

## Big Data Phenomics in the VA

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Harvard Medical School

**Academy Health  
Annual Research Meeting  
June 27, 2017**



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## Outline

- Importance of data standardization and interoperability
- PCORnet and the Observational Medical Outcomes Partnership (OMOP) Common Data Model
- Million Veteran Program (use case)
- Coding algorithms for computable phenotypes

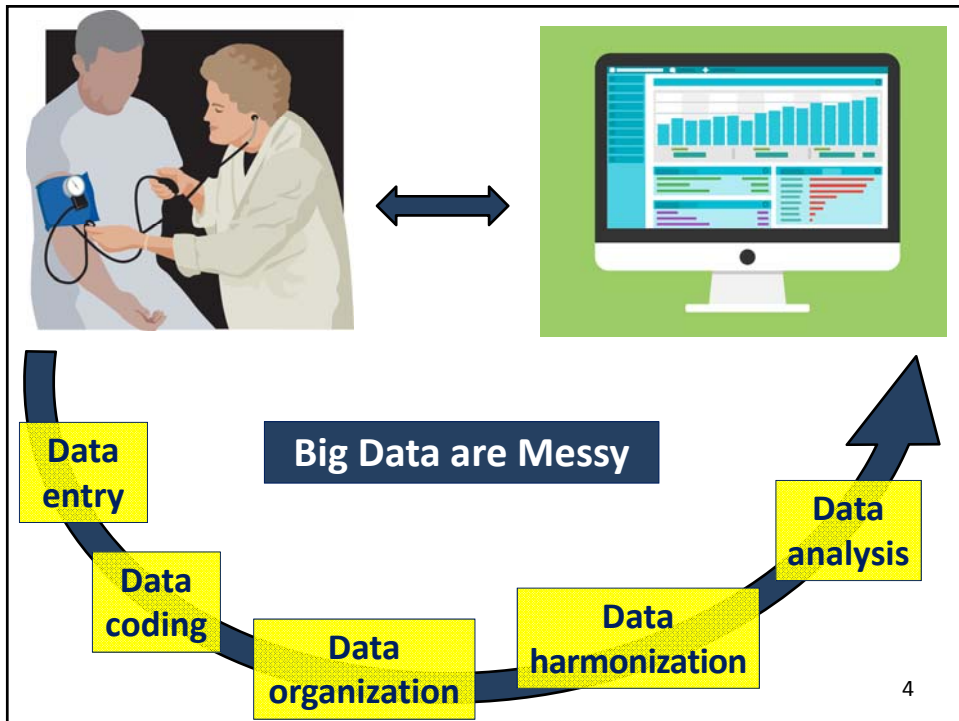


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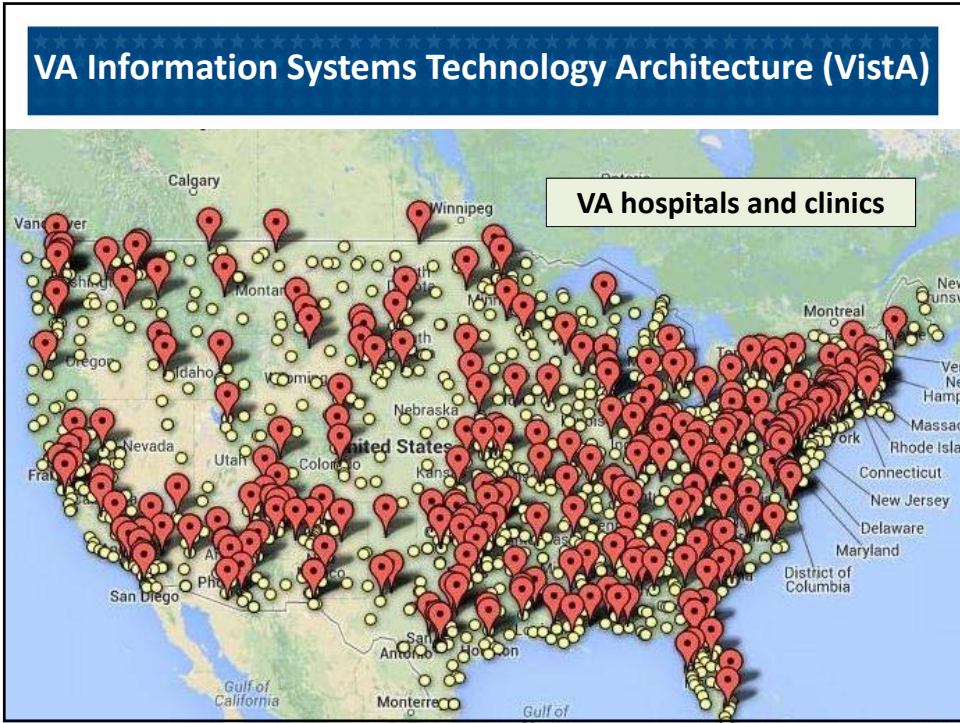




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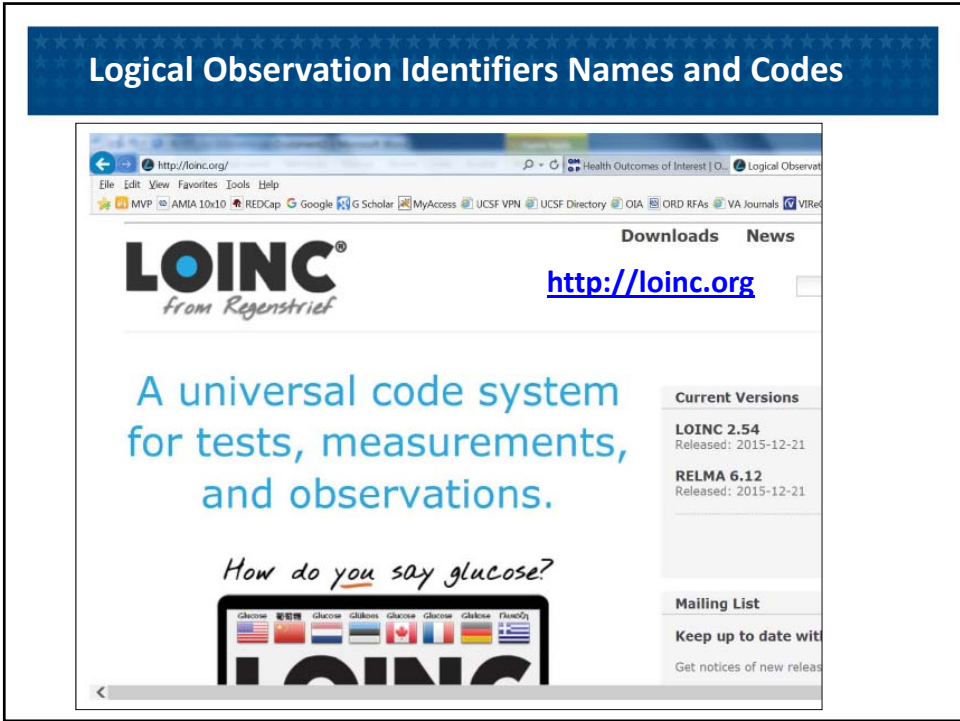


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**Example: How can we identify uncontrolled diabetics?**

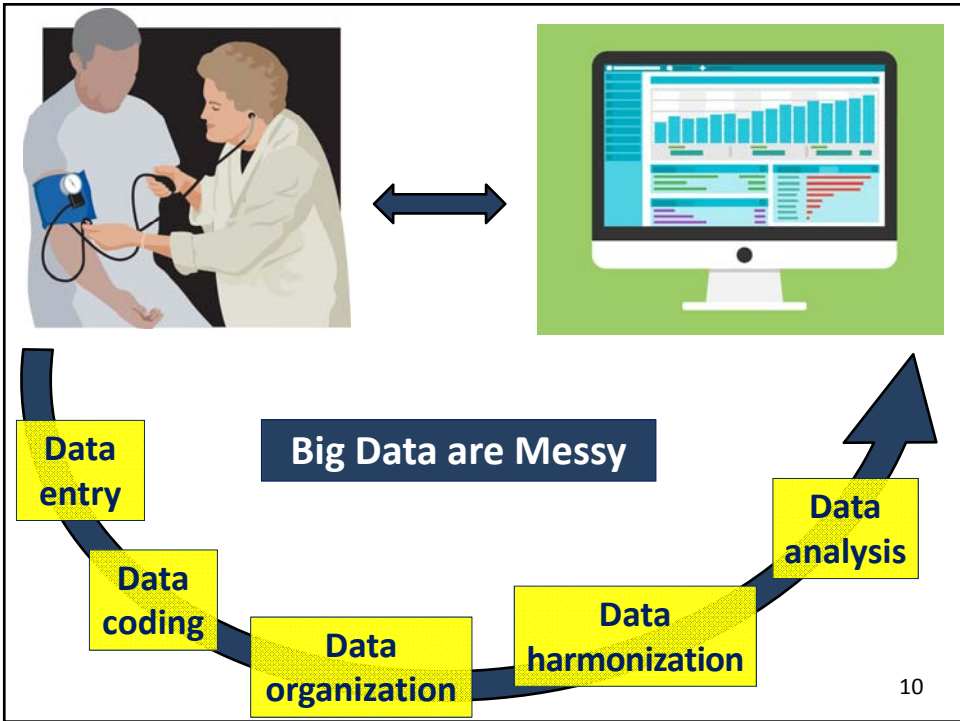
Value	LabChemTestName	units
7.5	A1C HGB	%
6.2	A1C GLYCOHEMOGLOBIN	% T HGB
5.9	GLYCOHEMOGLOBIN	% TOT HGB
<b>8.3</b>	GLYCOSYLATED HEMOGLOBIN	%TOTAL HBG
5.2	HBA1C	% gHbA1c
5.4	GLYCOSYL HEMOGLOBIN A1c	% HbA1C
5.7	HGB A1C	PERCENT
<b>9.3</b>	HEMOGLOBIN %A1C	%TOTAL
6.4	GLYCOHEMOGLOBIN (A1C)	%HGBA1C
7.3	GLYCOHEMOGLOBIN (GHB)	% HBG
<b>11.2</b>	GLYCOHGB	% OF TOTAL
6.8	HEMOGLOBIN A1C PANEL	% HBG
5.8	TOTAL A1C	% A1C



**Example: How can we identify uncontrolled diabetics?**

Value	LabChemTestName	units	LOINC
7.5	A1C HGB	%	4548-4
6.2	A1C GLYCOHEMOGLOBIN	% T HGB	4548-4
5.9	GLYCOHEMOGLOBIN	% TOT HGB	4548-4
8.3	GLYCOSYLATED HEMOGLOBIN	%TOTAL HBG	4548-4
5.2	HBA1C	% gHbA1c	4548-4
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5.7	HGB A1C	PERCENT	4548-4
9.3	HEMOGLOBIN %A1C	%TOTAL	4548-4
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7.3	GLYCOHEMOGLOBIN (GHB)	% HRG	4548-4
11.2	GLYCOHGB	% OF TOTAL	4548-4
6.8	HEMOGLOBIN A1C PANEL	% HBG	4548-4
5.8	TOTAL A1C	% A1C	4548-4

VA Corporate Data Warehouse Data Tables	
<input type="checkbox"/> Allergy	<input type="checkbox"/> Patient Enrollment
<input type="checkbox"/> Appointment	<input type="checkbox"/> Patient Insurance
<input type="checkbox"/> Consult	<input type="checkbox"/> Patient Record Flag
<input type="checkbox"/> CPRS Orders	<input type="checkbox"/> PCMM (Primary Care)
<input type="checkbox"/> Dental	<input type="checkbox"/> Pharmacy BCMA (Bar Code Medication)
<input type="checkbox"/> Emergency Dept.	<input type="checkbox"/> Pharmacy Outpatient
<input type="checkbox"/> Health Factors	<input type="checkbox"/> Pharmacy Patient
<input type="checkbox"/> Health Benefits Request	<input type="checkbox"/> Purchased Care (formerly fee)
<input type="checkbox"/> Immunization	
<input type="checkbox"/> Inpatient	<input type="checkbox"/> SStaff
<input type="checkbox"/> Lab Microbiology	<input type="checkbox"/> Surgery PRE, INTRA, and POST(
<input type="checkbox"/> Lab Chem	<input type="checkbox"/> VistA Waitlist
<input type="checkbox"/> Mental Health	<input type="checkbox"/> VistA Compensation & Pension
<input type="checkbox"/> Non-VA Meds	<input type="checkbox"/> Vital Signs
<input type="checkbox"/> Outpatient	<input type="checkbox"/> Women's Health



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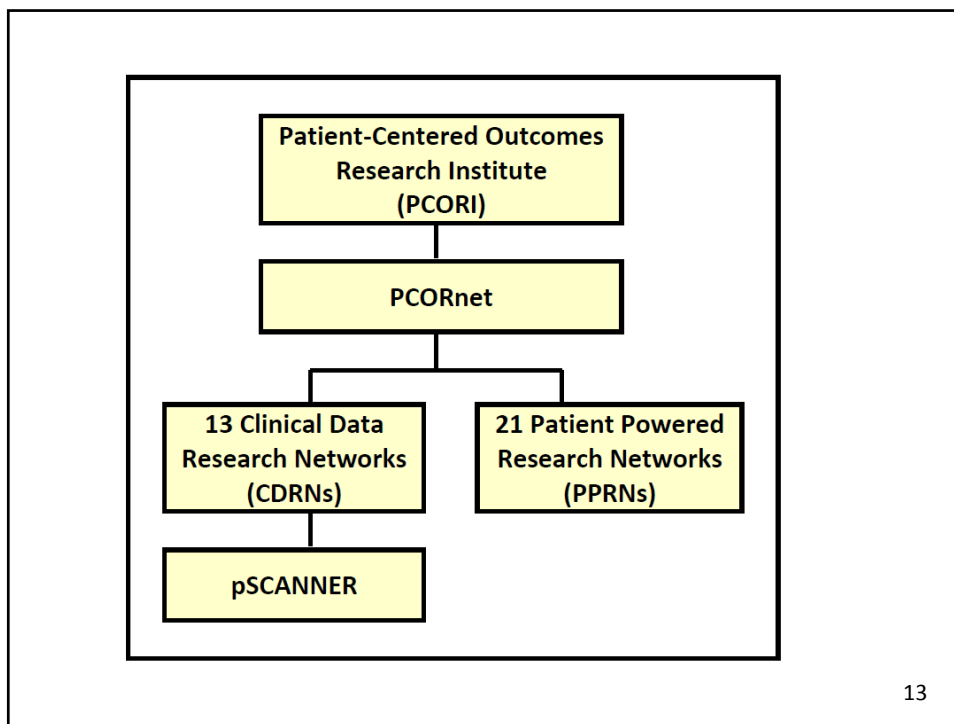
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<http://www.pcornet.org/>



### PCORnet, the National Patient-Centered Clinical Research Network

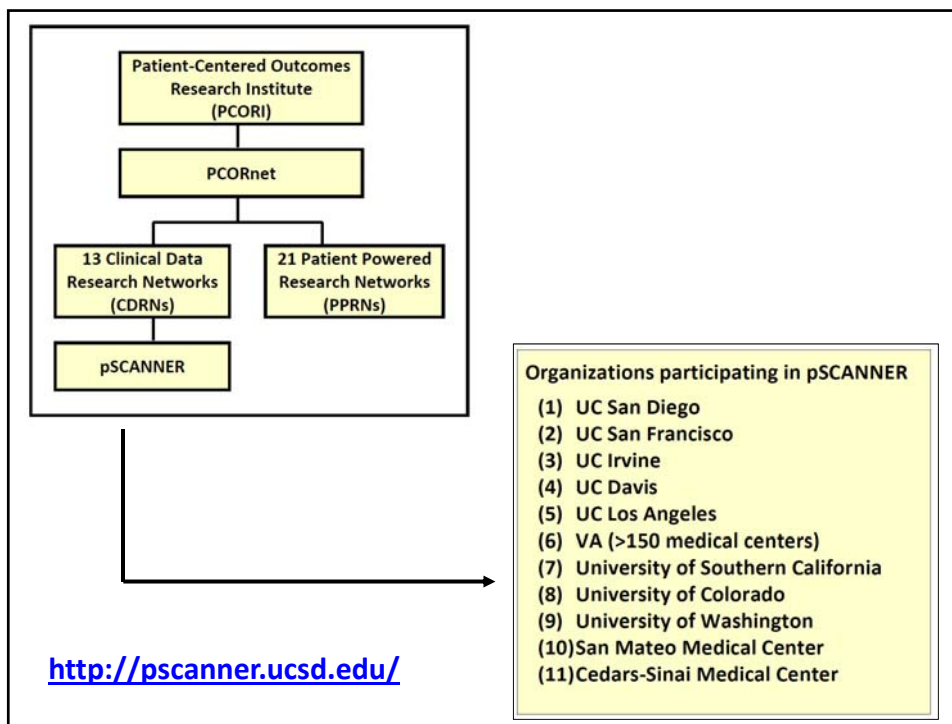
PCORnet, the National Patient-Centered Clinical Research Network, is an innovative initiative of the Patient-Centered Outcomes Research Institute (PCORI). It is designed to make it faster, easier, and less costly to conduct clinical research than is now possible by harnessing the power of large amounts of health data and patient partnerships. In the process, it is transforming the culture of clinical research from one directed by researchers to one driven by the needs of patients and those who care for them.



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<http://pscanner.ucsd.edu/>

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### Transforming the National Department of Veterans Affairs Data Warehouse to the OMOP Common Data Model

Fern FitzHenry<sup>1,2</sup>, Jesse Brannen<sup>1</sup>, Jason Denton<sup>1,2</sup>, Jonathan R. Nebeker<sup>3,4</sup>, Scott L. DuVall<sup>3,4</sup>, Freneka Minter<sup>1,2</sup>, Jeffrey Scehnet<sup>3</sup>, Brian Sauer<sup>3,4</sup>, Lucila Ohno-Machado<sup>5</sup>, Michael E. Matheny<sup>1,2</sup>

<sup>1</sup>Tennessee Valley Healthcare System, Veterans Affairs Medical Center, Nashville, TN;

<sup>2</sup>Vanderbilt University, Nashville, TN; <sup>3</sup>VA Salt Lake City Health Care System, Salt Lake City, UT;

<sup>4</sup>University of Utah, Salt Lake City, UT; <sup>5</sup>Bioinformatics and Systems Biology, University of California, San Diego, CA;

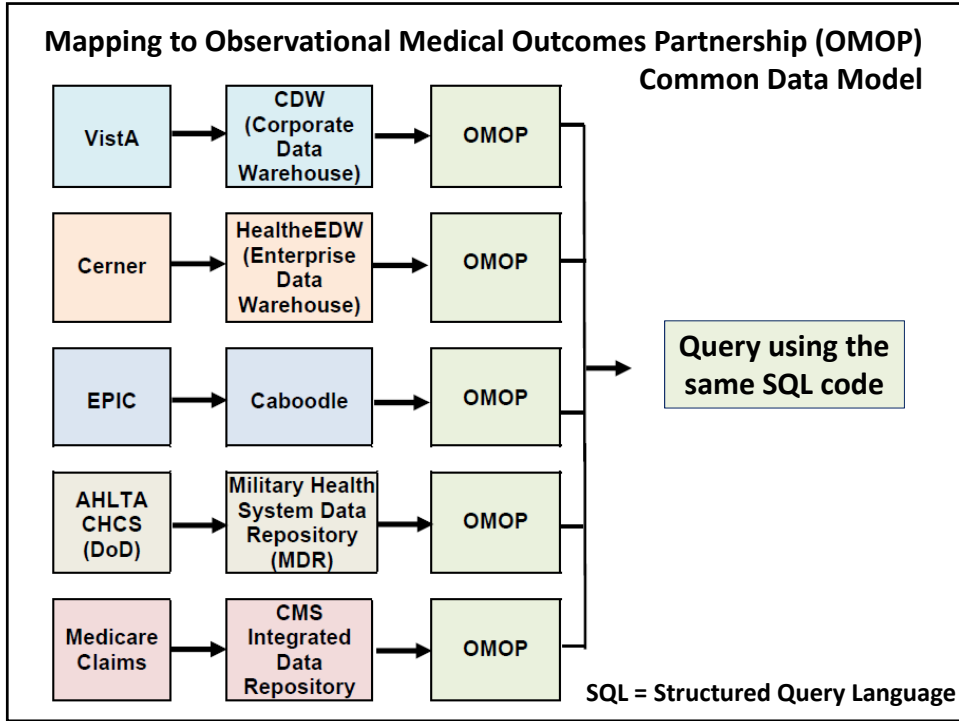
Abstract: To describe the conversion of the national Department of Veterans Affairs (VA) healthcare network's corporate data warehouse to the Observational Medical Outcomes Partnership (OMOP) common data model (CDM) suitable for distributed observational research. Observational outcomes from electronic medical record systems are becoming more important in comparative effectiveness research, particularly as post marketing surveillance research.<sup>1</sup>

#### 2000 to present

- 16 million unique patients
- 11 million w/ at least one encounter
- 5 million deaths
- 3 billion procedures
- 2.5 billion conditions
- 973,000 providers

*Abstract presented Nov 2015  
Am Medical Informatics Assoc*





### Observational Outcomes Partnership (OMOP) Common Data Model Implementations

**> 600 million patients worldwide**

VA **DISCOVERING EXCELLENCE** in Research Quality  
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Veterans Health Administration **Research & Development**  
Improving Veterans' Lives - www.research.va.gov

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Department of Veterans Affairs



**Million Veteran Program:**

## Million Veteran Program (MVP)

- National VA research initiative aiming to enroll one million users of the VHA in an observational cohort
- Over 500,000 patients already enrolled
- Blood collection for genotyping and storage
- Access to electronic medical record
- Goal is to create database of genomic, military exposure, lifestyle and electronic health information



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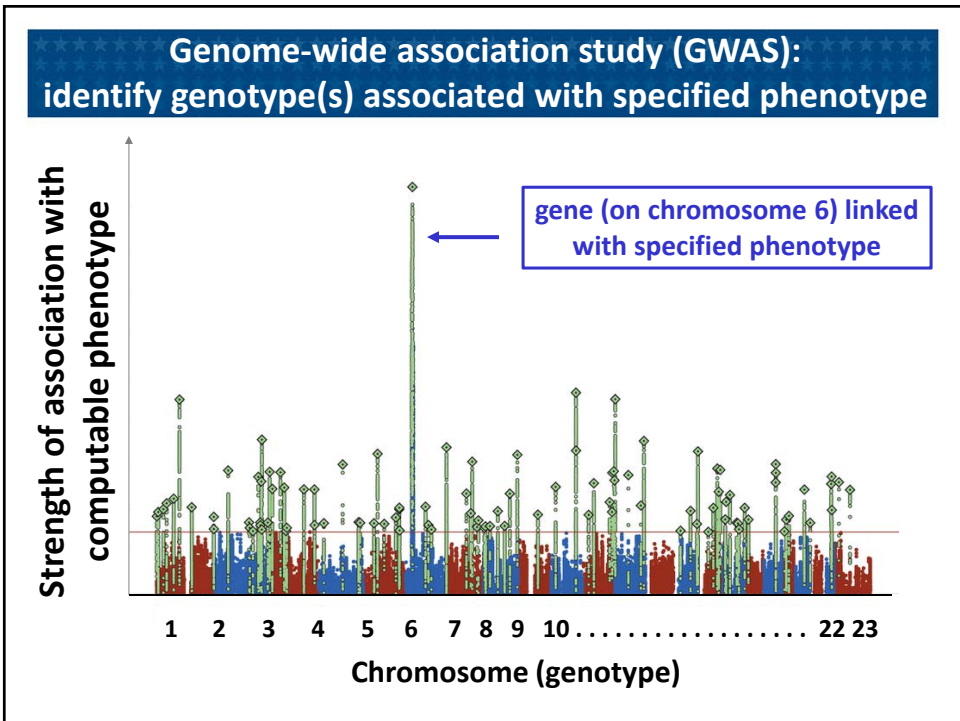
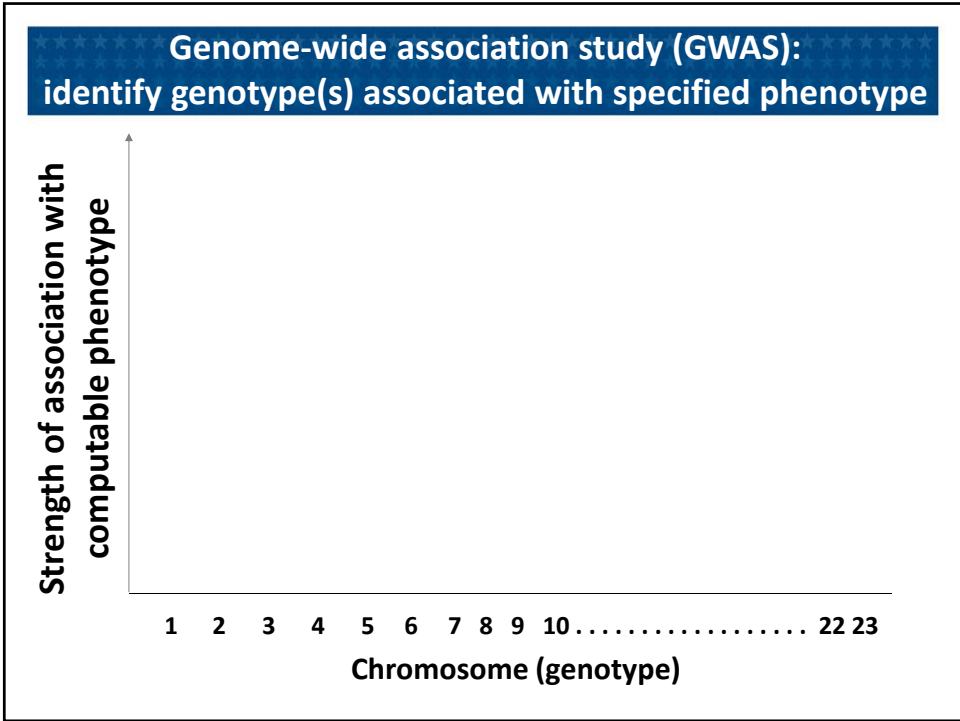
## Currently enrolling at >50 VHA Facilities



**Principal Investigators:**

**John Concato MD MS MPH**  
**J. Michael Gaziano MD MPH**

★ = Actively Recruiting  
 ● = Closed to Recruitment



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## What is a computable phenotype?

### Electronic Health Record

#### Structured data

- ICD9/10 codes
- CPT codes
- Prescriptions
- Lab results
- Vital signs

+

#### Unstructured data

- Visit notes
  - Signs/symptoms
  - Smoking/alcohol
  - Employment
- Radiology reports
- Discharge summary
- Pathology reports



=  
**Computable  
Phenotype**



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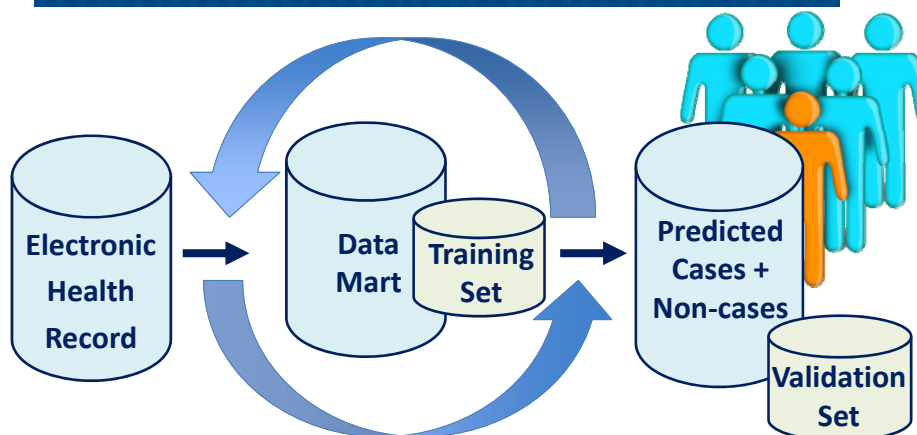


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## Phenotype Algorithms – <https://phekb.org/phenotypes>

Phenotype	Methods	Owner
Atrial Fibrillation	<a href="#">CPT Codes</a> , <a href="#">ICD 9 Codes</a> , <a href="#">Natural Language Processing</a>	<a href="#">Vanderbilt</a>
Dementia	<a href="#">ICD 9 Codes</a> , <a href="#">Medications</a>	<a href="#">eMERGE Univ Washington</a>
Heart Failure	<a href="#">CPT</a> , <a href="#">ICD 9 Codes</a> , <a href="#">Labs</a> , <a href="#">Meds</a> , <a href="#">Natural Language Processing</a>	<a href="#">eMERGE Mayo</a>
Coronary Disease	<a href="#">CPT Codes</a> , <a href="#">ICD 9 Codes</a>	<a href="#">PCORI MidSouth CDRN</a>
Sleep Apnea	<a href="#">CPT Codes</a> , <a href="#">ICD 9 Codes</a>	<a href="#">Beth Israel Deaconess</a>
Type 2 Diabetes	<a href="#">ICD 9 Codes</a> , <a href="#">Labs</a> , <a href="#">Medications</a>	<a href="#">eMERGE Northwestern</a>
Venous Thromboembolism	<a href="#">CPT</a> , <a href="#">ICD 9 Codes</a> , <a href="#">Vital Signs</a> , <a href="#">Natural Language Processing</a>	<a href="#">eMERGE Mayo</a>

## What is Natural Language Processing?



1. Identify cases and non-cases (often requires chart review)

2. Iteratively refine & test classification algorithm

3. Validate final algorithm (probabilistic approach)

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## Validation of electronic medical record-based phenotyping algorithms: results and lessons learned from the eMERGE network

Katherine M Newton,<sup>1</sup> Peggy L Peissig,<sup>2</sup> Abel Ngo Kho,<sup>3</sup> Suzette J Bielinski,<sup>4</sup>  
Richard L Berg,<sup>2</sup> Vidhu Choudhary,<sup>2</sup> Melissa Basford,<sup>5</sup> Christopher G Chute,<sup>6</sup>  
Iftikhar J Kullo,<sup>7</sup> Rongling Li,<sup>8</sup> Jennifer A Pacheco,<sup>3</sup> Luke V Rasmussen,<sup>3</sup>  
Leslie Spangler,<sup>1</sup> Joshua C Denny<sup>9</sup> *J Am Med Inform Assoc 2013*

## Extracting research-quality phenotypes from electronic health records to support precision medicine

Wei-Qi Wei<sup>1</sup> and Joshua C Denny<sup>1,2\*</sup> *Genome Medicine 2015*

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## MVP Phenomics Group

### Mission:

- 1) to provide a phenotyping framework for MVP Phenomics Science
- 2) to manage and coordinate resources for MVP phenotyping projects
- 3) to play a leading role towards “*Mapping the Human Phenome*”

### Organization:

Kelly Cho PhD MPH	Lead, MVP Phenotyping
Scott DuVall PhD	Lead, MVP-VINCI Collaboration
Jackie Honerlaw RN MPH	Manager, Phenomics Core
Kevin Malohi BS	Manager, VINCI Data Services
Mai Nguyen PhD	Manager, MVP Data Analytics
Anne Ho MPH	Lead, MVP Data Management
David Gagnon MD PhD	Lead, Biostatistics and Data Science



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