Simulation Example

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Basics

Start by including the packages, setting seed, directory and sample size.

```
library(seminr)
library(mnormt)
getwd()
```

[1] "/media/steven/samsung_t5/gerson"

```
setwd("/media/steven/samsung_t5/gerson")
set.seed(421)
N = 100
```

Data model

We start similar to Lai 2020 by simulating the latent means and covariances. We will use these with the factor loadings to generate the data. Thus, the data is highly variable depending on different choices of means (α) and covariances (ϕ)

$$\begin{bmatrix} y_{0i} \\ y_{1i} \\ y_{2i} \end{bmatrix} = \Lambda \begin{bmatrix} \eta_{1i} \\ \eta_{2i} \\ \eta_{3i} \end{bmatrix} + \begin{bmatrix} e_{0i} \\ e_{1i} \\ e_{2i} \end{bmatrix}$$

```
opt_lambda = c(.86, .88, .8)
opt_alpha = c(2, 4, 6)
opt_phi = matrix(c(1, .2, .3, .2, .3, 1, .3, .2, 1), nrow = 3)

pt_lambda = c(.78, .8, .64, .8, .75)
pt_alpha = c(4, 3, 5, 3, 4)
pt_phi = matrix(c(1, .2, .3, .4, .5, .2, 1, .4, .5, .3, .3, .4, .5, 1, .2, .4, .5, .3, 1, .2, .5, .4, .3, .2, 1), nrow = 5)

fse_lambda = c(.85, .89, .7)
fse_alpha = c(3, 5, 4)
```

```
fse_phi = matrix(c(1, .2, .3, .2, .3, 1, .3, .2, 1), nrow = 3)

teamperf_lambda = c(.85, .82, .75)
teamperf_alpha = c(3, 5, 4)
teamperf_phi = matrix(c(1, .2, .3, .2, .3, 1, .3, .2, 1), nrow = 3)
```

Simulating data

In the simulated data, they all follow the normal distribution with given means and covariances.

$$\begin{bmatrix} \eta_{1i} \\ \eta_{2i} \\ \eta_{3i} \end{bmatrix} \sim \mathcal{N} \left(\begin{bmatrix} \alpha_1 \\ \alpha_2 \\ \alpha_3 \end{bmatrix}, \begin{bmatrix} \phi_{11} & \phi_{12} & \phi_{13} \\ \phi_{21} & \phi_{22} & \phi_{23} \\ \phi_{31} & \phi_{32} & \phi_{33} \end{bmatrix} \right)$$

The error variances are normally distributed as:

$$\begin{bmatrix} e_{0i} \\ e_{1i} \\ e_{2i} \end{bmatrix} \sim \mathcal{N} \left(\begin{bmatrix} 0 \\ 0 \\ 0 \end{bmatrix}, \begin{bmatrix} \theta_{11} & 0 & 0 \\ 0 & \theta_{22} & 0 \\ 0 & 0 & \theta_{33} \end{bmatrix} \right)$$

We will generate data for all of the variables: optimism, perspective taking, self efficacy and team performance.

```
opt_eta = rmnorm(N, mean = opt_alpha, varcov = opt_phi)

pt_eta = rmnorm(N, mean = pt_alpha, varcov = pt_phi)

fse_eta = rmnorm(N, mean = fse_alpha, varcov = fse_phi)

teamperf_eta = rmnorm(N, mean = teamperf_alpha, varcov = teamperf_phi)
```

To simulate according to composite reliability, we need to know that:

$$CR = \frac{(\sum \lambda_i)^2}{(\sum \lambda_i)^2 + \sum \sigma_i^2}$$

We can then solve this for the sum of the error variances:

$$\sum \sigma_i^2 = \frac{(\sum \lambda_i)^2}{CR} - (\sum \lambda_i)^2$$

We will choose to uniformly distribute the sum of the error variances as the variance in the error term for each generated variable.

```
lambda = c(opt_lambda, pt_lambda, fse_lambda, teamperf_lambda)
CR = c(.4, .6, .8)
sum_err_var = sum(lambda)^2/CR - sum(lambda)^2
err_var = sum_err_var / 14
```

```
theta1 = diag(err_var[1], nrow = 3)
theta1_pt = diag(err_var[1], nrow = 5)
e1_opt = rmnorm(N, varcov = theta1)
e1_pt = rmnorm(N, varcov = theta1_pt)
e1_fse = rmnorm(N, varcov = theta1)
e1_teamperf = rmnorm(N, varcov = theta1)
theta2 = diag(err var[2], nrow = 3)
theta2_pt = diag(err_var[2], nrow = 5)
e2_opt = rmnorm(N, varcov = theta1)
e2_pt = rmnorm(N, varcov = theta1_pt)
e2_fse = rmnorm(N, varcov = theta1)
e2_teamperf = rmnorm(N, varcov = theta1)
theta3 = diag(err_var[3], nrow = 3)
theta3_pt = diag(err_var[3], nrow = 5)
e3_opt = rmnorm(N, varcov = theta1)
e3_pt = rmnorm(N, varcov = theta1_pt)
e3_fse = rmnorm(N, varcov = theta1)
e3_teamperf = rmnorm(N, varcov = theta1)
```

Now we generate the data by way of

$$\Lambda \begin{bmatrix} \eta_{1i} \\ \eta_{2i} \\ \eta_{3i} \end{bmatrix} + \begin{bmatrix} e_{0i} \\ e_{1i} \\ e_{2i} \end{bmatrix}$$

```
opt Lambda = cbind(opt lambda, opt lambda, opt lambda)
pt_Lambda = cbind(pt_lambda, pt_lambda, pt_lambda, pt_lambda)
fse_Lambda = cbind(fse_lambda, fse_lambda, fse_lambda)
teamperf_Lambda = cbind(teamperf_lambda, teamperf_lambda)
final opt = tcrossprod(opt eta, opt Lambda) + e1 opt
final_opt2 = tcrossprod(opt_eta, opt_Lambda) + e2_opt
final_opt3 = tcrossprod(opt_eta, opt_Lambda) + e3_opt
final_opt = ceiling(final_opt)
final_opt2 = ceiling(final_opt2)
final_opt3 = ceiling(final_opt3)
final_pt = tcrossprod(pt_eta, pt_Lambda) + e1_pt
final_pt2 = tcrossprod(pt_eta, pt_Lambda) + e2_pt
final_pt3 = tcrossprod(pt_eta, pt_Lambda) + e3_pt
final_pt = ceiling(final_pt)
final_pt2 = ceiling(final_pt2)
final_pt3 = ceiling(final_pt3)
final_fse = tcrossprod(fse_eta, fse_Lambda) + e1_fse
final_fse2 = tcrossprod(fse_eta, fse_Lambda) + e2_fse
final_fse3 = tcrossprod(fse_eta, fse_Lambda) + e3_fse
final fse = ceiling(final fse)
final_fse2 = ceiling(final_fse2)
final_fse3 = ceiling(final_fse3)
```

```
final_teamperf = tcrossprod(teamperf_eta, teamperf_Lambda) + e1_teamperf
final_teamperf2 = tcrossprod(teamperf_eta, teamperf_Lambda) + e2_teamperf
final_teamperf3 = tcrossprod(teamperf_eta, teamperf_Lambda) + e3_teamperf
final_teamperf = ceiling(final_teamperf)
final_teamperf2 = ceiling(final_teamperf2)
final_teamperf3 = ceiling(final_teamperf3)
```

Then we can combine the simulated data into the final dataset.

```
df1 = cbind(final_opt, final_pt, final_fse, final_teamperf)
df2 = cbind(final_opt2, final_pt2, final_fse2, final_teamperf2)
df3 = cbind(final_opt3, final_pt3, final_fse3, final_teamperf3)
colnames(df1) = c('opt1', 'opt2', 'opt3', 'pt1', 'pt2', 'pt3', 'pt4', 'pt5', 'fse1', 'fse2', 'fse3', 't
colnames(df2) = c('opt1', 'opt2', 'opt3', 'pt1', 'pt2', 'pt3', 'pt4', 'pt5', 'fse1', 'fse2', 'fse3', 't
colnames(df3) = c('opt1', 'opt2', 'opt3', 'pt1', 'pt2', 'pt3', 'pt4', 'pt5', 'fse1', 'fse2', 'fse3', 't
```

Finally, we can run PLS-SEM on the data and fit the measurement and structural models. These are summarized and bootstrapped accordingly for all three composite reliability scores.

```
df1_mm <- constructs(</pre>
  composite("COMP",
                           multi_items("opt", 1:3), weights = mode_A),
                    multi_items("pt", 1:5), weights = mode_A),
  composite("LIKE",
  composite("CUSA", multi_items("fse", 1:3), weights = mode_A),
  composite("CUSL",
                         multi items("teamperf", 1:3), weights = mode A)
)
#create structural model
df1 sm <- relationships(</pre>
  paths(from = "COMP",
                            to = c("CUSA", "CUSL")),
 paths(from = "LIKE", to = c("CUSA", "CUSL")),
 paths(from = "CUSA", to = "CUSL")
#model estimation
df1_pls <- estimate_pls(data = df1,
                        measurement_model = df1_mm,
                         structural_model = df1_sm,
                         inner_weights = path_weighting)
```

Generating the seminr model
All 100 observations are valid.

```
summary(df1_pls)
```

```
##
## Total Iterations: 45
## Path Coefficients:
## CUSA CUSL
## R^2 0.098 0.120
## AdjR^2 0.079 0.092
## COMP -0.169 -0.315
```

```
## LIKE
         -0.245 -0.142
               . -0.122
## CUSA
##
## Reliability:
        rhoC
               AVE rhoA
## COMP 0.722 0.478
## LIKE 0.798 0.449
## CUSA 0.680 0.425
                       1
## CUSL 0.433 0.338
#bootstrap
boot df1 pls <- bootstrap model(seminr model = df1 pls,
                                 nboot = 5000,
                                 cores = 2)
## Bootstrapping model using seminr...
## SEMinR Model successfully bootstrapped
summary(boot_df1_pls)
##
##
   Bootstrap resamples: 5000
##
## Bootstrapped Structural Paths:
##
                  Original Est. Bootstrap Mean Bootstrap SD T Stat. 2.5% CI
## COMP
        ->
            CUSA
                         -0.169
                                        -0.166
                                                      0.140 -1.213 -0.376
            CUSL
## COMP
        ->
                         -0.315
                                        -0.310
                                                      0.164
                                                             -1.919 -0.504
## LIKE
            CUSA
                                        -0.209
                                                      0.256
                                                            -0.957 -0.523
        ->
                         -0.245
## LIKE
            CUSL
                         -0.142
                                        -0.150
                                                      0.230
                                                            -0.616 -0.464
## CUSA
            CUSL
                         -0.122
                                        -0.108
                                                      0.136 -0.901 -0.352
        ->
                  97.5% CI
## COMP
        ->
            CUSA
                     0.205
## COMP
            CUSL
                     0.278
## LIKE -> CUSA
                     0.412
        ->
## LIKE
            CUSL
                     0.390
## CUSA -> CUSL
                     0.185
## Bootstrapped Weights:
##
                       Original Est. Bootstrap Mean Bootstrap SD T Stat. 2.5% CI
## opt1
        ->
            COMP
                               0.396
                                              0.389
                                                           0.271
                                                                   1.460 -0.283
## opt2
        -> COMP
                               0.260
                                              0.205
                                                           0.305
                                                                   0.854 -0.610
        -> COMP
                                                                   2.331
                                                                          -0.530
## opt3
                               0.700
                                              0.573
                                                           0.300
                                              0.318
       -> LIKE
                               0.457
                                                           0.276
                                                                   1.658
                                                                         -0.442
## pt1
## pt2
       -> LIKE
                               0.348
                                              0.271
                                                           0.196
                                                                   1.772
                                                                          -0.243
       -> LIKE
                                                                   0.446
                                                                          -0.275
## pt3
                               0.077
                                              0.129
                                                           0.172
## pt4
       -> LIKE
                               0.095
                                              0.150
                                                           0.394
                                                                   0.240
                                                                          -0.723
       -> LIKE
                               0.396
                                                           0.257
                                                                   1.543
                                                                         -0.370
## pt5
                                              0.281
        -> CUSA
                               0.385
                                              0.376
                                                           0.263
                                                                   1.460
                                                                          -0.312
## fse1
        -> CUSA
## fse2
                               0.366
                                              0.318
                                                           0.243
                                                                   1.508
                                                                         -0.265
## fse3 -> CUSA
                               0.716
                                              0.626
                                                           0.276
                                                                   2.600
                                                                          -0.239
## teamperf1 ->
                 CUSL
                               0.153
                                              0.223
                                                           0.315
                                                                   0.484
                                                                         -0.474
## teamperf2 ->
                 CUSL
                               0.026
                                              0.134
                                                           0.360
                                                                   0.073 -0.561
## teamperf3 -> CUSL
                               0.982
                                              0.722
                                                           0.362
                                                                   2.708 - 0.478
```

```
97.5% CI
##
                           0.865
## opt1 ->
             COMP
                           0.690
## opt2
        ->
             COMP
             COMP
## opt3
                           0.906
        ->
## pt1
        -> LIKE
                           0.728
## pt2
        ->
            LIKE
                           0.582
## pt3
        -> LIKE
                           0.428
## pt4
        -> LIKE
                           0.887
## pt5
       -> LIKE
                           0.675
## fse1
        ->
            CUSA
                           0.804
## fse2
        ->
             CUSA
                           0.745
             CUSA
                           0.963
## fse3
        ->
## teamperf1
             ->
                  CUSL
                           0.751
## teamperf2
                  CUSL
              ->
                           0.794
## teamperf3
                  CUSL
                           1.000
             ->
##
## Bootstrapped Loadings:
##
                        Original Est. Bootstrap Mean Bootstrap SD T Stat. 2.5% CI
             COMP
                                0.650
                                                0.605
                                                             0.259
                                                                      2.512 -0.137
## opt1
        ->
                                0.488
## opt2
        ->
             COMP
                                                0.400
                                                             0.346
                                                                      1.412
                                                                             -0.627
## opt3
        ->
            COMP
                                0.879
                                                0.745
                                                             0.320
                                                                      2.750
                                                                             -0.511
        -> LIKE
                                0.785
                                                0.625
                                                             0.294
                                                                      2.676
                                                                             -0.312
## pt1
                                                             0.265
                                                                      2.686
                                                                             -0.199
## pt2
        ->
            LIKE
                                0.712
                                                0.598
        -> LIKE
                                0.478
                                                0.448
                                                             0.236
                                                                      2.023
                                                                             -0.220
## pt3
## pt4
        -> LIKE
                                0.550
                                                0.499
                                                             0.365
                                                                      1.508
                                                                             -0.476
## pt5
        -> LIKE
                                0.769
                                                0.610
                                                             0.267
                                                                      2.875
                                                                             -0.207
        -> CUSA
                                0.554
                                                0.523
                                                             0.272
                                                                      2.032
                                                                             -0.217
## fse1
             CUSA
                                                             0.251
## fse2
        ->
                                0.539
                                                0.477
                                                                      2.148
                                                                             -0.202
## fse3
             CUSA
                                0.823
                                                0.727
                                                             0.270
                                                                      3.052
                                                                             -0.174
        ->
## teamperf1
              ->
                  CUSL
                                0.192
                                                0.273
                                                             0.361
                                                                      0.532
                                                                             -0.542
## teamperf2
              ->
                  CUSL
                                0.052
                                                0.168
                                                             0.396
                                                                      0.131
                                                                             -0.616
## teamperf3
              ->
                  CUSL
                                0.988
                                                0.742
                                                             0.366
                                                                      2.701
                                                                            -0.482
                        97.5% CI
##
             COMP
                           0.924
## opt1
        ->
## opt2
             COMP
                           0.827
         ->
        -> COMP
                           0.965
## opt3
## pt1
        -> LIKE
                           0.887
## pt2
        -> LIKE
                           0.859
        -> LIKE
                           0.741
## pt3
## pt4
        -> LIKE
                           0.917
        -> LIKE
                           0.878
## pt5
## fse1
        -> CUSA
                           0.888
## fse2
        -> CUSA
                           0.840
## fse3
        ->
             CUSA
                           0.975
## teamperf1
              ->
                  CUSL
                           0.826
## teamperf2
                  CUSL
                           0.851
              ->
                           0.996
## teamperf3 ->
                  CUSL
##
## Bootstrapped HTMT:
                  Original Est. Bootstrap Mean Bootstrap SD 2.5% CI 97.5% CI
##
## COMP
                           0.297
                                           0.395
                                                        0.100
                                                                0.234
                                                                          0.631
             LIKE
         ->
             CUSA
                                           0.598
                                                                 0.315
## COMP
         ->
                           0.373
                                                        0.184
                                                                          1.027
## COMP
        ->
             CUSL
                           1.199
                                           1.097
                                                        0.399
                                                                 0.541
                                                                          2.042
## LIKE ->
             CUSA
                           0.454
                                           0.571
                                                        0.147
                                                                 0.351
                                                                          0.914
```

```
## LIKE -> CUSL 0.598 0.709 0.244 0.383 1.321 ## CUSA -> CUSL 0.599 0.871 0.356 0.392 1.738
```

The second model.

```
df2 mm <- constructs(</pre>
  composite("COMP",
                          multi_items("opt", 1:3), weights = mode_A),
  composite("LIKE", multi_items("pt", 1:5), weights = mode_A),
                    multi_items("fse", 1:3), weights = mode_A),
 composite("CUSA",
  composite("CUSL",
                         multi_items("teamperf", 1:3), weights = mode_A)
#create structural model
df2_sm <- relationships(</pre>
 paths(from = "COMP",
                           to = c("CUSA", "CUSL")),
 paths(from = "LIKE", to = c("CUSA", "CUSL")),
 paths(from = "CUSA", to = "CUSL")
#model estimation
df2_pls <- estimate_pls(data = df2,</pre>
                       measurement_model = df2_mm,
                       structural_model = df2_sm,
                       inner_weights = path_weighting)
```

Generating the seminr model
All 100 observations are valid.

```
summary(df2_pls)
```

```
## Total Iterations: 33
## Path Coefficients:
         CUSA CUSL
## R^2
      0.070 0.099
## AdjR^2 0.051 0.070
## COMP 0.261 0.113
## LIKE 0.045 0.272
## CUSA
          . -0.158
## Reliability:
       rhoC AVE rhoA
## COMP 0.4689 0.337
## LIKE 0.7714 0.414
## CUSA 0.7209 0.465
                      1
## CUSL 0.0115 0.303
```

```
## Bootstrapping model using seminr...
## SEMinR Model successfully bootstrapped
summary(boot_df2_pls)
##
   Bootstrap resamples: 5000
##
## Bootstrapped Structural Paths:
##
                  Original Est. Bootstrap Mean Bootstrap SD T Stat. 2.5% CI
             CUSA
## COMP
         ->
                          0.261
                                          0.216
                                                        0.229
                                                                1.140 -0.381
## COMP
             CUSL
                                         -0.029
                                                        0.196
                                                                0.577 -0.372
        ->
                           0.113
## LIKE
        ->
             CUSA
                           0.045
                                          0.063
                                                        0.187
                                                                0.241
                                                                       -0.316
## LIKE
             CUSL
                                                        0.309
        ->
                           0.272
                                          0.017
                                                                0.879 -0.434
## CUSA
             CUSL
                          -0.158
                                         -0.014
                                                        0.214 -0.739 -0.379
        ->
##
                  97.5% CI
## COMP
         ->
             CUSA
                     0.464
## COMP
             CUSL
                     0.340
        ->
             CUSA
                     0.377
## LIKE
        ->
## LIKE
        ->
             CUSL
                     0.448
## CUSA
             CUSL
                     0.377
        ->
##
## Bootstrapped Weights:
                       Original Est. Bootstrap Mean Bootstrap SD T Stat. 2.5% CI
##
                                               0.080
                                                             0.447
## opt1
        ->
             COMP
                               -0.221
                                                                    -0.494
                                                                            -0.797
             COMP
                                0.233
                                               0.250
                                                             0.415
                                                                     0.561
                                                                            -0.658
## opt2
        ->
## opt3
        ->
             COMP
                                0.985
                                               0.523
                                                             0.522
                                                                     1.887
                                                                            -0.836
                                                                            -0.476
## pt1
        -> LIKE
                                0.043
                                               0.174
                                                             0.311
                                                                     0.140
            LIKE
                                0.506
                                                             0.329
                                                                     1.539
                                                                            -0.592
## pt2
        ->
                                               0.247
## pt3
        ->
           LIKE
                                0.307
                                               0.209
                                                             0.247
                                                                     1.242
                                                                            -0.437
## pt4
        -> LIKE
                                0.410
                                               0.249
                                                             0.322
                                                                     1.274
                                                                            -0.602
## pt5
        -> LIKE
                                0.145
                                               0.165
                                                             0.272
                                                                     0.534
                                                                            -0.487
## fse1
        ->
            CUSA
                                0.311
                                               0.335
                                                             0.307
                                                                     1.013
                                                                            -0.463
## fse2
        ->
             CUSA
                                0.496
                                               0.410
                                                             0.322
                                                                     1.541
                                                                            -0.425
                                                             0.420
## fse3 ->
             CUSA
                                0.628
                                               0.398
                                                                     1.495
                                                                            -0.773
## teamperf1
              ->
                  CUSL
                               -0.049
                                               0.302
                                                             0.362
                                                                    -0.135
                                                                            -0.532
                  CUSL
                                                             0.552
                                                                            -0.830
## teamperf2
                               -0.712
                                               0.235
                                                                    -1.290
              ->
                  CUSL
                                0.796
                                                             0.570
                                                                            -0.808
## teamperf3
              ->
                                               0.202
                                                                     1.396
##
                       97.5% CI
        ->
## opt1
             COMP
                           0.916
## opt2
        ->
             COMP
                           0.928
## opt3
        -> COMP
                           1.023
        -> LIKE
## pt1
                           0.815
## pt2
        ->
            LIKE
                           0.721
## pt3
        ->
            LIKE
                           0.585
        -> LIKE
## pt4
                           0.665
```

pt5

fse1

fse2

##

fse3 ->

teamperf1

teamperf2

teamperf3

-> LIKE

CUSA

CUSA

CUSA

->

->

->

CUSL

CUSL

CUSL

->

->

0.635

0.859

0.898

0.960

0.901

0.983

0.988

```
## Bootstrapped Loadings:
##
                       Original Est. Bootstrap Mean Bootstrap SD T Stat. 2.5% CI
                                                                          -0.669
## opt1
             COMP
                               0.058
                                              0.243
                                                           0.428
                                                                    0.135
                               0.313
                                              0.322
                                                           0.424
                                                                    0.739
                                                                           -0.642
## opt2 ->
            COMP
## opt3
        -> COMP
                               0.954
                                              0.578
                                                           0.488
                                                                    1.957
                                                                           -0.729
                                              0.426
                                                                          -0.508
## pt1
       -> LIKE
                               0.445
                                                           0.345
                                                                    1.290
                                                                          -0.778
## pt2
       -> LIKE
                               0.785
                                              0.487
                                                           0.418
                                                                    1.878
## pt3
       -> LIKE
                               0.623
                                              0.463
                                                           0.359
                                                                    1.737
                                                                          -0.618
## pt4
       -> LIKE
                               0.771
                                              0.527
                                                           0.449
                                                                    1.715
                                                                          -0.801
## pt5
       -> LIKE
                               0.522
                                              0.409
                                                           0.386
                                                                    1.351
                                                                          -0.631
## fse1
        -> CUSA
                               0.579
                                              0.544
                                                           0.332
                                                                    1.741
                                                                          -0.420
        -> CUSA
                               0.712
                                                           0.337
                                                                    2.115
                                                                          -0.366
## fse2
                                              0.602
        -> CUSA
## fse3
                               0.745
                                              0.513
                                                           0.422
                                                                    1.765
                                                                          -0.773
                                                                  -0.538
                                                                          -0.589
## teamperf1
             ->
                  CUSL
                              -0.229
                                              0.418
                                                           0.425
             ->
                  CUSL
                                              0.377
                                                           0.549
                                                                  -1.124
                                                                          -0.765
## teamperf2
                              -0.617
## teamperf3
             ->
                  CUSL
                               0.690
                                              0.274
                                                           0.534
                                                                    1.292
                                                                          -0.747
                       97.5% CI
##
## opt1
             COMP
                          0.903
        ->
            COMP
                          0.939
## opt2 ->
        -> COMP
## opt3
                          0.991
## pt1
       -> LIKE
                          0.880
## pt2
       -> LIKE
                          0.889
       -> LIKE
## pt3
                          0.820
       -> LIKE
## pt4
                          0.885
## pt5
       -> LIKE
                          0.836
## fse1
        -> CUSA
                          0.926
## fse2
        ->
            CUSA
                          0.951
## fse3 -> CUSA
                          0.971
                  CUSL
                          0.941
## teamperf1
             ->
## teamperf2
             ->
                  CUSL
                          0.970
## teamperf3 ->
                  CUSL
                          0.970
##
## Bootstrapped HTMT:
                  Original Est. Bootstrap Mean Bootstrap SD 2.5% CI 97.5% CI
##
## COMP
        ->
            LIKE
                          0.417
                                         0.565
                                                      0.171
                                                              0.320
                                                                        0.970
## COMP
        -> CUSA
                          0.478
                                         0.675
                                                      0.235
                                                              0.338
                                                                        1.234
## COMP
        -> CUSL
                          0.249
                                         0.524
                                                      0.194
                                                              0.254
                                                                        0.975
## LIKE
       ->
            CUSA
                          0.247
                                         0.400
                                                      0.123
                                                              0.219
                                                                        0.691
## LIKE
        ->
            CUSL
                          0.349
                                         0.470
                                                      0.121
                                                               0.277
                                                                        0.741
## CUSA -> CUSL
                          0.314
                                         0.486
                                                      0.167
                                                              0.236
                                                                        0.879
```

The third.

```
paths(from = "LIKE", to = c("CUSA", "CUSL")),
 paths(from = "CUSA", to = "CUSL")
#model estimation
df3_pls <- estimate_pls(data = df3,</pre>
                      measurement_model = df3_mm,
                       structural_model = df3_sm,
                       inner_weights = path_weighting)
## Generating the seminr model
## All 100 observations are valid.
summary(df3_pls)
##
## Total Iterations: 74
## Path Coefficients:
           CUSA
## R^2
          0.162 0.114
## AdjR^2 0.145 0.086
        0.067 0.304
## COMP
## LIKE -0.398 0.044
## CUSA
          . -0.138
## Reliability:
          rhoC
                AVE rhoA
## COMP 2.05e-01 0.273
## LIKE 5.54e-05 0.177
## CUSA 5.37e-02 0.326
                        1
## CUSL 5.43e-01 0.364
#bootstrap
boot_df3_pls <- bootstrap_model(seminr_model = df3_pls,</pre>
                              nboot = 5000,
                              cores = 2)
## Bootstrapping model using seminr...
## SEMinR Model successfully bootstrapped
summary(boot_df3_pls)
##
##
  Bootstrap resamples: 5000
##
## Bootstrapped Structural Paths:
##
                 Original Est. Bootstrap Mean Bootstrap SD T Stat. 2.5% CI
## COMP -> CUSA
                       0.067
                                -0.041 0.199 0.334 -0.381
## COMP -> CUSL
                       0.304
                                      0.056
                                                  0.290 1.048 -0.453
## LIKE -> CUSA
                       -0.398
                                     -0.067
                                                  0.339 -1.174 -0.520
                                                  0.216 0.204 -0.387
## LIKE -> CUSL
                       0.044
                                      0.003
```

```
## CUSA -> CUSL
                                        -0.128
                         -0.138
                                                      0.243 -0.570 -0.478
##
                  97.5% CI
## COMP
        ->
             CUSA
                     0.332
            CUSL
                     0.454
## COMP
        ->
## LIKE -> CUSA
                     0.499
## LIKE -> CUSL
                     0.399
## CUSA -> CUSL
                     0.389
##
## Bootstrapped Weights:
##
                       Original Est. Bootstrap Mean Bootstrap SD T Stat. 2.5% CI
## opt1
        ->
             COMP
                              -0.708
                                              0.143
                                                           0.566
                                                                 -1.251
                               0.805
                                              0.239
                                                           0.577
            COMP
                                                                   1.394
                                                                          -0.915
## opt2
        ->
       -> COMP
                               0.396
## opt3
                                              0.244
                                                           0.500
                                                                   0.792
                                                                          -0.843
## pt1
                               0.306
                                                           0.298
                                                                          -0.501
       -> LIKE
                                              0.175
                                                                   1.028
                                                                   1.065
## pt2
       -> LIKE
                               0.321
                                              0.178
                                                           0.301
                                                                          -0.509
## pt3
       -> LIKE
                              -0.693
                                              0.072
                                                           0.471
                                                                  -1.473
                                                                          -0.756
       -> LIKE
                                                           0.356
                                                                  -1.499
                                                                          -0.636
## pt4
                              -0.533
                                              0.120
## pt5
       -> LIKE
                              0.508
                                              0.207
                                                           0.378
                                                                   1.345
                                                                          -0.647
## fse1 -> CUSA
                              -0.154
                                              0.062
                                                           0.512
                                                                  -0.301
                                                                          -0.846
## fse2
        -> CUSA
                               0.910
                                              0.414
                                                           0.576
                                                                   1.580
                                                                          -0.829
## fse3 -> CUSA
                              -0.414
                                              0.067
                                                           0.450
                                                                 -0.919
                                                                         -0.686
## teamperf1 ->
                               0.947
                                              0.399
                                                           0.570
                                                                   1.662
                                                                          -0.926
                 CUSL
## teamperf2 ->
                  CUSL
                                              0.308
                                                           0.374
                                                                   0.419
                                                                         -0.461
                               0.157
## teamperf3 ->
                  CUSL
                               0.138
                                              0.232
                                                           0.344
                                                                   0.402 - 0.566
##
                       97.5% CI
## opt1 ->
            COMP
                          1.021
## opt2
        ->
            COMP
                          1.026
       -> COMP
## opt3
                          0.973
## pt1
       -> LIKE
                          0.606
## pt2
       -> LIKE
                          0.667
## pt3
       -> LIKE
                          0.814
## pt4
       -> LIKE
                          0.694
       -> LIKE
## pt5
                          0.759
## fse1 -> CUSA
                          0.957
## fse2
        -> CUSA
                          0.996
## fse3 -> CUSA
                          0.865
## teamperf1
             ->
                  CUSL
                          0.993
## teamperf2
             ->
                  CUSL
                          0.928
## teamperf3 ->
                 CUSL
                          0.807
##
## Bootstrapped Loadings:
                       Original Est. Bootstrap Mean Bootstrap SD T Stat. 2.5% CI
##
## opt1 -> COMP
                              -0.389
                                              0.264
                                                           0.496 - 0.784
                                                                         -0.758
## opt2 -> COMP
                               0.670
                                              0.345
                                                           0.534
                                                                         -0.794
                                                                   1.256
        -> COMP
                               0.468
                                              0.329
                                                           0.517
                                                                   0.907
                                                                          -0.833
## opt3
       -> LIKE
                               0.368
                                              0.393
                                                           0.441
                                                                   0.835
                                                                          -0.680
## pt1
## pt2
       -> LIKE
                               0.211
                                              0.394
                                                           0.407
                                                                   0.517
                                                                          -0.615
       -> LIKE
                                                           0.525
                                                                          -0.836
## pt3
                              -0.693
                                              0.192
                                                                  -1.319
## pt4
       -> LIKE
                              -0.263
                                              0.385
                                                           0.430
                                                                  -0.612
                                                                          -0.692
## pt5
       -> LIKE
                               0.392
                                              0.398
                                                           0.441
                                                                   0.889
                                                                          -0.717
        -> CUSA
                              -0.123
                                              0.124
                                                           0.526
                                                                  -0.233
                                                                          -0.810
## fse1
## fse2 -> CUSA
                              0.885
                                              0.440
                                                           0.576
                                                                   1.537
                                                                          -0.827
## fse3 -> CUSA
                              -0.424
                                              0.094
                                                           0.486 -0.872 -0.725
## teamperf1 -> CUSL
                              0.974
                                              0.457
                                                           0.598
                                                                   1.629 -0.937
```

```
## teamperf2 -> CUSL
                            0.226
                                            0.390
                                                        0.405
                                                                0.558 -0.504
                 CUSL
                             0.305
                                            0.371
                                                        0.391
                                                                0.781 -0.581
## teamperf3 ->
##
                      97.5% CI
## opt1 -> COMP
                        0.967
## opt2 -> COMP
                         0.977
## opt3 -> COMP
                         0.966
## pt1 -> LIKE
                         0.863
## pt2 -> LIKE
                         0.848
## pt3 -> LIKE
                         0.900
## pt4 -> LIKE
                         0.879
## pt5 -> LIKE
                         0.872
## fse1 -> CUSA
                         0.963
## fse2 -> CUSA
                         0.986
## fse3 -> CUSA
                         0.892
## teamperf1 -> CUSL
                         0.988
## teamperf2 ->
                 CUSL
                         0.953
## teamperf3 -> CUSL
                         0.887
##
## Bootstrapped HTMT:
                 Original Est. Bootstrap Mean Bootstrap SD 2.5% CI 97.5% CI
                                                                    0.626
## COMP -> LIKE
                        0.216
                                       0.368
                                                   0.110
                                                           0.201
## COMP -> CUSA
                         0.340
                                       0.589
                                                   0.222
                                                           0.277
                                                                    1.147
## COMP -> CUSL
                         0.449
                                       0.636
                                                   0.235
                                                           0.311
                                                                    1.212
## LIKE -> CUSA
                         0.452
                                       0.612
                                                   0.183
                                                           0.357
                                                                    1.026
## LIKE -> CUSL
                        0.267
                                                                    0.815
                                       0.451
                                                   0.150
                                                           0.233
## CUSA -> CUSL
                        0.805
                                       0.913
                                                   0.310
                                                           0.474
                                                                   1.643
```