## Session 6

Coping with missing data

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Session 6: Coping with missing data

#### **Outline**

- When tests are missing at random -> easy (template\_huiwalter)
- When tests are missing structurally -> does the test missingness correspond with expected prevalence?
- Removing data for cross-validation purposes

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- MNAR: Missing not at random
  - There is an unknown (or unrecorded) pattern to the missingness

# Practical session 6

#### Points to consider

- 1. How does missing-at-random data impact your results?
- 2. What about if you have data using confirmatory tests?
- 3. How can we use cross-validation as a method of checking assumptions?

## Summary

- Observations that are MCAR are trivial to deal with using JAGS
- We can also treat MAR observations as if they are MCAR as long as the reason for missingness does not confound with expected prevalence, or we allow prevalence to differ between groups where the structural missingness differs
- MNAR is bad news
- Deliberately making observations missing is a good way to assess model assumptions