
Study Design

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Framework of a Study

- Research Question
- Literature Review
- Method
- Results
- Discussion

Research Question

- A testable question that is based on the problem statement (goals of the study)
- Wording of the question is critical
 - **Difference** questions
 - **Relationship** questions
 - *Determines the method and analyses*
- **THIS IS THE MOST IMPORTANT ISSUE IN DESIGNING A STUDY**

Study Variables

- **Dependent** Variables
 - Outcome measures
 - The events being studied
- **Independent** Variables
 - Conditions/factors
 - Variables you have control over

Method

- Procedure
- Participants
- Measurements
- Analyses

Procedure

- **Within** vs. **Between** subjects studies
- What are the steps of the study
 - What does the robot do and when
 - How does the robot react to humans
- How are the conditions varied
- Where and when conducted
- What instructions are given to subjects

Ordering Effects

- Bias introduced by order in which conditions are presented
 - fatigue, frustration, learning
- Need to **counterbalance** conditions
 - Complete: All possible combinations (randomized testing)
 - Incomplete: Latin Square

A	B	C	D
B	A	D	C
C	D	A	B
D	C	B	A

Participants

- Sample pool
 - Generality of results
- How selected
 - Need to avoid bias
- Number of subjects needed
 - Sufficient for statistical validity

Measurements

- Measurement Types
 - categorical, ordinal, interval (ratio, logarithmic)
- Quantitative Measures
 - e.g. time on task, distance from robot, number of utterances
- Qualitative Measures
 - e.g. facial expressions, topics of utterances

Importance of accuracy and repeatability

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Measurements

- Surveys
 - Semantic Differential
 - Likert-Scale
 - Questionnaires: Closed vs. Open
 - Structured interviews
 - Validated instruments
 - e.g. Godspeed questionnaire
 - Combining questions
 - Cronbach's alpha

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Descriptive Statistics

- Central Tendency
 - mean, median, mode
- Variance
 - range, interquartile, standard deviation

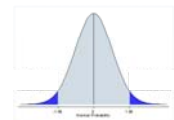
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Statistical Analyses

- Significance testing
 - Type I and Type II errors
 - Rejecting the null hypothesis
 - p-value
 - 1-tailed vs. 2-tailed
 - Parametric vs. non-parametric tests



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Statistical Analyses

- Difference questions
 - chi-square, t-test, ANOVA, ...
 - Main and interaction effects
 - Different tests if measures are related (within) or not (between)
- Relationship questions
 - Phi coefficient, Pearson coefficient, Spearman coefficient, regression, ...

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Study Validity

- Internal Validity
 - Effects that systematically bias the results
 - e.g. order effects, measurement bias, selection bias, experimenter bias, subject bias, ...
- External Validity
 - How generalizable beyond the specifics of the study
 - e.g. population, location, time, day, ...

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IRB

- Institutional Review Board
 - Monitor and review research involving humans and animals
 - Protect rights and welfare of subjects
 - prevent physical or psychological harm
 - explanation of risks and benefits
 - confidentiality
 - informed consent
 - right of refusal to participate

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Some Resources

- Defining a research question
 - <http://www.statpac.com/statistics-book/basics.htm>
- What statistics to use
 - <http://www.csun.edu/~amarenco/Fcs%20682/Whe n%20to%20use%20what%20test.pdf>
 - <http://www.graphpad.com/support/faqid/1790/>
- The Godspeed questionnaire
 - <http://www.bartneck.de/2008/03/11/the-godspeed-questionnaire-series/>

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