

Health Care Systems Research Collaboratory

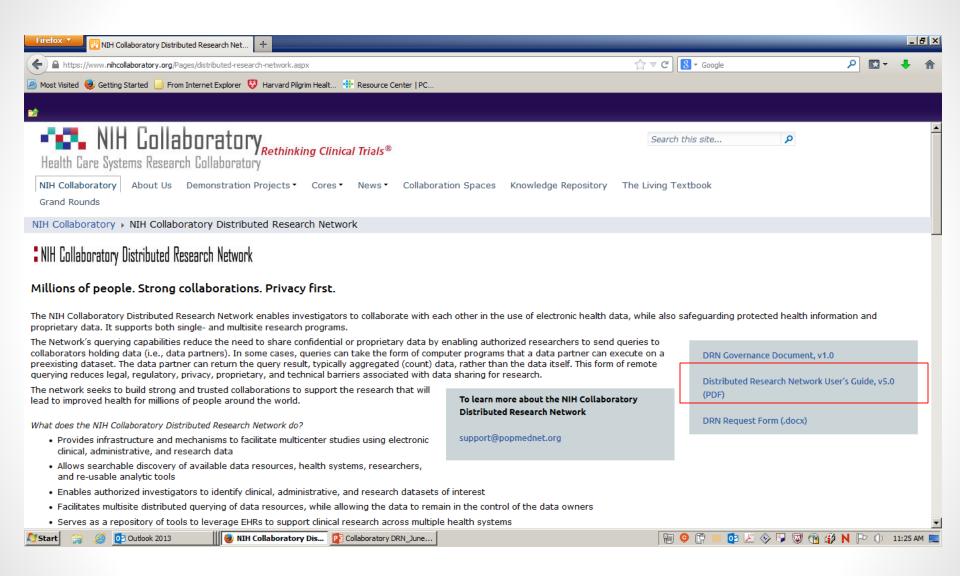
# The NIH Collaboratory Distributed Research Network

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## The Goal

The NIH Collaboratory DRN facilitates research partnerships with organizations (Data Partners) that possess <u>electronic</u> <u>health data that have been quality checked and formatted</u> to support multi-site biomedical research

### https://www.nihcollaboratory.org/Pages/distributed-research-network.aspx



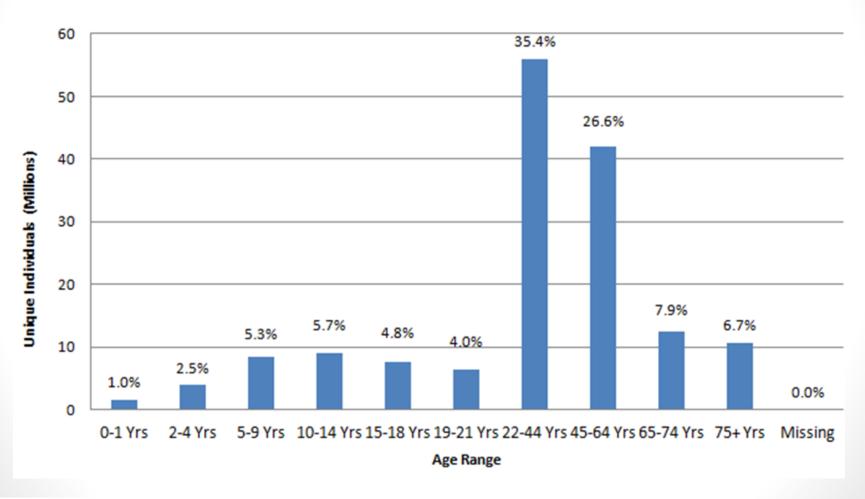
### Uses of the Distributed Network

- Provide information to support research planning
  - Background rates
  - Assess assumptions about relevant populations
  - Prioritize research domains
- Answer specific research questions
- Identify sites for participation in prospective interventional or observational studies

## **Currently Available Data**

- Research ready data sets representing >90% of the FDA Sentinel program
- > 300 million person-years of observation time and detailed information for billions of medical encounters and outpatient pharmacy dispensings

# Unique Individuals by Age Range



## **Data Elements**

### Captured

- Ambulatory care diagnoses and procedures
- Outpatient pharmacy dispensing
- Laboratory testing and selected test results
- Inpatient diagnoses, treatments and procedures itemized in hospital bill
- Not captured
  - Out of hospital death
  - Over-the-counter medication
  - Community-based immunizations

## Data Model

#### Administrative **Enrollment** Demographic **Dispensing Diagnosis Procedure Encounter** Person ID Person ID Person ID Person ID Person ID Person ID Enrollment start & end dates Birth date Dispensing date Dates of service Date Dates of service Drug coverage Sex National drug code (NDC) Principal diagnosis flag Provider seen Procedure code & type Medical coverage Race Days supply Type of encounter Encounter type & provider Encounter type & provider Medical record availability ZIP code Amount dispensed Facility Diagnosis code & type **Encounter ID** Etc. Etc. Etc.

Clinical Data Elements					
Lab Result	Vital Signs				
Person ID	Person ID				
Dates of order, collection & result	Date & time of measurement				
Test type, immediacy & location	Height and weight				
Procedure code & type	Diastolic & systolic BP				
Test result & unit	Tobacco use & type				
Etc.	Etc.				

Death Information					
Cause of Death					
Person ID					
Cause of death					
Source					
Confidence					
Etc.					

Registry
State Vaccine
Person ID
Provider
Admission Type
Vaccine Code
Vaccine Code Type
Etc.

Some data partners do not create every table (e.g., vital signs are available for only a subset of individuals)

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  - Counts, exposure-outcome relationships, confounder adjusted comparative cohort analyses

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  - Birth registry, death registry, etc

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- Hard: Requires investigation or mapping of existing data
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- Harder: New data is needed
  - Birth registry, death registry, etc
- Impossible: The data isn't reliably captured
  - Race, smoking status, over the counter medication use

# Where does the question fall on the continuum

- The DRN Coordinating Center helps requesters or their designees understand and use the network
- Assess fit between requests and the DRN's capabilities
- Suggest ways to maximize usefulness of the DRN data resources
- Facilitate engagement with data partners
- Requesters do not have to be experts in observational research or use of health care data to initiate a request

# Easy Example: Simple Counts

- Query goals
  - Counts of patients with Progressive Multifocal Leukoencephalopathy (PML)
- Analysis
  - Number of patients and prevalence rate of PML identified in inpatient setting
  - Counts provided per patient per year, age group, and sex

# Easy Example: Simple Counts

Result: In 2012, there were 87 individuals identified

# Prevalence of Progressive Multifocal Leukoencephalopathy in 2012

Age (years)	Males	Prevalence per 10,000	Females	Prevalence per 10,000
0-21	1	0.01	0	0
22-44	16	0.14	8	0.07
45-64	29	0.31	18	0.18
65+	6	0.16	9	0.20

# Easy Example: Cohort Identification and Descriptive Analysis

- Query goals
  - Patients continuously exposed to bisphosphonates for <u>></u>3 years
  - Assess the risk of hip and other fractures

### Analysis

- 2006 2013
- Health plan members with medical and pharmacy coverage
- New users of alendronate, risedronate, & ibandronate
- Create treatment episodes based on repeated exposures
- Identify fractures during or shortly after treatment
- Sensitivity analyses examined different exposure, event, and episode definitions (n=78 analyses)

# Easy Example: Cohort Identification and Descriptive Analysis

### **Results**

- ~34,000 new users
- ~22,000 <u>current</u> alendronate users exposed for 3 5 years
- ~9,000 people enter this cohort each year

### Fractures in long term alendronate users\*

Fracture type	Exposed people	Person time (yrs)	Fractures	Rate / 10K yrs
Нір	34,428	138,386	725	52
Femoral fractures of interest	34,672	140,020	339	24

<sup>\*</sup> New users of alendronate, continuously exposed for at least 3 years

# Easy Example: Propensity score matched comparison

- Query goals
  - What is the comparative risk of angioedema among new users of ACE inhibitors vs. new users of beta-blockers?
- Analysis
  - Propensity score matched survival analysis
  - Performed via reusable modular program requiring only specification of input parameters

## Easy Example: Propensity score matched comparison

### Input parameters

- Population (age/sex/etc.), time period
- Exposures
- Outcomes
  - ICD-9-CM code 995.1 in any position during outpatient, inpatient, or emergency department encounter
  - Washout period (days before first dispensing): 183 days
- Inclusion criteria
- Exclusion criteria
- Covariates
- Propensity score matching options
  - Comorbidity, utilization, high dimensional propensity score
  - Matching ratio
  - Caliper size

# Angioedema: Table 1. Unmatched Cohort

		Primary	Covariate Balance				
haracteristic	ACE Inf	nibitors	Beta Bl	ockers			
					Absolute	Standardized	
	N	%	N	%	Difference	Difference	
Patients	2,211,215	100%	1,673,682	100%	0.0	-	
Events while on therapy	5,158	0.2%	1,292	0.1%	0.1	0.0	
Person-time at risk (days)	186.9	266.6	149.2	235.1	37.7	0.2	
atient Characteristics							
Gender (F)	997,962	45.10%	946,344	56.50%	-11.4	-0.2	
Mean age (std dev)	54.6	12.7	53.7	15.6	0.9	0.1	
lecorded History of:							
Allergic reactions	207,344	9.4%	190,387	11.4%	-2.0	-0.1	
Diabetes	471,661	21.3%	173,083	10.3%	11.0	0.3	
Heart failure	41,060	1.9%	74,897	4.5%	-2.6	-0.1	
Ischemic heart diseases	109,948	5.0%	224,681	13.4%	-8.4	-0.3	
NSAID use	318,298	14.4%	250,697	15.0%	-0.6	0.0	
ealth Service Utilization Intensity:	Mean	Std Dev	Mean	Std Dev			
Number of generics	3.4	3.5	4.1	4.0	-0.7	-0.2	
Number of filled prescriptions	7.5	9.6	8.9	10.8	-1.4	-0.1	
Number of inpatient hospital							
encounters (IP)	0.1	0.4	0.2	0.6	-0.1	-0.3	
Number of non-acute							
institutional encounters (IS)	0.0	0.6	0.1	0.9	-0.1	-0.1	
Number of emergency room							
encounters (ED)	0.2	0.7	0.4	1.0	-0.2	-0.2	
Number of ambulatory							
encounters (AV)	4.8	6.3	6.9	8.4	-2.1	-0.3	
Number of other ambulatory							
encounters (OA)	1.1	2.6	1.5	3.6	-0.4	-0.1	

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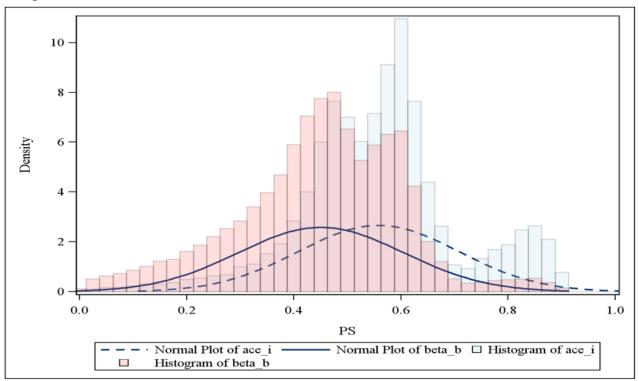
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Number of generics	3.4	3.5	Dia	nerez		ZI/0 VS
Number of filled prescriptions	7.5	9.6	Нез	rt failu	ro	2% vs
Number of inpatient hospital			1100	ii c iaiiai		2/0 43
encounters (IP)	0.1	0.4	Isch	emic he	eart disea	se 5% vs
Number of non-acute			150			
institutional encounters (IS)	0.0	0.6	0.1	0.9	-0.1	-0.1
Number of emergency room						
encounters (ED)	0.2	0.7	0.4	1.0	-0.2	-0.2
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## **Propensity Scores Before Match**

#### Histograms of PS distribution by DP (masked)

Histogram of Predefined PS, Unmatched Cohort C-Stat for Predefined: 0.695



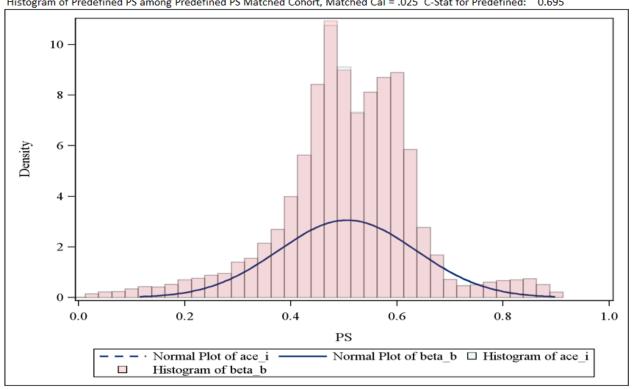
# Angioedema: Table 2. Matched Cohort

		Primary	Analysis		Covaria	ite Balance	
	ACE Inh	ibitors	Beta Bl	ockers			
2.6 million new users	N	%	N	%	Absolute Difference	Standardized Difference	
Patients	1,309,104	59.2%	1,309,104	78.2%	0.0	-0.4	_
Events while on therapy	3,311	0.3%	988	0.1%	0.2	0.0	
Person-time at risk (days)	183.8	263.7	151.8	238.9	31.9	0.1	
ent Characteristics							
Gender (F)	723,955	55.3%	689,617	52.7%	2.6	0.1	
Mean age (std dev)	54.1	13.1	54.4	14.9	-0.3	0.0	
rded History of:							
Allergic reactions	137,920	10.5%	134,933	10.3%	0.2	0.0	
Diabetes	150,036	11.5%	150,551	11.5%	0.0	0.0	
Heart failure	35,302	2.7%	38,966	3.0%	-0.3	0.0	
Ischemic heart diseases	102,200	7.8%	106,786	8.2%	-0.4	0.0	
NSAID use	191,798	7%	189,612	14.5%	0.2	0.0	
th Service Utilization Intensity:	Mean	Sta	Diab	otos		10% vs 1	100
Number of generics	3.7	3.7%	Diab	eles		TO 10 A2 T	LU
Number of filled prescriptions	8.1	10.2%	Hear	rt failur	е	3% vs	3
Number of inpatient hospital							
encounters (IP)	0.1	0.5%	Ische	emic he	art diseas	se 8% vs	8
Number of non-acute							
institutional encounters (IS)	0.1	0.7%	0.1	0.7%	0.0	0.0	
Number of emergency room							
encounters (ED)	0.3	0.8%	0.3	0.8%	0.0	0.0	
Number of ambulatory							
encounters (AV)	5.6	7.3%	5.6	6.6%	0.0	0.0	
Number of other ambulatory							
encounters (OA)	1.2	2.9%	1.3	3.0%	0.0	0.0	

# **Propensity Scores After Match**

#### Histograms of PS distribution by DP (masked)

Histogram of Predefined PS among Predefined PS Matched Cohort, Matched Cal = .025 C-Stat for Predefined: 0.695



# Angioedema: Table 3. Results

Table 3: Sequen	tial Estimates	for Angioede	ema Events by A	nalysis Type, ar	nd Drug Pair
-				Average	
Exposure	Monitoring		Person Years	Person Years	Number of
Definition	Period	New Users	at Risk	at Risk	Events
Unmatched Analy	ysis (Site-adjus	sted only)			
ACE Inhibitors	1	2,211,215	1,131,526	0.51	5,158
Beta Blockers	_	1,673,682	683,614	0.41	1,292
1:1 Matched Analy	ysis; Caliper=0.	.025			
ACE Inhibitors	1	1,309,104	658,700	0.50	3,311
Beta Blockers	-	1,309,104	544,285	0.42	988

Incidence Rate per 1000 Person Years	Risk per 1000 New Users	Difference per 1000 Person Years	Difference in Risk per 1000 New Users	Hazard Ratio (95% CI)	Wald P-Value
4.558	2.33	2.67	1.56	2 55 ( 2.40 2.71)	z 0001
1.890	0.77	2.07	1.50	2.55 ( 2.40, 2.71)	<.0001
5.027	2.53	2.21	4.77	244/205 244	4 0001
1.815	0.75	3.21	1.77	3.14 ( 2.86, 3.44)	<.0001

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ACEI vs β-blocker 1:1 matched analysis:

• **HR = 3.1** (95% CI, 2.9-3.4)

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 Plan to replicate the TACT trial – EDTA chelation to prevent coronary heart disease – focusing on diabetic patients

#### Inclusion criteria

- > 50 years old
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- Previous myocardial infarction

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EASY: All inclusion criteria are available for querying using existing cohort identification programs

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- Heart failure or heart failure hospitalization
  - EASY: Available
- No chelation therapy in prior 5 years
  - Probably EASY: Need to assess data capture reliability and payment policies

 Question: What are the demographic characteristics of patients that might be eligible – race, gender, age? What about comorbidities?

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  - EASY: Age, sex, and comorbidities can be defined and presented

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  - <u>EASY:</u> Age, sex, and comorbidities can be defined and presented
  - <u>IMPOSSIBLE</u>: Race is recorded for a subset of patients

 Question: What can you tell us about where patients who meet these criteria receive most of their care – primary care offices, cardiology offices, endocrinology clinics?
 Does this vary in urban, suburban, more rural communities?

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 What can you tell us about the uncertainties in these estimates?

- What can you tell us about the uncertainties in these estimates?
  - Suggest using sensitivity analyses to assess importance of each definition

Request: Characterize rate of follow-up of abnormal cancer screening tests, including mammography, fecal immunochemical (FIT), or Pap tests within a managed care population

 Identification of benefit design – to define "managed care" – is possible but complex

- Identification of benefit design to define "managed care" – is possible but complex
  - Assessment of complexity and validity over time is needed
  - Definition of "managed care"

- 1. How many are screened for each cancer?
- 2. How many have abnormal screening test results?
- 3. How many abnormal results appear to have no further testing?
  - a. For mammography no additional mammography, ultrasound, MRI or biopsy with 90 days
  - b. For FIT no colonoscopy within 90 days
  - c. For PAP no repeat PAP that is normal, or no colposcopy within 90 days
- 4. Is there other evidence of evaluation of the abnormality?

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- 4. Is there other evidence of evaluation of the abnormality?

EASY: Questions 1-4 can be answered using existing data and programs

5. Does the rate of follow up of abnormal test results vary across practices?

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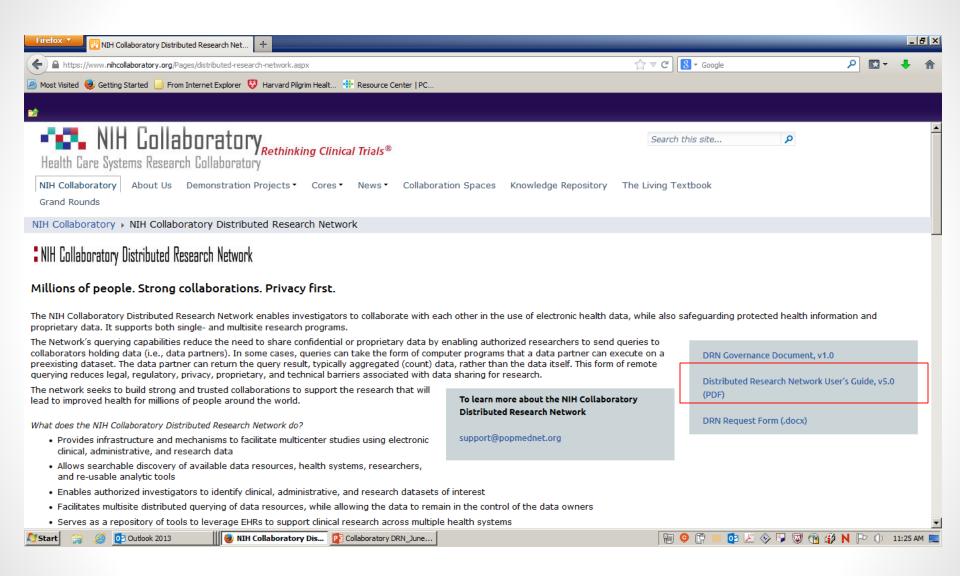
What are the race and age breakdowns of patients?

- EASY: Age distribution
- IMPOSSIBLE: Race

### How to Use the NIH Collaboratory Distributed Research Network

- Data Partners participate on a project-by-project-basis
- Submit requests using the <u>NIH Collaboratory DRN request form</u>
- The DRN Coordinating Center reviews each request to assess appropriateness and level of effort
- Costs: on a case-by-case basis

#### https://www.nihcollaboratory.org/Pages/distributed-research-network.aspx



Thank you!