

---

# **Guidance for Industry and FDA Staff**

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

### ***DRAFT GUIDANCE***

**This guidance document is being distributed for comment purposes only.**

Comments and suggestions regarding this draft document should be submitted within 60 days of publication in the *Federal Register* of the notice announcing the availability of the draft guidance. Submit comments to the Division of Dockets Management (HFA-305), Food and Drug Administration, 5630 Fishers Lane, rm. 1061, Rockville, MD 20852. All comments should be identified with the docket number listed in the notice of availability that publishes in the *Federal Register*.

For questions regarding this draft document contact (CDER) Judy Staffa 301-796-0540, or (CBER) Office of Communication, Outreach and Development at 800-835-4709 or 301-827-1800..

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

**February 2011  
Drug Safety**

---

# Guidance for Industry and FDA Staff

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

*Additional copies are available from:*

*Office of Communication  
Division of Drug Information, WO51, Room 2201  
Center for Drug Evaluation and Research  
Food and Drug Administration  
10903 New Hampshire Ave.  
Silver Spring, MD 20993-0002  
Phone: 301-796-3400; Fax: 301-847-8714  
druginfo@fda.hhs.gov*

<http://www.fda.gov/Drugs/GuidanceComplianceRegulatoryInformation/Guidances/default.htm>  
*and/or*

*Office of Communication, Outreach, and  
Development (OCOD)  
Center for Biologics Evaluation and Research  
Food and Drug Administration  
1401 Rockville Pike, Rockville, MD 20852-1448  
(Tel) 800-835-4709 or 301-827-1800  
Email: ocod@fda.hhs.gov*

<http://www.fda.gov/BiologicsBloodVaccines/GuidanceComplianceRegulatoryInformation/Guidances/default.htm>

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

**February 2011  
Drug Safety**

*Contains Nonbinding Recommendations*

*Draft — Not for Implementation*

**TABLE OF CONTENTS**

<b>I.</b>	<b>INTRODUCTION</b> .....	<b>1</b>
<b>II.</b>	<b>BACKGROUND</b> .....	<b>2</b>
<b>A.</b>	<b>Use of Electronic Healthcare Data Sets in Pharmacoepidemiologic Safety Studies</b> .....	<b>3</b>
<b>B.</b>	<b>Prior Guidelines and Guidance Documents</b> .....	<b>4</b>
<b>C.</b>	<b>PDUFA IV Commitment: Identification of Pharmacoepidemiology Best Practices and Development of Best Practices Guidance</b> .....	<b>5</b>
<b>III.</b>	<b>BEST PRACTICES — GENERAL CONSIDERATIONS</b> .....	<b>5</b>
<b>A.</b>	<b>Title and Detailed Study Summary</b> .....	<b>6</b>
<b>B.</b>	<b>Background</b> .....	<b>6</b>
<b>C.</b>	<b>Study Approach Considerations</b> .....	<b>6</b>
<b>D.</b>	<b>Study Team Expertise and Credentials</b> .....	<b>7</b>
<b>E.</b>	<b>Interpretation of Findings</b> .....	<b>7</b>
<b>IV.</b>	<b>BEST PRACTICES — DATA SOURCES</b> .....	<b>8</b>
<b>A.</b>	<b>Appropriateness of Data Source(s) in Addressing Safety Questions of Interest</b> .....	<b>8</b>
<b>B.</b>	<b>Enrollment and Comprehensive Capture of Care</b> .....	<b>9</b>
<b>C.</b>	<b>Country of Origin and Health System: Relevance to the United States</b> .....	<b>10</b>
<b>D.</b>	<b>Selection of Study Population</b> .....	<b>10</b>
<b>E.</b>	<b>Quality Assurance (QA) and Quality Control (QC)</b> .....	<b>11</b>
<b>F.</b>	<b>Study Timeframe and Lag Time Issues</b> .....	<b>11</b>
<b>V.</b>	<b>BEST PRACTICES — STUDY DESIGN</b> .....	<b>12</b>
<b>A.</b>	<b>Study Design Considerations</b> .....	<b>12</b>
1.	<i>Choice of Study Design</i> .....	<i>12</i>
2.	<i>Examples of Study Designs (Not All-Inclusive)</i> .....	<i>12</i>
3.	<i>Comparator Selection</i> .....	<i>12</i>
4.	<i>Study Timeframe</i> .....	<i>13</i>
5.	<i>Identification and Handling of Confounders and Effect Modifiers</i> .....	<i>13</i>
6.	<i>Sample Size and Statistical Power</i> .....	<i>14</i>
<b>B.</b>	<b>Study Design: Exposure Definition and Ascertainment</b> .....	<b>15</b>
1.	<i>Exposure Definition</i> .....	<i>15</i>
2.	<i>Exposure Ascertainment — Study Design</i> .....	<i>15</i>
3.	<i>Exposure Ascertainment — Data Source</i> .....	<i>16</i>
4.	<i>Exposure Ascertainment — Gaps in Therapy</i> .....	<i>16</i>
5.	<i>Exposure Ascertainment — Dose</i> .....	<i>16</i>
6.	<i>Exposure — Other Factors</i> .....	<i>17</i>
<b>C.</b>	<b>Study Design: Outcome Definition and Ascertainment</b> .....	<b>17</b>

***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

1. Medically and Scientifically Relevant Case Definition of Safety Outcomes of Interest.....	17
2. Validation of Outcomes.....	17
3. Outcome Definition — Procedures or Diagnoses .....	19
<b>VI. BEST PRACTICES — ANALYSES.....</b>	<b>19</b>
<b>A. Prespecified Analysis Plan .....</b>	<b>19</b>
<b>B. Additional Analyses .....</b>	<b>20</b>
<b>C. Use of Specific Statistical Techniques (e.g., To Minimize Confounding).....</b>	<b>20</b>
<b>D. Sensitivity Analyses.....</b>	<b>20</b>
<b>E. Linking or Pooling Data from Different Sources.....</b>	<b>20</b>
<b>F. Assessment and Handling of Missing and Uninterpretable Data.....</b>	<b>20</b>
<b>G. Quality Assurance (QA) and Quality Control (QC).....</b>	<b>21</b>
<b>H. Describe Procedures To Ensure Accuracy of Data Management and Analysis Process.....</b>	<b>21</b>
<b>GLOSSARY.....</b>	<b>22</b>
<b>BIBLIOGRAPHY .....</b>	<b>25</b>

# Guidance for Industry and FDA Staff<sup>1</sup>

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

This draft guidance, when finalized, will represent the Food and Drug Administration's (FDA's) current thinking on this topic. It does not create or confer any rights for or on any person and does not operate to bind FDA or the public. You can use an alternative approach if the approach satisfies the requirements of the applicable statutes and regulations. If you want to discuss an alternative approach, contact the FDA staff responsible for implementing this guidance. If you cannot identify the appropriate FDA staff, call the appropriate number listed on the title page of this guidance.

### I. INTRODUCTION

This guidance is meant to describe best practices pertaining to conducting and reporting on *pharmacoepidemiologic safety studies*<sup>2</sup> that use *electronic healthcare data sets*, which include *administrative claims data* and *electronic medical record (EMR)* data. The guidance includes recommendations for documenting the design, analysis, and results of pharmacoepidemiologic safety studies to optimize FDA's review of protocols and final reports that are submitted to the Agency for these types of studies. For purposes of this guidance, the term *pharmacoepidemiologic safety study* refers to an *observational study* designed to assess the risk attributed to a drug exposure and to test pre-specified hypotheses. For ease of reference, this guidance uses the term *drug* to refer to all drug products, including biological products that also meet the definition of drug in the Federal Food, Drug, and Cosmetic Act (the FD&C Act), regulated by CDER and CBER. Medical devices are not within the scope of this guidance.

This guidance is intended to provide the following:

- Consistent guidance for industry to use when submitting pharmacoepidemiologic safety study protocols and final reports to FDA so that study protocols and final reports submitted to FDA contain sufficient information to permit thorough review;
- A framework for FDA reviewers to use when reviewing and interpreting these submissions; and
- Consistent guidance for FDA to use when conducting these studies.

The focus of this guidance is on best practices that specifically apply to pharmacoepidemiologic safety studies using electronic healthcare data sets. Although the guidance is not intended to

<sup>1</sup> This guidance has been prepared by the Office of Surveillance and Epidemiology in the Center for Drug Evaluation and Research (CDER) in cooperation with the Center for Biologics Evaluation and Research (CBER) at the Food and Drug Administration.

<sup>2</sup> All terms presented in *bold italics* at first use in this guidance are defined in the Glossary.

## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

40 address broad, basic epidemiologic principles, many of the concepts discussed in the guidance  
41 may apply more broadly to pharmacoepidemiologic safety studies using other types of data, as  
42 well as descriptive studies of drug exposure or safety outcomes using electronic healthcare data.  
43 FDA encourages industry to inform FDA of all pharmacoepidemiologic safety studies; to submit  
44 plans and protocols for such studies before study initiation; and to submit comprehensive final  
45 reports with detailed methods and results to FDA in a timely manner.<sup>3</sup>

46  
47 This guidance does not address ***real-time active safety surveillance*** studies, as this field is still  
48 rapidly evolving and it is not possible at this time to recommend sound best practices.<sup>4</sup> This  
49 guidance is not intended to be prescriptive with regard to choice of study design or type of  
50 analysis and does not endorse any particular type of data resource or methodology. Finally, it  
51 does not provide a framework for determining the appropriate weight of evidence of studies from  
52 this data stream in the overall assessment of drug safety, as this appraisal represents a separate  
53 aspect of the regulatory decision-making process and is best accomplished in the context of the  
54 specific safety issue under investigation.

55  
56 FDA's guidance documents, including this one, do not establish legally enforceable  
57 responsibilities. Instead, guidance documents describe the Agency's current thinking on a topic  
58 and should be viewed only as recommendations, unless specific regulatory or statutory  
59 requirements are cited. The use of the word *should* in Agency guidances means that something  
60 is suggested or recommended, but not required.

## 61 **II. BACKGROUND**

62  
63  
64 The process of FDA regulatory decision-making on drug safety issues has several interrelated  
65 aspects.

- 66 • Initially, there is reported evidence of an association between a particular drug and an  
67 adverse event. This evidence mostly emerges from one or more of the following data  
68 streams: randomized controlled trials (RCTs), spontaneous adverse event case reports, or  
69 pharmacoepidemiologic safety studies.
- 70 • Assessment of evidence from the pharmacoepidemiologic safety study data stream involves  
71 an evaluation of the design and conduct of studies and final reports pertaining to the  
72 purported association of drug and outcome; additional studies might be initiated to further  
73 examine the association.

---

<sup>3</sup> The Food and Drug Administration Amendments Act of 2007 (FDAAA) (Public Law 110-85) amended the the FD&C Act to require submission of information pertaining to required studies (see section 505(o)(3)(E)(ii) of the FD&C Act (21 U.S.C. 355(o)(3)(E)(ii))), as well as on the status of any required pharmacoepidemiologic studies and the status of other related studies undertaken to investigate a safety issue, including pharmacoepidemiologic safety studies.

Section 506B of the FD&C Act requires sponsors to report on studies that the sponsors have agreed to conduct; these requirements are included in the current FDA regulations for annual reports: 21 CFR 314.81(b)(2)(vii) for NDAs, 21 CFR 314.98 for ANDAs, and 21 CFR 601.70 for BLAs.

<sup>4</sup> More specifically, the use of electronic healthcare data sets for hypothesis-generation (signal detection) or hypothesis-strengthening (signal strengthening), which is an intermediate step between hypothesis-generation and hypothesis-testing, is beyond the scope of this guidance.

## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

- 74 • The evidence generated from the different data streams is then integrated and weighed by a  
75 multidisciplinary team to arrive at an overall conclusion regarding the relationship of the risk  
76 of the drug and a re-assessment of benefit and risk.
- 77 • Finally, FDA determines whether regulatory action is warranted and what communication is  
78 needed to convey important safety information to medical providers, patients, and other  
79 stakeholders.

80 FDA regulatory decision-making on drug safety issues is an iterative process because regulatory  
81 decisions are informed by emerging evidence, including any additional studies that are initiated  
82 as mentioned above.

83

84 Drug-related adverse events of interest can be rare, making them difficult to study. For many  
85 potential associations between a drug and an adverse event, findings across studies can be  
86 inconsistent for a variety of reasons. However, because drug-related adverse events have the  
87 potential to broadly affect the public health, there is often an urgency to take regulatory action to  
88 address drug safety issues based on the available evidence, even if the data are less than optimal.  
89 One early aspect of regulatory decision-making is evaluating the evidence from  
90 pharmacoepidemiologic safety studies that formally test drug safety hypotheses. As described in  
91 this guidance, the best practices for the conduct and reporting of pharmacoepidemiologic safety  
92 studies using electronic healthcare data are intended to facilitate a more independent  
93 interpretation of findings from these studies.

### **A. Use of Electronic Healthcare Data Sets in Pharmacoepidemiologic Safety Studies**

94

95

96

97

98 The advent of new technologies and the ability to efficiently assemble electronic healthcare data  
99 sets for use in drug safety studies have provided many new opportunities for conducting  
100 pharmacoepidemiologic studies of drug safety issues. These technologies allow for the  
101 possibility of studying safety issues quickly (relative to alternative approaches) in real world  
102 healthcare environments involving large populations of patients. In addition, the development of  
103 innovative statistical methods has allowed investigators to study complex drug safety questions  
104 previously considered too difficult to examine outside of a clinical trial setting. However, these  
105 developments have also precipitated a great deal of discussion over the appropriate use of  
106 electronic healthcare data and statistical methods in conducting pharmacoepidemiologic safety  
107 studies.

108

109 This guidance does not address the case-by-case decision to pursue a pharmacoepidemiologic  
110 safety study using electronic healthcare data over any other type of study, as this decision is  
111 unique to each specific safety issue of interest.<sup>5</sup> Generally, however, these studies may be  
112 particularly useful when other forms of ***observational studies*** or clinical trials would be

---

<sup>5</sup> In some instances, when FDA is concerned about a serious risk, applicants are required to complete postmarketing studies (postmarketing requirements, or PMRs). For a full discussion of PMRs, refer to the draft guidance for industry, *Postmarketing Studies and Clinical Trials — Implementation of Section 505(o)(3) of the Federal Food, Drug, and Cosmetic Act*, which, when finalized, will represent the Agency's current thinking on this topic. FDAAA provides the specific circumstances when FDA can require the conduct of postapproval studies (see section 505(o)(3)(D)(i) of the Act).

## Contains Nonbinding Recommendations

Draft — Not for Implementation

113 infeasible (i.e., when the safety outcome is very rare) or when the study of outcomes or  
114 exposures in an interventional or prospective study would be unethical. There are also  
115 circumstances when a pharmacoepidemiologic safety study may not be appropriate or adequate  
116 to answer the safety question of interest, for example, if the safety outcome of interest is a  
117 subjective patient-reported outcome that is not typically collected in electronic healthcare data.

### 118 119 **B. Prior Guidelines and Guidance Documents**

120  
121 Previously published FDA guidance documents and other guidelines have informed the  
122 development of best practices for conducting pharmacoepidemiologic safety studies using  
123 electronic healthcare data. FDA’s 2005 guidance entitled *Good Pharmacovigilance Practices*  
124 *and Pharmacoepidemiologic Assessment* (FDA 2005 guidance), which is much broader in scope  
125 than the current guidance (focusing both on pharmacovigilance and all types of  
126 pharmacoepidemiologic studies), includes an abbreviated section on observational studies.<sup>6</sup>  
127 Another document on general best practices for pharmacoepidemiologic studies, the  
128 International Society for Pharmacoepidemiology’s (ISPE’s) *Guidelines for Good*  
129 *Pharmacoepidemiology Practices* (GPP) (ISPE guidelines), highlights the following critical  
130 factors for all pharmacoepidemiologic studies to address:

- 131 • Providing a written protocol, with dated amendments and justifications
- 132 • Performing a critical review of the literature to facilitate the identification of knowledge  
133 gaps in the current evidence base for safety issue(s) of interest and how the current or  
134 proposed study contributes to this evidence base
- 135 • Ensuring human subject protection
- 136 • Providing confidence intervals in addition to p-values; although p-values address the  
137 issue of statistical significance, confidence intervals quantify the precision of the risk  
138 estimates
- 139 • Including both absolute and relative risk estimates to assist in the interpretation of the  
140 public health impact of the findings
- 141 • Archiving of relevant study documents and data sets

142  
143 The Consolidated Standards of Reporting Trials (CONSORT) statement (Moher, et al.), created  
144 to improve clinical trials research reporting and subsequently supported by medical journals,  
145 serves as an example of how basic reporting standards can improve the quality of reports on  
146 *clinical* trials. The Strengthening the Reporting of Observational Studies in Epidemiology  
147 (STROBE) statement (von Elm, et al.) provides guidelines for reporting *observational* studies.<sup>7</sup>  
148 STROBE was created to address the fact that there is often missing information in published  
149 observational epidemiologic studies (von Elm, et al. 344).

---

<sup>6</sup> We update guidances periodically. To make sure you have the most recent version of a guidance, check the CDER guidance page at <http://www.fda.gov/Drugs/GuidanceComplianceRegulatoryInformation/Guidances/default.htm> or CBER guidance page at <http://www.fda.gov/BiologicsBloodVaccines/GuidanceComplianceRegulatoryInformation/Guidances/default.htm>.

<sup>7</sup> The term *reporting* in these documents means the transparent disclosure of information to the public describing critical methodological and scientific aspects of the study to enable the public to “assess the strengths and weaknesses of the study design, conduct, and analysis.” The term does not refer to regulatory reporting requirements (von Elm, et al. 344).



## *Contains Nonbinding Recommendations*

*Draft — Not for Implementation*

150  
151 The FDA 2005 guidance, the ISPE guidelines, and the STROBE provide general guidance  
152 applicable to **all** pharmacoepidemiologic safety studies. The unique characteristics of studies  
153 that involve the use of electronic healthcare data warrant more specific guidance. This best  
154 practices guidance provides criteria that apply specifically to the design, analysis, conduct, and  
155 documentation of pharmacoepidemiologic safety studies using electronic healthcare data with  
156 protocols and reported results submitted to FDA.

### 157 158 **C. PDUFA IV Commitment: Identification of Pharmacoepidemiology Best** 159 **Practices and Development of Best Practices Guidance**

160  
161 The Prescription Drug User Fee Amendments of 2007 (PDUFA IV) authorized a significant  
162 expansion of the postmarket focus under the PDUFA program.<sup>8</sup> Under PDUFA IV, FDA agreed  
163 to specific commitments to enhance and modernize the drug safety system.<sup>9</sup> One FDA  
164 commitment was to identify pharmacoepidemiologic safety study best practices and to develop a  
165 guidance describing these practices; the current guidance is intended to fulfill this commitment.  
166 Toward this end, FDA initially held a public workshop in May 2008 to obtain input from experts  
167 in the field and the public regarding the use of electronic healthcare data in  
168 pharmacoepidemiologic safety studies of drug safety issues. FDA carefully considered all oral  
169 and written public comments from the workshop and its docket when creating the current  
170 guidance.

### 171 172 **III. BEST PRACTICES — GENERAL CONSIDERATIONS**

173  
174 FDA encourages investigators to develop thoughtful, scientific approaches to answer drug safety  
175 questions of interest. Overall, investigators should clearly articulate the science-based rationale  
176 for all choices made in the proposed study protocols and final reports. Investigators should  
177 submit protocols to FDA before study initiation and final reports upon completion for all  
178 pharmacoepidemiologic safety studies using electronic healthcare data.<sup>10</sup> A scientifically valid  
179 study protocol should be developed by the investigators by predefining certain elements related  
180 to the design, analysis, conduct, and reporting of the study. All those involved in developing the  
181 protocol and their roles should be specified. **All of the elements described within this**  
182 **guidance should be addressed in the protocol.** Any changes to the initial protocol after initial  
183 collection of data should be justified and documented. It is also important to discuss the  
184 potential impact of these protocol changes when interpreting results at the end of the study.  
185 Published studies submitted to FDA should be accompanied by supplemental documents that  
186 provide these elements.

---

<sup>8</sup> FDAAA, Title I, Prescription Drug User Fee Amendments of 2007.

<sup>9</sup> See the letter from the Secretary of Health and Human Services to the Chairman of the Committee on Health, Education, Labor, and Pensions of the Senate and the Chairman of the Committee on Energy and Commerce of the House of Representatives, as set forth in the Congressional Record, at <http://www.fda.gov/ForIndustry/UserFees/PrescriptionDrugUserFee/ucm119243.htm>.

<sup>10</sup> 21 CFR 314.81(b)(2)(viii).

## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

187  
188  
189  
190  
191  
192  
193  
194  
195  
196  
197  
198  
199  
200  
201  
202  
203  
204  
205  
206  
207  
208  
209  
210  
211  
212  
213  
214  
215  
216  
217  
218  
219  
220  
221  
222  
223  
224  
225  
226  
227  
228  
229  
230  
231

### **A. Title and Detailed Study Summary**

Each protocol and final report should include a study title that indicates the type of pharmacoepidemiologic safety study design (e.g., cohort, case-control) employed in the study. The report should contain a detailed study summary that concisely describes the critical elements listed below. Although these elements are not uniquely applicable to pharmacoepidemiologic safety studies using electronic healthcare data, they are useful to summarize the key points of these types of studies.

- Scientific goals, study objectives, and pre-specified hypotheses
- Study design, including **comparator groups**
- Study population and time period of study
- Data sources used
- Drug exposures of interest
- Drug safety outcomes of interest
- Methods to control for sources of bias
- Brief, balanced description of the results, interpretation of study findings, and key study limitations
- Public health impact

### **B. Background**

A brief background of the drug(s) and safety concern(s) under investigation provides a context for the investigation. This information should include a **brief** description of prior evidence or suspicions prompting the study initiation, the strengths and weaknesses of previous studies on this issue, and some general information about the therapeutic class and use of the study drug(s). Based on this background and the identified gaps in evidence, investigators should establish concise study objectives and specific, feasible hypotheses. The subsequent development of the study design is then based on these objectives and hypotheses.

### **C. Study Approach Considerations**

Once the pre-specified hypotheses are identified, the study approach, including the selection of data sources, study design, and analysis plan, can be developed. It is important for investigators to elaborate on the reasons for their choices of study design, selection of databases, and analysis plan as they pertain to these hypotheses. FDA encourages investigators to briefly describe any alternative study approaches and databases they considered before arriving at the proposed approach and to clarify why those alternatives were neither feasible nor optimal in the context of answering the specific study questions. The discussion should reflect an in-depth understanding of the use of the drug(s) of interest, the safety outcome(s) of interest, the usual treatment of the safety outcome(s) of interest, and the capture of both the exposure and safety outcome in relevant patient populations using electronic healthcare data sources. Results of any preliminary or feasibility studies should be included.

## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

232 In the discussion of the study approach, it is important to explain if the use of more than one data  
233 source is appropriate. Multiple data sources can be used to increase study sample size by  
234 designing a multi-site study (using the same design and analysis plan across multiple data  
235 sources from different sites); if so, it is critical to address issues or concerns related to assembly  
236 of analytic data sets and data pooling in the development of the analysis plan. Multiple data  
237 sources can also be used separately, using the same and/or different design and analysis plans, to  
238 verify and replicate study findings. Use of multiple study designs and data sources may assist in  
239 addressing the hypotheses by increasing generalizability and robustness of findings and allowing  
240 for the study of different sub-populations of interest (Vandenbrouke 342).

241  
242 Specific aspects of best practices for the selection of the data sources, study design, and analysis  
243 plan to be described and included in any regulatory submission are discussed in detail in sections  
244 IV, V, and VI of this guidance.

### **D. Study Team Expertise and Credentials**

245  
246  
247 The protocol should include a description of the expertise and credentials of the study team,  
248 including their level of experience in using the specific data sources to be employed in the study.  
249 Because all existing electronic healthcare data sources used for pharmacoepidemiologic safety  
250 studies have unique features based on their original purpose and methods for collecting data and  
251 including patients, the inclusion of personnel on the study team with “hands-on” experience and  
252 knowledge of the data source will ensure appropriate use of the data. An experienced, balanced  
253 study team with the appropriate expertise is crucial to the successful execution of a safety study.

### **E. Interpretation of Findings**

254  
255  
256  
257 When interpreting findings, investigators should summarize the key results of the study,  
258 including the main measures of effect (including the absolute risk estimate if possible). In  
259 particular, findings of no association between the drug and safety outcome of interest should be  
260 presented in the context of the initial statistical power calculations; investigators should attempt  
261 to determine the level of risk that can be ruled out, given the study findings.

262  
263 Because statistical significance can be easy to achieve in large electronic data sets and, alone,  
264 does not exclusively determine the importance of the findings, it is critical for clinical  
265 significance to be considered when interpreting findings. In addition, the confidence interval  
266 should be provided to quantify the precision of the risk estimates and thus inform the  
267 interpretation of findings.

268  
269 Investigators should also discuss the limitations of the database and design and their impact on  
270 generalizability. Investigators should discuss key biases, the suspected magnitude and direction  
271 of those biases, and their impact on the interpretation of the study findings. Finally, investigators  
272 should place the study findings in the context of studies using other databases, populations, and  
273 study designs.

274  
275  
276

## *Contains Nonbinding Recommendations*

*Draft — Not for Implementation*

### 277 IV. BEST PRACTICES — DATA SOURCES

278  
279 FDA does not specifically endorse one type of data source over another; however, FDA  
280 encourages selection of data source(s) that are most appropriate to address the specific  
281 hypotheses. When submitting protocols or final reports to FDA, investigators should include in  
282 an appendix the names of all data sources used for the study and other relevant descriptive  
283 information discussed in more detail below.

#### 284 285 A. Appropriateness of Data Source(s) in Addressing Safety Questions of Interest

286  
287 Investigators should demonstrate a complete understanding of the electronic healthcare data  
288 source and its appropriateness to address specific hypotheses. Existing electronic healthcare data  
289 systems were generated for purposes other than drug safety investigations, and it is important to  
290 understand this limitation to use the data systems appropriately for investigations of a drug's  
291 safety. For example:

- 292 • Administrative claims data are generated to support payment for care; policies governing  
293 the approval and denial of such payments should be considered before using these data  
294 for investigations.
- 295 • EMR data are generated in the process of providing routine clinical care; therefore, it is  
296 important to consider guidelines for patient care and common clinical practices within  
297 that healthcare system that will influence the collection of data and any investigation  
298 based on the data.

299 Investigators should also describe historical accessibility to the data source(s) proposed to be  
300 used in the study. This description should include:

- 301 • how long the data source has been available to the investigator community,
- 302 • how often this data source has been used for pharmacoepidemiologic safety studies, and
- 303 • references for any relevant publications, including *validation* studies of safety outcomes  
304 of interest in the proposed study that are captured in the database (to be described further  
305 in section E).

306 This information will allow FDA reviewers to better understand how experienced the  
307 investigator community is in using the data source(s) that will be employed.

308  
309 Investigators should also demonstrate that each data source contains sufficient clinical  
310 granularity to capture the exposures and outcomes of interest in the appropriate setting of care.  
311 For example, outpatient data sources that do not include linkage to hospitalization data would not  
312 be appropriate for studying safety outcomes likely to result in hospitalization. It is also  
313 important to address the coding of available data and explain why the coding is sufficient for  
314 ascertainment of outcomes of interest and other important variables. For example, safety  
315 outcomes that cannot be identified using International Classification of Diseases (ICD) codes  
316 cannot be appropriately studied using data sources relying solely on ICD codes in claims data.

317  
318 Access to specific patient populations of interest (e.g., psychiatric, pediatric) may be important.  
319 The relevant populations to be used in a study should be described, including what constitutes  
320 *continuity of coverage* (see section IV.B) of patients included within the data source, so that it is  
321 clear that relevant exposures and outcomes will be captured during the study period. It is also

## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

322 important to ensure that the data source(s) contain a sufficient number of patients or patient  
323 follow-up time to ascertain outcomes of interest based on the hypothesized ***exposure risk***  
324 ***window***. Providing information about the ***churn rate*** is particularly helpful in determining if the  
325 data source(s) selected are appropriate for ascertaining delayed safety outcomes.

326

### **B. Enrollment and Comprehensive Capture of Care**

327

328  
329 Investigators using administrative claims data sources should address continuity of coverage  
330 (enrollment and disenrollment). This concept particularly applies to claims data sources in the  
331 United States because patients often enroll and disenroll in different health plans in relation to  
332 changes in employment or other life circumstances (Strom 221). The validity of a study using  
333 these data, however, depends in part on ensuring that the migration of patients in and out of the  
334 electronic healthcare data sources can be documented. Such documentation allows only periods  
335 of enrollment during which data are available on the patients of interest to be included in the  
336 study, and periods of disenrollment when data are not available on patients can be appropriately  
337 excluded. Definitions of enrollment or continuous coverage need to be developed and  
338 documented, particularly in studies using more than one data source.

339

340 Continuity of coverage of patients within a data source is especially important when employing  
341 EMR data sources, as the entire continuum of the patient's care might not be available in one  
342 EMR system. For example, a patient's visits to multiple physicians for treatment in different  
343 doctors' offices or hospitals might not be captured by a single practice-based EMR data source.  
344 In addition, patients in the United States do not typically "enroll" in physician practices, but  
345 rather see physicians as needed or as their insurance coverage allows. Therefore, when using an  
346 EMR data source, it is crucial to employ and describe methods to ensure complete observation  
347 and capture of patient care over time to facilitate the likelihood that all exposures and safety  
348 outcomes of interest will be captured. In the United States, primary care-based EMR networks  
349 may not capture hospitalizations or visits to specialists. If these are events of interest,  
350 investigators should specify how these events will be captured.

351

352 If a hospital data source alone is proposed, it is important to report whether outpatient care data  
353 are relevant to the study because they are often not currently captured in this type of data source.  
354 For example, data on outpatient drug exposures of interest may not be available using inpatient  
355 data sources alone. The converse also applies — if an outpatient data source alone is proposed,  
356 it is important to note that detailed data on drug exposures in the hospital setting are most often  
357 not available.

358

359 Over-the-counter (OTC) medications and dietary supplements are not typically captured  
360 systematically in electronic healthcare data because they are not prescribed by physicians and  
361 their costs are not always reimbursable under insurance plans. If these exposures are particularly  
362 relevant to the study question, then investigators should describe how they will address this  
363 informational gap.

364

## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

### **C. Country of Origin and Health System: Relevance to the United States**

365  
366  
367 In situations where use of a data source from a country other than the United States is proposed,  
368 it is important to provide:

- 369 • A discussion regarding why the data are most appropriate to address the specific  
370 hypotheses;
- 371 • Background information about the healthcare system (including method of diagnosis  
372 and preferred patterns of treatment of the disease(s) of interest) and to what degree  
373 relevant information is collected in the proposed data sources;
- 374 • A description of prescribing and utilization practices;
- 375 • Market availability for the treatment(s) of interest; and
- 376 • An explanation of how all these factors might affect the generalizability of the study  
377 results to the U.S. population.

378  
379 Reporting on these points is critical as there might be significant differences in the practice of  
380 medicine (including prescribing and use of medications) that directly affect the ability of a non-  
381 U.S. data source to address the specific hypotheses. Because of differences in practice  
382 guidelines, medication tiering (e.g., first-line, second-line), and patient selection in non-U.S.  
383 healthcare systems, patients taking a drug in the United States might differ in disease severity  
384 from patients taking the same drug in other countries. Furthermore, in the future, as we learn  
385 more about the association of pharmacogenetics and the risk of drug-related harms, it will be  
386 important to discuss the impact of potential variations in the distribution of patients'  
387 pharmacogenetic profiles outside the United States on the feasibility and generalizability of a  
388 pharmacoepidemiologic safety study.

### **D. Selection of Study Population**

389  
390  
391  
392 FDA encourages the use of explicit inclusion and exclusion criteria for the selection of the study  
393 population and provision of an appropriate explanation for the criteria selected. For proposed  
394 studies, we recommend providing specific estimates of relevant population size in the proposed  
395 data source, including the size of the exposed population. For studies involving elderly patients  
396 (age 65 and older) in the United States, it is important to describe the level of completeness of  
397 medical care and drug coverage, including direct access or linkage to Medicare data.<sup>11</sup>  
398 Obtaining data on patients with some types of serious and life-threatening conditions (e.g.,  
399 HIV/AIDS or cancer) can present a unique challenge as it might be difficult to fully capture drug  
400 coverage and medical care because state- or federal-based clinics, experimental clinical trial  
401 based therapies, and increased use of pharmaceutical company assistance programs are not  
402 captured in most electronic healthcare data sources. If these issues are relevant to the study  
403 question of interest, it is especially important to report how they will be addressed in the  
404 protocol. As previously stated, FDA encourages the use of multiple data sources and populations  
405 when possible to verify, validate, and replicate findings.

406

---

<sup>11</sup> For more information on Medicare data, please access the CMS Web site link:  
<http://www.cms.hhs.gov/medicareGenInfo>.

## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

407 FDA recommends the use of a flow diagram or other accounting scheme to display the  
408 disposition of study subjects at various stages of inclusion or exclusion. A diagram or schematic  
409 provides an easily visible record of study process (Esposito, et al. 648; Friedman, et al. 1910;  
410 Schneeweiss, et al. 773; Weiner, et al. 663).

411

### **E. Quality Assurance (QA) and Quality Control (QC)**

413

414 Investigators should ensure that they are aware of the ***quality assurance (QA)*** and ***quality***  
415 ***control (QC)*** procedures used by the data holders and how the procedures could affect data  
416 integrity and the study. FDA recommends that investigators address the following topics:

- 417 • The general procedures used by the data holders to ensure completeness, consistency  
418 and accuracy of data collection and management
- 419 • The frequency and type of any data error corrections or changes in data adjudication  
420 policies implemented by the data holders during the period of relevant data collection
- 421 • A description of any peer reviewed publications examining data quality and/or  
422 validity, including the relationships of the investigators with the data source(s)
- 423 • Any updates and changes in coding practices (e.g., ICD codes) across the study  
424 period that are relevant to the outcomes of interest
- 425 • Any changes in key data elements (which can change over time) during the timeframe  
426 of the study and the potential effect of the changes on the study
- 427 • A report on the extent of missing data over time (i.e., the percentage of a particular  
428 variable of interest for which data are not available) and procedures for handling this  
429 issue (e.g., exclusion, imputation)

430

### **F. Study Timeframe and Lag Time Issues**

432

433 Investigators should define the ***study timeframe*** (which spans from the beginning of the “look  
434 back period,” when the investigator looks back in the database before drug exposure to ascertain  
435 baseline patient covariate data) to the end of the exposure risk window. Investigators should  
436 demonstrate that the timeframe they selected is appropriate to address the specific hypotheses;  
437 this should include a discussion of temporal changes in the standard of care, the availability of  
438 other treatments, and other factors. Use patterns of a drug may change over time and result in  
439 potential differences in the patients exposed to the drug over time that may be relevant for the  
440 safety outcome(s) of interest. Investigators should:

- 441 • address the interval from drug approval until the study timeframe begins,
- 442 • describe in detail the lag time between the actual occurrence of outcomes and the  
443 availability of data for investigations using the data source, and
- 444 • describe the effect of the lag time on the study timeframe, data completeness, and the  
445 proposed feasibility of the proposed study.

446

## *Contains Nonbinding Recommendations*

*Draft — Not for Implementation*

### 447 V. BEST PRACTICES — STUDY DESIGN

448

#### 449 A. Study Design Considerations

450

##### 451 1. *Choice of Study Design*

452

453 FDA does not endorse a specific type of study design because the choice of study design depends  
454 on both the drug and the safety issue of interest and should be tailored to address the specific  
455 hypotheses of interest. Investigators should start from the study questions of interest and then  
456 determine which data source(s) and design are most appropriate to address these questions.

457 Clear reasons for selecting a particular study design should be included with the study protocol  
458 and final report.

459

##### 460 2. *Examples of Study Designs (Not All-Inclusive)*

461

462 The most commonly used types of observational pharmacoepidemiologic safety studies include  
463 cohort studies, case-control studies, and nested case-control studies. Other designs, including  
464 case-cohort or case-crossover design, can be used depending on the study question of interest  
465 and what is known about the postulated relationship between drug exposure and the specific  
466 safety outcomes of interest. Overall, different study designs can be appropriate depending on the  
467 study question(s). FDA discourages the use of *one size fits all* study designs. For purposes of this  
468 guidance, a *one size fits all* study design is a design employed by an investigator in a number of  
469 pharmacoepidemiologic safety studies, irrespective of appropriateness in addressing study  
470 questions of interest and specific hypotheses.

471

##### 472 3. *Comparator Selection*

473

474 Selection of an appropriate comparator group(s) is a critical part of a pharmacoepidemiologic  
475 safety study. FDA encourages the use of multiple comparator groups in any study design when  
476 it is feasible and relevant, as this strategy can serve to enhance the validity of safety studies  
477 (Waning, et al. 57). If multiple comparator groups are employed, the primary comparator for  
478 statistical purposes should be identified and the protocol should include an explanation of the  
479 rationale for the selection of each group with respect to the study questions of interest.

480

481 It is ideal to use a comparator group taking a drug used to treat the same disease, with the same  
482 level of severity, from the same time period as the cohort exposed to the drug of interest or cases  
483 for the study were selected. However, in some circumstances it may not be possible to find an  
484 appropriate comparator group from the same time period. In this case, investigators might elect  
485 to use *historical comparators*, which are comparators selected from a different time period than  
486 the cases. If historical comparators are used, it is important to explain the rationale behind their  
487 use and to address the associated limitations.

488

489 Issues that are especially relevant to comparator selection for pharmacoepidemiologic safety  
490 studies of preventative therapeutics, such as vaccines, should be considered. One such issue is  
491 the “healthy vaccinee effect.” In contrast to most drugs, vaccines are generally given to persons  
492 who are healthy. As a result, confounding could occur if vaccinated persons are compared to



## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

493 unvaccinated persons, who might be very different (e.g., they may be more ill or lack access to  
494 primary medical care). Many factors associated with avoidance or delay in vaccination may be  
495 associated with an increased risk of the outcomes of interest (Fine, et al. 122). It can also be  
496 appropriate to use self-control, or case-crossover designs, where the same person serves as his or  
497 her own control (Maclure 145). If this approach is employed, the protocol and final report  
498 should describe the relevant limitations of this study design.

### 4. *Study Timeframe*

501  
502 It is important to explain the rationale behind the study timeframe selected with respect to the  
503 safety outcomes of interest. As previously defined, the study timeframe spans from the  
504 beginning of the “look back period,” when the investigator looks back in the database before  
505 drug exposure to ascertain baseline patient covariate data, to the end of the follow-up period.

506  
507 Although the selection of study timeframe is important in all pharmacoepidemiologic studies,  
508 this factor is especially important for such studies using *electronic healthcare data* because there  
509 are usually significant lag times in data availability. Investigators should specifically include the  
510 time period for ascertainment of the relevant outcomes and covariates in the protocol, with  
511 assurance that complete data are available for the timeframe selected. The use of clear diagrams  
512 and pictorial displays to describe study timeframes is encouraged (Schneeweiss and Avorn 329).

### 5. *Identification and Handling of Confounders and Effect Modifiers*

513  
514  
515  
516 The suspicion of unidentified or inadequately addressed confounding can threaten the validity of  
517 all pharmacoepidemiologic safety studies. Therefore, it is important for investigators to describe  
518 the processes used to identify potential confounders and to provide a scientific rationale for the  
519 methods selected to handle them. The specific methods and an assessment of their performance  
520 should be addressed in study protocols and reports. There are multiple epidemiologic and  
521 statistical methods, some traditional (e.g., multiple regression) and some innovative (e.g.  
522 propensity scores), for identifying and handling confounding. Although FDA does not endorse  
523 or require any particular method, a few methods that have been used frequently in  
524 pharmacoepidemiologic safety studies using electronic healthcare data are discussed in this  
525 guidance. FDA encourages the continued development, use, and evaluation of innovative  
526 methods for controlling confounding in pharmacoepidemiologic safety studies using electronic  
527 healthcare data.

528  
529 One approach that has been used increasingly to address confounding is based on the propensity  
530 score. A propensity score for an individual is the predicted probability of being treated with a  
531 particular drug (usually the drug under study) conditioned on the individual’s measured covariate  
532 values within the relevant database(s). The score can be used to achieve balance in the  
533 distribution of potential confounding factors between the exposed (to the drug of interest) and  
534 comparator with respect to the measured covariates (Rosenbaum and Rubin; D’Agostino).  
535 ***Diagnostics*** of the propensity score model should be presented to allow for assessment of its  
536 performance and fit. A full discussion of propensity scores is beyond the scope of this guidance  
537 but the articles cited in the bibliography of this guidance, as well as others, discuss this model  
538 and its appropriate application to pharmacoepidemiologic safety studies in greater depth.

## *Contains Nonbinding Recommendations*

*Draft — Not for Implementation*

539  
540 Another approach used by some investigators to address confounding is to exclude patients who  
541 have risk factors for the outcome that are not related to the exposure of interest. This strategy  
542 can be appropriate, but might also have the unintended consequence of reducing sample size,  
543 precluding examination for effect modification, and limiting the generalizability of the results.  
544 An alternative approach to excluding such patients is to stratify by the unrelated risk factors,  
545 sample size permitting. The decision whether to exclude or stratify certain groups of patients  
546 based on other risk factors in a study should be made in the context of the specific hypotheses  
547 and fully explained and documented in the protocol. In general, it is preferable to stratify rather  
548 than exclude patients because it allows investigators to include all patient populations in the  
549 study, to maximize statistical power, and to study the impact of effect modification of these other  
550 risk factors. In general, the potential for effect modification by main demographic variables (e.g.,  
551 age, gender, and race), or pertinent co-morbidities, should be examined in the study. If  
552 significant effect modification is found, the risk estimates should be presented appropriately.  
553 However, if a particular group of patients is to be excluded from a study, the investigator should  
554 provide a detailed explanation of the exclusions and a discussion of the resulting limitations in  
555 study interpretation.

556  
557 ***Confounding by indication, or “channeling,”*** can be particularly problematic in  
558 pharmacoepidemiologic safety studies (Strom 797-8). Confounding by indication might lead to  
559 the appearance of an association between a drug and a safety outcome when the association is  
560 actually due to the underlying disease or indication for which the drug is prescribed. This is  
561 especially likely to occur when the drug of interest is preferentially prescribed to more severely  
562 ill patients. This type of confounding can be amenable to methods for controlling it or can be so  
563 pervasive as to preclude an observational study of the issue. Approaches to address this potential  
564 source of bias should be fully discussed by investigators in the study protocol.

565  
566 Drug exposures and medical conditions that are considered to be covariates should be measured  
567 **prior** to exposure to the drug of interest, to avoid controlling for factors that may actually be on  
568 the causal pathway (Hernan, et al. 176). It is critical to specify the “look back period,” which is  
569 the period of time the investigator looks back in the electronic healthcare data set to determine  
570 baseline covariates occurring prior to first drug exposure. Investigators should also indicate  
571 how ***time-varying confounders*** and potential unmeasured confounders (e.g., smoking, OTC drug  
572 use, or dietary supplement use) are operationally defined or explored. If a study takes place over  
573 many years, as the use of electronic healthcare data often makes possible, the investigators  
574 should consider ***time trend bias***, which refers to the evolution of medical practice and the  
575 diagnosis and treatment of disease over time, and report how this is addressed in the study.

### 576 577 *6. Sample Size and Statistical Power*

578  
579 Sample size requirements and statistical power should be estimated before initiating the study.  
580 In addition, investigators should explain how the sample size was determined, including but not  
581 limited to relevant assumptions with pertinent justifications, formulas used to calculate the  
582 sample size, and a description accounting for the impact of anticipated exclusion criteria applied  
583 to the study population that was selected. It is especially important to provide the rationale  
584 behind the determination of sample size for rare outcomes (e.g., specific vaccine issues related to

## *Contains Nonbinding Recommendations*

*Draft — Not for Implementation*

585 an adverse outcome). The initial power calculations and the validity of underlying assumptions  
586 should be revisited at the end of the study in the context of the results, particularly in the case of  
587 negative findings.

588

### **B. Study Design: Exposure Definition and Ascertainment**

590

591

592

#### *1. Exposure Definition*

593 The definition of relevant exposure to a medical drug for the outcome of interest (referred to as  
594 the exposure risk window) and its measurement should be described in detail, both conceptually  
595 and operationally using the data source(s) chosen. By obtaining information from other sources,  
596 such as spontaneous report data, about the postulated exposure risk window, the likelihood of  
597 focusing on only relevant periods of exposure can be increased. For example, if an adverse  
598 outcome is known to only occur immediately after initial use of a drug and the exposure  
599 definition includes all of the patient's time on a drug, a significant amount of nonrelevant  
600 exposure time could be included and could produce biased risk estimates. All assumptions made  
601 in defining the exposure risk window should be clearly articulated and justified, including but  
602 not limited to when information about the timing of exposure and outcome is not known during  
603 the study design process. Sensitivity analyses might prove helpful in testing these assumptions  
604 (refer to section VI.D).

605

606 It is also critical to provide a rationale for the selection of the appropriate units for the exposure  
607 risk window (e.g., person-time, patients, prescriptions). Relevant drug interactions that could  
608 affect the measurement of the exposure risk window for the drug of interest should also be  
609 operationally defined if applicable. For example, if investigators are operationally defining  
610 concomitancy, they should state whether:

- 611 • drugs are considered as being used concomitantly by the same patient only if they are  
612 dispensed on the same day,
- 613 • drugs are considered as being used concomitantly by the same patient only if they have  
614 overlapping days supply,
- 615 • the patient has ever received prescriptions for the two drugs during the study, or
- 616 • another relevant definition is appropriate.

617 It is common practice to use dispensed prescriptions to define exposure risk windows in  
618 administrative claims data. If exposure is defined in other ways (e.g., using other clinical  
619 characteristics or medical diagnoses, prescription orders from EMR data), a discussion of the  
620 demonstrated validity of these definitions should be included.

621

622

623

#### *2. Exposure Ascertainment — Study Design*

624 As previously mentioned, the study design should be tailored to the study question of interest;  
625 FDA does not advocate for the use of any specific study designs. One type of cohort study  
626 design that has gained popularity is the new (incident) user design, based on first exposure to or  
627 use of the drug of interest. When employing a new user design, new users should be defined  
628 operationally and a rationale for this definition in the context of the study question should be  
629 provided. This information is critical for evaluating the accuracy of the exposure definition.

## *Contains Nonbinding Recommendations*

*Draft — Not for Implementation*

630 When defining new users, investigators should bear in mind that patients may have entered the  
631 electronic healthcare data system already using the drug of interest; therefore, look back periods  
632 should be defined to ensure that such patients are not incorrectly classified as new users.  
633

### 3. *Exposure Ascertainment — Data Source*

634  
635  
636 For a defined study period, it is important to demonstrate sufficient capture of drug exposures by  
637 the proposed data source. Exposure definitions should incorporate the coding system of the data  
638 source(s) used and reflect an understanding of the prescription, delivery and reimbursement  
639 characteristics of the drug in that data source. For example, in the United States, the definition  
640 should include the appropriate use of pharmacy codes (National Drug Codes or NDC codes)  
641 and/or procedure (“J”) codes<sup>12</sup> to capture drug use in various settings, especially in the case of  
642 non-oral drugs. For example, patients may be required to purchase the injectable drug in the  
643 pharmacy (NDC code) or the provider may purchase the injectable drug for the patient and bill  
644 for the drug and its administration (“J” code).  
645

646 When using an insurance-based data source, it is also important to address lack of capture of  
647 prescriptions not associated with co-payments if these drugs are relevant exposures for the study.  
648 Uncaptured prescriptions might include low cost generics and drugs obtained through programs  
649 in which certain drugs are provided at a standardized discounted rate, samples provided by  
650 pharmaceutical companies and dispensed by health care providers, and drugs sold through the  
651 Internet. This lack of capture and its effect on study validity should be addressed.  
652

### 4. *Exposure Ascertainment — Gaps in Therapy*

653  
654  
655 FDA recommends that investigators clearly explain how they will address potential gaps in  
656 therapy in the context of exposure ascertainment over time, especially for chronic therapies.  
657 Since patients often do not obtain refills exactly on time, apparent gaps in therapy often exist in  
658 electronic healthcare data, and decisions need to be made as to when these gaps are long enough  
659 to suggest true interruption of treatment. Intermittent therapies (e.g., drugs used to treat pain on  
660 an as-needed basis) and therapies for which samples are provided to patients (e.g., oral  
661 contraceptives) represent special challenges with regard to assessing actual time of exposure. It  
662 is critical that investigators address how they will operationally define exposure when studying  
663 these types of therapies.  
664

### 5. *Exposure Ascertainment — Dose*

665  
666  
667 Electronic healthcare data capture only what is either prescribed or dispensed to a patient, but not  
668 what the patient actually ingests. In certain circumstances, particularly in the case of drugs used  
669 chronically or those with fixed-dose regimens, it can be appropriate to infer dosage information  
670 from electronic healthcare data. FDA encourages investigators to provide the specific  
671 assumptions made when estimating the dose of the exposure (drug) of interest; this information  
672 is especially important when studying pediatric patients. It is also important to report how  
673 different dosage forms will be incorporated into the dosage calculation, if multiple forms are

---

<sup>12</sup> A drug’s *J code* — more properly, the Health Care Financing Administration (HCFA) common procedures coding system code — is used for submitting Medicare claims for reimbursement of outpatient care.

## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

674 available. This is an area in which sensitivity analyses may prove helpful in testing assumptions  
675 (refer to sections VI.D and V.B.1).

676

### 677 **6. *Exposure — Other Factors***

678

679 When using inpatient data, it is also important to consider the order of administration of drugs in  
680 relation to each other and to the outcomes of interest. This information may not be readily  
681 available in electronic healthcare data. If the exposure of interest is available as combination  
682 therapy, it is important to account for this fact when ascertaining total exposure (e.g., drugs to  
683 treat hypertension are commonly prescribed as combination drugs). If switching within the  
684 therapeutic class of the exposure of interest is common, it is important to address how exposure  
685 will be ascertained and defined. Repeated switching could significantly complicate exposure  
686 definition, but for many drugs will reflect real-world patient experience. In these circumstances,  
687 the approach taken to account for this phenomenon and the potential impact on generalizability  
688 should be described.

689

690 When using most EMR data, information on exposure is generally limited to products prescribed  
691 by health care providers. Without linkage to dispensing systems, it cannot be assumed that the  
692 patient actually filled the prescription. It is important for investigators to ensure the validity of  
693 EMR prescribing information before using it to define patient drug exposures.

694

### 695 **C. *Study Design: Outcome Definition and Ascertainment***

696

697 One of the most crucial steps in selecting a data source is determining whether it is appropriate  
698 for capturing the outcomes of interest. Because electronic healthcare data typically capture  
699 outcomes that are treated (or at least brought to the attention of a healthcare professional),  
700 outcomes representing mild symptoms — or the other extreme of sudden death without medical  
701 care — will not be well captured. Outcomes on the continuum between these two extremes may  
702 be captured to varying degrees by different types of data sources and should be assessed  
703 carefully before study initiation.

704

#### 705 **1. *Medically and Scientifically Relevant Case Definition of Safety Outcomes*** 706 ***of Interest***

707

708 When developing the case definition for the outcomes of interest, it is important to obtain both  
709 epidemiologic and clinical input. Case definitions for outcomes should be developed  
710 independently of drug exposure status, and exposure to the drug should not be an inherent  
711 component of the outcome definition. FDA recommends that investigators refrain from defining  
712 cases based on future exposure and/or excluding cases based on undocumented clinical  
713 judgment.

714

#### 715 **2. *Validation of Outcomes***

716

717 Because *electronic* administrative claims data are not collected for investigative purposes, but  
718 rather for patient care or reimbursement purposes, it is vitally important to ensure that medical  
719 outcomes of interest are validated (Lanes). Validation of administrative claims data is the

## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

720 process through which primary medical data (generally medical charts) are abstracted and  
721 reviewed to determine whether the patient actually experienced the event coded (or suggested by  
722 the algorithm if applicable) in the electronic data. Although this validation is critical for all  
723 safety studies, it is especially important for certain vaccine outcomes, as they are often rare  
724 events for which coding practices cannot be known or assumed. If the outcome has previously  
725 been validated, it is critical to reference literature documenting when and in which databases the  
726 validation was done. If referring to previous validation work, the investigator should describe it  
727 in detail, include a description of the population and database in which validation was performed,  
728 and provide the timeframe during which the validation work was performed. For studies without  
729 outcome validation, the investigator should provide appropriate justification of the outcome  
730 definition used.<sup>13</sup>

731  
732 FDA recommends that outcome definitions be specified and explained *a priori* and incorporate  
733 the coding system of the data source(s) used. In some situations, it can be appropriate to validate  
734 only a sample of cases. Information gathered in the outcome validation process should be  
735 incorporated into the analysis plan and protocol and, if appropriate, be submitted as a final  
736 protocol amendment. Investigators should consider the rarity of the outcome when considering  
737 the desired sensitivity and specificity of the coding algorithm. It is important to consider the  
738 often arbitrary ranking of coded primary and secondary hospital discharge diagnoses, and the  
739 associated limitations of these categories when selecting which diagnoses to choose as outcomes  
740 (e.g., the order of discharge diagnoses may not correspond to their medical importance). ICD  
741 codes in claims data are generally considered more reliable for inpatient outcomes than for  
742 outpatient outcomes, where “upcoding” and “downcoding” are practices commonly used to  
743 maximize reimbursement (Strom 220). Therefore, when using claims data, it is preferable to use  
744 and validate inpatient codes when defining outcomes whenever possible because these codes are  
745 often more reliable and generally reflect more serious diseases. In addition, it is important to  
746 report on the investigators’ ability to capture outcome severity in the databases employed.

747  
748 When describing the outcome validation process, it is also recommended to report on and justify  
749 the validation of key covariates (defined by medical claims diagnoses) that will be used in the  
750 primary analysis. If such justification is not available, this should be noted.

751  
752 It is important to note that the concept of validation is not as well defined when using EMR data.  
753 The strategy described above for validation in administrative claims data might not be relevant  
754 because the EMR might represent all available primary medical data for the patient encounter to  
755 be validated. There is still a scientific need, however, to develop and employ strategies for  
756 ensuring that the electronic data accurately reflect patient experience. For example, investigators  
757 might review any paper files or documents or follow up with health care providers to gain more  
758 information. As implementation of EMRs becomes more widespread, investigators will be  
759 challenged to develop innovative strategies to confirm electronic exposure and outcome data,

---

<sup>13</sup> One example of justification is referencing standardized case definitions. For example, for vaccine studies investigators could reference collections of standardized case definitions such as the International Brighton Collaboration (<http://www.brightoncollaboration.org>), which provides a growing repertoire of such definitions for vaccine safety investigations. The use or adaptation of definitions from these types of standardized case definition collections may facilitate comparisons of analyses between different studies.

## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

760 and FDA encourages such efforts as they are critical to ensure the validity of studies relying  
761 upon these data.

762

### 763 3. *Outcome Definition — Procedures or Diagnoses*

764

765 If the investigator is using procedures instead of or in addition to diagnoses as outcomes, it is  
766 important to explain the rationale behind this choice. Validation of the codes used, or  
767 justification for not validating, should also be included.

768

### 769 4. *Mortality as an Outcome*

770

771 Death is a particularly difficult outcome to ascertain reliably using electronic healthcare data.  
772 Although deaths that occur while under medical care are often documented in these data systems,  
773 reliable ascertainment of deaths can only be accomplished through linkage with vital statistics or  
774 other systems such as the Social Security Administration (SSA) or National Death Index (NDI)  
775 (NDI Web site).<sup>14</sup> These linkages can provide confirmation of death and date of death, but cause  
776 of death may require further information obtained from death certificates (NDI data provide  
777 cause of death information from the state death certificate but SSA data do not) (MacMahon and  
778 Pugh 76). The use of death certificate data is subject to all the known limitations of such data.

779

780 Given that deaths while not under medical care may not be captured in electronic healthcare data  
781 systems, patients who die may simply be observed in electronic healthcare data sets as not filing  
782 any further claims or not receiving any additional care past a particular date. For studies in  
783 which outcomes may often be fatal, it is important therefore not to exclude patients who appear  
784 to be “lost to follow up” at any time following their drug exposure. These patients should be  
785 included in searches of NDI or other systems to see if their absence (disenrollment) from the  
786 system has been caused by death, specifically by death related to the study outcome of interest.

787

## 788 **VI. BEST PRACTICES — ANALYSES**

789

### 790 **A. Prespecified Analysis Plan**

791

792 In the study protocol, investigators should include a prespecified analysis plan that addresses the  
793 specific study objectives. The plan should specify primary and any secondary analyses. If  
794 investigators plan to perform *preliminary analyses*, they should prespecify the plan.

795 *Preliminary analyses* are analyses that involve nonvalidated outcomes without appropriate  
796 justification or when adjustments for confounders and examination for effect modification are  
797 lacking. Prespecifying a plan is critical because risk estimates for safety outcomes of interest  
798 may be substantially different before and after validation and adjustment. These differences may  
799 significantly affect the ultimate findings of the study. Investigators should also note if there is a  
800 lack of statistical power to detect rare outcomes of interest.

801

802 Investigators should present both unadjusted and adjusted results in the final analysis. This  
803 presentation is critical for studies that employ electronic healthcare data sets because significant  
804 statistical power can often be obtained in these types of studies; as a result, without adequate

---

<sup>14</sup> National Death Index Web site: <http://www.cdc.gov/nchs/ndi.htm>.

## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

805 adjustment for potential confounders, statistically significant results that are inaccurate can easily  
806 be found. However, adjustment for measured confounders does not guarantee accurate results,  
807 and the potential impact of unmeasured confounders must be addressed. Unadjusted results  
808 facilitate both qualitative and quantitative comparison with the adjusted results to examine the  
809 effect of adjustment.

810

### **B. Additional Analyses**

812

813 Significant findings in subgroup analyses may be considered hypothesis-generating unless  
814 prespecified and adequately powered. If subgroup analyses are employed, investigators should  
815 describe methods used to examine subgroups and interactions (von Elm, et al. 346). It is  
816 recommended that *post hoc analyses* be clearly described as such to aid interpretation.

817

### **C. Use of Specific Statistical Techniques (e.g., To Minimize Confounding)**

819

820 Investigators should ensure that appropriate statistical techniques are used to address  
821 confounding and assess effect modification and that these techniques are well described and  
822 justified, including a clear delineation of relevant assumptions and limitations. The reported  
823 results should be stratified by the key effect modifier. It is important to discuss in detail the  
824 performance of the techniques in specific databases used and the impact on the interpretation of  
825 the study findings. Diagnostics, both graphical and analytical, are often relevant and facilitate the  
826 evaluation of assumptions and performance of the techniques. Planned statistical techniques and  
827 diagnostic methods should be outlined in the analysis plan.

828

### **D. Sensitivity Analyses**

829

830  
831 FDA recommends the use of sensitivity analyses to determine the impact of various study  
832 decisions relating to design, exposure definition and outcome definition. Such analyses can be  
833 very helpful in determining the potential impact of varying assumptions on study results, and can  
834 facilitate better interpretation of study results in light of significant limitations. It is important  
835 for investigators to clearly identify and describe sensitivity analyses that are performed and to  
836 provide their own interpretation of the impact of these analyses on the interpretation of the study  
837 findings.

838

### **E. Linking or Pooling Data from Different Sources**

840

841 If applicable, the analysis plan should include information on how data are to be pooled from  
842 different sources. If relevant, investigators should also describe how data are linked or  
843 standardized to allow for pooling.

844

### **F. Assessment and Handling of Missing and Uninterpretable Data**

846

847 Investigators should develop a plan to assess and handle missing and uninterpretable data (e.g., a  
848 claim is paid for by an insurance company, but the claim is not clinically accurate). It is  
849 important to provide the percentage of missing data for key variables of interest. Missing  
850 information is sometimes falsely interpreted. For example, lack of positive information on the



## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

851 occurrence of an event (such as dialysis) or a risk factor (such as smoking) might not mean that  
852 the event or risk factor was nonexistent. Care should be given to default values of data and the  
853 implications of lack of information on data values.

854

### **G. Quality Assurance (QA) and Quality Control (QC)**

856

857 The quality control (QC) and quality assurance (QA) plan for the construction of the analytical  
858 data set(s) and analysis of data should be clearly described. QC consists of the steps taken  
859 during the analysis to ensure that it meets prespecified requirements and that it is reproducible.  
860 QA consists of activities undertaken to evaluate quality control. CDER’s Manual of Policy and  
861 Procedures (MAPP) 6700.2 *Standards for Data Management and Analytic Processes* provides an  
862 example of how quality control (QC) and quality assurance (QA) planning and implementation  
863 can be accomplished.<sup>15</sup>

864

865 Investigators should describe the approaches taken to ensure data integrity (confidentiality and  
866 security of information from authorized access or revision) and data validity (correctness of data  
867 that is collected and stored).

868

869 FDA could request access to the original analytic data set to conduct re-analyses of the data to  
870 verify study results; thus, the lead study investigator should ensure that analytic data sets used in  
871 the study are archived in a way that provides access for the purpose of such re-analyses while  
872 ensuring personal data protection.

873

### **H. Describe Procedures To Ensure Accuracy of Data Management and Analysis Process**

874

875

876  
877 ISPE highlights that it is important to “describe data management and statistical software  
878 programs and hardware to be used in the study” and “data preparation and analytical procedures  
879 as well as the methods for data retrieval and collection” (ISPE guidelines 202). FDA encourages  
880 investigators to describe these processes to ensure transparency about how data sets are managed  
881 and prepared. It is important for analysts performing and reviewing data management and  
882 analysis to have appropriate training or prior experience in the use of the particular analytic  
883 software. Documentation is another very important component of the analytic process. FDA  
884 recommends that all analytic programs be thoroughly annotated with comments that clearly  
885 describe the intent or purpose of each step.

---

<sup>15</sup> MAPPs are available on the Internet at  
<http://www.fda.gov/AboutFDA/CentersOffices/CDER/ManualofPoliciesProcedures/default.htm#ODS>.

## *Contains Nonbinding Recommendations*

*Draft — Not for Implementation*

886  
887  
888  
889  
890  
891  
892  
893  
894  
895  
896  
897  
898  
899  
900  
901  
902  
903  
904  
905  
906  
907  
908  
909  
910  
911  
912  
913  
914  
915  
916  
917  
918  
919  
920  
921  
922  
923  
924  
925  
926  
927  
928  
929  
930  
931

### **GLOSSARY**

The following terms are defined for the purposes of this guidance.

**Administrative claims data:** “Claims data arise from a person's use of the healthcare system [and reimbursement of healthcare providers for that care]. When a patient goes to a pharmacy and gets a drug dispensed, the pharmacy bills the insurance carrier for the cost of that drug, and has to identify which drug was dispensed, the milligrams per tablet, number of tablets, etc. Analogously, if a patient goes to a hospital or to a physician for medical care, the providers of the care bill the insurance carrier for the cost of the medical care, and have to justify the bill with a diagnosis” (Strom 220).

**Churn rate:** The churn rate is the rate at which a population moves in and out of a health plan; most healthcare coverage in the United States is employer based and thus coverage changes over time with changes in employer.

**Comparator (comparison) group:** Any group to which patients with either the exposure or outcome of interest are compared (Porta 47).

**Confounding by indication (channeling):** “Physicians prescribe drugs in light of diagnostic and prognostic information available at the time of prescribing. The factors influencing this decision vary by physician and over time and frequently involve patients’ clinical, functional, or behavioral characteristics that are not directly recorded in administrative databases. If some of these factors that are imbalanced among drug users and non-users are also independent predictors of the study outcome, then failing to control for such factors can lead to confounding bias. The confounding then results from selecting patients into drug exposure groups (confounding by indication)” (Schneeweiss and Avorn).

**Continuous coverage/Continuity of coverage:** The period of time over which a patient is enrolled in a healthcare system and during which any medical service or drug prescription would be captured in the healthcare system’s electronic record system.

**Diagnostics:** Methods used to assess the performance of a statistical model and/or evaluate the fit of the method or model to the data.

**Electronic healthcare data set:** An analytic data set that is “an organized set of [healthcare] data or collection of files available by computer through electronic format which can be used for the conduct of pharmacoepidemiologic [safety] studies” (Hartzema, et al. 519). It is derived from a raw electronic healthcare database.

**Electronic medical record (EMR):** An electronic record of health-related information on an individual that can be created, gathered, managed, and consulted by authorized clinicians and staff within one healthcare organization (NAHIT Report).

## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

932 **Exposure risk window:** Interval of exposure (to the drug of interest) time considered to be  
933 relevant in the design or analysis of a pharmacoepidemiologic study. In case-control studies, it is  
934 essential to define a priori the period during which the possible exposure to the drug of interest  
935 will be investigated in the previous history of the cases and comparators. An equivalent period  
936 must be defined for the comparators. Similarly, in a cohort study, the time window defines the  
937 period after the beginning of exposure during which the occurrence of an event (safety outcome)  
938 of interest will be attributed to the exposure. The a priori choice of an exposure risk window can  
939 be challenging if the outcome of interest is poorly documented. An inappropriate exposure risk  
940 window can strongly bias the estimate of risk (Begaud 156).

941  
942 **Historical comparators:** Comparator group for whom data were collected at a time preceding  
943 that at which the data were gathered on the group of interest. Because of secular trends, use of a  
944 historical comparator group can lead to bias in the risk estimates (Porta 117).

945  
946 **Observational studies:** In observational studies, “the investigator does not control the therapy,  
947 but observes and evaluates the results of ongoing medical care. These are the study designs that  
948 do not involve random” allocation. For purposes of this guidance, observational studies include  
949 case-control, cohort, and case-crossover studies (Strom 862).

950  
951 **Pharmacoepidemiologic safety study:** An observational study designed to assess the risk  
952 attributed to a drug exposure and test prespecified hypotheses (2005 FDA guidance).

953  
954 **Post hoc analysis:** “An analysis that was not anticipated or described” in the analysis plan or  
955 study protocol (Begaud 115).

956  
957 **Preliminary analysis:** Analyses are preliminary if they involve nonvalidated outcomes without  
958 appropriate justification or when adjustments for confounders and examination for effect  
959 modification are lacking.

960  
961 **Quality assurance (QA):** Quality assurance consists of activities undertaken to evaluate quality  
962 control (FDA MAPP 6700.2).

963  
964 **Quality control (QC):** Quality control consists of steps taken during the generation of a drug or  
965 service to ensure that it meets prespecified requirements and that the drug or service is  
966 reproducible (FDA MAPP 6700.2)

967  
968 **Real-time active safety surveillance:** Drug-based, real-time active surveillance systems that  
969 investigate large numbers of patients exposed to new molecular entities (NMEs) after their  
970 launch for all or specified adverse events. This type of system can also examine the use of drugs  
971 and modes of clinical practice (RFI).

972  
973 **Study timeframe:** The timeframe from the beginning of the “look back period,” when the  
974 investigator looks back in the database before drug exposure to ascertain baseline patient  
975 covariate data, to the end of the follow-up period.

976

## *Contains Nonbinding Recommendations*

*Draft — Not for Implementation*

977 **Time trend bias:** The evolution of medical practice and the diagnosis and treatment of disease  
978 over time.

979  
980 **Time-varying confounder:** A confounder variable whose values change over the study  
981 timeframe (Platt 687).

982  
983 **Validation:** The process through which primary medical data (generally medical charts) are  
984 abstracted, reviewed, and adjudicated to determine whether the patient actually experienced the  
985 event coded in the electronic data.

986

987

988

989

990

991

992

993

994

995

996

997

998

999

1000

1001

1002

1003

1004

1005

1006

1007

1008

1009

1010

1011

1012

1013

1014

1015

1016

## *Contains Nonbinding Recommendations*

*Draft — Not for Implementation*

### **BIBLIOGRAPHY**

- 1017  
1018  
1019  
1020  
1021 Begaud, Bernard. Dictionary of Pharmacoepidemiology. Chichester, England: Wiley and Sons,  
1022 2000.  
1023  
1024 Charlson, et al. A new method of classifying prognostic comorbidity in longitudinal studies:  
1025 development and validation. J Chronic Dis 1987;40(5):373-83.  
1026  
1027 D'Agostino, et al. Propensity Score Methods for Bias Reduction in the Comparison of a  
1028 Treatment to a Nonrandomized Control Group. Statist. Med 1998;2265-2281.  
1029  
1030 Esposito, et al. Results of a Retrospective Claims Database Analysis of Differences in  
1031 Antidepressant Treatment Persistence Associated with Escitalopram and Other Selective  
1032 Serotonin Reuptake Inhibitors in the United States. Clin Ther. 2009;31:644-656.  
1033  
1034 FDA 2005 Guidance: Good Pharmacovigilance Practices and Pharmacoepidemiologic  
1035 Assessment. March 2005.  
1036  
1037 FDA MAPP: Manual of Policies and Procedures (MAPP) 6700.2: Standards for Data  
1038 Management and Analytic Processes in the Office of Surveillance and Epidemiology. 2008.  
1039  
1040 Fine, et al. Confounding in Studies of Adverse Reactions to Vaccines. Am J Epidemiol  
1041 1992;136:121-35.  
1042  
1043 Friedman, et al. A Retrospective Study of the Use of Fluticasone Propionate/Salmeterol  
1044 Combination as Initial Asthma Controller Therapy in a Commercially Insured Population. Clin  
1045 Ther. 2008;30:1908-1917.  
1046  
1047 Hartzema, Tilson, and Chan. Pharmacoepidemiology and Therapeutic Risk Management.  
1048 Cincinnati: Harvey Whitney Books, 2008.  
1049  
1050 Hernan, et al. Causal Knowledge as a Prerequisite for Confounding Evaluation: An Application  
1051 to Birth Defects Epidemiology. Am J Epidemiol 2002;155:176-84.  
1052  
1053 HTA 101 glossary, National Information Center on Health Services Research and Health Care  
1054 Technology, National Library of Medicine. <<http://nlm.nih.gov/nichsr/hta101/ta101014.html>>.  
1055  
1056 ISPE guidelines. Guidelines for good pharmacoepidemiology practices (GPP).  
1057 Pharmacoepidemiology and Drug Safety 2008;17:200-208.  
1058  
1059 Lanes, et al. Bias due to False-Positive Diagnoses in an Automated Health Insurance Claims  
1060 Database Drug Safety 2006;29(14):1069-1075.  
1061

## ***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

- 1062 Maclure, Malcolm. The Case-Crossover Design: A Method for Studying Transient Effects on the  
1063 Risk of Acute Events. *Am J Epidemiol* 1991;133:144-53.  
1064
- 1065 MacMahon and Pugh. *Epidemiology principles and methods*. Boston: Little, Brown, and  
1066 Company, 1970.  
1067
- 1068 Moher D, Schulz KF, Altman DG, for the CONSORT Group. The CONSORT statement: revised  
1069 recommendations for improving the quality of reports of parallel group randomized trials. *Ann*  
1070 *Intern Med*. 2001;134:657-62.  
1071
- 1072 National Alliance for Health Information Technology (NAHIT) Report to the Office of the  
1073 National Coordinator for Health Information Technology (ONCHIT) on Defining Key Health  
1074 Information Technology; 5/15/08.  
1075
- 1076 Platt, Robert W, et al. Time-modified Confounding. *American Journal of Epidemiology*  
1077 2009;170(6):687-694.  
1078
- 1079 Porta, Miquel. *A Dictionary of Epidemiology*. New York: Oxford University Press, 2008.  
1080
- 1081 National Death Index, National Center for Health Statistics, CDC.  
1082 <[http://www.cdc.gov/nchs/data\\_access/ndi/about\\_ndi.htm](http://www.cdc.gov/nchs/data_access/ndi/about_ndi.htm)>.  
1083
- 1084 Ray, Wayne. Evaluating Medication Effects Outside Clinical Trials: New-User Designs. *Am J*  
1085 *Epidemiol* 2003;158:915-920.  
1086
- 1087 Request for Information (RFI) Number HHSF200601 on Active Surveillance Programs in the  
1088 United States for the Identification of Clinically Serious Adverse Events Associated with  
1089 Medical Drugs. April 18, 2005.  
1090
- 1091 Rosenbaum and Rubin. The Central Role of the Propensity Score in Observational Studies for  
1092 Causal Effects. *Biometrika* 1983;70:41-55.  
1093
- 1094 Strom, Brian. *Pharmacoepidemiology*. Chichester, England: John Wiley and Sons, 2005.  
1095
- 1096 Schneeweiss, et al. Aprotinin During Coronary-Artery Bypass Grafting and Risk of Death.  
1097 *NEJM* 2008;358:771-83.  
1098
- 1099 Schneeweiss and Avorn. A review of uses of health care utilization databases for epidemiologic  
1100 research on therapeutics. *Journal of Clinical Epidemiology* 2005;58:323-337.  
1101
- 1102 Suissa, Samy. Immortal time bias in observational studies of drug effects.  
1103 *Pharmacoepidemiology and Drug Safety* 2007;16:241-249.  
1104
- 1105 Vandembroucke, Jan. Observational Research, Randomised Trials, and Two Views of Medical  
1106 Science. *PLoS Med* 5(3):e67.  
1107

***Contains Nonbinding Recommendations***

*Draft — Not for Implementation*

- 1108 Von Elm, et al. The Strengthening the Reporting of Observational Studies in Epidemiology  
1109 (STROBE) statement: guidelines for reporting observational studies. Journal of Clinical  
1110 Epidemiology 2008;61:344-349.  
1111
- 1112 Waning, et al. Pharmacoepidemiology Principles and Practice. USA: McGraw Hill, 2001.  
1113
- 1114 Weiner, et al. Replication of the Scandanavian Simvastatin Survival Study using a primary care  
1115 medical record database prompted exploration of a new method to address unmeasured  
1116 confounding. Pharmacoepidemiology and Drug Safety 2008;17:661-670.  
1117