## Thinking Globally While Acting Locally: Developing Time-on-treatment Data in International Settings

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### Disclosures

- I have no conflicts to disclose.
- I receive funding from the U.S. Food and Drug Administration under HHSF223201400030I.

Acknowledgements: We would like to acknowledge all the Data Partners that contributed data.

### Sentinel is a Distributed Data Network

#### Data Partners (DPs) hold data in Common Data Model format: - Enrollment - Demographics Sentinel - Medical Utilization Operations - Pharmacy Prescriptions Center (SOC) - Diagnoses - Procedures **Queries Distributed to** - Laboratory Tests Data Partners (DPs) - Vital Signs **Query Results Reviewed** DP and Returned to SOC DP DP DP DP DP 2 3 (all direct identifiers removed) 1 4 5 6 DP DP DP DP DP DP 12 7 8 9 10 11 DP DP DP DP DP DP 13 14 15 16 17 18



### Available Data Elements

	Clinical Data						
Enrollment	Demographic	Dispensing	Encounter	Diagnosis	Procedure	Lab Result	Vital Signs
Patient ID	Patient ID	Patient ID	Patient ID	Patient ID	Patient ID	Patient ID	Patient ID
Enrollment Start &	Birth Date	Dispensing Date	Service Date(s)			Measurement Date	
End Dates	Sex	National Drug Code	Encounter ID	Encounter ID	Encounter ID	Collection Dates	& Time
Drug Coverage	Zip Code (NDC)	(NDC)	Encounter Type and	Encounter Type and	Encounter Type and	Test Type,	Height & Weight
Medical Coverage	Etc.	Days Supply	Provider	Provider	Provider	Immediacy & Location	Diastolic & Systolic
Medical Record		Amount Dispensed	Facility	Diagnosis Code &	Procedure Code &	Logical Observation	BP
Availability			Etc.	Туре	Туре	Identifiers Names	Tobacco Use & Type
				Principal Discharge	Etc.	and Codes (LOINC $^{\textcircled{B}}$ )	Etc.
				Diagnosis		Etc.	

Registry Data			Inpatie	nt Data	Mother-Infant Linkage Data	
Death	Cause of Death	State Vaccine	Inpatient Pharmacy	Inpatient Transfusion	Mother-Infant Linkage	
Patient ID	Patient ID	Patient ID	Patient ID	Patient ID	Mother ID	
Death Date	Cause of Death	Vaccination Date	Administration Date &	Administration Start &	Mother Birth Date	
Source	Source	Admission Date	Time	End Date & Time	Encounter ID & Type	
Confidence	Confidence	Vaccine Code & Type	Encounter ID	Encounter ID	Admission & Discharge Date	
Etc.	Etc.	Provider	National Drug Code (NDC)	Transfusion Administration ID	Child ID	
		Etc.	Route	Transfusion Product	Child Birth Date	
			Dose	Code	Mother-Infant Match Method	
			Etc.	Blood Type	Etc.	

Etc.

### Single Patient Example Data in Model

Υ

PatID1

PATID

PatID1

EncID1

COD

J18.0

	DEMOGRAPHIC								
PATID	BIRTH_DATE	SEX	HISPANIC		RACE	zip			
PatID1	2/2/2	1964 F	Ν			5	32818		
	DISPENSING								
PATID	RXDATE	NDC		RXS	UP	RXAM	т		
PatID1	10/14/20	05 0000607	74031		30		30		
PatID1	10/14/20	05 0018509	94098		30		30		
PatID1	10/17/20	05 0037803	15210		30		45		
PatID1	10/17/20	05 5409203	39101		30		30		
PatID1	10/21/20	05 0017307	73001		30		30		
PatID1	10/21/20	05 4988407	74311		30		30		
PatID1	10/21/20	05 5817702	26408		30		60		
PatID1	10/22/20	05 0009372	20656		30		30		
PatID1	10/23/20	05 0031002	27510		30		15		
ENROLLMENT									
PATID E	NR_START	ENR_END	MEDO	ov	DRU	IGCOV	/		
PatID1	7/1/2004	12/31	/2004 Y		N				

DEATH								
PATID	DEATHDT	DTIMPUTE	SOURCE	CONFIDENCE				
PatID1	12/27/2005	Ν	S	E				

12/31/2005 Y

1/1/2005

PatID1

ENCOUNTER									
PATID	ENCOUNTERID	ADA	TE	DDATI	E	ENCTY	'PE		
PatID1	EncID1		10/18/2	005	10/2	0/2005 IP			
	DIAGNOSIS								
PATID	ENCOUNTERID				DX	DX CODETYP	E PDX		
PatID1	EnclD1	10/18/2005	Provider1 IP		296.2	-	9 P		
PatID1	EnclD1	10/18/2005	Provider1 IP		300.02		9 S		
PatID1	EncID1	10/18/2005	Provider1 IP		305.6		9 S		
PatID1	EncID1	10/18/2005	Provider1 IP		311		9 P		
PatID1	EncID1	10/18/2005	Provider1 IP		401.9		9 S		
PatID1	EncID1	10/18/2005	Provider1 IP		493.9		9 S		
PatID1	EnclD1	10/18/2005	Provider1 IP		715.9		9 S		
PROCEDURE									
PATID	ENCOUNTERID	ADATE	PROVIDER	ENCTYPE	E PX	PX_COD	ETYPE		
PatID1	EnclD1	10/18/200	5 Provide	r1 IP	8	34443 C4			
PatID1	EnclD1	10/18/200	5 Provide	r1 IP	9	9222 C4			
PatID1	EnclD1	10/18/200	5 Provide	r1 IP	9	99238 C4			

10/18/2005

CODETYPE

10

Provider2 IP

SOURCE

S

**CAUSE OF DEATH** 

CAUSETYPE

U

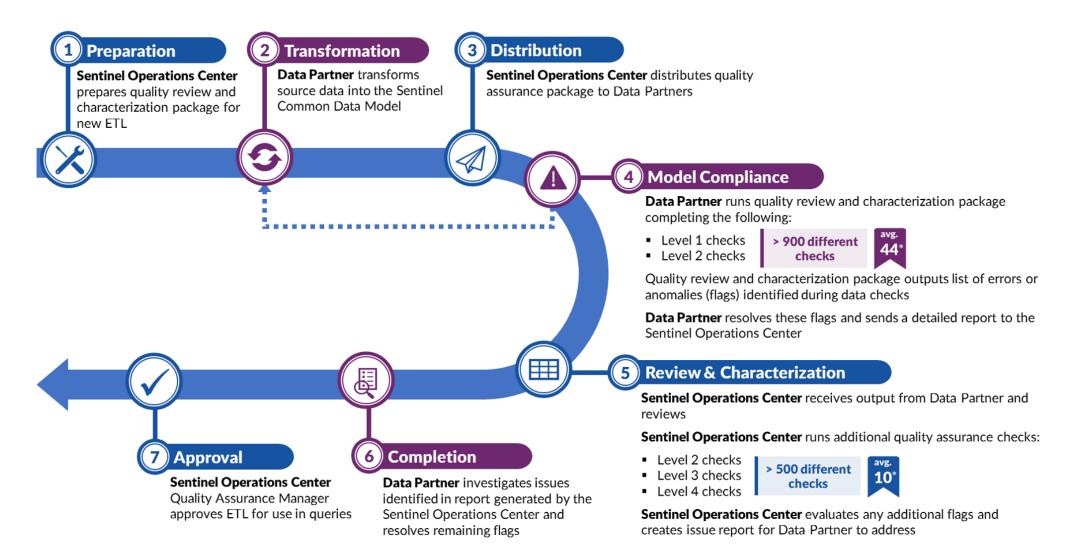
Sentinel Initiative   5
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27445 C4

Е

CONFIDENCE

### Data Quality Review and Characterization Process



\* On average, there are 44 flags identified by the program and 10 additional flags identified by the Sentinel Operations Center per ETL

### Sentinel Data Philosophy

- Includes claims, electronic health record (EHR), and registry data and flexible enough to accommodate new data domains (e.g., free text).
  - Typically, we do not include empty tables we expand as needed when fit for purpose.
- Data are stored at most granular/raw level possible with minimal mapping.
  - Distinct data types should be kept separate (e.g., prescriptions, dispensings)
  - Construction of medical concepts (e.g., outcome algorithms) from these elemental data is a project-specific design choice.
  - Sentinel stores these algorithms in a library for future use.
- Appropriate use and interpretation of local data requires the Data Partners' local knowledge and data expertise.
  - Not all tables are populated by all Data Partners  $\rightarrow$  site-specificity is allowed.
- Designed to meet FDA needs for analytic flexibility, transparency, and control.

## Piloting "North American" Distributed Data Networks



Administrative Data								
Enrollment	Demographic	Dispensing	Encounter	Diagnosis	Procedure	Death		
Patient ID	Patient ID	Patient ID	Patient ID	Patient ID	Patient ID	Patient ID		
Enrollment Start &	Birth Date	Dispensing Date	Service Date(s)	Service Date(s)	Service Date(s)	Death Date		
End Dates	Sex	Dispensing Code	Encounter ID	Encounter ID	Encounter ID	Source		
Drug Coverage	Zip Code	and Type	Encounter Type and	Encounter Type and	Encounter Type and	Confidence		
Medical Coverage	Etc.	Days Supply	Provider	Provider	Provider	Etc.		
Medical Record		Amount Dispensed	Facility	Diagnosis Code &	Procedure Code &			
Availability				Туре	Туре			
				Principal Discharge Diagnosis	Etc.			

### **Comparative Advantages: Longer Follow-Up Time**

https://www.sentinelinitiative.org/sentinel/data/distributed-database-common-data-model

### CNODES Common Data Model Pilot Project

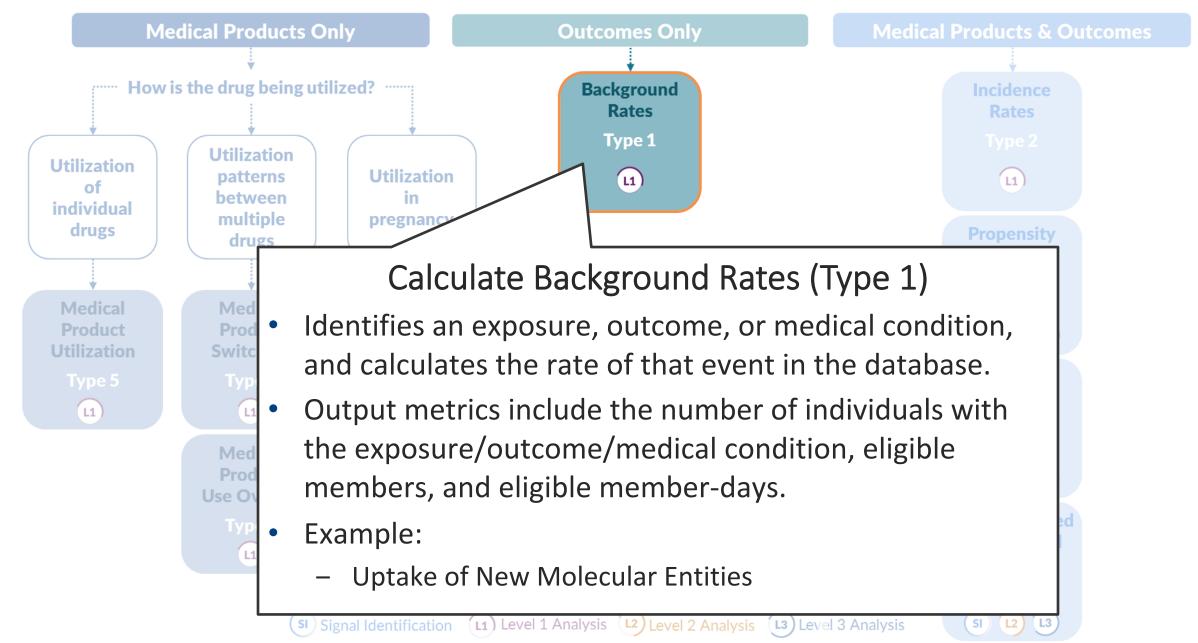
- Four Provinces (Saskatchewan, Manitoba, Ontario, Nova Scotia)
- Converted Administrative Data Tables and Death Table
  - Four quality assurance packages run at individual provinces; all passed
- Ready for querying using standard tools
  - One demonstration query looked at uptake of New Molecular Entities (NMEs) approved in 2015 in Canada
  - Equivalent queries were run in the Sentinel Distributed Database for other NME cohort years

### Active Risk Identification and Analysis (ARIA)

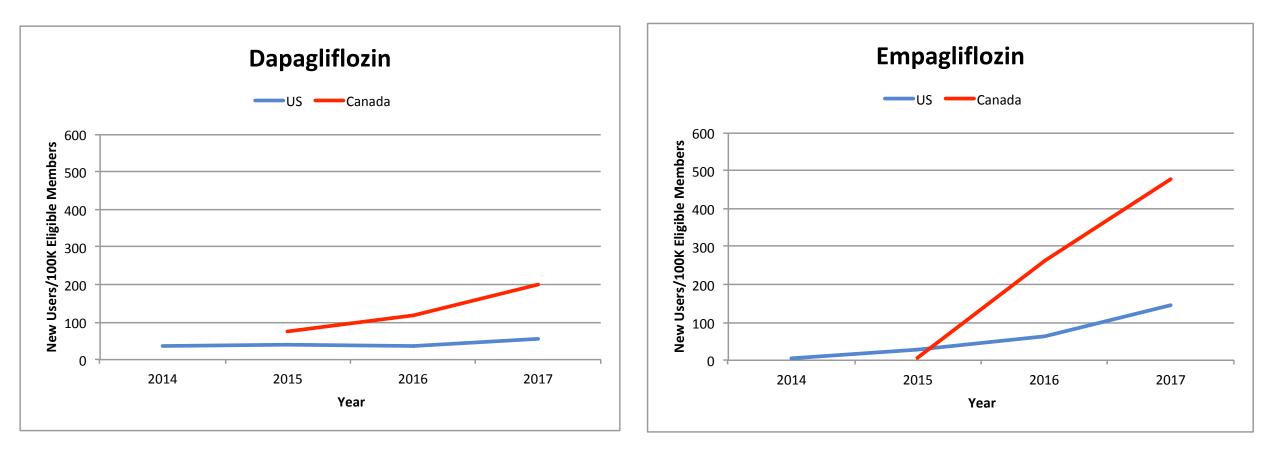


- Template computer programs with standardized questions
- Parameterized at program execution
- Pre-tested and quality-checked
- Standard output

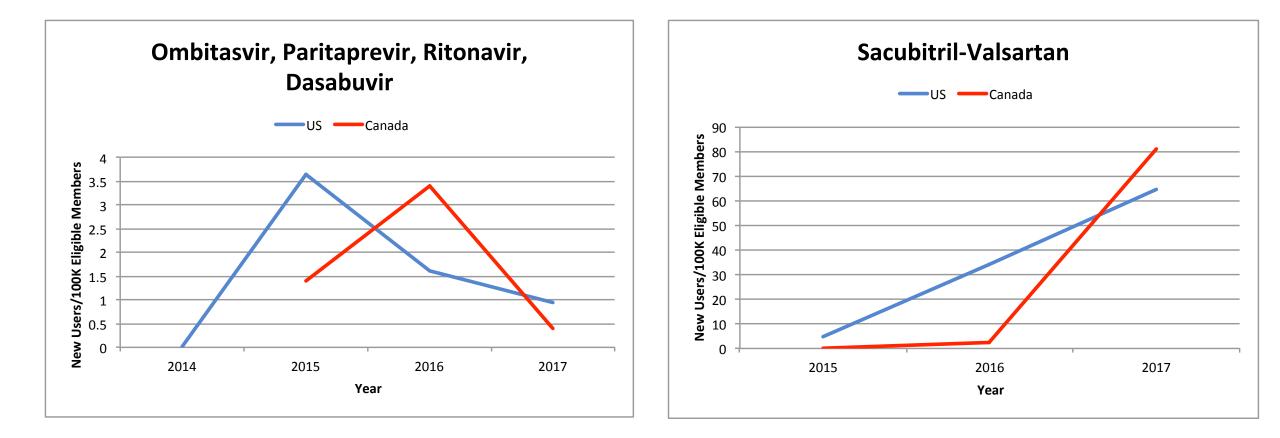
#### What are you investigating?



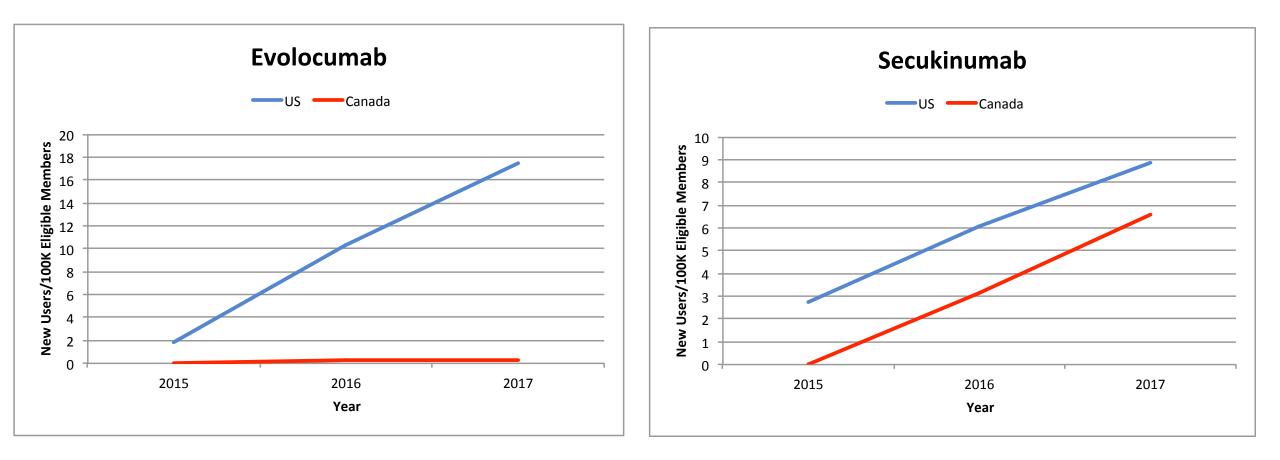
### 2015 New Molecular Entities – High Prevalence Medicines



### 2015 New Molecular Entities – High Cost Medications

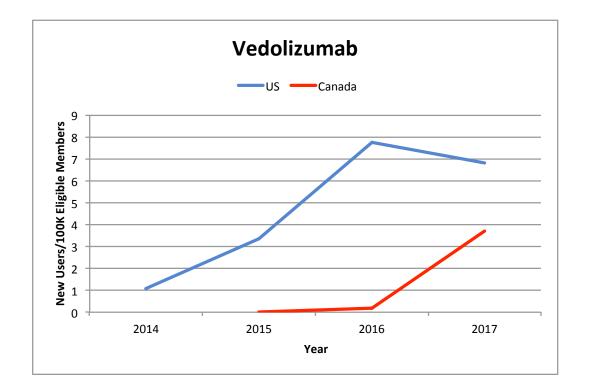


### 2015 New Molecular Entities – Injectables



### 2015 New Molecular Entities – Administered Medicines

- Medicines Not Well Captured in Canadian Data
  - Checkpoint Inhibitors (e.g., pembrolizumab, nivolumab)
  - Selected Oncology Drugs (e.g., ramucirumab)



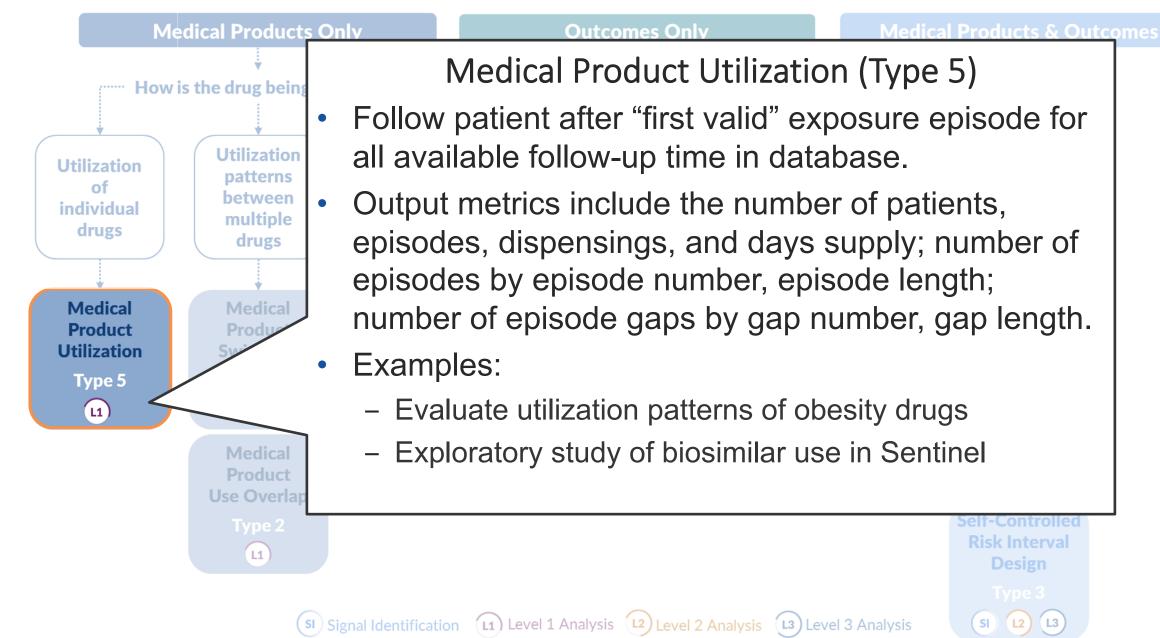
## Simple Proof-of-Concept Prescribing Table for CPRD

Patient IDPatient IDPatient IDPatient IDPatient IDPatient IDPatient IDEnrollment Start & End DatesBirth DatePrescription DateService Date(s)Service Date(s)Service Date(s)Service Date(s)Drug CoverageSexPrescribing Code & TypePrescribing Code & TypeEncounter IDEncounter IDEncounter IDMedical CoverageEtc.Days SupplyDays SupplyEncounter Type and ProviderEncounter Type and ProviderProcedure of TypeMedical Record AvailabilityAmount PrescribedFacilityDiagnosis Code & TypeProcedure of Type	Administrative Data									
Enrollment Start & End Dates     Birth Date     Prescription Date     Service Date(s)     Service Date(s)     Service Date(s)       Drug Coverage     Sex     Prescription Date     Encounter ID     Encounter ID     Encounter ID       Medical Coverage     Etc.     Days Supply     Days Supply     Facility     Diagnosis Code & Type     Procedure & Type	Enrollment	Demographic	Prescribing	Encounter	Diagnosis	Procedure				
End DatesSexPrescribing Code & TypeEncounter IDEncounter IDEncounter IDDrug CoverageZip CodeDays SupplyEncounter Type and ProviderEncounter Type and 	Patient ID	Patient ID	Patient ID	Patient ID	Patient ID	Patient ID				
SexPrescribing Code & TypeEncounter IDEncounter IDEncounter IDDrug CoverageZip CodeTypeEncounter Type and ProviderEncounter Type and ProviderMedical Record AvailabilityAmount PrescribedFacilityDiagnosis Code & TypeProcedure G Type	Enrollment Start &	Birth Date	Prescription Date	Service Date(s)	Service Date(s)	Service Date(s)				
Medical Coverage     Etc.     Days Supply     Encounter Type and Provider       Medical Record Availability     Etc.     Amount Prescribed     Facility     Diagnosis Code & Type     Procedure of Type	End Dates	Sex	Prescribing Code &	Encounter ID	Encounter ID	Encounter ID				
Medical Record Availability     Amount Prescribed     Facility     Diagnosis Code & Type     Procedure ( Type)	Drug Coverage	Zip Code	Туре	Encounter Type and	Encounter Type and	Encounter Type an				
Availability Etc. Type Type	Medical Coverage	Etc.	Days Supply	Provider	Provider	Provider				
Etc.			Amount Prescribed	Facility	•	Procedure Code &				
Dringing Discharge Etc.	Availability			Etc.	Туре	Туре				
Diagnosis					Principal Discharge	Etc.				

UK data driving real-world evidence

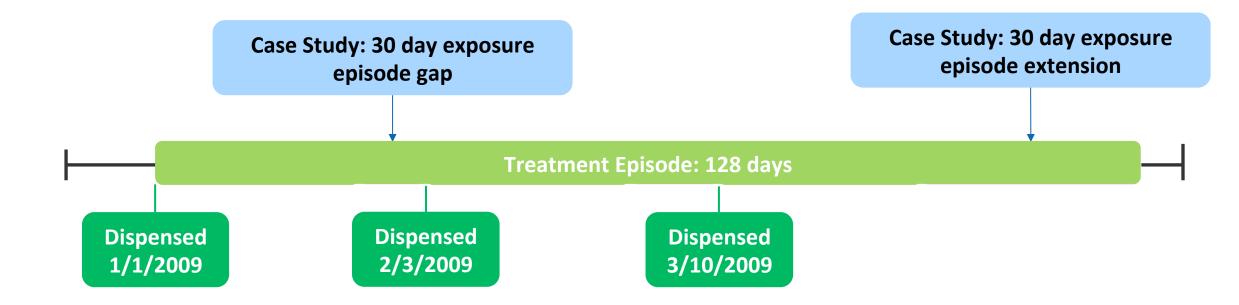
### **Comparative Advantages: Longer Follow-up Time, General Practitioner Intent**

What are you investigating?

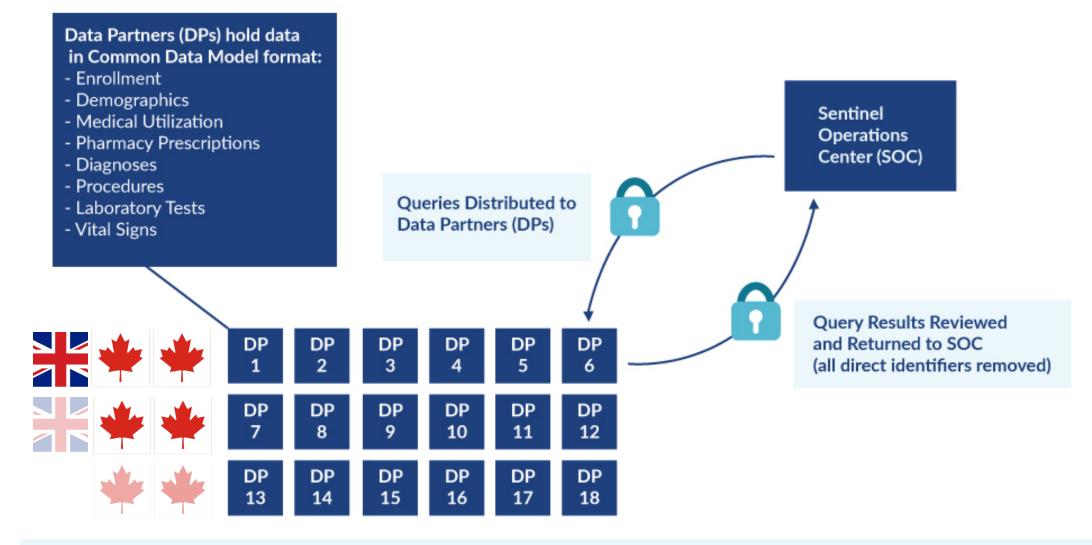


### Developing Time-on-Treatment using Sentinel Tools

- 1. Stockpiling is used to evaluate early refilling behavior, same day dispensings
- 2. Gaps are bridged to deal with late refill behavior
- 3. Extension days are added after any episode gaps have been bridged



### Expanded Options for Sentinel as a Distributed Data Network



#### Quality-Checked Query-Ready Datasets (Solid) Planned, not yet QC'd Datasets (Transparent)



### Generating Country-Stratified Time-On-Treatment Information

- Appropriate to use different measurement parameters based on national practice patterns?
  - Treatment of Overlapping Days Supply, Gaps in Continuous Coverage, etc.
- Analysis techniques to evaluate heterogeneous availability of medications, perhaps to special populations
  - Local, site-specific knowledge is key to successful analysis
  - Methods other than restriction and country-stratification?

## Questions?

info@sentinelsystem.org

CANADIAN NETWORK FOR OBSERVATIONAL DRUG EFFECT STUDIES (CNODES)

## Heterogeneity in Drug Data and its Impact in Multi-database Drug Safety Networks: The CNODES Experience

Kristian B. Filion, PhD

Associate Professor and William Dawson Scholar Departments of Medicine and of Epidemiology, Biostatistics, and Occupational Health McGill University



### **Disclosures**

- Salary support award from the Fonds de recherche Québec santé (FRQS; Quebec Foundation for Health Research)
- William Dawson Scholar award from McGill University
- Research grants from Canadian Institutes of Health Research
- No conflicts to disclose



## **CNODES** funding and investigators

Canadian Network for Observational Drug Effect Studies (CNODES), a collaborating center of the Drug Safety and Effectiveness Network (DSEN), is funded by the Canadian Institutes of Health Research (CIHR, Grant #DSE – 146021).

CNODES INVESTIGATORS						
Executive:	Samy Suissa (NPI*), Robert Platt					
British Columbia:	Colin Dormuth					
Alberta:	Brenda Hemmelgarn					
Saskatchewan:	Jacqueline Quail					
Manitoba:	Patricia Caetano, Dan Chateau					
Ontario:	David Henry, Michael Paterson					
Québec:	Jacques LeLorier					
Atlantic (NB, NL, NS, PEI):	Adrian Levy, Ingrid Sketris					
UK CPRD:	Pierre Ernst, Kristian Filion					



\*Nominated Principal Investigator

## **CNODES** at a glance

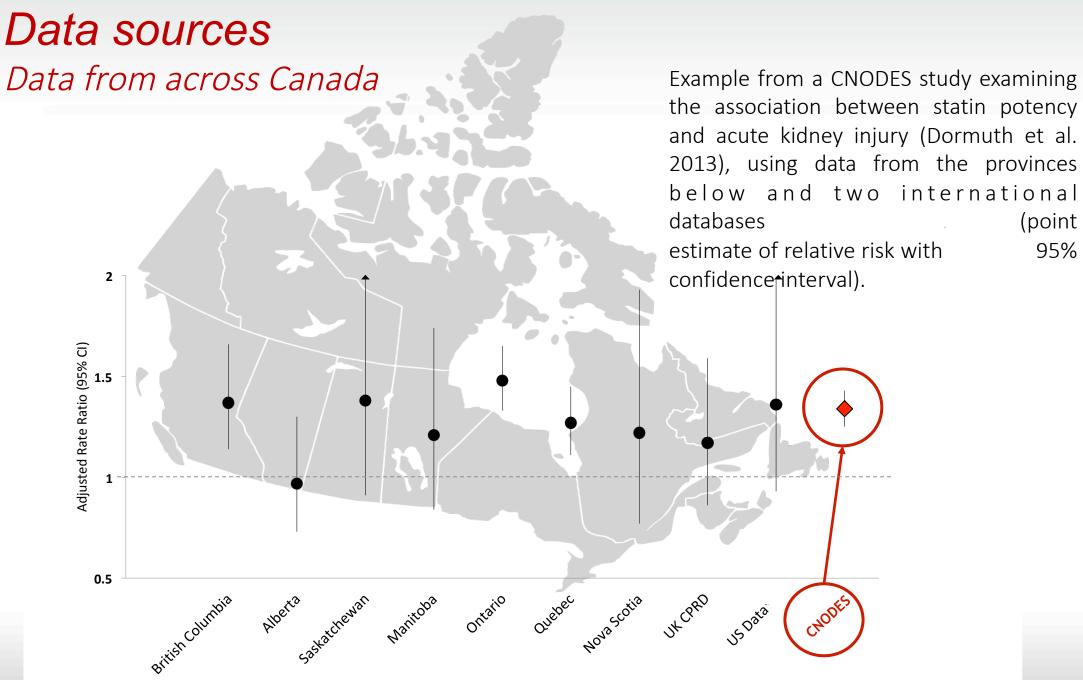
The Canadian Network for Observational Drug Effect Studies (CNODES) uses *population-based administrative* 



*healthcare data* to provide *timely responses* to queries for Canadian public stakeholders regarding drug safety and effectiveness CNODES uses:

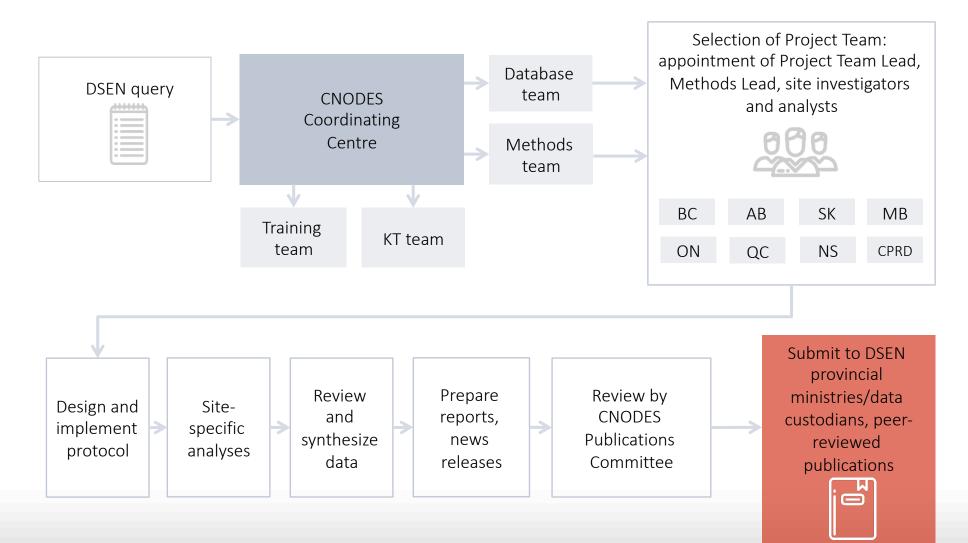
- Linked administrative data from *7 provincial* and *2 international* databases
- De-identified administrative health data of > 100 million people





## The CNODES process

From query submission to project completion and knowledge translation



## Heterogeneity in CNODES drug data

	CNODES Site	Drug data	Dispensings	Croup covered	Coding	systems			
	CNODES SITE	Drug data	captured Group covered		Drug	Class			
	Alberta <sup>1</sup>	Dispensings	All	≥18 years	DIN	WHO ATC			
(	ev challenge:								

Developing scientific protocols and statistical analysis plans that can be implemented in a reproducible manner cross sites with minimal heterogeneity while capturing the nuances of the data available at each site.

UK CPRD	Prescriptions	NA	Patients registered in a participating GP	Gemscript	British National Formulary
US MarketScan	Dispensings	Private	All	NDC	AHFS

<sup>1</sup>Alberta also has access to a second drug database capturing prescriptions for age ≥65 years (1994 onwards). <sup>2</sup>Saskatchewan also has access to a second drug database capturing all community pharmacy dispensations. Abbreviations: AHFS, American Hospital Formulary System; DIN, Drug Identification Number; GP, general practice; INN, International Non-proprietary Names; NDC, National Drug Code.



#### 

#### <sup>S</sup> Comparative safety of direct oral anticoagulants and warfarin in venous thromboembolism: multicentre, population based, observational study

Min Jun,<sup>1,2,3</sup> Lisa M Lix,<sup>4</sup> Madeleine Durand,<sup>5</sup> Matt Dahl,<sup>6</sup> J Michael Paterson,<sup>7,8,9</sup> Colin R Dormuth,<sup>10</sup> Pierre Ernst,<sup>11,12</sup> Shenzhen Yao,<sup>13</sup> Christel Renoux,<sup>11,14,15</sup> Hala Tamim,<sup>16,17</sup> Cynthia Wu,<sup>18</sup> Salaheddin M Mahmud,<sup>19</sup> Brenda R Hemmelgarn,<sup>1</sup> for the Canadian Network for Observational Drug Effect Studies (CNODES) Investigators

#### For numbered affiliations see end of article.

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Additional material is published online only. To view please visit the journal online.

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Accepted: 11 September 2017

#### ABSTRACT

#### OBJECTIVE

To determine the safety of direct oral anticoagulant (DOAC) use compared with warfarin use for the treatment of venous thromboembolism.

#### DESIGN

Retrospective matched cohort study conducted between 1 January 2009 and 31 March 2016.

#### SETTING

Community based, using healthcare data from six jurisdictions in Canada and the United States.

#### PARTICIPANTS

59 525 adults (12 489 DOAC users; 47 036 warfarin users) with a new diagnosis of venous

DOAC use. No difference was found in the risk of death (pooled hazard ratio 0.99, 0.84 to 1.16) for DOACs compared with warfarin use. There was no evidence of heterogeneity across centres, between patients with and without chronic kidney disease, across age groups, or between male and female patients.

#### CONCLUSIONS

In this analysis of adults with incident venous thromboembolism, treatment with DOACs, compared with warfarin, was not associated with an increased risk of major bleeding or all cause mortality in the first 90 days of treatment.

TRIAL REGISTRATION Clinical trials NCT02833987.



### **Methods**

### 8 databases (planned)

 Alberta, Alberta, Manitoba, Saskatchewan, Ontario, Quebec, Nova Scotia, CPRD, MarketScan

Nova Scotia: Excluded due to small number of events

### Study population

 New users of direct oral anticoagulants or warfarin in the 30 days post venous thromboembolism (VTE), matched on age, sex, calendar time, and propensity score

#### Exposure:

Intention-to-treat

### Outcomes:

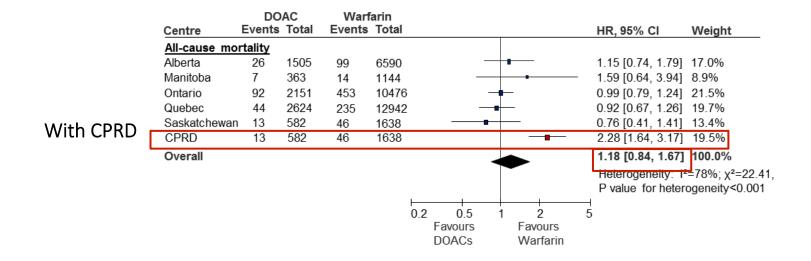
• Major bleeding and all-cause mortality within 90 days of initiation

### Statistical analysis

• Shared frailty model to account for repeat observations



## DOAC vs warfarin among VTE patients

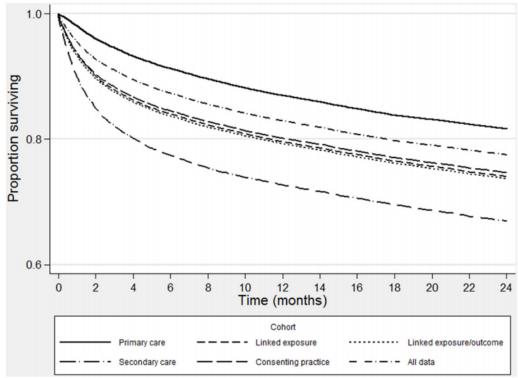


Note: MarketScan was excluded from all-cause mortality analysis due to incomplete capture of events.



## Sources of heterogeneity?

### 1. Incomplete and differential capture of VTE in CPRD Gold



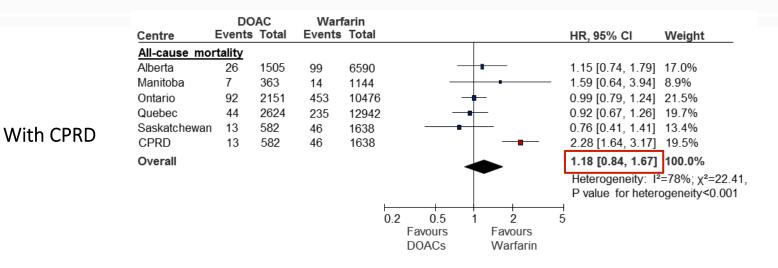
Mortality from venous thromboembolism based on CPRD data are substantially underestimated using the general practice electronic records only (selection bias)

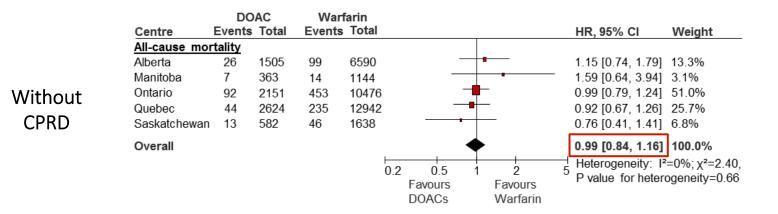
Fig 3. Mortality rate following VTE over time, by cohort.

2. Concerns regarding incomplete capture of anticoagulants among VTE patients given 30-day exposure assessment window

Gallagher et al. Plos One 2016.

## DOAC vs warfarin among VTE patients





Note: MarketScan was excluded from all-cause mortality analysis due to incomplete capture of events.



ORIGINAL ARTICLE

# Gut

### Proton pump inhibitors and the risk of hospitalisation for community-acquired pneumonia: replicated cohort studies with meta-analysis

Kristian B Filion,<sup>1</sup> Dan Chateau,<sup>2</sup> Laura E Targownik,<sup>3</sup> Andrea Gershon,<sup>4</sup> Madeleine Durand,<sup>5</sup> Hala Tamim,<sup>6</sup> Gary F Teare,<sup>7</sup> Pietro Ravani,<sup>8</sup> Pierre Ernst,<sup>1</sup> Colin R Dormuth,<sup>9</sup> the CNODES Investigators

#### ABSTRACT

► Additional material is published online only. To view please visit the journal online (http://dx.doi.org/10.1136/ gutjnl-2013-304738).

For numbered affiliations see end of article.

Correspondence to Dr Kristian B Filion, Division of Clinical Enidemiology McGill **Objective** Previous observational studies suggest that the use of proton pump inhibitors (PPIs) may increase the risk of hospitalisation for community-acquired pneumonia (HCAP). However, the potential presence of confounding and protopathic biases limits the conclusions that can be drawn from these studies. Our objective was, therefore, to examine the risk of HCAP with PPIs prescribed prophylactically in new users of non-steroidal anti-inflammatory drugs (NSAIDs).

#### Significance of this study

#### What is already known on this subject?

- Previous observational studies and their meta-analysis have found that proton pump inhibitors are associated with an increased risk of community-acquired pneumonia.
- Potential confounding by gastroesophageal



Filion et al. Gut 2014.

### **Methods**

#### 7 databases

• Alberta, Manitoba, Ontario, Quebec, Nova Scotia, CPRD, MarketScan

#### Study population

• New users of non-steroidal anti-inflammatory drugs (NSAIDs)

#### Outcome:

• Hospitalization for community-acquired pneumonia

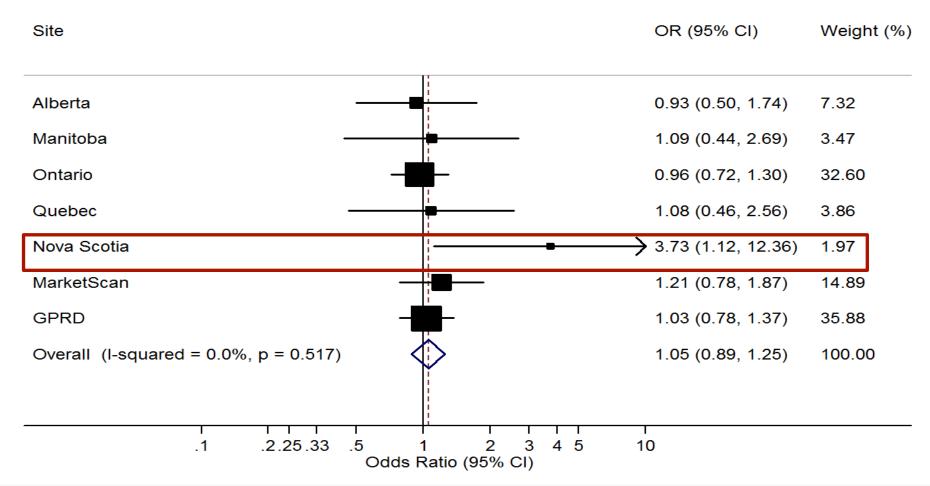
### Exposure:

• New PPI on the same day as NSAID prescription vs no PPI

### Statistical analysis

- Intention-to-treat analysis
- Follow-up = 6 months
- Logistic regression with high-dimensional propensity scores (HDPS)

### **PPIs and HCAP**





Filion et al. Gut 2014.

### Confounding by formulary restrictions: fluticasone/ salmeterol in Quebec

- Linked administrative health care data from Quebec
- Cohort of new users of fluticasone/salmeterol combination therapy
- Compared respiratory outcomes with 12 months of new user among new users from the liberal period (Sept 1999 to Sept 2003) to those of new users in the restricted period (January 2004 to October 2006)

				HR (95%CI)				
Period*	Number Number of events person ye		Crude	Age and Partially sex adjusted adjusted model <sup>†</sup>		Fully adjusted <sup>‡</sup>		
Hospitalizations for respiratory causes:								
Restricted	1020	3889	1.41 (1.32, 1.51)	1.33 (1.25, 1.42)	1.05 (0.98, 1.12)	0.78 (0.73, 0.83)		
Liberal	10 001	53 537	1.0 (Ref)	1.0 (Ref)	1.0 (Ref)	1.0 (Ref)		
Hospitalizations for any cause:								
Restricted	1248	3783	1.19 (1.12, 1.26)	1.13 (1.07, 1.20)	0.96 (0.90, 1.02)	0.82 (0.77, 0.87)		
Liberal	14 378	51 490	1.0 (Ref)	1.0 (Ref)	1.0 (Ref)	1.0 (Ref)		
All-cause mortality:								
Restricted	274	4359	1.40 (1.24, 1.59)	1.28 (1.13, 1.45)	1.10 (0.97, 1.25)	0.97 (0.84, 1.11)		
Liberal	2610	58 126	1.0 (Ref)	1.0 (Ref)	1.0 (Ref)	1.0 (Ref)		

Table 3. Hazard ratios of hospitalization for respiratory causes, hospitalization for any cause, and all-cause mortality among new users of fluticasone/ salmeterol before and after the introduction of formulary restrictions in Quebec, Canada



Filion et al. PDS 2016.

### Moving forward:

The study of SGLT2 inhibitors



### SGLT2 inhibitors provincial formulary listing



Note: SGLT2 inhibitors are not covered by the public drug plan in British Columbia.



# Comparison of publically vs privately reimbursed users in Manitoba

	DPP-4 inhibit	ors	SGLT2 inhibit	ors
	Public (n = 1,546)	Private (n = 4,059)	Public (n = 1,525)	Private (n = 5,990)
Age (years), mean ± SD	62.0 ± 13.2	57.2 ± 13.4	59.8 ± 12.0	56.8 ± 11.7
≥66 <i>,</i> n (%)	622 (40.2)	1,036 (25.6)	487 (31.9)	1,449 (24.3)
Females, n (%)	753 (48.7)	1,933 (47.6)	647 (42.4)	2,661 (44.4)
Income quintile, n (%)				
1 <sup>st</sup> (lowest)	325 (21.0)			
2 <sup>nd</sup>	336 (21.7)	1,178 (29.0)	310 (20.3)	1,288 (21.5)
3 <sup>rd</sup>	343 (22.2)	929 (22.9)	339 (22.2)	1,291 (21.6)
4 <sup>th</sup>	284 (18.4)	723 (17.8)	334 (21.9)	1,183 (19.7)
5 <sup>th</sup> (highest)	236 (15.3)	661 (16.3)	298 (19.5)	1,170 (19.5)
Missing	22 (1.4)	545 (13.4)	230 (15.1)	1,041 (17.4)

#### Calendar year of cohort entry, n (%)

2016	694 (44.9)	1,872 (46.1)	386 (25.3)	3,518 (58.7)
2017	676 (43.7)	1,740 (42.9)	855 (56.1)	1,974 (33.0)
2018	176 (11.4)	447 (11.0)	284 (18.6)	498 (8.3)

# Comparison of publically vs privately reimbursed users in Manitoba

	DPP-4 ir	nhibitors	SGLT2 ii	nhibitors
	Public	Private	Public	Private
	(n = 1,546)	(n = 4,059)	(n = 1,525)	(n = 5,990)
Diabetes duration (years), mean ± SD	11.8 ± 7.8	11.2 ± 8.0	11.5 ± 7.2	11.7 ± 7.7
Comorbidities, n (%)				
Myocardial infarction	14 (0.9)	21 (0.5)	15 (1.0)	52 (0.9)
Heart failure	10 (0.6)	25 (0.6)	12 (0.8)	25 (0.4)
Coronary artery disease	304 (19.7)	566 (13.9)	331 (21.7)	1,046 (17.5)
Dyslipidemia	392 (25.4)	859 (21.2)	406 (26.6)	1,434 (23.9)
Hypertension	1,214 (78.5)	2,712 (66.8)	1,185 (77.7)	4,241 (70.8)
Medications, n (%)				
Metformin	1,351 (87.4)	3,379 (83.2)	1,391 (91.2)	5,219 (87.1)
Sulfonylureas	1,185 (76.6)	2,740 (67.5)	1,211 (79.4)	3,646 (60.9)
Insulin	90 (5.8)	634 (15.6)	115 (7.5)	1,535 (25.6)
DPP-4 inhibitors	_	_	435 (28.5)	1,589 (26.5)
SGLT2 inhibitors	288 (18.6)	478 (11.8)	_	-
No. non-antidiabetic drugs, mean ± SD	7.6 ± 4.9	7.7 ± 5.4	$7.4 \pm 4.6$	7.3 ± 5.0

#### Conclusions

- Heterogeneity in the measurement of prescription drug data represents a key challenge to the conduct of multi-jurisdictional drug safety studies.
- CNODES has traditionally relied on *exclusion to minimize the impact* of such heterogeneity, both in terms of which sites participate in a given study and in terms of calendar time periods included in a given study.
- There remains a need to develop and apply alternative methodological approaches to address such heterogeneity. Such approaches would facilitate the triangulation of results and potential adjustment for sources of heterogeneity in the measurement of prescription drug data as we move to increasingly international collaborations across networks.



## Thank you

Visit us at www.cnodes.ca



#### kristian.filion@mcgill.ca





Medicines & Healthcare products Regulatory Agency



### Prescribing data formatted to the SCDM

Dr Achim Wolf, Senior Researcher





### Disclosures

Full-time employee of Clinical Practice Research Datalink (CPRD), a division of the UK Medicines and Healthcare products Regulatory Agency (MHRA).

Views expressed are my own and do not represent the official position of either the CPRD or the MHRA.

Honorary Researcher at the Department of Psychiatry, University of Oxford



### UK Healthcare System

The National Health Service (NHS) Launched 70 years ago Free at point of use



GPs: primary point of contact for non-emergency (93% consultations)

- 'Gatekeepers' each patient registered with one GP
- · Lifetime medical record travels with individual
- Unique NHS number for each patient



### **GP Medical Records**

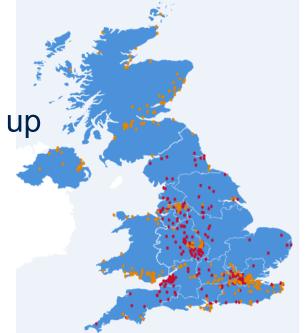
- Patient data routinely recorded onto computers
  - Patient demographics
  - Signs, symptoms and diagnoses
  - Primary care prescriptions (drugs and devices)
  - Immunisations
  - Test results
  - Referrals to specialist / secondary care
  - Feedback from other care settings
  - Lifestyle information
    - BMI, smoking, alcohol, exercise etc.





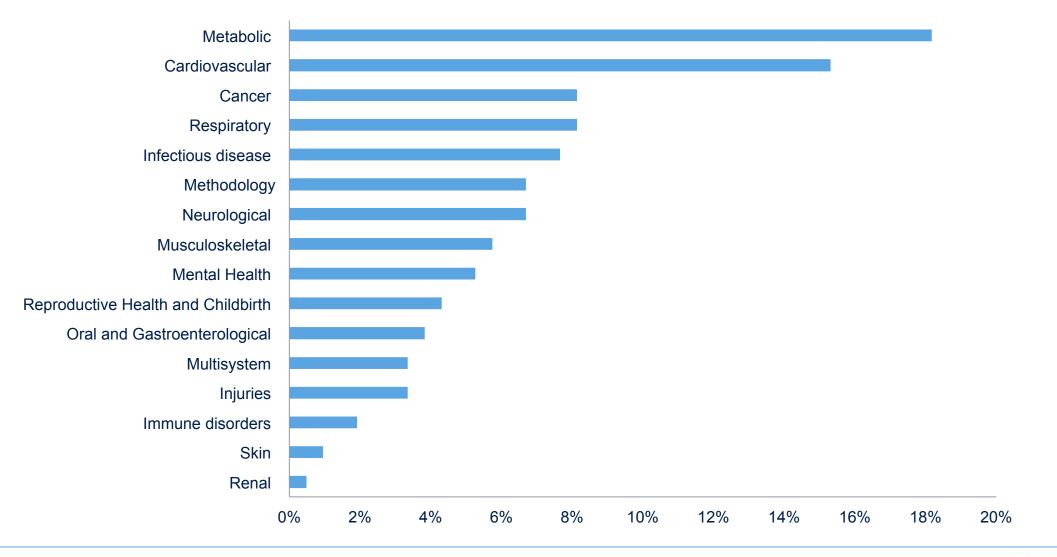
### **CPRD** Population Coverage

- Over 40 million total patient lives on CPRD databases
- 11 million currently registered patients 17% of UK population
- Near real-time data collection daily updates
- Median follow up time of 10 years some life-long follow up
- Secondary care and mortality linked data sources

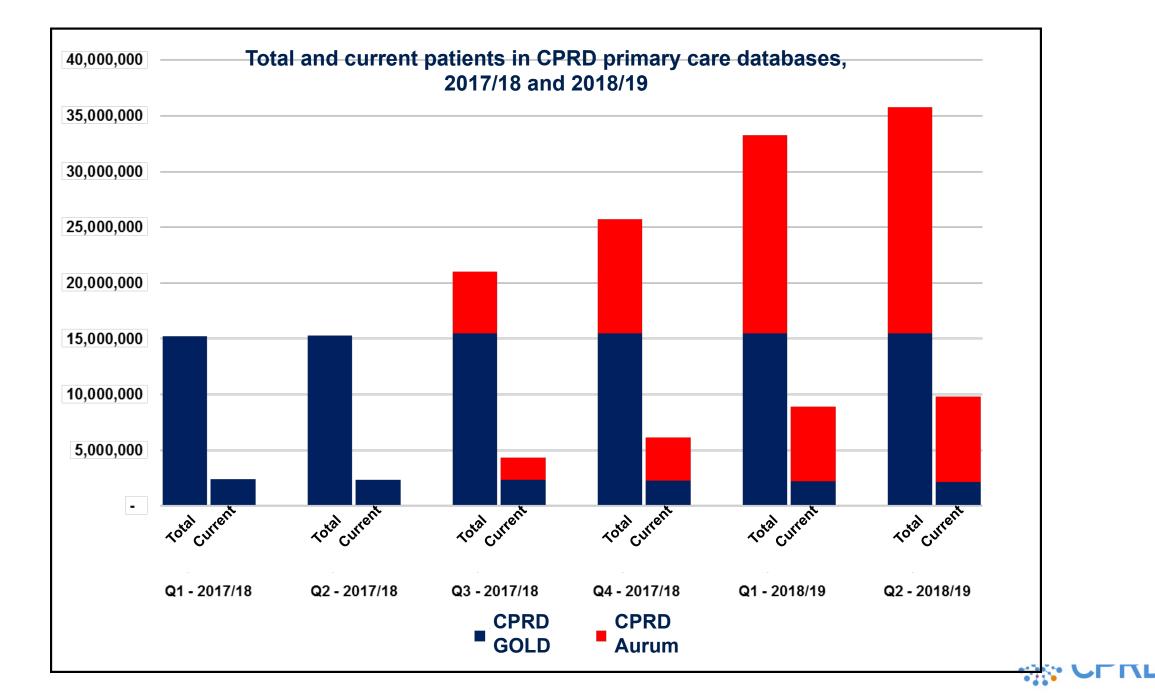




### CPRD research output by disease areas







### CPRD GOLD & CPRD Aurum

#### August 2019 figures

	CPRD GOLD	CPRD Aurum
Software system	Vision	EMIS
Patients [practices]		
All:	17.5M [840]	23.8M [895]
Current:	2.9M [347]	8.4M [863]
Linked (Set 17):	8.9M	20.1M
Follow up (y): median [lQR]		
All patients:	5.6 [2.0 - 13.2]	4.7 [1.8 – 12.0]
Current patients:	12.3 [4.5 - 24.0]	9.2 [3.4 – 20.6]
Regional distribution of current	practices (%)	
England:	100 (29%)	863 (100%)
Northern Ireland:	32 (9%)	-
Scotland:	125 (36%)	-
Wales:	90 (26%)	-



### CPRD GOLD & CPRD Aurum

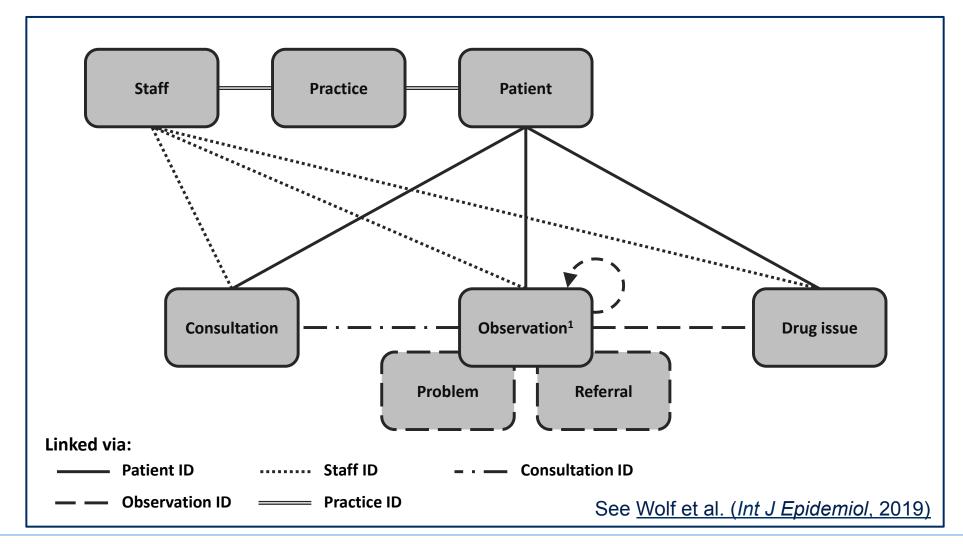
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Wales:	90 (26%)	-



### **CPRD** Aurum

Structure





		Clinical Data						
Enrollment	Demographic	Dispensing	Encour	nter	Diagnosis	Procedure	Lab Result	Vital Signs
Patient ID	Patient ID	Patient ID	Patient	t ID	Patient ID	Patient ID	Patient ID	Patient ID
Enrollment Start &	Birth date	Dispensing Date	Service D	ate(s)	Service date(s)	Service Date(s)	Result & Specimen	Measurement Date
End Dates	Sex	National Drug Code	Encount	er ID	Encounter ID	Encounter ID	Collection Dates	& Time
Drug Coverage	Zip code	(NDC)	Encounter T	ype and	Encounter Type an	d Encounter Type and	Test Type,	Height & Weight
Medical Coverage	Etc.	Days Supply	Provid	ler	Provider	Provider	Immediacy & Location	Diastolic & Systolic BP
Medical Record		Amount Dispensed	Facilit	ty	Diagnosis Code &		Logical Observation	Tobacco Use & Type
Availability			Etc.		Туре	Туре	Identifiers Names	
			Principle Discharge Diagnosis	e Etc.	and Codes (LOINC <sup>®</sup> )	Etc.		
					Diagnosis		Etc.	
	Registry D	ata			Inpatien	t Data	Mother-Infant	t Linkage Data
Death	Cause of Deat	th		Inpatie	ent Pharmacy	Inpatient Transfusion	Mother-Inf	ant Linkage
Patient ID	Patient ID			P	atient ID	Patient ID	Moth	ner ID
Death Date	Cause of Deat	h		Admini	stration Date &	Administration Start &	Mother Birth Date	
Source	Source				Time	End Date & Time	Encounter	ID & Type
Confidence	Confidence			En	counter ID	Encounter ID	Admission & [	Discharge Date
Etc.	Etc.			Nation	nal Drug Code (NDC)	Transfusion Administration ID	Chil	d ID
					Route	Transfusion Product	Child Bi	rth Date
					Code	Mother-Infant Match Method		
					Dose			

Etc.

### **CPRD / SCDM Proof Of Concept**

#### Subset of CPRD Aurum ('MVP'):

- 13 GP practices
- Ca. 500k patients (current and historic)

Utility:

- Drugs and conditions
- Procedures and diagnoses
- <u>Prescribing</u> rather than dispensing

Mapping:

• Patient data during their registration period at the practice



		Clinical Data						
Enrollment	Demographic	Dispensing	Encour	nter	Diagnosis	Procedure	Lab Result	Vital Signs
Patient ID	Patient ID	Patient ID	Patient	t ID	Patient ID	Patient ID	Patient ID	Patient ID
Enrollment Start &	Birth date	Dispensing Date	Service D	ate(s)	Service date(s)	Service Date(s)	Result & Specimen	Measurement Date
End Dates	Sex	National Drug Code	Encount	er ID	Encounter ID	Encounter ID	Collection Dates	& Time
Drug Coverage	Zip code	(NDC)	Encounter T	ype and	Encounter Type an	d Encounter Type and	Test Type,	Height & Weight
Medical Coverage	Etc.	Days Supply	Provid	ler	Provider	Provider	Immediacy & Location	Diastolic & Systolic BP
Medical Record		Amount Dispensed	Facilit	ty	Diagnosis Code &		Logical Observation	Tobacco Use & Type
Availability			Etc.		Туре	Туре	Identifiers Names	
			Principle Discharge Diagnosis	e Etc.	and Codes (LOINC <sup>®</sup> )	Etc.		
					Diagnosis		Etc.	
	Registry D	ata			Inpatien	t Data	Mother-Infant	t Linkage Data
Death	Cause of Deat	th		Inpatie	ent Pharmacy	Inpatient Transfusion	Mother-Inf	ant Linkage
Patient ID	Patient ID			P	atient ID	Patient ID	Moth	ner ID
Death Date	Cause of Deat	h		Admini	stration Date &	Administration Start &	Mother Birth Date	
Source	Source				Time	End Date & Time	Encounter	ID & Type
Confidence	Confidence			En	counter ID	Encounter ID	Admission & [	Discharge Date
Etc.	Etc.			Nation	nal Drug Code (NDC)	Transfusion Administration ID	Chil	d ID
					Route	Transfusion Product	Child Bi	rth Date
					Code	Mother-Infant Match Method		
					Dose			

Etc.

	Clinica	al Data						
Enrollment	Demographic	Dispensing	Encour	nter	Diagnosis	Procedure	Lab Result	Vital Signs
Patient ID	Patient ID	Patient ID	Patient	t ID	Patient ID	Patient ID	Patient ID	Patient ID
Enrollment Start &	Birth date	Dispensing Date	Service D	ate(s)	Service date(s)	Service Date(s)	Result & Specimen	Measurement Date
End Dates	Sex	National Drug Code	Encount	er ID	Encounter ID	Encounter ID	Collection Dates	& Time
Drug Coverage	Zip code	(NDC)	Encounter T	Type and	Encounter Type and	d Encounter Type and	Test Type, Immediacy &	Height & Weight
Medical Coverage	Etc.	Days Supply	Provid	der	Provider	Provider	Location	Diastolic & Systolic BP
Medical Record Availability		Amount Dispensed	Facili	ty	Diagnosis Code &	Procedure Code &	Logical Observation	Tobacco Use & Type
Availability			Etc.		Type	Туре	Identifiers Names	
					Principle Discharge Diagnosis	Etc.	and Codes (LOINC <sup>®</sup> )	Etc.
					5.48.0000		Etc.	
	Registry Da	ata			Inpatient	Data	Mother-Infant	t Linkage Data
Death	Cause of Deat	th		Inpatie	ent Pharmacy	Inpatient Transfusion	Mother-Inf	ant Linkage
Patient ID	Patient ID			P	Patient ID	Patient ID	Moth	ner ID
Death Date	Cause of Death	h		Admini	stration Date &	Administration Start &	Mother E	Birth Date
Source	Source				Time	End Date & Time	Encounter	ID & Type
Confidence	Confidence			En	counter ID	Encounter ID	Admission & [	Discharge Date
Etc.	Etc.			Nation	nal Drug Code (NDC)	Transfusion Administration ID	Chil	d ID
							Child Bi	rth Date
				Route	Transfusion Product Code	Mother-Infant	Match Method	
					Dose	Blood Type	Ef	
					Etc.	biood Type	L	

Etc.

		Clinica	l Data				
Enrollment	Demographic	Prescribing	Encounter	Diagnosis	Procedure	Lab Result	Vital Signs
Patient ID	Patient ID	Patient ID	Patient ID	Patient ID	Patient ID	Patient ID	Patient ID
Enrollment Start &	Birth date	Dispensing Date	Service Date(s)	Service date(s)	Service Date(s)	Result & Specimen	Measurement Date
End Dates	Sex	National Drug Code	Encounter ID	Encounter ID	Encounter ID	Collection Dates	& Time
Drug Coverage	Zip code	(NDC)	Encounter Type and	Encounter Type and	Encounter Type and	Test Type,	Height & Weight
Medical Coverage	Etc.	Days Supply	Provider	Provider	Provider	Immediacy & Location	Diastolic & Systolic
Medical Record		Amount Dispensed	Facility	Diagnosis Code &	Procedure Code &	Logical Observation	BP
Availability			Etc.	Туре	Туре	Identifiers Names	Tobacco Use & Type
			<b>_</b>	Principle Discharge	Etc.	and Codes (LOINC®)	Etc.
I				Diagnosis		Etc.	

	Registry Data							
Death	Cause of Death							
Patient ID	Patient ID							
Death Date	Cause of Death							
Source	Source							
Confidence	Confidence							
Etc.	Etc.							

		Clinical Data					
Enrollment	Demographic	Prescribing	Encounter	Diagnosis	Procedure	Lab Result	Vital Signs
Patient ID	Patient ID	Patient ID	Patient ID	Patient ID	Patient ID	Patient ID	Patient ID
Enrollment Start &	Birth date	Dispensing Date	Service Date(s)	Service date(s)	Service Date(s)	Result & Specimen	Measurement Date
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Medical Record		Amount Dispensed	Facility	Diagnosis Code &	Procedure Code &	Logical Observation	BP
Availability			Etc.	Туре	Туре	Identifiers Names	Tobacco Use & Type
			Principle Discharge	Etc.	and Codes (LOINC <sup>®</sup> )	Etc.	
				Diagnosis		Etc.	

Registry Data	
Death	Cause of Death
Patient ID	Patient ID
Death Date	Cause of Death
Source	Source
Confidence	Confidence
Etc.	Etc.

### **SCDM Mapping**

New code type – SNOMED UK (SK)	SCDM Table	Records
SNOMED	Enrolment	511,412
<ul> <li>SNOMED CT Core</li> <li>SNOMED CT UK Extension</li> </ul>		511,412
	Death	24,679
Encounter	Encounter	21,920,166
<ul> <li>No analogue in CPRD Aurum</li> </ul>	Diagnosis	23,520,028
Enrolment	Procedure	10,533,081
<ul> <li>MedCov – Ambulatory added</li> </ul>	Prescribing	36,130,122



#### **Original query (WP092)**

**Population**: 18+ with registration from Jan 2008 to Jan 2018

#### **Exposure:** Non-insulin antidiabetic drugs

albiglutide, alogliptin, canagliflozin, dapagliflozin, dulaglutide, empagliflozin, exenatide, glimepiride, glipizide, glyburide, linagliptin, liraglutide, metformin, pioglitazone, saxagliptin, sitagliptin

#### Treatment Episode creation: Incident dispensing



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metformin, glimepiride, glipizide, glyburide

.

#### Treatment Episode creation: Incident dispensing



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**Population**: 18+ with registration from Jan 2008 to Jan 2018

#### Exposure: Non-insulin antidiabetic drugs

metformin, glimepiride, glipizide, glyburide

.

#### Treatment Episode creation: Incident prescribing



	DPs (17 sites)	CPRD MVP
Metformin	71,316,729 (6,502,864)	123,389 (4,463)



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Metformin	71,316,729 (6,502,864)	123,389 (4,463)
Glimepiride	15,126,850 (1,423,976)	2,642 (125)



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Glipizide	20,518,629 (1,961,364)	483 (25)



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Glyburide	5,982,296 (720,925)	267 (23)



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All sulphonylureas?		



	DPs (17 sites)	CPRD MVP
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Glipizide	20,518,629 (1,961,364)	483 (25)
Glyburide	5,982,296 (720,925)	267 (23)
All sulphonylureas?	-	61,111 (2,138)

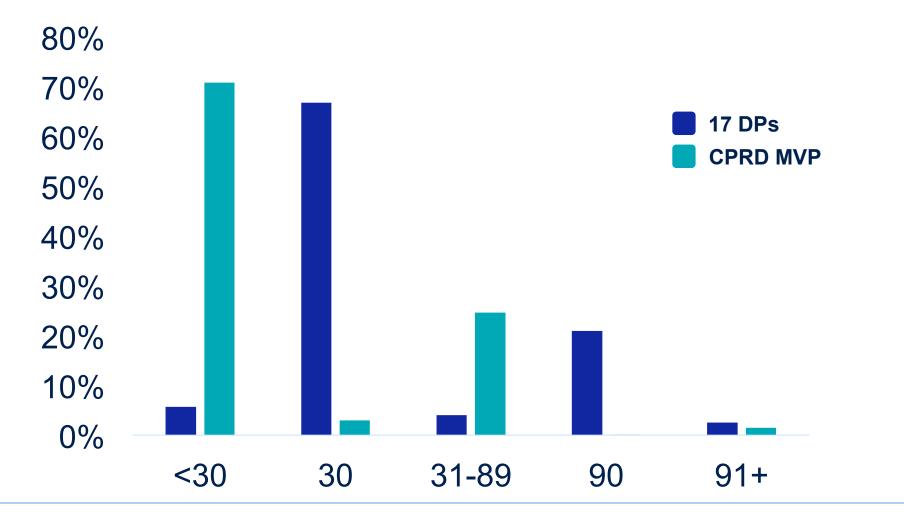


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Glyburide	5,982,296 (720,925)	267 (23)
Gliclazide	0 (0)	58,093 (2,027)
All sulphonylureas?	-	61,111 (2,138)



### Days prescribed

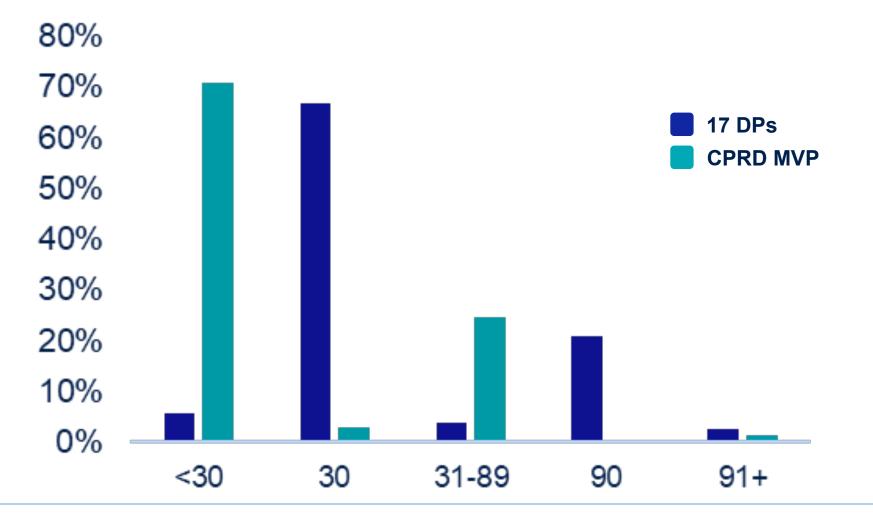
#### **Metformin**



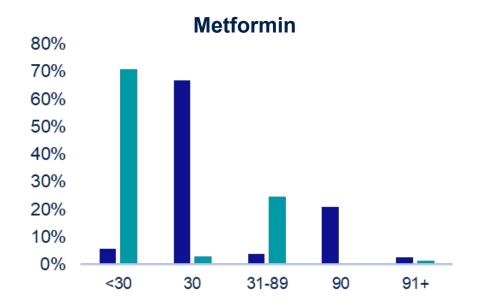


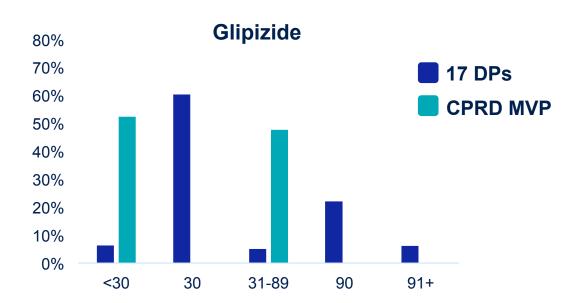
## Days prescribed

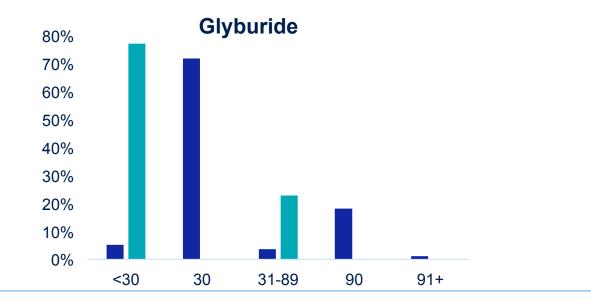
#### Metformin

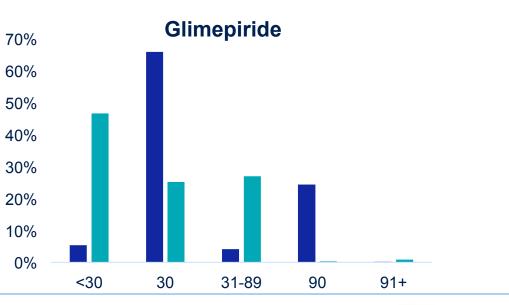






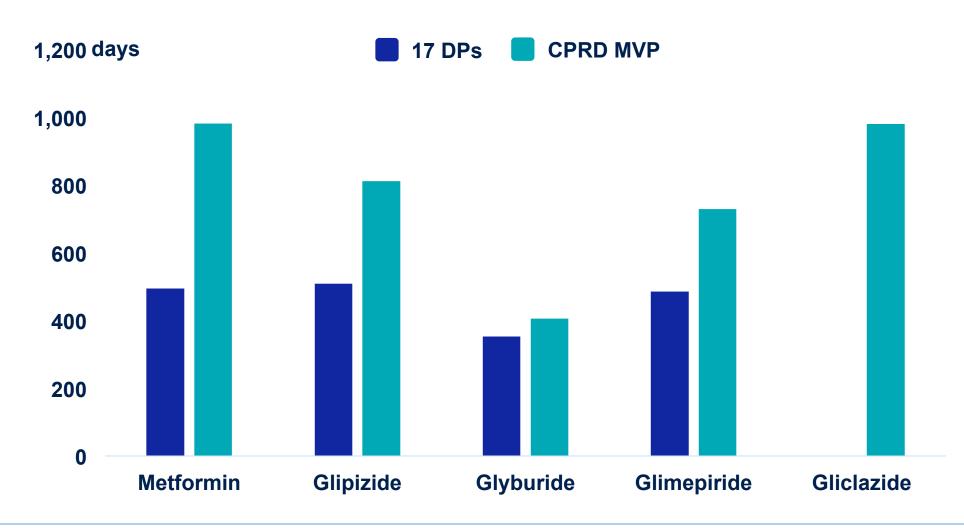








## **Cumulative exposure duration**





## Key differences





## On the horizon...

#### Historical data from before a patient's registration start date

#### Additional tables:

• Vital Signs, lab values, referrals, problems

#### Scaling up

- Storage, processing
- Update frequency
- CPRD GOLD

#### Linkages

• Official death record, secondary care



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## The PCORnet Antibiotics and Childhood Growth Study: Prescribing vs. Dispensing

Kevin Haynes, PharmD, MSCE Vinit Nair, PharmD, MS Jason Block, MD, MPH L. Charles Bailey, MD, PhD Pi-I Debby Lin, ScD



The National Patient-Centered Clinical Research Network

#### Outline

Short Pecha Kucha Image Presentation of Prescribing vs. Dispensing

- https://www.pechakucha.com 20slidesx20s/slide (we'll do 7x20s)
- Brief PCORnet Overview
- Overlap of Pediatric Antibiotic Study between Clinical Data Research Networks and Health Plan Research Networks

#### **Disclosures**

Employee of HealthCore, a subsidiary of Anthem

Funding from PCORI, FDA Sentinel, NIH
 pcornet<sup>®</sup>



∿ccuMed™		<b></b>	۹	8	٢		۲		×		۶	
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#### FIRST M LASTNAME JR

Enrollee ID DZW920000000

Issuer (80840) 9101003777 
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#### www.pcornet.org



PATIENT-CENTRIC

DATA-DRIVEN THE NETWORK IMPACT

WORK WITH PCORNET CONTACT

A BOARD A CONTRACTOR AND A T. H. CLANTING

#### A Network of Research Networks

PCORnet is a tightly integrated partnership of 9 large Clinical Research Networks, 2 Health Plan Research Networks, a Coordinating Center, and a Central Office. PCORnet represents a diverse set of patients and institutions, ranging from cutting-edge academic medical centers to local community health clinics caring for the nation's most vulnerable patients.



#### Shared Common Data Model

PCORnet's Common Data Model incorporates locally-stored data from millions of patients who receive care in the Network's health care systems in a standardized, high-quality format.



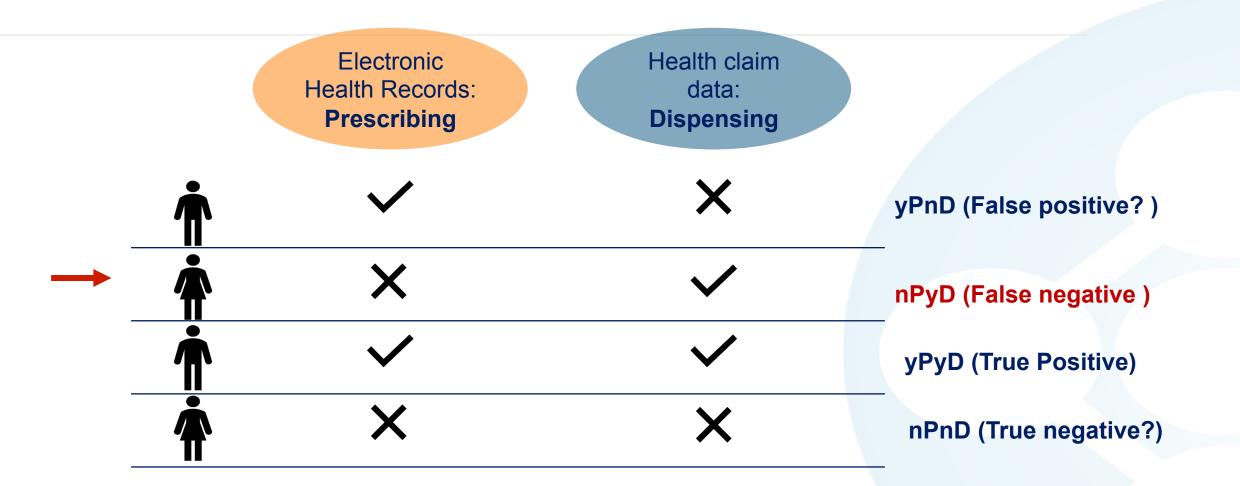
#### **Research Expertise**

PCORnet is made up of the nation's leading clinical researchers whose collective knowledge and experiences enable the Network to support a wide range of research.



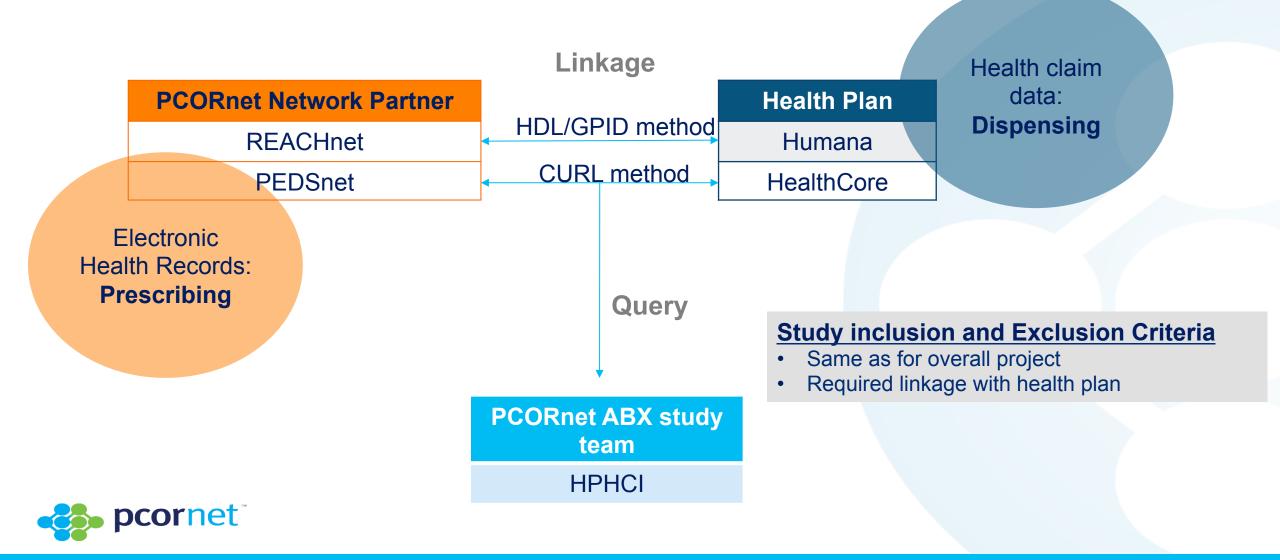
#### **Robust Infrastructure**

PCORnet offers efficiencies in research capabilities through its streamlined research processes, Network reach, and identically formatted data sets at each site. with sophisticated analytic capabilities.





#### **Health-Plan Linkage**

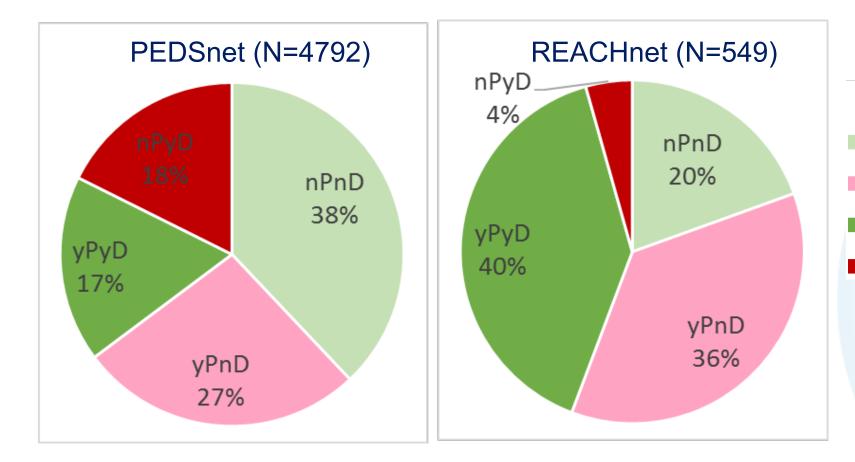


### **Demographics of ABX study and HP-linked populations**

	Main ABX Study	PEDSnet	PEDSnet/ HealthCore Linkage	REACHnet	REACHnet/ Humana Linkage
<b>Total Patients</b>	681,739	317,435	4,792	8,451	549
Sex					
.Male	52%	53%	58%	53%	54%
.Female	48%	47%	42%	47%	46%
Race					
.White	53%	48%	76%	63%	80%
.Black/Afr Am	25%	32%	9%	32%	17%
.Asian	4%	3%	3%	3%	2%
.Other/unk	18%	17%	11%	2%	1%



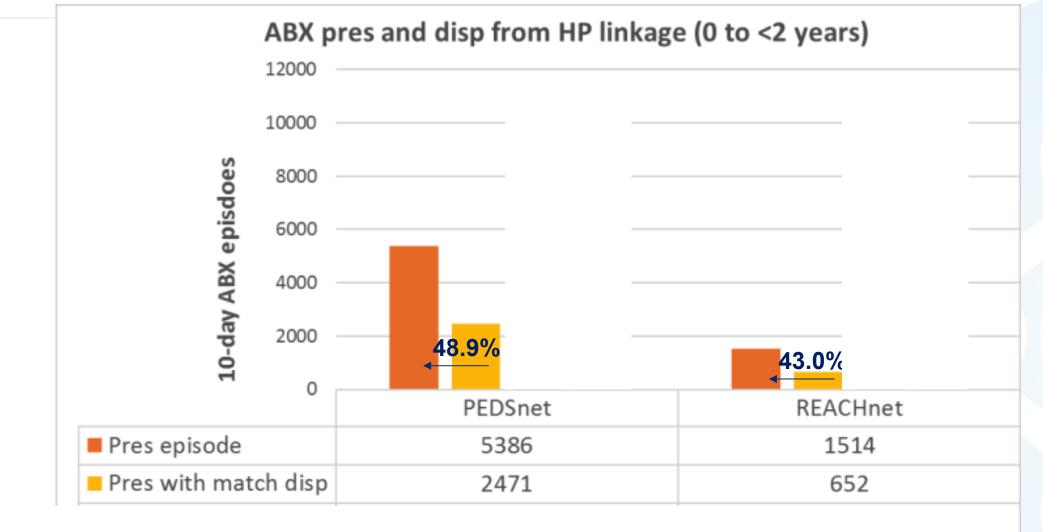
# Presence of prescription & dispensing between age 0 to <2 years



No prescription no dispensing (nPnD)
 Prescription but no dispensing (yPnD)
 Both prescription and dispensing (yPyD)
 No prescription but Dispensing (nPyD)

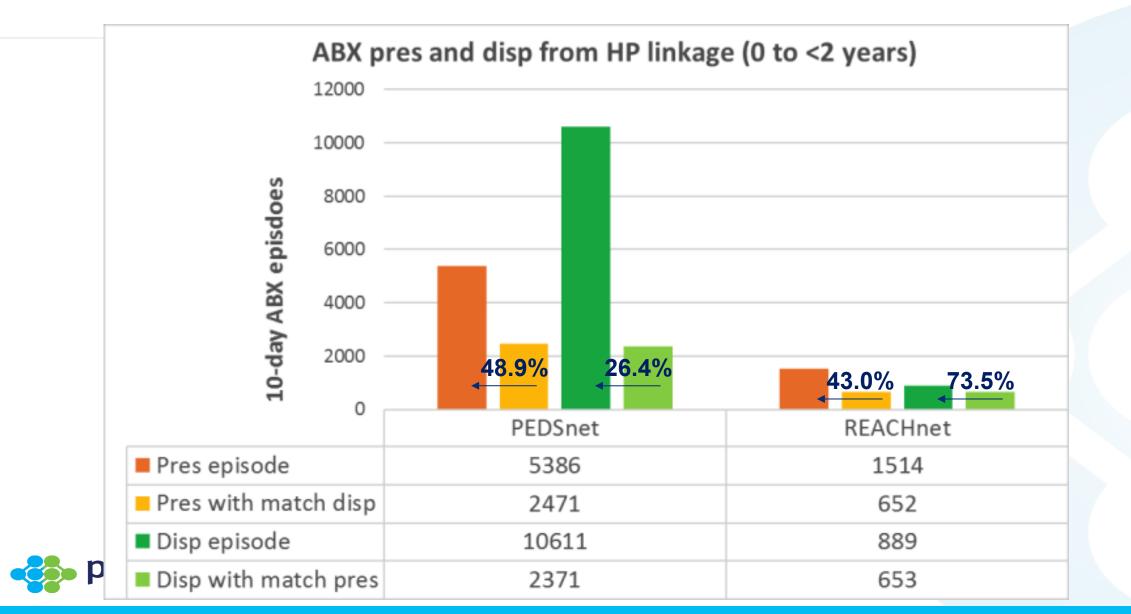


## Matching between prescribing and dispensing episodes





## Matching between prescribing and dispensing episodes



#### **Discussion**

- As common in other health care systems prescriptions may be written across multiple institutions or organizations
- Prescription dispensings may have varying degrees of completeness within administrative data systems
- Data linkage can close gaps between prescriptions written and prescription dispensings
- PCORnet is closing gaps in data to support patient-centered real world evidence development





# Heterogeneity as a Source of Strength: The Value of International and Prescribing Data to FDA

Michael D. Nguyen, MD Sentinel Program Lead Office of Surveillance and Epidemiology Center for Drug Evaluation and Research August 26, 2019

35th International Conference on Pharmacoepidemiology & Therapeutic Risk Management

# **Symposium Themes Thus Far**



- FDA's international collaboration efforts demonstrate the flexibility of multisite distributed data networks to incorporate a variety of data sources and reach across national borders
  - Shows extensibility and flexibility of Sentinel's common data model and analysis tools
  - Exemplifies how all participants can benefit from shared infrastructure
- Two new dimensions: prescribing data and country-specific data
  - Illustrates how heterogeneity of data sources can be a source of strength and improve our understanding of medication utilization when used appropriately
  - Defining exposed time should account for the differences between prescribing and dispensing data streams, as well as other country-specific factors

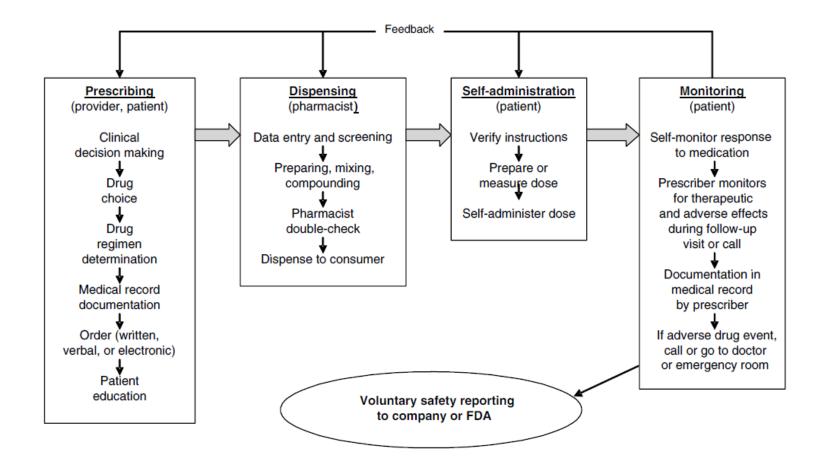
# Outline



- What different types of regulatory questions might be addressed with prescribing data?
  - Prescribing data alone
  - Prescribing data in combination with dispensing data
- How international drug utilization data might help regulatory agencies



## **Medication Use Process in Community Care**



#### PREVENTING MEDICATION ERRORS



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## **Potential Regulatory Questions to Pursue**

#### **Prescribing Data Alone**

- Drug utilization (e.g., use in pregnancy )
- Inferential safety studies
- Rates of proprietary name use
- Impact of proprietary name change interventions

#### **Prescribing Linked to Dispensing Data**

- Medication errors
  - Wrong drug, dose, frequency
  - Name confusion
- Prescribing vs. dispensing substitutions or change rates
- Assess rates of "dispensed as written" prescriptions as potential indicator of concerns about therapeutic inequivalence

## **FDA Studies Using CPRD Prescribing Data**



Patterns of Prescription of Antidepressants and Antipsychotics	Risk of acute myocardia initiating olmesartan or o a cohort study using the
Matem Child Health J DOI 10.1007/s10995-013-1419-2	
Andrew D. Mosholder*, Joo-Yeon Lee, Esther H. Zhou, Elizabeth M. Kang, Mayurika Ghosh, Rima Izem, Jacqueline M. Major, and David J. Graham Correspondence to Dr. Andrew D. Mosholder, Division of Epidemiology 1, Center for Drug Evaluation and Research, US Food and Drug Administration, 10903 New Hampshire Avenue, Silver Spring, MD 20993 (e-mail: andrew.mosholder@fda.hhs.gov).	Andrea V. Margulis, Adel Abou-Ali, M Mark S. Levenson and Tarek A. Hamm PHARMACOEPIDEMIOLOGY AND DRUG SA Published online in Wiley Online Library (wiley
Long-Term Risk of Acute Myocardial Infarction, Stroke, and Death With Outpatient Jse of Clarithromycin: A Retrospective Cohort Study	Use of selective serotonic cardiac malformations: a
American Journal of Epidemiology Published by Oxford University Press on behalf of the Johns Hopkins Bloomberg School of Public Health 2018. This work is written by (a) US Government employee(s) and is in the public domain in the US. DOI: 10.1093/aje/kwx319 DOI: 10.1093/aje/kwx319 DOI: 10.1093/aje/kwx319	PHARMACOEPIDEMIOLOGY AND DRUG SA Published online in Wiley Online Library (wiley

FETY (2013) onlinelibrary.com) DOI: 10.1002/pds.3462

ORIGINAL REPORT

in reuptake inhibitors in pregnancy and a propensity-score matched cohort in CPRD<sup> $\dagger$ </sup>

Iarian M. Strazzeri, Yulan Ding, Fatmatta Kuyateh, Eric Y. Frimpong, ad\*

FETY (2013) onlinelibrary.com) DOI: 10.1002/pds.3549

ORIGINAL REPORT

al infarction, stroke, or death in patients other angiotensin receptor blockers — Clinical Practice Research Datalink<sup>†</sup>

lark S. Levenson<sup>2</sup>, Martin Rose<sup>3</sup>, Ya-Hui Hsueh<sup>2</sup> and David J. Graham<sup>1</sup>

Food and Drug Administration, MD, USA ninistration, MD, USA inistration, MD, USA

## **Institute for Safe Medication Practices** High-Alert Medications in Ambulatory Settings



Classes/Categories of Medications	Specific Medications
antiretroviral agents (e.g., efavirenz, lami <b>VUD</b> ine, raltegravir, ritonavir, combination antiretroviral products)	car <b>BAM</b> azepine
chemotherapeutic agents, oral (excluding hormonal agents) (e.g., cyclophosphamide, mercaptopurine, temozolomide)	chloral hydrate liquid, for sedation of children
nypoglycemic agents, oral	heparin, including unfractionated and low molecular weight heparin
mmunosuppressant agents (e.g., aza <b>THIO</b> prine, cyclo <b>SPORINE</b> , racrolimus)	met <b>FORMIN</b>
nsulin, all formulations	methotrexate, non-oncologic use
opioids, all formulations	midazolam liquid, for sedation of children
ediatric liquid medications that require measurement	propylthiouracil
pregnancy category X drugs (e.g., bosentan, <b>ISO</b> tretinoin)	warfarin

https://www.ismp.org/recommendations/high-alert-medications-community-ambulatory-list

DOI: 10.1002/pds.4858

#### ORIGINAL REPORT

Development of an algorithm to detect methotrexate wrong frequency error using computerized health care data

Lisa J. Herrinton<sup>1</sup> I Tiffany S. Woodworth<sup>2</sup> | Efe Eworuke<sup>3</sup> I Laura B. Amsden<sup>1</sup> | Liyan Liu<sup>1</sup> | Jo Wyeth<sup>3</sup> | Andrew Petrone<sup>2</sup> | Talia J. Menzin<sup>2</sup> | James Williams<sup>2</sup> | Robert Goldfien<sup>1</sup> | Michael Nguyen<sup>3</sup>

Having access to the prescribing and dispensing data allowed FDA to assess and control for the potential contribution of prescribing behaviors





#### WILEY



FDA

RECOMMENDATIONS

#### List of Confused Drug Names

February 28, 2019

 $\square$ 

 f
 ISMP's List of Confused Drug Names contains look-alike and sound-alike (LASA) name pairs, of medications that have been published in the ISMP Medication Safety Alert!® and the ISMP Medication Safety Alert!®

 in
 Medication Safety Alert!® and the ISMP Medication Safety Alert!®

 Community/Ambulatory Care Edition through February 28, 2019.

Use this list to determine which medications require special safeguards to reduce the risk of errors and minimize harm. This may include strategies such as:

ce <b>FAZ</b> olin	cef <b>TRIAX</b> one		
cef <b>TRIAX</b> one	ce <b>FAZ</b> olin		
cefuroxime	sulfa <b>SALA</b> zine		
CeleBREX	CeleXA		
CeleBREX	Сегеbух		
CeleXA	CeleBREX		
CeleXA	Сегеbух		
CeleXA	Zy <b>PREXA</b>		
Cerebyx	CeleBREX		
Cerebyx	CeleXA		
cetirizine	sertraline		

# Value of International Collaboration

- Different drug approval dates allow regulators to leverage postmarket safety information from other countries for more timely safety data
- Different uptake patterns and underlying populations (race, ethnicity, BMI, smoking, etc.) allow subgroup analyses
- Differences in healthcare systems may impact duration of medication adherence or duration of observation creating new opportunities
- Pooling of smaller populations may lead to more precise population level risk estimates (e.g., pregnancy, pediatrics, rare diseases, orphan drugs)

FDA

# **Adherence to Drugs May Differ**



Adjusted Odds

Cost-Related Prescription Nonadherence in the United States and Canada: A System-Level Comparison Using the 2007

Jae Kennedy, PhD<sup>1</sup>; and

<sup>1</sup>Department of Health Poli Spokane, Washington; and <sup>2</sup> and Public Health, Universit

#### ABSTRACT

Background: Prior researc of the United States are near nadian residents to report co (CRNA) (ie, being unable to f cost). However, these kinds obscure important within-co surance coverage.

International H Table II. Odds ratios for cost-related nonadherence (CRNA)\* among working-age adults (<65 years of age) in Canada and the United States, by insurance system.

oli	Insurance System	N (1000s)	CRNA, %	Ratio (95% CI) <sup>†</sup>
d <sup>1</sup> rsit	Canadian compulsory coverage (Quebec) Canadian senior and social assistance coverage (Ontario)	242 727	4.4 8.8	<b>0.5 (0.3–0.8)</b> Reference
	Canadian income-based coverage (British Columbia, Manitoba, and Saskatchewan)	487	12.1	1.4 (1.0-2.1)
ırc	Canadian mixed coverage (all other provinces)	431	11.0	1.3 (0.9–1.9)
ear	US private coverage (employer-based or individual)	14,810	15.9	2.2 (1.6–3.0)
cc	US senior and social assistance coverage (Medicare,			
:0 1	Medicaid, or other)	7447	22.2	2.2 (1.4–3.5)
ls -	US no coverage (uninsured during past year)	25,755	43.3	7.2 (5.0–10.5)
-00				

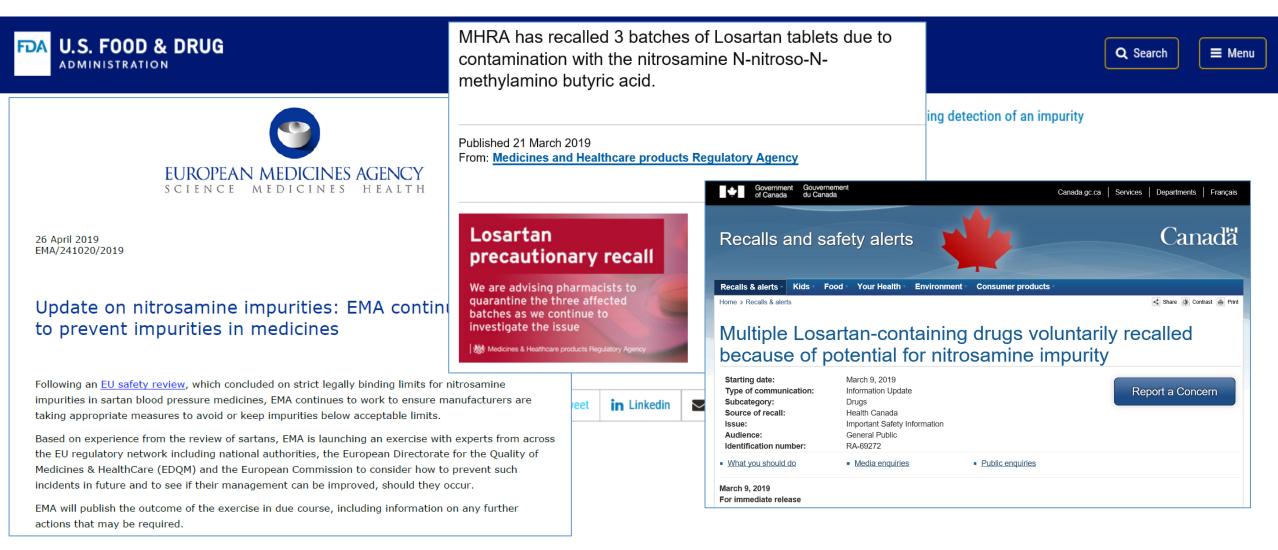
\*Defined as inability to pay for a prescribed medication.

<sup>†</sup>Adjusted model controls for gender, income, and chronic illness; significant odds ratios in boldface.

Source: 2007 International Health Policy Survey in Seven Countries.<sup>32</sup>

# **International Product Quality Issue**





## **Potential International Analysis in Sentinel**

- In July 2018, international regulatory agencies ordered the recall of angiotensin receptor blockers.
- Public communications emphasized that patients should not stop their medication. It is unknown how these safety communications affected prescribing behavior and use.
- Assess impact of drug safety communications and recalls in USA, Canada, UK and other countries.
- Develop a single, common analytic package using data formatted in the Sentinel CDM.
- Assess drug switching to non-recalled products or alternative drugs, and drug discontinuation trends, possibly using interrupted time series analysis.
- Assess differential impact of public health interventions between countries to inform future global health responses.





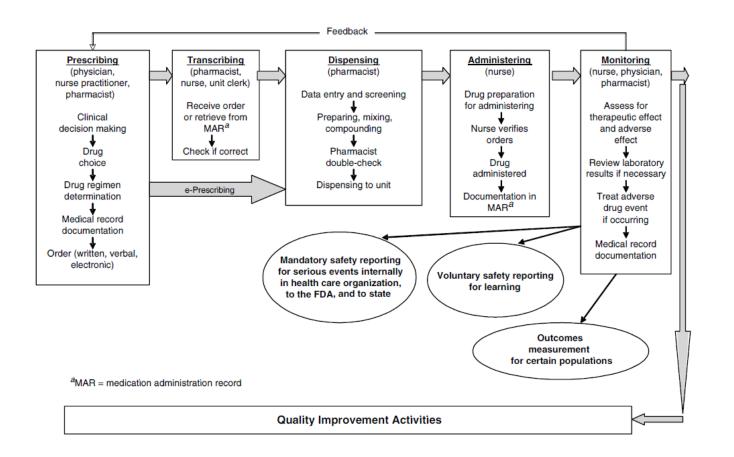
# Summary



- The expanded Sentinel CDM that integrates prescribing data, coupled with international data harmonization efforts in CNODES and UK has created new opportunities to improve public health.
- The single common analytic platform allows countries to evaluate global public health issues in a unified approach
  - Leverages the relative strengths and unique features of each country
  - Offers the ability for combined analysis for more robust descriptive or inferential analyses
- FDA will continue to explore ways to encourage international collaboration using the Sentinel CDM and analytic tools



## Medication Use Process in Hospital and Long Term Care



# <section-header>

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