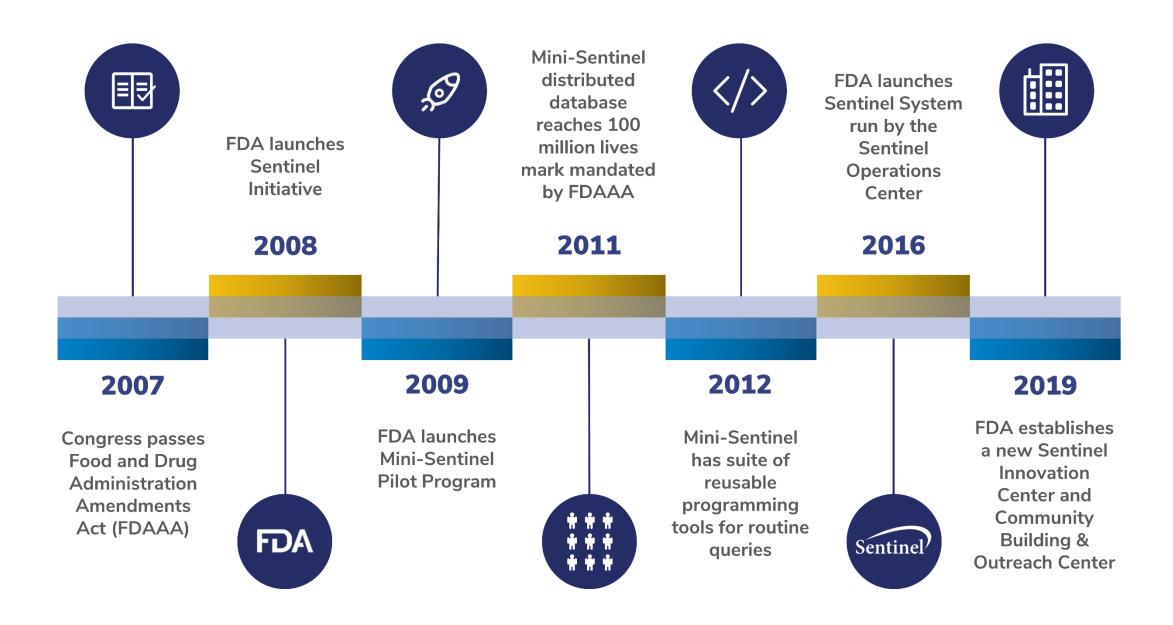


# Real-world evidence: Trends and application of real-world data in drug development and safety

## The Sentinel Experience

Darren Toh, ScD
Endowed Professor
Department of Population Medicine
Harvard Medical School and Harvard Pilgrim Health Care Institute

July 10, 2021



https://www.sentinelinitiative.org/about

#### DEPARTMENT OF POPULATION MEDICINE







### Healthagen **♥aetna**™





































Colorado Hawaii **Mid-Atlantic Northern California Northwest** Washington



**NYC-CDRN** 

New York City Clinical















































Has Appendectomy

Diagnosed with Hypertension

**Routine Office Visit** 

2017 2018 2018 2019 2019 2019

1/1/2017

Encounter

Office Visit Diagnosis: Influenza with pneumonia

**Dispensings** 

Prescription: Antibiotic 3/15/2018

**Encounters** 

**Emergency Department Procedure:** Appendectomy

3/15/2018 - 3/18/2018

Hospital: Inpatient Stay 12/11/2018

**Encounter** 

Office Visit Diagnosis: Hypertension

Dispensings

**Prescription:** Anti-hypertensive

10/31/2019

**Encounter** 

Office Visit Diagnosis: Hypertension

	DEN	10G	RAPHIC			
PATID	BIRTH_DATE	SEX	HISPANIC	RACE	zip	
PatID1	2/2/1964	F	N		5	32818

		DISPENSING		
PATID	RXDATE	NDC	RXSUP	RXAMT
PatID1	10/14/	/2005 00006074031	30	30
PatID1	10/14/	/2005 00185094098	30	30
PatID1	10/17,	/2005 00378015210	30	45
PatID1	10/17,	/2005 54092039101	30	30
PatID1	10/21,	/2005 00173073001	30	30
PatID1	10/21,	/2005 49884074311	30	30
PatID1	10/21,	/2005 58177026408	30	60
PatID1	10/22,	/2005 00093720656	30	30
PatID1	10/23/	/2005 00310027510	30	15

ENROLLMENT								
PATID	ENR_START	ENR	END	MEDCOV	DRUGCOV			
PatID1	7/1/2004		12/31/2004	Υ	N			
PatID1	1/1/2005		12/31/2005	Υ	Υ			

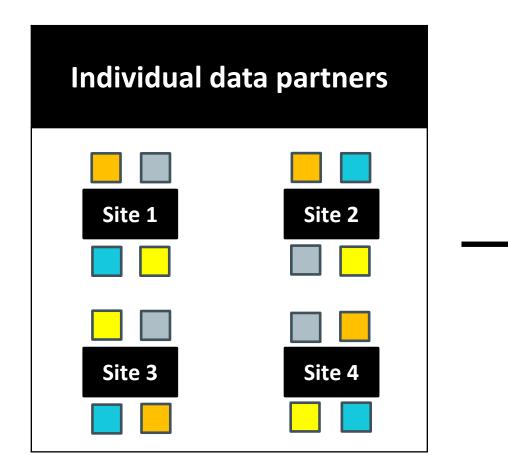
DEATH							
PATID	DEATHDT	DTIMPUTE	SOURCE	CONFIDENCE			
PatID1	12/27/2005	N	S	E			

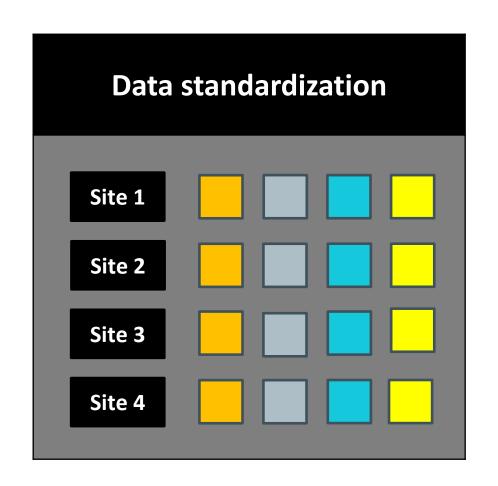
ENCOUNTER							
PATID	ENCOUNTERID	ADATE	DDATE	ENCTYPE			
PatID1	EncID1	1	0/18/2005 10	)/20/2005 IP			

		SIS	DIAGNO			
DDETYPE PDX	DX DX_CODE	ENCTYPE	PROVIDER	ADATE	ENCOUNTERID	PATID
9 P	296.2	r1 IP	Provider	10/18/2005	EncID1	PatID1
9 S	300.02	r1 IP	Provider	10/18/2005	EncID1	PatID1
95	305.6	r1 IP	Provider	10/18/2005	EncID1	PatID1
9 P	311	r1 IP	Provider	10/18/2005	EncID1	PatID1
9 \$	401.9	r1 IP	Provider	10/18/2005	EncID1	PatID1
9 \$	493.9	r1 IP	Provider	10/18/2005	EncID1	PatID1
9 \$	715.9	r1 IP	Provider	10/18/2005	EncID1	PatID1
	493.9	r1 IP	Provider	10/18/2005	EncID1	PatID1

		PR	OCEDURE			
PATID	ENCOUNTERID	ADATE	PROVIDER	ENCTYPE	PX	PX_CODETYPE
PatID1	EncID1	10/18/2005	Provider1	IP	84443	C4
PatID1	EncID1	10/18/2005	Provider1	IP	99222	C4
PatID1	EncID1	10/18/2005	Provider1	IP	99238	C4
PatID1	EncID1	10/18/2005	Provider2	IP	27445	C4

CAUSE OF DEATH								
PATID	COD	CODETYPE	CAUSETYPE	SOURCE	CONFIDENCE			
PatID1	J18.0	10	U	S	E			





#### **Types of Data Quality Checks and Examples**

**Level 1 Checks:** Single table checks



Admission date is not missing value

Validity

Admission date is in date format

**Level 2 Checks:** Cross-table checks

Accuracy

Admission date occurs before the patient's discharge

/ Integrity

Admission date occurs within the patient's active enrollment period

**Level 3 Checks:** Cross-time checks

Consistency of Trends

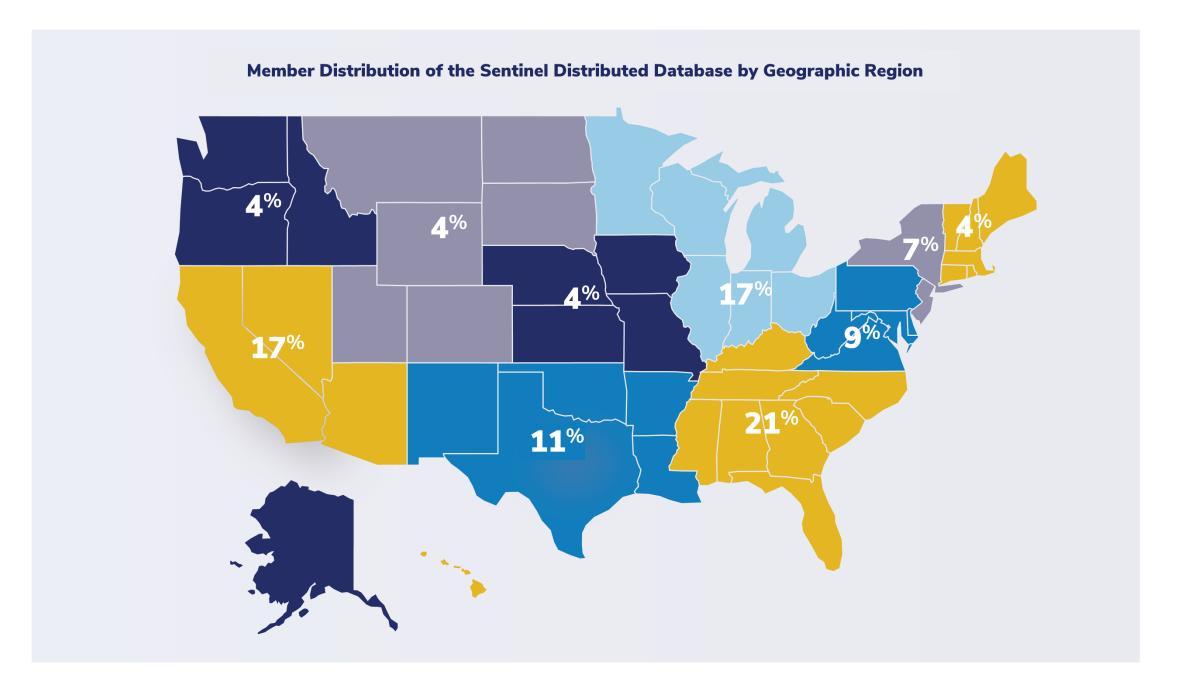
There is no sizable percent change in admission date record counts by month-year

**788 million** person-years of data

**15 billion** pharmacy dispensing

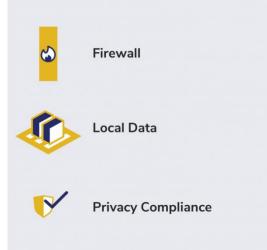
71 million individuals currently accruing data

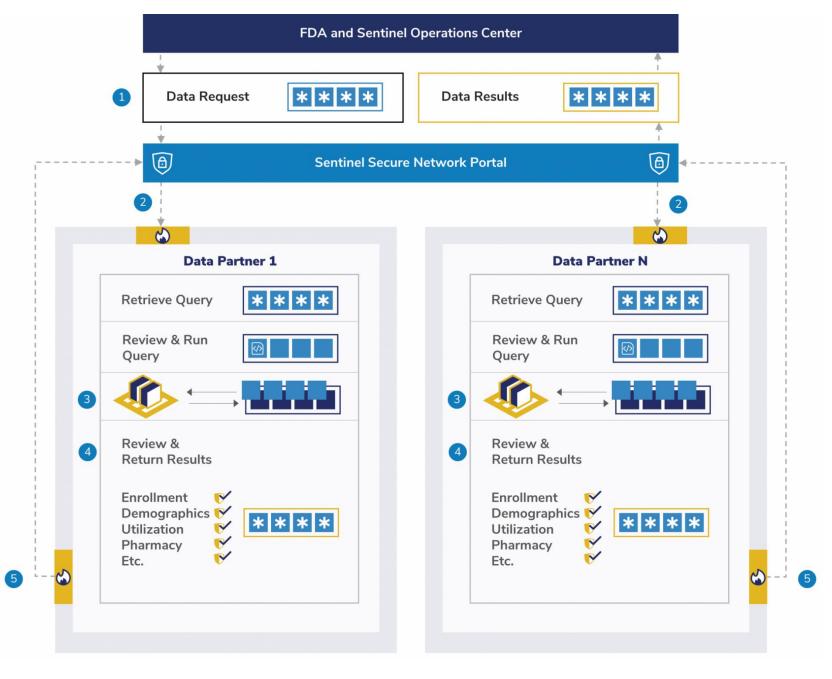
**14 billion** medical encounters





- 2 Data Partners retrieve query
- 3 Data Partners review and run query against their local data behind their firewalls
- 4 Data Partners review results for accuracy and privacy compliance
- Data Partners return deidentified results to SOC via secure portal





### Sentinel's Multi-Modal Response System

## Claims (with Limited EHR Network)

Active Risk Identification and Analysis (ARIA)\*

Sentinel Distributed
Database

IBM® MarketScan® Research Databases

- Sentinel Common Data Model
- Sentinel Analytic Tools
- Access to Medical Records within the Sentinel Distributed Database

#### EHR Data Aggregators

TriNetX

**IBM Watson Health** 

- Proprietary Common Data Models
- Web-Based Query Interface & Custom Programming
- Access to Medical Records varies by Source

#### EHR Data Warehouse

**HCA Healthcare** 

Veradigm

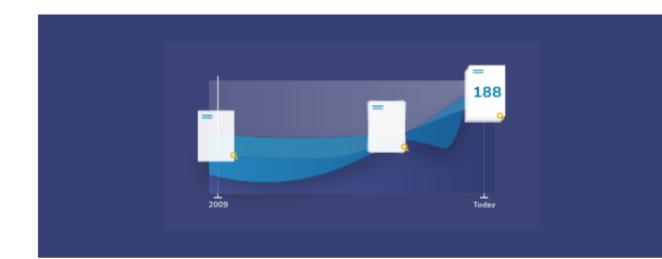
- Data Warehouse for Multiple Healthcare Organizations in a System
- Custom Programming
- Access to Medical Records

#### EHR Networks

**PCORnet** 

- PCORnet Common Data Model
- PCORnet Analytic Tools
- Access to Medical Records

<sup>\*</sup>Note: The Active Risk Identification and Analysis (ARIA) System is comprised of the Sentinel Distributed Database, the Sentinel Common Data Model, and Sentinel analytic tools.



Since the founding of the Sentinel Initiative in 2009, 188 scientific papers have been published

Scientific Publications >

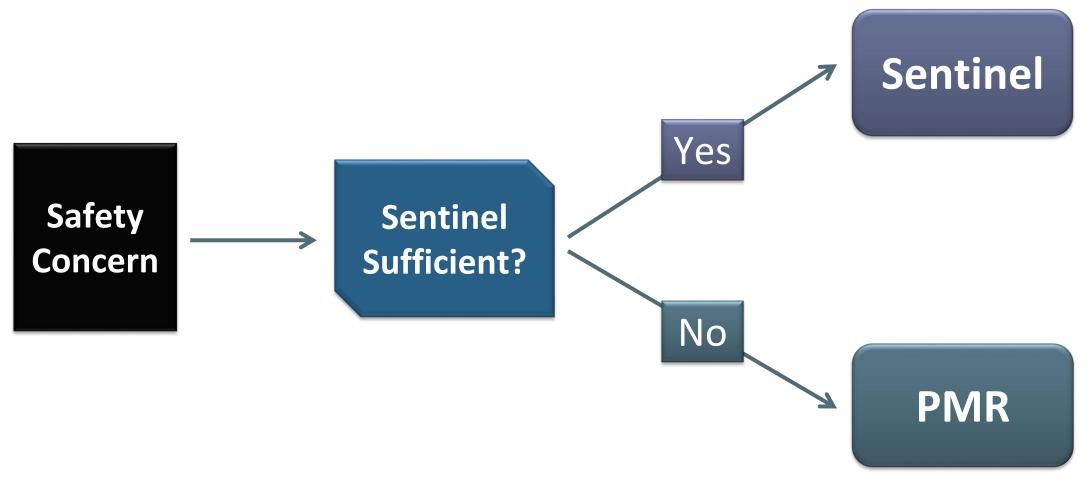


Since 2016, more than 30 Sentinel drug assessments have contributed to FDA regulatory actions or discussion

Drug Assessments >







PMR: Post-market requirement



NDA 211801

NDA APPROVAL

Ardelyx, Inc. Attention: Robert C. Blanks, M.S., RAC Senior Vice President, Regulatory Affairs and Quality Assurance 34175 Ardenwood Blvd. Suite 100 Fremont, CA 94555

### **NDA** approval letter

#### SENTINEL/ARIA NOTIFICATION

The Food and Drug Administration Amendments Act of 2007 (FDAAA) required FDA to establish a national electronic system to monitor the safety of FDA-regulated medical products. In fulfillment of this mandate, FDA established the Sentinel System, which enables FDA to proactively monitor drug safety using electronic health data from multiple data sources that contribute to the Sentinel Distributed Database.

FDA plans to evaluate tenapanor in the Sentinel System as part of the implementation of section 505(o) of the FDCA. We have determined that the new pharmacovigilance system, Sentinel's Active Risk Identification and Analysis (ARIA) System, established under section 505(k)(3) of the FDCA, is sufficient to assess the following serious risks: risk of inflammatory bowel disease.

The ARIA safety assessment will be posted to the Sentinel website.<sup>3</sup> Once there is sufficient product uptake to support an analysis, an analysis plan will be posted online. After the analysis is complete, FDA will also post the results on the Sentinel website. FDA will notify you prior to posting the analysis plan and prior to posting the results.



JNCI Cancer Spectrum (2021) 5(2): pkab009

doi: 10.1093/jncics/pkab009 First published online 4 February 2021

Risk of Nonmelanoma Skin Cancer in Association With Use of Hydrochlorothiazide-Containing Products in the United States

Efe Eworuke [6], PhD, 1,\* Nicole Haug, MPH, 2 Marie Bradley [6], PhD, 1 Austin Cosgrove, BS, 2 Tancy Zhang, MPH, 2 Elizabeth C. Dee, MPH,<sup>2</sup> Sruthi Adimadhyam p, PhD<sup>2</sup> Andrew Petrone, MPH,<sup>2</sup> Hana Lee, PhD,<sup>3</sup> Tiffany Woodworth , MPH, Sengwee Toh, ScD<sup>2</sup>

#### **Postmarketing Experience:**

#### Non-melanoma Skin Cancer

Hydrochlorothiazide is associated with an increased risk of non-melanoma skin cancer. In a study conducted in the Sentinel System, increased risk was predominantly for squamous cell carcinoma (SCC) and in white patients taking large cumulative doses. The increased risk for SCC in the overall population was approximately 1 additional case per 16,000 patients per year, and for white patients taking a cumulative dose of  $\geq$ 50,000 mg the risk increase was approximately 1 additional SCC case for every 6,700 patients per year.

### Label change

#### **FDA Briefing Document**

ARTHRITIS ADVISORY COMMITTEE AND DRUG SAFETY AND RISK MANAGEMENT ADVISORY COMMITTEE MEETING January 11, 2019

**NDA 21856** Febuxostat Xanthine oxidase (XO) inhibitor for the chronic management of hyperuricemia in patients with gout

Takeda

#### EXECUTIVE SUMMARY

Febuxostat (Uloric®), a selective inhibitor of xanthine oxidase, lowers serum uric acid levels by inhibiting the conversion of xanthine to uric acid. It was approved by the FDA in February 2009 for the management of chronic hyperuricemia in patients with gout. Preliminary results from a post-approval safety trial (Cardiovascular Safety of Febuxostat and Allopurinol in Patients with Gout and Cardiovascular Morbidity (CARES)) showed an increased risk of cardiovascular-related death and allcause death in febuxostat users. As a result, FDA issued a drug safety communication in November 2017. An advisory committee (AC) meeting is scheduled for January 11, 2019 to discuss potential regulatory action to address the safety of febuxostat. For context, the Division of Pulmonary, Allergy, and Rheumatology Products (DPARP) requested the Division of Epidemiology (DEPI) to investigate the characteristics of the gout population and use of febuxostat and allopurinol in real-world settings using the Sentinel Distributed Database (SDD) since the CARES trial was enriched for patients with CVD.

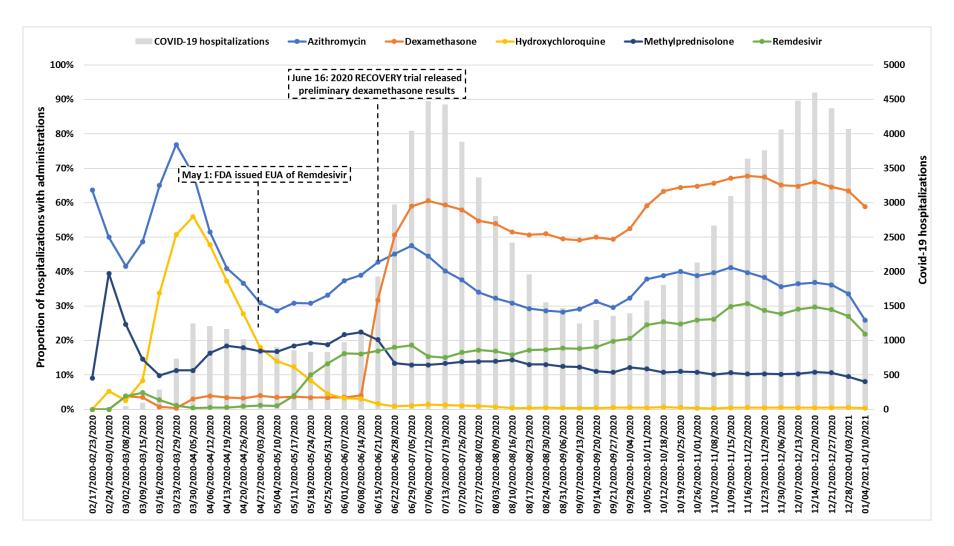
## **Advisory Committee** briefing document

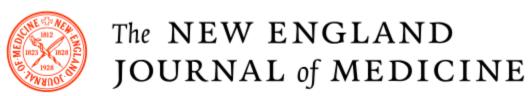
DOI: 10.1002/pds.5240

#### REVIEW

#### WILEY

## A COVID-19-ready public health surveillance system: The Food and Drug Administration's Sentinel System





Perspective

# Developing the Sentinel System — A National Resource for Evidence Development

Rachel E. Behrman, M.D., M.P.H., Joshua S. Benner, Pharm.D., Sc.D., Jeffrey S. Brown, Ph.D., Mark McClellan, M.D., Ph.D., Janet Woodcock, M.D., and Richard Platt, M.D.

N Engl J Med 2011; 364:498-499

## The FDA Sentinel Initiative — An Evolving National Resource

Richard Platt, M.D., Jeffrey S. Brown, Ph.D., Melissa Robb, M.S., Mark McClellan, M.D., Ph.D., Robert Ball, M.D., M.P.H., Michael D. Nguyen, M.D., and Rachel E. Sherman, M.D., M.P.H.

N Engl J Med 2018; 379:2091-2093



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## The Sentinel Experience

Darren Toh, ScD



darren\_toh@harvardpilgrim.org

@darrentoh\_epi