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1 #~~~~~#
2 # INSTRUCTIONS #
3 #~~~~~#
4 # The following code can be used for calculating RMSEA_u and CFI_u
5 # using approaches (1.1), (1.2), and (2). It can be used for uni- and
6 # multidimensional CFA models. For a more flexible use, the Ffun-
7 # function (lines 24 to 31) needs to be adapted.
8 # An example data is provided with this article, which contains four
9 # metric variables. Its location needs to be specified in line 37.
10 # The corresponding parameter estimates (standardized ML loadings)
11 # are entered in line 54. Estimate vectors of multidimensional CFA
12 # models first contain all loadings and then the factor correlations.
13
14 library(matrixcalc)
15 library(numDeriv)
16
17 #~~~~~#
18 # basic functions #
19 #~~~~~#
20 #matrix trace
21 tr <- function(x) sum(diag(x))
22
23 #model implied correlations based on loadings and factor correlations
24 Ffun <- function(x) {
25   LAM <- diag(q) %*% rep(1,p/q)
26   LAM[LAM==1] <- x[(q2+1):(q2+p)]
27   PHI <- diag(q)/2
28   PHI[lower.tri(PHI)] <- x[1:q2]
29   PHI <- PHI + t(PHI)
30   (LAM %*% PHI %*% t(LAM))[lower.tri(diag(p))]
31 }
32
33 #~~~~~#
34 # data #
35 #~~~~~#
36 #!!! specify data location !!!
37 X <- read.table('..\example_data.txt')
38
39 #settings
40 n <- nrow(X)
41 p <- ncol(X)
42 p2 <- (p*(p-1))/2
43 q <- 1
44 q2 <- (q*(q-1))/2
45 df <- p2 - p - q2
46
47 #sample correlations
48 S0 <- cor(X)
49
50 #~~~~~#
51 # ML CFA-results #
52 #~~~~~#
53 #std. loading estimates
54 est <- c(0.3177388, -0.3547450, 0.2909282, -0.4468409)
55
56 #model implied correlations
57 s1 <- Ffun(est)
58 S. <- diag(p)/2
59 S.[lower.tri(S.)] <- s1
60 S1 <- S. + t(S.)
61
62 #ML test statistic
63 T_ML <- n * (log(det(S1)) + tr(S0 %*% solve(S1)) - log(det(S0)) - p)
64
65 #ML test statistic (base model)
66 T_B_ML <- n * (tr(S0 %*% diag(p)) - log(det(S0)) - p)
67
68 #~~~~~#
69 # ULS discrepancy #
70 #~~~~~#
71 #correlation residuals
72 e <- (S0-S1)[lower.tri(S0)]
73

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74 #model discrepancy
75 F_uls <- sum(e^2)
76
77 #base model discrepancy
78 F_B_u <- sum(S0[lower.tri(S0)]^2)
79
80 ######
81 # calculate matrices #
82 ######
83 #I
84 I <- diag((p*(p-1))/2)
85
86 #Gamma
87 X2 <- X^2
88 C <- combn(p, 2)
89 for(i in 1:ncol(C)) X2 <- cbind(X2, X[,C[1,i]]*X[,C[2,i]])
90 GAM <- var(X2)
91
92 #W
93 Dp <- duplication.matrix(p)
94 D. <- svd.inverse(Dp)
95 cr <- which(rowSums(D.^2) != 1)
96 W. <- 2 * D. %*% (S0 %x% S0) %*% t(D.)
97 W <- solve(W.) [cr,cr]
98
99 #Delta
100 DEL <- jacobian(Ffun, est)
101
102 ######
103 # approach (1.1) #
104 ######
105 U_1.1 <- I - DEL %*% solve(t(DEL) %*% DEL) %*% t(DEL)
106 V_1.1 <- (U_1.1 %*% GAM[cr,cr])/n
107 tr_1.1 <- tr(V_1.1)
108 s2_1.1 <- 2 * tr(V_1.1^2) + 4 * t(e) %*% V_1.1 %*% e
109
110 #corrected RMSEA_u estimate
111 k_1.1 <- 1 - (s2_1.1) / (4*F_uls^2)
112 R_u_1.1 <- 1/k_1.1 * sqrt(max(c(F_uls - tr_1.1, 0))/df)
113
114 #RMSEA_u standard error
115 SE_1.1 <- sqrt(s2_1.1/(k_1.1^2*4*F_uls))[1]
116
117 #CFI_u
118 C_u_1.1 <- 1 - (F_uls-tr_1.1) / (F_B_u-tr_1.1)
119
120 #output
121 round(
122 c(RMSEA_u_1.1 = R_u_1.1,
123   low.CI = max(0, R_u_1.1-qnorm(.95)*SE_1.1),
124   upp.CI = R_u_1.1+qnorm(.95)*SE_1.1,
125   CFI_u_1.1 = C_u_1.1), 3)
126
127 ######
128 # approach (1.2) #
129 ######
130 U_1.2 <- I - DEL %*% solve(t(DEL) %*% W %*% DEL) %*% t(DEL) %*% W
131 V_1.2 <- 1/n * (U_1.2) %*% GAM[cr,cr] %*% t(U_1.2)
132 tr_1.2 <- tr(V_1.2)
133 s2_1.2 <- 2 * tr(V_1.2^2) + 4 * t(e) %*% V_1.2 %*% e
134
135 #corrected RMSEA_u estimate
136 k_1.2 <- 1 - (s2_1.2) / (4*F_uls^2)
137 R_u_1.2 <- 1/k_1.2 * sqrt(max(c(F_uls - tr_1.2, 0))/df)
138
139 #RMSEA_u standard error
140 SE_1.2 <- sqrt(s2_1.2/(k_1.2^2*4*df*F_uls))[1]
141
142 #CFI_u
143 C_u_1.2 <- 1 - (F_uls-tr_1.2) / (F_B_u-tr_1.2)
144
145 #output
146 round(

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147 c(RMSEA_u_1.2 = R_u_1.2,
148   low.CI    = max(0, R_u_1.2-qnorm(.95)*SE_1.2),
149   upp.CI    = R_u_1.2+qnorm(.95)*SE_1.2,
150   CFI_u_1.2 = C_u_1.2), 3)
151
152 #~~~~~#
153 # approach (2) #
154 #~~~~~#
155 s2_2 <- s2_1.2
156 #model ADR
157 ADR <- (T_ML - df) / T_ML
158 #base model ADR (for CFI_u)
159 ADR_B <- (T_B_ML - p2) / T_B_ML
160
161 #corrected RMSEA_u estimate
162 k_2 <- 1 - (s2_2)/(8*F_uls^2)
163 R_u_2 <- 1/k_2 * sqrt(max(c(ADR * F_uls, 0))/df)
164
165 #RMSEA_u standard error
166 SE_2 <- sqrt((s2_2*ADR)/(k_2^2*4*df*F_uls))[1]
167
168 #CFI_u
169 C_u_2 <- 1 - (ADR * F_uls) / (ADR_B * F_B_u)
170
171 #output
172 round(
173 c(RMSEA_u_2 = R_u_2,
174   low.CI    = max(0, R_u_2-qnorm(.95)*SE_2),
175   upp.CI    = R_u_2+qnorm(.95)*SE_2,
176   CFI_u_2 = C_u_2), 3)
177

```