
Meta-Analyses of Randomized Controlled Clinical Trials to Evaluate the Safety of Human Drugs or Biological Products Guidance for Industry

DRAFT GUIDANCE

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**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)**

**November 2018
Drug Safety**

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1 **Meta-Analyses of Randomized Controlled Clinical Trials to 2 Evaluate the Safety of Human Drugs or Biological Products 3 Guidance for Industry¹**

4 This draft guidance, when finalized, will represent the current thinking of the Food and Drug
5 Administration (FDA or Agency) on this topic. It does not establish any rights for any person and is not
6 binding on FDA or the public. You can use an alternative approach if it satisfies the requirements of the
7 applicable statutes and regulations. To discuss an alternative approach, contact the FDA staff responsible
8 for this guidance as listed on the title page.

9 **I. INTRODUCTION**

10 This document provides guidance to applicants submitting investigational new drug applications
11 (INDs), new drug applications (NDAs), biologics license applications (BLAs), or supplemental
12 applications on the use of meta-analyses of randomized controlled clinical trials (RCTs) to
13 evaluate the safety of human drugs or biological products within the framework of regulatory
14 decision-making.² This guidance is also intended for FDA reviewers and for third-party entities
15 that prepare or evaluate meta-analyses assessing the safety of drug products. Specifically, this
16 guidance describes the factors FDA intends to consider when evaluating the strength of evidence
17 provided by a meta-analysis studying the safety of drugs.

18 In general, FDA's guidance documents do not establish legally enforceable responsibilities.
19 Instead, guidances describe the Agency's current thinking on a topic and should be viewed only
20 as recommendations, unless specific regulatory or statutory requirements are cited. The use of
21 the word *should* in Agency guidances means that something is suggested or recommended, but
22 not required.

24 **II. BACKGROUND AND SCOPE**

25 Evaluating the safety of drug products, both before approval and after marketing, is a
26 fundamental responsibility of the FDA. This evaluation often requires combining and
27 summarizing information from multiple sources, and meta-analysis is a useful tool for this
28 purpose. The term *meta-analysis*, as used in this document, refers to the combining of evidence
29 from relevant studies using appropriate statistical methods to allow inference to be made to the
30 population of interest. The most common reason for performing a meta-analysis is to provide an
31 estimate of a treatment effect or measure of relative risk associated with an intervention and to
32 quantify the uncertainty about the estimated effect or risk, when data from a single existing study
33 are insufficient for this purpose, and the conduct of a new, large study would be impractical, take

¹ This guidance has been prepared by the Office of Biostatistics in the Center for Drug Evaluation and Research, in cooperation with the Center for Biologics Evaluation and Research, at the Food and Drug Administration.

² For the purposes of this guidance, all references to *drugs* include both human drugs and biological products unless otherwise specified.

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34 too long, or be unethical. The term meta-analysis sometimes refers to the quantitative synthesis
35 in a systematic review (Cochrane Handbook 2011) and the term systematic review refers to the
36 broader effort, including defining objectives and selecting and evaluating studies, as well as
37 synthesis. We use the term meta-analysis more broadly to include consideration of study
38 selection as well as overall design issues such as prespecification and reporting.

39 Unless a randomized controlled clinical trial is prospectively designed with a particular safety
40 outcome as its primary endpoint and sized accordingly, the trial may not have sufficient sample
41 size to detect important adverse consequences of drugs and to reliably evaluate whether there is
42 increased risk of such events. This is because most serious drug-induced adverse events (1) are
43 rare or (2) occur at only slightly increased frequency compared to background rates and are not
44 obviously drug-related (e.g., cardiovascular events, cancers). Meta-analysis is most useful in the
45 latter case, to detect and quantify an increased risk over the background rate of the safety event.
46 For the former case, when events are rare and not expected to occur in the target population,
47 meta-analyses may still be useful for improving the precision of the estimate of risk.

48 Meta-analysis factors into FDA's evaluation of potential safety issues in a variety of ways:

- 49 • Meta-analyses may be conducted by sponsors and submitted to FDA as part of an
50 IND, NDA, BLA or supplemental submission.
- 51 • FDA may ask a sponsor to conduct a prospective meta-analysis, as it has
52 recommended for sponsors of new antidiabetic therapies to treat type 2 diabetes in the
53 draft guidance for industry, *Diabetes Mellitus – Evaluating Cardiovascular Risk in*
54 *New Antidiabetic Therapies to Treat Type 2 Diabetes*.³
- 55 • FDA may initiate its own meta-analysis in response to safety signals that FDA is
56 aware of, using study data FDA has access to, but that may be unavailable to sponsors
57 and other researchers. These meta-analyses typically have prospective protocols to
58 address issues of bias and multiplicity, as discussed later in this document.
- 59 • FDA may evaluate a meta-analysis conducted by an external party that raises a safety
60 concern about a marketed product.

61 Because regulatory actions may stem from a meta-analysis, it is important that rigorous
62 principles be applied to such studies. In this guidance, the important principles underlying best
63 practices for safety meta-analysis and the way that FDA intends to factor adherence to those
64 principles into its decision-making are described. An overview of the most important principles
65 presented in this guidance is as follows:

- 66 • Prespecification and transparency are recommended, as they enable a thorough
67 evaluation of the meta-analysis.
- 68 • The criteria for selecting which trials to include should be determined prior to
69 conducting the meta-analysis. The selection of the studies should not be based on the

³ We update guidances periodically. To make sure you have the most recent version of a guidance, check the FDA Drugs or Biologics guidance web pages at:

<https://www.fda.gov/Drugs/GuidanceComplianceRegulatoryInformation/Guidances/default.htm>

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70 trial outcomes, but rather on trial quality and consistency of critical design elements,
71 and should be executed by parties masked to the outcomes of the trials, whenever
72 possible.

- 73 • The quality and relevance of the individual trials and the quality of the trial data are
74 critical determinants of the quality of the meta-analysis itself. Outcome ascertainment
75 and adequacy of exposure periods are two of the most important determinants of trial
76 quality.
- 77 • Meta-analysis conducted to meet safety objectives often requires re-purposing trials
78 that were originally designed to meet efficacy objectives. This can be challenging,
79 particularly if subject-level data are not available.
- 80 • Meta-analysis based solely on published trials is particularly problematic because of
81 the potential for bias and error, both known and unrecognized.
- 82 • Generally accepted principles of good statistical practice should be followed in
83 selecting the statistical methods to be used for meta-analysis (but this guidance is not
84 prescriptive as to the choice of method).

85 This guidance applies to meta-analyses conducted in both pre-market and post-market settings.
86 In the pre-market setting, the number and scope of trials may be limited, because the drugs are
87 not yet approved for marketing, and these limitations may affect the ability to address the safety
88 question of interest. In the post-market setting, the number and variety of trials available for
89 inclusion are usually larger, as is the number of parties able to conduct the meta-analysis. In both
90 pre- and post-market settings, the important principles guiding a well-planned and well-executed
91 meta-analysis apply.

92 This document focuses specifically on meta-analyses conducted for purposes of safety evaluation
93 using data from RCTs. Meta-analyses conducted to evaluate a product's effectiveness, either
94 overall or within specific subgroups, are occasionally of interest to FDA, but the primary use of
95 meta-analysis in the regulatory setting is for assessment of product risk. While meta-analyses of
96 non-randomized studies may be informative for the assessment of certain safety outcomes, the
97 issues related to such a meta-analysis are more complex, and the interpretation of the results
98 more controversial. Meta-analyses of observational studies are therefore not addressed in this
99 guidance.

100 Meta-analyses are conducted for both exploratory and confirmatory purposes. The primary focus
101 of this guidance, however, is on meta-analyses with predefined hypotheses that are designed to
102 confirm a suspected risk associated with a drug rather than on exploratory meta-analyses.

103 The subsequent sections of this guidance provide a detailed discussion of the important elements
104 used in evaluating meta-analyses for regulatory purposes. In section III, the importance of the
105 quality and relevance of the component trials included in a meta-analysis and the quality of the
106 data from those trials are discussed. In section IV, the importance of prespecification and
107 transparency in designing, conducting, and reporting a meta-analysis is described. In section V,
108 the use of recommended statistical methods is discussed. In section VI, we summarize these
109 technical considerations and discuss how they may be factored into a regulatory decision.

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110 Section VII provides two examples illustrating the range of meta-analyses conducted for safety
111 evaluation and FDA's use of the evidence provided by each.

112 **III. THE QUALITY AND RELEVANCE OF CANDIDATE TRIALS**

113 **A. Basic Principles**

114 Deciding what trials to include in a meta-analysis is an important step in the design and conduct
115 of a high-quality meta-analysis. The major determinants for this decision should be the quality
116 and relevance of the individual trials and the data collected in those trials. The component trials
117 of a meta-analysis should be able to address the safety objectives of the analysis and be of
118 sufficient quality to provide evidence useful for regulatory decision-making. The following are
119 important factors to consider in determining whether the individual trials and associated data are
120 of sufficient quality and relevance to ensure the validity of the meta-analysis:

- 121 • The extent to which the component trials are consistent with established standards for
122 the design and conduct of adequate and well-controlled clinical trials
- 123 • The quality and completeness of safety outcome ascertainment in each trial
- 124 • The appropriateness of exposure and follow-up periods for estimating risk
- 125 • The appropriateness of the component trials' inclusion/exclusion criteria for defining
126 the population at risk
- 127 • The appropriateness of the comparator used in each trial and of the doses for the test
128 drug and comparator
- 129 • The relevance of the candidate trials to current medical practice
- 130 • The availability of subject level data from each trial

131 These factors are discussed further in the subsections that follow.

132 **B. Consistency with Standards for Adequate and Well-Controlled Trials**

133 The knowledge base, literature, and published guidelines for designing, conducting, and
134 analyzing well-controlled clinical trials to demonstrate efficacy in support of an NDA or BLA
135 are extensive and well-known (see, e.g., *E9 Statistical Principles for Clinical Trials*,
136 International Council on Harmonisation (ICH) of Technical Requirements for Pharmaceuticals
137 for Human Use). The same principles apply to the individual component trials of a meta-
138 analysis, and the extent to which the component trials satisfy these principles has strong bearing
139 on the quality of the meta-analysis to which they contribute. Notably, however, trials that are
140 well-designed to measure the effect of a drug on a particular efficacy outcome may not
141 necessarily be well-designed to measure an effect on another outcome, particularly an
142 uncommonly occurring safety outcome, as discussed further in section III.C.

143 Some study designs may cause a candidate trial to be discouraged from inclusion in the meta-
144 analysis. For example, randomized withdrawal studies, in which all subjects initially receive the
145 drug and are then randomized to either remain on the drug or withdraw to a placebo or active
146 control drug, may not be recommended for a safety meta-analysis. In these studies, subjects who
147 cannot tolerate the test drug are excluded from the randomized portion of the trial, and the study

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148 population may therefore not accurately represent the population at risk. Additionally, depending
149 on the period of exposure needed for the adverse effect to occur, the initial exposure to the drug
150 may result in events in both randomized groups and an underestimate of the relative risk.
151 Crossover studies in which subjects receive different treatments at different periods of time may
152 not be recommended for evaluating safety outcomes, if exposure to a treatment in one period can
153 result in an adverse event occurring in a later period. Washout periods for safety outcomes may
154 need to be longer than for efficacy outcomes. Other non-standard study designs such as
155 enrichment trials, trials with add-on therapies, adaptive trials, and trials stopped at interim may
156 raise similar issues.

157 C. Outcome Definition and Ascertainment

158 A high-quality meta-analysis has a carefully defined outcome variable with appropriate
159 ascertainment procedures prospectively implemented in the component trials such as specific
160 protocol-defined procedures for data collection and adjudication of safety outcomes. For
161 example, if the outcome of interest is myocardial infarction, the protocol might instruct the
162 investigators to collect laboratory and electrocardiogram data for suspected events during the
163 trial. The results of these procedures might then be subject to adjudication by an independent
164 panel to strengthen the evidence that a case event is real. Such procedures, however, are used
165 primarily to assess effectiveness outcomes (does the treatment reduce myocardial infarction
166 rates) and are not commonly used to assess safety outcomes, unless there is a specific concern
167 known and planned for prior to study start (e.g., cardiovascular outcomes in studies of Type 2
168 diabetes drugs; suicidal events in studies of antidepressant drugs). Although prospective
169 collection and adjudication of safety outcomes are desirable, they are usually not feasible,
170 particularly in the most common setting of evaluating a new, unanticipated safety signal with
171 data from trials already completed.

172 When the component trials are not prospectively designed to produce accurate ascertainment of
173 the meta-analysis safety outcome, retrospective identification and adjudication of events will
174 usually be recommended. In this situation, the safety outcome of interest should be clearly
175 defined, and the identification and adjudication of events should be performed while masked. For
176 example, in the antidepressants and suicidal events meta-analysis (section VII, Example 1),
177 where suicidality was not specifically assessed, predefined search criteria were applied to
178 adverse event data collected in the component trials. Based on the results of the search,
179 narratives of candidate events were created, and a group of experts masked to treatment
180 assignment classified the events into validated suicidal outcome categories. This resource
181 intensive effort required subject-level data not directly available in the original trial datasets. A
182 detailed meta-analysis protocol was developed that described the procedures necessary for
183 obtaining and adjudicating the outcome data of interest prior to implementing those procedures.

184 Measurement bias (such as an over- or under-estimation of the rate of events because of
185 imprecise or individualized interpretation of adverse event reporting) factors into determining
186 whether outcome ascertainment is sufficient for a high-quality meta-analysis. Biases common to
187 both treatment and control groups can occur when an outcome variable does not accurately
188 represent the safety outcome of interest (e.g., is not specific enough, causing many irrelevant
189 events to be reported, or is too narrowly defined, causing many events to be missed). Both

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190 reporting problems may result in reduced power or a biased effect measure, but will not
191 completely eliminate the ability to detect an effect. Of greater concern are reporting problems
192 that can affect treatment groups differently, as they can eliminate the ability to detect an effect
193 when one exists or that create the appearance of an effect when one does not exist.

194 Biased ascertainment of outcomes is one important concern in unmasked trials, where
195 investigators or subjects may unconsciously, or consciously, under- or over-report medical
196 events based on the known treatment assignment. Even in double-masked trials, there is a
197 potential for differential bias to occur in safety reporting, especially when safety outcomes were
198 not of primary interest in designing the trial. For example, a drug may cause discoloration of the
199 urine, which in turn may lead to more evaluations and subsequent diagnoses of kidney disease. If
200 anticipated, the trial protocols could have included an evaluation for kidney disease at scheduled
201 times during the trials, thereby reducing the potential for biased reporting of that safety outcome.

202 Several strategies should be considered to minimize the impact of measurement bias. The use of
203 safety outcomes that can be diagnosed readily and unambiguously, often called *hard outcomes*,
204 can help minimize bias due to outcome ascertainment in a meta-analysis. For example, if vital
205 status at the end of the study is known for all patients in all of the component trials, then use of
206 death as the safety outcome effectively avoids any potential for ascertainment bias. If ischemic
207 cardiovascular outcomes are of interest, ascertainment of myocardial infarction and stroke will
208 be less prone to ascertainment bias than less specific events such as transient ischemic attack or
209 angina. Excluding the less specific events or events that are difficult to ascertain objectively will
210 probably reduce the power of the meta-analysis to detect a safety signal as well as the precision
211 of the risk estimate that results, but the reduction in ascertainment bias may outweigh these
212 losses. Precision and power can be quantified and reported with the meta-analysis results,
213 whereas bias is typically unknown and difficult to measure. In general, reducing bias in a meta-
214 analysis should be given greater weight than increasing precision and power.

215 It is important to define the period within which the safety outcome of interest is to be measured.
216 For example, a safety outcome corresponding to the occurrence of anaphylactic events may call
217 for the primary focus to be placed on the period of initial drug exposure, with a secondary focus
218 on the entire drug exposure period. Including events beyond the initial exposure period may
219 result in underestimation of the risk attributable to the drug. In cases where it is known that the
220 effect of the drug diminishes when the drug is stopped, it might be recommended for the primary
221 analysis to count outcomes only during the time a subject is on the drug (such as an on-treatment
222 analysis).

223 Ideally, outcome definition and ascertainment should be as uniform as possible across the
224 component trials. Trial-to-trial differences can introduce heterogeneity in safety outcomes,
225 increasing the variability of the meta-analytic estimate of risk. Differences in outcome definition
226 and ascertainment may be confounded with other trial design or subject population
227 characteristics, making observed differences in risk measures difficult to interpret.

228 Outcome definition and ascertainment are particular problems for meta-analyses that rely
229 exclusively on published trial data. Information taken from published articles about the
230 component trials may be incomplete or lack specificity. Publications may not report on the safety

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231 outcome of interest, and even when the outcome is reported, important details may be lacking,
232 including whether the event occurred on or off randomized treatment and whether the outcome
233 was defined a priori and uniformly across trials. Protocols, study reports, and subject-level data
234 from the component trials are often important to determine whether the trial outcomes are
235 adequate for supporting a high quality meta-analysis.

236 The definition of the safety outcome, the source data and any adjudication procedures that may
237 have been employed should be prespecified in the meta-analysis protocol and consistently
238 applied to all component trials, if possible (see Section IV.B).

239 D. Duration of Exposure and Length of Follow-Up

240 The duration of exposure and length of follow-up for each of the candidate trials should be
241 factored into the criteria for trial inclusion. For an outcome with delayed appearance, such as
242 cancer or bone injury, the inclusion of short-term trials may not be recommended. When subject-
243 level data are available, analysis methods can be used to identify and account for differences in
244 trial duration across studies (see Section V). Without subject-level data, it may not be possible to
245 account for differences in duration, depending on the level of detail provided by the summary
246 information available from each trial, and some trials may need to be excluded as a result.

247 Subjects prematurely stopping assigned drug or withdrawing from the trial can affect the
248 comparability of subject groups with respect to safety outcomes ascertained over the course of
249 the treatment or study period. The dropout pattern may result in dissimilar observation time
250 between the two groups, resulting in more opportunity to observe the safety outcome in one
251 group compared to the other. Simple adjustments for person-time of observation may not be
252 sufficient to correct for non-comparability, because these adjustments assume constant hazards
253 across time. The risk of the event may not be constant over time if, for example, the safety
254 outcome tends to occur either early or late during treatment. Time-to-event analysis may also be
255 insufficient if the dropout rates are indicative of informative censoring; for example, if the
256 adverse events resulting in early discontinuations are similar to or predecessor events of the
257 safety outcome.

258 When reviewing the component trials of a meta-analysis, it is important to consider the
259 possibility of differential follow-up and informative censoring. Examining summary statistics
260 and graphics by subject group of on-assigned drug time and follow-up time is usually helpful for
261 this purpose, as is an examination of the stated reasons for stopping assigned-drug or
262 discontinuing participation in the trial by subject group. The criteria for excluding individual
263 trials for these reasons should be specified a priori and described in the meta-analysis protocol
264 and analysis plan (see Section IV). If incorporated in the trial inclusion and exclusion criteria
265 (applied to determine the component trials of the meta-analysis), a review to identify differential
266 dropout rates should be performed masked to the safety outcome measurements. Regardless of
267 the decision on inclusion, data summaries should be provided in the meta-analysis report to
268 permit consideration of these issues.

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269 **E. Subject Populations**

270 Wherever possible, the subject population for component trials should reflect the patient
271 population hypothesized to be adversely affected by the drug. For cardiovascular safety
272 outcomes, for example, trials that enrolled subjects with pre-existing cardiovascular risk factors
273 may improve the ability of the meta-analysis to detect any risk associated with the drug.
274 Conversely, including trials that excluded subjects with certain risk factors may limit the ability
275 to detect risk. The inclusion/exclusion criteria of the component trials should be reviewed to
276 determine if the corresponding subject populations are consistent with the objectives of the meta-
277 analysis.

278 **F. Dosing and Comparators**

279 Although uniformity of dosing regimens and therapeutic indications studied across component
280 trials is desirable, it may be that trials including other doses or conducted in other indications can
281 contribute to the meta-analysis. For example, in some circumstances, it may be assumed that if a
282 safety event is not observed at doses higher than the dose or doses approved, it should not occur
283 at the approved dose or doses. In this scenario, including trials with dosing higher than the
284 approved dose might be used to rule out an association. Information on dose response
285 relationships may also support a possible relationship between drug use and safety outcomes.
286 Similarly, including trials for indications outside the indication of specific interest may be useful
287 in a safety meta-analysis, if it can be assumed that the association would not depend on the
288 indicated use. Such assumptions can be examined to some extent through sensitivity analyses
289 conducted on subsets of trials at particular doses or in particular indications (see Section V.D).

290 The suitability of the comparator drugs in the candidate trials should also be factored into the
291 meta-analysis inclusion criteria. In some situations, the ideal comparator is a placebo, since a
292 placebo cannot cause the safety outcome under investigation. However, placebo-controlled trials
293 may not be feasible or ethical in certain disease areas. If trials with active drug comparators are
294 used, attempts should be made a priori to determine if the active comparator is associated with
295 the safety outcome of interest. The protocol specifications for concomitant therapy in the
296 individual trials are also relevant, since concomitant therapies may be associated with the safety
297 outcome.

298 **G. Relevance to Current Medical Practice**

299 Changes over time in the practice of medicine may affect the usefulness of some trials for
300 contributing data to a meta-analysis. Older trials may no longer be relevant, if medical practice
301 has changed such that current practices are able to prevent or reduce the occurrence of the safety
302 outcome under investigation. Sensitivity analyses can be used to examine estimated risks as a
303 function of the dates the component trials were conducted to determine if calendar trends pose a
304 problem.

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305 **H. Availability of Subject-Level Data**

306 The availability of subject-level data is an important consideration in deciding which studies to
307 include in the meta-analysis. For reasons already discussed, subject-level data improve the
308 quality of the meta-analysis by providing the ability to evaluate important quality factors of the
309 component trials and possibly correct for any deficiencies identified, particularly poor outcome
310 assessment or insufficient exposure periods. Subject-level data also allow for a broader range of
311 analysis methods to be used and an examination of subgroups (see Section V). Note, however,
312 that in some cases, meta-analyses based on only trial-level summary data may be able to identify
313 or rule out risks associated with a drug. If so, then the criteria for determining which trials to
314 include in a trial-level meta-analysis should be carefully considered; the principles described in
315 this section apply to trial-level meta-analyses just as they do to subject-level meta-analyses.

316 **I. Quality over Quantity**

317 There is often a desire to include as many trials as possible in a meta-analysis to both increase
318 the sample size and enhance the generalizability or external validity of the findings. Including
319 trials that are of poor quality, however, does not accomplish this. The findings from a meta-
320 analysis of a limited set of trials, selected with careful attention to trial and data quality, the
321 intended use of the product, and combined using appropriate statistical methods, will yield a
322 more informative answer to the safety question under investigation than a broader set of trials
323 that includes trials of poor quality.

324 The criteria used to decide which of the candidate trials will be included in a safety meta-analysis
325 should be carefully developed, taking into consideration outcome ascertainment and exposure
326 periods as well as other factors described in the previous subsections. The choices of subject
327 populations, dosing regimens, comparator arms, background therapy, standard of care, and other
328 trial features that comprise the meta-analysis inclusion criteria will affect the validity and
329 interpretation of the meta-analysis findings. Broad inclusion criteria (such as including trials
330 where outcomes may not be reliably assessed) will likely compromise the internal validity of the
331 meta-analysis without necessarily improving the external validity. The criteria for trial inclusion
332 should be well-documented in advance of conducting the meta-analysis. This topic is discussed
333 in section IV.

334 Trial inclusion decisions are particularly important for network meta-analyses, which are
335 designed to assess safety concerns about one drug relative to another, when the two may not
336 have been studied in the same randomized trial (Ohlssen, Price et al. 2014). Direct comparisons
337 between drugs within the individual trials included in a network meta-analysis are used to form
338 indirect comparisons between the two drugs of interest. Because some of the subject group
339 comparisons are made across trials, it is important that the trials involved in a network meta-
340 analysis be similar in design, subject populations, outcome definitions, and medical practice.
341 Although the principles in this guidance apply to network meta-analyses, network meta-analyses
342 have unique considerations beyond what is discussed in this guidance.

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343 **IV. THE IMPORTANCE OF PRESPECIFICATION AND TRANSPARENCY**

344 The extent of the information that should be considered both before and following the conduct of
345 a meta-analysis to adequately establish prespecification and transparency is discussed in this
346 section.

347 **A. Potential for Bias, Multiplicity, and Other Errors**

348 Meta-analysis is a form of retrospective research in that most meta-analyses are conducted based
349 on published clinical trials or trials already completed and whose results are known. It is
350 important to minimize the potential for bias and other errors from sources that are often
351 characteristic of retrospective research, including:

- 352
 - Prior knowledge of individual study results when selecting the studies to be included
353 in the meta-analysis
 - Inclusion of the hypothesis-generating study in a meta-analysis designed to confirm
355 the hypothesis
 - Inability to determine the impact of multiplicity on the reported results

357 Special care is recommended when including trials whose results regarding the safety outcome
358 of interest are known prior to the conduct of the meta-analysis. Information describing the
359 knowledge base at the time the meta-analysis was planned will aid in determining the extent of
360 possible bias that may affect interpretation of the results (e.g., trial outcomes influencing
361 selection of trials). Prespecification of the criteria used to decide which trials to include before
362 decisions about individual trials are made is a major mechanism to minimize bias and can help
363 lessen the impact of this knowledge on the validity of the meta-analysis findings.

364 As stated earlier, our focus is on meta-analyses conducted to confirm a hypothesized safety risk.
365 If a safety hypothesis was generated from the results of a specific clinical trial, then drawing
366 inference from a meta-analysis that includes that trial is problematic. In this case, hypothesis test
367 results and confidence intervals about the risk estimate are not readily interpretable. If the goal of
368 the meta-analysis is to summarize existing information and not to make formal inference, then
369 including the motivating trial may be reasonable. If the motivating trial is included, sensitivity
370 analyses should be performed with and without the motivating trial to investigate its impact on
371 the meta-analysis results (See Section V).

372 Another problem frequently encountered when evaluating the evidence provided by a meta-
373 analysis is the potential for spurious findings due to multiple hypotheses being tested, multiple
374 outcomes being evaluated, multiple or iterative analyses being conducted and multiple subject
375 subgroups being investigated (Bender, Bunce et al. 2008). The result is inflation of the Type I
376 error probability associated with the tests of hypotheses, making the meta-analysis conclusions
377 difficult to interpret. When each of these sources of multiplicity is not well-described in advance,
378 it is impossible to apply a statistical method of adjustment for multiplicity because the full range
379 of factors that were evaluated cannot be determined. And even when the analysis plan does
380 contain a clear description of the sequence of tests to be conducted (across hypotheses,
381 outcomes, subgroups, etc.), there may be too little power available for each of the tests to

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382 confirm the hypothesized safety signal, when appropriate adjustments are applied. Adequate
383 planning and prespecification of meta-analysis objectives and tests of hypotheses may help
384 minimize, to some extent, problems due to multiplicity.

385 B. Meta-Analysis Protocol

386 Prespecification, completeness, and transparency are important principles in the reporting of a
387 meta-analysis, and the reporting begins with the meta-analysis protocol. The protocol should
388 contain a detailed description of the information available prior to designing the meta-analysis
389 that motivated the research. Potential problems anticipated in designing the meta-analysis and
390 the methods planned to manage those problems should be documented. The protocol should be
391 finalized prior to conducting the meta-analysis and, importantly, be in place prior to the selection
392 of the component trials.

393 The meta-analysis protocol should be available through advance publication or other methods of
394 distribution. This practice has been widely adopted for clinical trials via use of the web site,
395 <https://clinicaltrials.gov/>. There are several repositories for the protocols, such as PROSPERO
396 (Chien, Khan et al. 2012). Having protocols appear in the same publication as the meta-analysis
397 findings is generally insufficient to provide such assurance.

398 Following is a list of the broad topics a meta-analysis protocol should include. Each is discussed
399 further in the paragraphs that follow:

- 400 • The planned purpose of the meta-analysis
- 401 • The background information available at the time of protocol development that
402 motivated the meta-analysis
- 403 • The design features of the meta-analysis, including outcome definition and
404 ascertainment, exposure periods and assessment, comparator drugs, and target subject
405 population
- 406 • A description of the search strategy that will be used to identify candidate trials and
407 the criteria that will be applied for trial selection
- 408 • The analysis strategy for conducting the meta-analysis, including planned subgroup
409 analyses and sensitivity analyses

410 Planned purpose: The planned purpose should be clearly stated in the protocol, with sufficient
411 background material to explain the reason for conducting the meta-analysis. Examples include:
412 to estimate a specific risk, to evaluate risk in a subgroup of patients, to identify risk factors or
413 effect modifiers, to examine whether risk changes over time, or to assess accumulating evidence
414 on product safety as ongoing studies of the product complete. The weight of evidence provided
415 by a meta-analysis planned specifically to provide new information or update existing
416 information about a hypothesized risk of a drug would be considered more compelling than that
417 from a meta-analysis designed to explore safety signals or relationships among variables with no
418 stated hypothesis. The distinction is analogous to that made between exploratory and
419 confirmatory clinical trials in drug development, with the latter guided by pre-specified
420 objectives reflected in a final protocol prior to study start.

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421 **Background information:** The protocol should describe the information available prior to
422 designing the meta-analysis that served as motivation for the research. Examples include safety
423 risks identified in a randomized clinical trial of the drug or another drug in the same class,
424 potential relationships between exposure and safety outcomes shown in post-marketing studies
425 of health care data, or potential relationships identified during review of spontaneous adverse
426 event reports.

427 **Design elements:** A clear prospective plan can help protect a meta-analysis against bias and
428 inflation of Type I error by providing the rationale for each design element based on the
429 knowledge and information available during planning. Without such a plan, it is difficult to
430 determine which analyses were planned and which were exploratory or suggested as the analysis
431 progressed. Important among the design elements is outcome ascertainment, including whether
432 the outcome data were collected as part of the design of the individual trials or retrospectively
433 collected as part of the meta-analysis; whether the outcome was actively collected from subjects
434 or passively collected via subject adverse event reports; and whether the outcome was
435 adjudicated, and, if so, how. Clear definitions of the outcome variable and the follow-up period
436 for its ascertainment should be stated, with rationale for the choices thereof. The protocol should
437 state the specific exposure of interest and the comparator. If multiple exposures (multiple doses
438 of one drug or multiple drugs within a class) or comparators are to be combined, this should be
439 stated, and the primary exposure and comparator should be identified.

440 **Search and selection criteria:** The protocol should describe the search algorithm that will be used
441 to identify candidate trials to be considered for inclusion in the meta-analysis. Details should
442 include a description of the sources to be searched, such as the literature or online resources (e.g.,
443 <https://clinicaltrials.gov/>, <https://www.accessdata.fda.gov/scripts/cder/drugsatfda>). The trial
444 inclusion criteria should be described in detail, with the rationale given for each factor used as a
445 basis for trial selection (see Section III.D). The selection process should be masked to study
446 outcome and described in the meta-analysis protocol. Note that even if results are known to some
447 parties, it may be possible to find others who could apply the trial selection criteria for the meta-
448 analysis in an unbiased manner.

449 **Analysis strategy:** The protocol should describe the primary analysis strategy for achieving the
450 study objectives as well as any sensitivity analyses and subgroup analyses planned. The
451 statistical methods for the primary analysis should be stated in the protocol, with additional
452 details provided in the statistical analysis plan. The analysis plan should be finalized prior to
453 conducting the meta-analysis, analogous to the recommendation that a clinical trial's analysis
454 plan be finalized prior to unmasking of treatment codes. Sensitivity analyses should be planned a
455 priori to assess the impact of any unverifiable assumptions on the meta-analysis results. The
456 factors that should be considered in choosing the statistical methods are discussed in section V.

457 C. Reporting Results from a Meta-Analysis

458 Results of a meta-analysis should be reported in a way that provides transparency and full
459 disclosure of the many decisions involved in conducting the meta-analysis. The report should
460 provide enough detail about the selection of trials, the statistical methods applied in the analyses,
461 the results of those analyses, and the rationale for and results of any sensitivity analyses carried

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462 out to enable an evaluation of the impact of bias and multiplicity on the findings and to assess
463 their strength and credibility. The Preferred Reporting Items for Systematic Reviews and Meta-
464 Analyses (PRISMA) statement provides some recommendations on the reporting of systematic
465 reviews and meta-analyses (Moher, Liberati et al. 2009). Although not all the PRISMA
466 components directly apply to meta-analyses that are the focus of this guidance, they should be
467 considered.

468 The report should include the results of the search algorithm used to identify candidate trials and
469 contain enough detail to evaluate the search. The selection process used to determine which of
470 the candidate trials were selected for inclusion in the meta-analysis, which should be by applying
471 the pre-specified criteria, should also be reported. Accounting for the trials that were not selected
472 and the reasons for their exclusion is as important as accounting for the trials that were selected.

473 Characteristics of the individual trials included in the meta-analysis should be summarized,
474 including individual trial design features, durations of exposure and follow-up periods, and
475 patient populations. The report should describe the sources of any trial-level and subject-level
476 data used in the meta-analysis. Summaries of subject-level characteristics should also be
477 provided for the trials to be included in the meta-analysis, including basic demographics,
478 concomitant medication usage, and other important factors thought to impact the exposure-risk
479 relationship under investigation.

480 Any departures from the planned statistical methods should be described, as well as the rationale
481 for those departures. Additional sensitivity analyses determined to be needed after the protocol
482 was finalized, because of characteristics of the particular trials selected, unanticipated data issues
483 encountered during analysis (e.g., zero-event trials), or preliminary findings needing further
484 exploration, should be described and justified.

485 Results corresponding to the pre-specified test of hypotheses, supporting analyses, and
486 sensitivity analyses should be provided in a clear and concise manner, with sufficient detail to
487 aid in interpretation. Point estimates of absolute or relative risk should be accompanied by
488 measures of uncertainty, e.g., confidence intervals. Forest plots are recommended for providing
489 visual summaries of the results from each of the component trials relative to the results of the
490 meta-analysis. These plots are useful in describing study-to-study heterogeneity.

V. STATISTICAL METHODOLOGY CONSIDERATIONS

A. Overview

493 In this section, general recommendations for selecting the statistical methods that will be used to
494 combine evidence from the component trials in a safety meta-analysis are discussed. It is not the
495 goal of this guidance to propose any best method, as no method performs best in all settings, nor
496 is it the goal to restate the relative performance of methods that are well-established and have
497 been compared in the literature pertinent to safety meta-analyses. Rather, this guidance
498 recommends that the statistical methods used in a meta-analysis be aligned with the analysis
499 objectives and hypotheses under investigation and be consistent with the study designs and data
500 collected in the individual trials. The choice of methods should be justified based on the stated

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501 objectives and documented in the protocol or analysis plan (see Section IV); sensitivity of the
502 results to departures from assumptions required for correct application of the methods should be
503 examined as part of the planned analysis strategy. Note that although this guidance generally
504 recommends the use of subject-level data when available, it is recognized that meta-analyses
505 conducted based on trial-level data only may be useful in certain settings (see Section VI.B.).
506 The recommendations in this section apply to trial-level meta-analysis as well.

507 The material in this section falls into three broad areas: statistical properties of the analysis
508 methods, heterogeneity, and sensitivity analysis.

509 **B. Statistical Properties of Risk Estimates and Hypothesis Tests**

510 The statistical approach for a safety meta-analysis should ensure that the estimator and/or
511 hypothesis test have good statistical properties, namely that the resulting risk estimate is
512 approximately unbiased and sufficiently precise, the standard error of the estimated risk is
513 accurate, and the associated confidence intervals have accurate coverage properties. Tests of
514 hypotheses about the risk should have good operating characteristics, i.e., the Type I and II error
515 probabilities should be accurate, and the power maximized given the data available.

516 An important principle involved in estimating risk from a meta-analysis is that the randomized
517 comparisons of the individual trials should be maintained when analyzing the combined data. In
518 other words, when comparing drug A to drug B, subjects randomly assigned to drug A in a single
519 trial are compared to subjects assigned to drug B from the same trial and not to subjects from
520 other trials. In the statistics literature, this is referred to as stratifying the analysis by trial.
521 Intuitively, this implies that the overall comparative measure of risk is based on combining the
522 comparative risk measures from the individual trials using recommended statistical methods.
523 Stratifying the analysis by trial is preferred to combining data across all subjects in the
524 component trials by subject group prior to estimating risk, often referred to as simple pooling, as
525 this ignores the randomized comparisons of the individual trials and can produce misleading
526 findings.

527 When one or more of the trials included in the pooling does not employ a one-to-one
528 randomization scheme, simple pooling of trial data can result in a phenomenon known as
529 *Simpson's paradox* (Chuang-Stein and Beltangady 2011). When there are large sample size
530 disparities among the trials with different randomization allocations, the impact of this
531 phenomenon can be quite large. The hypothetical example in Table 1 illustrates an extreme
532 example of Simpson's paradox in which, for each of four trials, the estimated risk of a safety
533 event is identical for both Drug A and Drug B. With simple pooling, however, the risk for Drug
534 A appears to be more than twice as high as that for Drug B (12.8 percent vs. 6.2 percent).

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Table 1. An Illustration of Simpson's Paradox from Incorrect Pooling of Data

Trial	Drug A			Drug B		
	Events	Patients	Risk	Events	Patients	Risk
1	1	100	1.0%	2	200	1.0%
2	1	100	1.0%	2	200	1.0%
3	200	1200	16.7%	50	300	16.7%
4	2	200	1.0%	2	200	1.0%
Total	204	1600	12.8%	56	900	6.2%

536 It is sometimes of interest to combine multiple doses of a drug in one or more of the component
537 trials to gain statistical power and improve the precision of the risk estimate in a meta-analysis.
538 The combination of arms should be performed within each trial and the overall analysis should
539 still be stratified by trial to avoid Simpson's paradox in this setting.

540 Sparse data resulting from rare safety outcomes pose particular problems in a meta-analysis. The
541 statistical methods chosen for the analysis should perform well when the number of outcome
542 events is very small in one or more of the component trials or in one or more treatment groups
543 within a trial. Some commonly used methods perform well when there are ample events, but not
544 so well when events are sparse (Bradburn, Deeks et al. 2007). For example, inverse variance
545 weighting involves estimating risk with a weighted estimate of trial results, where weights are
546 computed as the inverse of the trial level variance estimates. With sparse data, the estimated
547 variances may not be well-determined, resulting in an unstable risk estimate. If some of the
548 component trials have no events, the choice of methods is even more limited.

549 We do not recommend the use of continuity corrections, one approach for handling zero-event
550 trials or trials with zero events in one or more treatment groups. Because it may not be apparent
551 with some software packages if and how continuity corrections are incorporated, caution is
552 needed to avoid their inadvertent use. Continuity corrections approaches generally involve
553 adding small quantities to the zero event counts prior to analysis. Although their use allows zero-
554 event trials to be included in a meta-analysis, the results may be biased. Note that the use of ratio
555 effect measures, such as the risk ratio or hazard ratio, is more challenging in the presence of
556 zero-event trials than is the use of risk difference measures, such as the Mantel-Haenszel risk
557 difference (Greenland and Robins 1985). Another approach is to consider Bayesian methods for
558 meta-analysis (Sutton and Abrams 2001) (Spiegelhalter, Abrams et al. 2004), which can
559 incorporate information on trials with no events, even when a relative risk measure is used. The
560 performance of any proposed method for dealing with zero-event trials should be established and
561 the choice justified for a particular meta-analysis application.

562 The ability to replicate the results of a meta-analysis with an independent study will increase the
563 persuasiveness of the findings. One such approach is to analyze one or more newly available
564 trials to see if the results agree quantitatively and/or qualitatively with the results of an existing
565 meta-analysis. Alternatively, an existing meta-analysis can be updated as new trials become
566 available. Although this sequential approach to meta-analysis provides an efficient way to update
567 risk estimates with new study results, the impact of repeated hypothesis tests about that risk
568 should be taken into account (Whitehead 1997).

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C. Heterogeneity

570 In any meta-analysis, heterogeneity of the drug effect among the component trials is expected
571 and should be addressed at the design stage. If there is strong reason to believe trials will have
572 importantly different drug effects based on known factors such as characteristics of the trial
573 populations, the specific interventions, or other trial design features, then the statistical analysis
574 should account for this expected variation. This may involve use of a statistical model that allows
575 for different effects based on known factors. Alternatively, it may be of interest to conduct
576 separate analyses for distinct groups of trials that vary with respect to one or more important
577 design factors. For example, if the set of component trials consists of both placebo-controlled
578 and active-controlled trials, a reasonable approach would be to perform a meta-analysis for each
579 group of trials separately, taking into account what is known about the active control effect. In
580 some situations the trials may be so heterogeneous that it is not possible to conduct a meta-
581 analysis.

582 The most common approach to account for residual heterogeneity in drug effects across trials,
583 after accounting for expected heterogeneity attributable to known factors, is to incorporate
584 individual-trial treatment effects in the analysis model as either fixed or random effects. The
585 meta-analysis literature includes a great deal of discussion about choosing between the two
586 (Borenstein, Hedges et al. 2010). In the context of a meta-analysis, use of a fixed effects model is
587 often interpreted as assuming a common effect exists across the trials, in contrast to the use of a
588 random effects model, where the effects are assumed to vary across trials according to some
589 probability distribution. This distinction is not usually made in other, similar areas of application,
590 e.g., in managing centers in a multi-center trial (Senn 2000). In the statistics literature on multi-
591 center trials (see, e.g., ICH E9), use of a fixed effects model is not as restrictive in that the model
592 can specify either a common effect across centers or different, but non-random, effects for each
593 center (i.e., by including the center by treatment interaction terms in the model). In the latter
594 case, interest lies in estimating an average effect across the centers. Similarly, in meta-analysis, it
595 may be desirable to allow effects to vary by trial with the inclusion of treatment by trial
596 interaction terms in the fixed effects model, and, in this case, averaging across trials with
597 appropriate methods provides the drug effect of interest.

598 Use of a random effects model in a meta-analysis implies an interest in estimating the average
599 effect for some larger population of trials that are believed to be adequately represented by the
600 trials in the analysis, and this parallels use of a random effects model in a multi-center trial; i.e.,
601 interest lies in estimating the average effect for a larger population of centers for which the trial's
602 centers provide adequate representation. Arguments may be made against the use of random
603 effects models in a meta-analysis based on the belief that the trials available for analysis are not a
604 random sample of some larger population of trials — that is, all relevant trials are included in the
605 meta-analysis. It has been pointed out, however, that even when there is no interest in making
606 inference to a larger population of trials, use of a random effects model may produce more
607 appropriate results, due to the better characterization of the between- and within-trial variance in
608 the estimation process (Permutt 2003).

609 Both frequentist and Bayesian methods are available for random-effects meta-analysis, and the
610 difference between the two lies in the assumptions made about the distributions of the random

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611 effects, with Bayesian methods offering more flexibility (Muthukumarana and Tiwari 2016).
612 Bayesian methods also allow multiple sources of variation to be incorporated in the modeling
613 and estimation process. For example, in a meta-analysis designed to examine a specific risk for a
614 class of drugs, one may assume there is a component of variation among different drugs within
615 the class and a separate component among trials involving a single drug. To date, the Agency has
616 limited experience in evaluating meta-analysis submissions that use Bayesian methods, but
617 supports the consideration of Bayesian and other methods that achieve the desired properties
618 discussed in this section.

619 For safety meta-analysis, the goal is to determine whether a significant risk is causally related to
620 exposure to the drug, and the power available for that test should be maximized. Use of a fixed
621 effects model will usually provide optimal power for detection of risk and also reflects a primary
622 interest in the average effect among only those trials included in the meta-analysis. The parallel
623 with the establishment of efficacy for drug approval is relevant here. The selective populations
624 included in premarket efficacy trials may not fully represent the broader patient populations seen
625 in clinical practice, but are still central in making regulatory decisions. However, for the
626 quantification of the risk itself, a random effects model might be more appropriate, as the
627 incorporation of the between-trial variance might better reflect the uncertainty associated with
628 the risk estimate. Under all scenarios, the statistical inference should properly reflect the
629 assumptions made for the fixed or random effects model used; in particular, the variance of the
630 estimator should properly reflect whether the trial effects are constant, non-constant, or random.

D. Sensitivity Analysis

631 Sensitivity analyses play an important role in examining the impact of meta-analysis design
632 decisions on the findings as well as the strength of evidence provided by the meta-analysis. The
633 goal of any sensitivity analysis should not be to search for additional findings, but to support and
634 understand the primary findings of the meta-analysis. Trial inclusion criteria, outcome definition,
635 time period within which the safety outcome of interest is to be measured, and analysis method
636 are examples of design characteristics that may be varied as part of a sensitivity analyses.

637 For example, if a meta-analysis protocol and statistical analysis plan called for including only
638 those safety events that occurred during exposure periods in the risk estimate, then a sensitivity
639 analysis that included all reported events, regardless of whether subjects were on or off drug,
640 could provide important information about the observed risk estimate. A decreased event rate in
641 off-treatment periods could, in this example, support causality (depending on the hypothesized
642 mechanism). Similarly, a meta-analysis that included one very large study contributing a large
643 proportion of subjects and events could raise a concern that it was overly influencing the meta-
644 analytic results. A sensitivity analysis that excluded that study would have reduced numbers of
645 subjects and events and lower power to yield a significant finding, but a risk estimate that was
646 consistent with the original estimate would add to the weight of evidence of the finding.

647 It is often of interest to examine the consistency of findings from a meta-analysis across
648 subgroups based either on trial-level or subject-level characteristics. Trial-level factors that might
649 be of interest include the comparator treatment, dose and duration of treatment, background
650 therapy, and subject inclusion criteria. Subject-level factors may vary within trials, and subject-

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652 level data are required to provide estimates for each subgroup. In the antidepressant meta-
653 analysis example of section VII, age was an important factor of specific interest, because the
654 meta-analysis was motivated by an earlier meta-analysis of pediatric subjects. The number of
655 subgroups to be examined should be kept to a minimum to avoid the consequences of multiple
656 testing. Given the multiplicity issues, subgroup findings are seldom viewed as definitive in safety
657 meta-analyses.

658 **VI. STRENGTH OF EVIDENCE AND REGULATORY DECISIONS**

659 **A. Critical Factors in Determining the Strength of Evidence**

660 Regulatory decisions related to drug safety are generally taken after considering the totality of
661 available evidence, which may include meta-analytic findings, as well as other factors such as
662 risk-benefit considerations, availability of alternative treatments, biological and clinical
663 plausibility of the drug-risk relationship, and available regulatory options. The strength of
664 evidence provided by the meta-analysis may influence a regulatory decision by FDA. The factors
665 discussed above that FDA generally considers in determining the strength of evidence with
666 respect to a safety-related regulatory decision can be summarized as follows:

- 667 • Quality and appropriateness of the individual trials for the meta-analysis objectives
 - 668 ➤ Quality and completeness of safety outcome ascertainment
 - 669 ➤ Appropriateness of studied populations and exposure and follow-up periods
 - 670 ➤ Protocol adherence in the individual trials (e.g., compliance with investigational
 - 671 treatment, loss to follow-up, etc.)
 - 672 ➤ Availability and quality of subject-level data
- 673 • Prespecification and adequacy of documentation
 - 674 ➤ Prespecification and documentation of objectives, available knowledge, trial
 - 675 inclusion criteria, and choice of comparators, outcomes, statistical methods, and
 - 676 subgroups
 - 677 ➤ Documentation that trial outcomes were not used as part of the trial selection
 - 678 criteria
 - 679 ➤ Documentation of meta-analysis results including summaries of trials, subjects,
 - 680 outcomes, effect estimates, measures of uncertainty, and sensitivity analyses
- 681 • Appropriateness of statistical methods
 - 682 ➤ Approach used for combining trials
 - 683 ➤ Methods to handle sparse data or rare events
 - 684 ➤ Methods to address heterogeneity
 - 685 ➤ Sensitivity analyses
 - 686 ➤ Validity of uncertainty estimates (e.g., confidence intervals or credible intervals)

687 Although not previously discussed, the magnitude of the estimated risk and associated measures
688 of uncertainty are also important. A large estimated risk will generally be more convincing than a
689 small to moderate one, because it will provide more assurance that an effect is real even in the
690 presence of potential biases. Similarly, smaller p-values or narrower confidence intervals, both
691 measures of uncertainty, provide additional assurance on the findings of the meta-analysis. For

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692 safety meta-analyses, however, there is potential for bias from both known (e.g., selection of
693 trials based on their outcomes) and unknown (biases that cannot be identified from the data used
694 to conduct the meta-analysis) sources. Given this difficulty, standard measures of uncertainty,
695 such as significance levels, should be interpreted with caution.

696 One approach to account for the many potential sources of bias and error in a meta-analysis is to
697 replace the commonly used test size or alpha level for hypothesis testing, $\alpha = 0.05$, with an
698 arbitrarily lower value (e.g., 0.01 or 0.001) in order for the results to be considered convincing.
699 The choice of a lower value would reflect the recommendation to compensate for known and
700 unknown sources of potential bias as well as to minimize the impact of multiplicity resulting
701 from multiple comparisons. Such an approach would be important if the meta-analysis is the
702 only basis for decision-making, as it will explicitly reflect the higher degree of uncertainty that
703 exists for meta-analysis results. At the same time, there are often other sources of safety
704 information so that the significance level for the meta-analysis is only one of many factors taken
705 into consideration. Consequently, no single test size (alpha level) and no single confidence level
706 can be recommended for deciding the level of statistical significance for results from a safety
707 meta-analysis to be relied upon. The potential for harm may be so serious that marginally
708 significant findings could prompt regulatory consideration. In this setting, however, the sources
709 of bias and error related to the meta-analysis should be identified and accounted for wherever
710 possible.

711 In addition to the magnitude of the observed effect and the level of uncertainty, the robustness of
712 the risk estimate to appropriate sensitivity analyses can also support the strength of the meta-
713 analysis findings. The importance of sensitivity analyses is described in section V, as their results
714 play an important role in determining the strength of evidence. Risk estimates that are reasonably
715 robust to the inclusion or exclusion of particular studies, or to changes in the statistical analysis
716 methods used and assumptions required for appropriate use of those methods, will carry a greater
717 weight of evidence than estimates that vary widely with such changes.

718 Similarly, risk estimates that are consistent across trials will also carry greater weight. In section
719 IV, the use of forest plots or other graphical display of the study-specific risk estimates and their
720 confidence intervals is advocated as a descriptive assessment of study-to-study heterogeneity.
721 Absent any known cross-study differences, a high degree of similarity among study-specific
722 results will strengthen the evidence provided by the meta-analytic summary risk estimate.
723 Conversely, a large amount of variability among studies would make a marginal risk estimate (in
724 terms of lack of statistical significance or small in magnitude) less persuasive.

B. Hierarchy of Evidence for Decision-Making

726 The factors described above for evaluating the strength of meta-analytic findings can be used to
727 define a hierarchy of evidence against which meta-analyses conducted or reviewed for regulatory
728 purposes should be evaluated.

- 729 • A top tier meta-analysis is one that is prospectively planned prior to the conduct of the
730 trials to be included, and where the component trials are designed with the meta-analysis
731 objectives in mind. The trials have well-ascertained outcomes and exposure periods, and

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732 subject-level data are available for analysis. This level represents a gold standard not
733 often realized in practice but useful as a benchmark in evaluating the quality of a meta-
734 analysis.

- 735 • The next level down is a prospectively planned meta-analysis based on existing trials that
736 were designed for other purposes but for which the quality of the data and the
737 ascertainment of outcomes and exposure are adequate to support the planned analysis.
738 Further, all meta-analytic study plans and trial inclusion decisions were made without
739 knowledge of the study outcomes for the safety events of interest.
- 740 • The lowest tier, representing the least useful evidence for regulatory decision-making,
741 corresponds to meta-analyses for which prospective planning did not occur, or is in
742 doubt, study outcomes and trial inclusion decisions were made with outcome data in
743 hand, and one or more of the important quality factors is in question, e.g., lack of rigor in
744 outcome ascertainment, lack of subject-level data for use in determining exposure, use of
745 inappropriate statistical methods such as simple pooling of trial data, or other issues.

746 Between the bottom and top tiers lies a broad range of meta-analyses for which an evaluation of
747 the strength of evidence provided should include careful consideration of the important factors
748 delineated in the previous subsections.

749 The level of evidence from a meta-analysis that is based solely on study level summary data,
750 either prospective or retrospective, is generally considered to be lower than one for which
751 subject-level data are available, as the party conducting the meta-analysis has little ability to
752 judge the quality or completeness of the data or the appropriateness of the analysis methods used.
753 On the other hand, if the outcome is relatively judgment-free and well-ascertained (e.g. mortality
754 or perhaps stroke rate), these meta-analyses may still play a role in regulatory decisions. A study-
755 level meta-analysis could be used as a first step to determine whether a more resource intensive
756 subject-level meta-analysis is needed, perhaps based on the same studies. A hybrid would be a
757 combination of studies for which subject level data are available for a subset; the mix would
758 determine where in the hierarchy such a meta-analysis should be placed. The recommendations
759 laid out in this guidance for producing high-quality meta-analyses apply regardless of the level
760 (subject- or trial-level) of analysis involved.

761 There are two categories of meta-analyses considered particularly problematic for the regulatory
762 framework and worth mentioning here. The first includes meta-analyses reported in the literature
763 with no prior publication or credible record of a protocol to guide the selection of studies or
764 prespecification of study objectives and analysis strategy. This type of meta-analysis is likely
765 insufficient for regulatory purposes, for the reasons outlined in section IV. Even if the studies
766 included in the meta-analysis represent a reasonable subset of those available (as opposed to only
767 published studies), without documentation of a prespecified plan for deciding which to include
768 and identifying outcomes of interest, it is usually not possible to determine what was known at
769 the time the studies were selected, what analysis methods were chosen, or how many different
770 analyses were conducted, in what sequence, and for which study populations or subgroups.
771 Evidence from such an analysis would generally be considered too weak to support regulatory
772 decision-making without further confirmation of the findings.

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773 The second category includes meta-analyses that are based solely on safety results appearing in
774 the literature. Limiting the meta-analysis to studies whose results appeared in publications about
775 the exposure-risk relationship can introduce publication bias. This well-known phenomenon
776 arises from the concern that studies failing to find a significant association between drug use and
777 risk are not published at the same frequency as studies that show an association, and even among
778 those published, bias may occur due to a failure to include certain safety outcomes in the
779 publication and failure to include studies that did not show the outcome sought (Chalmers, Levin
780 et al. 1987). Further, the information contained in the publication for each study may be lacking
781 in detail, and without access to subject-level data, it may not be possible to rule out bias or severe
782 heterogeneity in the results. For example, even if the results for the safety outcome of interest are
783 reported for each trial, the details of how events were defined, measured, or adjudicated in the
784 trials may not be clear, and it may not be possible to determine if the safety events of interest
785 occurred on or off drug. Subject-level data are typically not available in publications of
786 completed trials, limiting the ability to resolve these issues.

787 In summary, a number of important factors should be involved in determining the credibility of
788 evidence from a particular meta-analysis. These factors range from the knowledge about and
789 documentation of eligible studies, both published and unpublished; the quality and relevance of
790 the studies selected as well as the process and timing of selection; and the validity of the
791 statistical analysis that supports the inferential conclusions and the strength of the findings,
792 evaluated against sources of potential or real bias. Whether or not the findings of a meta-analysis
793 influence regulatory decision-making will generally depend, in part, on the strength of evidence
794 provided by the findings, as determined by a careful evaluation of the important factors
795 described in this guidance.

796 VII. EXAMPLES

797 A. Example 1: Antidepressant Use and Suicidal Events in Adults

798 This example illustrates the use of a meta-analysis to evaluate risks associated with a class of
799 drugs and represents a prospectively planned meta-analysis of retrospective data, falling into the
800 middle tier of the hierarchy of evidence discussed in section VI.B. The research hypotheses,
801 study inclusion criteria, outcome measures, and statistical analysis plan were all specified prior
802 to the conduct of the meta-analysis. Outcomes were uniformly adjudicated across studies,
803 pooling of study data was accomplished with stratification, and subject-level data were available
804 to explore subgroups as well as trends in risks across time. The interpretation of the findings,
805 which resulted in a boxed warning for labeling of drugs in the class, reflects appropriate
806 consideration given to the level of statistical significance, and to the consistency of findings.

807 In 2004, FDA completed a meta-analysis of studies of pediatric patients that showed an
808 association of antidepressant drugs and suicidal behavior and ideation (Hammad, Laughren et al.
809 (2006). Unsolicited information provided by drug sponsors to FDA and published articles
810 motivated this meta-analysis. Based on the meta-analysis findings and deliberations from a

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811 meeting in 2004 of FDA Advisory Committees (69 FR 47157⁴) and further consideration by
812 FDA, a boxed warning was added to the labeling of all antidepressants concerning use in
813 pediatric patients. Other FDA Advisory Committees later asked FDA to explore the association
814 in adult patients (71 FR 66545⁵.)

815 For this purpose, FDA planned and conducted a meta-analysis of randomized clinical trials of
816 antidepressants. FDA is uniquely positioned to address this research question, because of the
817 Agency's knowledge of marketed products in the drug class in question. The meta-analysis had
818 several important features that supported its quality and utility for regulatory actions: (1)
819 hypotheses generated from previous and independent evidence provided the meta-analysis
820 objectives; (2) the meta-analysis was based on well-defined inclusion criteria and a complete set
821 of the trials that met the inclusion criteria; (3) the meta-analysis employed rigorous and
822 consistent outcome definitions across trials and patients; (4) the meta-analysis was based on a
823 prespecified plan; and subject-level data was available.

824 FDA requested from all manufacturers of antidepressants all available subject-level data from
825 randomized placebo-controlled trials of antidepressants. Basing the meta-analysis on data
826 available to sponsors, while not inclusive of all potentially available data, has some important
827 advantages. Because of regulatory requirements, trials from drug manufacturers typically contain
828 detailed subject-level data including medical history, baseline characteristics, subject
829 dispositions, patient outcomes, and adverse events. Focusing on the relatively small group of
830 drug manufacturers (nine) allowed for the timely acquisition of the large amounts of pertinent
831 data. Overall, the FDA obtained subject-level data considered usable for 372 trials.

832 The meta-analysis was prospectively planned but was based on previously collected data.
833 Because the specific outcomes of interest were not systematically collected and adjudicated
834 during the conduct of the trials, FDA provided specific instructions to the individual sponsors to
835 conduct a retrospective identification and adjudication of potential suicidal behavior and ideation
836 events from the subject-level data. The outcome definition required that the suicidal behavior and
837 ideation events occurred on randomized treatment or within one day of stopping the randomized
838 treatment. Based on adverse event reporting, potential events were identified with a specified
839 algorithm. Based on blinded narratives of the events, qualified personnel classified the events
840 into specific outcomes including: completed suicide, attempted suicide, preparatory actions
841 toward imminent suicidal behaviors, and suicidal ideation based on the Columbia Classification
842 Algorithm for Suicide Assessment (Posner, Oquendo et al. 2007). The overall process resulted in
843 outcome measures that were consistently and rigorously defined across trials and subjects.

844 The meta-analysis employed a prespecified plan that included the trial inclusion criteria,
845 hypotheses, outcome definitions, analysis methods, sensitivity analyses, and subgroups. The
846 primary analysis method incorporated stratification by trial and accounted for the sparse nature
847 of the outcome events by using exact statistical methods for hypothesis testing. Sensitivity

⁴ Briefing package:

<http://web.archive.org/web/20040911055410/https://www.fda.gov/ohrms/dockets/ac/04/briefing/2004-4065b1.htm>

⁵ Briefing package: <https://wayback.archive-it.org/7993/20170405070114/https://www.fda.gov/ohrms/dockets/ac/06/briefing/2006-4272b1-01-FDA.pdf>

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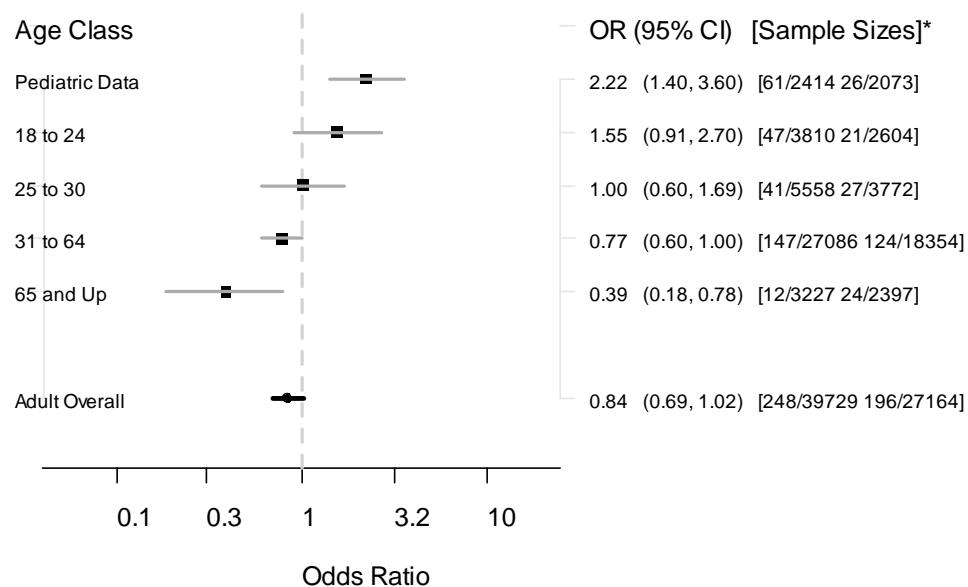
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848 analyses were planned to examine the possibility and consequences of the following: differential
849 exposure time between the randomized drug arms; heterogeneity of the effect measure across the
850 trials; and trials with no events. The subject-level data allowed for the examination of important
851 subgroups, including subject age, and for the examination of changing risk over time.

852 FDA presented the meta-analysis findings to a 2006 meeting of FDA Advisory Committees
853 (FDA 2006) and sought advice on the interpretation and possible regulatory actions based on the
854 findings of the meta-analysis. The meta-analysis found that the overall association of
855 antidepressant drugs and suicidal behavior and ideation was not statistically significant in adult
856 subjects, in contrast to the FDA meta-analysis of pediatric subjects. However, the association
857 was nearly statistically significant for young adults, and a clear pattern emerged with respect to
858 patient age (see Figure 1). The result from the pediatric meta-analysis supported this trend.

859 Based on the totality of the evidence, including results from the meta-analysis, FDA requested
860 that manufacturers update the boxed warning on all antidepressants to include the risk of suicidal
861 behavior and ideation associated with antidepressants for young adult patients in addition to
862 pediatric patients. The warning states that the effect was not seen in adults over the age of 24,
863 and for adults aged 65 and older, there was a reduction in risk. It should be appreciated that the
864 clear pattern observed with respect to age and not just statistical significance led to the warning.

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865

866 **Figure 1: FDA Meta-Analysis of Antidepressants and Suicidal Behavior and Ideation.**

867 Note: Pediatric results from previous FDA meta-analysis of pediatric patients (Hammad,
868 Laughren et al. 2006).

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B. Example 2: Tiotropium and Cardiovascular Events

870 This example illustrates FDA's consideration of the cardiovascular safety of the drug tiotropium
871 and shows how the relative strengths of a well-designed, large, long-term trial and a meta-
872 analysis based on published literature as well as other trial-level information (Michele, Pinheiro
873 et al. 2010) were factored into a regulatory decision. Tiotropium bromide inhalation powder is a
874 long-acting anticholinergic approved for use in treating bronchospasm associated with chronic
875 obstructive pulmonary disease (COPD) and for reducing COPD exacerbations. The potential
876 association of the drug with cardiovascular events was first reported to FDA based on an analysis
877 of adverse events from 29 placebo-controlled trials conducted by the drug manufacturer. In
878 particular, the simple pooled analysis of these studies showed that the drug had an excess number
879 of strokes associated with its use. The pooled analysis was intended to identify potential signals
880 for further evaluation and examine a range of adverse events. As is typical for such analyses,
881 findings from the pooled analysis were not adjusted for multiplicity associated with examining
882 multiple endpoints.

883 Because of the severity of the clinical outcomes, FDA issued a communication informing the
884 public of the potential safety signal and FDA's efforts to investigate the findings. The
885 communication noted that data from a large, four-year study called UPLIFT (Tashkin, Celli et al.
886 2008) would soon be available and would provide additional long-term safety data on the drug.
887 Following the FDA communication, an article appeared on a meta-analysis of 17 randomized
888 trials reporting a statistically significant increase in a cardiovascular composite outcome
889 (cardiovascular death, myocardial infarction, and stroke) associated with inhaled anticholinergics
890 (consisting of tiotropium and ipratropium) (Singh, Loke et al. 2008). At the same time, the
891 results from UPLIFT had become available, and the initial review did not support a finding that
892 tiotropium was associated with an increased risk of stroke, heart attack, or cardiovascular death.

893 A comparison between the pooled analysis of 29 trials conducted by the manufacturer and the
894 UPLIFT trial highlights some important differences between the two sources of safety
895 information. Although the pooled analysis contained more than twice as many subjects as
896 UPLIFT (13,544 versus 5,992), the study duration of UPLIFT (4 years) was substantially longer
897 than the durations of the trials in the pooled analysis (1 – 12 months). Consequently, UPLIFT
898 provided more than twice as many person-years of follow-up (17,721 person-years) than the
899 pooled analysis (7,636 person-years). Additionally, UPLIFT prospectively collected data on
900 death and adjudicated cause of death for all subjects, including subjects who withdrew from the
901 study.

902 In 2009, FDA convened an advisory committee meeting to discuss the results of UPLIFT and the
903 published meta-analysis. The advisory committee concluded (11 votes to 1) that the results of
904 UPLIFT adequately addressed the cardiovascular safety concerns that had been raised for
905 tiotropium based on the initial pooling of 29 trials by the manufacturer and the published meta-
906 analysis. The committee noted methodological concerns with the published meta-analysis,
907 including lack of accounting for differential withdrawal rates between treatment groups and the
908 potential for publication bias due to including only studies reporting an increase in
909 cardiovascular events with use of tiotropium in the meta-analysis. The committee also noted
910 concerns about the heterogeneity of trial designs in the review, including differences in study

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911 drug, comparator drug, trial duration, and studied population. Based on the strength of the
912 UPLIFT study findings and the methodological concerns of the published meta-analysis, FDA
913 concluded that the available data did not support an association between the drug and adverse
914 cardiovascular events.

915 The tiotropium example shows that a meta-analysis based on trial-level summaries may not
916 agree with a large trial that is well designed specifically with a safety outcome as a primary
917 objective. However, the Agency's position on the safety and effectiveness of a drug is based on
918 the best information available at the time. In the tiotropium example, FDA issued a series of
919 public communications to apprise the public of the latest safety information available and FDA's
920 intended course of action. The example shows FDA's intention to carefully evaluate potential
921 safety risks while balancing the need to not unnecessarily discourage or restrict the use of safe
922 and effective drugs. The example also shows FDA's intention to act in a transparent manner, to
923 the extent possible, based on the available data to ensure the safe use of drugs.

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