

# Introduction to structural equation modelling - advanced modelling techniques

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- Interactions

- Interactions
- Latent variables

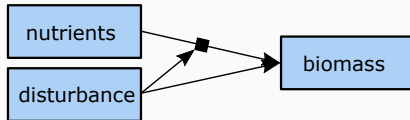
- Interactions
- Latent variables
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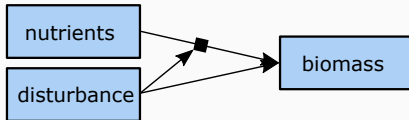
## Interaction questions (Moderation)



- In nature, things often are contingent on each other.

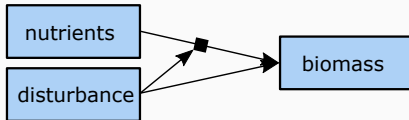


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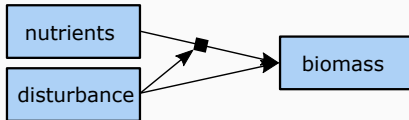
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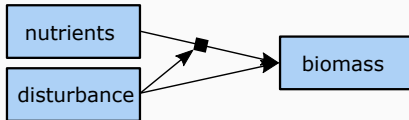
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- For instance, the effect of nutrients on plant growth, may depend on how disturbed the environment is.
- Such a behaviour is called an interaction, which indicates that the effect of the two main effects are different when combined.
- Both positive and negative interactions are possible.
- In regression, the interaction is represented by a coefficient that estimates the effect of the product of the two predictors.

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- 2) Composites

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- Importantly, groups have to be of categorical nature.

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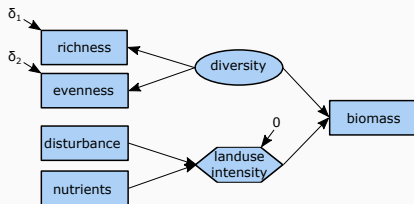
## Interactions (Moderation)

- Lavaan allows to introduce equality constraints on various aspects via the `group.equal` argument:

```
mod <- sem(model, group = "age_class", group.equal =  
c("regressions"), data = dd)
```

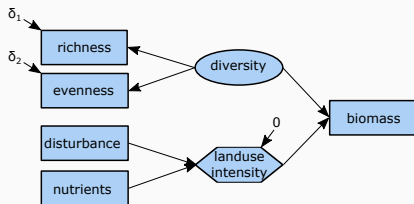
```
group.equal=c(  
  "intercepts",  
  "means",  
  "regressions",  
  "residuals",  
  "residual.covariances")
```

## Latent variables



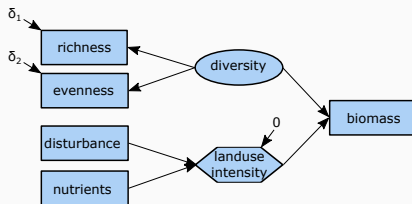
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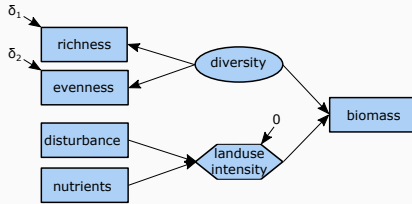
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- Latent variables are variables that are unobserved, but whose influence can be summarized through one or more indicator variables.
- They are useful for capturing complex or conceptual properties of a system that are difficult to quantify or measure directly.
- First, the direction of causality is reversed from what you might expect: from the latent variables to the observed variable. This is because the indicator variable is an emergent manifestation of the

# Composite variables

Composite variables specify the influences of collections of other variables (examples)

