Practical Guide to Confirmatory Factor Analysis using Mplus

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Mplus is a statistical modeling software that provides researchers with a flexible tool to analyze data. Mplus offers a wide choice of models, estimators, and algorithms with a user-friendly interface and graphical displays of data and analysis results (Muthén & Muthén, 1998–2017). The Mplus modeling framework draws on the unifying theme of latent variables. Various types of analyses can be conducted utilizing continuous latent variables, such as regression, path analysis, exploratory and confirmatory factor analysis, structural equation modeling, and item response theory modeling (Muthén & Muthén, 1998–2017).

This document details the steps to conduct a second-order confirmatory factor analysis of the Leadership Scale for Sports using Mplus 8.0.

Leadership Scale for Sports

The Leadership Scale for Sports (LSS; Chelladurai & Saleh, 1980) is the most widely utilized measure of leadership in sport. Although originally developed for coaches, Loughead and Hardy (2005) adapted the LSS to assess athlete leaders. The modifications made to the LSS concerned the stem that preceded the items. In the original LSS, the stem reads "My coach" whereas in the athlete leader version the stem reads "The athlete leader(s) on my team." Like the original coach version, the athlete version of the LSS includes 40-items assessing five dimensions of leadership behaviours: training and instruction (13 items), positive feedback (5 items), social support (8 items), democratic behaviour (9 items), and autocratic behaviour (5 items). All responses on the LSS are scored on a 5-point Likert scale ranging from (1) never to (5) always with higher scores reflecting higher occurrences of the leadership behaviours. Psychometric evaluations of the athlete leader version of the LSS revealed a reasonably good model fit: CFI = .99, TLI = .98, and RMSEA = .05 (Vincer & Loughead, 2010), along with acceptable internal consistency scores (Paradis & Loughead, 2012). To view the instrument, see Appendix A.

Section 1: Getting Started with Mplus

To purchase and install Mplus 8.0, visit http://www.statmodel.com/orderonline/

After Mplus has been installed, the program can be run from the Mplus Editor or Diagrammer. I conducted every analysis using the Diagrammer. The Mplus user language consists of a set of ten commands each of which has several options. For most analyses, even complex models, only a small subset of the Mplus commands is needed. The ten main commands are:

Command	Action			
TITLE	Provides a title for the syntax			
DATA*	Identifies the dataset for the analysis			
VARIABLE*	Specify the names and variables for the analysis			
DEFINE	Transforming factors or creating variables			
ANALYSIS	Describes the type of analysis			
MODEL	Specifies the model that will be tested			
OUTPUT	Request output of the analysis			

SAVEDATA	Save analysis data, auxiliary data, and analysis results.
PLOT	Request graphical displays of observed data and analysis results
MONTECARLO	Specify the details of a Monte Carlo simulation study

^{*} Required for every analysis.

The Mplus commands may come in any order. All commands must begin on a new line and must be followed by a colon. Semicolons separate command options.

The **TITLE** command assigns a name to the analysis:

```
TITLE: CFA;
```

The **DATA** and **VARIABLE** commands are required for <u>all analyses</u>. If the data file is located in the same folder as the syntax, you can simply identify the name of the file:

```
DATA: FILE IS LSS.dat:
```

If your data is located in another folder, you need to specify the path:

```
DATA: FILE IS c:\desktop\cfa\data\LSS.dat;
```

Important to note, **VARIABLE** names CANNOT be longer than 8 characters and lines of text CANNOT exceed 90 characters. There can be more than one option per line, which can contain upper and/or lower-case letters and tabs. Commands can be shortened to four or more letters for convenience. Mplus uses a hyphen (-) to indicate a list of variables or numbers.

For this analysis, under the **VARIABLE** command, there are 3 additional commands: NAMES ARE, USE VARIABLES ARE, and MISSING.

The NAMES ARE command is where you list all of the factors in the data set. Each variable name represents a column within the original Excel file. Before uploading the file to Mplus, it is important to remove column names from the Excel file because Mplus cannot read column names. Therefore, it is important to name ALL of the variables in the file, in their specific order, regardless of how many variables will be included in the analysis.

VARIABLE:

NAMES ARE

```
TIA1 TIA2 TIA3 TIA4 TIA5 TIA6 TIA7 TIA8 TIA9 TIA10 TIA11 TIA12 TIA13 DBA15 DBA16 DBA17 DBA18 DBA19 DBA20 DBA21 DBA22 ABA23 ABA24 ABA25 ABA26 ABA27 SSA28 SSA29 SSA30 SSA31 SSA32 SSA33 SSA34 SSA35 PFA36 PFA37 PFA38 PFA39 PFA40;
```

The MISSING command allows Mplus to know which variables within the original dataset were designated as missing. In this case, all missing data were given the label of "999".

```
MISSING ARE ALL (999);
```

The USEVARIABLES ARE command is used to specify which items/factors are going to be utilized in the analysis.

USEVARIABLES ARE

!f1: training and instruction
TIA1 TIA2 TIA3 TIA4 TIA5 TIA6 TIA7 TIA8 TIA9 TIA10 TIA11 TIA12 TIA13
!f2: demographic behaviour
DBA15 DBA16 DBA17 DBA18 DBA19 DBA20 DBA21 DBA22
!f3: autocratic behaviour
ABA23 ABA24 ABA25 ABA26 ABA27
!f4: social support
SSA28 SSA29 SSA30 SSA31 SSA32 SSA33 SSA34 SSA35
!f5: positive feedback
PFA36 PFA37 PFA38 PFA39 PFA40

Comments can be included anywhere in the input setup by adding an "!". Anything on a line following an exclamation point is treated as a user comment and is ignored by Mplus. Several lines can be commented out by starting the first line with "!*" and ending the last line with "*!".

The keywords "IS", "ARE", and "=" can be used interchangeably in all commands except DEFINE, MODEL CONSTRAINT, and MODEL TEST. Items in a list can be separated by blanks or commas. There is also a special keyword ALL which can be used to indicate all variables.

The **ANALYSIS** command is used to specify the type of analysis. Mplus has a wide range of available estimators:

ML: maximum likelihood

MLM-ML, robust standard errors, & mean adjusted chi-square

MLMV-ML, robust standard errors & mean and variance adjusted chi-square

MLR-maximum likelihood with robust standard errors

MLF-maximum likelihood with first order derivative standard errors

WLSMV-weighted least squares, robust standard errors, & mean and variance adjusted chi-square

The default estimator for Mplus is the maximum likelihood, which assumes that the data is normally distributed. For the current analysis, the default maximum likelihood was utilized.

ANALYSIS:

ESTIMATOR = ML;

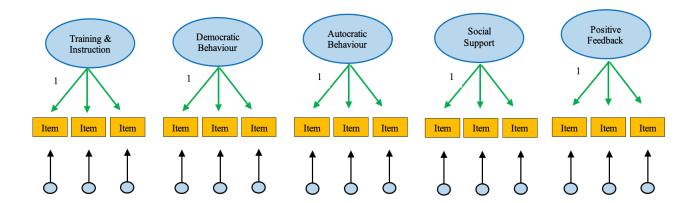
The **MODEL** command is used to specify the type of model that will be tested.

Command	Function	Syntax
statements		
	Factor loading.	F5 BY PFA36-40;
BY	Means "measured BY" and is used to define factors associated with a latent variable.	OR
		F5 BY PFA36 PFA37 PFA38
		PFA39 PFA40;
	Correlation.	DBA21 WITH DBA19;
WITH	Means "correlated WITH" and is used to specify covariance or correlational relationships	
	Regression.	GEQ ON LSS;
ON	Means "regressed ON" a linear relationship	This would be used in a structural
	between exogenous and endogenous factors	model

MODEL:

!Leadership Scale for Sports Fit

- f1 BY TIA1 TIA2 TIA3 TIA4 TIA5 TIA6 TIA7 TIA8 TIA9 TIA10 TIA11 TIA12 TIA13;
- f2 BY DBA15 DBA16 DBA17 DBA18 DBA19 DBA20 DBA21 DBA22;
- f3 BY ABA23 ABA24 ABA25 ABA26 ABA27;
- f4 BY SSA28 SSA29 SSA30 SSA31 SSA32 SSA33 SSA34 SSA35;
- f5 BY PFA36 PFA37 PFA38 PFA39 PFA40;



The model above represents a first-order latent factor of the LSS. Here we can see that Training and Instruction (i.e., f1) is measured by 13 factors, Democratic Behaviour (i.e., f2) is measured by 8 factors, Autocratic Behaviour (i.e., f3) is measured by 5 factors, Social Support (i.e., f4) is measured by 8 factors, and Positive Feedback (i.e., f5) is measured by 5 factors.

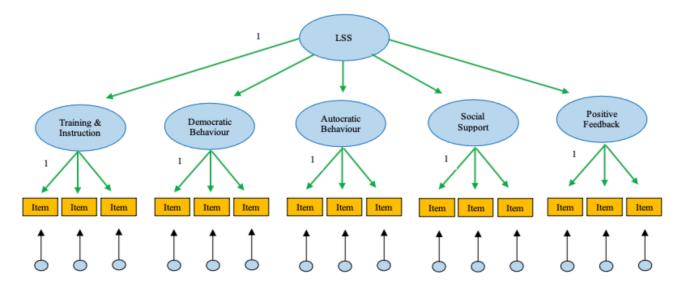
Additionally, each factor has an attached error variance. Although not shown in the above diagram, Mplus automatically calculates the covariances between each factor (see appendix B for the Mplus diagram). By default, Mplus constrains the first item of each latent variable to a factor loading of 1.

MODEL:

```
!Leadership Scale for Sports Fit
```

```
f1 BY TIA1 TIA2 TIA3 TIA4 TIA5 TIA6 TIA7 TIA8 TIA9 TIA10 TIA11 TIA12 TIA13; f2 BY DBA15 DBA16 DBA17 DBA18 DBA19 DBA20 DBA21 DBA22; f3 BY ABA23 ABA24 ABA25 ABA26 ABA27; f4 BY SSA28 SSA29 SSA30 SSA31 SSA32 SSA33 SSA34 SSA35; f5 BY PFA36 PFA37 PFA38 PFA39 PFA40;
```

LSS BY f1 f2 f3 f4 f5;



The model above represents a second-order latent factor of the LSS. In this case, a new latent variable, named LSS, is measured by the five latent variables in the previous model.

The **OUTPUT** command allows you to request specific outputs for the analysis. The outputs requested included the standardized results, sample statistics to verify the distribution of the data (e.g., skewness and kurtosis), and modification indices to see how we can improve the model by correlating certain factors with one another. In this case, requesting modification indices of 10 will output relationships/modifications that will decrease the chi square by a minimum of 10.

OUTPUT:

```
stdyx;
sampstat;
modindices (10); ! reduces chi square by 10
```

Section 2: Second-Order CFA in Mplus

The following syntax was used to conduct the second-order CFA on the LSS. The following pages will detail the various relevant outputs.

```
TITLE:
 DATA:
                           FILE IS LSS.dat;
 VARIABLE:
 NAMES ARE
         TIA1 TIA2 TIA3 TIA4 TIA5 TIA6 TIA7 TIA8 TIA9 TIA10 TIA11 TIA12 TIA13
         DBA15 DBA16 DBA17 DBA18 DBA19 DBA20 DBA21 DBA22
         ABA23 ABA24 ABA25 ABA26 ABA27
         SSA28 SSA29 SSA30 SSA31 SSA32 SSA33 SSA34 SSA35
         PFA36 PFA37 PFA38 PFA39 PFA40;
MISSING ARE ALL (999);
USEVARIABLES ARE
!fl: training and instruction
TIA1 TIA2 TIA3 TIA4 TIA5 TIA6 TIA7 TIA8 TIA9 TIA10 TIA11 TIA12 TIA13
!f2: demographic behaviour
DBA15 DBA16 DBA17 DBA18 DBA19 DBA20 DBA21 DBA22
!f3: autocratic behaviour
ABA23 ABA24 ABA25 ABA26 ABA27
!f4: social support
SSA28 SSA29 SSA30 SSA31 SSA32 SSA33 SSA34 SSA35
!f5: positive feedback
PFA36 PFA37 PFA38 PFA39 PFA40
ANALYSIS:
ESTIMATOR = ML;
MODEL:
!Leadership Scale for Sports Fit
f1 BY TIA1 TIA2 TIA3 TIA4 TIA5 TIA6 TIA7 TIA8 TIA9 TIA10 TIA11 TIA12 TIA13;
f2 BY DBA15 DBA16 DBA17 DBA18 DBA19 DBA20 DBA21 DBA22;
f3 BY ABA23 ABA24 ABA25 ABA26 ABA27;
f4 BY SSA28 SSA29 SSA30 SSA31 SSA32 SSA33 SSA34 SSA35;
f5 BY PFA36 PFA37 PFA38 PFA39 PFA40;
LSS BY f1 f2 f3 f4 f5;
OUTPUT:
stdyx;
sampstat;
modindices (10); ! reduces chi square by 10
```

Summary Statistics

The sample size for this CFA was 306. One negatively worded item "SPUR8" was removed, leaving a total of 39 continuous variables and 6 latent factors.

On the following page, the skewness and kurtosis scores show no value \pm 2. After insecting the skewness and kurtosis scores, I moved on to the model fit information (see page 9).

INPUT READING TERMINATED NORMALLY

SUMMARY	OF	ANALYSIS
Number o	of o	groups

CFA;

		observations	306
Number	of	dependent variables independent variables continuous latent variables	39 0 6

Observed dependent variables

Continuous	5				
TIA1	TIA2	TIA3	TIA4	TIA5	TIA6
TIA7	TIA8	TIA9	TIA10	TIA11	TIA12
TIA13	DBA15	DBA16	DBA17	DBA18	DBA19
DBA20	DBA21	DBA22	ABA23	ABA24	ABA25
ABA26	ABA27	SSA28	SSA29	SSA30	SSA31
SSA32	SSA33	SSA34	SSA35	PFA36	PFA37
PFA38	PFA39	PFA40			

Continuous	latent	variables			
F1	F2	F3	F4	F5	LSS
	12	13	1.1	13	БББ

Estimator	ML
Information matrix	OBSERVED
Maximum number of iterations	1000
Convergence criterion	0.500D-04
Maximum number of steepest descent iterations	20
Maximum number of iterations for H1	2000
Convergence criterion for H1	0.100D-03

UNIVARIATE SAMPLE STATISTICS

UNIVARIATE HIGHER-ORDER MOMENT DESCRIPTIVE STATISTICS

UNIVAR	TATE HIGHER	-ORDER MOMENT	DESCRIPTIVE	STATISTIC	S			
	riable/ ple Size	Mean/ Variance	Skewness/ Kurtosis	Minimum/ Maximum	% with Min/Max	20%/60%	Percentiles 40%/80%	Median
TIA1	305.000	3.613 0.657	-0.331 0.009	1.000 5.000	0.66% 11.48%	3.000 4.000	3.000 4.000	4.000
TIA2	306.000	3.229 1.013	-0.200 -0.488	1.000	4.58%	2.000 4.000	3.000 4.000	3.000
TIA3		3.151	-0.121	1.000	5.25% 8.20%	2.000	3.000	3.000
TIA4	305.000	0.976 3.367	-0.324 -0.242	5.000 1.000	4.90%	3.000 3.000	4.000 3.000	3.000
TIA5	306.000	1.122 2.890	-0.467 -0.016	5.000 1.000	15.36% 9.87%	4.000 2.000	4.000 3.000	3.000
TIA6	304.000	1.114 3.381	-0.701 -0.521	5.000 1.000	5.26% 3.29%	3.000 3.000	4.000 3.000	3.000
TIA7	304.000	0.801 3.085	0.148 -0.039	5.000 1.000	6.91% 7.92%	4.000 2.000	4.000 3.000	3.000
TIA8	303.000	1.246 3.918	-0.760 -0.756	5.000 1.000	10.89% 2.30%	3.000 3.000	4.000	4.000
TIA9	304.000	1.075 2.988	-0.089 0.039	5.000 1.000	35.20% 8.17%	4.000 2.000	5.000 3.000	3.000
TIA10	306.000	1.113 2.815	-0.472 0.039	5.000 1.000	8.50% 13.07%	3.000 2.000	4.000 3.000	3.000
TIA11	306.000	1.205 3.596	-0.719 -0.285	5.000 1.000	5.88% 0.98%	3.000 3.000	4.000 3.000	4.000
TIA12	306.000	0.841 3.220	-0.401 -0.168	5.000 1.000	16.01% 7.21%	4.000	4.000	3.000
TIA13	305.000	1.280	-0.749 -0.012	5.000 1.000	13.77% 11.76%	4.000	4.000	3.000
DBA15	306.000	1.431 3.723	-0.888 -0.561	5.000	12.09%	3.000 3.000	4.000	4.000
DBA16	305.000	0.967 3.969	-0.094 -0.592	5.000	22.62%	4.000 3.000	5.000 4.000	4.000
	306.000	0.735	-0.064	5.000	28.76%	4.000	5.000	
DBA17	306.000	2.739 1.539	0.135 -0.987	1.000 5.000	20.59% 8.82%	1.000 3.000	2.000 4.000	3.000
DBA18	306.000	3.912 1.087	-0.740 -0.143	1.000 5.000	2.29% 35.29%	3.000 4.000	4.000 5.000	4.000
DBA19	306.000	3.542 1.000	-0.421 -0.214	1.000 5.000	3.27% 16.99%	3.000 4.000	3.000 4.000	4.000
DBA20	306.000	4.010 0.794	-0.740 0.157	1.000 5.000	0.65% 32.35%	3.000 4.000	4.000 5.000	4.000
DBA21	306.000	3.444 1.116	-0.211 -0.637	1.000 5.000	3.27% 17.97%	3.000 4.000	3.000 4.000	3.000
DBA22	305.000	3.304 1.727	-0.373 -0.956	1.000 5.000	13.77% 21.31%	2.000 4.000	3.000 5.000	3.000
ABA23	303.000	2.919 1.123	0.013 -0.723	1.000 5.000	8.91% 5.94%	2.000 3.000	3.000 4.000	3.000
ABA24	304.000	2.803 1.007	0.051 -0.528	1.000 5.000	9.87% 3.95%	2.000 3.000	3.000 4.000	3.000
ABA25	303.000	2.426 1.386	0.487 -0.724	1.000 5.000	25.41% 5.28%	1.000 3.000	2.000 4.000	2.000
ABA26	306.000	2.493 1.296	0.309 -0.791	1.000	23.20% 4.25%	1.000 3.000	2.000 4.000	2.000
ABA27	306.000	2.484	0.489 -0.536	1.000	21.57%	1.000	2.000	2.000
SSA28	305.000	3.757 0.885	-0.469 -0.223	1.000	1.31% 22.95%	3.000 4.000	4.000 5.000	4.000
SSA29	306.000	3.518 0.912	-0.352 -0.348	1.000	1.96% 14.05%	3.000 4.000	3.000 4.000	4.000
SSA30	304.000	4.003 0.819	-0.832 0.528	1.000	1.32%	3.000 4.000	4.000 5.000	4.000
SSA31		3.990	-1.163	1.000	3.93%	3.000	4.000 5.000	4.000
SSA32	305.000	1.011 4.357	1.211 -1.357	5.000 1.000	33.77%	4.000	4.000	5.000
SSA33	305.000	0.630 3.857	2.082 -0.635	5.000 1.000	51.15%	5.000 3.000	5.000 4.000	4.000
SSA34	305.000	0.942 4.062	0.018 -0.742	5.000 1.000	28.85%	4.000 3.000	5.000 4.000	4.000
SSA35	304.000	0.789 3.642	0.229 -0.696	5.000 1.000	36.51% 10.89%	4.000 3.000	5.000 4.000	4.000
PFA36	303.000	1.721 4.390	-0.606 -1.072	5.000 1.000	33.66% 0.33%	4.000 4.000	5.000 4.000	5.000
PFA37	304.000	0.513 4.350	1.228 -0.832	5.000 2.000	50.99% 1.32%	5.000 4.000	5.000 4.000	4.000
PFA38	303.000	0.485 3.668	0.352 -0.455	5.000 1.000	46.53% 2.32%	5.000 3.000	5.000 3.000	4.000
PFA39	302.000	1.009 4.281	-0.322 -0.998	5.000 1.000	22.19% 0.66%	4.000	5.000 4.000	4.000
PFA40	303.000	0.532 4.467	1.745 -1.334	5.000 1.000	41.91% 0.33%	5.000 4.000	5.000 4.000	5.000
	305.000	0.520	1.797	5.000	58.36%	5.000	5.000	

Model Fit

Chi Square is an indicator of model misfit. A Chi-Square value closer to zero indicates a better fitting model. Additionally, we are looking for a <u>non-significant P-value</u>. In this case, the p-value is significant, indicating a poor model fit. However, the Chi-Square is sensitive to sample size and model complexity. For this analysis, the model is simple, and the sample is small (i.e., 306). As such, other model fit indices will be investigated.

Root-Means-Square Error of Approximation (RMSEA) scores are deemed acceptable \leq .08 (Marsh, 2007) and good \leq .06 (Hu & Bentler, 1999). The results indicated a good model fit, RMSEA = .06.

Comparative Fit Index (CFI) and Tucker-Lewis Index (TLI) values are deemed acceptable above 0.90 (Marsh, 2007) and excellent above 0.95 (Hu & Bentler, 1999). The results indicated a poor model fit, CFI = .79 and TLI = .78.

Standardized Root Mean Residual (SRMR) scores are deemed good \leq .08. The results revealed an SRMR = .09.

MODEL FI	T INFORMATION			
Number o	f Free Parameters		122	
Loglikel	ihood			
	H0 Value H1 Value		153.116 402.448	
Informat	ion Criteria			
	Akaike (AIC) Bayesian (BIC) Sample-Size Adjusted BIC (n* = (n + 2) / 24)	31	550.232 004.509 617.581	
Chi-Squa	re Test of Model Fit			
	Value Degrees of Freedom P-Value	1	501.336 697 0.0000	
RMSEA (Re	oot Mean Square Error Of Appro	oximat	ion)	
	Estimate 90 Percent C.I.		0.061 0.057	
	Probability RMSEA <= .05		0.000	0.066
CFI/TLI	Probability RMSEA <= .05			0.066
CFI/TLI	Probability RMSEA <= .05 CFI TLI			0.066
	CFI	Baseli	0.000 0.791 0.778]
	CFI TLI		0.000 0.791 0.778]
Chi-Squa	CFI TLI re Test of Model Fit for the E Value Degrees of Freedom	4	0.000 0.791 0.778 ne Model 593.932 741 0.0000]

Standardized Model Results

This is where we look for measurement quality. Every item loading should be larger than .4 and significantly loaded. Although each item loads significantly, three Democratic Behaviour items (i.e., DBA 19, 21, 22) and one Autocratic Behaviour item (i.e., ABA 26) have low item loadings. Due to the poor fitting model, these items will be removed to improve model fit.

STDYX Standardization

F1 BY			Estimate	S.E.	Est./S.E.	Two-Tailed P-Value
TIA1	E1	DV				
TIA2		ві	0 510	0.045	11 570	0 000
TIA3						
TIA4						
TIA5						
TIA6						
TIA7						
TIA8						
TIA9						
TIA10						
TIA11						
TIA12						
TIA13 0.775 0.026 29.900 0.000 F2 BY DBA15 0.564 0.048 11.679 0.000 DBA16 0.552 0.049 11.243 0.000 DBA17 0.444 0.056 7.882 0.000 DBA18 0.609 0.045 13.466 0.000 DBA19 0.352 0.059 5.963 0.000 DBA20 0.622 0.045 13.814 0.000 DBA21 0.288 0.061 4.701 0.000 DBA22 0.304 0.060 5.077 0.000 F3 BY ABA23 0.533 0.062 8.558 0.000 ABA24 0.566 0.062 9.156 0.000 ABA25 0.539 0.063 8.622 0.000 ABA26 0.302 0.070 4.290 0.000 ABA27 0.523 0.063 8.324 0.000 F4 BY SSA28 0.665 0.039 17.093 0.000 SSA30 0.615 0.042 14.537 0.000 SSA31 0.470 0.051 9.259 0.000 SSA32 0.556 0.046 12.028 0.000 SSA33 0.597 0.043 13.740 0.000 SSA34 0.640 0.041 15.639 0.000 SSA35 0.416 0.054 7.762 0.000 F5 BY PFA36 0.672 0.041 16.582 0.000 PFA37 0.773 0.035 21.864 0.000 PFA39 0.661 0.042 15.794 0.000 F5 BY PFA36 0.672 0.041 16.582 0.000 PFA37 0.773 0.035 21.864 0.000 PFA39 0.661 0.042 15.794 0.000 PFA39 0.661 0.042 15.794 0.000 PFA39 0.661 0.042 15.794 0.000 PFA39 0.666 0.049 13.589 0.000 F5 BY F1 0.662 0.049 13.589 0.000 F5 BY F1 0.666 0.049 17.665 0.000 F5 0.866 0.047 17.338 0.000						
DBA15						
DBA15	T2	DV				
DBA16		BI	0 564	0 049	11 670	0 000
DBA17						
DBA18						
DBA19						
DBA20						
DBA21						
DBA22						
F3 BY ABA23						
ABA23						
ABA24		BY				
ABA25 0.539 0.063 8.622 0.000 ABA26 0.302 0.070 4.290 0.000 ABA27 0.523 0.063 8.324 0.000 F4 BY SSA28 0.665 0.039 17.093 0.000 SSA30 0.615 0.042 14.537 0.000 SSA31 0.470 0.051 9.259 0.000 SSA32 0.556 0.046 12.028 0.000 SSA33 0.597 0.043 13.740 0.000 SSA34 0.640 0.041 15.639 0.000 SSA35 0.416 0.054 7.762 0.000 F5 BY PFA36 0.672 0.041 16.582 0.000 PFA37 0.773 0.035 21.864 0.000 PFA38 0.491 0.052 9.517 0.000 PFA39 0.661 0.042 15.794 0.000 PFA39 0.661 0.042 15.794 0.000 PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000						
ABA26 0.302 0.070 4.290 0.000 ABA27 0.523 0.063 8.324 0.000 F4 BY SSA28 0.665 0.039 17.093 0.000 SSA29 0.676 0.038 17.752 0.000 SSA30 0.615 0.042 14.537 0.000 SSA31 0.470 0.051 9.259 0.000 SSA32 0.556 0.046 12.028 0.000 SSA33 0.597 0.043 13.740 0.000 SSA34 0.640 0.041 15.639 0.000 SSA35 0.416 0.054 7.762 0.000 F5 BY PFA36 0.672 0.041 16.582 0.000 PFA37 0.773 0.035 21.864 0.000 PFA38 0.491 0.052 9.517 0.000 PFA39 0.661 0.042 15.794 0.000 PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000						
ABA27 0.523 0.063 8.324 0.000 F4 BY SSA28 0.665 0.039 17.093 0.000 SSA29 0.676 0.038 17.752 0.000 SSA30 0.615 0.042 14.537 0.000 SSA31 0.470 0.051 9.259 0.000 SSA32 0.556 0.046 12.028 0.000 SSA33 0.597 0.043 13.740 0.000 SSA34 0.640 0.041 15.639 0.000 SSA35 0.416 0.054 7.762 0.000 F5 BY PFA36 0.672 0.041 16.582 0.000 PFA37 0.773 0.035 21.864 0.000 PFA38 0.491 0.052 9.517 0.000 PFA39 0.661 0.042 15.794 0.000 PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000						
F4 BY SSA28						
SSA28 0.665 0.039 17.093 0.000 SSA29 0.676 0.038 17.752 0.000 SSA30 0.615 0.042 14.537 0.000 SSA31 0.470 0.051 9.259 0.000 SSA32 0.556 0.046 12.028 0.000 SSA33 0.597 0.043 13.740 0.000 SSA34 0.640 0.041 15.639 0.000 SSA35 0.416 0.054 7.762 0.000 F5 BY PFA37 0.773 0.035 21.864 0.000 PFA38 0.491 0.052 9.517 0.000 PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809	ABA27		0.523	0.063	8.324	0.000
SSA28 0.665 0.039 17.093 0.000 SSA29 0.676 0.038 17.752 0.000 SSA30 0.615 0.042 14.537 0.000 SSA31 0.470 0.051 9.259 0.000 SSA32 0.556 0.046 12.028 0.000 SSA33 0.597 0.043 13.740 0.000 SSA34 0.640 0.041 15.639 0.000 SSA35 0.416 0.054 7.762 0.000 F5 BY PFA37 0.773 0.035 21.864 0.000 PFA38 0.491 0.052 9.517 0.000 PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809	F4	BY				
SSA29 0.676 0.038 17.752 0.000 SSA30 0.615 0.042 14.537 0.000 SSA31 0.470 0.051 9.259 0.000 SSA32 0.556 0.046 12.028 0.000 SSA33 0.597 0.043 13.740 0.000 SSA34 0.640 0.041 15.639 0.000 SSA35 0.416 0.054 7.762 0.000 F5 BY PFA36 0.672 0.041 16.582 0.000 PFA37 0.773 0.035 21.864 0.000 PFA38 0.491 0.052 9.517 0.000 PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809			0.665	0.039	17.093	0.000
SSA30 0.615 0.042 14.537 0.000 SSA31 0.470 0.051 9.259 0.000 SSA32 0.556 0.046 12.028 0.000 SSA33 0.597 0.043 13.740 0.000 SSA34 0.640 0.041 15.639 0.000 SSA35 0.416 0.054 7.762 0.000 F5 BY PFA36 0.672 0.041 16.582 0.000 PFA37 0.773 0.035 21.864 0.000 PFA38 0.491 0.052 9.517 0.000 PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000						
SSA31 0.470 0.051 9.259 0.000 SSA32 0.556 0.046 12.028 0.000 SSA33 0.597 0.043 13.740 0.000 SSA34 0.640 0.041 15.639 0.000 SSA35 0.416 0.054 7.762 0.000 F5 BY PFA36 0.672 0.041 16.582 0.000 PFA37 0.773 0.035 21.864 0.000 PFA38 0.491 0.052 9.517 0.000 PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000						
SSA33	SSA31		0.470	0.051		0.000
SSA34 0.640 0.041 15.639 0.000 SSA35 0.416 0.054 7.762 0.000	SSA32		0.556	0.046	12.028	0.000
SSA35 0.416 0.054 7.762 0.000 F5 BY PFA36 0.672 0.041 16.582 0.000 PFA37 0.773 0.035 21.864 0.000 PFA38 0.491 0.052 9.517 0.000 PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000	SSA33		0.597	0.043	13.740	0.000
F5 BY PFA36 0.672 0.041 16.582 0.000 PFA37 0.773 0.035 21.864 0.000 PFA38 0.491 0.052 9.517 0.000 PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000	SSA34			0.041	15.639	0.000
PFA36 0.672 0.041 16.582 0.000 PFA37 0.773 0.035 21.864 0.000 PFA38 0.491 0.052 9.517 0.000 PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000	SSA35		0.416	0.054	7.762	0.000
PFA36 0.672 0.041 16.582 0.000 PFA37 0.773 0.035 21.864 0.000 PFA38 0.491 0.052 9.517 0.000 PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000	F5	RV				
PFA37 0.773 0.035 21.864 0.000 PFA38 0.491 0.052 9.517 0.000 PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000		DI	0.672	0.041	16.582	0.000
PFA38 0.491 0.052 9.517 0.000 PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000						
PFA39 0.661 0.042 15.794 0.000 PFA40 0.551 0.048 11.495 0.000 LSS BY						
PFA40 0.551 0.048 11.495 0.000 LSS BY F1 0.662 0.049 13.589 0.000 F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000						
F1 0.662 0.049 13.589 0.000 F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000						
F1 0.662 0.049 13.589 0.000 F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000	TCC	DV				
F2 0.866 0.049 17.665 0.000 F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000		ы	0.662	0 040	12 500	0 000
F3 0.115 0.086 1.334 0.182 F4 0.809 0.047 17.338 0.000						
F4 0.809 0.047 17.338 0.000						
						0.102
				0.057	10.676	0.000

R-Square

R-Square indicates the specific variances for each individual item and each latent factor. Although significant, the three Democratic Behaviour items (i.e., DBA 19, 21, 22) and one Autocratic Behaviour item (i.e., ABA 26) do not appear to contribute much to the model. Similarly, Factor 3 (i.e., Autocratic Behaviour) does not significantly contribute to the model.

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Observed Variable	Estimate	S.E.	Est./S.E.	Two-Tailed P-Value
TIA1	0.268	0.046	5.789	0.000
TIA2	0.393	0.047	8.360	0.000
TIA3	0.456	0.047	9.912	0.000
			12.078	
TIA4	0.528	0.044		0.000
TIA5	0.506	0.044	11.371	0.000
TIA6	0.385	0.047	8.134	0.000
TIA7	0.611	0.040	15.276	0.000
TIA8	0.157	0.040	3.883	0.000
TIA9	0.352	0.047	7.446	0.000
TIA10	0.492	0.045	10.960	0.000
TIA11	0.315	0.047	6.679	0.000
TIA12	0.411	0.047	8.781	0.000
TIA13	0.601	0.040	14.950	0.000
DBA15	0.318	0.054	5.840	0.000
DBA16	0.305	0.054	5.622	0.000
DBA17	0.197	0.050	3.941	0.000
DBA18	0.371	0.055	6.733	0.000
DBA19	0.124	0.042	2.981	0.003
DBA20	0.386	0.056	6.907	0.000
DBA21	0.083	0.035	2.351	0.019
DBA22	0.092	0.036	2.538	0.011
ABA23	0.285	0.066	4.279	0.000
ABA24	0.321	0.070	4.578	0.000
ABA25	0.291	0.067	4.311	0.000
ABA26	0.091	0.042	2.145	0.032
ABA27	0.274	0.066	4.162	0.000
SSA28	0.443	0.052	8.547	0.000
SSA29	0.457	0.052	8.876	0.000
SSA30	0.379	0.052	7.268	0.000
SSA31	0.220	0.048	4.630	0.000
SSA32	0.309	0.051	6.014	0.000
SSA33	0.356	0.052	6.870	0.000
SSA34	0.410	0.052	7.819	0.000
SSA35	0.173	0.045	3.881	0.000
PFA36	0.452	0.054	8.291	0.000
PFA37	0.597	0.055	10.932	0.000
PFA38	0.241	0.051	4.758	0.000
PFA39	0.437	0.055	7.897	0.000
PFA40	0.303	0.053	5.748	0.000
Latent				Two-Tailed
Variable	Estimate	S.E.	Est./S.E.	P-Value
F1	0.438	0.064	6.795	0.000
F2	0.750	0.085	8.832	0.000
F3	0.013	0.020	0.667	0.505
F4	0.655	0.075	8.669	0.000
F5	0.368	0.069	5.338	0.000
ro	0.300	0.009	5.336	0.000

Modification Indices

Modification Indices will help improve model fit. Importantly, items should be modified as little as possible. Additionally, error terms should only be correlated if there are theoretical justifications allowing it. That is, Democratic Behaviour items can only be correlated with other Democratic Behaviour items, and not with items from other latent factors.

Below, we can see that there are only 2 possible correlations between error terms: Training and Instruction item #10 **WITH** Training and Instruction item #7 and Democratic Behaviour item #21 **WITH** Democratic Behaviour item #19. However, as mentioned earlier Democratic Behaviour items 19 and 21 will be removed from the analysis.

Minimum M.I. value for printing the modification index 10.000

		M.I.	E.P.C.	Std E.P.C.	StdYX E.P.C.
WITH Sta	atements				
TIA10	WITH TIA7	17.793	0.153	0.153	0.281
DBA21	WITH DBA19	45.324	0.377	0.377	0.398
ABA27	WITH TIA10	21.627	0.228	0.228	0.298
SSA29	WITH TIA3	16.354	0.132	0.132	0.258
SSA32	WITH TIA11	17.928	0.129	0.129	0.257
F3	WITH F1	23.924	0.075	0.424	0.424

Section 3: Improving Model Fit

Mplus Syntax

The first step was to remove the items that loaded poorly and run the analysis again. Error terms should only be correlated if necessary, therefore no correlations were added to the model at this stage.

The syntax below shows how items are excluded from the analysis. Adding a "!", followed by the items, turns these items into comments. Putting items into comments rather than simply deleting them helps keep track of the steps taken during the analysis.

```
USEVARIABLES ARE
!fl: training and instruction
TIA1 TIA2 TIA3 TIA4 TIA5 TIA6 TIA7 TIA8 TIA9 TIA10 TIA11 TIA12 TIA13
!f2: demographic behaviour
DBA15 DBA16 DBA17 DBA18 DBA20 !Removed: DBA19 DBA21 DBA22
!f3: autocratic behaviour
ABA23 ABA24 ABA25 ABA27 !Removed: ABA26
!f4: social support
SSA28 SSA29 SSA30 SSA31 SSA32 SSA33 SSA34 SSA35
!f5: positive feedback
PFA36 PFA37 PFA38 PFA39 PFA40
ANALYSIS:
ESTIMATOR = ML;
MODEL:
!Leadership Scale for Sports Fit
f1 BY TIA1 TIA2 TIA3 TIA4 TIA5 TIA6 TIA7 TIA8 TIA9 TIA10 TIA11 TIA12 TIA13;
f2 BY DBA15 DBA16 DBA17 DBA18 DBA20; !Removed: DBA19 DBA21 DBA22
f3 BY ABA23 ABA24 ABA25 ABA27; !Removed: ABA26 f4 BY SSA28 SSA29 SSA30 SSA31 SSA32 SSA33 SSA34 SSA35;
f5 BY PFA36 PFA37 PFA38 PFA39 PFA40;
LSS BY f1 f2 f3 f4 f5;
```

Model Fit

Simply removing the items did not lead to any major improvement to model fit.

The RMSEA score was unchanged, RMSEA = .06.

Although the CFI increased from .79 to .82 and the TLI increased from .78 to .81, these still indicate a poor model fit.

The SRMR improved from .9 to .8.

MODEL FIT INFORMATION

Number of Free Parameters 110

Loglikelihood

H0 Value -13317.418 H1 Value -12723.389

Information Criteria

Akaike (AIC) 26854.837
Bayesian (BIC) 27264.431
Sample-Size Adjusted BIC 26915.562
(n* = (n + 2) / 24)

Chi-Square Test of Model Fit

 Value
 1188.059

 Degrees of Freedom
 555

 P-Value
 0.0000

RMSEA (Root Mean Square Error Of Approximation)

Estimate 0.061 90 Percent C.I. 0.056 0.066 Probability RMSEA <= .05 0.000

CFI/TLI

CFI 0.824 TLI 0.812

Chi-Square Test of Model Fit for the Baseline Model

Value 4201.715
Degrees of Freedom 595
P-Value 0.0000

SRMR (Standardized Root Mean Square Residual)

Value 0.081

Modification Indices

To further improve model fit, I started correlating error terms. Correlations were done individually starting with the largest sore. Correlations are run one at a time because the second largest score now may not be the largest score after the new analysis.

In this case, the Training and Instruction items 7 and 10 were correlated.

Minimum M.I. value for printing the modification index 10.000

			M.I.	E.P.C.	Std E.P.C.	StdYX E.P.C.
WITH Sta	tement	ts				
TIA10	WITH	TIA7	18.239	0.155	0.155	0.284
TIA12		TIA3	10.135	-0.125	-0.125	-0.198
DBA17	WITH	TIA10	13.515	0.196	0.196	0.226
ABA27	WITH	TIA9	10.655	0.171	0.171	0.207
ABA27	WITH	TIA10	22.317	0.232	0.232	0.305
SSA28	WITH	TIA8	13.390	-0.151	-0.151	-0.227
SSA29	WITH	TIA3	16.341	0.132	0.132	0.259
SSA30	WITH	TIA6	11.666	-0.107	-0.107	-0.212
SSA32	WITH	TIA5	10.556	-0.100	-0.100	-0.202
SSA32	WITH	TIA11	18.155	0.130	0.130	0.258
SSA32	WITH	DBA17	13.037	-0.162	-0.162	-0.221
SSA34	WITH	TIA8	12.022	0.139	0.139	0.213
SSA34	WITH	TIA11	14.011	0.121	0.121	0.232
SSA34	WITH	SSA29	11.290	-0.114	-0.114	-0.238
PFA37	WITH	PFA36	10.678	0.079	0.079	0.338
F3	WITH	F1	27.317	0.075	0.472	0.472

Mplus Syntax

To correlate error terms, a simple line of code is added to the **MODEL** command.

Simply add the command statement WITH in between the items.

It is important to add a ";" after the line of code, otherwise Mplus will not run the correlation.

MODEL:

```
!Leadership Scale for Sports Fit

f1 BY TIA1 TIA2 TIA3 TIA4 TIA5 TIA6 TIA7 TIA8 TIA9 TIA10 TIA11 TIA12 TIA13;
f2 BY DBA15 DBA16 DBA17 DBA18 DBA20; !Removed: DBA19 DBA21 DBA22;
f3 BY ABA23 ABA24 ABA25 ABA27; !Removed: ABA26
f4 BY SSA28 SSA29 SSA30 SSA31 SSA32 SSA33 SSA34 SSA35;
f5 BY PFA36 PFA37 PFA38 PFA39 PFA40;

LSS BY f1 f2 f3 f4 f5;

TIA10 WITH TIA7;

OUTPUT:
stdyx;
sampstat;
modindices (10); ! reduces chi square by 10
```

Model Fit

The correlation of the two Training and Instruction items did not lead to any major improvement to model fit.

The Chi-Square, RMSEA, and SRMR were unchanged.

The CFI and TLI improved to .83 and .82, respectively.

MODEL FIT	INFORMATION	
Number of	Free Parameters	111
Loglikeli	Lhood	
	H0 Value H1 Value	-13308.584 -12723.389
Informati	ion Criteria	
	Akaike (AIC) Bayesian (BIC) Sample-Size Adjusted BIC (n* = (n + 2) / 24)	26839.168 27252.486 26900.445
Chi-Squar	re Test of Model Fit	
RMSEA (Ro	Value Degrees of Freedom P-Value Doot Mean Square Error Of Approx	1170.390 554 0.0000
	Estimate 90 Percent C.I. Probability RMSEA <= .05	0.060 0.055 0.065 0.000
CFI/TLI		
	CFI TLI	0.829 0.816
Chi-Squar	re Test of Model Fit for the Ba	seline Model
	Value	4201.715

595 0.0000

0.080

Degrees of Freedom

SRMR (Standardized Root Mean Square Residual)

P-Value

Value

Modification Indices

To further improve model fit, I correlated the largest error term, Social Support items 29 and 34.

Minimum M.I. value for printing the modification index 10.000

							_
				M.I.	E.P.C.	Std E.P.C.	StdYX E.P.C.
	WITH Sta	tement	ts				
	TIA12	WITH	TIA3	10.805	-0.130	-0.130	-0.206
	DBA17	WITH	TIA5	10.987	0.168	0.168	0.205
	DBA17	WITH	TIA10	11.733	0.177	0.177	0.198
	ABA27	WITH	TIA9	11.813	0.181	0.181	0.218
	ABA27	WITH	TIA10	17.075	0.198	0.198	0.251
	SSA28	WITH	TIA8	13.383	-0.151	-0.151	-0.227
	SSA29	WITH	TIA3	16.603	0.133	0.133	0.261
	SSA30	WITH	TIA6	11.487	-0.106	-0.106	-0.211
	SSA32	WITH	TIA5	11.700	-0.105	-0.105	-0.214
	SSA32	WITH	TIA11	17.556	0.127	0.127	0.254
	SSA32	WITH	DBA17	13.105	-0.162	-0.162	-0.222
	SSA34	WITH	TIA8	11.877	0.138	0.138	0.212
	SSA34	WITH	TIA11	13.822	0.120	0.120	0.231
I	SSA34	WITH	SSA29	11.354	-0.114	-0.114	-0.239
•	PFA37	WITH	PFA36	10.699	0.079	0.079	0.338
	F3	WITH	F1	26.067	0.075	0.468	0.468

Mplus Syntax

The second correlated error term is added a line below the other error term.

It is important to add a ";" after the line of code, otherwise Mplus will not run the correlation.

```
MODEL:
!Leadership Scale for Sports Fit

fl BY TIA1 TIA2 TIA3 TIA4 TIA5 TIA6 TIA7 TIA8 TIA9 TIA10 TIA11 TIA12 TIA13;
f2 BY DBA15 DBA16 DBA17 DBA18 DBA20; !Removed: DBA19 DBA21 DBA22;
f3 BY ABA23 ABA24 ABA25 ABA27; !Removed: ABA26
f4 BY SSA28 SSA29 SSA30 SSA31 SSA32 SSA33 SSA34 SSA35;
f5 BY PFA36 PFA37 PFA38 PFA39 PFA40;

LSS BY f1 f2 f3 f4 f5;

TIA10 WITH TIA7;
SSA34 WITH SSA29;

OUTPUT:
stdyx;
sampstat;
modindices (10); ! reduces chi square by 10
```

Model Fit

The correlation of the two Social Support items did not lead to any improvement to model fit.

The Chi-Square, RMSEA, SRMR, CFI, and TLI were unchanged.

I chose to correlate two more items to see if that would increase model fit.

MODEL FIT	INFORMATION						
Number of	Free Parameters			112			
Loglikeli	hood						
	H0 Value H1 Value		3302 2723				
Informati	on Criteria						
	Akaike (AIC) Bayesian (BIC) Sample-Size Adjusted BIC (n* = (n + 2) / 24)	2	6828 7245 6890	.758			
Chi-Squar	e Test of Model Fit						
	Value Degrees of Freedom P-Value	1		.939 553 0000			
RMSEA (Ro	ot Mean Square Error Of Approx	imat	tion)			
	Estimate 90 Percent C.I. Probability RMSEA <= .05		0.	.060 .055 .001	0.065		
CFI/TLI							
	CFI TLI			.832 .820			
Chi-Squar	e Test of Model Fit for the Ba	seli	ine 1	Model			
	Value Degrees of Freedom P-Value	4	4201. 0.0	.715 595 0000			
SRMR (Sta	SRMR (Standardized Root Mean Square Residual)						
	Value		0.	.080			

Modification Indices

To further improve model fit, I correlated the largest error term, Positive Feedback items 36 and 37.

Minimum M.I. value for printing the modification index 10.000

				M.I.	E.P.C.	Std E.P.C.	StdYX E.P.C.
W	ITH Sta	tement	ts				
Т	IA12	WITH	TIA3	10.837	-0.130	-0.130	-0.206
D	BA17	WITH	TIA5	10.959	0.168	0.168	0.205
D	BA17	WITH	TIA10	11.763	0.177	0.177	0.198
Α	BA27	WITH	TIA9	11.852	0.181	0.181	0.218
Α	BA27	WITH	TIA10	17.090	0.198	0.198	0.251
S	SA28	WITH	TIA8	13.655	-0.153	-0.153	-0.227
S	SA29	WITH	TIA3	16.139	0.129	0.129	0.265
S	SA30	WITH	TIA6	11.658	-0.107	-0.107	-0.211
S	SA32	WITH	TIA5	11.782	-0.106	-0.106	-0.213
S	SA32	WITH	TIA11	17.322	0.127	0.127	0.251
S	SA32	WITH	DBA17	13.221	-0.164	-0.164	-0.221
S	SA34	WITH	TIA8	11.491	0.133	0.133	0.214
S	SA34	WITH	TIA11	10.680	0.103	0.103	0.208
P	FA37	WITH	PFA36	10.953	0.080	0.080	0.341
F	'3	WITH	F1	26.009	0.074	0.469	0.469

Mplus Syntax

The correlated error term is added a line below the other error terms.

It is important to add a ";" after the line of code, otherwise Mplus will not run the correlation.

MODEL:

```
!Leadership Scale for Sports Fit

fl BY TIA1 TIA2 TIA3 TIA4 TIA5 TIA6 TIA7 TIA8 TIA9 TIA10 TIA11 TIA12 TIA13;
f2 BY DBA15 DBA16 DBA17 DBA18 DBA20; !Removed: DBA19 DBA21 DBA22;
f3 BY ABA23 ABA24 ABA25 ABA27; !Removed: ABA26
f4 BY SSA28 SSA29 SSA30 SSA31 SSA32 SSA33 SSA34 SSA35;
f5 BY PFA36 PFA37 PFA38 PFA39 PFA40;

LSS BY f1 f2 f3 f4 f5;

TIA10 WITH TIA7;
SSA34 WITH SSA29;
PFA37 WITH PFA36;

OUTPUT:

stdyx;
sampstat;
modindices (10); ! reduces chi square by 10
```

Model Fit

The Chi-Square, RMSEA, SRMR, and TLI were unchanged. Only the CFI slightly improved from .83 to .84.

I chose to correlate two more items to see if that would increase model fit.

MODEL FIT	MODEL FIT INFORMATION							
Number of	Free Parameters	113						
Loglikeli	.hood							
	H0 Value H1 Value	-13297.283 -12723.389						
Informati	on Criteria							
	Akaike (AIC) Bayesian (BIC) Sample-Size Adjusted BIC (n* = (n + 2) / 24)	26820.565 27241.330 26882.946						
Chi-Squar	re Test of Model Fit							
	Value Degrees of Freedom P-Value	1147.787 552 0.0000						
RMSEA (Ro	oot Mean Square Error Of Approx	kimation)						
	Estimate 90 Percent C.I. Probability RMSEA <= .05	0.059 0.055 0.064 0.001						
CFI/TLI								
	CFI TLI	0.835 0.822						
Chi-Squar	Chi-Square Test of Model Fit for the Baseline Model							
	Value Degrees of Freedom P-Value	4201.715 595 0.0000						
SRMR (Sta	SRMR (Standardized Root Mean Square Residual)							

Value

0.079

Modification Indices

SSA32

SSA32

SSA34

SSA34

F3

WITH TIA11

WITH DBA17

WITH TIA8

WITH TIA11

WITH F1

To further improve model fit, I correlated the largest error term, Training and Instruction items 3 and 12.

E.P.C. Std E.P.C. StdYX E.P.C.

0.127

-0.163

0.133

0.103

0.476

0.251

0.214

0.208

0.476

-0.220

Minimum M.I. value for printing the modification index 10.000

WITH Statements							
TIA12	WITH TIA3	10.879	-0.130	-0.130	-0.207		
DBA17	WITH TIA5	10.960	0.168	0.168	0.205		
DBA17	WITH TIA10	11.826	0.178	0.178	0.199		
ABA27	WITH TIA9	11.853	0.181	0.181	0.218		
ABA27	WITH TIA10	17.073	0.198	0.198	0.251		
SSA28	WITH TIA8	13.618	-0.152	-0.152	-0.226		
SSA29	WITH TIA3	15.952	0.128	0.128	0.264		
SSA30	WITH TIA6	11.689	-0.107	-0.107	-0.211		
SSA32	WITH TIA5	11.727	-0.106	-0.106	-0.212		

17.367

13.074

11.478

10.694

26.984

0.127

-0.163

0.133

0.103

0.076

M.I.

Mplus Syntax

The correlated error term is added a line below the other error terms.

It is important to add a ";" after the line of code, otherwise Mplus will not run the correlation.

```
MODEL:
!Leadership Scale for Sports Fit
f1 BY TIA1 TIA2 TIA3 TIA4 TIA5 TIA6 TIA7 TIA8 TIA9 TIA10 TIA11 TIA12 TIA13;
f2 BY DBA15 DBA16 DBA17 DBA18 DBA20; !Removed: DBA19 DBA21 DBA22;
f3 BY ABA23 ABA24 ABA25 ABA27; !Removed: ABA26
f4 BY SSA28 SSA29 SSA30 SSA31 SSA32 SSA33 SSA34 SSA35;
f5 BY PFA36 PFA37 PFA38 PFA39 PFA40;
LSS BY f1 f2 f3 f4 f5;
TIA10 WITH TIA7;
SSA34 WITH SSA29;
PFA37 WITH PFA36;
TIA12 WITH TIA3;
OUTPUT:
stdyx;
sampstat;
modindices (10); ! reduces chi square by 10
```

Model Fit

There was only one more correlation between error terms that would decrease the chi square by a minimum of 10. However, the model fit information remained the same. Therefore, I chose to stop correlating error terms at this stage.

The final model fit statistics indicate a poor fitting model: RMSEA = .06, CFI = .84, TLI = .83, and SRMR = .08.

The following pages include the final standardized model results, r-square values, and the graphical output of the second-order CFA model of the LSS.

MODEL FIT	INFORMATION			
Number of	Free Parameters		114	
Loglikeli	hood			
	HO Value H1 Value		291.533 723.389	
Informati	on Criteria			
	Akaike (AIC) Bayesian (BIC) Sample-Size Adjusted BIC (n* = (n + 2) / 24)	27	811.067 235.556 874.000	
Chi-Squar	e Test of Model Fit			
[Value Degrees of Freedom P-Value	1	136.289 551 0.0000]
RMSEA (Ro	ot Mean Square Error Of Approxi	imat	ion)	
	Estimate 90 Percent C.I. Probability RMSEA <= .05		0.059 0.054 0.001	0.064
CFI/TLI				
	CFI TLI		0.838 0.825	
Chi-Squar	e Test of Model Fit for the Bas	seli	ne Model	
	Value Degrees of Freedom P-Value	4	201.715 595 0.0000	
SRMR (Sta	ndardized Root Mean Square Resi	idua	1)	
	Value		0.079	

Standardized Model Results

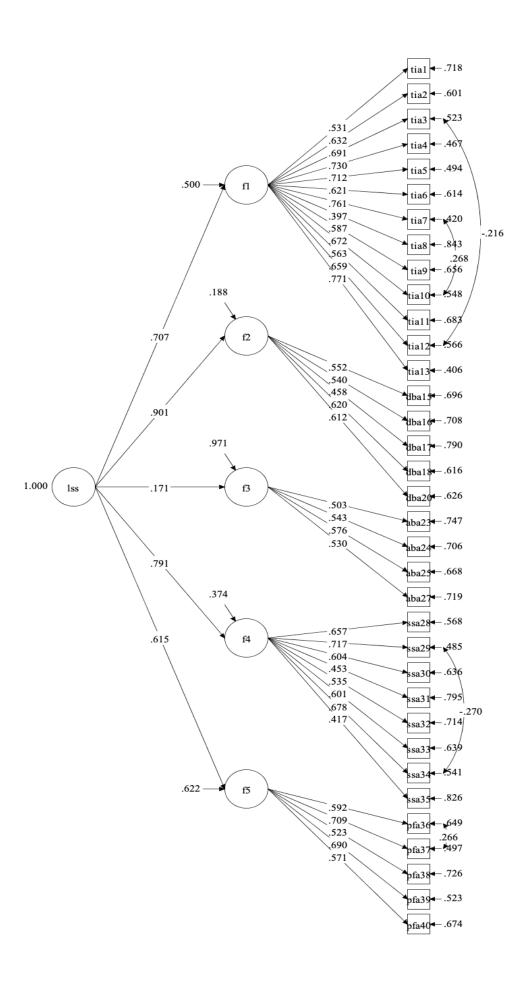
STDYX Standardization

	Estimate	S.E.	Est./S.E.	Two-Tailed P-Value
F1 B	Y			
TIA1	0.531	0.044	12.059	0.000
TIA2	0.632	0.037	16.971	0.000
TIA3	0.691	0.033	20.755	0.000
TIA4	0.730	0.030	24.522	0.000
TIA5	0.712	0.031	22.761	0.000
TIA6	0.621	0.038	16.303	0.000
TIA7	0.761	0.027	27.834	0.000
TIA8	0.397	0.051	7.781	0.000
TIA9	0.587	0.040	14.544	0.000
TIA10 TIA11	0.672 0.563	0.035 0.042	19.461 13.436	0.000
TIA11	0.659	0.042	18.478	0.000
TIA13	0.771	0.026	29.207	0.000
IIAIJ	0.771	0.020	27.207	0.000
F2 B	Y			
DBA15	0.552	0.050	11.072	0.000
DBA16	0.540	0.052	10.452	0.000
DBA17	0.458	0.058	7.969	0.000
DBA18	0.620	0.045	13.733	0.000
DBA20	0.612	0.047	13.035	0.000
	Υ	0.064	7 007	0 000
ABA23 ABA24	0.503 0.543	0.064 0.064	7.807 8.486	0.000
ABA25	0.576	0.063	9.075	0.000
ABA27	0.530	0.064	8.304	0.000
1101107	01330	0.001	0.001	0.000
F4 B	Y			
SSA28	0.657	0.038	17.117	0.000
SSA29	0.717	0.036	19.781	0.000
SSA30	0.604	0.042	14.342	0.000
SSA31	0.453	0.051	8.891	0.000
SSA32	0.535	0.047	11.402	0.000
SSA33 SSA34	0.601 0.678	0.042 0.040	14.315 17.064	0.000
SSA34 SSA35	0.417	0.040	7.915	0.000
BBBBB	0.417	0.055	7.913	0.000
F5 B	Y			
PFA36	0.592	0.051	11.670	0.000
PFA37	0.709	0.043	16.501	0.000
PFA38	0.523	0.052	10.050	0.000
PFA39	0.690	0.043	16.148	0.000
PFA40	0.571	0.049	11.712	0.000
	••			
	Υ 0 707	0.046	1E 420	0 000
F1 F2	0.707 0.901	0.046 0.049	15.430 18.481	0.000
F3	0.901	0.049	2.033	0.042
F4	0.791	0.045	17.766	0.000
F5	0.615	0.058	10.539	0.000

R-Square

R-SQUARE

0bserved				Two-Tailed
Variable	Estimate	S.E.	Est./S.E.	P-Value
TIA1	0.282	0.047	6.030	0.000
TIA2	0.399	0.047	8.486	0.000
TIA3	0.477	0.046	10.377	0.000
TIA4	0.533	0.043	12.261	0.000
TIA5	0.506	0.044	11.380	0.000
TIA6	0.386	0.047	8.152	0.000
TIA7	0.580	0.042	13.917	0.000
TIA8	0.157	0.040	3.891	0.000
TIA9	0.344	0.047	7.272	0.000
TIA10	0.452	0.046	9.731	0.000
TIA11	0.317	0.047	6.718	0.000
TIA12	0.434	0.047	9.239	0.000
TIA13	0.594	0.041	14.604	0.000
DBA15	0.304	0.055	5.536	0.000
DBA16	0.292	0.056	5.226	0.000
DBA17	0.210	0.053	3.984	0.000
DBA18	0.384	0.056	6.867	0.000
DBA20	0.374	0.057	6.518	0.000
ABA23	0.253	0.065	3.904	0.000
ABA24	0.294	0.069	4.243	0.000
ABA25	0.332	0.073	4.538	0.000
ABA27	0.281	0.068	4.152	0.000
SSA28	0.432	0.050	8.559	0.000
SSA29	0.515	0.052	9.890	0.000
SSA30	0.364	0.051	7.171	0.000
SSA31	0.205	0.046	4.445	0.000
SSA32	0.286	0.050	5.701	0.000
SSA33	0.361	0.050	7.158	0.000
SSA34	0.459	0.054	8.532	0.000
SSA35	0.174	0.044	3.957	0.000
PFA36	0.351	0.060	5.835	0.000
PFA37	0.503	0.061	8.251	0.000
PFA38	0.274	0.054	5.025	0.000
PFA39	0.477	0.059	8.074	0.000
PFA40	0.326	0.056	5.856	0.000
Latent				Two-Tailed
Variable	Estimate	S.E.	Est./S.E.	P-Value
F1	0.500	0.065	7.715	0.000
F2	0.812	0.088		0.000
F3	0.029	0.029		0.309
F4	0.626	0.071		0.000
F5	0.378	0.072		0.000
			3.207	3.000



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Appendix A

Leadership Scale for Sports (LSS; Chelladurai & Saleh, 1980)

Latent Factors:

- F1: Training and instruction (item #1 to #13)
- F2: Democratic behavior (item #14 to #22)
- F3: Autocratic behavior (item #23 to #27)
- F4: Social support (item #28 to #35)
- F5: Positive feedback (item #36 to #40)

Using the following scale, please circle a number from 1 to 5 to indicate your level of agreement with each of the statements regarding ATHLETE LEADERS on your team.

1	2	3	4	5
Never	Seldom	Occasionally	Often	Always
	25% of	50% of	75% of	
	the time	the time	the time	

The athlete leader(s) on my team...

	Nev	Never		A	Always	
1. See to it that every team member is working to his/her capacity.		2	3	4	5	
2. Explain to team members the techniques and tactics of the sport.	1	2	3	4	5	
3. Pay attention to correcting team members' mistakes.	1	2	3	4	5	
4. Make sure that team members role on the team are understood.	1	2	3	4	5	
5. Instruct team members individually in the skills of the sport.		2	3	4	5	
6. Figure ahead on what should be done.		2	3	4	5	
7. Explain to team members what they should and what they should not do.	1	2	3	4	5	
8. Expect team members to carry out their assignment to the last detail.	1	2	3	4	5	
9. Point out team members' strengths and weaknesses.	1	2	3	4	5	
10. Give specific instructions to team members as to what they should do in every situation.	1	2	3	4	5	
11. See to it that the efforts are coordinated.	1	2	3	4	5	
12. Explain how team members contributions fits into the total picture.	1	2	3	4	5	
13. Specify in detail what is expected of team members.	1	2	3	4	5	

14. Ask for the opinion of team members on strategies for specific competitions.	1	2	3	4	5
15. Get team members approval on important matters before going ahead.	1	2	3	4	5
16. Let fellow team members share in decision making.	1	2	3	4	5 5
17. Encourage team members to make suggestions for ways of conducting practices.	1	2	3	4	5
18. Let team members share in discussion about goals for the team		2	3	4	5
as a whole (e.g., the number of wins over the following month). 19. Let team members try their own way even if they make mistakes.		2	3	4	5
20. Ask for the opinion of team members on important team matters.	1	2	3	4	5
21. Let team members work at their own speed.	1	2	3	4	5
22. Let team members decide on the plays to be used in a game.	1	2	3	4	5
23. Work relatively independent of other team members.	1	2	3	4	5
24. Not explain his/her/their action(s).	1	2	3	4	5
25. Refuse to compromise a point.	1	2	3	4	5
26. Keep to himself/herself/themselves.	1	2	3	4	5
27. Speak in a manner not to be questioned.	1	2	3	4	5
28. Help team members with their personal problems.	1	2	3	4	5
29. Help team members settle their conflicts.	1	2	3	4	5
30. Look out for the personal welfare of team members.	1	2	3	4	5
31. Do favors for team members.	1	2	3	4	5
32. Express care for other team members.	1	2	3	4	5
33. Encourage team members to confide in him/her/them.	1	2	3	4	5
34. Encourage close and informal relations with team members.	1	2	3	4	5
35. Invite team members to his/her/their home(s).	1	2	3	4	5
36. Compliment a team member for his/her performance in front of others.	1	2	3	4	5
37. Tell a team member when he/she does a particularly good job.	1	2	3	4	5
38. See that a team member is rewarded for a good performance.	1	2	3	4	5
39. Express appreciation when a team member performs well.	1	2	3	4	5
40. Give credit when credit is due.	1	2	3	4	5

Appendix B

