

# **Practical methods for analysing ordinal outcome data in clinical trials**

## **References - methodology**

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## **References – useful websites**

The Cochrane Reviewer's handbook:  
<http://www.cochrane-handbook.org/>

The Cochrane distance learning material  
<http://www.cochrane-net.org/openlearning/>

The Cochrane RevMan user guide.  
<http://ims.cochrane.org/revman/documentation/rm5userguide.pdf> (user guide)  
<http://ims.cochrane.org/revman/documentation/Statistical-methods-in-RevMan-5.pdf> (all the equations)

R meta analysis documentation.  
<http://rss.acs.unt.edu/Rdoc/library/rmeta/html/00Index.html>

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