

# ... of Structural Equation Modeling

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THE POWER TO KNOW。

## **OVERVIEW**

#### Introduction

- What is SEM?
- Connections with
  - Factor analysis (not PCA)
  - Regression analysis
- Path diagrams

Hands on Examples

- Data for Demo: COVID-19
- Model specification and interpretation
- Answer specific questions
  - Confirmatory factor analysis
  - Multivariate Regression
- Wrap up: CFA & Regression

## What is SEM?



#### Fundamental SEM Examples SEM Path Diagram Elements Y regressed on X Х Υ Ζ Observed Latent variable Variable 1 Latent Constant Variable Variance or **Regression or** Covariance Loading W Х Υ

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## **SEMs as Path Diagrams**



## Why Use SEM?



- Unobserved variables
- Account for measurement error
- Sequential relations between variables (observed/unobserved)
- Missing data

## **SEM Terminology**



### LV Indicators:

Variables caused by unobserved variables

#### Uniqueness:

Variance not explained by LV: Systematic (unique to MV) plus measurement error

## **SEM Analysis**

#### Shift in focus

Multivariate analysis of *covariance* structures (and means)

**Data** Variances and covariances (and means)

**Residuals** WRT variances and covariances (and means)

**Degrees of freedom** WRT variances and covariances (and means)

OSF_COVID_Scale_Study2.jmp										
♥ OSF_COVID_Scale_Study      Notes Start Date     SEM: 6-Factor CFA     SEM: Threats> Well-Being		<ul> <li>236/0 Cols</li> <li>1</li> <li>2</li> </ul>	BDW_2	BDW_3 6	BDW_4 4	BDW_5	BDW_6 6	BDW_7 6	BDW_8	
Covariance Matrix										
	BDW_2	BDW_3	BDW	_4	BDW_5	BI	DW_6	BDW	/_7	BDW_8
BDW_2	2.86174	-1.60938	1.515	13	1.59817	-1.2	4045	1.899	967 -	1.48280
BDW_3	-1.60938	3.30554	-1.543	42 -	1.43866	1.6	62067	-1.505	560	2.24953
BDW_4	1.51513	-1.54342	2.742	92	1.15966	-1.4	9853	1.636	512 -	1.43812
BDW_5	1.59817	-1.43866	1.159	66 3	3.48178	-1.0	1895	1.351	- 102	1.52319
BDW_6	-1.24045	1.62067	-1.498	53 -	1.01 <mark>8</mark> 95	2.8	84589	-1.514	172	1.63232
BDW_7	1.89967	-1.50560	1.636	12 <sup>·</sup>	1.35102	-1.5	51472	3.123	378 -	1.37096
BDW_8	-1.48280	2.24953	-1.438	12 -	1.52319	1.6	3232	-1.370	)96	3.06218
All rows Selected	55U 0	16	5	3	5	6	5	6	2	
Excluded	0	17	2	7	1	3	5	3	3	
Hidden Labelled	0	18	3	6	2	1	5	3	5	
	· ·	20	2	6	1	5	7	1	6	
		21	4	5	3	6	6	5	6	1





## **Data for Demo**



How do Perceived Threats of COVID-19 Impact Well-Being and Public Health Behaviors

#### Integrated COVID-19 Threat Scale

The integrated COVID-19 threat scale has 10 items (random order). Five items assess perceived *realistic threats* of the COVID-19 pandemic. Five items assess perceived *symbolic threats* of the COVID-19 pandemic.

**Preamble:** On March 11th, 2020 the World Health Organization officially declared the COVID-19, a viral disease that has swept the globe, a pandemic. How much of a **threat**, if any, is the coronavirus outbreak for ...



## **Using SEM to Answer Specific Questions**

- Exploratory factor analysis Confirmatory
- factor analysis
- Assessing measurement
- 1. How do we measure *perceptions* of COVID-19 threats?
  - Two types of threat
- 2. Do perceptions of COVID-19 threats predict
  - Well-being markers

Public health behaviors

- Equality constraints
- Model comparisons
- Are offects of each type of threat on outcome
- 3. Are effects of each type of threat on outcomes equal?

- Simple regression
- Multiple regression
- Path analysis (multivariate multiple regression)

## Demo

## **THANK YOU**

**Questions?**