

**Centre for Digital Transformation of Health** 



# Unlocking the Value of Health Data with Large Scale Analytics

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Austin Health

Clinical Informatics Director (Austin)

Centre for Digital Transformation of Health, University of Melbourne

Acknowledgements: Assoc Prof Doug Boyle, Dr Christine Hallinan, Dr Roger Ward Mr Andrew Howard.

Austin Health and the University of Melbourne acknowledge the Traditional Owners of the land on which we meet today, the Wurundjeri people and all members of the Kulin nation.

We would like to pay our respects to Elders past and present and extend that respect to other Aboriginal and Torres Strait Islander people who are here today.

# Data is Generated Everywhere – in the petabytes

- Health is no exception
  - How best to harness this information and transform into actionable knowledge?
  - Domains of Practice and Influence/Control
  - Administrative local, state and federal
  - Clinical Audit, Financial,
  - Clinical Quality Registries Professional Societies, ACSQHC, Jurisdictions
  - Research clinician led (+/- Grant funded),
     Academic, industry led
    - Single site, multi site, multi jurisdictional, linked, unlinked

# What is "VALUE"

- Value derives from the formative use of information to influence and innovate behaviours and therapies and evaluate the consequences of our actions and change.
- The efficient creation, dissemination and use of information provides best value to the community



**SHORT** Learning Healthcare Systems Academy

Centre for Digital Transformation of Health



### **Applied Learning Healthcare Systems**

Training the future champions of digital transformation of the health system.

Do you want to learn to use health data to inform clinical practice and to design and validate digital health-enabled models of care?

The Centre for Digital Transformation of Health (DT4Health) is offering selected enrolment in an online pilot of a short course on creating a digital health-enabled Learning Healthcare System.

This course is to support you, your organisation and ultimately the health sector in developing and implementing digital health innovations to improve clinical decision making and healthcare

You will gain the fundamental knowledge and skills in clinical informatics and digital health that you need to apply the Learning Healthcare System approach to practice improvement:



- gain hands-on experience working through the phases of a Learning Healthcare System
- · step through a scenario of improving diabetes management

- · use real healthcare data to gain new knowledge to drive practice change
- · design, build and validate components of a remote monitoring system

Practice to Data

- · create an implementation and evaluation
- · measure whether digital health innovations actually work

### Information session

5:30-6:30pm Mon 23 August 2021 Hear from program leaders, followed by a Q & A.

### What are the prerequisites?

- strong interest in the topic and commitment to complete the course and engage in real-time sessions
- no programming experience or healthcare expertise required
- agreement to take part in evaluation of this pilot, so that we can use the learnings to tailor future programs to meet health sector needs

### What is "VALUE": Perspective Statements for data custodians, researchers, & funders

Data custodians, researchers, and funders have various expectations from the data market place, which is driven by their varying ideas for how to apply data for analytical research, nature of research undertaken, and transformative changes it brings to health practice.



### Complication: Problem statements for data custodians, researchers, & funders

Data custodians, researchers, and funders have various expectations from the data market place, which is driven by their varying ideas for how to apply data for analytical research, nature of research undertaken, and transformative changes it brings to health practice.



# Where Does the Data Live?

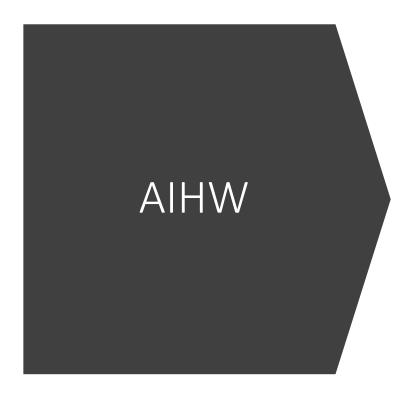


Research Data Australia

More than ever we're recognising the value of data and the huge amount of untapped potential in our nation's extensive research data collections.

That's why services such as Research Data Australia (RDA) are essential. The RDA is an online portal for finding research data and associated projects, researchers, and data services. You can find, access, and reuse data for research from over one hundred Australian research organisations, government agencies, and cultural institutions. RDA covers a broad spectrum of research fields from science, technology.

Australian Research Data Commons









# Public Health Research Network

News & Events

# Centre for Victorian Data Linkage

'n.org.au/



Committee Login

Q Search

GO



About Us For Researchers For the Community Publications

### What is PHRN?

PHRN is a national network of data linkage units, a secure data laboratory and e-research services which support researchers access to linked population data.



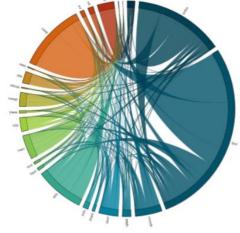
LEARN MORE

### What linked data is available from CVDL?

The CVDL receives internal, departmental and external research requests to link data within and across datasets and has undertaken more than 500 linkage requests since 2009. During the first few years of the CVDL's operation, most linkage was undertaken on a project-by-project basis. During the past couple of years, the CVDL has developed the Victorian Linkage Map, which provides an enduring resource of linked datasets.

The Victorian Linkage Map (VLM) is a system of linked records that are identified as belonging to the same person across 30 different Victorian health and human services datasets, including the following:

- · Victorian Admitted Episodes Dataset
- · Victorian Emergency Minimum Dataset
- Victorian Cost Data Collection
- · Public mental health services
- · Alcohol and Drug Information System
- Victorian Integrated Non-Admitted Heath Dataset
- Elective Surgery Information System
- · Victorian Cancer Registry
- · Victorian Radiotherapy Minimum Dataset
- . Mental Health Community Support Services
- Family Services
- · Family Violence Services
- Sexual Assault Services
- Disability Services
- · Youth Justice
- Homelessness Services
- Victorian Death Index
- Community Health
- Child Protection
- Public Housing Tenancies
- · Perinatal data collection
- · Home and Community Care

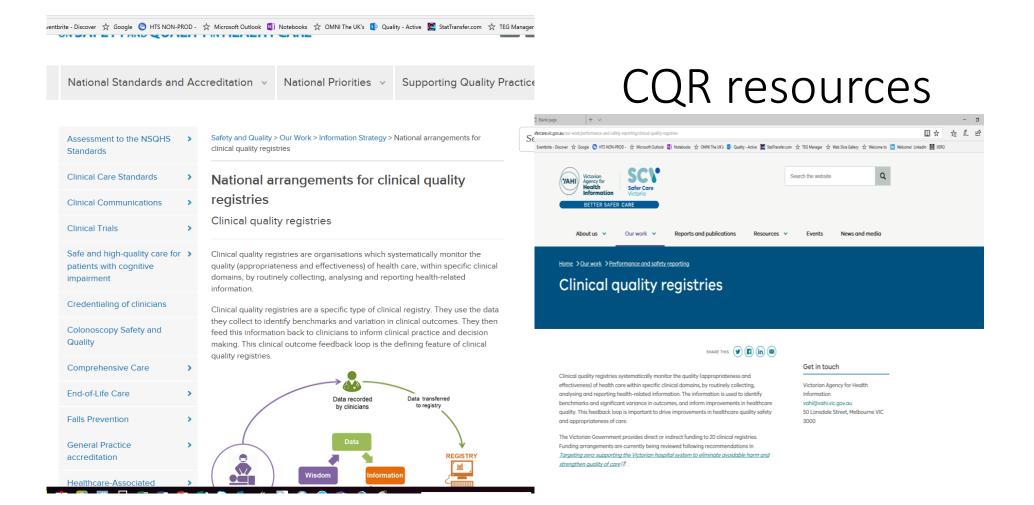


- Dental Health Program Dataset
- · Early childhood intervention
- · Births Registry
- · Public housing applications
- Cradle to Kinder program
- · Early Parenthood Centers
- Public Health Event Surveillance System

### How does CVDL protect privacy?

The CVDL has developed a range of robust processes to ensure compliance with the requirements of the Privacy and Data Protection Act and Health Records Act, as well as best practice data linkage techniques. This includes approval by data custodians for use of the data, and, where required, development of a Privacy Impact Assessment, and approval by an accredited Human Research Ethics Committee.

The CVDL employs data separation to help protect an individual's privacy during the linkage and integration process. This separation means that an individual's identifying information is kept separate from the corresponding content information and access by the CVDL staff is restricted to either one type of data or the other.



### Monash Dept Epidemiology and Preventive Medicine

Cancer & Blood Diseases, Cardiovascular Disease, ,Critical Care, Trauma & Perioperative Medicine, Development, Stem Cells & Regenerative Medicine, Infection, Inflammation & Immunity, Metabolism, Obesity & Men's Health, Neurosciences & Mental Health, Public Health & Health Systems Improvement, Women's, Children's & Reproductive Health

## POLAR



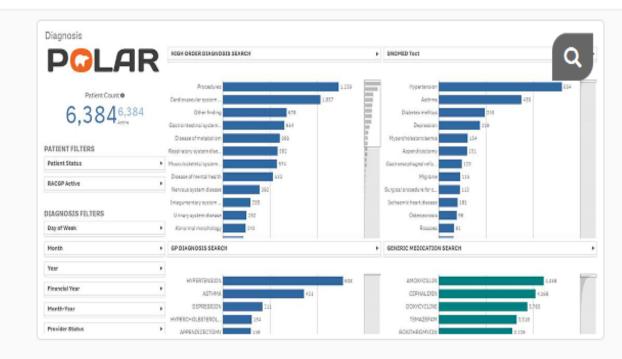


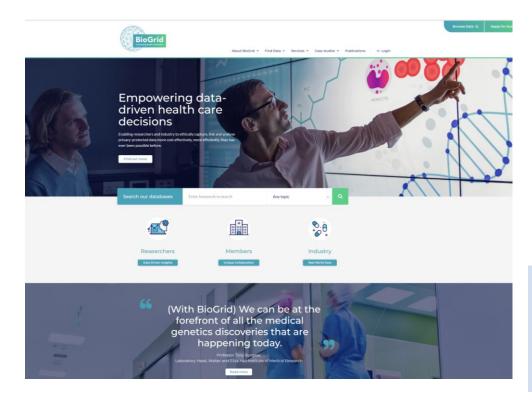
HOME ABOUT US V SERVICES V CONTACT US 4

### **POLAR GP**

Advanced data mining and analysis

This "business intelligence tool" is based on extracted data for clinical/billing software, for GPs, Practice Managers and other staff to use within their practice to help provide better patient centred care, quality improvement and support business development.







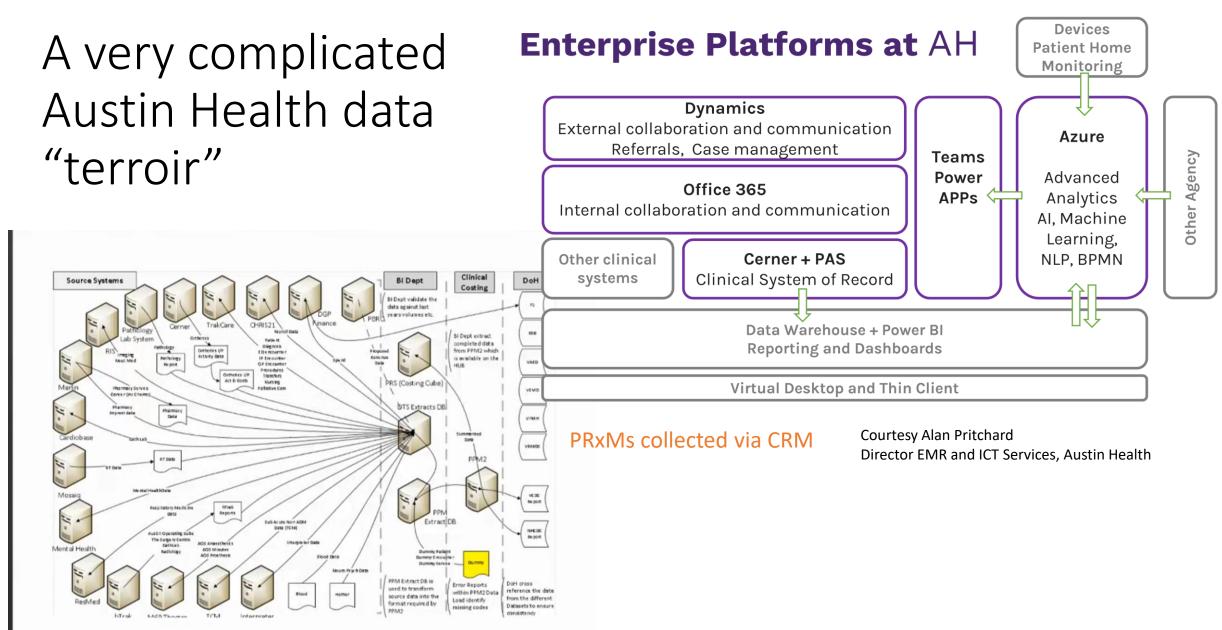
http://www.datafordecisions.com.au/

- Largest PBRN in Australia. 140 practices, 2M patients
- Epidemiological research
- Direct research agreement between participating practices and the University hospital networks..
- Translational research including trialling new care processes, interventions and clinical decision support tools like Future Health Today <a href="https://futurehealthtoday.com.au/">https://futurehealthtoday.com.au/</a>.

Other local Data Linkage / GP systems

• Bio Grid:

PATRON



Courtesy Ronald Ma, Clinical Costing Specialist, Austin Health





Run Query New Query Print Query 3 Groups

Hospital C

Hospital D

223±3

### SHRINE: Enabling Nationally Scalable Multi-Site Disease Studies

Andrew J. McMurry<sup>1,2,3,4</sup>, Shawn N. Murphy<sup>3,5,6</sup>, Douglas MacFadden<sup>1</sup>, Griffin Weber<sup>3,7</sup>, William W. Simons<sup>1</sup>, John Orechia<sup>8</sup>, Jonathan Bickel<sup>2,9</sup>, Nich Wattanasin<sup>5</sup>, Clint Gilbert<sup>1</sup>, Philip Trevvett<sup>1</sup>, Susanne Churchill<sup>3,5</sup>, Isaac S, Kohane<sup>1,2,3</sup>

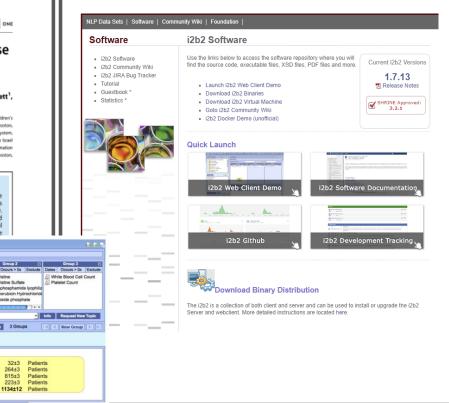
1 Center for Biomedical Informatics, Harvard Medical School, Boston, Massachusetts, United States of America, 2 Children's Hospital Informatics Program, Children's Hospital Boston, Boston, Massachusetts, United States of America, 312b2 National Center for Biomedical Computing, Brigham and Women's Hospital, Boston, Massachusetts, United States of America, 4 Bioinformatics Program, Boston University, Boston, Massachusetts, United States of America, 5 Partners Healthcare System. Research Computing, Boston, Massachusetts, United States of America, 6 Massachusetts General Hospital, Boston, Massachusetts, United States of America, 7 Beth Israel Deaconess Medical Center and Harvard Medical School Information Technology, Boston, Massachusetts, United States of America, & Clinical Research Information Technology, Dana-Farber Cancer Institute, Boston, Massachusetts, United States of America, 9Information Systems Department, Children's Hospital Boston, Boston, Massachusetts, United States of America

### Abstract

Results of medical research studies are often contradictory or cannot be reproduced. One reason is that there may not be enough patient subjects available for observation for a long enough time period. Another reason is that patient populations may vary considerably with respect to geographic and demographic boundaries thus limiting how broadly the results apply. Even when similar patient populations are pooled together from multiple locations, differences in medical treatment and record systems can limit which outcome measures can be commonly analyzed. In total, these differences in medical

- 200 US AcuteHospitals
- EMR extracts to Common metadata repository
- Researcher Interface allows search criteria
- Platform gueries metadata repositories to identify location and number of patients

Researcher contacts data custodians for permission to contact patients or access to data





NETWORK RESEARCH DATA ENGAGEMENT FRONT DOOR



PCORnet represents data from everyday encounters with more than 30 million people annually across the U.S.

Data Resources

Data is the backbone of PCORnet, and the scale, quality, and security of PCORnet-accessible data is a differentiator for the Network. PCORnet Network Partners perform rigorous work upfront that enables users to ask the same question to millions of people across the United States simultaneously, with fast answers delivered in a single, standardized format.

### >30 Million in the Network

PCORnet represents data from everyday encounters with more than 30 million people across the U.S. each



Data Sources

Data accessible via the PCORnet distributed network draw from millions of electronic health records (EHRs) with growing links to patient-reported and payor data to create a powerful, standard data set that facilitates large-scale, multi-site research

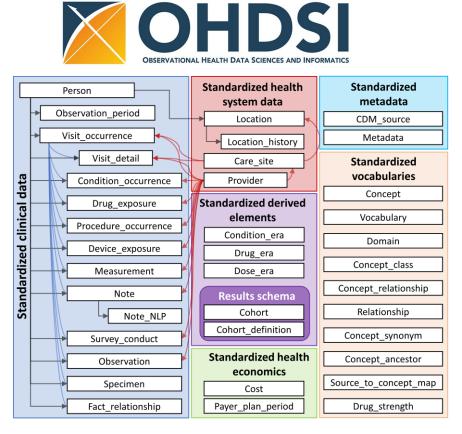
PCORnet Network Partners have developed policies and other critical documentation to ensure the quality, facilitate the accessibility, and govern the use of the PCORnet Common Data Model and resources.



# International Data Models for Research

# Possible Path through the Tower of Babel??







Consolidated Reports to Hospitals, Jurisdictions

? Consumers?

Single Site Outcome Research

Multicentre Outcome Research

PAS s







www.ohdsi.org

### The European Health Data & Evidence **Network Portal**

The European Health Data & Evidence Network (EHDEN) project aspires to be the trusted observational research ecosystem to enable better health decisions, outcomes and care. Its mission is to provide a new paradigm for the discovery and analysis of health data in Europe, by building a large-scale, federated network of data sources standardized to the OMOP common data model.



Learning for Anyone, Anywhere









### OHDSI APAC conference July 13-14, 2023

John Niland Scientia building (The Galleries) at UNSW Randwick Campus.

### **OHDSI APAC - Our Asia-Pacific Community**

OHDSI is a global, multi-stakeholder, interdisciplinary and open-science network that collaborates to bring out the value of health data through large-scale analytics. Our Asia-Pacific (APAC) community comprises seven regional chapters (Australia, China, India, Japan, Singapore, South Korea, Taiwan) and has led important OHDSI initiatives. around the world.

### **OHDSI APAC Community in Teams**

The APAC community has its own group in the OHDSI MS Teams environment to promote greater collaboration on our collaborative efforts. First, request access to our MS Teams Environment, then request access to our OHDSI APAC workgroup.



### **APAC Monthly Community Call**

Everybody is invited to the monthly OHDSI APAC community call, which takes place the third Thursday of each month at 12 pm Korea time. These calls are meant to provide updates, share research presentations, collaborate on topics of shared interest, and plenty more. The upcoming schedule is available to the right.

Use this link to get to the bi-weekly meeting. The recordings from all 2023 calls will be posted here; recordings from both the 2021 and 2022 calls are available here.

### Ongoing APAC Studies

In 2021 APAC Symposium, the four studies below were selected by the community to work together

- · Characterization of non-communicable disease across the pre- and post- COVID-19 era by Seng Chan You
- . Comparison of mortality, morbidities & healthcare resources utilization between patients with and without a diagnosis of COVID-19 by
- Celine Chui (cceline@connect.hku.hk), Shirley Li (sxueli@hku.hk), Eric Wan (yfwan@hku.hk) . Real world safety of treatments for multiple sclerosis - by Nicole Pratt (nicole.pratt@unisa.edu.au)
- Quality assessment of CDM databases across the OHDSI-AP network by Chungsoo Kim (ted9219@ajou.ac.kr)

Study documents and meeting recordings are saved under each study channel in OHDSI APAC Teams.

Study liaisons from each chapter are working closely with the study owners, and we appreciate all the help and support



### Welcome to OHDSI Australia!!

The Observational Health Data Sciences and Informatics (or OHDSI, pronounced "Odyssey") program is a multi-stakeholder, interdisciplinary collaborative to bring out the value of health data through large-scale analytics. All our solutions are open-source. OHDSI Australia is a newly formed Australian chapter.

The establishment of OHDSI Australia has been facilitated by close cooperation with the Transformational Data Collaboration (TDC) https://machaustralia.org/projects/transformational-data-collaboration/

The TDC is an initiative under the auspices of the Australian Health Research Alliance https://ahra.org.au/

Under the 'Data Integration' priority area of the 'AHRA Data Driven Healthcare' activity stream. It has a singular goal:

"To utilise the unique open and collaborative nature of AHRA to help develop and support national data initiatives where an open,

As such the aims of the AHRA TDC align perfectly with the strategy of OHDSI Australia

Membership: Subscribe here to join OHDSI Australia and get news and notice of events

### **Latest News**

EHDEN Academy free access to all

Next Event:

27th July 2021 at 1pm AEST

ETL Framework for the Conversion of Health Databases to OMOP

See events page for details

Recorded webinars here

**OHDSI Australia Publications** 

### What is OMOP?

The Observational Medical Outcomes Partnership Common Data Model (OMOP-CDM)

'is a standard data schema that uses standardised terms'

to enable the systematic analysis of multiple distinct observational databases

### The concept behind the **OMOP approach**:

- Transform data contained within a unique repository (database) into a common format (data model)
- Enable a common representation of terminologies, vocabularies, and coding schemes through harmonisation
- Perform systematic analyses using a library of standard analytic routines using a common format

### **OMOP** can be used for:

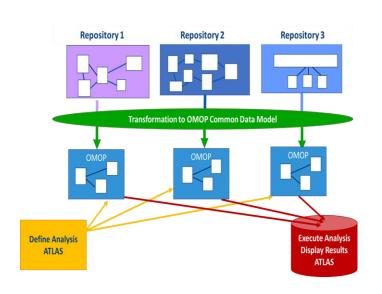
- Independent institutional research that incorporates advanced analytic and prediction techniques
- Research within a research network where research requests are delivered to partner institutions
- Clinical decision support systems for patient-specific medical treatment
- Pharmacovigilance for the active surveillance of drug safety
- Multi-institutional research where 'validation' analyses are rapidly conducted under the same conditions using tools such as ATLAS

### What is ATLAS?

ATLAS is a web-based search and navigation tool that enables the filtering of data within the OMOP platform.

Once data in OMOP is captured by ATLAS, the tool schematically represents the cohort with tables, graphs, sunburst charts.

# What about OHDSI OMOP makes it different?





Open Source Strong international User Community Repository of Tools to Share Extensible – NLP, ML

### Incidence of new-onset in-hospital and persistent diabetes in COVID-19 patients: comparison with influenza

Justin Y. Lu, ar Jack Wilson, ar Wei Hou, Roman Fleysher, Betsy C. Herold, Kevan C. Herold, and Tim Q. Duong

"Department of Radiology, Albert Einstein College of Medicine and Montefiore Medical Center, Bronx, New York, United States "Department of Family and Preventive Medicine, Storny Brook University, Storny Brook, New York, United States "Department of Pediatrics and Microbiology-Immunology, Albert Einstein College of Medicine, Bronx, New York, United States "Department of Immunobiology and Medicine, Yale University, New Haven, CT, United States "Department of Immunobiology and Medicine, Yale University, New Haven, CT, United States

### ummary

Background This study investigated the incidences and risk factors associated with new-onset persistent type-2 diabetes during COVID-19 hospitalization and at 3-months follow-up compared to influenza.

Methods This retrospective study consisted of \$216 hospitalized, 2998 non-hospitalized COVID-19 patients, and 2988 hospitalized influenza patients without history of pre-diabetes or diabetes in the Montefiore Health System in Bronx, New York. The primary outcomes were incidences of new-onset in-hospital type-2 diabetes mellitus (I-DM) and persistent diabetes mellitus (P-DM) at 3 months (average) follow-up. Predictive models used 80%/20% of data for training/lesting with five-fold cross-validation.

Findings I-DM was diagnosed in 22.6% of patients with COVID-19 compared to only 3.3% of patients with influenza (95% CI of difference [0.18, 0.20]). COVID-19 patients with I-DM compared to those without I-DM were older, more likely not be treated with steroids and had more comorbidities. P-DM was diagnosed in 16.7% of hospitalized COVID-19 patients versus 12% of hospitalized influenza patients (95% CI of difference [0.03,0.065) but only 7.3% of non-hospitalized COVID-19 patients [95% CI of difference [0.078,0.11]). The rates of F-DM significantly decreased from 23.9% to 4.0% over the studied period. Logistic regression identified similar risk factors predictive of P-DM for COVID-19 and influenza. The adjusted odds ratio (0.90 [95% CI 0.64,1.28]) for developing P-DM was not significantly different between the two viruses.

Interpretation The incidence of new-onset type-2 diabetes was higher in patients with COVID-19 than influenza. Increased risk of diabetes associated with COVID-19 is mediated through disease severity, which plays a dominant role in the development of this post-acute infection sequela.

### Funding None.

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Rapid Response to new Health Threats Standing Infrastructure Strong Research Community Sharable Resources

# OMOP Transformations underway

- ARDC Funded
- CERNER sites
  - Queensland Health
  - University of NSW hospital affiliates
  - Austin Health
  - Western Health

- Independently Funded
  - Parkville Precinct (EPIC)
  - Patron GP

### Matters of Importance - OMOP Patron Data Governance

### **DATA GOVERNANCE**

Patron OMOP data may only be utilised for projects *approved* by the Patron Data Governance Committee.

Re-use of the same OMOP dataset for a new project *requires* new ethics and Patron Data Governance Committee approvals.

Project scope is shaped by the *limits* placed on the project by the Patron Data Governance Committee.

Patron Data Governance Committee considerations include the:

- Nature of a prospective researchers IT system
- Quality of systems and protections used to safeguard data
- Nature of the research institution
- Research objectives, proposed uses, data disclosure, and commercial entity involvement
- Prior contraventions of privacy laws or data breaches

### **CONSENT**

Patron-OMOP practices need to provide consent for their practice data to be accessed for research purposes. Patron practices can change their consent options or withdraw their consent to participate at any time, without prejudice.

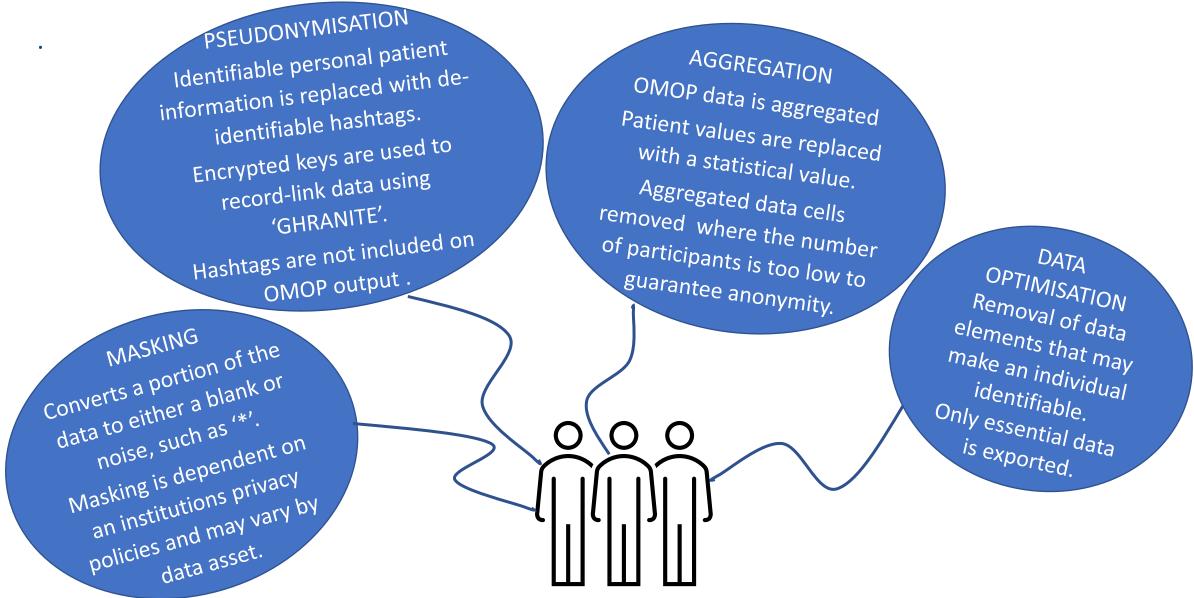
### **Opt out**

If a research project is deemed by an ethics committee to be of low risk to the individual - consent is conventionally managed in an opt-out manner.

### Waiver of consent

It is not always possible to obtain patient consent. If certain criteria are met, waivers of consent will be granted by an ethics committee. This is a common model for Patron-OMOP projects.

# Data Governance – How Patron OMOP Anonymises Personally Identifiable Information



# Compatibility with International Governance Standards

The FAIR Guiding Principles				
F	Findability	Metadata and data should be easily found by both humans and computers through the assignment of globally unique and permanent identifier to enable the automatic discovery of datasets and services via machine learning [31, 32].		
А	Accessibility	Metadata and data should easily retrieved by authorised and authenticated users via a standard communication protocol[31, 32] .		
1	Interoperabilty	Data from one data source can be integrated with data from other sources so that it can be aggregated into a single, unified view, and refers to the integration and exchange of applications, analysis, storage, and workflow processing across different data sources[31, 32].		
R	Reusability	Metadata and data characteristics is specified in detail to enable replication and or linkage in different settings. Reusability includes the release of data usage licenses, provenance details, and disclosure around community standards relevant to the domain [31, 32].		

The Five Safes Framework				
	Safe People			
People	Is the researcher appropriately trained and authorised to access and use the data?			
	[34]			
Projects	Safe Projects			
riojects	Is data used for an appropriate purpose that is valid and of public benefit ? [34]			
Settings	Safe Settings			
Jettings	Does IT access and physical environment prevent unauthorised use? [34]			
	Safe Data			
Data	Has appropriate and sufficient protection been applied to the data to avoid risk of			
	disclosure? [34]			
Outputs	Safe Outputs			
Outputs	Are the statistical results non-disclosive? [34]			

The CARE Principles				
	С	Collective Benefit	Collective benefit include that where the wellbeing of Indigenous Peoples' rights and are of primary concern[33]	
	Α	Authority	Indigenous Peoples' rights and interests in data about their peoples, communities, cultures, and territories is part of reclaiming control of data is clearly articulated[33]	
	R	Researcher	Researchers have a responsibility to develop and nurture respectful relationship with Indigenous Peoples' from whom the data originate [33]	
	E	Ethics	Minimise harm and maximise benefit for Indigenous Peoples, for justice and future use [33]	

# Summary



Health data is ubiquitous but heavily siloed



Research and Innovation capacity and efficiency is constrained

Silos, data conformance, costs of "research readiness", Privacy fears



Complexity and Commercial Designs of EMR vendor databases

Cost, time, reproducibility



**Adding Value** 

OHDSI OMOP CDM offers a real opportunity to simplify and streamline

Advantages for large scale, rapid implementation multicentre research