

# ADVANCED DATA ANALYSIS FOR PSYCHOLOGICAL SCIENCE

## Part 2. Introduction to multivariate modeling

**Luca Menghini Ph.D.**

luca.menghini@unipd.it

\*\*\*





Master degree in Developmental and Educational Psychology

University of Padova

2023-2024




## Outline of Part 2

- **sem() intro:** Gentle introduction to the world of structural equation modeling (SEM)
- **Path analysis:** Introduction to path analysis (aka SEM with observed variables) and focus on *mediation models*
- **Data structure:** How to approach a multivariate data structure, how to manipulate and pre-process multivariate data 
- **Model fit & evaluation:** How to fit a path analysis in R, to evaluate model fit, compare multiple models, and interpret model results 
- **cfa():** How to conduct a confirmatory factor analysis (CFA) and to interpret its results 
- **Related topics:** In-depth topics related to multivariate modeling (e.g., cross-lagged panel models, multilevel and Bayesian SEM) 

---

 = not for the exam

 = exercises with R (bring your laptop!)

# Factor analysis: rationale

# Exploratory vs. Confirmatory factor analysis

# Exploratory factor analysis

Principal component analysis vs. Common factor analysis(?)

# Confirmatory factor analysis

# Case study: Validation of AMMSA Scale in Mexican University Students

<https://osf.io/pkm4f/>

# Credits

The present slides are partially based on:

- Altoè, G. (2023) Corso Modelli lineari generalizzati ad effetti misti - 2023.  
<https://osf.io/b7tkp/>
- Beaujean, A. A. (2014) Latent Variable Modeling Using R. A Step-by-Step Guide. New York: Routledge
- Finch, W. H., Bolin, J. E., Kelley, K. (2014). Multilevel Modeling Using R (2nd edition). Boca Raton: CRC Press
- Pastore, M. (2015). Analisi dei dati in psicologia (e applicazioni in R). Il Mulino.



## Useful resources

- Baayen, R. H., Davidson, D. J., & Bates, D. M. (2008). Mixed-effects modeling with crossed random effects for subjects and items. *Journal of memory and language*, 59(4), 390-412.
- Bliese, P. (2022). Multilevel modeling in R (2.7).  
[https://cran.r-project.org/doc/contrib/Bliese\\_Multilevel.pdf](https://cran.r-project.org/doc/contrib/Bliese_Multilevel.pdf)
- McElreath, R. (2020). Statistical rethinking: A Bayesian course with examples in R and Stan. Chapman and Hall/CRC.
- Pinheiro, J., & Bates, D. (2006). Mixed-effects models in S and S-PLUS. Springer science & business media.  
 see also Bates, D. (2022). lme4: Mixed-effects modeling with R.  
<https://stat.ethz.ch/~maechler/MEMo-pages/IMMwR.pdf>