



# **Welcome to the journey: OHDSI Symposium 2015**

Wifi:

Network: HHONORS-MEETING

Passcode: OHDSI15

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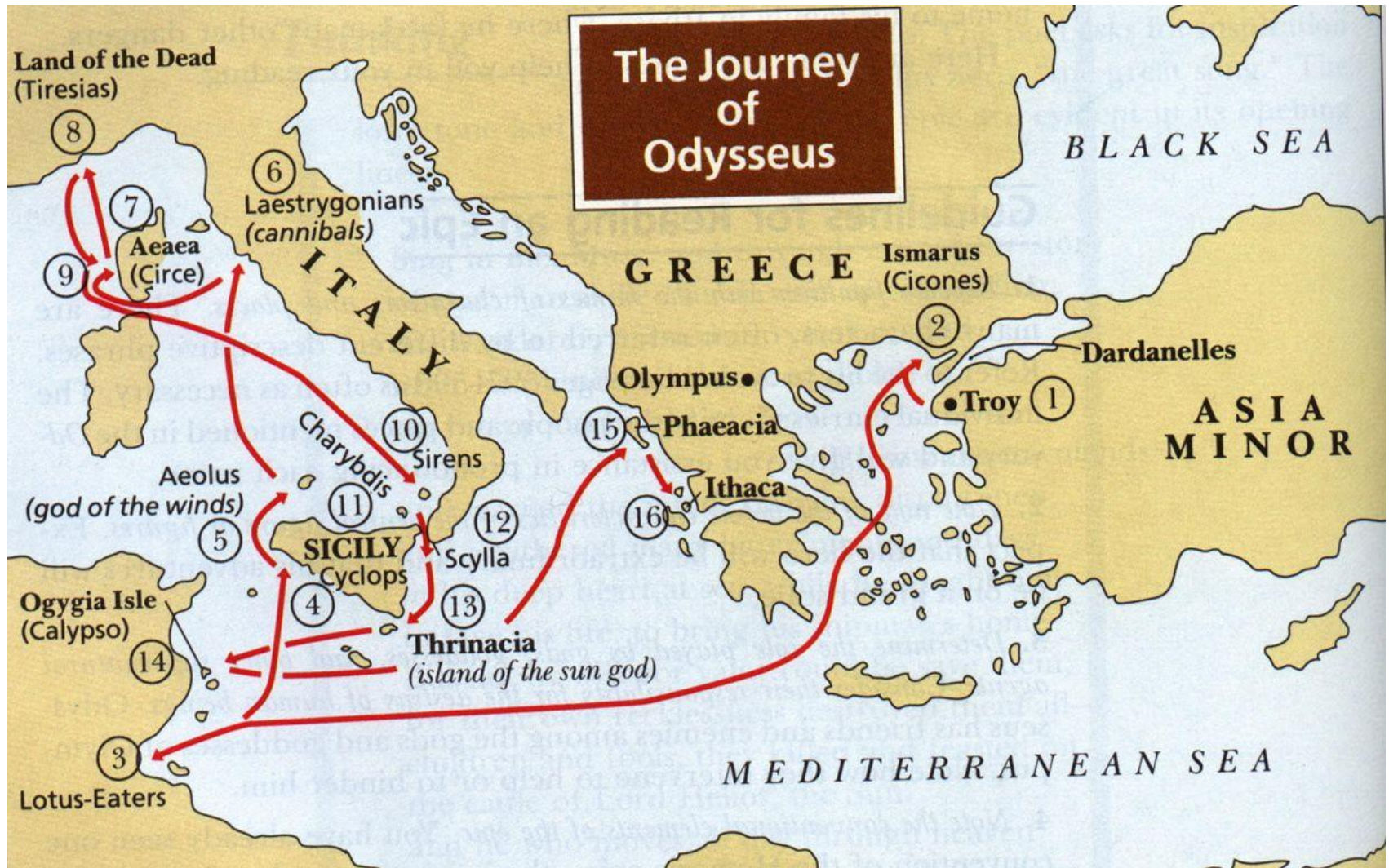
# **Welcome to the journey: Overview of OHDSI : past, present, future**

**Patrick Ryan, PhD**  
**Janssen Research and Development**  
**Columbia University Medical Center**  
**20 October 2015**

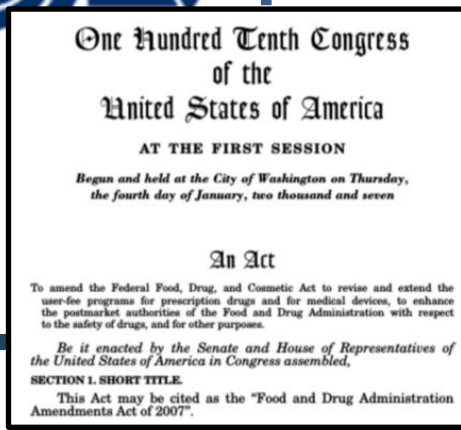


Odyssey (*noun*): \oh-d-si\

1. A long journey full of adventures
2. A series of experiences that give knowledge or understanding to someone



# A journey to OHDSI



# OHDSI



# *OMOP'S* **GOLDEN TICKET**

*Greetings to you, the lucky finder of this GOLDEN TICKET  
from the OMOP Research Team*

**Present this ticket at the next OMOP Symposium in the morning and do not be late. You may bring with you one member of your own family...and only one....but no one else...**

*In your wildest dreams, you could not imagine the marvelous  
SURPRISES that await YOU!*



# Thanks to our sponsors

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**ims**health<sup>TM</sup>  
INTELLIGENCE APPLIED.

## Thanks for the Eugene Washington Engagement Award

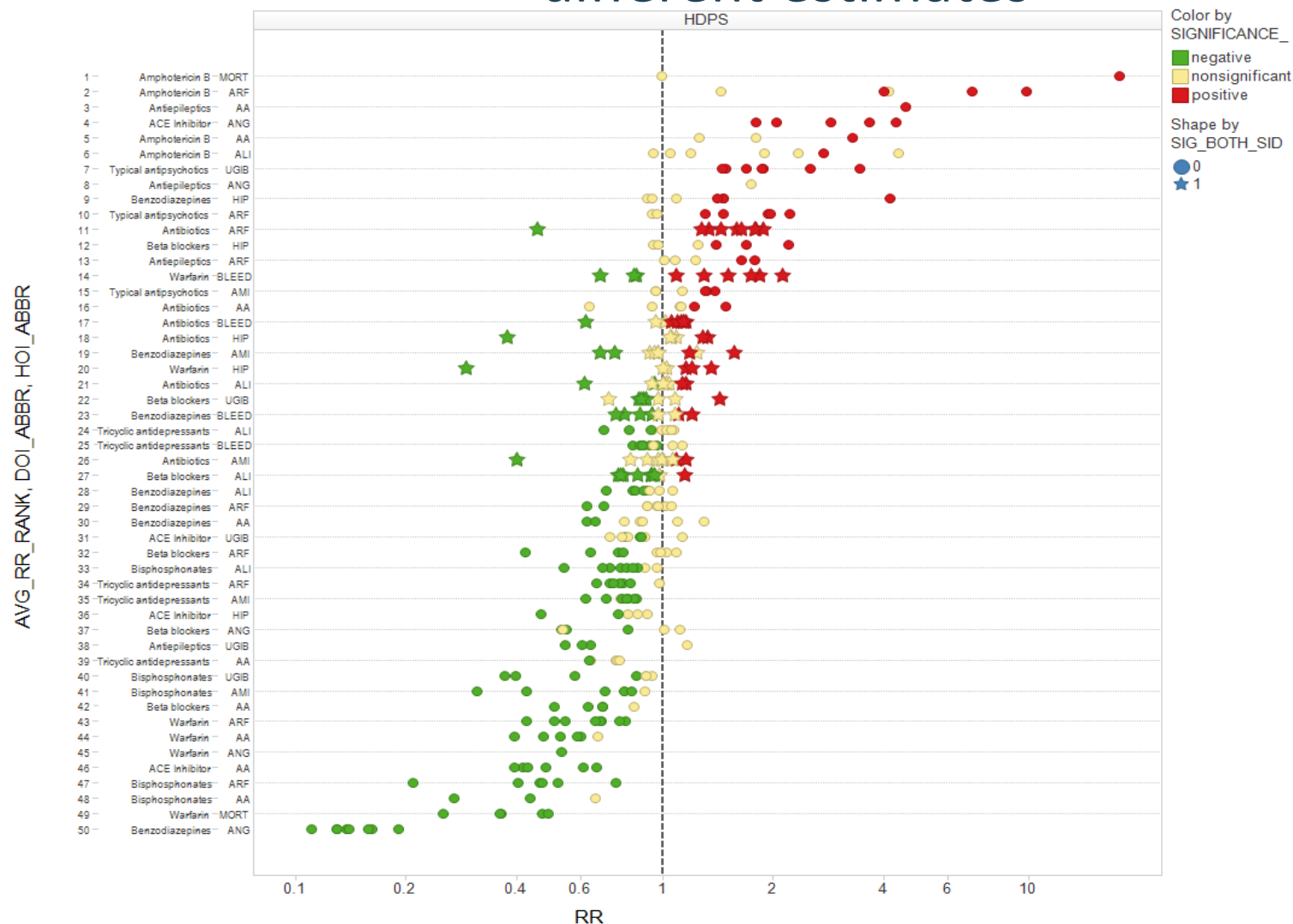
**pcori** 

PATIENT-CENTERED OUTCOMES RESEARCH INSTITUTE



# Lesson 1: Database heterogeneity:

## Holding analysis constant, different data may yield different estimates



Madigan D, Ryan PB, Schuemie MJ et al, American Journal of Epidemiology, 2013  
“Evaluating the Impact of Database Heterogeneity on Observational Study Results”

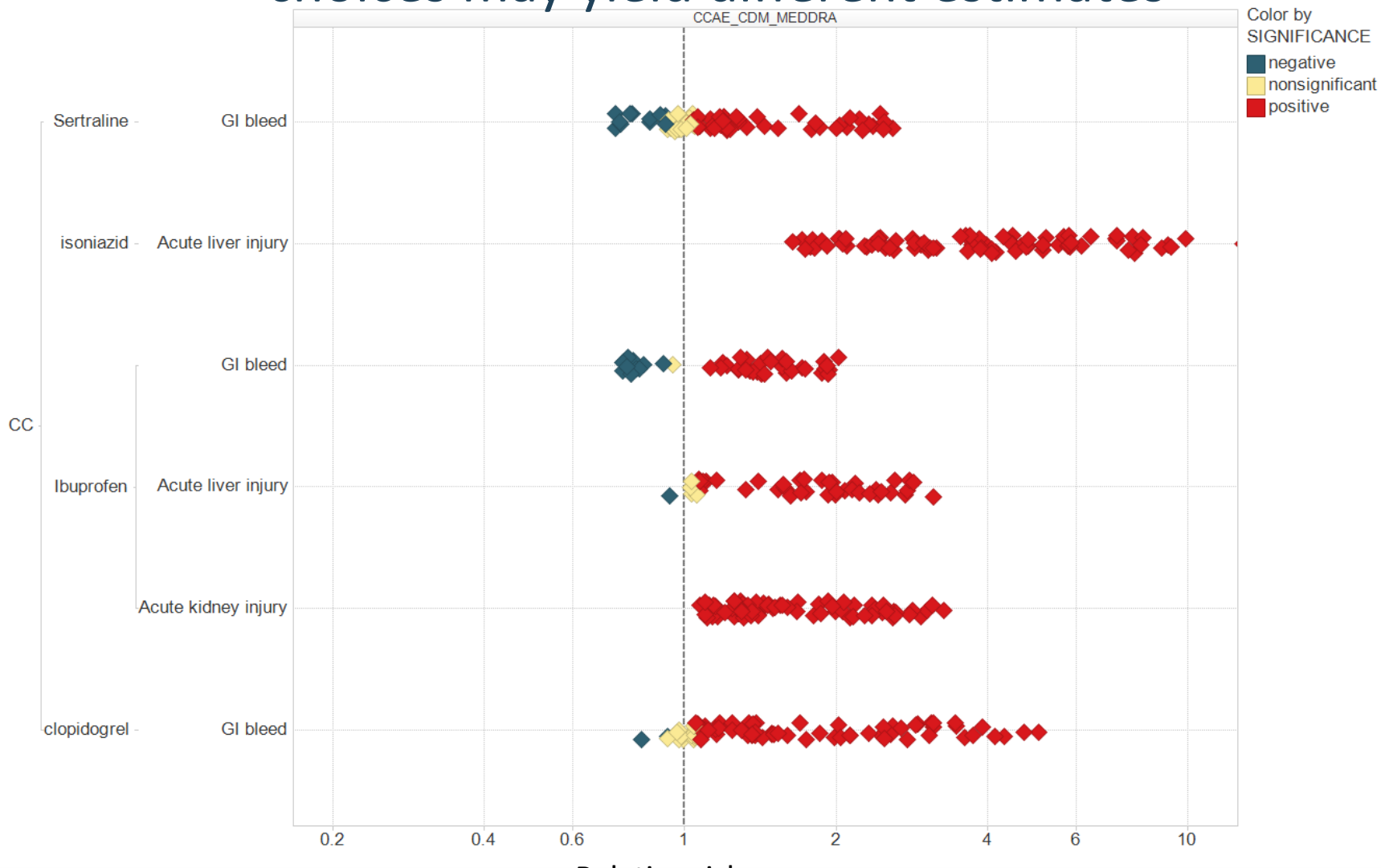




# Lesson 2: Parameter sensitivity:

## Holding data constant, different analytic design choices may yield different estimates

Test cases from OMOP 2011/2012 experiment

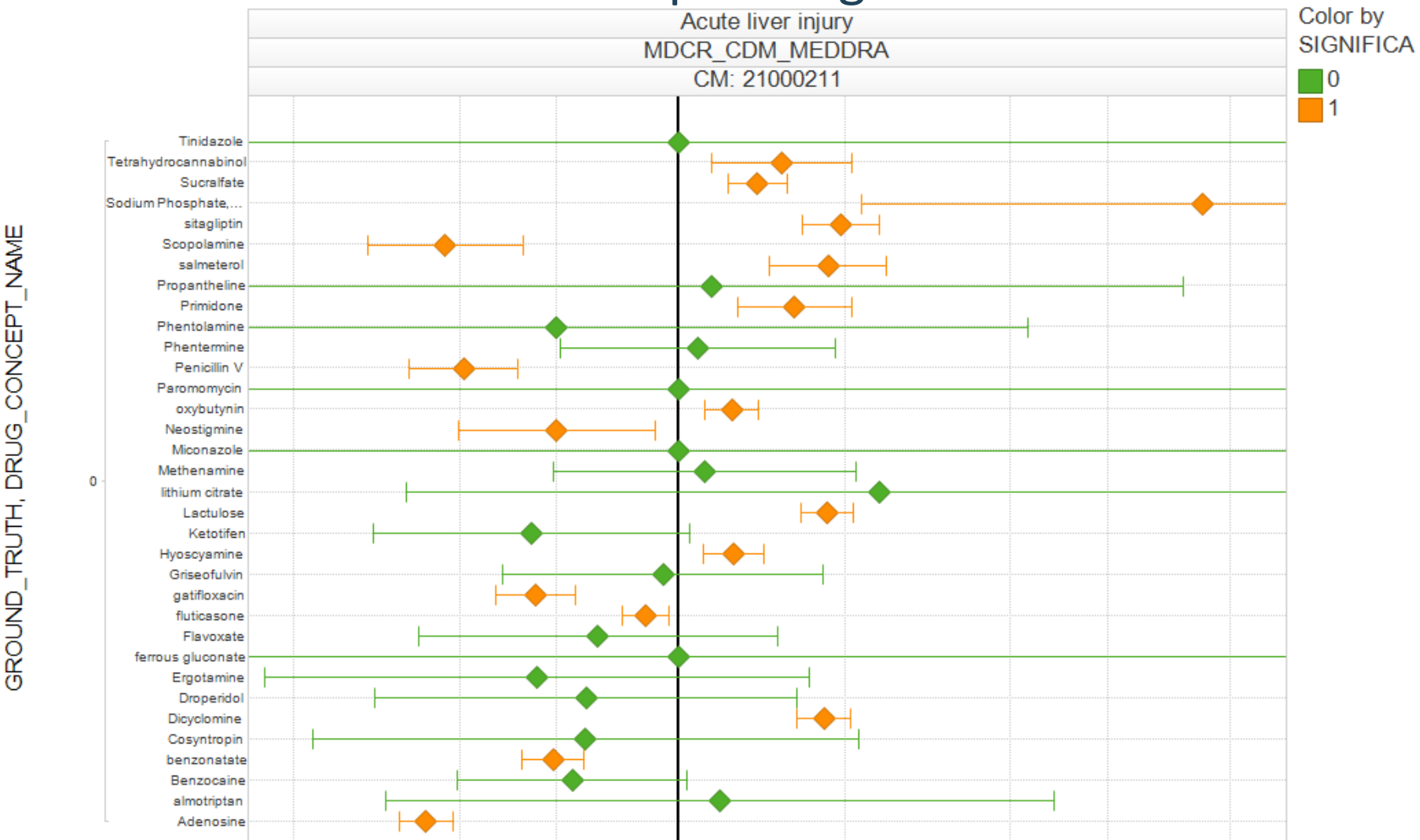


Madigan D, Ryan PB, Scheumie MJ, Therapeutic Advances in Drug Safety, 2013: "Does design matter? Systematic evaluation of the impact of analytical choices on effect estimates in observational studies"



# Lesson 3: Empirical performance:

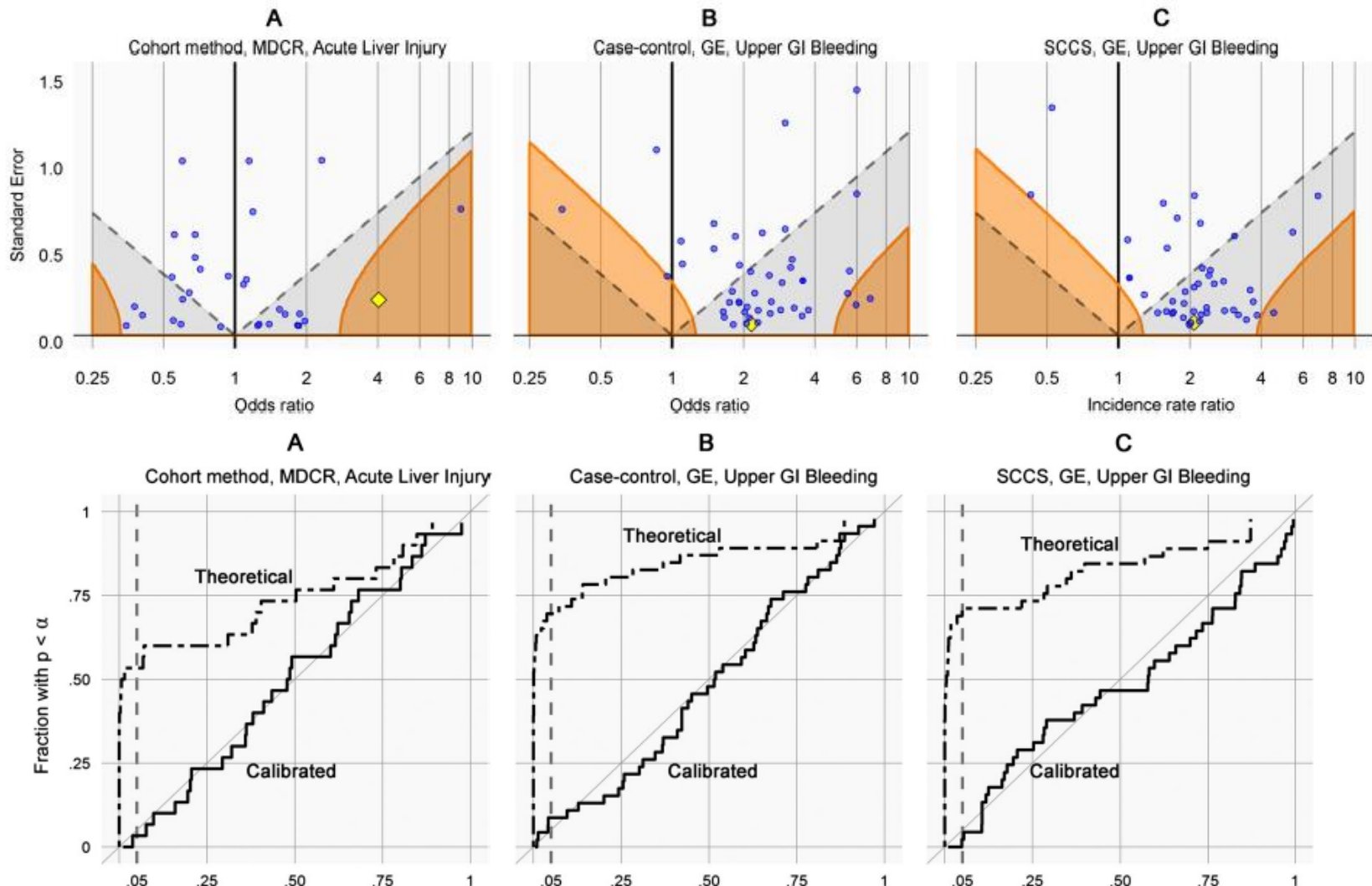
## Most observational methods do not have nominal statistical operating characteristics



Ryan PB, Stang PE, Overhage JM et al, Drug Safety, 2013:  
“A Comparison of the Empirical Performance of Methods for a Risk Identification System”



# Lesson 4: Empirical calibration can help restore interpretation of study findings



Schuemie MJ, Ryan PB, DuMouchel W, et al, Statistics in Medicine, 2013:

“Interpreting observational studies: why empirical calibration is needed to correct p-values”



## Lesson 5: Reliable evidence generation isn't (just) a data/analysis/technology problem

- Understanding the problems requires input and perspective from multiple stakeholders: government, industry, academia, health systems
- Research and development of novel solutions require multi-disciplinary approach: informatics, epidemiology, statistics, clinical sciences
- Adoption and application requires active participation and buy-in from all interested parties (both evidence producers and evidence consumers)
- Major outstanding need: to establish a community of individuals based on shared attitudes, interests and goals where everyone has equal opportunity to participate and contribute



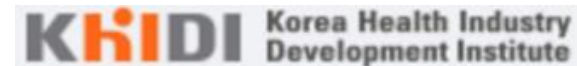
# Introducing OHDSI

- The Observational Health Data Sciences and Informatics (OHDSI) program is a multi-stakeholder, interdisciplinary collaborative to create open-source solutions that bring out the value of observational health data through large-scale analytics
- OHDSI has established an international network of researchers and observational health databases with a central coordinating center housed at Columbia University





# Thanks for all of the supporters of the OHDSI community



Full list of acknowledgements: <http://www.ohdsi.org/who-we-are/support-for-ohdsi/>



# OHDSI's vision

OHDSI collaborators access a network of 1 billion patients to generate evidence about all aspects of healthcare. Patients and clinicians and other decision-makers around the world use OHDSI tools and evidence every day.



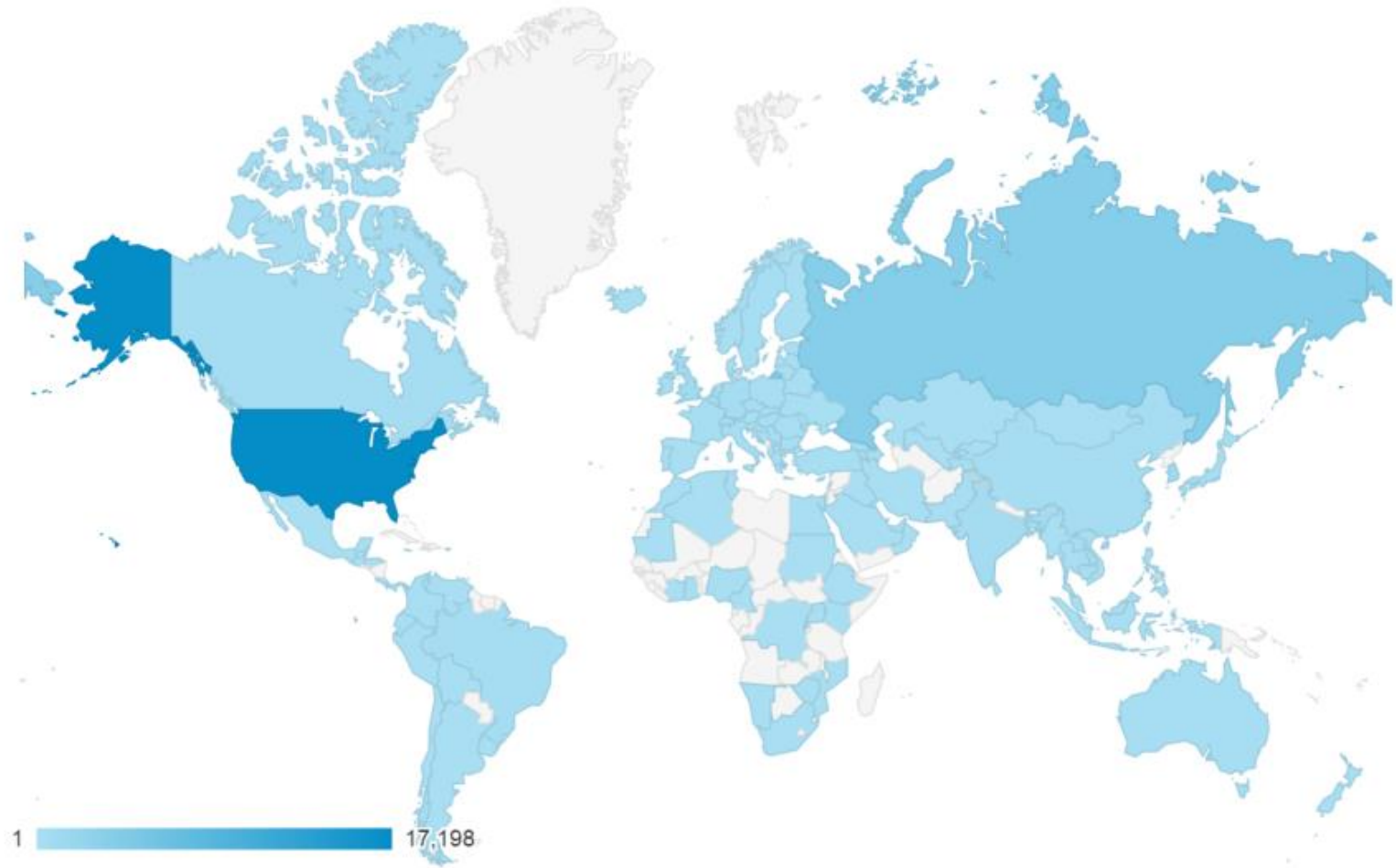
# OHDSI: a global community



<http://www.ohdsi.org/who-we-are/collaborators/>



# Global reach of ohdsi.org



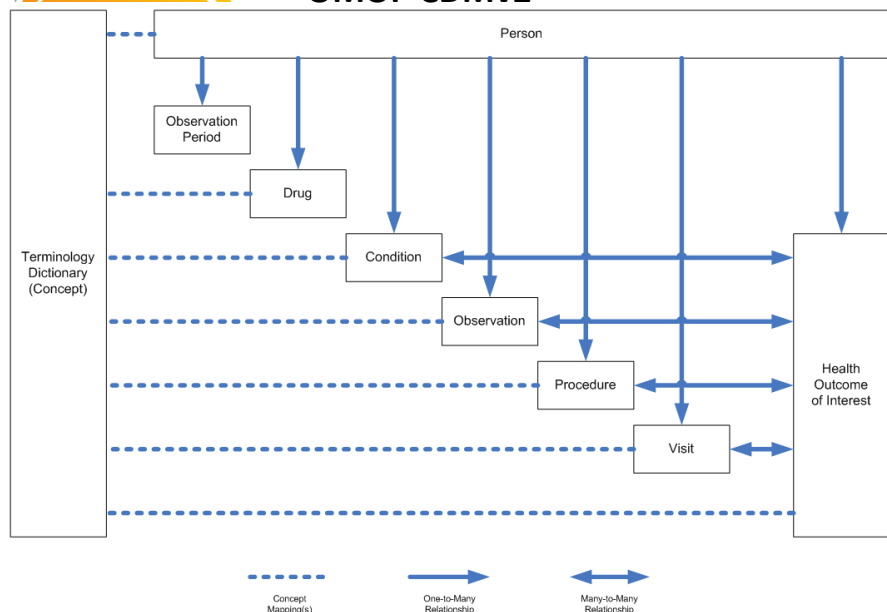
- >16,800 distinct viewers from 120 countries in 2015



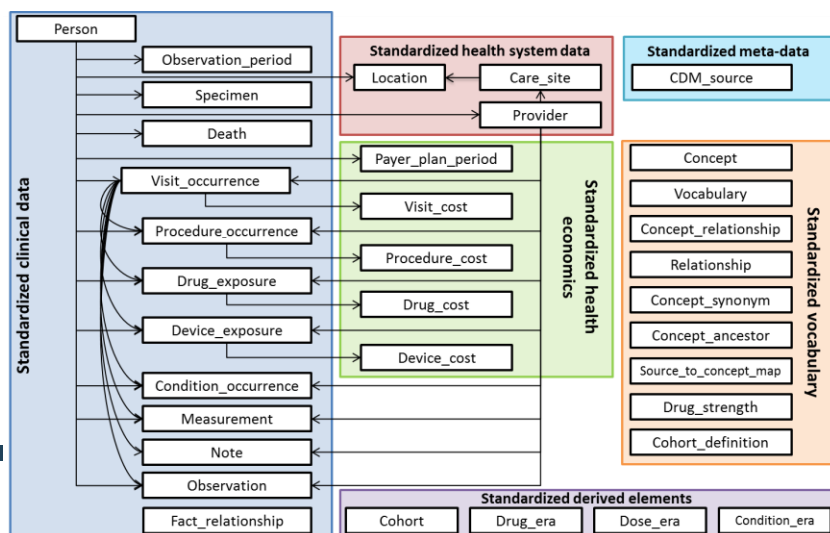
# The journey of the OMOP Common data model

OMOP CDM now Version 5, following multiple iterations of implementation, testing, modifications, and expansion based on the experiences of the community who bring on a growing landscape of research use cases.

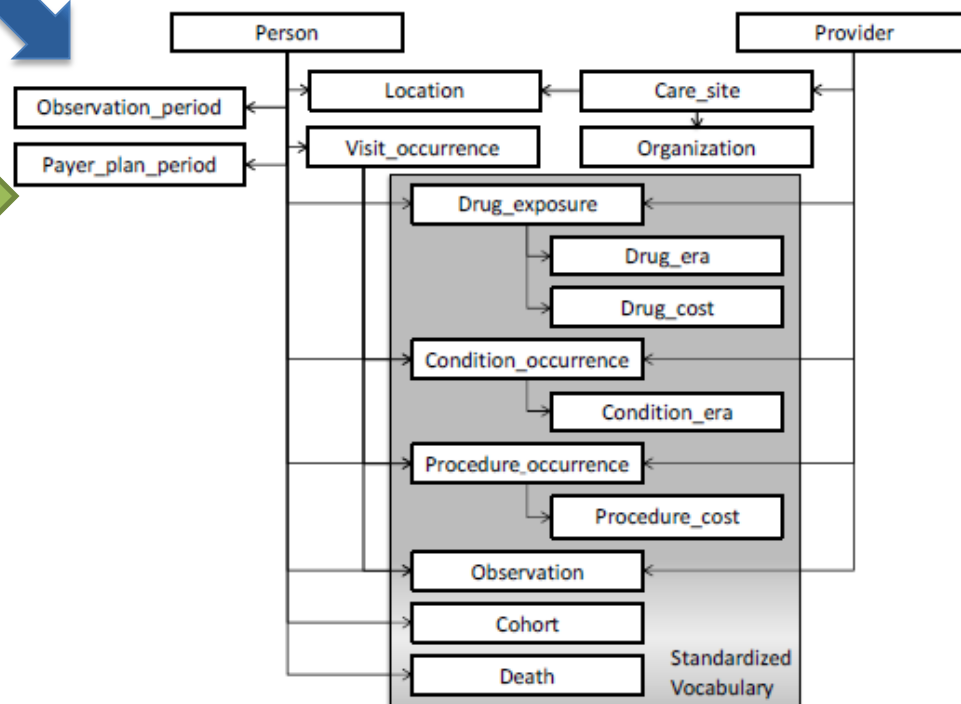
## OMOP CDMv2



## OMOP CDMv5

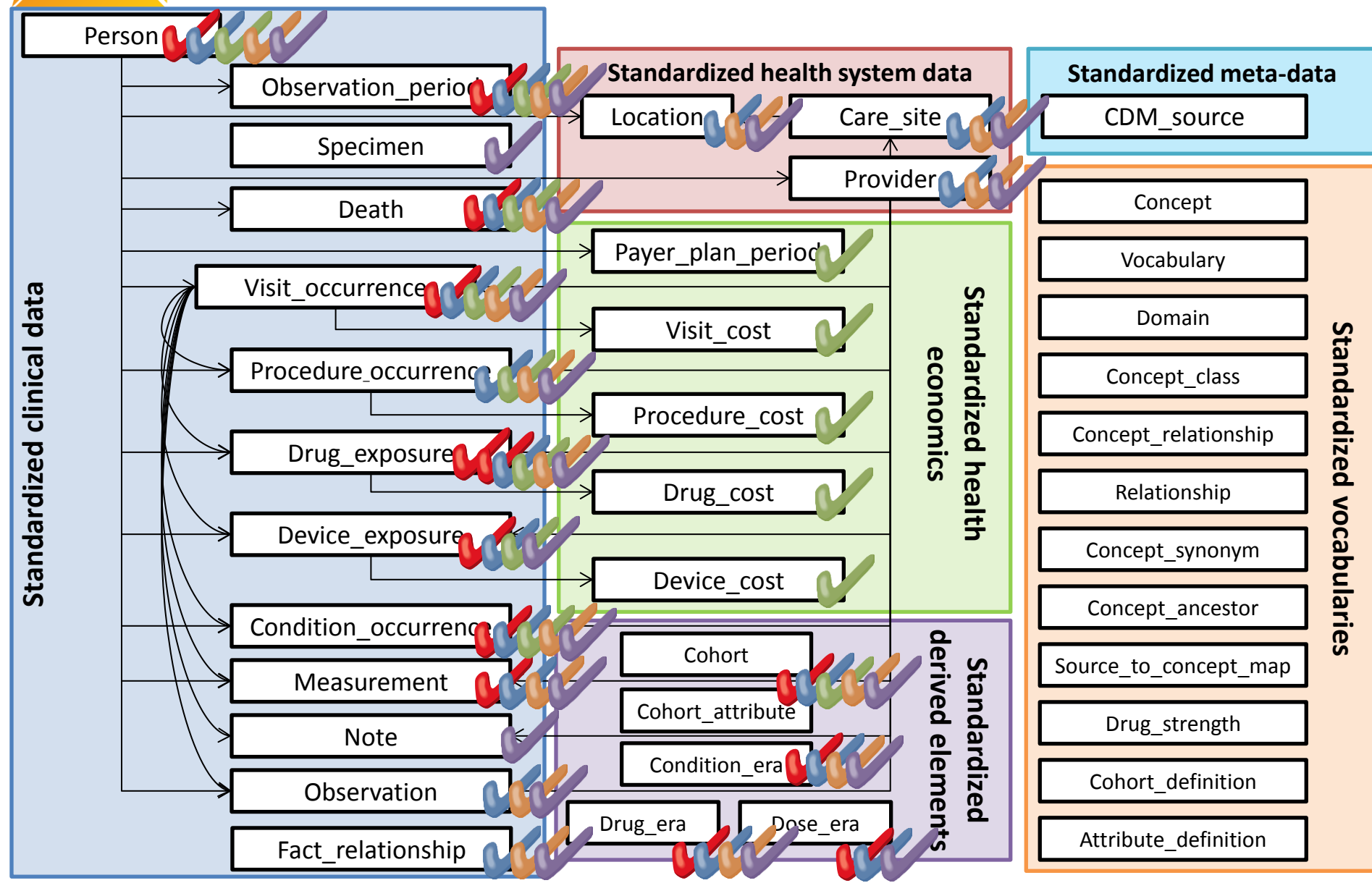


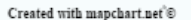
## OMOP CDMv4





# One model, multiple use cases



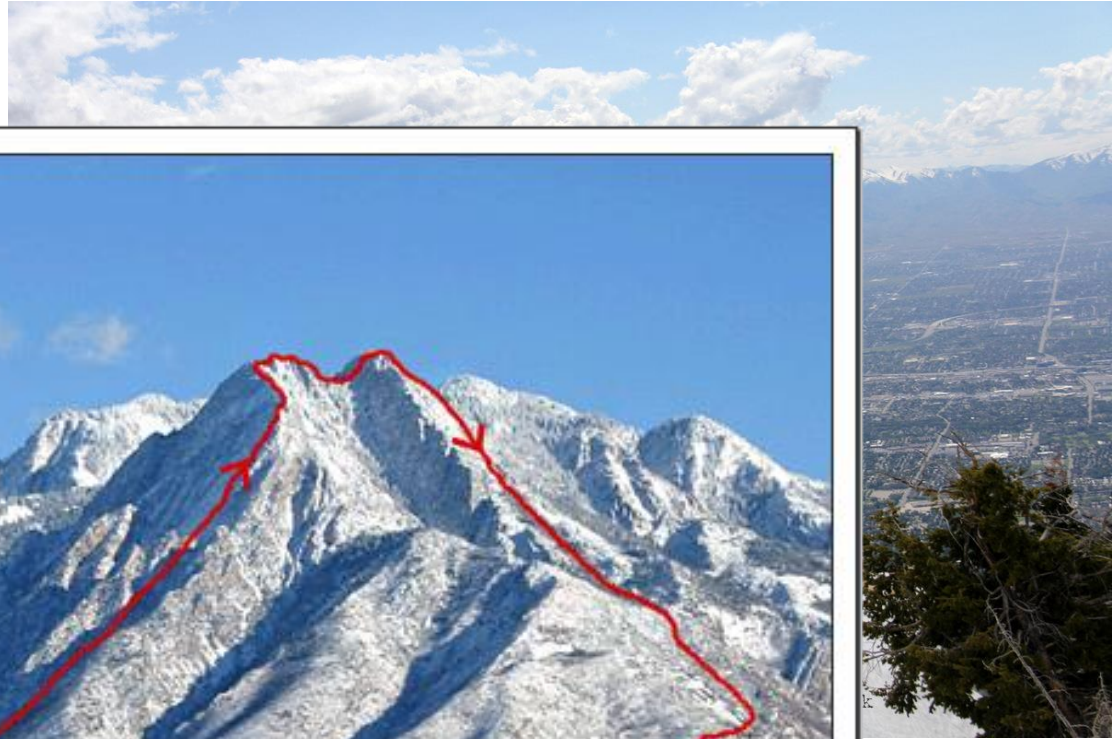
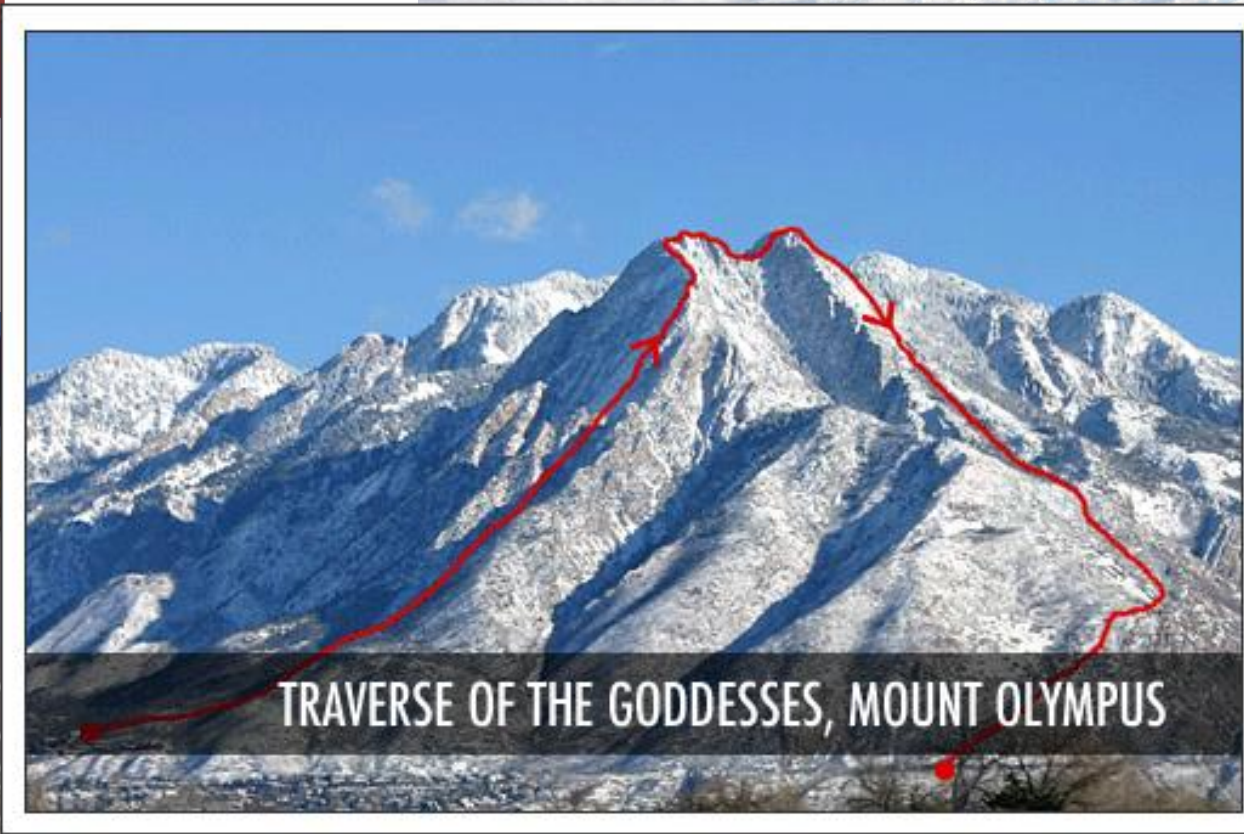


- 53 databases
- 660 million patients
- 12 countries



# The odyssey to evidence generation

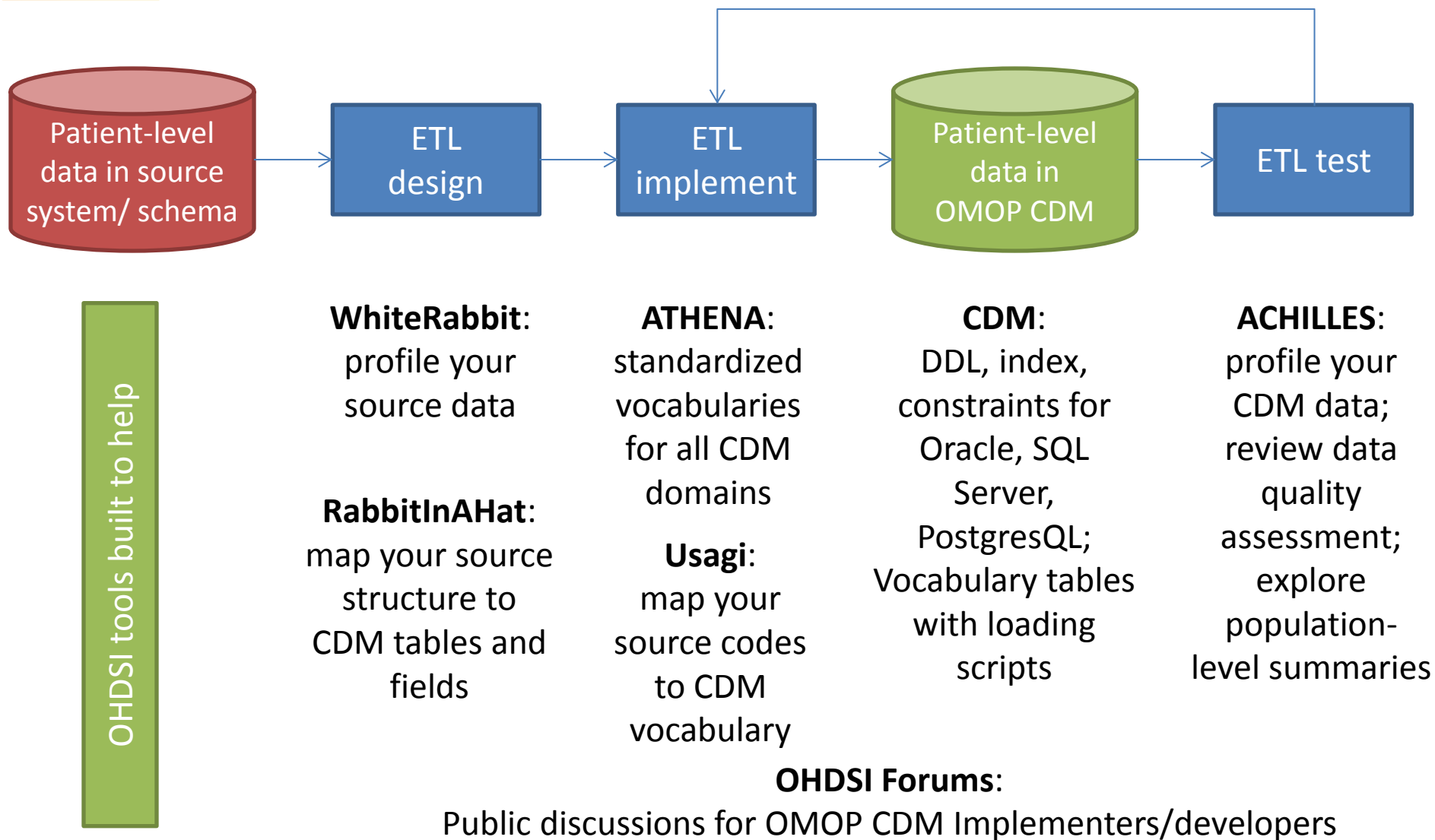
Patient-level  
data in source  
system/ schema



evidence

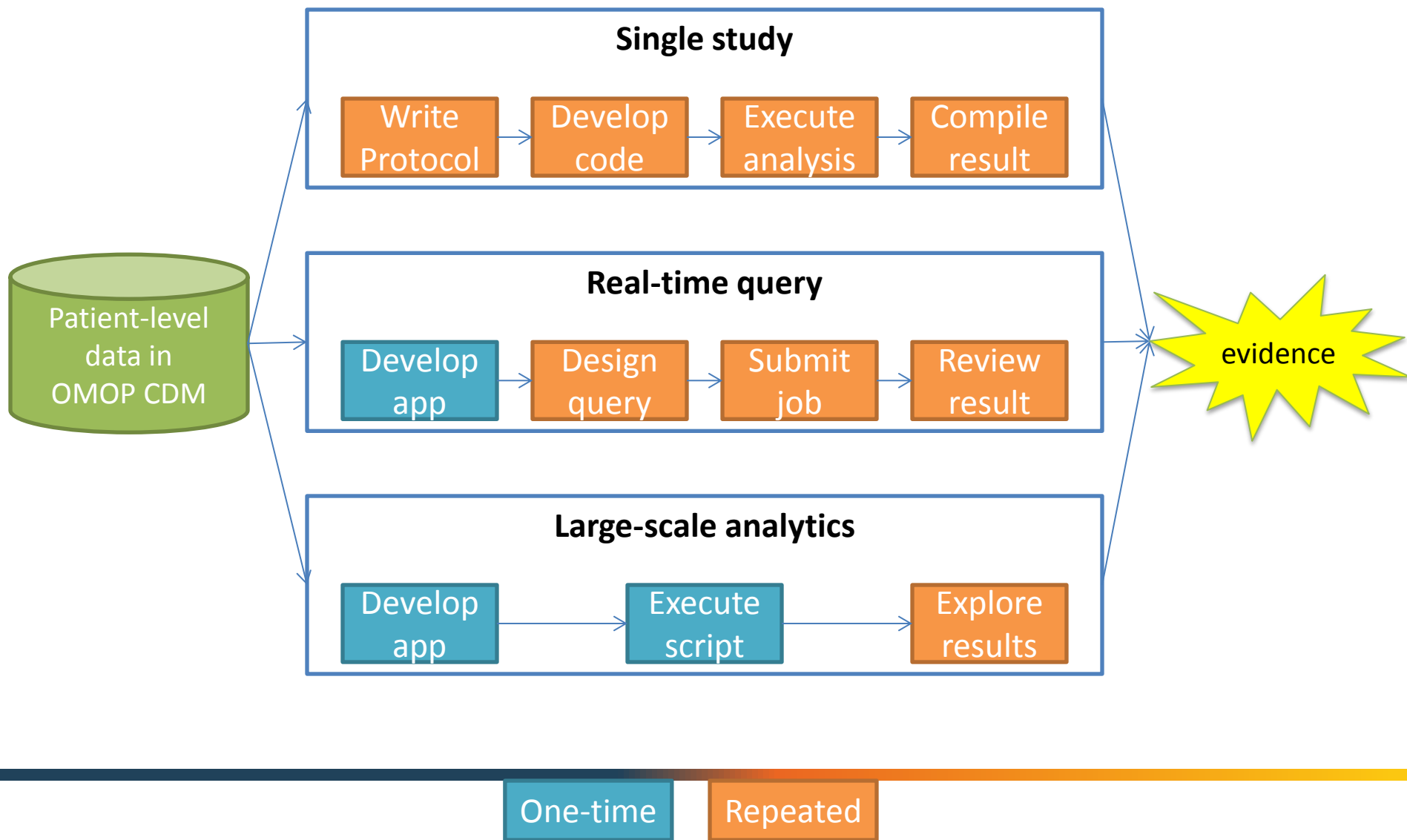


# Preparing your data for analysis





# ~~Data~~ Evidence sharing paradigms







# What evidence does OHDSI seek to generate from observational data?

- Clinical characterization
  - **Natural history:** Who are the patients who have diabetes? Among those patients, who takes metformin?
  - **Quality improvement:** what proportion of patients with diabetes experience disease-related complications?
- Population-level estimation
  - **Safety surveillance:** Does metformin cause lactic acidosis?
  - **Comparative effectiveness:** Does metformin cause lactic acidosis more than glyburide?
- Patient-level prediction
  - **Precision medicine:** Given everything you know about me and my medical history, if I start taking metformin, what is the chance that I am going to have lactic acidosis in the next year?
  - **Disease interception:** Given everything you know about me, what is the chance I will develop diabetes?

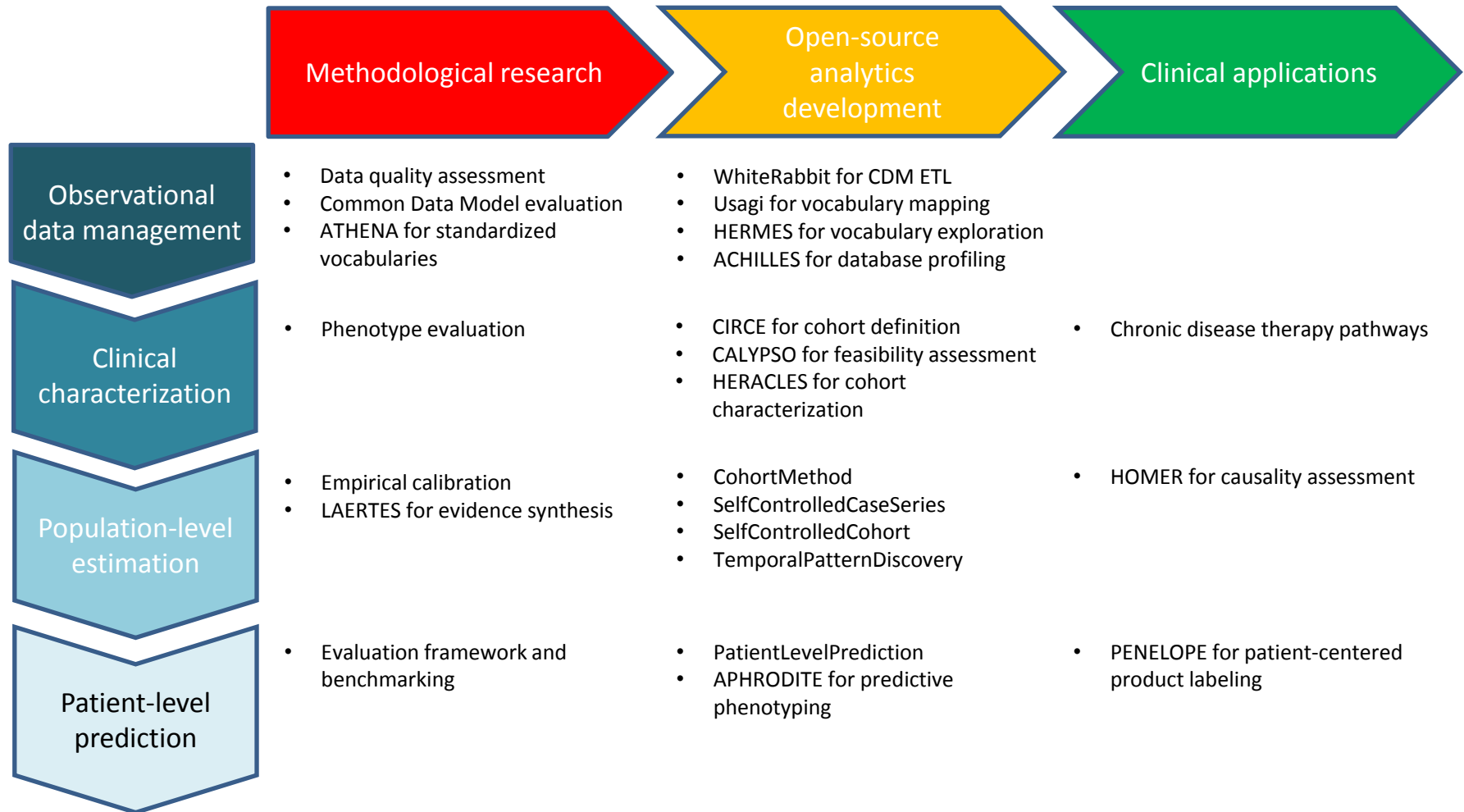


# What is OHDSI's strategy to generate evidence?

- Methodological research
  - Develop new approaches to observational data analysis
  - Evaluate the performance of new and existing methods
  - Establish empirically-based scientific best practices
- Open-source analytics development
  - Design tools for data transformation and standardization
  - Implement statistical methods for large-scale analytics
  - Build interactive visualization for evidence exploration
- Clinical applications
  - Identify clinically-relevant questions that require real-world evidence
  - Execute research studies by applying scientific best practices through open-source tools across the OHDSI international data network
  - Promote open-science strategies for transparent study design and evidence dissemination

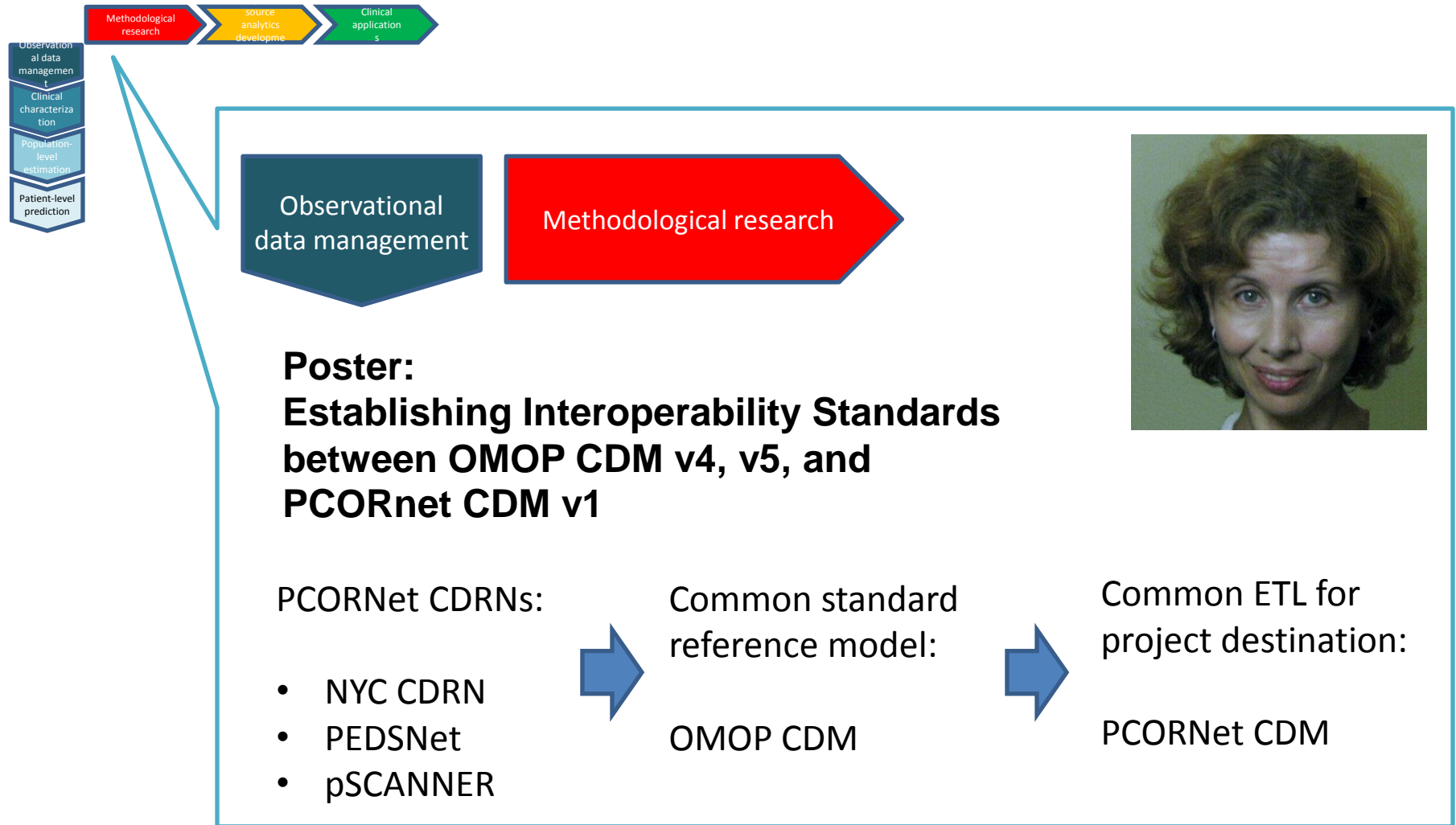


# OHDSI ongoing collaborative activities



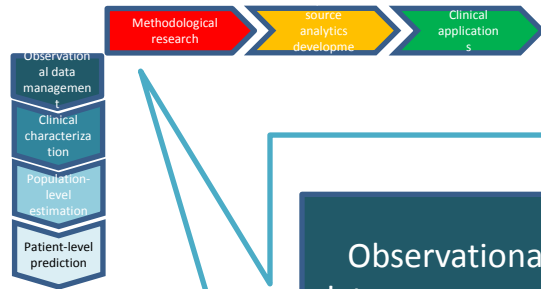


# OHDSI ongoing collaborative activities





# OHDSI ongoing collaborative activities



Observational  
data management

Methodological research



**Poster:**  
**Transforming the National Department  
of Veterans Affairs Data Warehouse to  
the OMOP Common Data Model**

Case Report

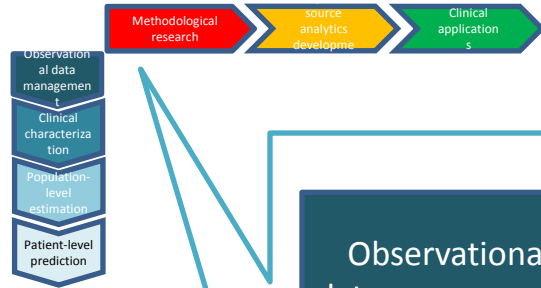
**ACI** Applied Clinical Informatics 536

**Creating a Common Data Model for  
Comparative Effectiveness with the  
Observational Medical Outcomes  
Partnership**

F. FitzHenry<sup>1,2</sup>; F.S. Resnic<sup>3</sup>; S.L. Robbins<sup>3</sup>; J. Denton<sup>1,4</sup>; L. Nookala<sup>1,4</sup>; D. Meeker<sup>5</sup>; L. Ohno-Machado<sup>6</sup>; M.E. Matheny<sup>1,2,4,7</sup>



# OHDSI ongoing collaborative activities

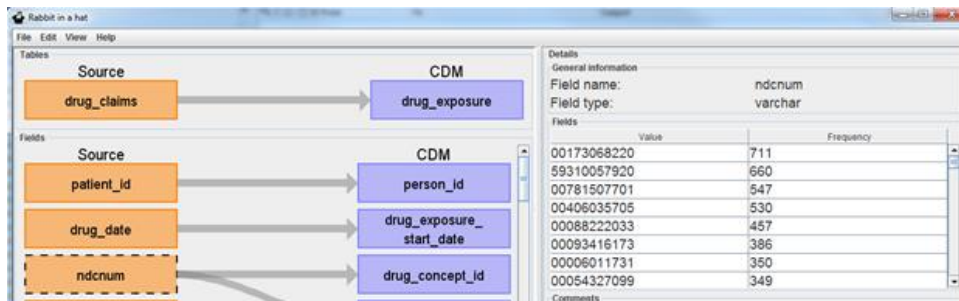


Observational  
data management

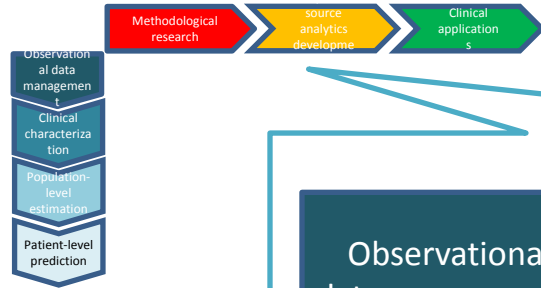
Methodological research

Open-source  
analytics  
development

**OHDSI Community Booth:  
ETL 101**

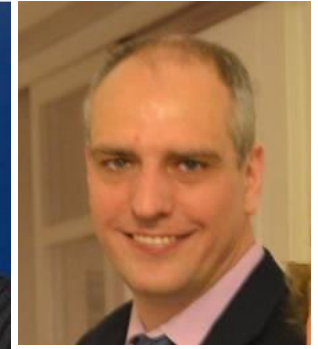


# OHDSI ongoing collaborative activities



Observational  
data management

Open-source  
analytics  
development



## OHDSI Community Booth: ATHENA for standardized vocabularies

### ATHENA Download Page Standardized Vocabularies for OMOP CDM

Fill out the form, pick the required vocabularies and select the right version

E-mail\*:

Your name\*:

Title:

Organization\*:

Address\*:

City\*:

Country\*:  State:  Zip:

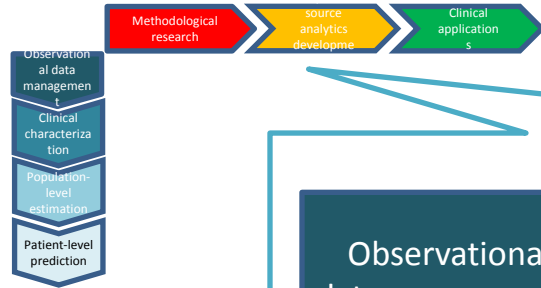
Phone\*:

CDM Version\*: V4.5 ☐ V5 ☒

Select vocabularies\*:

	Vocabulary ID (CDM V4.5)	Vocabulary code (CDM V5)	VOCABULARY NAME	Available	Latest update
<input checked="" type="checkbox"/>	71	ABMS	Provider Specialty (American Board of Medical Specialties)		
<input checked="" type="checkbox"/>	1	SNOMED	Systematic Nomenclature of Medicine - Clinical Terms (IHDSTO)		31-JAN-15
<input checked="" type="checkbox"/>	2	ICD9CM	International Classification of Diseases, Ninth Revision, Clinical Modification, Volume 1 and 2 (NCHS)		01-OCT-14
<input checked="" type="checkbox"/>	3	ICD9Proc	International Classification of Diseases, Ninth Revision, Clinical Modification, Volume 3 (NCHS)		01-OCT-14
<input checked="" type="checkbox"/>	4	CPT4	Current Procedural Terminology version 4 (AMA)	<a href="#">EULA required</a>	10-OCT-14
<input checked="" type="checkbox"/>	5	HCPCS	Healthcare Common Procedure Coding System (CMS)		12-NOV-14
<input checked="" type="checkbox"/>	6	LOINC	Logical Observation Identifiers Names and Codes (Regenstrief Institute)		29-JUN-15
<input checked="" type="checkbox"/>	7	NDFRT	National Drug File - Reference Terminology (VA)		06-JUL-15

# OHDSI ongoing collaborative activities



Observational  
data management

Open-source  
analytics  
development



## Open-source analytic demo: HERMES for vocabulary exploration

← → ↻ [www.ohdsi.org/web/atlas/#/concept/4329847](http://www.ohdsi.org/web/atlas/#/concept/4329847) 🔍 ☆

**ATLAS**

🔍 Vocabulary Search  
myocardial infarctio... (350)

🕒 Recent Concepts  
Myocardial infarction

📁 Concept Set 0

📄 Import

📄 Cohort Definitions

👤 Profiles

📊 Cohort Reporting

🕒 Feasibility

📄 Jobs

⚙️ Configure

💬 Feedback

### Myocardial infarction

Details Related Concepts **Hierarchy** Record Counts

Parents

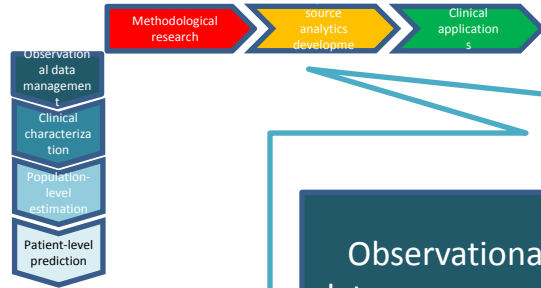
Id	Code	Name	Class	RC	DRC	Domain	Vocabulary
4185932	414545008	Ischemic heart disease	Clinical Finding	72	1,691	Condition	SNOMED
43530876	609410002	Necrosis of anatomical site	Clinical Finding	0	1,415	Condition	SNOMED
4239975	57809008	Myocardial disease	Clinical Finding	0	1,123	Condition	SNOMED
4354249	251061000	Myocardial necrosis	Clinical Finding	0	529	Condition	SNOMED

22298006 Myocardial infarction

Children

Id	Code	Name	Class	RC	DRC	Domain	Vocabulary
312327	57054005	Acute myocardial infarction	Clinical Finding	119	338	Condition	SNOMED
314666	1755008	Old myocardial infarction	Clinical Finding	187	187	Condition	SNOMED
439693	194802003	True posterior myocardial infarction	Clinical Finding	4	4	Condition	SNOMED
4154704	371068009	Myocardial infarction with complication	Clinical Finding	0	0	Condition	SNOMED

# OHDSI ongoing collaborative activities



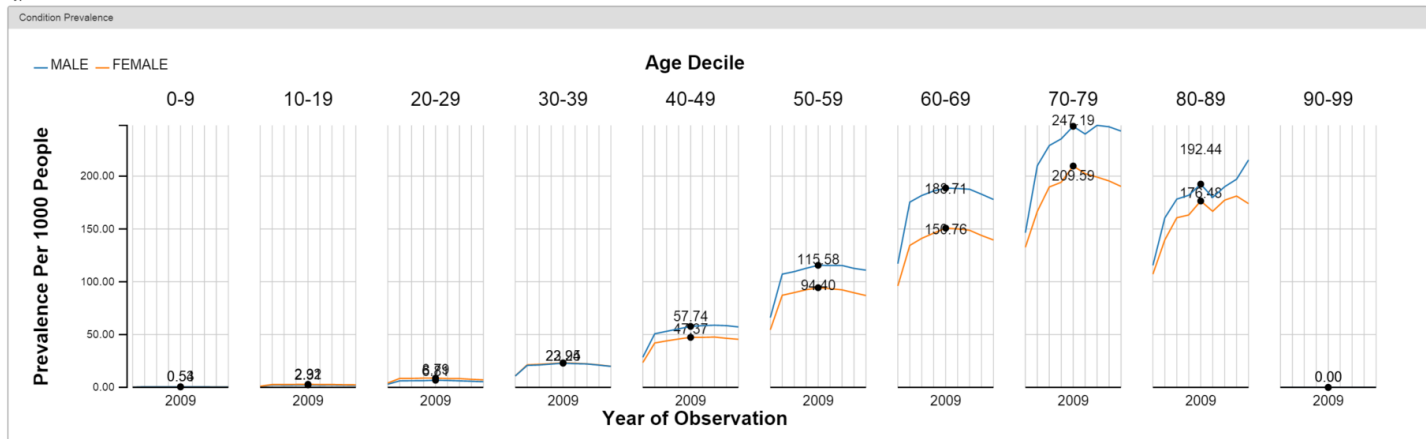
Observational  
data management

Open-source  
analytics  
development

## Open-source analytic demo: ACHILLES for database profiling



Type 2 diabetes mellitus



# OHDSI ongoing collaborative activities



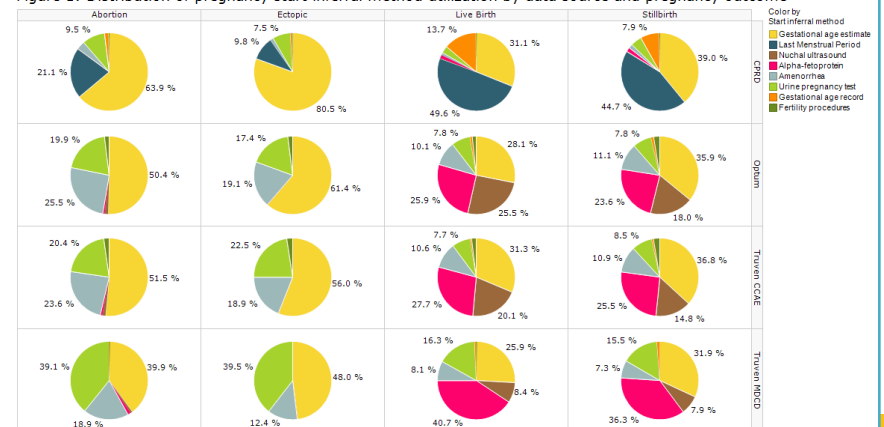
Observational  
data management

Clinical applications

## Poster: Determination of Pregnancy Episodes and Outcomes within a Distributed Network of Observational Databases



Figure 1: Distribution of pregnancy start infernal method utilization by data source and pregnancy outcome



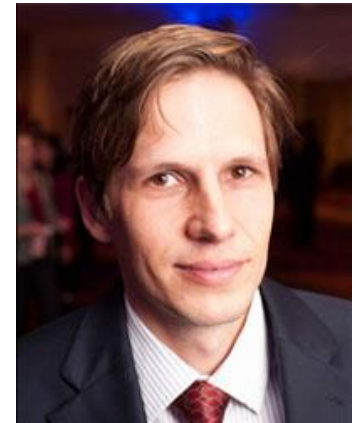


# OHDSI ongoing collaborative activities



Clinical  
characterization

Methodological research



**Poster:**  
**Size comparison of 17 CDM**  
**datasets using IRIS tool**

MEASURE	RESULT	EXPLANATION
G1	141,805,491	count of patients
G2	20,328,289,601	count of events
D2	90,024,522	count of patients with at least 1 Dx and 1 Rx
D3	112,148,500	count of patients with at least 1 Dx and 1 Proc
D4	5,939,621	count of patients with at least 1 Obs, 1 Dx and 1 Rx
D5	277,975	count of deceased patients

# OHDSI ongoing collaborative activities

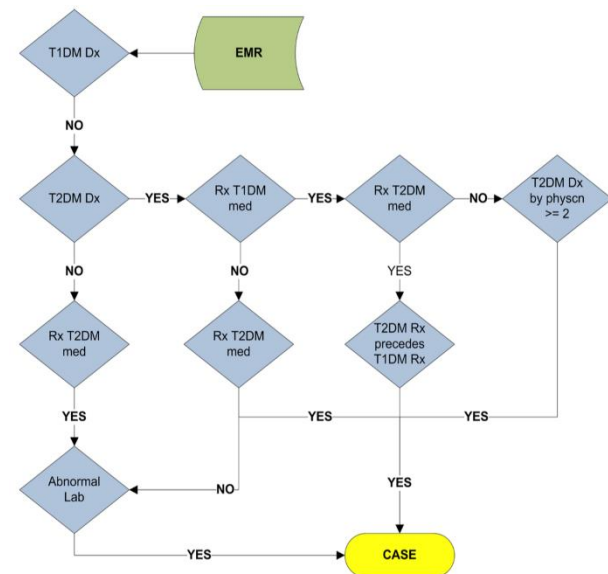


Clinical  
characterization

Methodological research



**Poster:**  
**Lessons from CIRCE**  
**implementation of eMERGE**  
**phenotype definitions into**  
**actionable CDM v5 SQL queries**



# OHDSI ongoing collaborative activities




Clinical  
characterization

Open-source  
analytics  
development

**Open-source analytics demos:**  
**CIRCE for cohort definition**  
**CALYPSO for feasibility**  
**assessment**



 **CIRCE**  
Cohort Inclusion and Restriction Criteria Expression

Cohort Definition List Help

eMERGE PheKB Type 2 Diabetes phenotype algorithm  
(Northwestern University) Literal Save

Description:  
As detailed at: <https://phekb.org/phenotype/type-2-diabetes-mellitus>

Expression Concept Sets Print Friendly Raw JSON Generate

People having any of the following: Add Primary Event Filters...

a condition occurrence of T2DM Diagnosis Add Filter...

a drug exposure of T2DM Prescriptions Add Filter...

with observation at least 0 days prior and 0 days after index

Limit primary events to: All Events per person.

**For people matching the Primary Events, include:**

People having All of the following criteria: Add New Criteria...

with At Most 0 using all occurrences of:

a condition occurrence of T1DM Diagnosis Add Filter...

occurring between All days Before and All days After index

# OHDSI ongoing collaborative activities

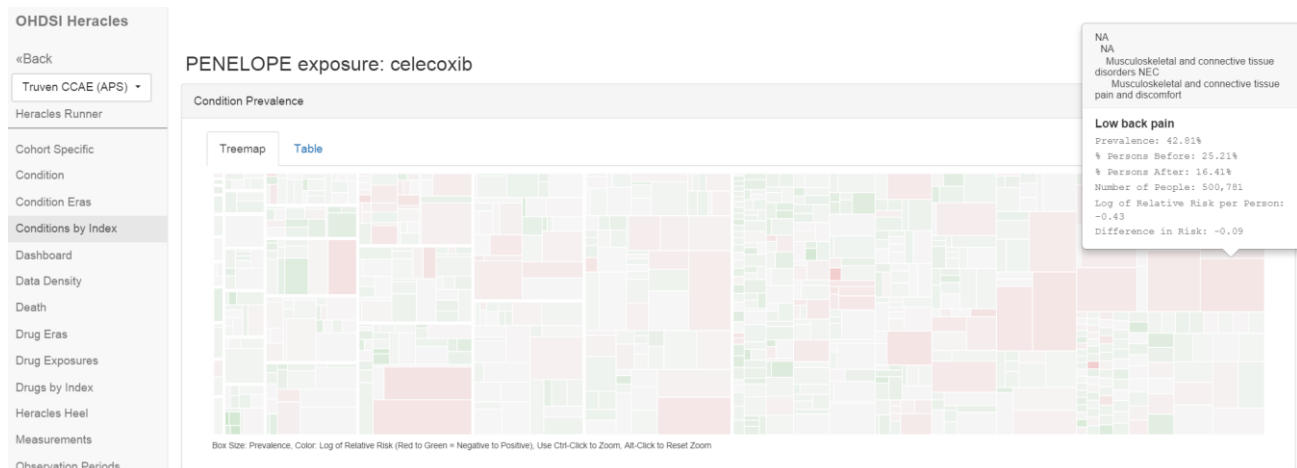


Clinical  
characterization

Open-source  
analytics  
development



## Open-source analytics demos: HERACLES for cohort characterization

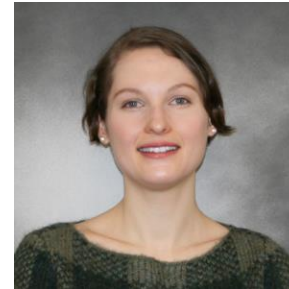


# OHDSI ongoing collaborative activities



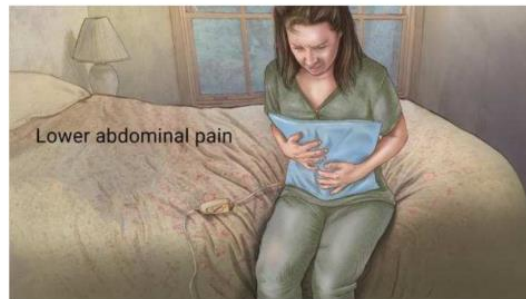
Clinical  
characterization

Clinical applications



## Poster: Exploration of the Epidemiology of Endometriosis





### Endometriosis



A disorder in which tissue that normally lines the uterus grows outside the uterus.

#### Very common

More than 3 million US cases per year

-  Treatable by a medical professional
-  Requires a medical diagnosis
-  Lab tests or imaging often required
-  Chronic: can last for years or be lifelong

With endometriosis, the tissue can be found on the ovaries, fallopian tubes or the intestines.

The most common symptoms are pain and menstrual irregularities.

Effective treatments, such as hormones and excision surgery, are available.



# OHDSI ongoing collaborative activities

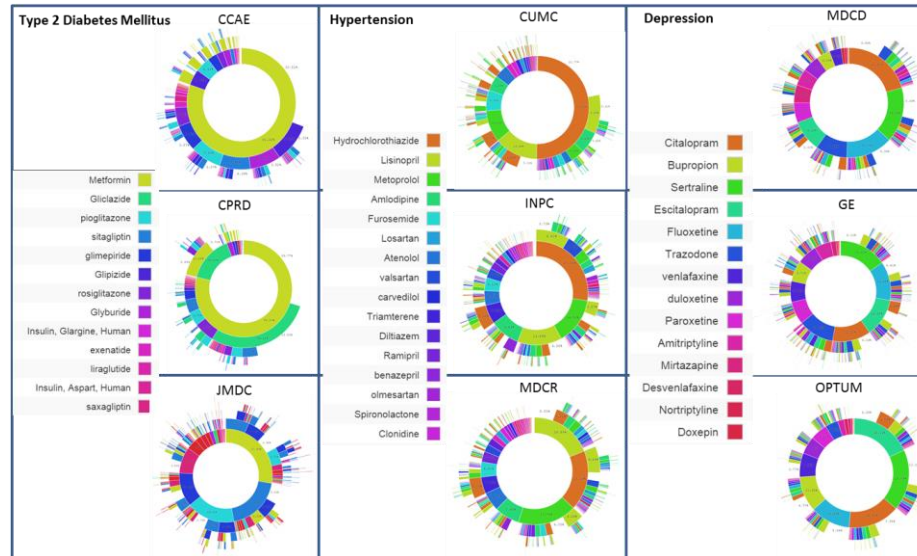


Clinical  
characterization

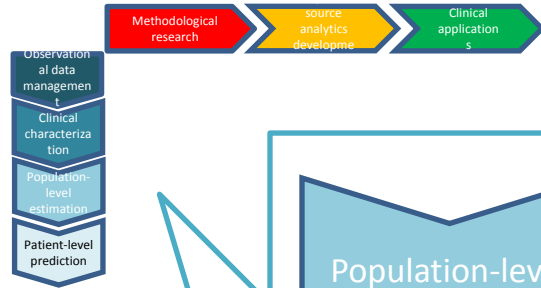
Clinical applications



## Presentation: Treatment pathways in chronic disease



# OHDSI ongoing collaborative activities

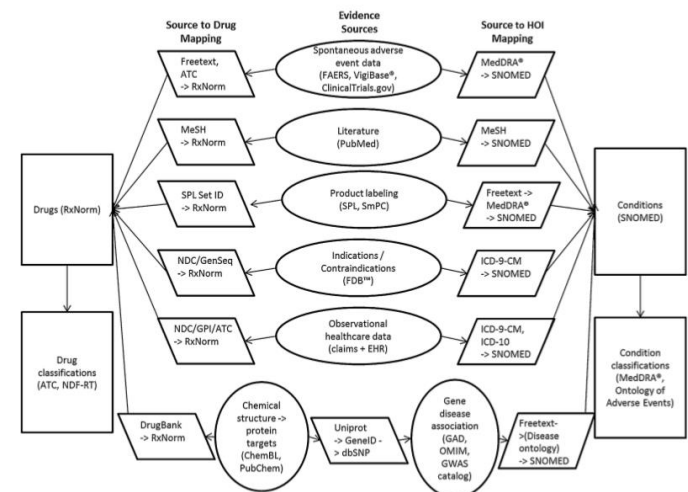


Population-level estimation

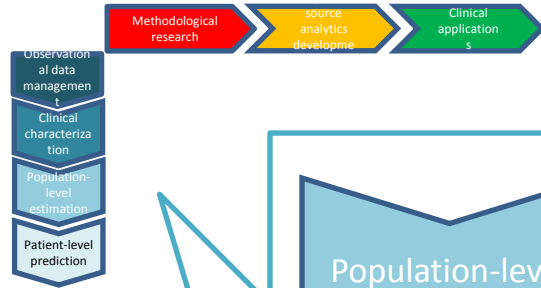
Methodological research



## Open-source analytic demo: LAERTES for evidence integration



# OHDSI ongoing collaborative activities



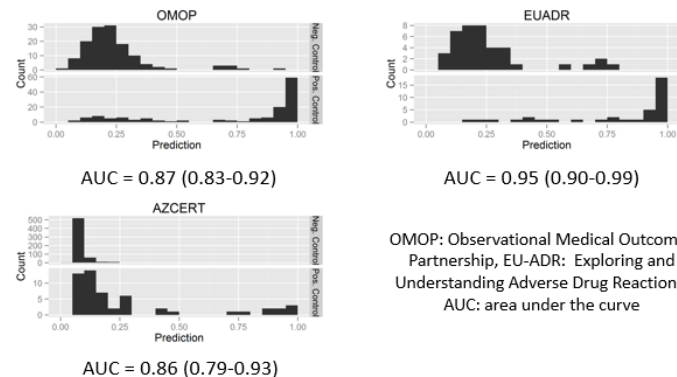
Population-level estimation

Methodological research



## Poster: Accuracy of an Automated Knowledgebase for Identifying Adverse Drug Reactions

Figure 1. Histograms of predicted probabilities with AUCs for positive/negative controls in the various reference sets, using the model trained on both OMOP and EU-ADR ref. set.



OMOP: Observational Medical Outcomes Partnership, EU-ADR: Exploring and Understanding Adverse Drug Reactions, AUC: area under the curve

# OHDSI ongoing collaborative activities

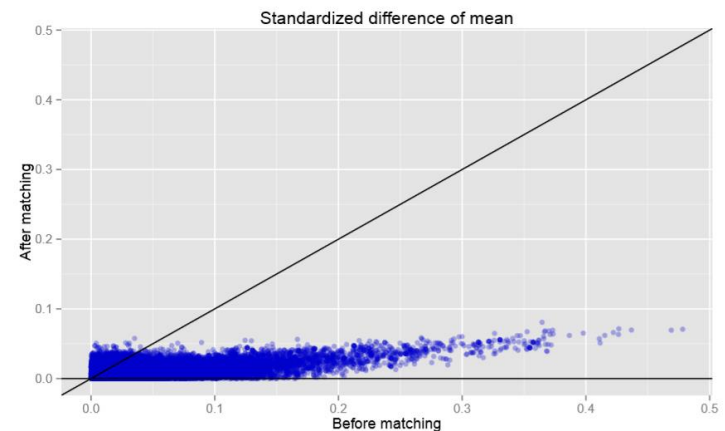


Population-level estimation

Methodological research



**Poster:**  
**How high can we go? Evaluating massively high-dimensional propensity score and outcome models in large-scale observational studies**



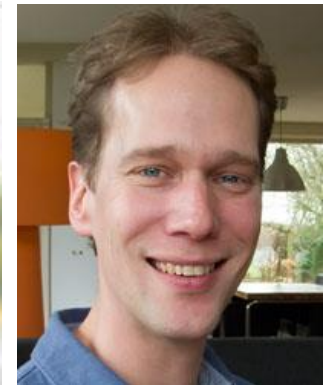


# OHDSI ongoing collaborative activities



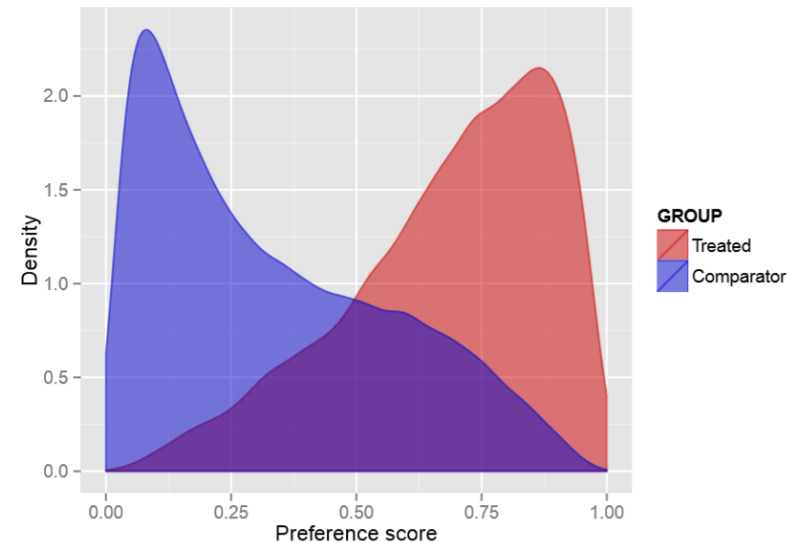
Population-level  
estimation

Open-source  
analytics  
development

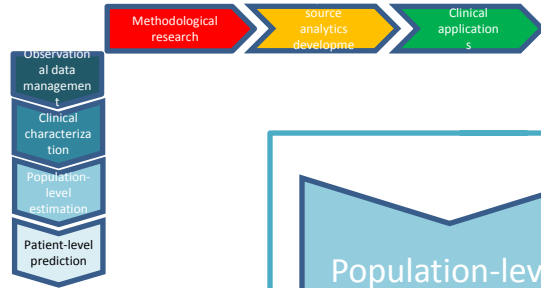


**Open-source analytics demos:**

**Cohort Method**  
**Self-controlled case series**  
**Empirical calibration**



# OHDSI ongoing collaborative activities

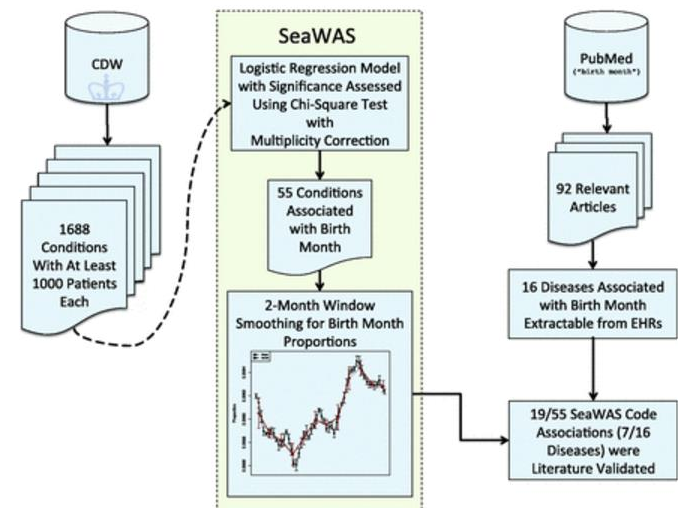


Population-level estimation

Clinical applications



## Poster: A Climate-Wide Journey to Explore Mechanisms Underlying Birth Month Disease Risk Associations





# OHDSI ongoing collaborative activities



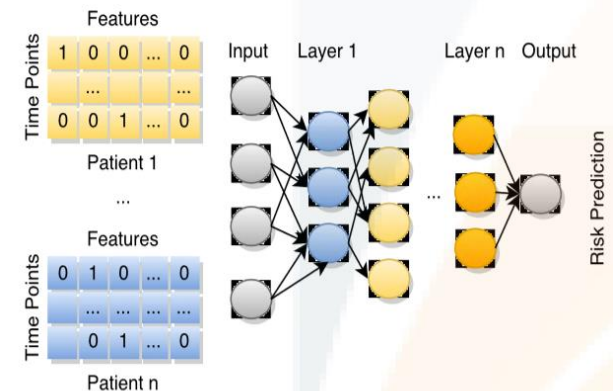
Patient-level prediction

Methodological research

**Poster:**  
**Discovering the hidden risk factors: An empirical evaluation of incorporating feature-learning methods into a risk model framework using the OMOP CDM**



## Deep Learning



# OHDSI ongoing collaborative activities



Patient-level prediction

Open-source analytics development



## Open-source analytic demo: APHRODITE for predictive phenotyping

### Package ‘Aphrodite’

October 15, 2015

**Type** Package

**Title** Automated PHenotype Routine for Observational Definition Identification Training and Evaluation (APHRODITE) - Phenotype building tool using Fuzzy labels

**Version** 1.2

**Date** 2015-09-21

**Author** Juan M. Banda [aut, cre],  
Kate Niehaus [aut],  
Marc A. Suchard [aut],  
Martijn J. Schuemie [aut]

**Maintainer** Juan M. Banda <jmbanda@stanford.edu>

**Description** Aphrodite uses noisy class labels to create silver standard training corpora to construct phenotype models in conjunction with expert knowledge codified in existing ontologies and a comprehensive representation of the patient clinical record to learn phenotype models.

**License** Apache License 2.0 | file LICENSE

**Depends** R (>= 3.1.0),  
data.table

# OHDSI ongoing collaborative activities



Patient-level prediction

Clinical applications



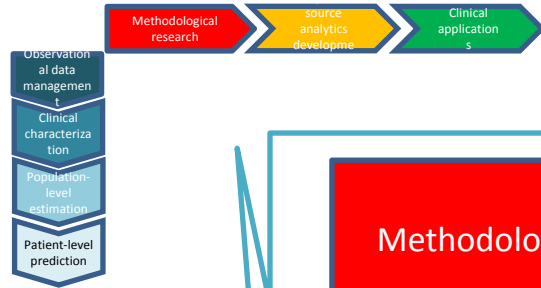
## Poster: Lift your Anchors and Begin the OHDSI with APHRODITE

Abdominal pain	Cerebrovascular accident	Kidney stone
Alcoholism	Diabetes	Laceration
Allergic reaction	Deep vein thrombosis	Liver (history)
Ankle fracture	Employee exposure	Motor Vehicle Accident
Anticoagulated	Epistaxis	From nursing home
asthma/copd	Gastroenteritis	Pancreatitis
Back pain	Gastrointestinal bleed	Pneumonia
Bicycle accident	Geriatric fall	Psych
Cancer	Headache	Obstruction
Cardiac etiology	Hematuria	Septic shock
Cellulitis	Hiv+	Severe sepsis
Chest pain	Intracerebral hemorrhage	Sexual assault
Congestive heart failure	Immunosuppressed	Suicidal ideation
Cholecystitis	Infection	Syncope
		Urinary tract infection

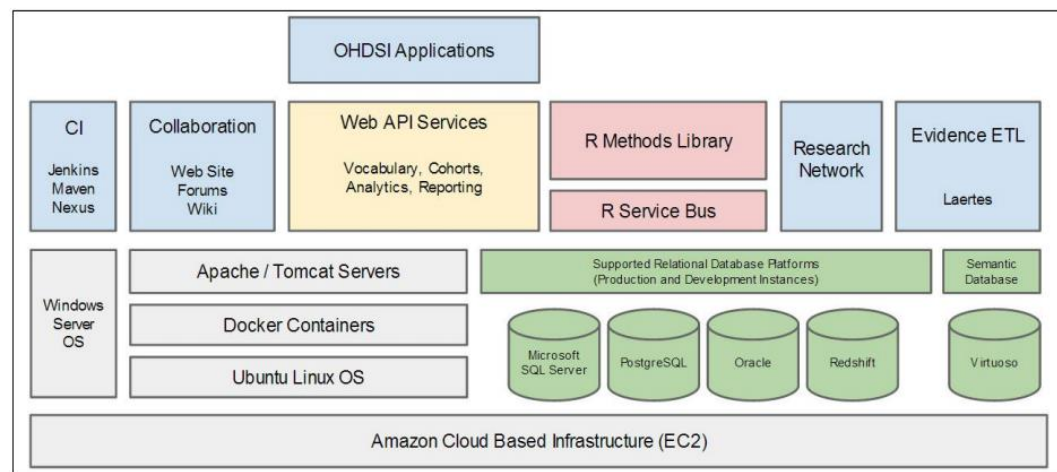
Patient	Dr. [Name] (35381)
Age / Sex	37 / M
Chief Complaint	slp Fall
Room / Zone	37 / Purple Zone
Registration	Not Updated
PCP	[Name] (35381) [Address - Kenmore Square]
	Admits to: Dept. of Medicine Hospitalist Group (HMD) (817-421-8843)
Atrius	Atrius EpicWeb -- 781-292-7272
Attending	Nathanson, Larry (35381) 11
Resident	[Name] (35381)
Nurse	[Name] (35381)
Tech	[Name] (35381)
Referrals	Referral for "Respiratory" (35381) (35381)
Clinical State	geriatricFail x
Pathways	Consider Geriatric Falls pathway: (Click Here)
	Reset

Figure 1: (Left) Phenotypes currently being identified in real-time at BIDMC. (Right) Display screen where one of the phenotypes has been used to recommend a pathway of care.

# OHDSI ongoing collaborative activities



## Poster: OHDSI Cloud Architecture





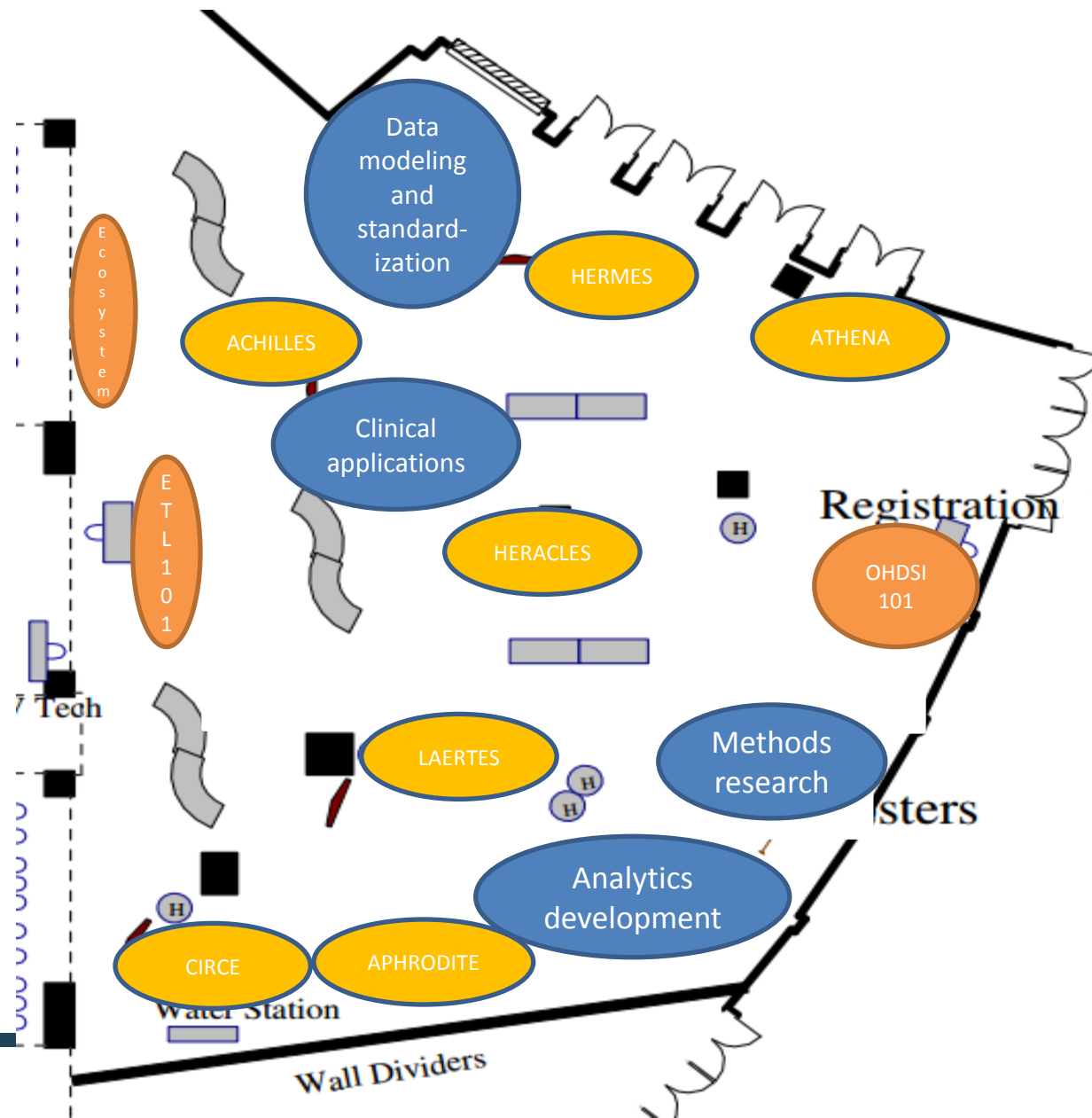
# OHDSI commercial ecosystem



LTS Computing LLC



# Journey through the OHDSI collaborator showcase







# Panel Discussion – Experiences from the OHDSI international data network





# Panel Discussion – The Value and Challenges of Evidence from Observational Data: A Multi-Stakeholder Perspective



- Moderator: David Madigan, PhD, Executive Vice President and Dean of the Faculty of Arts and Sciences at Columbia University
- Robert Ball, MD, MPH, ScM, Deputy Director – Office of Surveillance and Epidemiology, CDER, US Food and Drug Administration
- Invited: Robert Califf, MD, Deputy Commissioner of Medical Products and Tobacco, US Food and Drug Administration
- Nareesa Mohammed-Rajput, MD, Medical Director of Clinical Informatics, Suburban Hospital part of Johns Hopkins Medicine
- Maryan Zirkle MD, MS, MA, Program Officer – CER Methods and Infrastructure Program, PCORI
- Lesley Wise, Vice President of PV Risk Management and Pharmacoepidemiology, Takeda Pharmaceuticals



# Future of OHDSI

This is your journey....

....where do we go from here?





I asked you to participate...

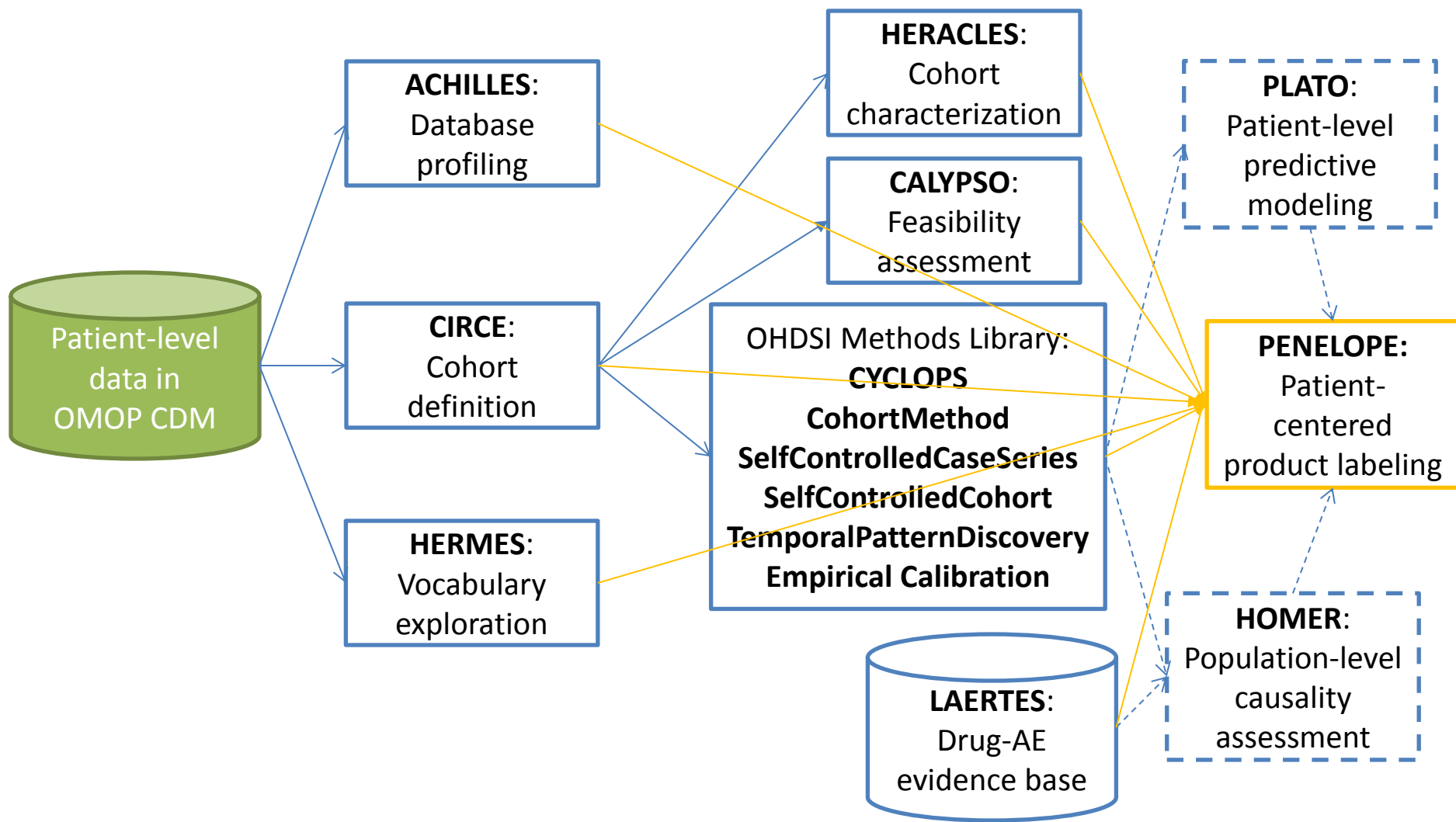
<https://www.surveymonkey.com/r/59GTY6X>

Let's generate some evidence...

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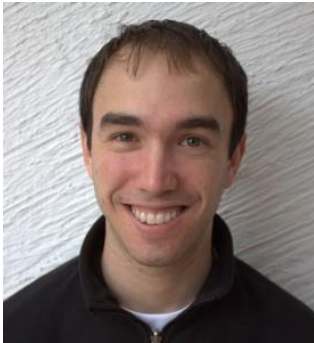


# Standardized large-scale analytics tools under development within OHDSI





# Thank you OHDSI Symposium Organizing Committee



David Sontag  
NYU



Chunhua Weng  
Columbia University



Jon Duke  
Regenstrief



Ana Szarfman  
FDA



Charlie Bailey  
CHOP



Gregory Fusco  
Takeda





# Thank you Maura Beaton





# Join the journey

Interested in OHDSI?  
Questions or comments?

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