Bias in meta-analysis detected by a simple, graphical test
Matthias Egger, George Davey Smith, Martin Schneider, Christoph Minder

Abstract

Objective: Funnel plots (plots of effect estimates against sample size) may be useful to detect bias in meta-analyses that were later contradicted by large trials. We examined whether a simple test of asymmetry of funnel plots predicts discordance of results when meta-analyses are compared to large trials, and we assessed the prevalence of bias in published meta-analyses.

Design: Medline search to identify pairs consisting of a meta-analysis and a single large trial (concordance of results was assumed if effects were in the same direction and the meta-analytic estimate was within 30% of the trial analysis of funnel plots from 37 meta-analyses identified from a hand search of four leading general medicine journals 1993-6 and 38 meta-analyses from the second 1996 issue of the Cochrane Database of Systematic Reviews.

Main outcome measure: Degree of funnel plot asymmetry as measured by the intercept from regression of standard normal deviates against precision.

Results: In the eight pairs of meta-analysis and large trial that were identified (five from cardiovascular medicine, one from diabetic medicine, one from geriatric medicine, one from perinatal medicine) there were four concordant and four discordant pairs. In all cases discordance was due to meta-analyses showing larger effects. Funnel plot asymmetry was present in three out of four discordant pairs but in none of concordant pairs. In 14 (38%) journal meta-analyses and 5 (13%) Cochrane reviews, funnel plot asymmetry indicated that there was bias.

Conclusions: A simple analysis of funnel plots provides a useful test for the likely presence of bias in meta-analyses, but as the capacity to detect bias will be limited when meta-analyses are based on a limited number of small trials the results from such analyses should be treated with considerable caution.

Introduction

Systematic reviews of the best available evidence, regarding the benefits and risks of medical interventions can inform decision making in clinical practice and public health. Such reviews are, whenever possible, based on meta-analysis: a statistical analysis which combines or integrates the results of several independent clinical trials considered by the analyst to be combinable. However, the findings of some meta-analyses have later been contradicted by large randomised controlled trials. Such discrepancies have brought discredit on a technique that has been controversial since the outset. The appearance of misleading meta-analysis is not surprising considering the existence of publication bias and the many other biases that may be introduced in the process of locating, selecting, and combining studies.

Funnel plots, plots of the trials' effect estimates against sample size, may be useful to assess the validity of meta-analyses. The funnel plot is based on the fact that precision in estimating the underlying treatment effect will increase as the sample size of component studies increases. Results from small studies will scatter widely at the bottom of the graph, with the spread narrowing among larger studies. In the absence of bias the plot will resemble a symmetrical inverted funnel. Conversely, if there is bias, funnel plots will often be skewed and asymmetrical. The value of the funnel plot has not been systematically examined, and symmetry (or asymmetry) has generally been defined informally, through visual examination. Unsurprisingly, funnel plots have been interpreted differently by different observers.

We measured funnel plot asymmetry numerically and examined the extent to which such asymmetry predicts discordance of results when meta-analyses are compared to single large trials of the same issue. We used the same method to assess the prevalence of funnel plot asymmetry, and thus of possible bias, among meta-analyses published in leading general medicine journals and meta-analyses disseminated electronically by the Cochrane Collaboration.

Methods

Measures of funnel plot asymmetry
We used a linear regression approach to measure funnel plot asymmetry on the natural logarithm scale of the odds ratio. This corresponds to a regression analysis of Galbraith's radial plot, although in the present context the regression is not constrained to run through the origin. The standard normal deviate (SND), defined as the odds ratio divided by its standard error, is regressed against the estimate's precision, the latter being defined as the inverse of the standard error (regression equation: SND = a + b × precision). As precision depends largely on sample size, small trials will be close to zero on the x axis. Small trials may produce an odds ratio that differs from unity, but because the
standard error will be large, the resulting standard normal deviate will again be close to zero. Small trials will thus be close to zero on both axes—that is, close to the origin. Conversely, large studies will produce precise estimates and, if the treatment is effective, also produce large standard normal deviates. The points from a homogeneous set of trials, not distorted by selection bias, will thus scatter about a line that runs through the origin at standard normal deviate zero ($a = 0$), with the slope $b$ indicating the size and direction of effect. This situation corresponds to a symmetrical funnel plot.

If there is asymmetry, with smaller studies showing effects that differ systematically from larger studies, the regression line will not run through the origin. The intercept $a$ provides a measure of asymmetry—the larger its deviation from zero the more pronounced the asymmetry. If the smaller studies show big protective effects, they will force the regression line below the origin on the logarithmic scale. Negative values will therefore indicate that smaller studies show more pronounced beneficial effects than larger studies. In some situations (for example, if there are several small trials but only one larger study) power is gained by weighting the analysis by the inverse of the variance of the effect estimate. We performed both weighted and unweighted analyses and used the output from the analysis yielding the intercept with the larger deviation from zero.

In contrast to the overall test of heterogeneity, the test for funnel plot asymmetry assesses a specific type of heterogeneity and provides a more powerful test in this situation. However, any analysis of heterogeneity depends on the number of trials included in a meta-analysis, which is generally small, and this limits the statistical power of the test. We therefore based evidence of asymmetry on $P < 0.1$, and we present intercepts with 90% confidence intervals. The same significance level has been used in previous analyses of heterogeneity in meta-analysis.

Identification of meta-analyses and matching large randomised trials

A Medline search (Kniest-Ritter Information Services, Berne, Switzerland) covering the period January 1985 to April 1996 was performed in April 1996 to identify published meta-analyses. For this purpose the word “meta-analysis” was entered in a free text search. The articles identified included all those indexed with the Medical Subject Heading (MeSH) keyword “meta-analysis,” which was introduced in 1989, and articles without the keyword which carried the word meta-analysis in their title or abstract. Results were tabulated by source of publication, and the items published in journals which yielded 30 or more hits were examined further. Meta-analyses of controlled trials combining at least five trials with binary endpoints were identified.

Large scale randomised controlled trials of the same interventions which had been published after the meta-analyses were identified by a Medline search using appropriate keywords. Large trials had to provide an effect estimate with a precision of at least 5. For example, a trial among patients with heart failure in which mortality in the control group at three months is 5% and in which mortality is reduced to 3% among treated patients will need to randomise 2800 patients to measure this effect with a precision of 3 and about 12 000 patients for a precision of 10. Also, the effect estimate from the large trials had to be of equal or greater precision than the meta-analysis. We scrutinised potential matching pairs of meta-analyses and large trials with regard to study participants, interventions, end points and lengths of follow up. In some cases a further Medline search was performed to identify a meta-analysis published in any journal indexed in Medline which would be more suitable for comparison with the large trial.

Some meta-analyses were published several years before the corresponding large trial. In these cases we examined whether the shape of the funnel plot changed when the meta-analysis was updated with trials published in the intervening period.

Concordance and discordance of results

Comparison of results from meta-analyses and large trials required expressing results on a common scale. Odds ratios were used for this purpose. The meta-analysis and the large trial were considered concordant when effects were in the same direction and the estimates from the meta-analysis were within 30% of the estimate of the single trial. A difference of 30% was proposed by Villar et al to denote high similarity between the results from meta-analyses and large trials.

SAS version 6.11 software package (Statistical Analysis System, Cary, NC) was used for statistical analysis.

<table>
<thead>
<tr>
<th>Concordant pairs</th>
<th>Typical end point</th>
<th>Large trial (year of publication)</th>
<th>Meta-analysis (year of publication)</th>
</tr>
</thead>
<tbody>
<tr>
<td><strong>Concordant pairs</strong></td>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>** Discordant pairs**</td>
<td></td>
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ISIS=Gruppo italiano per lo studio della streptochinasi nell’infarto miocardico; ISIS=International Study of Infarct Survival; DCCT=Diabetes Control and Complications Trial; HOMO=Health Maintenance Organisation study; SOLVD=Studies of Left Ventricular Dysfunction; CLASP, Collaborative Low-dose Aspirin Study in Pregnancy.
Frequency of asymmetry in funnel plots
We performed a hand search of four leading general medicine journals, Annals of Internal Medicine, BMJ, JAMA, and Lancet, from 1993 to 1996 and examined the second 1996 issue of the Cochrane Database of Systematic Reviews(29) to identify meta-analyses of controlled trials. Analyses that were based on at least five trials with categorical end points were examined further. For each intervention and comparison, the outcome measure which was reported in the largest number of trials was selected. To obtain consistency across reviews, end points were recoded if necessary so that the direction of effect for the expected beneficial outcome was in the same direction. For example, in a review of trials of nicotine patches in smoking cessation, continued smoking rather than quitting was considered to be the outcome, so that an odds ratio above unity indicates an adverse effect.

We identified 38 Cochrane reviews and 37 journal meta-analyses. All references of meta-analyses and trials included are available from the authors on request.

Results
Eight pairs consisting of a meta-analysis and a large trial were identified (table 1). Five were from cardiovascular medicine, one from diabetic medicine, one from geriatric medicine, and one from perinatal medicine. Effect estimates from meta-analyses had an average precision of 7.9 compared with 14.4 for large trials. There were four concordant pairs(17-20, 26) and four discordant pairs(14, 25, 27, 29) (fig 1). In all cases discordance was a consequence of the meta-analyses showing more beneficial effects than the large trials. Three out of four discordant meta-analyses showed significant (P<0.1) funnel plot asymmetry; funnel plots from concordant pairs showed no significant asymmetry (fig 2, table 2).

Additional trials were identified for three meta-analyses published several years earlier than the large trials. These were extracted from more recent meta-analyses. When the meta-analysis of trials of

Table 2: Analysis of funnel plot asymmetry

<table>
<thead>
<tr>
<th>Meta-analysis</th>
<th>No of trials</th>
<th>Linear regression analysis</th>
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<tbody>
<tr>
<td>Results concordant with single large trial</td>
<td></td>
<td></td>
</tr>
<tr>
<td></td>
<td></td>
<td></td>
</tr>
<tr>
<td>β blockers in myocardial infarction</td>
<td>26</td>
<td>0.44 (-0.11 to 1.00)</td>
</tr>
<tr>
<td>Streptokinase in myocardial infarction</td>
<td>20</td>
<td>0.56 (-1.30 to 2.48)</td>
</tr>
<tr>
<td>Angiotension converting enzyme inhibitors in heart failure</td>
<td>13</td>
<td>-0.14 (-0.44 to 0.16)</td>
</tr>
<tr>
<td>Intensive therapy in insulin-dependent diabetes mellitus</td>
<td>6</td>
<td>-0.75 (-2.53 to 1.03)</td>
</tr>
<tr>
<td>Results discordant with single large trial</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Magnesium in myocardial infarction</td>
<td>10</td>
<td>-1.15 (-2.26 to 0.01)</td>
</tr>
<tr>
<td>Nitrates in myocardial infarction</td>
<td>10</td>
<td>1.84 (-3.28 to -0.43)</td>
</tr>
<tr>
<td>Inpatient geriatric consultation service</td>
<td>8</td>
<td>-2.66 (-4.84 to -0.37)</td>
</tr>
<tr>
<td>Aspirin for prevention of pre-eclampsia</td>
<td>6</td>
<td>0.27 (-1.84 to 2.59)</td>
</tr>
</tbody>
</table>

Fig 1: Results from four concordant and four discordant pairs of meta-analysis and large scale randomised controlled trial

Fig 2: Funnel plots and single large trials. Points indicate odds ratios from trials included in meta-analysis; squares with horizontal lines show odds ratio from large trial with 95% confidence interval. See table 1 for abbreviations of trial names

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intravenous magnesium in myocardial infarction was updated with five additional trials showing benefit in the presence of publication bias. The results were consistent with previous meta-analyses. However, the findings were limited by the relatively small number of trials included.

**Fig 3** Funnel plot of trials of low dose aspirin in the prevention of pre-eclampsia. Trials included in the Dalling and Stollenswerk's 1991 meta-analysis (closed circles), 13 trials published in subsequent years (1992 to 1995, open circles) and the large 1994 CLASP (collaborative low-dose aspirin study in pregnancy) trial (square with horizontal line indicating 95% confidence interval). 22

**Fig 4** Distribution of intercepts from regression analysis of funnel plot asymmetry for 38 meta-analyses from the Cochrane Database of Systematic Reviews, 1996 (upper panel) and 37 meta-analyses published in Annals of Internal Medicine, BMJ, JAMA, and Lancet 1993 through 1996 (lower panel).

Although registration of trials and creation of a database holding the results of both published and unpublished trials would solve the problem, it is unlikely that this will be widely instituted in the foreseeable future. Critical examination for the presence of publication and related biases must therefore become an essential part of meta-analytic studies and systematic reviews. The findings presented here indicate that a simple graphical and statistical method is useful for this purpose. When testing this method on pairs consisting of meta-analyses and single large trials of the same intervention, we found asymmetry in funnel plots in three out of four pairs with discordant results. The fourth was based on only six trials, and asymmetry emerged when it was updated with further studies.

**Sources of funnel plot asymmetry**

Publication bias has long been associated with funnel plot asymmetry. Among published studies, however, the probability of identifying relevant trials for meta-analysis is also influenced by their results. English-language studies—the preferential publication of "negative" findings in journals published in languages other than English—makes the location and inclusion of such studies less likely. As a consequence of citation bias, "negative" studies are quoted less frequently and are therefore more likely to be missed in the search for relevant trials. Results of "positive" studies are sometimes reported more than once, increasing the probability that they will be located for meta-analysis (multiple publication bias). These biases are likely to affect smaller studies to a greater degree than large trials.
Another source of asymmetry arises from differences in methodological quality. Smaller studies are, on average, conducted and analysed with less methodological rigour than larger studies. Trials of lower quality also tend to show the larger effects. The degree of symmetry found in a funnel plot may depend on the statistic used to measure effect. Odds ratios overestimate the relative reduction, or increase, in risk if the event rate is high. This can lead to funnel plot asymmetry if the smaller trials were consistently conducted in patients at higher risk. Similarly, if events accrue at a constant rate, relative risks will move towards unity with increasing length of follow up. In large trials, follow up is often longer than in small studies. Finally, an asymmetrical funnel plot may arise by chance.

The trials displayed in a funnel plot may not estimate the same underlying effect of the intervention, and such heterogeneity between results may lead to asymmetry in funnel plots. For example, if a combined outcome is considered then substantial benefit may be seen only in patients at high risk for the component of the combined outcome that is affected by the intervention. A cholesterol lowering drug that reduces mortality from coronary heart disease will have a greater effect on all cause mortality in high risk patients with established cardiovascular disease than in asymptomatic patients with isolated hypercholesterolaemia. This is because a consistent relative reduction in mortality from coronary heart disease will translate into a greater relative reduction in all cause mortality in high risk patients, in whom a greater proportion of all deaths will be from coronary heart disease. This will produce asymmetry in funnel plots if the smaller trials were performed in high risk patients.

Small trials are generally conducted before larger trials are established. In the intervening years, control treatments may have improved or changed in a way that could reduce the efficacy of the experimental treatment. Such a mechanism has been proposed as an explanation for the discrepant results obtained in clinical trials of the effect of magnesium infusion in myocardial infarction, although this interpretation is not supported by the data from clinical trials. Finally, some interventions may have been implemented less thoroughly in larger trials, thus explaining the more positive results in smaller trials. This could have occurred in one of the interventions considered in our comparison of meta-analysis and single large trials, inpatient geriatric consultation.

Very different mechanisms can thus lead to asymmetry in funnel plots, as summarised in the box. It is important to note, however, that this will always be associated with a biased overall estimate of effect when studies are combined in a meta-analysis. The more pronounced the asymmetry, the more likely it is that the amount of bias will be substantial. The exception to this rule arises when asymmetry is produced by chance alone.

How frequent is bias in meta-analysis?

Several studies have recently tried to evaluate the validity of meta-analysis. Villar et al analysed 38 meta-analyses from the pregnancy and childbirth module of the 1993 Cochrane database by comparing the results from the largest trial with the remaining smaller studies. On the basis of the direction of estimates of treatment effects, they concluded that 80% of meta-analyses were in total or partial agreement with the results from the larger "gold standard" trial. In a similar study, Cappelleri et al analysed 79 meta-analyses and concluded that there was agreement between smaller trials and large trials in over 80%. In both these analyses, however, the precision of the large trials was low in a sizeable proportion of comparisons. The larger trials in fact often provided an estimate of lower precision than the meta-analysis of the smaller studies. In this situation, concordance between the two could simply be due to the fact that estimates with large, overlapping confidence intervals are unlikely to be classified as discordant.

We thought that stringent criteria were necessary for identifying single large trials that could sensibly be used to assess the results from meta-analyses of smaller trials. As a result, the large trials used in our analysis on average provided an estimate of considerably greater precision that the corresponding meta-analyses. Despite an extensive literature search, we identified only eight such pairs. The matched pair approach may therefore not be suitable for assessing the frequency of misleading meta-analysis. However, our results indicate that an asymmetrical funnel plot makes bias likely. The prevalence of funnel plot asymmetry may thus provide a useful proxy measure to examine the prevalence of biased analyses in the literature. Our findings indicate that bias may be present in a small proportion of meta-analyses published in the Cochrane Database of Systematic Reviews. Bias may be considerably more prevalent, however, among meta-analyses published in leading general medicine journals. Whether such bias is likely to affect the conclusions of a systematic review or meta-analysis must be carefully assessed for each case.

Begg and Mazumdar proposed a rank correlation test to measure asymmetry in funnel plots. The method is based on the degree of association between the size of effect estimates and their variances. If publication bias is present, the smaller studies will show the larger effects. A positive correlation between effect size and variance emerges in this situation because the variance of the estimates from smaller studies will also be large. When we applied their test to the eight meta-analyses, it indicated significant (P<0.1) asymmetry for only one meta-analysis (inpatient geriatric consultation). This
indicates that the linear regression approach may be more powerful than the rank correlation test.

Conclusions
In the absence of large, conclusive trials for most medical interventions, systematic reviews based on randomised controlled trials are clearly the best strategy for appraising the evidence. Selection bias and other biases pose a serious threat to the validity of this approach, however, and care must be taken to avoid meta-analysis becoming discredited. The technique discussed here should contribute to this goal, providing a reproducible measure for the likely presence, or apparent absence, of such biases. It is easily calibrated and provides summary statistics that can be reported when space limitations do not permit the display of funnel plots. Though more methodological research is required, the critical examination for the presence of publication and related biases should be considered a routine procedure. The capacity to unearth such bias will, however, be limited when meta-analyses are based specifically on small trials. There is no statistical solution to this situation, and the results from such analyses should therefore be treated with caution.

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27. ISIS 4 Collaborative Group. ISIS-4: a randomized factorial trial assessing early oral captopril, oral mononitrate, and intravenous magnesium sulphate in 58,052 patients with suspected acute myocardial infarction. Lancet 1993;341:57-64.

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