Longitudinal Invariance CFA (using MLR) Example in Mplus v. 8.4 (N = 151; 6 items over 3 occasions)

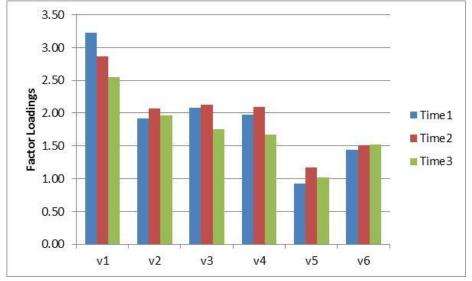
These data measuring a latent trait of social functioning were collected at a Psychiatric Rehabilitation center, in which time 1 was admittance, and times 2 and 3 were collected at six-month intervals. There were six subscales that were completed by the hospital staff for each patient, including positively-oriented measures of Social Competence, Social Interest, and Personal Neatness, and negatively-oriented measures of Psychoticism, Motor Retardation, and Irritability. The negatively-oriented subscales were reflected (*-1) prior to analysis. Initial models examined the fit of one-factor versus two-factor models given the two valences of the subscales, but the fit of the two-factor model was not a significant improvement, and thus a one-factor model with all six items was used here.

Mplus Code to Read in Data:

```
TITLE:
           Longitudinal Invariance
DATA:
           FILE = Example7b.csv;
                                               ! Don't need path if in same folder
           FORMAT = free; TYPE = INDIVIDUAL; ! Defaults
VARIABLE: NAMES = ID v1T1 v1T2 v1T3 v2T1 v2T2 v2T3
                                                            ! Every variable in data set
                     v3T1 v3T2 v3T3 v4T1 v4T2 v4T3
                     v5T1 v5T2 v5T3 v6T1 v6T2 v6T3;
           USEVARIABLES = v1T1 v1T2 v1T3 v2T1 v2T2 v2T3
                                                            ! Every variable in MODEL
                          v3T1 v3T2 v3T3 v4T1 v4T2 v4T3
                         v5T1 v5T2 v5T3 v6T1 v6T2 v6T3;
          MISSING = ALL (9999);
                                   ! Specify all missing values
          IDVARIABLE = ID;
                                   ! Specify person ID variable
! Reverse-coding items so that higher = better
           v4T1 = v4T1*(-1);
DEFINE:
           v4T2 = v4T2*(-1);
           v4T3 = v4T3*(-1);
           v5T1 = v5T1*(-1);
           v5T2 = v5T2*(-1);
           v5T3 = v5T3*(-1);
           v6T1 = v6T1*(-1);
           v6T2 = v6T2*(-1);
           v6T3 = v6T3*(-1);
ANALYSIS: ESTIMATOR = MLR; ! For continuous items whose residuals may not be normal
         MODINDICES(3.84); ! For modification indices of p<.05 for DF=1
OUTPUT:
          STDYX RESIDUAL;
                            ! Fully standardized solution, local model fit
MODEL:
          ! Model syntax goes here, to be changed for each model
```

Model 1. Configural Longitudinal Invariance Model (everything separate across time)

```
MODEL:
!!!!! Model 1: Configural Longitudinal Invariance
! Factor loadings all freely estimated, not labeled
 Time1 BY v1T1* v2T1* v3T1* v4T1* v5T1* v6T1*;
 Time2 BY v1T2* v2T2* v3T2* v4T2* v5T2* v6T2*;
 Time3 BY v1T3* v2T3* v3T3* v4T3* v5T3* v6T3*;
! Item intercepts all freely estimated, not labeled
  [v1T1* v1T2* v1T3*]; [v2T1* v2T2* v2T3*];
  [v3T1* v3T2* v3T3*]; [v4T1* v4T2* v4T3*];
  [v5T1* v5T2* v5T3*]; [v6T1* v6T2* v6T3*];
! Residual variances all freely estimated, not labeled
 v1T1* v1T2* v1T3*; v2T1* v2T2* v2T3*;
 v3T1* v3T2* v3T3*; v4T1* v4T2* v4T3*;
 v5T1* v5T2* v5T3*; v6T1* v6T2* v6T3*;
! Factor variances all fixed=1 for identification
 Time1@1 Time2@1 Time3@1;
! Factor means all fixed=0 for identification
  [Time1@0 Time2@0 Time3@0];
! Factor covariances all freely estimated
 Time1 Time2 Time3 WITH Time1* Time2* Time3*;
! Residual covariances estimated for same item across time
 v1T1 v1T2 v1T3 WITH v1T1* v1T2* v1T3*;
 v2T1 v2T2 v2T3 WITH v2T1* v2T2* v2T3*;
 v3T1 v3T2 v3T3 WITH v3T1* v3T2* v3T3*;
 v4T1 v4T2 v4T3 WITH v4T1* v4T2* v4T3*;
 v5T1 v5T2 v5T3 WITH v5T1* v5T2* v5T3*;
 v6T1 v6T2 v6T3 WITH v6T1* v6T2* v6T3*;
```



| а | rate across | s time) | | |
|---|---------------|--|------------|-------|
| | MODEL FIT | INFORMATION | | |
| | Number of | Free Parameters | 75 | |
| | Loglikelih | nood | | |
| | | HO Value | -4430.302 | |
| | | HO Scaling Correction Facto for MLR | r 1.4617 | |
| | | H1 Value | -4284.045 | |
| | | H1 Scaling Correction Facto for MLR | r 1.2029 | |
| | Informatio | on Criteria | | |
| | | Akaike (AIC) | 9010.604 | |
| | | Bayesian (BIC) | 9236.900 | |
| | | Sample-Size Adjusted BIC $(n* = (n + 2) / 24)$ | 8999.533 | |
| | Chi-Square | e Test of Model Fit | | |
| | 1 | Value | 283.247* | |
| | | Degrees of Freedom | 114 | |
| | | P-Value | 0.0000 | |
| | | Scaling Correction Factor for MLR | 1.0327 | |
| | RMSEA (Roo | ot Mean Square Error Of Appr | oximation) | |
| | 1410211 (1100 | Estimate | 0.099 | |
| | | 90 Percent C.I. | 0.085 | 0.114 |
| | | Probability RMSEA <= .05 | 0.000 | |
| | CFI/TLI | | | |
| | | CFI | 0.903 | |
| | | TLI | 0.870 | |
| | Chi-Square | e Test of Model Fit for the | | |
| | | Value | 1896.788 | |
| | | Degrees of Freedom | 153 | |
| | | P-Value | 0.0000 | |
| | SRMR (Star | ndardized Root Mean Square R | esidual) | |
| | | Value | 0.089 | |
| | | | | |

Although the fit is not great, attempts to improve it logically were unsuccessful, so we proceed from here with this as the configural invariance model. The plot of factor loadings on the left foreshadows what will happen when testing metric invariance next...

UNSTANDARDIZED MODEL RESULTS - NOTE ALL MEASUREMENT PARAMETERS DIFFER ACROSS TIME

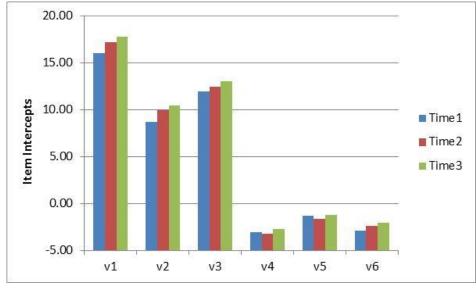
| | | | | | Two-Tailed | | | | | Two-Tailed |
|-----------|--------------|--------------|-----------|------------|------------|---------------|----------------------|----------|------------|------------|
| | | Estimate | S.E. | Est./S.E. | P-Value | | Estimate | S.E. | Est./S.E. | P-Value |
| FACTOR LO | ADINGS PER | | | | | | | | | |
| | BY | | | | | Means (FACTOR | R MEANS FIXED=0 FOR | IDENTIFI | CATION) | |
| V1T1 | | 3.222 | 0.267 | 12.063 | 0.000 | TIME1 | 0.000 | 0.000 | 999.000 | 999.000 |
| V2T1 | | 1.915 | 0.274 | 6.997 | 0.000 | TIME2 | 0.000 | 0.000 | 999.000 | 999.000 |
| V3T1 | | 2.080 | 0.209 | 9.956 | 0.000 | TIME3 | 0.000 | 0.000 | 999.000 | 999.000 |
| V4T1 | | 1.975 | 0.271 | 7.298 | 0.000 | | | | | |
| V5T1 | | 0.931 | 0.148 | 6.281 | 0.000 | Intercepts (A | ARE EXPECTED OUTCOME | WHEN FA | CTOR IS AT | 0) |
| V6T1 | | 1.441 | 0.119 | 12.101 | 0.000 | V1T1 | 16.077 | 0.276 | 58.220 | 0.000 |
| | | | | | | V1T2 | 17.226 | 0.245 | 70.294 | 0.000 |
| TIME2 | BY | | | | | V1T3 | 17.756 | 0.220 | 80.620 | 0.000 |
| V1T2 | | 2.863 | 0.305 | 9.372 | 0.000 | V2T1 | 8.672 | 0.298 | 29.132 | 0.000 |
| V2T2 | | 2.072 | 0.197 | 10.490 | 0.000 | V2T2 | 9.981 | 0.263 | 37.921 | 0.000 |
| V3T2 | | 2.133 | 0.185 | 11.509 | 0.000 | V2T3 | 10.442 | 0.281 | 37.204 | 0.000 |
| V4T2 | | 2.098 | 0.322 | 6.514 | 0.000 | V3T1 | 11.970 | 0.225 | 53.108 | 0.000 |
| V5T2 | | 1.175 | 0.239 | 4.921 | 0.000 | V3T2 | 12.467 | 0.218 | 57.264 | 0.000 |
| V6T2 | | 1.512 | 0.129 | 11.749 | 0.000 | V3T3 | 13.029 | 0.213 | 61.157 | 0.000 |
| | | | | | | V4T1 | -3.037 | 0.271 | -11.216 | 0.000 |
| TIME3 | BY | | | | | V4T2 | -3.211 | 0.260 | -12.349 | 0.000 |
| V1T3 | | 2.550 | 0.288 | 8.865 | 0.000 | V4T3 | -2.738 | 0.249 | -11.014 | 0.000 |
| V2T3 | | 1.961 | 0.230 | 8.539 | 0.000 | V5T1 | -1.283 | 0.138 | -9.293 | 0.000 |
| V3T3 | | 1.751 | 0.210 | 8.323 | 0.000 | V5T2 | -1.664 | 0.200 | -8.338 | 0.000 |
| V4T3 | | 1.678 | 0.260 | 6.448 | 0.000 | V5T3 | -1.247 | 0.166 | -7.511 | 0.000 |
| V5T3 | | 1.021 | 0.170 | 6.012 | 0.000 | V6T1 | -2.871 | 0.164 | -17.508 | 0.000 |
| V6T3 | | 1.523 | 0.159 | 9.574 | 0.000 | V6T2 | -2.413 | 0.158 | -15.316 | 0.000 |
| | | | | | | V6T3 | -2.075 | 0.152 | -13.618 | 0.000 |
| TIME1 | WITH (ESTI | MATED FACTO | R COVARIA | NCES) | | | | | | |
| TIME2 | 2 | 0.786 | 0.042 | 18.827 | 0.000 | Residual Var | riances (VARIANCE PE | | | |
| TIME3 | 3 | 0.707 | 0.084 | 8.456 | 0.000 | V1T1 | 0.241 | 0.395 | 0.610 | 0.542 |
| | | | | | | V1T2 | 0.511 | 0.268 | 1.907 | 0.056 |
| TIME2 | WITH | | | | | V1T3 | 0.523 | 0.349 | 1.497 | 0.134 |
| TIME3 | 3 | 0.671 | 0.089 | 7.532 | 0.000 | V2T1 | 8.672 | 1.022 | 8.484 | 0.000 |
| | | | | | | V2T2 | 5.913 | 0.617 | 9.581 | 0.000 |
| *** Resid | lual covaria | nces among | same item | across tim | e **** | V2T3 | 5.142 | 0.806 | 6.379 | 0.000 |
| V1T1 | WITH | | | | | V3T1 | 2.413 | 0.398 | 6.067 | 0.000 |
| V1T2 | | -0.214 | 0.250 | -0.855 | 0.393 | V3T2 | 2.202 | 0.369 | 5.972 | 0.000 |
| V1T3 | | -0.004 | 0.247 | -0.016 | 0.987 | V3T3 | 2.381 | 0.430 | 5.542 | 0.000 |
| | | | | | | V4T1 | 7.199 | 1.036 | 6.950 | 0.000 |
| V1T2 | WITH | | | | | V4T2 | 6.765 | 0.990 | 6.834 | 0.000 |
| V1T3 | | 0.113 | 0.231 | 0.488 | 0.626 | V4T3 | 6.456 | 1.078 | 5.988 | 0.000 |
| | | | | | | V5T1 | 1.824 | 0.446 | 4.093 | 0.000 |
| | | | | | | V5T2 | 4.676 | 1.439 | 3.251 | 0.001 |
| | • | ARIANCES FIX | | | • | V5T3 | 2.944 | 0.752 | 3.913 | 0.000 |
| TIME1 | | 1.000 | 0.000 | 999.000 | 999.000 | V6T1 | 1.694 | 0.243 | 6.974 | 0.000 |
| TIME2 | | 1.000 | 0.000 | 999.000 | 999.000 | V6T2 | 1.103 | 0.166 | 6.643 | 0.000 |
| TIME3 | ` | 1.000 | 0.000 | 999.000 | 999.000 | V6T3 | 0.751 | 0.162 | 4.630 | 0.000 |

Model 2a. Metric Invariance Model (ALL loadings held equal across time – identified model using Time1 Factor Variance = 1)

```
MODEL:
!!!!! Model 2a: Metric Longitudinal Invariance
                                                             MODEL FIT INFORMATION
                                                             Number of Free Parameters
                                                                                                             65
! Factor loadings NOW CONSTRAINED EQUAL ACROSS TIME
 Time1 BY v1T1* v2T1* v3T1* v4T1* v5T1* v6T1* (L1-L6);
                                                             Loglikelihood
 Time2 BY v1T2* v2T2* v3T2* v4T2* v5T2* v6T2* (L1-L6);
                                                                       HO Value
                                                                                                      -4442.401
 Time3 BY v1T3* v2T3* v3T3* v4T3* v5T3* v6T3* (L1-16);
                                                                       HO Scaling Correction Factor
                                                                                                       1.4921
! Item intercepts all freely estimated, not labeled
                                                                       for MLR
  [v1T1* v1T2* v1T3*]; [v2T1* v2T2* v2T3*];
                                                                     H1 Value
                                                                                                     -4284.045
                                                                      H1 Scaling Correction Factor
  [v3T1* v3T2* v3T3*]; [v4T1* v4T2* v4T3*];
                                                                                                       1.2029
  [v5T1* v5T2* v5T3*]; [v6T1* v6T2* v6T3*];
                                                                        for MLR
! Residual variances all freely estimated, not labeled
 v1T1* v1T2* v1T3*; v2T1* v2T2* v2T3*;
                                                             Information Criteria
 v3T1* v3T2* v3T3*; v4T1* v4T2* v4T3*;
                                                                       Akaike (AIC)
                                                                                                       9014.803
 v5T1* v5T2* v5T3*; v6T1* v6T2* v6T3*;
                                                                      Bavesian (BIC)
                                                                                                       9210.926
! Factor variance AT TIME 1 fixed=1 for identification
                                                                      Sample-Size Adjusted BIC
                                                                                                       9005.208
                                                                        (n* = (n + 2) / 24)
 Time1@1 Time2* Time3*;
! Factor means all fixed=0 for identification
  [Time1@0 Time2@0 Time3@0];
                                                             Chi-Square Test of Model Fit
! Factor covariances all freely estimated
                                                                       Value
                                                                                                        301.234*
 Time1 Time2 Time3 WITH Time1* Time2* Time3*;
                                                                       Degrees of Freedom
                                                                                                           124
! Residual covariances estimated for same item across time
                                                                       P-Value
                                                                                                         0.0000
 v1T1 v1T2 v1T3 WITH v1T1* v1T2* v1T3*;
                                                                       Scaling Correction Factor
                                                                                                         1.0514
 v2T1 v2T2 v2T3 WITH v2T1* v2T2* v2T3*;
                                                                         for MLR
 v3T1 v3T2 v3T3 WITH v3T1* v3T2* v3T3*;
 v4T1 v4T2 v4T3 WITH v4T1* v4T2* v4T3*;
                                                             RMSEA (Root Mean Square Error Of Approximation)
 v5T1 v5T2 v5T3 WITH v5T1* v5T2* v5T3*;
                                                                       Estimate
                                                                                                          0.097
 v6T1 v6T2 v6T3 WITH v6T1* v6T2* v6T3*;
                                                                       90 Percent C.I.
                                                                                                         0.083 0.111
                                                                       Probability RMSEA <= .05
                                                                                                        0.000
Does the metric model (2a) fit worse than the configural model (1)?
                                                             CFI/TLI
Yes, -2\Delta LL(df=10) = 19.14, p = .04
                                                                       CFI
                                                                                                          0.898
                                                                       TLI
                                                                                                          0.875
                                                             SRMR (Standardized Root Mean Square Residual)
                                                                       Value
                                                                                                          0.094
                                                             MODEL MODIFICATION INDICES (relevant for testing invariance)
                                                             BY Statements
                                                                                    M.I.
                                                                                             E.P.C. Std E.P.C. StdYX E.P.C.
                                                             BY Statements
                                                             TIME1
                                                                      BY V1T1
                                                                                   10.377
                                                                                              0.182
                                                                                                         0.182
                                                                                                                      0.058
                                                             TIME1
                                                                      BY V5T1
                                                                                 6.062
                                                                                             -0.054
                                                                                                        -0.054
                                                                                                                     -0.033
                                                             TIME3 BY V6T3
                                                                                    7.603
                                                                                              0.201
                                                                                                         0.175
                                                                                                                      0.105
                                                             Modification indices suggest that freeing the loading for v1 at Time1 would
                                                             help, and that matches our observations, so let's try that.
```

Model 2b. Partial Metric Invariance Model with loading for v1 at Time 1 free

```
MODEL:
! Model 2b: Partial Metric Invariance without v1T1
! Factor loadings NOW CONSTRAINED EQUAL ACROSS TIME EXCEPT v1T1
 Time1 BY v1T1* v2T1* v3T1* v4T1* v5T1* v6T1* (L1a L2-L6);
 Time2 BY v1T2* v2T2* v3T2* v4T2* v5T2* v6T2* (L1-L6);
 Time3 BY v1T3* v2T3* v3T3* v4T3* v5T3* v6T3* (L1-16);
! Item intercepts all freely estimated, not labeled
  [v1T1* v1T2* v1T3*]; [v2T1* v2T2* v2T3*];
  [v3T1* v3T2* v3T3*]; [v4T1* v4T2* v4T3*];
  [v5T1* v5T2* v5T3*]; [v6T1* v6T2* v6T3*];
! Residual variances all freely estimated, not labeled
 v1T1* v1T2* v1T3*; v2T1* v2T2* v2T3*;
 v3T1* v3T2* v3T3*; v4T1* v4T2* v4T3*;
 v5T1* v5T2* v5T3*; v6T1* v6T2* v6T3*;
! Factor variance AT TIME 1 fixed=1 for identification
 Time1@1 Time2* Time3*;
! Factor means all fixed=0 for identification
  [Time1@0 Time2@0 Time3@0];
! Factor covariances all freely estimated
 Time1 Time2 Time3 WITH Time1* Time2* Time3*;
! Residual covariances estimated for same item across time
 v1T1 v1T2 v1T3 WITH v1T1* v1T2* v1T3*;
 v2T1 v2T2 v2T3 WITH v2T1* v2T2* v2T3*;
 v3T1 v3T2 v3T3 WITH v3T1* v3T2* v3T3*;
 v4T1 v4T2 v4T3 WITH v4T1* v4T2* v4T3*;
 v5T1 v5T2 v5T3 WITH v5T1* v5T2* v5T3*;
 v6T1 v6T2 v6T3 WITH v6T1* v6T2* v6T3*;
```



| - | INFORMATION Free Parameters | 66 | |
|-------------|--|-----------|-------|
| Loglikelih | nood | | |
| Logilheili | HO Value | -4435.669 | |
| | HO Scaling Correction Factor for MLR | 1.4980 | |
| | H1 Value | -4284.045 | |
| | H1 Scaling Correction Factor for MLR | 1.2029 | |
| Information | on Criteria | | |
| | Akaike (AIC) | 9003.337 | |
| | Bayesian (BIC) | 9202.478 | |
| | Sample-Size Adjusted BIC $(n* = (n + 2) / 24)$ | 8993.595 | |
| | (11 (11 + 2) / 24) | | |
| Chi-Square | e Test of Model Fit | | |
| 1 | Value | 290.301* | |
| | Degrees of Freedom | 123 | |
| | P-Value | 0.0000 | |
| | Scaling Correction Factor for MLR | 1.0446 | |
| | TOT MER | | |
| RMSEA (Roc | ot Mean Square Error Of Approxi | .mation) | |
| | Estimate | 0.095 | |
| | 90 Percent C.I. | 0.081 | 0.109 |
| | Probability RMSEA <= .05 | 0.000 | |
| CFI/TLI | | | |
| | CFI | 0.904 | |
| | TLI | 0.881 | |
| SRMR (Star | ndardized Root Mean Square Resi | dual) | |
| | Value | 0.091 | |

Does the partial metric model (2b) fit *better* than the full metric model (2a)? Yes, $-2\Delta LL(df=1) = 7.16$, p < .01

Does the partial metric model (2b) fit worse than the configural model (1)? No, $-2\Delta LL(df=9) = 8.98$, p = .44

No large invariance-related modification indices were found, so we'll call it good! Onto the next model! The plot of intercepts on the left foreshadow what we will find with testing scalar invariance...

2b UNSTANDARDIZED PARTIAL METRIC MODEL RESULTS - ALL FACTOR LOADINGS ARE HELD EQUAL EXCEPT v1T1

| 2b UNSTANDARDIZ | ED PARTIAL METRI | C MODEL F | | | ADINGS ARE HEL | D EQUAL EXCEPT v1T1 | • | | |
|---|----------------------------|-----------|---------------|------------|----------------|----------------------|-----------|-------------|------------|
| | | | | Two-Tailed | | | | | Two-Tailed |
| | Estimate | S.E. | Est./S.E. | P-Value | | Estimate | S.E. | Est./S.E. | P-Value |
| TIME1 BY | | | | | Means (FACTOR | R MEANS FIXED=0 FOR | | | |
| V1T1 | 3.233 | 0.261 | 12.362 | 0.000 | TIME1 | 0.000 | 0.000 | 999.000 | 999.000 |
| V2T1 | 1.950 | 0.201 | 9.706 | 0.000 | TIME2 | 0.000 | 0.000 | 999.000 | 999.000 |
| V3T1 | 1.967 | 0.198 | 9.910 | 0.000 | TIME3 | 0.000 | 0.000 | 999.000 | 999.000 |
| V4T1 | 1.899 | 0.224 | 8.481 | 0.000 | | | | | |
| V5T1 | 0.968 | 0.137 | 7.055 | 0.000 | Intercepts - | - SCALED SO SHOULD I | BE EQUAL | ACROSS TIME | |
| V6T1 | 1.476 | 0.131 | 11.247 | 0.000 | V1T1 | 16.078 | 0.276 | 58.267 | 0.000 |
| | | | | | V1T2 | 17.225 | 0.245 | 70.282 | 0.000 |
| TIME2 BY | | | | | V1T3 | 17.756 | 0.222 | 80.036 | 0.000 |
| V1T2 | 2.644 | 0.234 | 11.315 | 0.000 | V2T1 | 8.672 | 0.298 | 29.071 | 0.000 |
| V2T2 | 1.950 | 0.201 | 9.706 | 0.000 | V2T2 | 9.980 | 0.264 | 37.872 | 0.000 |
| V3T2 | 1.967 | 0.198 | 9.910 | 0.000 | V2T3 | 10.434 | 0.280 | 37.245 | 0.000 |
| V4T2 | 1.899 | 0.224 | 8.481 | 0.000 | V3T1 | 11.978 | 0.225 | 53.192 | 0.000 |
| V5T2 | 0.968 | 0.137 | 7.055 | 0.000 | V3T2 | 12.468 | 0.217 | 57.325 | 0.000 |
| V6T2 | 1.476 | 0.131 | 11.247 | 0.000 | V3T3 | 13.041 | 0.212 | 61.441 | 0.000 |
| | | | | | V4T1 | -3.034 | 0.267 | -11.343 | 0.000 |
| TIME3 BY | | | | | V4T2 | -3.210 | 0.260 | -12.365 | 0.000 |
| V1T3 | 2.644 | 0.234 | 11.315 | 0.000 | V4T3 | -2.720 | 0.254 | -10.720 | 0.000 |
| V2T3 | 1.950 | 0.201 | 9.706 | 0.000 | V5T1 | -1.288 | 0.137 | -9.377 | 0.000 |
| V3T3 | 1.967 | 0.198 | 9.910 | 0.000 | V5T2 | -1.663 | 0.199 | -8.340 | 0.000 |
| V4T3 | 1.899 | 0.224 | 8.481 | 0.000 | V5T3 | -1.246 | 0.169 | -7.373 | 0.000 |
| V5T3 | 0.968 | 0.137 | 7.055 | 0.000 | V6T1 | -2.871 | 0.164 | -17.506 | 0.000 |
| V6T3 | 1.476 | 0.131 | 11.247 | 0.000 | V6T2 | -2.414 | 0.158 | -15.319 | 0.000 |
| V 013 | 1.170 | 0.101 | 11.21, | 0.000 | V6T3 | -2.087 | 0.154 | -13.571 | 0.000 |
| TIME1 WITH | | | | | V015 | 2.007 | 0.131 | 13.371 | 0.000 |
| TIME2 | 0.847 | 0.078 | 10.837 | 0.000 | Residual Var | riances - ITEM VARIA | ANCE THAT | IS NOT THE | FACTOR |
| TIME3 | 0.682 | 0.124 | 5.508 | 0.000 | V1T1 | 0.170 | 0.374 | 0.454 | 0.650 |
| 111111111111111111111111111111111111111 | 0.002 | 0.121 | 0.000 | 0.000 | V1T2 | 0.548 | 0.265 | 2.070 | 0.038 |
| TIME2 WITH | | | | | V1T3 | 0.509 | 0.314 | 1.618 | 0.106 |
| TIME3 | 0.699 | 0.128 | 5.473 | 0.000 | V2T1 | 8.702 | 1.026 | 8.483 | 0.000 |
| 111111111111111111111111111111111111111 | 0.055 | 0.120 | 3.173 | 0.000 | V2T2 | 5.895 | 0.605 | 9.746 | 0.000 |
| *** Residual co | variances among | same item | n across time | · *** | V212 V2T3 | 5.177 | 0.795 | 6.514 | 0.000 |
| 1.651ddd1 CO | .arrances among . | came reen | GOLODO CIME | • | V213 V3T1 | 2.502 | 0.386 | 6.484 | 0.000 |
| V1T1 WITH | | | | | V3T2 | 2.178 | 0.352 | 6.183 | 0.000 |
| V1T2 | -0.225 | 0.249 | -0.904 | 0.366 | V3T2 | 2.309 | 0.416 | 5.548 | 0.000 |
| V1T3 | -0.223 | 0.249 | -0.049 | 0.961 | V313 V4T1 | 7.172 | 1.021 | 7.021 | 0.000 |
| V 1 1 3 | 0.012 | 0.230 | 0.049 | 0.501 | V4T1 V4T2 | 6.759 | 0.967 | 6.990 | 0.000 |
| V1T2 WITH | | | | | V4T3 | 6.613 | 1.128 | 5.860 | 0.000 |
| V1T3 | 0.132 | 0.230 | 0.573 | 0.566 | V413 V5T1 | 1.829 | 0.443 | 4.131 | 0.000 |
| | 0.132 | 0.230 | 0.575 | 0.500 | V5T2 | 4.678 | 1.430 | 3.272 | 0.001 |
| • | | | | | V5T3 | 2.944 | 0.760 | 3.872 | 0.000 |
| Variances (EACE | OR VARIANCE AT T | TME1-1 EC | O TOWNTETCE | \TT∩N) | V6T1 | 1.707 | 0.760 | 7.059 | 0.000 |
| TIME1 | JR VARIANCE AT T. 1.000 | 0.000 | 999.000 | 999.000 | V6T1 V6T2 | 1.090 | 0.242 | 6.599 | 0.000 |
| TIME1 TIME2 | 1.162 | 0.185 | 6.270 | 0.000 | V6T2 V6T3 | 0.784 | 0.165 | 4.618 | 0.000 |
| | | 0.185 | 5.999 | | V 012 | 0.784 | 0.1/0 | 4.018 | 0.000 |
| TIME3 | 0.941 | 0.13/ | 5.999 | 0.000 | | | | | |
| | | | | | | | | | |

Model 3a. Scalar Invariance Model (all intercepts held equal across over time except v1T1); identified by Time1 mean=0

| MODEL: | | | | | |
|---|--|--|--|--|--|
| ! Model 3a: Full Scalar Invariance without v1T1 | MODEL FIT INFORMATION | | | | |
| FACTOR STATE SCATAL INVALIANCE WITHOUT VIII | Number of Free Parameters 57 | | | | |
| ! Factor loadings NOW CONSTRAINED EQUAL ACROSS TIME EXCEPT v1T1 | Number of free farameters | | | | |
| | Tarlibaliband | | | | |
| Time1 BY v1T1* v2T1* v3T1* v4T1* v5T1* v6T1* (L1a L2-L6); | Loglikelihood | | | | |
| Time2 BY v1T2* v2T2* v3T2* v4T2* v5T2* v6T2* (L1-L6); | HO Value -4461.842 | | | | |
| Time3 BY v1T3* v2T3* v3T3* v4T3* v5T3* v6T3* (L1-16); | HO Scaling Correction Factor 1.5846 | | | | |
| ! Item intercepts NOW CONSTRAINED EQUAL ACROSS TIME EXCEPT v1T1 | for MLR | | | | |
| [v1T1*]; [v1T2* v1T3*] (I1); ! 3a: I1 applies only to 2 and 3 | H1 Value -4284.045 | | | | |
| [v2T1* v2T2* v2T3*] (I2); | H1 Scaling Correction Factor 1.2029 | | | | |
| [v3T1* v3T2* v3T3*] (I3); | for MLR | | | | |
| [v4T1* v4T2* v4T3*] (I4); | | | | | |
| [v5T1* v5T2* v5T3*] (I5); | Information Criteria | | | | |
| [v6T1* v6T2* v6T3*] (I6); | Akaike (AIC) 9037.685 | | | | |
| ! Residual variances all freely estimated, not labeled | Bayesian (BIC) 9209.670 | | | | |
| v1T1* v1T2* v1T3*; v2T1* v2T2* v2T3*; | Sample-Size Adjusted BIC 9029.271 | | | | |
| v3T1* v3T2* v3T3*; v4T1* v4T2* v4T3*; | $(n^* = (n + 2) / 24)$ | | | | |
| v5T1* v5T2* v5T3*; v6T1* v6T2* v6T3*; | | | | | |
| ! Factor variance AT TIME 1 fixed=1 for identification | Chi-Square Test of Model Fit | | | | |
| Time1@1 Time2* Time3*; | Value 342.530* | | | | |
| ! Factor mean AT TIME 1 fixed=0 for identification | Degrees of Freedom 132 | | | | |
| [Time1@0 Time2* Time3*]; | P-Value 0.0000 | | | | |
| | | | | | |
| ! Factor covariances all freely estimated | Scaling Correction Factor 1.0381 | | | | |
| Time1 Time2 Time3 WITH Time1* Time2* Time3*; | for MLR | | | | |
| ! Residual covariances estimated for same item across time | DMCEA (Doot Moon Course Enner Of Annouination) | | | | |
| v1T1 v1T2 v1T3 WITH v1T1* v1T2* v1T3*; | RMSEA (Root Mean Square Error Of Approximation) | | | | |
| v2T1 v2T2 v2T3 WITH v2T1* v2T2* v2T3*; | Estimate 0.103 | | | | |
| v3T1 v3T2 v3T3 WITH v3T1* v3T2* v3T3*; | 90 Percent C.I. 0.089 0.116 | | | | |
| v4T1 v4T2 v4T3 WITH v4T1* v4T2* v4T3*; | Probability RMSEA <= .05 0.000 | | | | |
| v5T1 v5T2 v5T3 WITH v5T1* v5T2* v5T3*; | | | | | |
| v6T1 v6T2 v6T3 WITH v6T1* v6T2* v6T3*; | CFI/TLI | | | | |
| | CFI 0.879 | | | | |
| Does the full scalar model (3a) fit worse than the partial metric model | TLI 0.860 | | | | |
| (2b)? Yes, $-2\Delta LL(df=9) = 55.13$, $p < .01$ | | | | | |
| (20): 103, ZALL((1-3) = 30.13, p <.01 | SRMR (Standardized Root Mean Square Residual) | | | | |
| | Value 0.093 | | | | |
| | | | | | |
| | | | | | |
| Modification indices suggest that freeing these intercepts would help, so | MODEL MODIFICATION INDICES (relevant for invariance testing) | | | | |
| | Means/Intercepts/Thresholds | | | | |
| let's try v5T1 first (biggest χ² change suggested). | | | | | |
| | M.I. E.P.C. Std E.P.C. StdYX E.P.C. | | | | |
| | [V2T1] 14.761 -0.696 -0.696 -0.189 | | | | |
| | [V2T2] 5.578 0.307 0.307 0.094 | | | | |
| | [V4T1] 10.400 0.366 0.366 0.113 | | | | |
| | [V4T2] 5.167 -0.271 -0.271 -0.084 | | | | |
| | [V5T1] 20.890 -0.027 -0.027 -0.017 | | | | |
| | [V5T2] 14.191 -0.596 -0.596 -0.241 | | | | |
| | [v 0.12 | | | | |

Model 3b. Partial Scalar Invariance Model (all intercepts held equal across over time except v1T1 and v5T1)

| Model 3b. Partial Scalar Invariance Model (all intercepts held equal a | cross over time except viii and voii) |
|--|--|
| MODEL: ! Model 3b: Partial Scalar Invariance, no v1T1 v5T1 | |
| | MODEL FIT INFORMATION |
| ! Factor loadings NOW CONSTRAINED EQUAL ACROSS TIME EXCEPT v1T1 | Number of Free Parameters 58 |
| Time1 BY v1T1* v2T1* v3T1* v4T1* v5T1* v6T1* (L1a L2-L6); | |
| Time2 BY v1T2* v2T2* v3T2* v4T2* v5T2* v6T2* (L1-L6); | Loglikelihood |
| Time3 BY v1T3* v2T3* v3T3* v4T3* v5T3* v6T3* (L1-16); | H0 Value -4450.001 |
| ! Item intercepts NOW CONSTRAINED EQUAL ACROSS TIME, no v1T1 v5T1 | HO Scaling Correction Factor 1.5626 |
| [v1T1*]; [v1T2* v1T3*] (I1); ! 3a: I1 applies only to 2 and 3 | for MLR |
| [v2T1* v2T2* v2T3*] (I2); | H1 Value -4284.045 |
| [v3T1* v3T2* v3T3*] (I3); | H1 Scaling Correction Factor 1.2029 |
| [v4T1* v4T2* v4T3*] (I4); | for MLR |
| [v5T1*]; [v5T2* v5T3*] (I5); ! 3b: I5 applies only to 2 and 3 | |
| [v6T1* v6T2* v6T3*] (I6); | Information Criteria |
| ! Residual variances all freely estimated, not labeled | Akaike (AIC) 9016.001 |
| v1T1* v1T2* v1T3*; v2T1* v2T2* v2T3*; | Bayesian (BIC) 9191.004 |
| v3T1* v3T2* v3T3*; v4T1* v4T2* v4T3*; | Sample-Size Adjusted BIC 9007.440 |
| v5T1* v5T2* v5T3*; v6T1* v6T2* v6T3*; | $(n^* = (n + 2) / 24)$ |
| ! Factor variance AT TIME 1 fixed=1 for identification | |
| Time1@1 Time2* Time3*; | Chi-Square Test of Model Fit |
| ! Factor mean AT TIME 1 fixed=0 for identification | Value 318.018* |
| [Time1@0 Time2* Time3*]; | Degrees of Freedom 131 |
| ! Factor covariances all freely estimated | P-Value 0.0000 |
| Time1 Time2 Time3 WITH Time1* Time2* Time3*; | Scaling Correction Factor 1.0437 |
| ! Residual covariances estimated for same item across time | for MLR |
| v1T1 v1T2 v1T3 WITH v1T1* v1T2* v1T3*; | TOT PILIC |
| v2T1 v2T2 v2T3 WITH v2T1* v2T2* v2T3*; | RMSEA (Root Mean Square Error Of Approximation) |
| v3T1 v3T2 v3T3 WITH v3T1* v3T2* v3T3*; | Estimate 0.097 |
| v4T1 v4T2 v4T3 WITH v4T1* v4T2* v4T3*; | 90 Percent C.I. 0.084 0.111 |
| v5T1 v5T2 v5T3 WITH v5T1* v5T2* v5T3*; | Probability RMSEA <= .05 0.000 |
| v6T1 v6T2 v6T3 WITH v6T1* v6T2* v6T3*; | 110bdb111ty Nubbh (05 |
| Voll Voll Voll Will Voll Voll Voll Voll Voll Voll Voll V | CFI/TLI |
| | CFI 0.893 |
| Does the partial scalar model (3b) fit better than the full scalar model (3a)? | TLI 0.875 |
| Yes, $-2\Delta LL(df=1) = 15.16$, $p < .01$ | 111 |
| | SRMR (Standardized Root Mean Square Residual) |
| Does the partial scalar model (3b) fit worse than the partial metric model | Value 0.086 |
| (2b)? Yes, $-2\Delta LL(df=8) = 27.84$, $p < .01$ | value 0.000 |
| (· · · · · · · · · · · · · · · · · · · | MODEL MODIFICATION INDICES (relevant for invariance testing) |
| | Means/Intercepts/Thresholds |
| | Liegus/Incercebcs/Integnords |
| | M.I. E.P.C. Std E.P.C. StdYX |
| Modification indices still suggest that freeing these intercepts would help, | E.P.C. Std E.P.C. StdX |
| so let's try v4T1 next (biggest χ² change suggested). | |
| , | |
| | |
| | [V4T1] 13.795 0.425 0.425 0.132 |
| | [V4T2] 6.398 -0.306 -0.306 -0.096 |
| | |

Model 3c. Partial Scalar Invariance Model (all intercepts held equal across over time except v1T1, v5T1, v4T1)

```
MODEL: ! Model 3c: Partial Scalar Invariance, no v1T1 v5T1 v4T1
                                                                    MODEL FIT INFORMATION
                                                                    Number of Free Parameters
! Factor loadings NOW CONSTRAINED EQUAL ACROSS TIME EXCEPT v1T1
                                                                                                                     59
 Time1 BY v1T1* v2T1* v3T1* v4T1* v5T1* v6T1* (L1a L2-L6);
 Time2 BY v1T2* v2T2* v3T2* v4T2* v5T2* v6T2* (L1-L6);
                                                                    Loglikelihood
                                                                                                              -4442.214
 Time3 BY v1T3* v2T3* v3T3* v4T3* v5T3* v6T3* (L1-16);
                                                                               HO Value
! Item intercepts NOW CONSTRAINED EQUAL ACROSS TIME,
                                                                               HO Scaling Correction Factor
                                                                                                                1.5647
! no v1T1 v5T1 v4T1
                                                                               for MLR
  [v1T1*]; [v1T2* v1T3*] (I1); ! 3a: I1 applies only to 2 and 3
                                                                               H1 Value
                                                                                                              -4284.045
                                                                              H1 Scaling Correction Factor
           v2T2* v2T3*] (I2);
                                                                                                               1.2029
  [v3T1*
            v3T2* v3T3*] (I3);
                                                                                for MLR
  [v4T1*]; [v4T2* v4T3*] (I4); ! 3c: I4 applies only to 2 and 3
  [v5T1*]; [v5T2* v5T3*] (I5); ! 3b: I5 applies only to 2 and 3
                                                                    Information Criteria
  [v6T1*
            v6T2* v6T3*] (I6);
                                                                               Akaike (AIC)
                                                                                                               9002.427
! Residual variances all freely estimated, not labeled
                                                                               Bavesian (BIC)
                                                                                                               9180.447
 v1T1* v1T2* v1T3*; v2T1* v2T2* v2T3*;
                                                                               Sample-Size Adjusted BIC
                                                                                                               8993.718
                                                                                (n* = (n + 2) / 24)
 v3T1* v3T2* v3T3*; v4T1* v4T2* v4T3*;
 v5T1* v5T2* v5T3*; v6T1* v6T2* v6T3*;
! Factor variance AT TIME 1 fixed=1 for identification
                                                                    Chi-Square Test of Model Fit
 Time1@1 Time2* Time3*;
                                                                               Value
                                                                                                                304.537*
! Factor mean AT TIME 1 fixed=0 for identification
                                                                               Degrees of Freedom
                                                                                                                    130
  [Time1@0 Time2* Time3*];
                                                                               P-Value
                                                                                                                 0.0000
! Factor covariances all freely estimated
                                                                               Scaling Correction Factor
                                                                                                                 1.0387
 Time1 Time2 Time3 WITH Time1* Time2* Time3*;
                                                                                 for MLR
! Residual covariances estimated for same item across time
 v1T1 v1T2 v1T3 WITH v1T1* v1T2* v1T3*;
                                                                    RMSEA (Root Mean Square Error Of Approximation)
 v2T1 v2T2 v2T3 WITH v2T1* v2T2* v2T3*;
                                                                               Estimate
                                                                                                                  0.094
 v3T1 v3T2 v3T3 WITH v3T1* v3T2* v3T3*;
                                                                               90 Percent C.I.
                                                                                                                  0.081 0.108
 v4T1 v4T2 v4T3 WITH v4T1* v4T2* v4T3*;
                                                                               Probability RMSEA <= .05
                                                                                                                  0.000
 v5T1 v5T2 v5T3 WITH v5T1* v5T2* v5T3*;
 v6T1 v6T2 v6T3 WITH v6T1* v6T2* v6T3*;
                                                                    CFI/TLI
                                                                               CFI
                                                                                                                  0.900
                                                                               TLI
                                                                                                                  0.882
Does the partial scalar model (3c) fit better than the partial scalar model
(3b)? Yes, -2\Delta LL(df=1) = 9.24, p < .01
                                                                    SRMR (Standardized Root Mean Square Residual)
                                                                               Value
                                                                                                                  0.092
Does the partial scalar model (3c) fit worse than the partial metric model
(2b)? Eh, -2\Delta LL(df=7) = 13.99, p = .05
                                                                    MODEL MODIFICATION INDICES (relevant for invariance testing)
                                                                    Means/Intercepts/Thresholds
                                                                                       M.I. E.P.C. Std E.P.C. StdYX E.P.C.
                                                                    [ V2T1 ]
                                                                                       8.560 -0.497 -0.497
                                                                                                                         -0.137
Although fit is close to not worse than the partial metric model,
there is a significant modification index for v2T1, suggesting
localized strain. So let's see what happens if we free that one, too.
```

No invariance-related modification indices remain, so we are done!

The intercepts at the end of Model 3d are shown on the left.

Model 3d. Partial Scalar Invariance Model (all intercepts held equal across over time except v1T1, v5T1, v4T1, v2T1)

```
MODEL: ! Model 3d: Partial Scalar Invariance,
                                                                    MODEL FIT INFORMATION
        ! no v1T1 v5T1 v4T1 v2T1
                                                                    Number of Free Parameters
                                                                                                                      60
! Factor loadings NOW CONSTRAINED EQUAL ACROSS TIME EXCEPT v1T1
                                                                    Loglikelihood
 Time1 BY v1T1* v2T1* v3T1* v4T1* v5T1* v6T1* (L1a L2-L6);
                                                                              HO Value
                                                                                                               -4437.665
  Time2 BY v1T2* v2T2* v3T2* v4T2* v5T2* v6T2* (L1-L6);
                                                                              HO Scaling Correction Factor
                                                                                                                1.5560
 Time3 BY v1T3* v2T3* v3T3* v4T3* v5T3* v6T3* (L1-16);
                                                                                for MLR
! Item intercepts NOW CONSTRAINED EQUAL ACROSS TIME,
                                                                              H1 Value
                                                                                                               -4284.045
! no v1T1 v5T1 v4T1 v2T1
                                                                              H1 Scaling Correction Factor
                                                                                                                1.2029
  [v1T1*]; [v1T2* v1T3*] (I1); ! 3a: I1 applies only to 2 and 3
                                                                                for MLR
  [v2T1*]; [v2T2* v2T3*] (I2); ! 3d: I2 applies only to 2 and 3
            v3T2* v3T3*] (I3);
                                                                    Information Criteria
  [v4T1*]; [v4T2* v4T3*] (I4); ! 3c: I4 applies only to 2 and 3
                                                                              Akaike (AIC)
                                                                                                                8995.330
  [v5T1*]; [v5T2* v5T3*] (I5); ! 3b: I5 applies only to 2 and 3
                                                                               Bayesian (BIC)
                                                                                                                9176.366
            v6T2* v6T3*] (I6);
                                                                               Sample-Size Adjusted BIC
                                                                                                                8986.473
! Residual variances all freely estimated, not labeled
                                                                                 (n* = (n + 2) / 24)
 v1T1* v1T2* v1T3*; v2T1* v2T2* v2T3*;
 v3T1* v3T2* v3T3*; v4T1* v4T2* v4T3*;
                                                                    Chi-Square Test of Model Fit
 v5T1* v5T2* v5T3*; v6T1* v6T2* v6T3*;
                                                                               Value
                                                                                                                 295.789*
! Factor variance AT TIME 1 fixed=1 for identification
                                                                               Degrees of Freedom
                                                                                                                     129
 Time1@1 Time2* Time3*;
                                                                              P-Value
                                                                                                                  0.0000
! Factor mean AT TIME 1 fixed=0 for identification
                                                                               Scaling Correction Factor
                                                                                                                  1.0387
  [Time1@0 Time2* Time3*];
                                                                                 for MLR
! Factor covariances all freely estimated
 Time1 Time2 Time3 WITH Time1* Time2* Time3*;
                                                                    RMSEA (Root Mean Square Error Of Approximation)
! Residual covariances estimated for same item across time
                                                                               Estimate
                                                                                                                   0.093
 v1T1 v1T2 v1T3 WITH v1T1* v1T2* v1T3*;
                                                                               90 Percent C.I.
                                                                                                                   0.079 0.106
 v2T1 v2T2 v2T3 WITH v2T1* v2T2* v2T3*;
                                                                               Probability RMSEA <= .05
                                                                                                                   0.000
 v3T1 v3T2 v3T3 WITH v3T1* v3T2* v3T3*;
                                                                    CFI/TLI
 v4T1 v4T2 v4T3 WITH v4T1* v4T2* v4T3*;
                                                                               CFI
                                                                                                                   0.904
 v5T1 v5T2 v5T3 WITH v5T1* v5T2* v5T3*;
                                                                               TIT
                                                                                                                   0.887
  v6T1 v6T2 v6T3 WITH v6T1* v6T2* v6T3*;
                                                                    Chi-Square Test of Model Fit for the Baseline Model
    20
                                                                               Value
                                                                                                                1896.788
                                                                               Degrees of Freedom
                                                                                                                     153
                                                                               P-Value
                                                                                                                  0.0000
    15
                                                                    SRMR (Standardized Root Mean Square Residual)
                                                                               Value
                                                                                                                   0.091
 tem Intercepts
    10
                                                   ■ Time 1
                                                                    Does the partial scalar model (3d) fit better than the partial scalar model
                                                   ■ Time 2
                                                                    (3c)? Yes, -2\Delta LL(df=1) = 8.73, p < .01
     5
                                                   ■ Time 3
                                                                    Does the partial scalar model (3d) fit worse than the partial metric model
                                                                    (2b)? No, -2\Delta LL(df=6) = 4.35, p = .63
     0
```

v1

v2

v3

3d UNSTANDARDIZED PARTIAL SCALAR MODEL RESULTS

| 3d UNSTAN | DARDIZED | PARTIAL SCALA | R MODEL R | | | 1 | | | | |
|--------------|---------------|---------------|-----------|-------------|------------|--------------|----------------------|------------|---------------------------|------------|
| | | | | | Two-Tailed | | | | | Two-Tailed |
| | | Estimate | S.E. | Est./S.E. | P-Value | | Estimate | S.E. | Est./S.E. | P-Value |
| TIME1 | BY | | | | | Means (FACTO | R MEAN AT TIME1 FIX | ED=0 FOR | IDENTIFICAT | ION) |
| V1T1 | | 3.231 | 0.262 | 12.330 | 0.000 | TIME1 | 0.000 | 0.000 | 999.000 | 999.000 |
| V2T1 | | 1.953 | 0.201 | 9.739 | 0.000 | TIME2 | 0.293 | 0.081 | 3.625 | 0.000 |
| V3T1 | | 1.974 | 0.198 | 9.989 | 0.000 | TIME3 | 0.521 | 0.093 | 5.612 | 0.000 |
| V4T1 | | 1.904 | 0.220 | 8.656 | 0.000 | | | | | |
| V5T1 | | 0.983 | 0.138 | 7.097 | 0.000 | Intercepts | | | | |
| V6T1 | | 1.477 | 0.130 | 11.353 | 0.000 | V1T1 | 16.090 | 0.274 | 58.684 | 0.000 |
| | | | | | | V1T2 | 16.425 | 0.281 | 58.364 | 0.000 |
| TIME2 | BY | | | | | V1T3 | 16.425 | 0.281 | 58.364 | 0.000 |
| V1T2 | 21 | 2.629 | 0.232 | 11.317 | 0.000 | V2T1 | 8.674 | 0.294 | 29.540 | 0.000 |
| V2T2 | | 1.953 | 0.201 | 9.739 | 0.000 | V2T2 | 9.413 | 0.261 | 36.036 | 0.000 |
| V3T2 | | 1.974 | 0.198 | 9.989 | 0.000 | V2T3 | 9.413 | 0.261 | 36.036 | 0.000 |
| V4T2 | | 1.904 | 0.220 | 8.656 | 0.000 | V213 V3T1 | 11.950 | 0.225 | 53.099 | 0.000 |
| V5T2 | | 0.983 | 0.138 | 7.097 | 0.000 | V3T2 | 11.950 | 0.225 | 53.099 | 0.000 |
| V6T2 | | 1.477 | 0.130 | 11.353 | 0.000 | V3T2 | 11.950 | 0.225 | 53.099 | 0.000 |
| V 012 | | 1.1/ | 0.130 | 11.555 | 0.000 | V4T1 | -3.024 | 0.267 | -11.334 | 0.000 |
| TIME3 | BY | | | | | V4T2 | -3.744 | 0.299 | -12.535 | 0.000 |
| V1T3 | DI | 2.629 | 0.232 | 11.317 | 0.000 | V412 V4T3 | -3.744 | 0.299 | -12.535 | 0.000 |
| V113 V2T3 | | 1.953 | 0.232 | 9.739 | 0.000 | V5T1 | -1.215 | 0.233 | -12.333 - 9.277 | 0.000 |
| V213 V3T3 | | 1.974 | 0.201 | 9.989 | 0.000 | V5T1 V5T2 | -1.213 -1.802 | 0.131 | -8.706 | 0.000 |
| V313 V4T3 | | 1.904 | 0.196 | 8.656 | 0.000 | V512 V5T3 | -1.802 | 0.207 | -8.706 | 0.000 |
| | | | | | | | | | | |
| V5T3 | | 0.983 | 0.138 | 7.097 | 0.000 | V6T1 | -2.854 | 0.161 | -17.688 | 0.000 |
| V6T3 | | 1.477 | 0.130 | 11.353 | 0.000 | V6T2 | -2.854 | 0.161 | -17.688 | 0.000 |
| m TMT 1 | T-7 T T T T T | | | | | V6T3 | -2.854 | 0.161 | -17.688 | 0.000 |
| TIME1 | WITH | 0 050 | 0 070 | 10 000 | 0 000 | D | THEN MADE A | NOD BUILDE | TO NOT THE | 77 CEOD \ |
| TIME2 | | 0.850 | 0.079 | 10.809 | 0.000 | | riances (ITEM VARIA) | | | |
| TIME3 | | 0.686 | 0.124 | 5.543 | 0.000 | V1T1 | 0.170 | 0.374 | 0.454 | 0.650 |
| | | | | | | V1T2 | 0.548 | 0.265 | 2.070 | 0.038 |
| TIME2 | WITH | | | | | V1T3 | 0.509 | 0.314 | 1.618 | 0.106 |
| TIME3 | | 0.706 | 0.128 | 5.519 | 0.000 | V2T1 | 8.702 | 1.026 | 8.483 | 0.000 |
| | | | | | | V2T2 | 5.895 | 0.605 | 9.746 | 0.000 |
| *** Resid | ual covar: | iances among | same item | across tim | e **** | V2T3 | 5.177 | 0.795 | 6.514 | 0.000 |
| | | | | | | V3T1 | 2.502 | 0.386 | 6.484 | 0.000 |
| | WITH | | | | | V3T2 | 2.178 | 0.352 | 6.183 | 0.000 |
| V1T2 | | -0.206 | 0.246 | -0.838 | 0.402 | V3T3 | 2.309 | 0.416 | 5.548 | 0.000 |
| V1T3 | | -0.010 | 0.233 | -0.043 | 0.966 | V4T1 | 7.172 | 1.021 | 7.021 | 0.000 |
| | | | | | | V4T2 | 6.759 | 0.967 | 6.990 | 0.000 |
| V1T2 | WITH | | | | | V4T3 | 6.613 | 1.128 | 5.860 | 0.000 |
| V1T3 | | 0.130 | 0.231 | 0.561 | 0.575 | V5T1 | 1.829 | 0.443 | 4.131 | 0.000 |
| | | | | | | V5T2 | 4.678 | 1.430 | 3.272 | 0.001 |
| | | | | | | V5T3 | 2.944 | 0.760 | 3.872 | 0.000 |
| Variances | (FACTOR V | VARIANCE AT T | IME1=1 FC | R IDENTIFIC | ATION) | V6T1 | 1.707 | 0.242 | 7.059 | 0.000 |
| TIME1 | | 1.000 | 0.000 | 999.000 | 999.000 | V6T2 | 1.090 | 0.165 | 6.599 | 0.000 |
| TIME2 | | 1.167 | 0.187 | 6.252 | 0.000 | V6T3 | 0.784 | 0.170 | 4.618 | 0.000 |
| TIME3 | | 0.947 | 0.156 | 6.054 | 0.000 | | | | | |
| | | | | | | | | | | |

Model 4a. Residual Variance Invariance Model (error variances held equal for all except non-invariant items)

| MODEL: ! Model 4a: Residual Variances | |
|--|--|
| ! except for non-invariant items | MODEL FIT INFORMATION |
| : except for non invariant fems | Number of Free Parameters 52 |
| ! Factor loadings NOW CONSTRAINED EQUAL ACROSS TIME EXCEPT v1T1 | Number of free ratameters 32 |
| | Tanii halibaad |
| Time1 BY v1T1* v2T1* v3T1* v4T1* v5T1* v6T1* (L1a L2-L6); | Loglikelihood |
| Time2 BY v1T2* v2T2* v3T2* v4T2* v5T2* v6T2* (L1-L6); | HO Value -4454.592 |
| Time3 BY v1T3* v2T3* v3T3* v4T3* v5T3* v6T3* (L1-16); | HO Scaling Correction Factor 1.5487 |
| ! Item intercepts NOW CONSTRAINED EQUAL ACROSS TIME, | for MLR |
| ! no v1T1 v5T1 v4T1 v2T1 | H1 Value -4284.045 |
| [v1T1*]; [v1T2* v1T3*] (I1); ! 3a: I1 applies only to 2 and 3 | H1 Scaling Correction Factor 1.2029 |
| [v2T1*]; [v2T2* v2T3*] (I2); ! 3d: I2 applies only to 2 and 3 | for MLR |
| [v3T1* v3T2* v3T3*] (I3); | |
| [v4T1*]; [v4T2* v4T3*] (I4); ! 3c: I4 applies only to 2 and 3 | Information Criteria |
| [v5T1*]; [v5T2* v5T3*] (I5); ! 3b: I5 applies only to 2 and 3 | Akaike (AIC) 9013.185 |
| [v6T1* v6T2* v6T3*] (I6); | Bayesian (BIC) 9170.083 |
| ! Residual variances NOW CONSTRAINED EQUAL ACROSS TIME | Sample-Size Adjusted BIC 9005.509 |
| (WHEN POSSIBLE) | $(n^* = (n + 2) / 24)$ |
| v1T1*; v1T2* v1T3* (E1); !4a: E1 applies only to 2 and 3 | |
| v2T1*; v2T2* v2T3* (E2); !4a: E2 applies only to 2 and 3 | Chi-Square Test of Model Fit |
| v3T1* v3T2* v3T3* (E3); | Value 318.280* |
| v4T1*; v4T2* v4T3* (E4); !4a: E4 applies only to 2 and 3 | Degrees of Freedom 137 |
| v5T1*; v5T2* v5T3* (E5); !4a: E5 applies only to 2 and 3 | P-Value 0.0000 |
| v6T1* v6T2* v6T3* (E6); | Scaling Correction Factor 1.0717 |
| ! Factor variance AT TIME 1 fixed=1 for identification | for MLR |
| Time1@1 Time2* Time3*; | TOT MILK |
| ! Factor mean AT TIME 1 fixed=0 for identification | RMSEA (Root Mean Square Error Of Approximation) |
| [Time1@0 Time2* Time3*]; | Estimate 0.094 |
| ! Factor covariances all freely estimated | |
| ! Factor covariances all freely estimated Time1 Time2 Time3 WITH Time1* Time2* Time3*; | 90 Percent C.I. 0.080 0.107 |
| • | Probability RMSEA <= .05 0.000 |
| ! Residual covariances estimated for same item across time | CRT /RT T |
| v1T1 v1T2 v1T3 WITH v1T1* v1T2* v1T3*; | CFI/TLI |
| v2T1 v2T2 v2T3 WITH v2T1* v2T2* v2T3*; | CFI 0.896 |
| v3T1 v3T2 v3T3 WITH v3T1* v3T2* v3T3*; | TLI 0.884 |
| v4T1 v4T2 v4T3 WITH v4T1* v4T2* v4T3*; | |
| v5T1 v5T2 v5T3 WITH v5T1* v5T2* v5T3*; | SRMR (Standardized Root Mean Square Residual) |
| v6T1 v6T2 v6T3 WITH v6T1* v6T2* v6T3*; | Value 0.095 |
| | |
| | MODEL MODIFICATION INDICES (relevant for invariance testing) |
| Does the full residual model (4a) fit worse than the partial scalar model | Means/Intercepts/Thresholds |
| (3d)? Yes, $-2\Delta LL(df=8) = 24.72$, $p < .01$ | |
| (34): 165, $2\Delta LL(GI=0) = 24.72, p < .01$ | M.I. E.P.C. Std E.P.C. StdYX E.P.C. |
| | Variances/Residual Variances |
| | |
| | V5T2 12.739 0.755 0.755 0.153 |
| Modification indices suggest freeing v5 across Time2 and Time3, so let's | V5T3 12.740 -1.125 -1.125 -0.238 |
| try that next. | V6T1 13.740 0.421 0.421 0.124 |
| try that home | V6T3 7.815 -0.393 -0.393 -0.124 |
| | |

Model 4b. Partial Residual Variance Invariance Model (error variances held equal for all except non-invariant items and v5T2/T3)

| Model 4b. Partial Residual Variance Invariance Model (error variance | s held equal for all except non-invariant items and v5T2/T3) |
|--|--|
| MODEL: ! Model 4b: Residual Variances | |
| ! except for non-invariant items, v5T2-v5T3 | MODEL FIT INFORMATION |
| | Number of Free Parameters 53 |
| ! Factor loadings NOW CONSTRAINED EQUAL ACROSS TIME EXCEPT v1T1 | |
| Time1 BY v1T1* v2T1* v3T1* v4T1* v5T1* v6T1* (L1a L2-L6); | Loglikelihood |
| Time2 BY v1T2* v2T2* v3T2* v4T2* v5T2* v6T2* (L1-L6); | HO Value -4447.259 |
| Time3 BY v1T3* v2T3* v3T3* v4T3* v5T3* v6T3* (L1-16); | HO Scaling Correction Factor 1.5823 |
| ! Item intercepts NOW CONSTRAINED EQUAL ACROSS TIME, | for MLR |
| ! no v1T1 v5T1 v4T1 v2T1 | H1 Value -4284.045 |
| [v1T1*]; [v1T2* v1T3*] (I1); ! 3a: I1 applies only to 2 and 3 | H1 Scaling Correction Factor 1.2029 |
| [v2T1*]; [v2T2* v2T3*] (I2); ! 3d: I2 applies only to 2 and 3 | for MLR |
| [v3T1* v3T2* v3T3*] (I3); | |
| [v4T1*]; [v4T2* v4T3*] (I4); ! 3c: I4 applies only to 2 and 3 | Information Criteria |
| [v5T1*]; [v5T2* v5T3*] (I5); ! 3b: I5 applies only to 2 and 3 | Akaike (AIC) 9000.518 |
| [v6T1* v6T2* v6T3*] (I6); | Bayesian (BIC) 9160.434 |
| ! Residual variances NOW CONSTRAINED EQUAL ACROSS TIME | Sample-Size Adjusted BIC 8992.694 |
| (WHEN POSSIBLE) except v5T2-v5T3 | $(n^* = (n + 2) / 24)$ |
| v1T1*; v1T2* v1T3* (E1); !4a: E1 applies only to 2 and 3 | (11" - (11 + 2) / 24) |
| v2T1*; v2T2* v2T3* (E1); !4a: E1 applies only to 2 and 3 | Chi Canara Hast of Madal Fit |
| v3T1* v3T2* v3T3* (E3); | Chi-Square Test of Model Fit Value 309.384* |
| v4T1*; v4T2* v4T3* (E4); !4a: E4 applies only to 2 and 3 | Degrees of Freedom 136 |
| | |
| v5T1*; v5T2*; v5T3*; !4b: 2 and 3 now also separate | P-Value 0.0000 |
| v6T1* v6T2* v6T3* (E6); | Scaling Correction Factor 1.0551 |
| ! Factor variance AT TIME 1 fixed=1 for identification | for MLR |
| Time1@1 Time2* Time3*; | DMCF3 (Park Mars Course Fours Of Assessingly) |
| ! Factor mean AT TIME 1 fixed=0 for identification | RMSEA (Root Mean Square Error Of Approximation) |
| [Time1@0 Time2* Time3*]; | Estimate 0.092 |
| ! Factor covariances all freely estimated | 90 Percent C.I. 0.078 0.105 |
| Time1 Time2 Time3 WITH Time1* Time2* Time3*; | Probability RMSEA <= .05 0.000 |
| ! Residual covariances estimated for same item across time | CDT /FT T |
| v1T1 v1T2 v1T3 WITH v1T1* v1T2* v1T3*; | CFI/TLI |
| v2T1 v2T2 v2T3 WITH v2T1* v2T2* v2T3*; | CFI 0.901 |
| v3T1 v3T2 v3T3 WITH v3T1* v3T2* v3T3*; | TLI 0.888 |
| v4T1 v4T2 v4T3 WITH v4T1* v4T2* v4T3*; | |
| v5T1 v5T2 v5T3 WITH v5T1* v5T2* v5T3*; | SRMR (Standardized Root Mean Square Residual) |
| v6T1 v6T2 v6T3 WITH v6T1* v6T2* v6T3*; | Value 0.093 |
| | |
| Does the partial residual model (4b) fit better than the full residual model | MODEL MODIFICATION INDICES (relevant for invariance testing) |
| (4a)? Yes, $-2\Delta LL(df=1) = 10.06$, $p < .01$ | Means/Intercepts/Thresholds |
| | |
| Does the partial residual model (4b) fit worse than the partial scalar model | M.I. E.P.C. Std E.P.C. StdYX E.P.C. |
| | Variances/Residual Variances |
| (3d)? Eh, $-2\Delta LL(df=7) = 14.14$, $p = .05$ | |
| | V6T1 13.772 0.419 0.419 0.125 |
| | V6T3 7.149 -0.373 -0.373 -0.118 |
| Modification indices suggest freeing v6 from Time1, so let's try that next. | |
| | |
| | |
| | |

Model 4c. Partial Residual Variance Invariance Model (error variances held equal for all except non-invariant items, v5T2/T3, v6T1)

```
MODEL: ! Model 4c: Residual Variances
       ! except for non-invariant items, v5T2-v5T3, v6T1
! Factor loadings NOW CONSTRAINED EQUAL ACROSS TIME EXCEPT v1T1
 Time1 BY v1T1* v2T1* v3T1* v4T1* v5T1* v6T1* (L1a L2-L6);
 Time2 BY v1T2* v2T2* v3T2* v4T2* v5T2* v6T2* (L1-L6);
 Time3 BY v1T3* v2T3* v3T3* v4T3* v5T3* v6T3* (L1-16);
! Item intercepts NOW CONSTRAINED EQUAL ACROSS TIME,
! no v1T1 v5T1 v4T1 v2T1
  [v1T1*]; [v1T2* v1T3*] (I1); ! 3a: I1 applies only to 2 and 3
  [v2T1*]; [v2T2* v2T3*] (I2); ! 3d: I2 applies only to 2 and 3
           v3T2* v3T3*] (I3);
  [v3T1*
  [v4T1*]; [v4T2* v4T3*] (I4); ! 3c: I4 applies only to 2 and 3
  [v5T1*]; [v5T2* v5T3*] (I5); ! 3b: I5 applies only to 2 and 3
  [v6T1*
           v6T2* v6T3*] (I6);
! Residual variances NOW CONSTRAINED EQUAL ACROSS TIME
  (WHEN POSSIBLE) except v5T2-v5T3, v6T1
 v1T1*; v1T2* v1T3* (E1); !4a: E1 applies only to 2 and 3
 v2T1*; v2T2* v2T3* (E2); !4a: E2 applies only to 2 and 3
 v3T1* v3T2* v3T3* (E3);
 v4T1*; v4T2* v4T3* (E4); !4a: E4 applies only to 2 and 3
 v5T1*; v5T2*; v5T3*;
                            !4b: 2 and 3 now also separate
 v6T1*; v6T2* v6T3* (E6); !4c: E6 applies only to 2 and 3
! Factor variance AT TIME 1 fixed=1 for identification
 Time1@1 Time2* Time3*;
! Factor mean AT TIME 1 fixed=0 for identification
  [Time1@0 Time2* Time3*];
! Factor covariances all freely estimated
 Time1 Time2 Time3 WITH Time1* Time2* Time3*;
! Residual covariances estimated for same item across time
 v1T1 v1T2 v1T3 WITH v1T1* v1T2* v1T3*;
 v2T1 v2T2 v2T3 WITH v2T1* v2T2* v2T3*;
 v3T1 v3T2 v3T3 WITH v3T1* v3T2* v3T3*;
 v4T1 v4T2 v4T3 WITH v4T1* v4T2* v4T3*;
 v5T1 v5T2 v5T3 WITH v5T1* v5T2* v5T3*;
 v6T1 v6T2 v6T3 WITH v6T1* v6T2* v6T3*;
                                     ■ Time 1
 E 4
                                     ■ Time 2
                                     ■ Time 3
  3
           v2
```

| - | INFORMATION Free Parameters | 54 | |
|-----------|--|--------------------------------------|-------|
| Loglikeli | hood HO Value HO Scaling Correction Factor for MLR H1 Value H1 Scaling Correction Factor for MLR | -4284.045 | |
| Informati | on Criteria Akaike (AIC) Bayesian (BIC) Sample-Size Adjusted BIC (n* = (n + 2) / 24) | 8987.942 9150.876 8979.971 | |
| Chi-Squar | Test of Model Fit Value Degrees of Freedom P-Value Scaling Correction Factor for MLR | 296.084* 135 0.0000 1.0533 | |
| RMSEA (Ro | oot Mean Square Error Of Approx Estimate 90 Percent C.I. Probability RMSEA <= .05 | ximation) 0.089 0.075 0.000 | 0.103 |
| CFI/TLI | CFI TLI | 0.908 0.895 | |
| SRMR (Sta | andardized Root Mean Square Re Value | sidual) 0.092 | |

Does the partial residual model (4c) fit *better* than the partial residual model (4b)? Yes, $-2\Delta LL(df=1) = 11.20$, p < .01

Does the partial residual model (4c) fit worse than the partial scalar model (3d)? No, $-2\Delta LL(df=6) = 3.38$, p = .76

No invariance-related modification indices remain, so we are done! The residual variances at the end of Model 4c are shown on the left. Next is structural invariance.

4c UNSTANDARDIZED FINAL MEASUREMENT INVARIANCE SOLUTION

| 4c UNSTANDARDIZ | | | | Two-Tailed | | | | 7 | wo-Tailed |
|---------------------------------------|------------------|-----------|-------------|------------|---------------|-------------------|----------------|-------------|-----------|
| | Estimate | S.E. | Est./S.E. | P-Value | | Estimate | S.E. | Est./S.E. | P-Value |
| | | | | | | | | | |
| TIME1 BY | | | | | Means (FACTOR | MEAN AT TIME1 FIX | | | |
| V1T1 | 3.214 | 0.259 | 12.409 | 0.000 | TIME1 | 0.000 | 0.000 | 999.000 | 999.000 |
| V2T1 | 1.945 | 0.200 | 9.735 | 0.000 | TIME2 | 0.295 | 0.081 | 3.654 | 0.000 |
| V3T1 | 1.983 | 0.196 | 10.094 | 0.000 | TIME3 | 0.520 | 0.092 | 5.668 | 0.000 |
| V4T1 | 1.913 | 0.219 | 8.741 | 0.000 | | | | | |
| V5T1 | 0.987 | 0.138 | 7.154 | 0.000 | Intercepts - | V3 AND V6 ARE HOL | DING THIS | TOGETHER WI | TH TIME1 |
| V6T1 | 1.470 | 0.123 | 11.975 | 0.000 | V1T1 | 16.089 | 0.275 | 58.597 | 0.000 |
| | | | | | V1T2 | 16.418 | 0.283 | 58.056 | 0.000 |
| TIME2 BY | | | | | V1T3 | 16.418 | 0.283 | 58.056 | 0.000 |
| V1T2 | 2.644 | 0.230 | 11.473 | 0.000 | V2T1 | 8.675 | 0.294 | 29.523 | 0.000 |
| V2T2 | 1.945 | 0.200 | 9.735 | 0.000 | V2T2 | 9.416 | 0.262 | 35.991 | 0.000 |
| V3T2 | 1.983 | 0.196 | 10.094 | 0.000 | V2T3 | 9.416 | 0.262 | 35.991 | 0.000 |
| V4T2 | 1.913 | 0.219 | 8.741 | 0.000 | V3T1 | 11.950 | 0.225 | 53.170 | 0.000 |
| V5T2 | 0.987 | 0.138 | 7.154 | 0.000 | V3T2 | 11.950 | 0.225 | 53.170 | 0.000 |
| V6T2 | 1.470 | 0.123 | 11.975 | 0.000 | V3T3 | 11.950 | 0.225 | 53.170 | 0.000 |
| | | | | | V4T1 | -3.024 | 0.266 | -11.352 | 0.000 |
| TIME3 BY | | | | | V4T2 | -3.750 | 0.298 | -12.565 | 0.000 |
| V1T3 | 2.644 | 0.230 | 11.473 | 0.000 | V4T3 | -3.750 | 0.298 | -12.565 | 0.000 |
| V2T3 | 1.945 | 0.200 | 9.735 | 0.000 | V5T1 | -1.213 | 0.131 | -9.275 | 0.000 |
| V3T3 | 1.983 | 0.196 | 10.094 | 0.000 | V5T2 | -1.803 | 0.207 | -8.720 | 0.000 |
| V4T3 | 1.913 | 0.219 | 8.741 | 0.000 | V5T3 | -1.803 | 0.207 | -8.720 | 0.000 |
| V5T3 | 0.987 | 0.138 | 7.154 | 0.000 | V6T1 | -2.851 | 0.160 | -17.815 | 0.000 |
| V6T3 | 1.470 | 0.123 | 11.975 | 0.000 | V6T2 | -2.851 | 0.160 | -17.815 | 0.000 |
| V 0 1 3 | 1.170 | 0.123 | 11.575 | 0.000 | V6T3 | -2.851 | 0.160 | -17.815 | 0.000 |
| TIME1 WITH | | | | | V 013 | 2.001 | 0.100 | 17.013 | 0.000 |
| TIME2 | 0.843 | 0.078 | 10.745 | 0.000 | Residual Vari | ances - ITEM VARI | ANCE THAT | TS NOT THE | FACTOR |
| TIME3 | 0.683 | 0.124 | 5.505 | 0.000 | V1T1 | 0.285 | 0.342 | 0.831 | 0.406 |
| 1111115 | 0.003 | 0.124 | 3.303 | 0.000 | V1T2 | 0.539 | 0.233 | 2.316 | 0.021 |
| TIME2 WITH | | | | | V1T3 | 0.539 | 0.233 | 2.316 | 0.021 |
| TIME3 | 0.692 | 0.126 | 5.489 | 0.000 | V2T1 | 8.562 | 1.004 | 8.526 | 0.000 |
| 1111113 | 0.092 | 0.120 | 3.409 | 0.000 | V2T1 V2T2 | 5.592 | 0.502 | 11.132 | 0.000 |
| *** Posidual so | variances among | itom | +im | . ++++ | V2T3 | 5.592 | 0.502 | 11.132 | 0.000 |
| ~~~ Residual Co | variances among | Same Item | across time | 3 ^^^^ | V213 V3T1 | 2.312 | 0.302 | 8.534 | 0.000 |
| V1T1 WITH | | | | | V3T2 | 2.312 | | 8.534 | 0.000 |
| V1T2 | -0.165 | 0.230 | -0.716 | 0.474 | V312 V3T3 | 2.312 | 0.271 0.271 | 8.534 | 0.000 |
| V1T2 V1T3 | 0.014 | 0.230 | 0.066 | 0.474 | V4T1 | 7.139 | 1.043 | 6.842 | 0.000 |
| V1.1.2 | 0.014 | 0.212 | 0.006 | 0.948 | | | | | |
| 771 m O 777 m 77 | | | | | V4T2 | 6.686 | 0.870 | 7.684 | 0.000 |
| V1T2 WITH | 0 150 | 0 000 | 0 667 | 0 505 | V4T3 | 6.686 | 0.870 | 7.684 | 0.000 |
| V1T3 | 0.153 | 0.230 | 0.667 | 0.505 | V5T1 | 1.829 | 0.448 | 4.078 | 0.000 |
| | | | | | V5T2 | 4.705 | 1.455 | 3.233 | 0.001 |
| | | | | | V5T3 | 2.908 | 0.749 | 3.881 | 0.000 |
| · · · · · · · · · · · · · · · · · · · | OR VARIANCE AT T | | | • | V6T1 | 1.664 | 0.233 | 7.138 | 0.000 |
| TIME1 | 1.000 | 0.000 | 999.000 | 999.000 | V6T2 | 0.957 | 0.136 | 7.039 | 0.000 |
| TIME2 | 1.159 | 0.186 | 6.231 | 0.000 | V6T3 | 0.957 | 0.136 | 7.039 | 0.000 |
| TIME3 | 0.934 | 0.151 | 6.171 | 0.000 | i | | | | |

STRUCTURAL INVARIANCE TESTS

Model 5a. Factor Variance Invariance Model

Model 6a. Factor Covariance Invariance Model

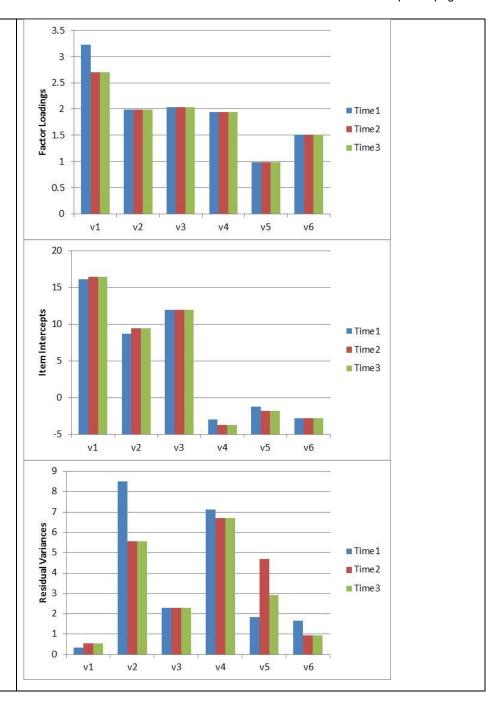
| | Factor Varia | | | • | MODEL: Model 6a: Factor Covariance Invariance | | | | | |
|---|---------------|-------------|-------------|--------------|---|--------------------------------------|-------------|----------------|---|--|
| MODEL: ! Model 5a: | | | | | MODEL: ! Model 6a: Factor Covariance Invariance (rest of code before and after is same as 5a) | | | | | |
| (rest of code befor | re and after | is same as | 4C) | | | | | | | |
| ! Model 5a: Factor Time1@1 Time2@1 | | ariance (al | ll fixed t | o 1 now) | | Factor Covaria Time3 WITH Time | | • | - · · · · · · · · · · · · · · · · · · · | |
| MODEL FIT INFORMATI | ON | | | | MODEL FIT INFORMATION | | | | | |
| Number of Free Para | meters | | 52 | | Number of Fr | ee Parameters | | 5 | 0 | |
| Loglikelihood | | | | | Loglikelihoo | d | | | | |
| HO Value | | - | -4441.238 | | - | Value | | -4443.65 | 4 | |
| H0 Scalin | ng Correction | Factor | 1.5848 | | H0 | Scaling Correc | ction Facto | r 1.564 | 9 | |
| for MLR | - | | | | | for MLR | | | | |
| H1 Value | | - | -4284.045 | | Н1 | Value | | -4284.04 | 5 | |
| H1 Scalin | ng Correction | Factor | 1.2029 | | Н1 | Scaling Correct | ction Facto | r 1.202 | 9 | |
| for MLR | - | | | | | for MLR | | | | |
| Information Criteri | .a | | | | Information | Criteria | | | | |
| Akaike (A | AIC) | | 8986.475 | | Ak | aike (AIC) | | 8987.30 | 8 | |
| Bayesian | (BIC) | | 9143.374 | | | yesian (BIC) | | 9138.17 | | |
| Sample-Si | ze Adjusted | BIC | 8978.799 | | | mple-Size Adju | | 8979.92 | .7 | |
| $(n^* = ($ | (n + 2) / 24) | | | | | (n* = (n + 2)) | | | | |
| Chi-Square Test of | Model Fit | | | | Chi-Square T | est of Model F: | it | | | |
| Value | | | 297.152* | | Va | lue | | 297.56 | 8* | |
| Degrees c | of Freedom | | 137 | | De | grees of Freed | om | 13 | 9 | |
| P-Value | | | 0.0000 | | | Value | | 0.000 | 0 | |
| Scaling C for MLR | Correction Fa | ctor | 1.0580 | | | aling Correction | on Factor | 1.072 | 8 | |
| RMSEA (Root Mean Sq | uare Error O | f Approxima | ation) | | RMSEA (Root | Mean Square Er: | ror Of Appr | oximation) | | |
| Estimate | | 11 | 0.088 | | | timate | | 0.08 | 7 | |
| 90 Percen | nt C.I. | | 0.074 | 0.102 | 90 | Percent C.I. | | 0.07 | 3 0.101 | |
| | ty RMSEA <= | .05 | 0.000 | | | obability RMSE | A <= .05 | | | |
| CFI/TLI | - 2 | | | | CFI/TLI | | | | | |
| CFI | | | 0.908 | | CF | I | | 0.90 | 9 | |
| TLI | | | 0.897 | | TL | | | 0.90 | | |
| SRMR (Standardized | Root Mean So | uare Residu | | | | - rdized Root Mea | an Square R | | | |
| Value | | | 0.100 | | • | lue | | 0.10 | 0 | |
| Does the factor variar model (4c)? No, -2ΔL | | | an the part | ial residual | | or covariance mo o, -2ΔLL(df=2) = | | vorse than the | e factor variance | |
| Factor Covariances. | | | | | | IANCES FROM MOI | - | | · | |
| TIME1 WITH | | | | | | IME2 0.724 | | | 0.000 | |
| TIME2 | 0.778 | 0.042 | 18.375 | 0.000 | | IME3 0.724 | | | 0.000 | |
| TIME3 | 0.713 | 0.087 | 8.214 | 0.000 | TIME2 WITH T | | | | 0.000 | |
| TIME2 WITH | | | | | | FROM MODEL 6a | • | | • | |
| TIME3 | 0.662 | 0.095 | 6.929 | 0.000 | TIME1 | 0.000 | 0.000 | 999.000 | 999.000 | |
| 1 | | | | | TIME2 | 0.284 | | | 0.000 | |
| | | | | | TIME3 | 0.520 | 0.091 | 5.700 | 0.000 | |

Model 7a. Factor Mean Invariance Model

```
MODEL: ! Model 7a: Factor Mean Invariance
       ! Testing Diff between Time2 and Time3
! Factor loadings NOW CONSTRAINED EQUAL ACROSS TIME EXCEPT v1T1
 Time1 BY v1T1* v2T1* v3T1* v4T1* v5T1* v6T1* (L1a L2-L6);
 Time2 BY v1T2* v2T2* v3T2* v4T2* v5T2* v6T2* (L1-L6);
 Time3 BY v1T3* v2T3* v3T3* v4T3* v5T3* v6T3* (L1-16);
! Item intercepts NOW CONSTRAINED EQUAL ACROSS TIME,
! no v1T1 v5T1 v4T1
  [v1T1*]; [v1T2* v1T3*] (I1); ! 3a: I1 applies only to 2 and 3
  [v2T1*]; [v2T2* v2T3*] (I2); ! 3d: I2 applies only to 2 and 3
           v3T2* v3T3*] (I3);
  [v3T1*
  [v4T1*]; [v4T2* v4T3*] (I4); ! 3c: I4 applies only to 2 and 3
  [v5T1*]; [v5T2* v5T3*] (I5); ! 3b: I5 applies only to 2 and 3
  [v6T1*
           v6T2* v6T3*] (I6);
! Residual variances NOW CONSTRAINED EQUAL ACROSS TIME
  (WHEN POSSIBLE) except v5T2-v5T3, v6T1
 v1T1*; v1T2* v1T3* (E1); !4a: E1 applies only to 2 and 3
 v2T1*; v2T2* v2T3* (E2); !4a: E2 applies only to 2 and 3
 v3T1* v3T2* v3T3* (E3);
 v4T1*; v4T2* v4T3* (E4); !4a: E4 applies only to 2 and 3
 v5T1*; v5T2*; v5T3*;
                           !4b: 2 and 3 now also separate
 v6T1*; v6T2* v6T3* (E6); !4c: E6 applies only to 2 and 3
! Factor variance fixed=1 for structural invariance
 Time1@1 Time2@1 Time3@1;
! Testing factor mean difference between Time2 and Time3
  [Time1@0]; [Time2* Time3*] (Fmean); ! NEW CONSTRAINT
! Factor covariances held equal for structural invariance
 Time1 Time2 Time3 WITH Time1* Time2* Time3* (Fcov);
! Residual covariances estimated for same item across time
 v1T1 v1T2 v1T3 WITH v1T1* v1T2* v1T3*;
 v2T1 v2T2 v2T3 WITH v2T1* v2T2* v2T3*;
 v3T1 v3T2 v3T3 WITH v3T1* v3T2* v3T3*;
 v4T1 v4T2 v4T3 WITH v4T1* v4T2* v4T3*;
 v5T1 v5T2 v5T3 WITH v5T1* v5T2* v5T3*;
 v6T1 v6T2 v6T3 WITH v6T1* v6T2* v6T3*;
```

Does the factor mean model (7a) fit worse than the factor covariance model (6a)? Yes, $-2\Delta LL(df=1) = 11.15$, p < .01, so we keep Model 6a instead.

```
MODEL FIT INFORMATION
Number of Free Parameters
Loglikelihood
          HO Value
                                          -4448.472
          HO Scaling Correction Factor
                                             1.5792
            for MLR
Means
    TIME1
                       0.000
                                   0.000
                                            999.000
                                                        999,000
    TIME2
                       0.378
                                   0.075
                                              5.014
                                                          0.000
                                                          0.000
    TIME3
                       0.378
                                   0.075
                                               5.014
```



6a UNSTANDARDIZED FINAL STRUCTURAL INVARIANCE SOLUTION

| OA UNSIA | NDANDIZED | FINAL STRUCTU | KALI INVAL | TANCE SOLOI | Two-Tailed | | | | | Two-Tailed |
|---|-----------|---------------|------------|-------------|------------|---|-------------------|-----------|-------------|------------|
| | | Estimate | S.E. | Est./S.E. | P-Value | | Estimate | S.E. | Est./S.E. | P-Value |
| | | | | | | | | | | |
| TIME1 | BY | | | | | Means (FACTOR | MEAN AT TIME1 FIX | ED=0 FOR | IDENTIFICAT | ION) |
| V1T1 | | 3.229 | 0.243 | 13.272 | 0.000 | TIME1 | 0.000 | 0.000 | 999.000 | 999.000 |
| V2T1 | | 1.993 | 0.170 | 11.754 | 0.000 | TIME2 | 0.284 | 0.079 | 3.605 | 0.000 |
| V3T1 | | 2.029 | 0.169 | 12.022 | 0.000 | TIME3 | 0.520 | 0.091 | 5.700 | 0.000 |
| V4T1 | | 1.939 | 0.214 | 9.077 | 0.000 | | | | | |
| V5T1 | | 0.986 | 0.147 | 6.701 | 0.000 | Intercepts - | V3 AND V6 ARE HOL | DING THIS | TOGETHER W | ITH TIME1 |
| V6T1 | | 1.508 | 0.109 | 13.821 | 0.000 | V1T1 | 16.099 | 0.271 | 59.420 | 0.000 |
| | | | | | | V1T2 | 16.428 | 0.281 | 58.488 | 0.000 |
| TIME2 | BY | | | | | V1T3 | 16.428 | 0.281 | 58.488 | 0.000 |
| V1T2 | | 2.704 | 0.232 | 11.677 | 0.000 | V2T1 | 8.681 | 0.292 | 29.694 | 0.000 |
| V2T2 | | 1.993 | 0.170 | 11.754 | 0.000 | V2T2 | 9.423 | 0.259 | 36.368 | 0.000 |
| V3T2 | | 2.029 | 0.169 | 12.022 | 0.000 | V2T3 | 9.423 | 0.259 | 36.368 | 0.000 |
| V4T2 | | 1.939 | 0.214 | 9.077 | 0.000 | V3T1 | 11.956 | 0.223 | 53.706 | 0.000 |
| V5T2 | | 0.986 | 0.147 | 6.701 | 0.000 | V3T2 | 11.956 | 0.223 | 53.706 | 0.000 |
| V6T2 | | 1.508 | 0.109 | 13.821 | 0.000 | V3T3 | 11.956 | 0.223 | 53.706 | 0.000 |
| | | | | | | V4T1 | -3.018 | 0.263 | -11.463 | 0.000 |
| TIME3 | BY | | | | | V4T2 | -3.737 | 0.292 | -12.784 | 0.000 |
| V1T3 | | 2.704 | 0.232 | 11.677 | 0.000 | V4T3 | -3.737 | 0.292 | -12.784 | 0.000 |
| V2T3 | | 1.993 | 0.170 | 11.754 | 0.000 | V5T1 | -1.210 | 0.131 | -9.269 | 0.000 |
| V3T3 | | 2.029 | 0.169 | 12.022 | 0.000 | V5T2 | -1.791 | 0.203 | -8.807 | 0.000 |
| V4T3 | | 1.939 | 0.214 | 9.077 | 0.000 | V5T3 | -1.791 | 0.203 | -8.807 | 0.000 |
| V5T3 | | 0.986 | 0.147 | 6.701 | 0.000 | V6T1 | -2.847 | 0.159 | -17.889 | 0.000 |
| V6T3 | | 1.508 | 0.109 | 13.821 | 0.000 | V6T2 | -2.847 | 0.159 | -17.889 | 0.000 |
| | | | | | | V6T3 | -2.847 | 0.159 | -17.889 | 0.000 |
| TIME1 | WITH | | | | | | | | | |
| TIME2 | | 0.724 | 0.053 | 13.748 | 0.000 | Residual Variances - ITEM VARIANCE THAT IS NOT THE FACTOR | | | | |
| TIME | 3 | 0.724 | 0.053 | 13.748 | 0.000 | V1T1 | 0.351 | 0.331 | 1.060 | 0.289 |
| | | | | | | V1T2 | 0.562 | 0.231 | 2.432 | 0.015 |
| TIME2 | WITH | | | | | V1T3 | 0.562 | 0.231 | 2.432 | 0.015 |
| TIME | 3 | 0.724 | 0.053 | 13.748 | 0.000 | V2T1 | 8.506 | 0.999 | 8.511 | 0.000 |
| | | | | | | V2T2 | 5.563 | 0.494 | 11.261 | 0.000 |
| *** Residual covariances among same item across time **** | | | | | | V2T3 | 5.563 | 0.494 | 11.261 | 0.000 |
| | | | | | | V3T1 | 2.288 | 0.269 | 8.507 | 0.000 |
| V1T1 | WITH | | | | | V3T2 | 2.288 | 0.269 | 8.507 | 0.000 |
| V1T2 | | -0.106 | 0.225 | -0.471 | 0.638 | V3T3 | 2.288 | 0.269 | 8.507 | 0.000 |
| V1T3 | | 0.038 | 0.215 | 0.175 | 0.861 | V4T1 | 7.134 | 1.041 | 6.853 | 0.000 |
| | | | | | | V4T2 | 6.694 | 0.873 | 7.666 | 0.000 |
| V1T2 | WITH | | | | | V4T3 | 6.694 | 0.873 | 7.666 | 0.000 |
| V1T3 | | 0.130 | 0.243 | 0.534 | | V5T1 | 1.825 | 0.446 | 4.092 | 0.000 |
| 0.593 | | | | | | V5T2 | 4.705 | 1.454 | 3.235 | 0.001 |
| | | | | | | V5T3 | 2.921 | 0.752 | 3.887 | 0.000 |
| | • | VARIANCES CON | | | | V6T1 | 1.656 | 0.235 | 7.054 | 0.000 |
| TIME | | 1.000 | 0.000 | 999.000 | 999.000 | V6T2 | 0.942 | 0.131 | 7.188 | 0.000 |
| TIME | | 1.000 | 0.000 | 999.000 | 999.000 | V6T3 | 0.942 | 0.131 | 7.188 | 0.000 |
| TIME | 3 | 1.000 | 0.000 | 999.000 | 999.000 | | | | | |

Example results section for these analyses:

The extent to which a confirmatory factor model measuring social functioning (with six observed indicators) exhibited measurement invariance and structural invariance over time (i.e., across three occasions taken at six-month intervals) was examined using Mplus v. 8.4 (Muthén & Muthén, 1998–2017). Robust maximum likelihood (MLR) estimation was used for all analyses; accordingly, nested model comparisons were conducted using the rescaled difference in the model –2LL values as a function of the difference in model degrees of freedom. A configural invariance model was initially specified in which three correlated factors (i.e., the factor at the three occasions) were estimated simultaneously; all factor means were fixed to 0 and all factor variances were fixed to 1 for identification. Residual covariances between the same indicators across occasions were estimated as well. As shown in Table 1, although the configural invariance model had marginal fit, theoretically reasonable attempts to improve the fit were unsuccessful. Thus, the analysis proceeded by applying parameter constraints in successive models to examine potential decreases in fit resulting from measurement or structural non-invariance over the three occasions.

Equality of the unstandardized indicator factor loadings across occasions was then examined in a metric invariance model. The factor variance was fixed to 1 at time 1 but was freely estimated at times 2 and 3. All factor loadings were constrained equal across time; all intercepts and residual variances were still permitted to vary across time. Factor covariances and residual covariances were estimated as described previously. The metric invariance model fit significantly worse than the configural invariance model $-2\Delta LL(10) = 19.14$, p = .04. The modification indices suggested that the loading of indicator 1 at time 1 was a source of misfit and should be freed. After doing so, the partial metric invariance model fit significantly better than the full metric invariance model, $-2\Delta LL(1) = 7.16$, p < .001, and the partial metric invariance model did not fit worse than the configural invariance model $-2\Delta LL(9) = 8.98$, p = .44. The fact that partial metric invariance (i.e., "weak invariance") held indicates that the indicators were related to the latent factor equivalently across time, or more simply, that the same latent factor was being measured at each of occasion (with the exception of indicator 1, which was more related to the factor at time 1 than at times 2 or 3).

Equality of the unstandardized indicator intercepts across time was then examined in a scalar invariance model. The factor mean and variance were fixed to 0 and 1, respectively, at time 1 for identification, but the factor mean and variance were then estimated at times 2 and 3. All factor loadings and indicator intercepts were constrained equal across time (except for indicator 1 at time 1); all residual variances were still permitted to differ across time. Factor covariances and residual covariances were estimated as described previously. The scalar invariance model fit significantly worse than the partial metric invariance model, $-2\Delta LL(9) = 55.13$, p < .01. The modification indices suggested that the intercept of indicator 5 at time 1 was the largest source of the misfit and should be freed. After doing so, although the partial scalar invariance model had significantly better fit than the full scalar invariance model, -2ΔLL(1) = 15.16, p < .01, it still fit worse than the partial metric invariance model, $-2\Delta LL(8) = 27.84$, p < .001. The modification indices suggested that the intercept of indicator 4 at time 1 was the largest remaining source of the misfit and should be freed. After doing so, although the new partial scalar invariance model (with the intercepts for indicators 1, 4, and 5 freed at time 1) fit significantly better than the previous partial scalar invariance model (without the intercept for indicator 4 freed at time 1), $-2\Delta LL(1) = 9.24$, p < .01, it still fit marginally worse than the partial metric invariance model, $-2\Delta LL(7) = 13.99$, p = 05. The modification indices suggested that the intercept of indicator 2 at time 1 was the largest remaining source of the misfit and should be freed. After doing so, the new partial scalar invariance model (with the intercepts for indicators 1, 2, 4 and 5 freed at time 1) fit significantly better than the previous partial scalar invariance model (without the intercept for indicator 2 freed at time 1), $-2\Delta LL(1) = 8.73$, p < .01, and it did not fit significantly worse than the partial metric invariance model, $-2\Delta LL(6) = 4.35$, p = .63. The fact that partial scalar invariance (i.e., "strong invariance") held indicates that times 2 and 3 have the same expected response for each indicator at the same absolute level of the trait, or more simply, that the observed differences in the indicator means between times 2 and 3 is due to factor mean differences only. However, indicators 1 and 2 had a lower expected indicator response at the same absolute level of social functioning at time 1 than at time 2 or 3, while indicators 4 and 5 had a higher expected response.

Equality of the unstandardized residual variances across time was then examined in a residual variance invariance model. As in the partial scalar invariance model, the factor mean and variance were fixed to 0 and 1, respectively, for identification at time 1, but the factor mean and variance were still estimated at times 2 and 3. All factor loadings (except for indicator 1 at time 1), item intercepts (except for indicators 1, 2, 4, and 5 at time 1), and all residual variances (except for indicators 1, 2, 4, and 5 at time 1) were constrained to be equal across groups. Factor covariances and residual covariances were estimated as described previously. The residual variance invariance model fit significantly worse than the last partial scalar invariance model, $-2\Delta LL(8) = 24.72$, p < .01. The modification indices suggested that the residual variance of indicator 5 at time 2 versus time 3 was the largest remaining source of the misfit and should be

freed. After doing so, the partial residual variance invariance model fit significantly better than the residual invariance model, $-2\Delta LL(1) = 10.06$, p < .01, but still fit marginally worse than the last partial scalar invariance model, $-2\Delta LL(7) = 14.14$, p = .05. The modification indices suggested that the residual variance of indicator 6 at time 1 was the largest remaining source of the misfit and should be freed. After doing so, the new partial residual variance invariance model (with residual variances for indicators 1, 2, 4, 5, and 6 free at time 1; indicator 5 free at times 2 and 3 also) fit significantly better than the partial residual invariance model (without the residual variance for indicator 6 at time 1 freed), $-2\Delta LL(1) = 11.20$, p < .01, and did not fit worse than the last partial scalar invariance model, $-2\Delta LL(6) = 3.38$, p = .76. The fact that partial residual variance invariance (i.e., "strict invariance") held indicates that the amount of indicator variance not accounted for by the factor was the same across times 2 and 3 (except for indicator 5, for which there was more residual variance at time 2). However, 5 out of 6 indicators did not have residual variance invariance at time 1 (although this was required because of a lack of metric or scalar invariance for indicators 1, 2, 4, and 5).

After achieving partial measurement invariance as was just described, structural invariance was then tested with three additional models. First, the factor variance at times 2 and 3 (which had been estimated freely) was constrained to 1 (i.e., to be equal to the factor variance at time 1), resulting in a nonsignificant decrease in fit relative to the last partial residual invariance model, $-2\Delta LL(2) = 1.84$, p = .40. Thus, equivalent amounts of individual differences in social functioning were found across time. Second, the factor covariances across time were constrained to be equal (which become factor correlations given a variance of 1 for each factor across time), resulting in a nonsignificant decrease in fit relative to the factor variance model, $-2\Delta LL(2) = 2.32$, p = .31. Third, the factor means at times 2 and 3 (which had been estimated freely) was constrained to be equal to each other, resulting in a significant decrease in fit relative to the factor covariance invariance model $-2\Delta LL(1) = 11.15$, p < .01, indicating that the factor mean at time 3 was significantly higher than at time 2. The factor mean at time 2 was already significantly different from 0 (the factor mean at time 1), and thus, the three factor means were significantly different, increasing over time.

In conclusion, these analyses showed that partial measurement invariance was obtained over time—that is, the relationships of the indicators to the latent factor of social functioning were equivalent at times 2 and 3, although primarily not equivalent at time 1, as previous described. These analyses also showed that partial structural invariance was obtained over time, such that the same amount of individual differences variance in social functioning was observed with equal covariance over time across occasions (i.e., compound symmetry of the latent factor), although the amount of social functioning on average increased significantly over time. Model parameters from the final model are given in Table 2.

Reference: Muthén, L. K., & Muthén, B.O. (1998–2017). Mplus user's guide (8th ed.). Los Angeles, CA: Muthén & Muthén.

(see excel worksheet for Table 1; Table 2 would have unstandardized and standardized estimates and their SEs)

You might also replace all the nested model comparisons tests in the text with a table that provides them instead.