

# *Structural Equation Models*

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# What are Structural Equation Models?

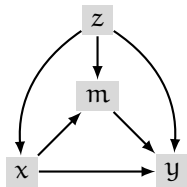
- ▶ Structural equation models (SEM) are
  1. Systems of statistical regression models ...
  2. ...that represent hypothetical causal models.
- ▶ As regression models, they generally include *latent* variables.
- ▶ Path analysis and SEM can be seen as either identical, or SEM can be seen as path analysis with additional latent variables.

## *A very brief history*

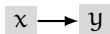
- ▶ SEM began with the path analysis work of biologist Sewall Wright around 1920.
- ▶ SEM became more widely used from 1970s onwards, but the focus became centred on algorithms and computer implementation, the peculiarities of linear-normal models, and the causal interpretation of SEM was downplayed or eschewed.
- ▶ Since 2000s, SEM has become increasingly associated with *causal graph theory* (see J. Pearl), and no longer focused on linear-normal models.

# SEM & DAG

- ▶ A SEM model can be represented by a *directed acyclic graph* (DAG), where vertices represent variables and directed edges represent causal relationships
- ▶ For example,



- ▶ For example, we interpret the following to mean that  $x$  causes  $y$ :



## *Regression models and DAGs*

- ▶ Any regression model, or probabilistic model, can be represented by a DAG.
- ▶ All variables, including parameters, are represented by vertices and directed edges represent conditional statistical dependence.
- ▶ A sem is often represented by a *nonparametric* DAG, i.e., where the parameters and functional form of the regression model are not represented.
- ▶ Crucially, directed edges represent causal relationships.

# *Overview of course*

- ▶ Regression models
- ▶ Mediation models, including causal mediation
- ▶ Latent variable models
- ▶ SEM with lavaan and blavaan
- ▶ SEM with stan, brms, etc.