# **Tutorial on the R package ReplicationSuccess**

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#### Installation

# Replication studies

General things about replication studies / Replication crisis

# Data sets / examples

Show examples

#### **Criteria for replication success**

 Discuss different criteria for replication success – Discuss problems: Inflation, shrinkage, heterogeneity

## **Design of replication studies**

 Discuss sample size calculation important and depends on analysis strategy – Discuss what was done in projects – Ad hoc shrinkage

## Statistical framework of package

normality assumption – relative quantities – DesignPrior:
Predictive and conditional

# **Significance**

- powerSignficance + arguments sampleSizeSignificance
- + arguments exercises

# **Comparison of effect size**

- predictionInterval - sampleSizePI - sampleSizePIwidth

#### **Reverse Bayes**

– pSceptical – powerReplicationSuccess – sampleSizeReplicationSuccess

#### **Outlook**

- Interim - Heterogeneity - EB shrinkage

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