

# Sentinel Journey from Safety Question to Regulatory Action

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Food and Drug Administration

Center for Drug Evaluation and Research

Division of Biometrics 7

## Disclaimer

This presentation reflects the views of the author and should not be construed to represent the policies of the U.S. Food and Drug Administration

# First, some background....

# FDA regulates drugs and...



**Food**



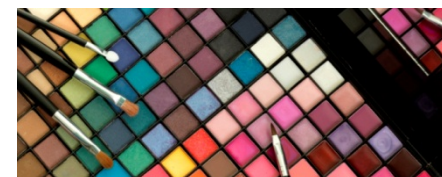
**Vaccines, Blood & Biologics**



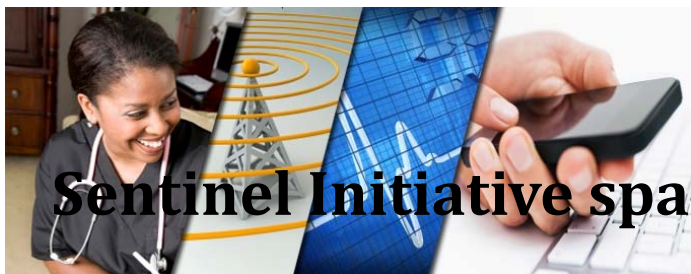
**DRUGS**



**Tobacco Products**



**Cosmetics**



**Medical Devices**

**Safe and Effective**



**Animal & Veterinary**



**Radiation-Emitting Products**

**Sentinel Initiative spans multiple centers**



# Center for Drug Evaluation and Research Office of Biostatistics

**Over 170 statisticians across 8 divisions,  
Expertise in regulatory statistics in all phases of drug  
development across many drug therapeutic areas**



Office of Biostatistics Regulatory Science Day, September 2014

# Safety in (New) Drug Development

**Drug Reasonably  
Safe for use in  
Humans**

**Marketing  
Application  
and Review  
of Benefits  
and Risks**

**Basic  
Research  
Discovery  
Preclinical**

Div. of Biometrics 6

**Randomized  
Clinical  
Trials**

Div. of Biometrics 1-5

**Post-Market  
Assessments**

Div. of Biometrics 7

**Safety Profile of The  
Drug**

**Safety  
Surveillance**

# Why Post-Market Assessment?

## Example, Dabigatran

Approved on 10/2010 to reduce the risk of stroke in patients with atrial fibrillation

	<b>PRADAXA 150 mg twice daily</b>	<b>Warfarin</b>	<b>Hazard ratio vs. warfarin (95% CI)</b>
Patients randomized	6076	6022	
Stroke	123	187	0.64 (0.51, 0.81)
Ischemic stroke	104	134	0.76 (0.59, 0.98)
Hemorrhagic stroke	12	45	0.26 (0.14, 0.49)
Systemic embolism	13	21	0.61 (0.30, 1.21)

How will the 2-3 million people in US with atrial fibrillation fare on this drug?

Randomized patients			
Patient-years			
Intracranial hemorrhage			
Life-threatening bleed	183 (1.5)	221 (1.9)	0.81 (0.67, 0.99)
Major bleed	409 (3.4)	426 (3.6)	0.94 (0.82, 1.08)
Any bleed	1997 (16.6)	2169 (18.4)	0.91 (0.85, 0.96)

\*Patients contributed multiple events and events were counted in multiple categories.

## Post-Market Safety Assessment Data Include...

- Post-market randomized studies, observational studies and meta-analyses
- FDA adverse reporting system (FAERS)
- **FDA led observational studies\***
  - **With Sentinel**
  - With SafeRx/federal data partners (CMS, DoD, VA)

\*Section 905 of Food and Drug Administration Amendments Acts (09/2007)



# Sentinel and Mini-Sentinel

# Acknowledgments

My team in the Div. of Biometrics 7 is involved in *ongoing* projects investigating the safety of newly approved anticoagulants discussed today. However, most projects discussed today were initiated and/or completed prior to my involvement

- Special thanks to: Rongmei Zhang (DB7), Mark Levenson (DB7), Marsha Reichman (OSE), Mary-Ross Southworth (OND)

## Take Home Messages

- Sentinel is an *active* surveillance system, one of many sources of safety data at FDA
- Mini-sentinel pilot implemented a structure to query sentinel and demonstrated its use
- Some methodological challenges lie ahead in post-market safety ( Big data/rare outcomes, stratification, sequential analyses)

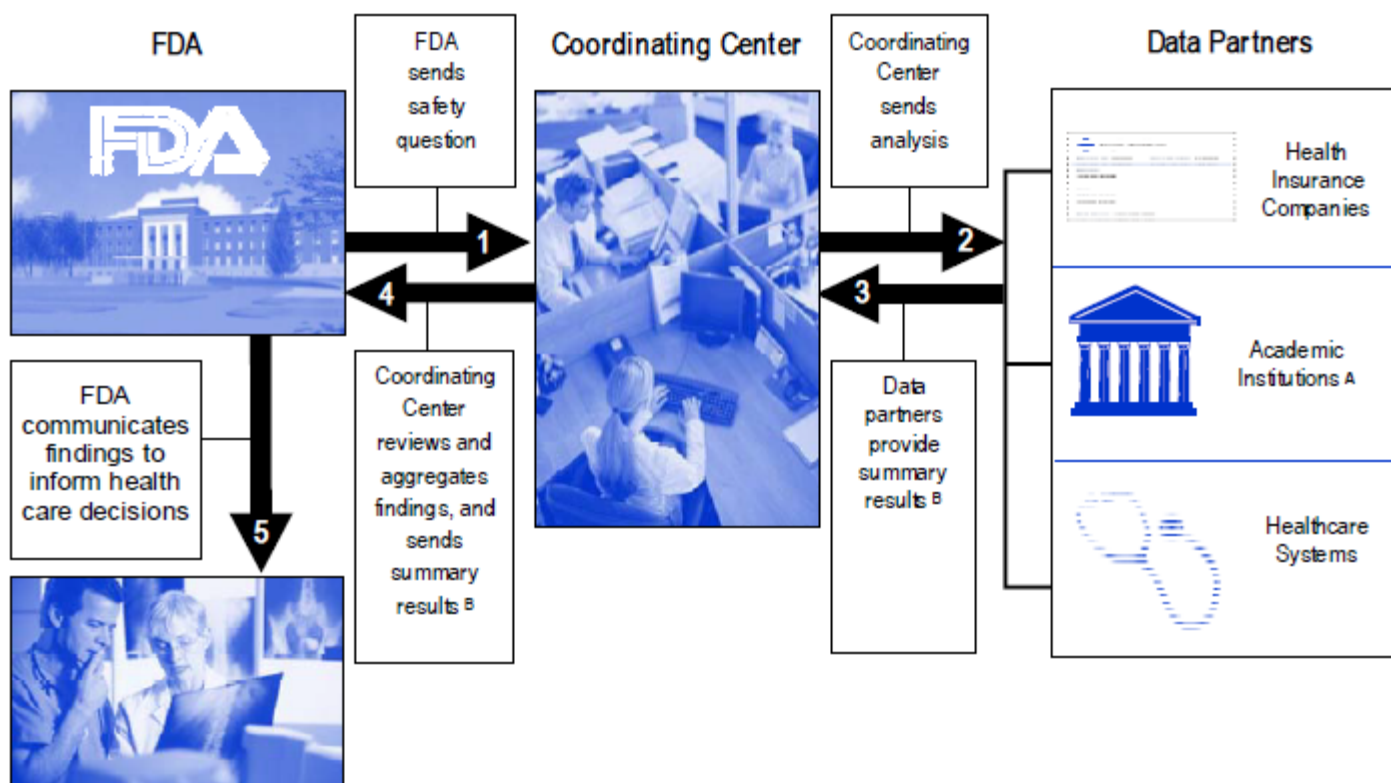


## Vision and Pilot



- National safety *active* surveillance system of drugs and medical products *post-marketing*
- Results of safety *queries* are shared publically
- 48 million people currently accruing new data - 358 million person-years of observation time of drugs and vaccines
- Safety questions, protocols and results in mini-sentinel website

# Sentinel System, Distributed Database



- A. Only those academic institutions with electronic healthcare data will receive safety questions for evaluation.
- B. Data partners will provide summary results from analyses conducted within their secure data environments. Those summary results will not include directly identifiable health information.



**Safety Question:  
Drug exposure(s) (test/comparator), outcome(s),  
and population of interest**

**Data: Electronic Healthcare Data**

See FDA  
Guidance\*

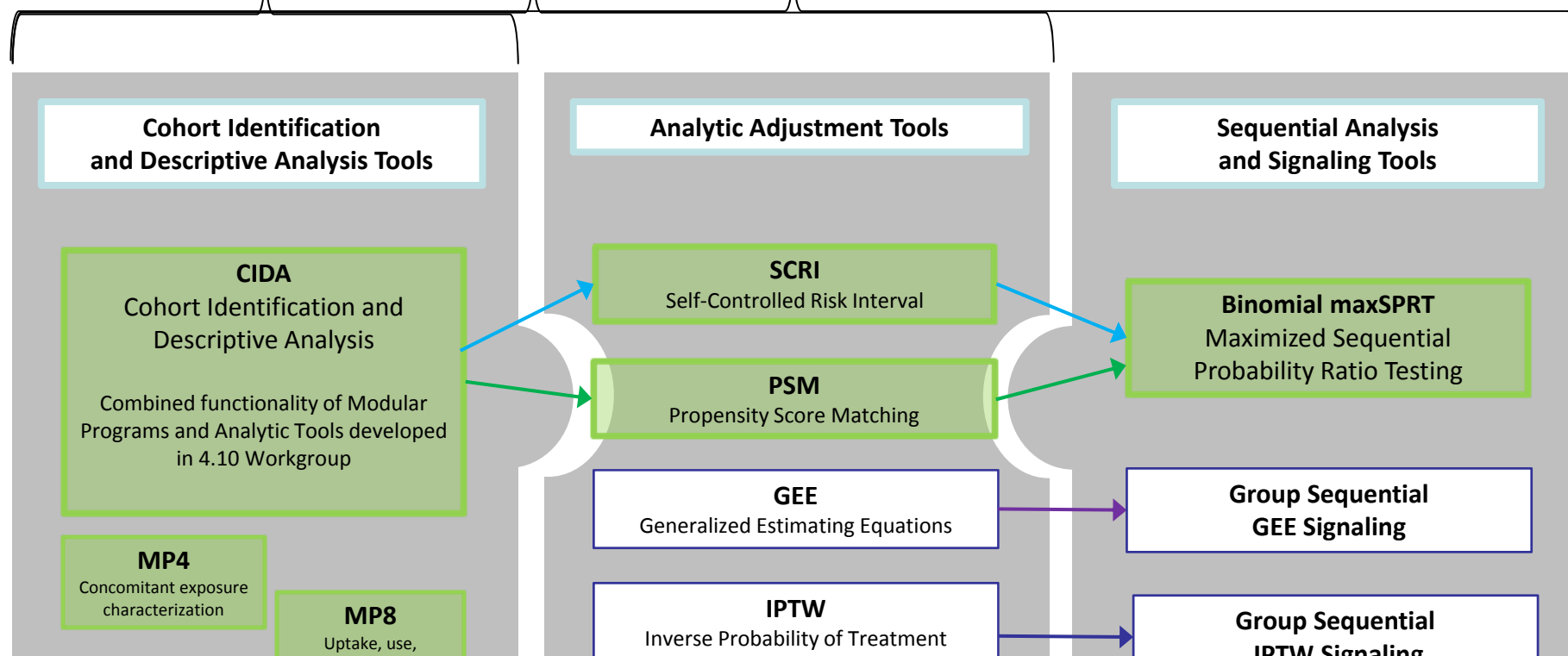
**Statistical Inference  
Question: Estimation, detect  
or rule out risk**

**Feasibility of safety assessment?  
Generalizability to population at risk?**

**Not Every Safety Question is  
Feasible in Sentinel**

# Mini-Sentinel Modular Program, Available Tools

Level 1 Request    Level 2 Request    Level 3 Request



Next, more methods? More diagnostics  
and sensitivity analyses?

# Mini-sentinel, Distributed Database

- In each site
  - Control for confounding
  - Subgroup analyses
- Across sites
  - Stratified analyses of *pooled* results
- Data refresh quarterly



heterogeneity across sites? in time?

Source of logos: Rich Platt's slide at mini-sentinel meeting in February 2015

# The Role of the Division of Biometrics 7 in FDA led Projects

- Develop protocol and statistical analysis plans
- [Conduct Analyses]
- Review and interpret results
- Participate in methodology working groups, e.g.
  - Sentinel Survival
  - Sentinel Prospective Monitoring Tools (PROMPT) Enhancement

# Sentinel Journey – Dabigatran Example

**Reports  
Of bleeding  
(FAERS and  
literature)**

**Mini-sentinel  
(level 1)  
investigation  
(10/2012)**

**Approval of  
Dabigatran  
(10/2010)**

**Drug Safety  
Communication  
(12/2011) and change  
in labeling (01/2012)**

**Drug Safety  
Communication  
(11/2012) and NEJM  
publication**

**Approval of  
Rivaroxaban  
(11/2010)**

**Approval of  
Apixaban  
(12/2012)**



# Dabigatran Example (continued)

## Safety Question

- Population of interest: subjects with atrial fibrillation (2-3 millions Americans)
- Exposure: Dabigatran versus Warfarin (anticoagulants)
- Outcomes:
  - Stroke
  - Serious bleeding

## Electronic Claims Data

- Cohort: AF diagnosis and *new* filled prescription of dabigatran or warfarin, other inclusion/exclusion
- Outcomes identified with ICD-9 codes  
positive predictive values > 80% for most outcomes

# Dabigatran Example (continued)

## Modular Program Level 1 (10/2012)

Level 1: identifies cohorts of interest and, for some cohorts, can perform descriptive analyses

Intracranial and Gastrointestinal Bleeding Events in New Users of Dabigatran and Warfarin from the Mini-Sentinel Distributed Database, October 2010 through December 2011.*						
Analysis	Dabigatran			Warfarin		
	No. of Patients	No. of Events	Incidence (no. of events/ 100,000 days at risk)	No. of Patients	No. of Events	Incidence (no. of events/ 100,000 days at risk)
<b>Gastrointestinal hemorrhage</b>						
Analysis with required diagnosis of atrial fibrillation	10,599	16	1.6	43,541	160	3.5
Sensitivity analysis without required diagnosis of atrial fibrillation	12,195	19	1.6	119,940	338	3.1
<b>Intracranial hemorrhage</b>						
Analysis with required diagnosis of atrial fibrillation	10,587	8	0.8	43,594	109	2.4
Sensitivity analysis without required diagnosis of atrial fibrillation	12,182	10	0.9	120,020	204	1.9

\* Patients were included in the cohorts if, in the 183 days before the index dispensing of dabigatran or warfarin, they were enrolled in plans for drug and medical coverage and had been given a diagnosis of atrial fibrillation in any care setting. Patients were excluded from the cohorts if, in the 183 days before the index dispensing, they had a claim for an event of interest in an inpatient or emergency department setting or a claim for dispensing of dabigatran or warfarin. Events were assessed during drug exposure, from inpatient or emergency department settings only.

# Regulatory Actions

## FDA Drug Safety Communication: Update on the risk for serious bleeding events with the anticoagulant Pradaxa (dabigatran)

The FDA has issued new information about this safety issue, see the [FDA Drug Safety Communication issued 05-13-2014](#).

This update is a follow-up to the FDA Drug Safety Communication of 12/7/2011: Safety review of post-market reports of serious bleeding events with the anticoagulant Pradaxa (dabigatran etexilate mesylate)

[Safety Announcement](#)  
[Additional Information for Patients](#)  
[Additional Information for Healthcare Professionals](#)  
[Data Summary](#)  
[References](#)

### Safety Announcement

**[11-02-2012]** The U.S. Food and Drug Administration (FDA) has evaluated new information about the risk of serious bleeding associated with use of the anticoagulants (blood thinners) dabigatran (Pradaxa) and warfarin (Coumadin, Jantoven, and generics). Following the approval of Pradaxa, FDA received a large number of post-marketing reports of bleeding among Pradaxa users. As a result, FDA investigated the actual rates of gastrointestinal bleeding (occurring in the stomach and intestines) and intracranial hemorrhage (a type of bleeding in the brain) for new users of Pradaxa compared to new users of warfarin. This assessment was done using insurance claims and administrative data from FDA's Mini-Sentinel pilot of the Sentinel Initiative. The results of this Mini-Sentinel assessment indicate that bleeding rates associated with new use of Pradaxa do not appear to be higher than bleeding rates associated with new use of warfarin, which is consistent with observations from the large clinical trial used to approve Pradaxa (the RE-LY trial).<sup>1</sup> (see [Data Summary](#)). FDA is continuing to evaluate multiple sources of data in the ongoing safety review of this issue.

<http://www.fda.gov/Drugs/DrugSafety/ucm326580.htm>



The NEW ENGLAND  
JOURNAL of MEDICINE



## Perspective

### Dabigatran and Postmarketing Reports of Bleeding

Mary Ross Southworth, Pharm.D., Marsha E. Reichman, Ph.D., and Ellis F. Unger, M.D.  
N Engl J Med 2013; 368:1272-1274 | April 4, 2013 | DOI: 10.1056/NEJMp1302834

Share: [f](#) [t](#) [g+](#) [in](#) [+](#)

Article

*"...large numbers of reported cases of bleeding with dabigatran is an example of stimulated reporting. The Mini-Sentinel assessment suggests that bleeding rates with dabigatran are not higher than those with warfarin, a finding that is consistent with the results of RE-LY"*  
-April 2013

# Sentinel Journey – Dabigatran Example (continued)

**CMS/SafeRx  
Protocol based  
Investigation  
Final statistical  
Analysis plan  
(06/2013)**

**Mini-sentinel Rivaroxaban  
Protocol Based Assessment  
(level 3- *like*) (03/2014)**

**Mini-sentinel  
Protocol Based Assessment  
(level 2-*like*) (03/2014)**

**Drug Safety  
Communication based  
on CMS Study  
(05/2014)**

# Dabigatran Example

## Protocol Based Assessment (level 2 *like* query)

### Protocol



#### MINI-SENTINEL MEDICAL PRODUCT ASSESSMENT

#### A PROTOCOL FOR ASSESSMENT OF DABIGATRAN

Version 2

March 18, 2014

Prior versions:

Version 1: December 31, 2013

Prepared by: Alan S. Go, MD<sup>1</sup>, Daniel Singer, MD<sup>2</sup>, T. Craig Cheetham, PharmD MS<sup>3</sup>, Darren Toh, ScD<sup>4</sup>, Marsha Reichman, PhD<sup>5</sup>, David Graham, MD MPH<sup>5</sup>, Mary Ross Southworth, PharmD<sup>6</sup>, Rongmei Zhang PhD<sup>7</sup>, Monika Houstoun, PharmD<sup>5</sup>, Yu-te Wu PhD<sup>7</sup>, Katrina Mott MS<sup>5</sup>, Joshua Gagne, PharmD ScD<sup>8</sup>

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### Adjusted Analysis

- New user cohort study
- Propensity score matching by site to control for confounding
- Primary analysis is time to event using cox regression stratified by site

[http://www.mini-sentinel.org/work\\_products/Assessments/Mini-Sentinel\\_Protocol-for-Assessment-of-Dabigatran.pdf](http://www.mini-sentinel.org/work_products/Assessments/Mini-Sentinel_Protocol-for-Assessment-of-Dabigatran.pdf)



# Dabigatran Example

## CMS – SafeRx Protocol Based Assessment

### Circulation

#### Cardiovascular, Bleeding, and Mortality Risks in Elderly Medicare Patients Treated with Dabigatran or Warfarin for Non-Valvular Atrial Fibrillation

Running title: *Graham et al.; Comparative safety of dabigatran and warfarin*

David J. Graham, MD, MPH<sup>1</sup>; Marsha E. Reichman, PhD<sup>1</sup>; Michael Wernicke, BA<sup>2</sup>;  
Rongmei Zhang, PhD<sup>3</sup>; Mary Ross Southworth, PharmD<sup>4</sup>; Mark Levenson, PhD<sup>3</sup>;  
Ting-Chang Sheu, MPH<sup>2</sup>; Katrina Mott, MHS<sup>1</sup>; Margie R. Goulding, PhD<sup>1</sup>;  
Monika Houstoun, PharmD, MPH<sup>1</sup>; Thomas E. MaCurdy, PhD<sup>2,5</sup>; Chris Worrall, BS<sup>6</sup>;  
Jeffrey A. Kelman, MD, MMSc<sup>6</sup>

<sup>1</sup>Office of Surveillance and Epidemiology, Center for Drug Evaluation and Research, Food and Drug Administration, Silver Spring, MD; <sup>2</sup>Acumen LLC, Burlingame, CA; <sup>3</sup>Office of Biostatistics, Center for Drug Evaluation and Research, Food and Drug Administration, Silver Spring, MD; <sup>4</sup>Office of New Drugs, Center for Drug Evaluation and Research, Food and Drug Administration, Silver Spring, MD; <sup>5</sup>Dept of Economics, Stanford University, Stanford, CA; <sup>6</sup>Centers for Medicare & Medicaid Services, Washington, DC

Published online October 2014

The screenshot shows the FDA's Drug Safety Communication page for Pradaxa (dabigatran). The header includes the FDA logo and the text "U.S. Food and Drug Administration Protecting and Promoting Your Health". Below the header is a navigation bar with links to Home, Food, Drugs, Medical Devices, Radiation-Emitting Products, Vaccines, Blood & Biologics, Animal & Veterinary, Cosmetics, and Tobacco Products. The main content area is titled "Drugs" and includes a sidebar with links to Drug Safety and Availability, Drug Alerts and Statements, Importing Prescription Drugs, Medication Guides, Drug Safety Communications, Drug Shortages, Postmarket Drug Safety Information for Patients and Providers, Information by Drug Class, Medication Errors, and Drug Safety Podcasts. The main text area is titled "FDA Drug Safety Communication: FDA study of Medicare patients finds risks lower for stroke and death but higher for gastrointestinal bleeding with Pradaxa (dabigatran) compared to warfarin". It includes a summary of the study findings and a link to the full Drug Safety Communication (PDF - 103KB). There is also a section for "Safety Announcement" with a table of contents and a "References" section.

*"In this study...Pradaxa was associated with a lower risk of clot-related strokes, bleeding in the brain, and death, than warfarin. The study also found an increased risk of major gastrointestinal bleeding with use of Pradaxa as compared to warfarin."*  
-May 2014

# Rivaroxaban Example Protocol Based Assessment (level 3 *like* query)

## Protocol



### MINI-SENTINEL SURVEILLANCE PLAN

#### MINI-SENTINEL PROSPECTIVE ROUTINE OBSERVATIONAL MONITORING PROGRAM TOOLS (PROMPT): RIVAROXABAN SURVEILLANCE

Version 2  
March 28, 2014  
Prior versions:  
Version 1: January 13, 2014

Prepared by: Ryan Carnahan, PharmD, MS, BCPP,<sup>1</sup> Joshua J. Gagne, PharmD, ScD,<sup>2</sup> Jennifer Nelson, PhD,<sup>3</sup> Bruce Fireman, MA,<sup>4</sup> Shirley Wang, PhD,<sup>2</sup> Azadeh Shoaibi, MS, MHS,<sup>5</sup> Marsha Reichman, PhD,<sup>6</sup> Rongmei Zhang, PhD,<sup>7</sup> Mark Levenson, PhD,<sup>7</sup> David Graham, MD, MPH,<sup>6</sup> Ram Tiwari, PhD,<sup>8</sup> Mary Ross Southworth, PharmD,<sup>6</sup> Patrick Archdeacon, MD, MS,<sup>7</sup> Aloka Chakravarty, PhD,<sup>7</sup> Margie Goulding, PhD,<sup>6</sup> Jeffrey Brown, PhD,<sup>8</sup> Candace Fuller, PhD,<sup>8</sup> Darren Toh, ScD,<sup>8</sup> Elizabeth Chrischilles, PhD, MS<sup>1</sup>

**Author Affiliations:** 1. Department of Epidemiology, University of Iowa College of Public Health, Iowa City IA 2. Division of Pharmacoepidemiology and Pharmacoeconomics, Department of Medicine, Brigham and Women's Hospital, Boston, MA 3. Biostatistics Unit, Group Health Research Institute and Department of Biostatistics, University of Washington, Seattle, WA 4. Kaiser Permanente Northern California, Oakland, CA 5. Office of Medical Policy, Center for Drug Evaluation and Research, Food and Drug Administration, Silver Spring, MD 6. Office of Surveillance and Epidemiology, Center for Drug Evaluation and Research, Food and Drug Administration, Silver Spring, MD 7. Division of Biometric VII, Office of Biostatistics, Office of Translation Sciences, Food and Drug Administration, Silver Springs MD 8. Department of Population Medicine, Harvard Medical School and Harvard Pilgrim Health Care Institute, Boston, MA

## Adjusted, Sequential Analyses

- New user cohort study
- Variable ratio propensity score matching by site to control for confounding
- Sequential looks (5) with Pocock stopping boundary
- Primary analysis is time to event using cox regression stratified by site

[http://www.mini-sentinel.org/work\\_products/Assessments/Mini-Sentinel\\_PROMPT\\_Rivaroxaban-Surveillance-Plan.pdf](http://www.mini-sentinel.org/work_products/Assessments/Mini-Sentinel_PROMPT_Rivaroxaban-Surveillance-Plan.pdf)

# Sentinel – Some Regulatory Science Challenges

- Regulatory response to a safety signal, considerations of
  - Statistical significance
  - Clinical relevance
  - Benefit-Risk
  - Speed of sharing results with public
  - confidence in results

## Take Home Messages

- Sentinel is an *active* surveillance system, one of many sources of safety data at FDA
- Mini-sentinel pilot implemented a structure to query sentinel and demonstrated its use
- Some methodological challenges lie ahead in post-market safety ( Big data/rare outcomes, stratification, sequential analyses)

# WANT TO GET INVOLVED?

# IMEDS Methods



## IMEDS Program

### Key Areas

**IMEDS will help the FDA, regulated industry, and clinicians improve patient care and the safety of medical products by focusing on three areas.**

#### IMEDS-Methods

Facilitate methods research aimed at monitoring safety of marketed medical products.

①

③

#### IMEDS-Evaluation

Use research findings to help understand the risks and benefits of marketed medical products.

②

#### IMEDS-Education

Train scientists in how to conduct methods research using electronic healthcare data.

Source: Susan Gruber slide at sentinel meeting in February 2015

## To find out more...

- Mini-sentinel website

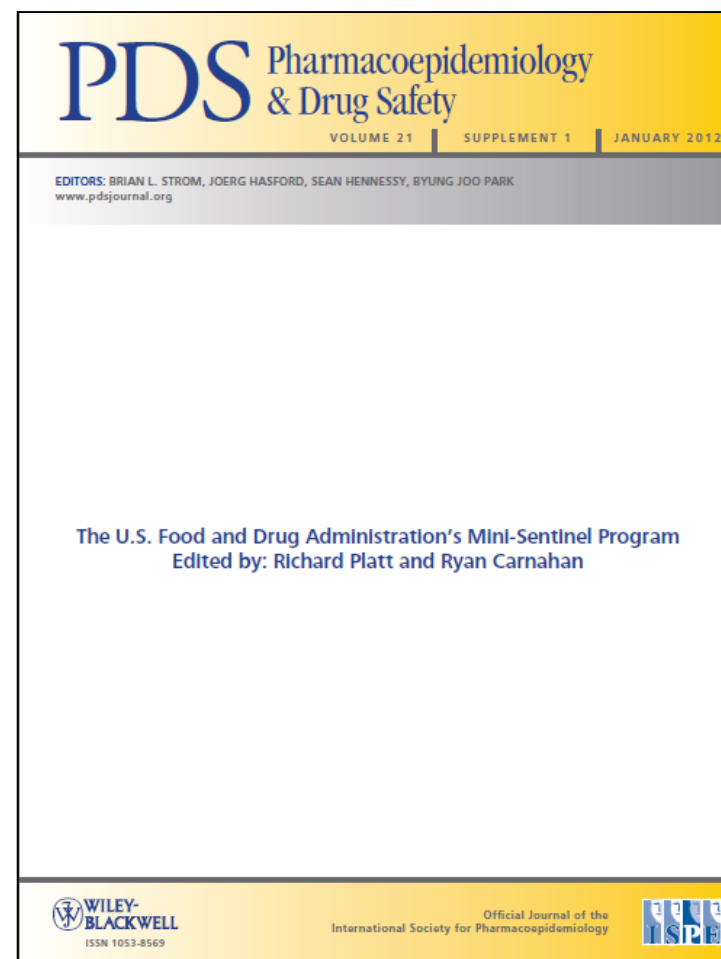
<http://www.mini-sentinel.org/>

- Sentinel Initiative  
Public Workshop

<http://www.brookings.edu/events/2015/02/05-fda-sentinel-initiative-workshop>

- FDA/Sentinel  
initiative website

<http://www.fda.gov/Safety/FDASentinelInitiative/ucm149341.htm>



<http://onlinelibrary.wiley.com/doi/10.1002/pds.v21.S1/issuetoc>





# THANK YOU

# Back up

# Sentinel – Some Data Limitations

- Include claims data, will include more electronic medical records and lab data
- Ascertainment of exposure, drug dispensed and gaps in exposure
- Ascertainment of outcomes
- Ascertainment of confounders
- Safety outcomes are usually

---

Guidance for Industry and FDA Staff  
Best Practices for Conducting  
and Reporting  
Pharmacoepidemiologic Safety  
Studies Using Electronic  
Healthcare Data

U.S. Department of Health and Human Services  
Food and Drug Administration  
Center for Drug Evaluation and Research (CDER)

**Not Every Safety Question is  
Feasible in Sentinel**

## Sentinel – Some Design and Analyses Challenges

- Modeling rare outcomes
- Controlling and/or assessing
  - Unmeasured confounding bias
  - Confounding by indication, channeling biases
  - Selection bias
- Assessing time varying treatments and adherence

**Diagnostics and sensitivity analyses are important**

# Sentinel – Some Design and Analyses Challenges (continued)

- Working around limit on pooling data across sites
  - Control for confounders in each site
  - Subgroup analyses in each site
  - Simple stratified analyses across sites
- Sequential testing

Assessing heterogeneity across sites and in time is important

# Sentinel – Some Regulatory Science Challenges

- Regulatory response to a safety signal, considerations of
  - Statistical significance
  - Clinical relevance
  - Benefit-Risk
  - Confidence in results
  - Speed of sharing results

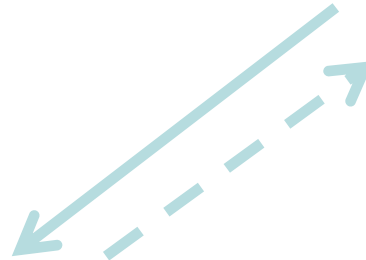
# Safety Question: Drug exposure(s) (test/comparator), outcome(s), and population of interest



Data: Electronic Healthcare Data



Feasibility?  
Generalizability?



Statistical Inference  
Question: Estimation, detect  
or rule out risk



YES

Statistical Analyses

Pre-specified  
Statistical  
Analysis Plan  
(SAP)



Safety Assessment



# Dabigatran, FAERS reports of Bleeding

**Table 1. Leading suspect drugs ranked by number of direct reports to FDA 2011**

Rank	Drug Name	Brand Name	Year Approved	Direct Reports
1	DABIGATRAN	PRADAXA	2010	817
2	WARFARIN	COUMADIN	1954	490
3	LEVOFLOXACIN	LEVAQUIN	1996	393
4	CARBOPLATIN	N/A	1989	376
5	LISINOPRIL	ZESTRIL	1988	351
All other drugs				18,575
Total (all cases)				21,002

Source: Institute of Safe Medication Practice Reporting on FAERS data

# Why Safety Question Post-Marketing?

- Biological plausibility of adverse event
- Pre-clinical signal
- Imbalance in clinical studies
- Safety signal in published studies
- Many adverse event reports

**Safety concern due to higher risk than expected  
and/or rare but serious risk**

# Sentinel – Some Data Limitations

- Includes mostly claims data
- Ascertainment of exposure, drug dispensed and gaps in exposure
- Ascertainment of outcomes and covariates
- Control for confounding
- Sa  
ra

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## Guidance for Industry and FDA Staff

Best Practices for Conducting  
and Reporting  
Pharmacoepidemiologic Safety  
Studies Using Electronic  
Healthcare Data

**Not Every Safety Question is  
Feasible in Sentinel**

<http://www.fda.gov/downloads/drugs/guidancecompliance/regulatoryinformation/guidances/ucm243537.pdf>