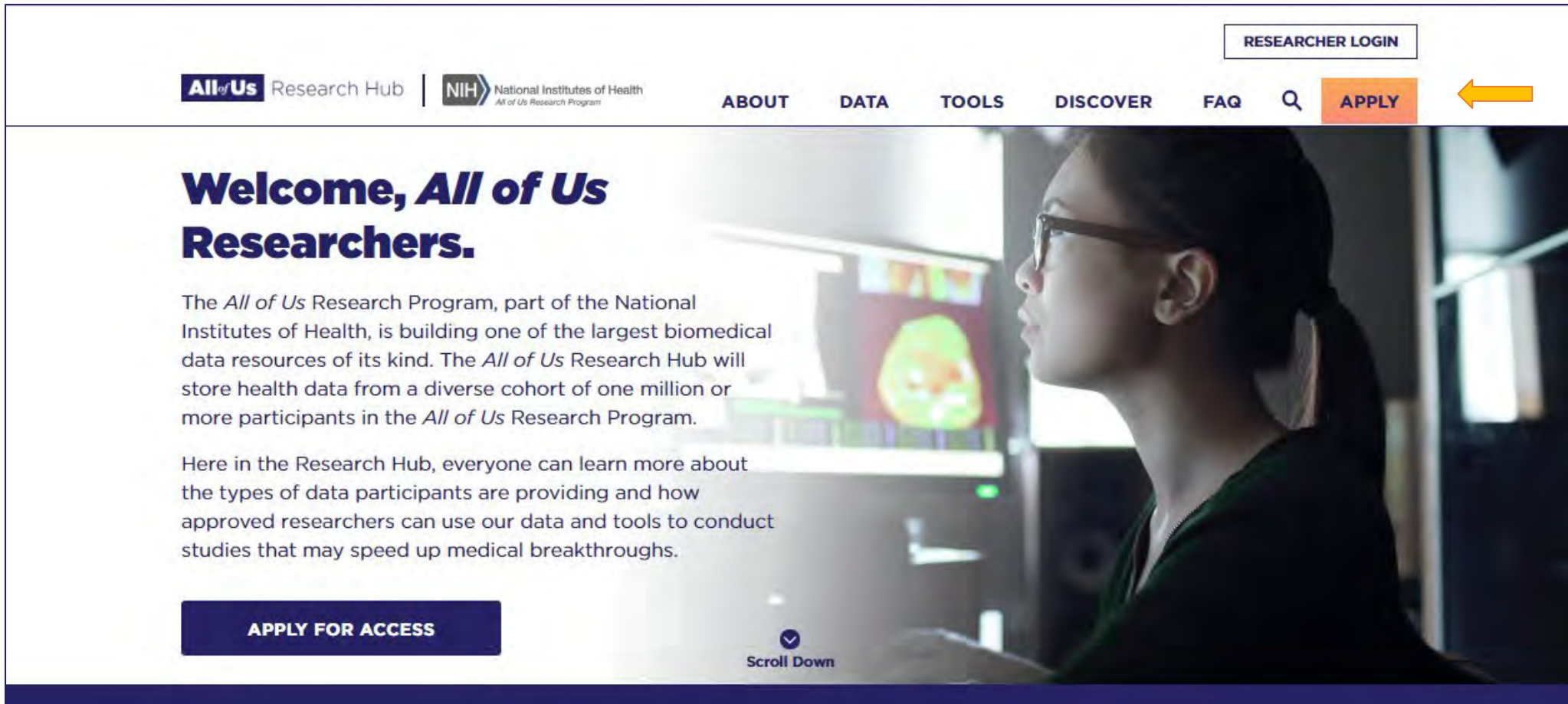


# Data Release Timeline



# Interested in becoming a Beta Researcher?

Visit [researchallofus.org](https://researchallofus.org) to apply!



The screenshot shows the top navigation bar of the All of Us Research Hub website. The navigation menu includes links for ABOUT, DATA, TOOLS, DISCOVER, and FAQ. The 'APPLY' button is highlighted in orange and has a yellow arrow pointing to it from the right. A 'RESEARCHER LOGIN' button is located in the top right corner. The main content area features a large heading 'Welcome, All of Us Researchers.' followed by a paragraph describing the program and a 'Scroll Down' indicator at the bottom.

**RESEARCHER LOGIN**

**All of Us** Research Hub | **NIH** National Institutes of Health  
*All of Us Research Program*

**ABOUT** **DATA** **TOOLS** **DISCOVER** **FAQ** **APPLY**

## Welcome, *All of Us* Researchers.

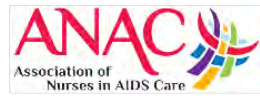
The *All of Us* Research Program, part of the National Institutes of Health, is building one of the largest biomedical data resources of its kind. The *All of Us* Research Hub will store health data from a diverse cohort of one million or more participants in the *All of Us* Research Program.

Here in the Research Hub, everyone can learn more about the types of data participants are providing and how approved researchers can use our data and tools to conduct studies that may speed up medical breakthroughs.

**APPLY FOR ACCESS**

✓  
Scroll Down

# All of Us Community and Provider Partner Network (as of January 2020)





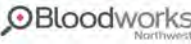
# All of Us Consortium Members *(beyond community partners, as of March 2020)*

## The Participant Center



## Communications & Engagement

## WONDROS



## HPO Network

(Health Care Provider Organizations)

### RMCs

#### All of Us California



Illinois Precision Medicine Consortium



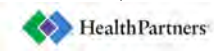
#### All of Us New England



#### All of Us Pennsylvania



Trans America Consortium



New York City Consortium



University of Arizona and Banner Health



#### All of Us Southern Network



#### FQHCs (Federally Qualified Health Centers)



All of Us SouthEast Enrollment Center



VA Medical Centers



## Participant Technology Systems Center (PTSC)



## Biobank



## Data & Research Center (DRC)



## Genomics Partners





**It takes *All of Us*....**





For more information...

Thank you!

[andrea.h.ramirez@vumc.org](mailto:andrea.h.ramirez@vumc.org)  
[@AndreaRamirezMD](#)



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National Institutes  
of Health

[ResearchAllofUs.org](https://ResearchAllofUs.org)  
*(to apply as a researcher!)*

**@AllofUsResearch**  
**#JoinAllofUs**

[AllofUs.nih.gov](https://AllofUs.nih.gov)

[JoinAllofUs.org](https://JoinAllofUs.org)




Precision Medicine Initiative, PMI, All of Us, the All of Us logo, and "The Future of Health Begins with You" are service marks of the U.S. Department of Health and Human Services.

**Additional Slides**

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**Screenshot Walk Thru**

# Underrepresented in Biomedical Research (UBR) Definitions

Category	<i>All of Us</i> UBR definition
<i>Ancestry (Race/Ethnicity)</i>	Participant identifies as any race or ethnicity other than White, including Multi-Ancestry (any combination of 2 or more races)
<i>Age</i>	Participant is under 18 or 65 or over at time of consent
<i>Sexual &amp; Gender Minorities</i>	<p><b>Biological sex at birth:</b> Participant self-reports intersex as their sex assigned at birth</p> <p><b>Gender Identity (GI):</b> Participant identifies as anything other than man or woman (e.g., non-binary, transgender, etc.)</p> <p><b>Sexual Orientation (SO):</b> Participant identifies as anything other than straight (e.g., gay, lesbian, bisexual, etc.)</p>
<i>Income</i>	Participant with household income equal to or below two times the Federal Poverty Level
<i>Educational Attainment</i>	Participant is currently without a high school diploma or GED
<i>Geography</i>	Participant's zip code is within the list of Rural/Non-Metropolitan zip codes (per HRSA's Federal Office of Rural Health Policy)
<i>Access to Care</i>	Participant cannot readily use the health care system or pay for needed care
	Participant has a physical and/or cognitive disability

# Questions & Answers

Please submit all questions through the question box.



CMSS WEBINAR SERIES

Advancing Clinical Registries to Support Pandemic Treatment and Response

# Summary & Evaluation

- Thank you to all our panelists.
- A recording of the webinar will be available on the CMSS website in the coming weeks.
- Please complete a short evaluation following the webinar.
- For more information, contact [info@cmss.org](mailto:info@cmss.org).



CMSS WEBINAR SERIES

[Advancing Clinical Registries to Support Pandemic Treatment and Response](#)





CMSS WEBINAR SERIES

Advancing Clinical  
Registries to Support  
Pandemic Treatment and  
Response

The series will address key questions related to the rapid development, deployment and implementation of Covid-19 focused clinical registries and clinical repositories by specialty societies and academia.

SUMMER 2020 | FREE TO ATTEND

Upcoming Webinars:

---

Aug. 12

Prioritizing Patient Engagement and Inclusion of Patient-generated Data

Sept. 1

Using Clinical Registries to Address Disparities in Covid-19



## CMSS WEBINAR SERIES

Advancing Clinical Registries to Support Pandemic Treatment and Response

### Upcoming Webinar:

---

Prioritizing Patient Engagement and  
Inclusion of Patient-Generated  
Covid-19 Data

Aug. 12 | 1:00 - 2:30 pm ET

### Moderator:



**Susannah Fox**

Principal, Internet Geologist LLC;  
Former Chief Technology Officer,  
US Department of Health and  
Human Services

### Host:



**Helen Burstin, MD, MPH, MACP**

Chief Executive Officer  
Council of Medical Specialty  
Societies (CMSS)

### Panelists:



**Gina Assaf**

Independent digital design  
consultant, Leading the Patient-  
Led Research Group within Body  
Politic



**Hannah Davis**

Researcher with the Patient-Led  
Research Group within  
Body Politic



**Emily Sirotych**

COVID-19 Global Rheumatology  
Alliance; Canadian Arthritis Patient  
Alliance; Department of Health  
Research Methods, Evidence, and  
Impact, McMaster University



**Gary Wolf**

Co-Founder, Quantified Self