## CFA\_SimDesign

```
library(SimDesign)
library(lavaan)
library(tidyr)
```

## **Step 1** — **Defining conditions (sample size and model)**

## Step 2 — Define generate, analyse, and summarise functions

```
# Generate function: Simulate data based on the true model
Generate <- function(condition, fixed_objects) {
   N <- condition$sample_size

# True model: Two factors, 8 indicators each
   true_model <- '
        f1 =~ 0.7*y1 +
        0.7*y2 +
        0.7*y3 +
        0.7*y4 +
        0.7*y5 +
        0.7*y6 +
        0.7*y7 +
        0.7*y8</pre>
f2 =~ 0.7*y9 +
```

```
0.7*y10 +
    0.7*y11 +
    0.7*y12 +
    0.7*y13 +
    0.7*y14 +
    0.7*y15 +
    0.7*y16
# Misspecification: Add cross-loadings
misspecified_model <- '</pre>
    f1 = ~0.7*y1 +
    0.7*y2 +
    0.7*y3 +
    0.7*y4 +
    0.7*y5 +
    0.7*y6 +
    0.7*y7 +
    0.7*y8 +
    0.3*y9 # added cross-loading
    f2 = ~0.7*y9 +
    0.7*y10 +
    0.7*y11 +
    0.7*y12 +
    0.7*y13 +
    0.7*y14 +
    0.7*y15 +
    0.7*y16 +
    0.3*y1 # added cross-loading
# Generate data based on the condition
if(condition$model_type == "true") {
    data <- simulateData(true_model, sample.nobs = N)</pre>
} else {
    data <- simulateData(misspecified_model, sample.nobs = N)</pre>
}
return(data)
```

```
}
  # Analyse function: Fit the true model and extract fit measures
  Analyse <- function(condition, dat, fixed_objects) {</pre>
      true model <- '
           f1 = v1 + v2 + v3 + v4 + v5 + v6 + v7 + v8
          f2 = y9 + y10 + y11 + y12 + y13 + y14 + y15 + y16
      fit <- cfa(true_model, data = dat)</pre>
      # Extract fit measures
      fit measures <- fitMeasures(fit, c("cfi", "tli", "rmsea", "srmr", "chisq"))</pre>
      return(fit_measures)
  }
  # Summarise function: Calculate the average fit measures from n replications
  Summarise <- function(condition, results, fixed_objects) {</pre>
      summary_measures <- colMeans(results)</pre>
      return(summary measures)
  }
  # Make sure it doesn't try resuming a simulation
  SimClean()
  # Step 3 --- Collect results by looping over the rows in design
  library(SimDesign)
  library(lavaan)
  res <- runSimulation(design=Design, replications=100,</pre>
                        generate=Generate, analyse=Analyse, summarise=Summarise)
Design: 1/12; RAM Used: 62.3 Mb;
                                      Replications: 100; Total Time: 0.00s
 Conditions: sample_size=50, model_type=true
```

Conditions: sample\_size=100, model\_type=true

Design: 3/12; RAM Used: 78.8 Mb; Replications: 100; Total Time: 8.09s

Conditions: sample\_size=500, model\_type=true

Design: 4/12; RAM Used: 78.8 Mb; Replications: 100; Total Time: 12.08s

Conditions: sample\_size=1000, model\_type=true

Design: 5/12; RAM Used: 78.8 Mb; Replications: 100; Total Time: 16.38s

Conditions: sample\_size=10000, model\_type=true

Design: 6/12; RAM Used: 78.8 Mb; Replications: 100; Total Time: 22.12s

Conditions: sample\_size=1e+05, model\_type=true

Design: 7/12; RAM Used: 78.8 Mb; Replications: 100; Total Time: 45.44s

Conditions: sample\_size=50, model\_type=misspecified

Design: 8/12; RAM Used: 78.8 Mb; Replications: 100; Total Time: 52.94s

Conditions: sample\_size=100, model\_type=misspecified

Design: 9/12; RAM Used: 78.8 Mb; Replications: 100; Total Time: 01m 0.23s

Conditions: sample\_size=500, model\_type=misspecified

Design: 10/12; RAM Used: 78.9 Mb; Replications: 100; Total Time: 01m 7.60s

Conditions: sample\_size=1000, model\_type=misspecified

Design: 11/12; RAM Used: 78.9 Mb; Replications: 100; Total Time: 01m 15.24s

Conditions: sample\_size=10000, model\_type=misspecified

Design: 12/12; RAM Used: 78.9 Mb; Replications: 100; Total Time: 01m 20.64s

Conditions: sample\_size=1e+05, model\_type=misspecified

```
res <- res %>% dplyr::select(-COMPLETED, -SEED)
  print(res)
# A tibble: 12 x 10
                             cfi tli
  sample_size model_type
                                              rmsea
                                                                 chisq
                                                           srmr
        <dbl> <chr>
                             <dbl>
                                     <dbl>
                                                <dbl>
                                                          <dbl>
                                                                  <dbl>
           50 true
                           0.89669 0.88426 0.055521
                                                                  123.07
1
                                                      0.10270
 2
          100 true
                           0.96744 0.97400 0.025384
                                                      0.072316
                                                                  111.04
 3
          500 true
                           0.99557 0.99826 0.0085409 0.032497
                                                                 105.55
 4
         1000 true
                           0.99833 0.99997 0.0045251
                                                      0.022673
                                                                 103.05
 5
        10000 true
                           0.99976 0.99989 0.0018654 0.0073577 106.12
6
       100000 true
                           0.99998 1.0000 0.00052441 0.0023223 104.07
7
           50 misspecified 0.86934 0.85193 0.063645
                                                      0.10913
                                                                127.54
8
          100 misspecified 0.94071 0.93262 0.040156
                                                      0.083298 122.90
9
          500 misspecified 0.96078 0.95430 0.034933 0.054521
                                                                 168.11
10
         1000 misspecified 0.96418 0.95827 0.033450 0.048682
                                                                 219.91
        10000 misspecified 0.96309 0.95700 0.034296
11
                                                      0.044508
                                                                 1315.6
        100000 misspecified 0.96344 0.95741 0.034130
                                                      0.043800 12102.
# i 3 more variables: REPLICATIONS <dbl>, SIM_TIME <chr>, RAM_USED <chr>
  true_model <- '</pre>
      f1 = y1 + y2 + y3 + y4 + y5 + y6 + y7 + y8
      f2 = y9 + y10 + y11 + y12 + y13 + y14 + y15 + y16
  simulated_data <- simulateData(true_model, sample.nobs = 1000)</pre>
  fit <- cfa(true_model, data = simulated_data)</pre>
  summary(fit, fit.measures = TRUE)
lavaan 0.6-18 ended normally after 26 iterations
 Estimator
                                                   ML
```

NLMINB

Optimization method

Number of model parameters	33
Number of observations	1000
Model Test User Model:	
Test statistic Degrees of freedom P-value (Chi-square)  Model Test Baseline Model:	100.847 103 0.542
Test statistic Degrees of freedom P-value	6951.272 120 0.000
User Model versus Baseline Model:	
Comparative Fit Index (CFI) Tucker-Lewis Index (TLI)	1.000 1.000
Loglikelihood and Information Criteria:	
Loglikelihood user model (HO) Loglikelihood unrestricted model (H1)	-24950.843 -24900.419
Akaike (AIC) Bayesian (BIC) Sample-size adjusted Bayesian (SABIC)	49967.685 50129.641 50024.831
Root Mean Square Error of Approximation:	
RMSEA  90 Percent confidence interval - lower  90 Percent confidence interval - upper  P-value H_0: RMSEA <= 0.050  P-value H_0: RMSEA >= 0.080	0.000 0.000 0.016 1.000 0.000
Standardized Root Mean Square Residual:	
SRMR	0.020

Parameter Estimates:

Standard errors	Standard
Information	Expected
Information saturated (h1) model	Structured

## Latent Variables:

	Estimate	Std.Err	z-value	P(> z )
f1 =~				
<b>y1</b>	1.000			
у2	0.896	0.042	21.329	0.000
у3	0.975	0.043	22.443	0.000
y4	0.986	0.044	22.449	0.000
у5	0.989	0.044	22.638	0.000
у6	0.941	0.043	21.733	0.000
у7	0.912	0.043	21.339	0.000
у8	0.911	0.043	21.427	0.000
f2 =~				
у9	1.000			
y10	1.015	0.050	20.281	0.000
y11	1.003	0.050	20.141	0.000
y12	1.059	0.051	20.604	0.000
y13	1.045	0.050	20.947	0.000
y14	1.066	0.051	20.812	0.000
y15	1.013	0.049	20.775	0.000
y16	1.062	0.049	21.649	0.000
Covariances:				
	Estimate	Std.Err	z-value	P(> z )
f1 ~~				
f2	-0.014	0.037	-0.379	0.705
Variances:				
	Estimate	Std.Err	z-value	P(> z )
.y1	0.909	0.048	18.944	0.000
.y2	1.010	0.051	19.898	0.000
.y3	0.986	0.051	19.371	0.000
.y4	1.008	0.052	19.368	0.000
.y5	0.982	0.051	19.265	0.000
.y6	1.040	0.053	19.721	0.000
. y7	1.044	0.052	19.893	0.000
.y8	1.027	0.052	19.856	0.000
.y9	0.966	0.049	19.615	0.000
.y10	1.066	0.054	19.800	0.000

.y11	1.070	0.054	19.870	0.000
.y12	1.088	0.055	19.626	0.000
.y13	0.987	0.051	19.425	0.000
.y14	1.057	0.054	19.507	0.000
.y15	0.961	0.049	19.528	0.000
.y16	0.878	0.046	18.947	0.000
f1	1.145	0.086	13.277	0.000
f2	0.956	0.078	12.257	0.000