Title

example 26 — Fitting a model with data missing at random

Description Remarks and examples Also see

# Description

sem method(mlmv) is demonstrated using

. use http://www.stata-press.com/data/r13/cfa\_missing (CFA MAR data)

. summarize

Variable	Obs	Mean	Std. Dev.	Min	Max
id	500	250.5	144.4818	1	500
test1	406	97.37475	13.91442	56.0406	136.5672
test2	413	98.04501	13.84145	62.25496	129.3881
test3	443	100.9699	13.4862	65.51753	137.3046
test4	417	99.56815	14.25438	53.8719	153.9779
taken	500	3.358	.6593219	2	4

. notes

\_dta:

1. Fictional data on 500 subjects taking four tests.

2. Tests results M.A.R. (missing at random).

3. 230 took all 4 tests

4. 219 took 3 of the 4 tests

5. 51 took 2 of the 4 tests

6. All tests have expected mean 100, s.d. 14.

See [SEM] intro 4 for background.

## **Remarks and examples**

stata.com

Remarks are presented under the following headings:

Fitting the model with method(ml) Fitting the model with method(mlmv) Fitting the model with the Builder

## Fitting the model with method(ml)

We fit a single-factor measurement model.

		5	x			
	test1	test2		est3 ε <sub>3</sub>	test4	
. sem (test1 t (270 observat: Endogenous van Measurement: Exogenous var:	test2 test3 t ions with mis riables test1 test2 f iables	est4 <- X), sing values test3 test4	nolog excluded)	)		
Structural equ Estimation met Log likelihood ( 1) [test1]	Lation model thod = ml d = -3464 ]X = 1	. 3099		Number	of obs =	230
	Coef.	OIM Std. Err.	z	P> z	[95% Conf.	Interval]
Measurement test1 <- X _cons	1 96.76907	(constraine .8134878	ed) 118.96	0.000	95.17467	98.36348
test2 <- X _cons	1.021885 92.41248	.1183745 .8405189	8.63 109.95	0.000	.789875 90.7651	1.253895 94.05987
test3 <- X _cons	.5084673 94.12958	.0814191 .7039862	6.25 133.71	0.000	.3488889 92.7498	.6680457 95.50937
test4 <- X _cons	.5585651 92.2556	.0857772 .7322511	6.51 125.99	0.000	.3904449 90.82042	.7266853 93.69079
<pre>var(e.test1) var(e.test2) var(e.test3) var(e.test4) var(X)</pre>	55.86083 61.88092 89.07839 93.26508 96.34453	10.85681 11.50377 8.962574 9.504276 16.28034			38.16563 42.985 73.13566 76.37945 69.18161	81.76028 89.08338 108.4965 113.8837 134.1725
LR test of mod	del vs. satur	ated: chi2(2	2) =	0.39,	Prob > chi2 =	0.8212

Notes:

- 1. This model was fit using 230 of the 500 observations in the dataset. Unless you use sem's method(mlmv), observations are casewise omitted, meaning that if there is a single variable with a missing value among the variables being used, the observation is ignored.
- 2. The coefficients for test3 and test4 are 0.51 and 0.56. Because we at StataCorp manufactured these data, we can tell you that the true coefficients are 1.
- 3. The error variance for e.test1 and e.test2 are understated. These data were manufactured with an error variance of 100.
- 4. These data are missing at random (MAR), not missing completely at random (MCAR). In MAR data, which values are missing can be a function of the observed values in the data. MAR data can produce biased estimates if the missingness is ignored, as we just did. MCAR data do not bias estimates.

### Fitting the model with method(mlmv)

. sem (test1 test2 test3 test4 <- X), method(mlmv) nolog Endogenous variables Measurement: test1 test2 test3 test4 Exogenous variables Latent: X (output omitted) Structural equation model Number of obs = 500 Estimation method = mlmv Log likelihood = -6592.9961 ( 1) [test1]X = 1

	OIM						
	Coef.	Std. Err.	Z	P> z	[95% Conf.	Interval]	
Measurement test1 <-							
Х	1	(constrain	ed)				
_cons	98.94386	.6814418	145.20	0.000	97.60826	100.2795	
test2 <-							
Х	1.069952	.1079173	9.91	0.000	.8584378	1.281466	
_cons	99.84218	.6911295	144.46	0.000	98.48759	101.1968	
test3 <-							
Х	.9489025	.0896098	10.59	0.000	.7732706	1.124534	
_cons	101.0655	.6256275	161.54	0.000	99.83928	102.2917	
test4 <-							
Х	1.021626	.0958982	10.65	0.000	.8336687	1.209583	
_cons	99.64509	.6730054	148.06	0.000	98.32603	100.9642	
var(e.test1)	101.1135	10.1898			82.99057	123.1941	
<pre>var(e.test2)</pre>	95.45572	10.79485			76.47892	119.1413	
<pre>var(e.test3)</pre>	95.14847	9.053014			78.9611	114.6543	
<pre>var(e.test4)</pre>	101.0943	10.0969			83.12124	122.9536	
var(X)	94.04629	13.96734			70.29508	125.8225	

LR test of model vs. saturated: chi2(2) = 2.27, Prob > chi2 = 0.3209

Notes:

- 1. The model is now fit using all 500 observations in the dataset.
- 2. The coefficients for test3 and test4—previously 0.51 and 0.56—are now 0.95 and 1.02.
- 3. Error variance estimates are now consistent with the true value of 100.
- 4. Standard errors of path coefficients are mostly smaller than reported in the previous model.
- 5. method(mlmv) requires that the data be MCAR or MAR.
- 6. method(mlmv) requires that the data be multivariate normal.

#### Fitting the model with the Builder

Use the diagram above for reference.

1. Open the dataset.

In the Command window, type

- . use http://www.stata-press.com/data/r13/cfa\_missing
- 2. Open a new Builder diagram.

Select menu item Statistics > SEM (structural equation modeling) > Model building and estimation.

3. Create the measurement component for X.

Select the Add Measurement Component tool, <sup>39</sup>, and then click in the diagram about one-third of the way down from the top and about halfway in from the left.

In the resulting dialog box,

- a. change the Latent variable name to X;
- b. select test1, test2, test3, and test4 by using the Measurement variables control;
- c. select Down in the Measurement direction control;
- d. click on OK.

If you wish, move the component by clicking on any variable and dragging it.

- 4. Estimate.
  - Click on the Estimate button, *in the Standard Toolbar*. In the resulting dialog box,
    - a. select the Model tab;
    - b. select the Maximum likelihood with missing values radio button;
    - c. click on OK.

You can open a completed diagram in the Builder by typing

. webgetsem cfa\_missing

### Also see

[SEM] **intro 4** — Substantive concepts

[SEM] sem option method() — Specifying method and calculation of VCE