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9 **Bill Shipley, Cause and Correlation in Biology. A User's Guide to Path Analysis,**  
10 **Structural Equations and Causal Inference with R. Second edition, 2016, Cambridge**  
11 **University Press, ISBN: 978-1-107-44259-7, 314 pp., £39.99 (paperback)**

12  
13 Anyone who has taken a statistics class has heard the old adage “correlation does not  
14 mean causation”. Distinguishing correlation from causation is not obvious. Correlation  
15 belongs to the language of statistics, while causation belongs to the language of logics.  
16 Good use of statistics allows a researcher to investigate whether correlations might reveal  
17 potential causal relationships. Although correlation and causation must not be conflated, in  
18 most cases correlation is an indicator of causation. This book examines how correlation  
19 analyses can be legitimately used to disclose and test causation.

20  
21 There are many possible ways to statistically test causal hypotheses via correlation  
22 approaches. This book is dedicated to the application of structural equation modelling  
23 (which includes path analysis as a special case). Structural equations are a statistical tool  
24 particularly well suited to deal with biological data. Cause-effect relationships in biology are  
25 typically multivariate, which means that a given effect may be the result of multiple factors  
26 that act directly or indirectly; structural equations allow the researcher to help make sense  
27 of complex relationships. The use of structural equation modelling in biology and  
28 environmental sciences is still relatively limited, however. Structural equation modelling is  
29 seldom explained in general textbooks, although it is not conceptually more complicated  
30 than other methods. Shipley's book is recommended reading because it offers one of the  
31 most comprehensive presentations of structural equation modelling for biologists. In fact, it  
32 may be useful to any scientist who operates in circumstances where causation cannot be  
33 investigated by randomised experiments (a situation that is typical of, but not unique to,  
34 biology).

35

36 Use of structural equations has been subject to many critiques (e.g. Tomarken & Waller,  
37 2005, *Annual Review of Clinical Psychology*, 1: 31-65; VanderWeele, 2012, *American*  
38 *Journal of Epidemiology*, 176: 608-612; Lindquist & Sobel, 2013, *NeuroImage*, 76, 446-  
39 449) and I had few occasions to read papers using structural equations in ecology,  
40 although their number is growing. Apart from philosophical considerations (Hall, 2007,  
41 *Philosophical Studies*, 132: 109–136; Hitchcock, 2009, *Philosophical Studies*, 144: 391–  
42 401), structural equations, like all statistical procedures, have their pros and cons, and  
43 cannot be viewed as a panacea, but a good tool kit includes them. Thus, a comprehensive  
44 book such as this is really welcome.

45

46 The book is organised into eight chapters that starts with basic concepts and proceeds to  
47 explicate progressively more complicated and detailed aspects of models of analysis and  
48 testing. The first chapter presents a very interesting discussion about the meaning of  
49 correlation and causation and the distinction between controlled and randomised  
50 experiments. The second chapter explains how causal relationships can be translated into  
51 statistical models, and therefore expressed in the language of probability. This chapter  
52 illustrates the logic of causal inference, how to construct graphs describing the causal  
53 relationships between variables, how to deduce probabilistic independence relationships  
54 using the d-separation technique, the underlying probability assumptions and a series on  
55 counter-intuitive consequences and limitations of d-separation. Chapter 3 presents the  
56 basis of path analysis and the use of d-sep tests--a set of methods which are alternative to  
57 structural equations and which were developed by the author of this book to deal with for  
58 small sample sizes, non-normally distributed data or non-linear functional relationships.

59

60 Chapter 4 illustrates how to test path models using maximum likelihood, how to  
61 disentangle the effects in path diagrams, and how to use multiple regressions in path  
62 analysis. Chapters 5 and 6 provide details about measurement error and latent variables;  
63 in these three chapters, the use of the R package “lavaan” (latent variable analysis) to  
64 construct and test path models is also described. Chapter 7 deals with multigroup and  
65 multilevel models and correction for the non-independence of observations, with a section  
66 specifically dedicated to phylogenetic non-independence. The last chapter presents  
67 intriguing clues about how to generate causal hypotheses in the light of structural equation  
68 modelling with some empirical examples that can be used as analogies for analysing  
69 readers’ cases.

70

71 The book also includes the prefaces to both editions, an appendix that summarises the  
72 usage of two R libraries (“ggm” and “lavaan”), a reference section and an index.

73 Although the book uses a minimum of statistical jargon, it is quite demanding reading.

74 Conceptually very dense, the book is written in a didactic style that does not allow the  
75 reader to skip sections. Although the book includes detailed instructions throughout for  
76 running analyses in R, there are no comprehensive examples presented in a schematic  
77 way. These would have greatly aided the reader in getting some practice.

78

79 The book has a hybrid nature. It is a guide to structural equation modelling (and probably  
80 one of the best guides a biologist can find) and it contains technical sections that may be  
81 annoying a reader more interested to practical applications. Thus, it is an excellent text for  
82 those seeking to understand how they can better use statistics to identify causation, but it  
83 is not a cookbook.

84

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