



FAIRification of OHDSI assets

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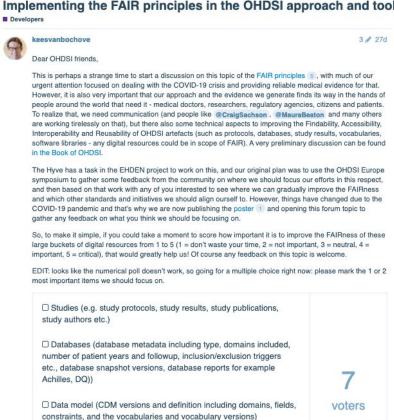




- The FAIR principles: quick recap
- State of FAIRness of the OHDSI landscape
- How to implement FAIR
- A use case: the COVID-19 study-a-thon

https://forums.ohdsi.org/t/implementing-the-fa ir-principles-in-the-ohdsi-approach-and-tools/ 10387

Implementing the FAIR principles in the OHDSI approach and tools



□ Software (analysis packages, visualization tools, ETL tools, ATLAS

☐ Discourse (protocol discussions, CDM choices, forum posts, WG

materials from wiki, papers etc.)

Vote now! Show results







Choose up to 5 options Votes are public.





Open Science & the FAIR principles

A short refresher of making data Findable, Accessible, Interoperable and Reusable

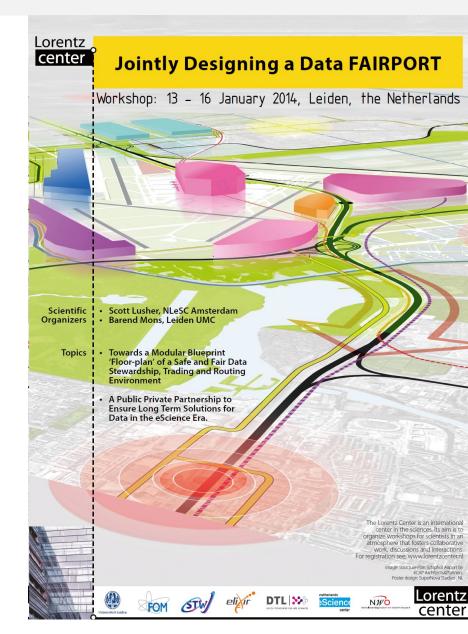








- Public-private partnership to advance:
 - Open Science
 - Sustainability & reuse of data
- Workshop in Leiden in 2014
 - Towards a Modular Blueprint 'Floor-plan'
 of a safe and fair Data Stewardship,
 Trading and Routing environment,
 provisionally called the Data FAIRPORT









netherlands



center







RESEARCH DATA ALLIANCE

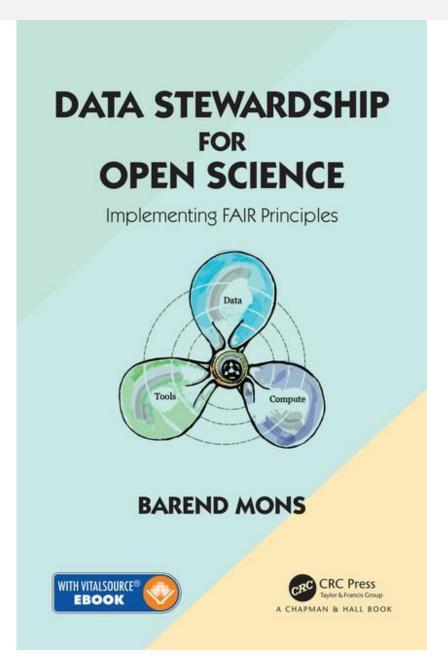




https://youtu.be/5YgAH3f9LiU









OPEN SCIENCE IN PRACTICE

Assessment

- Comment / peer review
- Determine impact of research output
- Determine impact of researchers

Preparation

- Define & crowdsource research priorities
- Organize project, team, collaborations
- Get funding / contract

Discovery

- Search literature / data / code / ...
- Get access
- Get alerts / recommendations
- Read / view
- Annotate

Outreach

- Archive/share posters
- Archive/share presentations
- Tell about research outside academia
- Researcher profiles/networks

Analysis

- Collect, mine, extract data / experiment
- Share protocols/ notebooks/ workflows
- Analyze

Publication

- Archive / share publications
- Archive / share data & code
- Select journal to submit to
- Publish

Writing

- Write / code
- Visualize
- Cite
- Translate

Findable
Accessible
Interoperable
Reusable

https://doi.org/10.5281/zenodo.2587951



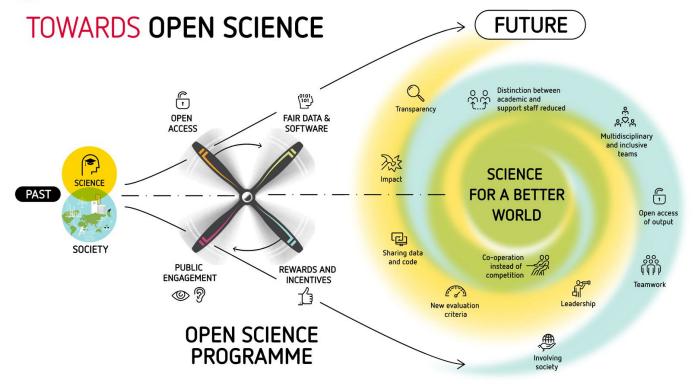




OPEN SCIENCE AND OHDSI

https://ohdsi.github.io/TheBookOfOhdsi/OpenScience.html







Reproducibility: Accurate, reproducible, and well-calibrated evidence is necessary for health improvement.

Community: Everyone is welcome to actively participate in OHDSI, whether you are a patient, a health professional, a researcher, or someone who simply believes in our cause.

Collaboration: We work collectively to prioritize and address the real world needs of our community's participants.

Openness: We strive to make all our community's proceeds open and publicly accessible, including the methods, tools and the evidence that we generate.

Beneficence: We seek to protect the rights of individuals and organizations within our community at all times.

https://www.ohdsi.org/who-we-are/mission-vision-values/







https://www.uu.nl/en/research/open-science





State of FAIRness of the OHDSI landscape







- Data model
 - OMOP CDM versions and definitions
 - Vocabularies
- Data network
 - Data source metadata
- Software
 - Analysis packages, visualization tools, ETL tools, ATLAS
- Studies
 - Study protocols, results, publications, authors
- Other materials
 - Protocol discussions, CDM choices, forum posts, working group documents, papers

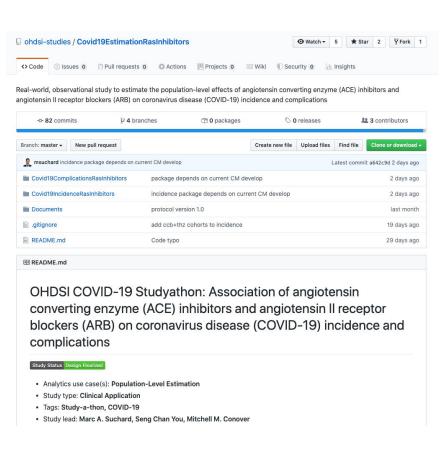






CURRENT STATE: DATA NETWORK AND STUDY PAGES

Database	Data Type	Contact email	Country	# of Patients (000s)	CDM Status
AltaMed Health Services	EHR		USA	638	CDMv4 complete
ARS	Claims		Italy	4,000	CDMv4 in progress
AU-ePBRN (Australian Electronic practice based research network)	EHR (Primary care data linked with hospital admissions)	Jitendra (z3339253@unsw.edu.au); Teng (siaw@unsw.edu.au)	Australia	1,100	CDMv5.3.1 Complete
AUSOM	EHR	Dahye Shin at dasoon0031@naver.com	Korea	2,2,270	CDMv5 complete
BTRIS	EHR/CTDMS	Vojtech.Huser at nih dot gov	USA	500	CDMv4 complete (without era tables) (pilot implementati , ETL posted
Clinical Practice Research Datalink (CPRD)	EHR		UK	11,560	CDMv4 converted to CDMv5 complete, CDMv4 ETL posted
CMS	Claims		USA	2.000	CDMv4 draft





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- PatientLevelPredictionRepository/
- PhenotypeLibrarySubmit/
- PhenotypeLibraryViewer/
- plpLive18Study/
- PredictingSevereInHospResults/
- PredictionViewer/
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THE FAIR PRINCIPLES

Findable:

F1. metadata are assigned globally unique and **persistent** identifier;

F2. data are described with rich **metadata**;

F3. metadata clearly and explicitly include the identifier of the data it describes;

F4. metadata **registered or indexed** in a searchable resource;

Accessible:

A1. metadata retrievable by their identifier using a **standardized** communications **protocol**;

A1.1 protocol is **open**, free, and universally implementable;

A1.2. protocol allows for an **authentication and authorization** procedure, where necessary;

A2. metadata accessible, even when data are no longer available;

Interoperable:

- 11. metadata use a **formal**, accessible, shared, and broadly applicable language for **knowledge representation**.
- 12. metadata use **vocabularies** that follow FAIR principles;
- 13. metadata include qualified **references** to other (meta)data;

Reusable:

R1. metadata are richly described with a plurality of accurate and relevant **attributes**;

R1.1. metadata are released with a clear and accessible data usage **license**;

R1.2. metadata are associated with detailed provenance;

R1.3. metadata meet domain-relevant community standards;

http://www.nature.com/articles/sdata201618









OHDSI Assets are Interoperable and Reusable

Interoperable:

- 11. (meta)data use a **formal**, accessible, shared, and broadly applicable language for **knowledge representation**.
- 12. (meta)data use **vocabularies** that follow FAIR principles;
- 13. (meta)data include qualified **references** to other (meta)data;

OMOP CDM

OMOP Standard Vocabularies

Relationships between source and standard vocabularies

Reusable:

- R1. meta(data) are richly described with a plurality of accurate and relevant **attributes**;
- R1.1. (meta) data are released with a clear and accessible data usage **license**;
- R1.2. (meta)data are associated with detailed **provenance**;
- R1.3. (meta)data meet domain-relevant **community standards**;

OHDSI software licenced under Apache 2.0, data not consistently licensed

OMOP CDM, Vocabulary and Methods Library for best-practice observational research









OHDSI Assets can be more Reusable

nteroperable:

- 11. (meta)data use a **formal**, accessible, shared, and broadly applicable language for **knowledge representation**.
- 12. (meta)data use vocabularies that follow FAIR principles;
- (meta)data include qualified references to other (meta)data;

Metadata is not in an interoperable format

Reusable:

- R1. meta(data) are richly described with a plurality of accurate and relevant **attributes**;
- R1.1. (meta) data are released with a clear and accessible data usage **license**;
- R1.2. (meta)data are associated with detailed **provenance**;
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OHDSI Assets are Accessible

Findable:

F1. (meta)data are assigned a globally unique and **persistent identifier**;

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A1.1 the protocol is **open**, free, and universally implementable;

A1.2. the protocol allows for an **authentication and authorization** procedure, where necessary;

A2. metadata are accessible, even when the data are no longer available;

SqlRender to translate
OHDSI SQL to other SQL
dialects

Achilles, (EHDEN data catalogue)









OHDSI Assets are not (MACHINE) FINDABLE

Findable:

F1. (meta)data are assigned a globally unique and persistent identifier;

F2. data are described with rich metadata;

F3. metadata clearly and explicitly include the identifier of the data it describes;

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How to implement FAIR

From FAIR assessment to linked data









Workflow & Proof of Principle

Identify digital resources

Select key digital resources

FAIRness FAIRness
FAIRness FAIRness
FAIRness
FAIRness
FAIRness

- Identified digital resources in OHDSI
- Selected study-a-thons and study databases as resources to begin FAIRifying
- Assessed FAIRness of study-a-thon and study databases
- Chose one aspect to improve → Findability of studies
- Improving Findability via study-a-thon website annotated with rich
 & findable metadata



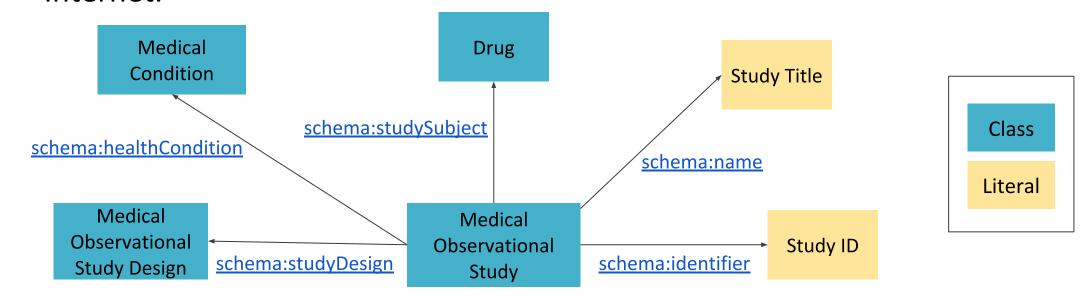




Rich metadata

Metadata should be generous and extensive, to make data Findable and Reusable.

- → Map study metadata elements to Schema.org concepts
 - ◆ Schema.org is a vocabulary that can be used to structure metadata on the Internet.









Use Schema.org concepts for metadata elements

Map study metadata elements to **Schema.org** concepts:

Class	Metadata element	Property	Range
	Study id	schema.org/identifier	Data type: https://schema.org/Text Data type: https://schema.org/URL
	Study title	schema.org/name	Data type: https://schema.org/Text
,	Study description	schema.org/description	Data type: https://schema.org/Text
schema.org/ MedicalObservational Study	Study protocol	schema.org/studyDesign	Class: schema.org/MedicalObservationStudy Design
	Medical Condition studied	schema.org/healthCondition	Class: schema.org/MedicalCondition
	Drug studied	schema.org/studySubject	Class: schema.org/Drug







Findable metadata

Capture metadata as machine-readable, structured data: JSON-LD

→ Encoding Schema.org in JSON-LD allows metadata to be searchable using Google and other search engines

Linked data is more Findable and Interoperable = more Reusable









A use case: the COVID-19 study-a-thon

Creating FAIR assets









https://covid19.ohdsi.app/



- Human-readable page
 - https://covid19.ohdsi.app/study/ace-arb/

- Machine-readable metadata
 - <u>view-source:https://covid19.ohdsi.app/study/ace-arb/</u>

Generated from one rich YAML document







https://covid19.ohdsi.app/

 https://github.com/thehyve/ohdsi-covi d19-site



www.ehden.eu



@IMI_EHDEN



IMI_EHDEN



github.com/EHDEN







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