

Path Analysis with Latent Variables

In a fashion analogous to Path Analysis with manifest variables, Path Analysis with latent variables allows researchers to **test putative causal relationships among latent variables**. The structural equations are as follows:

$$\boldsymbol{\eta} = \mathbf{B}\boldsymbol{\eta} + \boldsymbol{\Gamma}\mathbf{x} + \boldsymbol{\zeta} \quad (1)$$

The **reduced form** of (1) which results from solving (1) for $\boldsymbol{\eta}$ is

$$\boldsymbol{\eta} = (\mathbf{I} - \mathbf{B})^{-1}\boldsymbol{\Gamma}\mathbf{x} + (\mathbf{I} - \mathbf{B})^{-1}\boldsymbol{\zeta} . \quad (2)$$

The variables on the y-side are explained as follows:

$$\mathbf{y} = \boldsymbol{\Lambda}_y\boldsymbol{\eta} + \boldsymbol{\varepsilon} \quad (3)$$

Inserting (2) into (3) yields

$$\mathbf{y} = \boldsymbol{\Lambda}_y(\mathbf{I} - \mathbf{B})^{-1}\boldsymbol{\Gamma}\mathbf{x} + \boldsymbol{\Lambda}_y(\mathbf{I} - \mathbf{B})^{-1}\boldsymbol{\zeta} + \boldsymbol{\varepsilon} . \quad (4)$$

In words, the path model with latent variables involves

- ▶ **exogenous factors**, that is, factors used to explain other factors; these are the factors ‘**on the x-side**’
- ▶ **endogenous factors**, that is, factors explained (‘caused’) by exogenous factors; these are the factors ‘**on the y-side**’; and
- ▶ **mediating factors**, that is, factors between exogenous and endogenous factors; mediating factors can be either on the x-side or on the y-side

Notice that the only difference between manifest and latent variable path analysis is that whereas manifest variable path analysis relates observed variables to each other, **latent variable path analysis relates factors to each other.**

Matrices involved:

1. On the x-side of the model

- ▶ Λ_x : loadings of x-variables on ξ -factors (NX x NK)
- ▶ Θ_δ : variance/covariance matrix of residuals of x-variables (NX x NX)
- ▶ Φ : variance covariance matrix of ξ -factors (NK x NK)

2. On the y-side of the model

- ▶ Λ_y : loadings of y-variables on η -factors (NY x Ne)
- ▶ Θ_ϵ : variance/covariance matrix of residuals of y-variables (NY x NY)
- ▶ B : structural matrix of (asymmetric) relationships between η -factors (NE x NE)
- ▶ Ψ : variance/covariance matrix of η -factors (NE x NE)

3. Relating the x- and the y-side of the model

- ▶ Γ : structural matrix of (asymmetric) relationships between factors on the x-side (ξ -factors) and factors on the y-side (η -factors)

Thus, the path model with latent variables can be expressed using the following three terms:

1. **The measurement model on the x-side**

$$\mathbf{x} = \Lambda_x \boldsymbol{\xi} + \boldsymbol{\delta}, \quad (5)$$

2. **The Structural Equation model**

$$\boldsymbol{\eta} = \mathbf{B}\boldsymbol{\eta} + \Gamma\boldsymbol{\xi} + \boldsymbol{\zeta} \quad (6)$$

3. **The measurement model on the y-side**

$$\mathbf{y} = \Lambda_y \boldsymbol{\eta} + \boldsymbol{\varepsilon}. \quad (7)$$

Data Example (Forest Succession Simulation)

Sample: N = 89 forest sample plots

Variables: % overstory and % climax species, measured in four consecutive decades: O1, C1, O2, C2, O3, C3, O4, D4.

Model:

- ▶ the manifest variables constitute factors of physical change, each of which has two indicators: O. and C.

Results (all parts of model specified at the y-side)

- ▶ excellent fit in all respects