#### Vorlesung Fortgeschrittene Softwaretechnik

Wintersemester 2024/25

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Informatik

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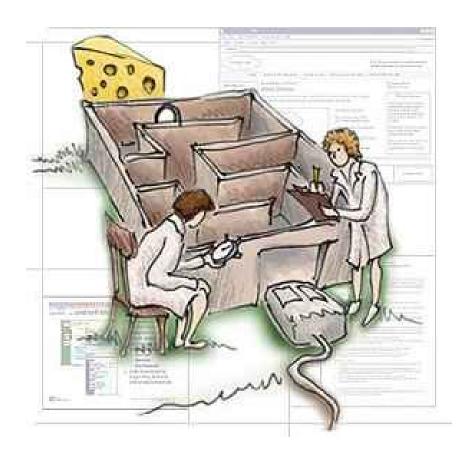


# PLACEBO CHRISTMAS



#### Heute

- Research Design
- Quantitative Analyse



#### Goals of Research



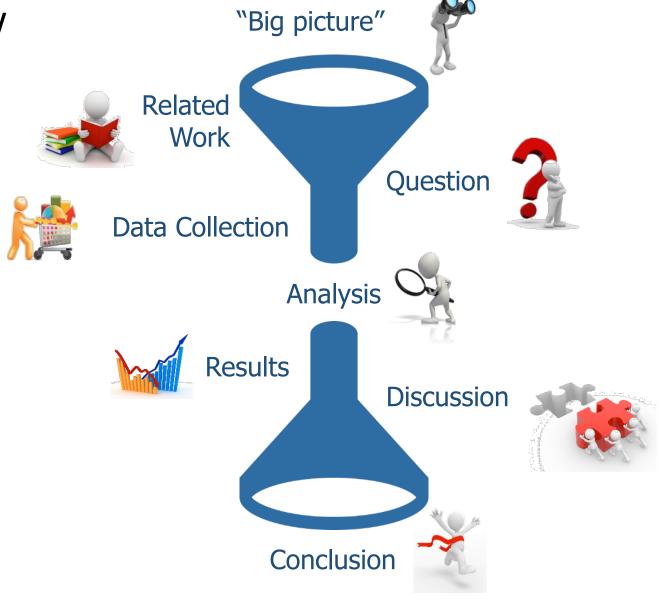
- Observe
- Describe
- Predict
- Explain
- Determine causes of

Phenomena  $\Rightarrow$  **Expand knowledge** 

#### **Examples from Software Engineering research**:

Does tool XY improve program comprehension? How do software developers interact in a pair-programming setting? Is software implemented in statically typed languages less error-prone than software implemented in dynamically typed languages?

#### Scientific Workflow

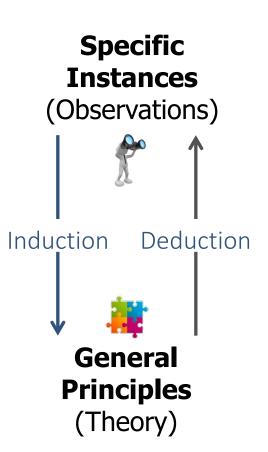


https://explorable.com/research-basics

## What is "Empirical" Research?

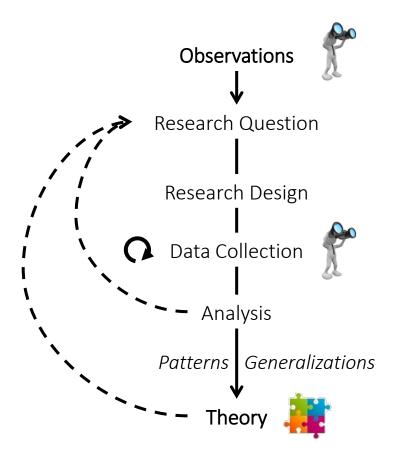
Empirical: "originating in or based on observation or experience"





- There is no "truth" in science, just evidence we trust
- Important property of theories: **falsifiability** (possibility to prove a theory to be false)
- Example: "All swans are white." vs. "There is a god."
- Karl Popper:
  - Theory only scientific if falsifiable
  - Theories cannot be verified, but can be accepted as long as attempts to falsify fail

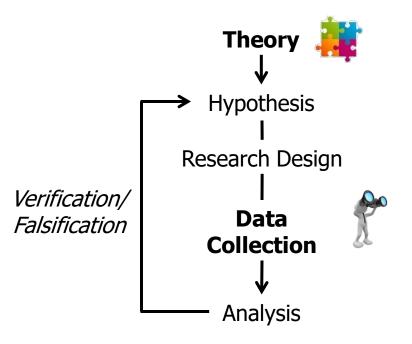
#### Inductive Research



- Exploring new phenomena
- Open-ended
- Process-oriented
- Focus on qualitative data (but quantitative data may also be used)
- Generating new theory from data (grounded theory)
- Reiterating until saturation (constant comparison)

**Example:** How do software developers interact in a pair-programming setting?

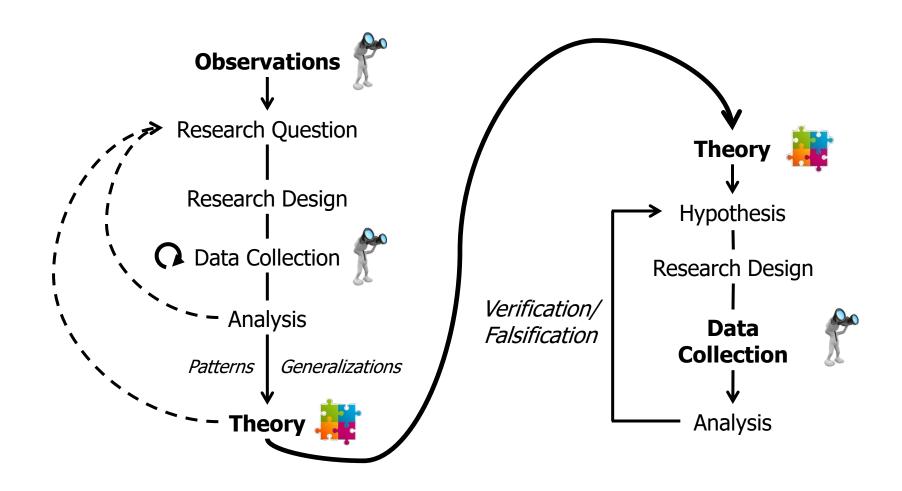
#### Deductive Research



- Confirmatory (testing hypotheses)
- Outcome-oriented (causality)
- Focus on quantitative data (often controlled experiments)
- Operationalization ("Messbarmachung")
- Statistical methods (descriptive statistics or correlations)

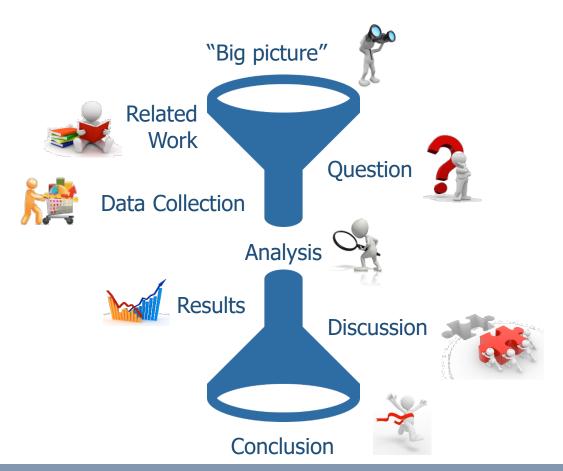
**Example:** (To what extent ...) *Does tool XY* improve program comprehension?

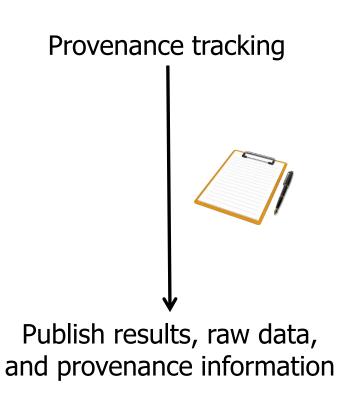
#### "Mixed Methods"



## Properties of "Good" Research

Reproducibility of Research





## Properties of "Good" Research

**Reliability:** "the extent to which an experiment, test, or measuring procedure yields the same results on repeated trials" [Merriam-Webster.com]

**Validity:** "the extent to which conclusions drawn from research provide an accurate description of what happened or a correct explanation of what happens and why"

[methods.sagepub.com]

**Transparency:** "honest and open, not secretive"

[Merriam-Webster.com]

**Reproducibility:** "the ability of an entire experiment or study to be duplicated, either by the same researcher or by someone else working independently."

[en.wikipedia.org]

**Ethical Issues:** "following accepted rules of behavior"

[Merriam-Webster.com]

Good research should be well planned and documented!

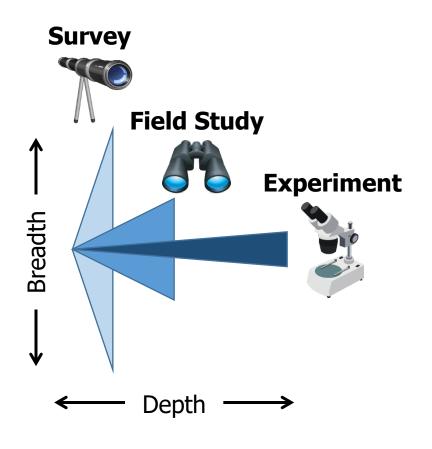


## Research Methods



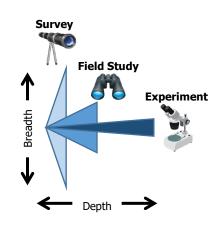
## Basic Research Methods ----





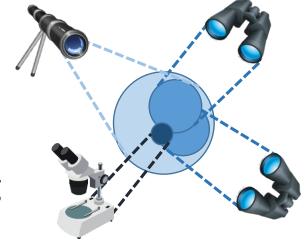
#### Mixed-Methods Research

- Remember goals of research:
  - **Exploration:** Understanding a problem in more detail, making it known to a broader audience, inform future research.
  - Explanation: Developing a theory based on previous explorations and exiting theories.
  - **Prediction:** Use a theory to build causal relationships to make predictions about phenomena.
  - **Demonstration:** Show that something can be done in a particular way (e.g. new tool).
- Each instrument can only help to achieve some of these goals.
- Combine different research instruments to gain both greater breadth and depth of insights.
- Example: Start with exploratory field study and validate results with large online survey.



## Triangulation

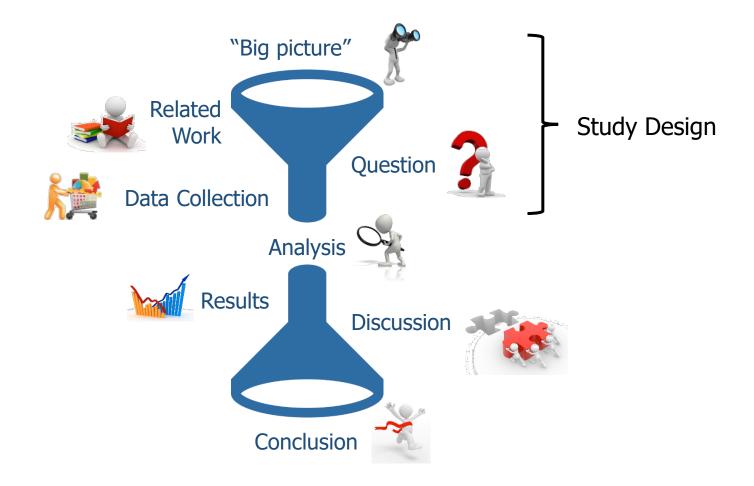
- Increase validity of research by studying a phenomenon from several points of view
- Cross-validation from two or more sources:
  - Different data sources
  - Different aspects of the same phenomenon
  - Different research instruments
  - Different researchers
- Term "triangulation" is an analogy to land surveying



# Research Design



#### Scientific Workflow



## Finding a Research Question

- A research question has to be **precise**, **operational**, small enough to be **feasible**, and should be **relevant**. (Alternative: SMART: specific, measurable, attainable, realistic, time bound)
- **Iterative** process
- Literature review, exploratory research, and discussion.
- Template for formulation of research goal:

We study order to <purpose</pre>) by <method</pre>.

In order to improve software development practices, we study effectiveness of pairprogramming with students at university having single programmers and pairs of programmers in a laboratory experiment.

## Finding a Research Question

Alternative: PICOC

• Population: Who?

Intervention: What or How?

Comparison: Compared to what? (possibly N/A)

Outcome: What are you trying to accomplish / improve?

Context: In what kind of organization / circumstances?



Criteria	Element
Population	Final-year undergraduate students in Software Systems Engineering with work expe-
	rience, e.g., work placements or internships
Intervention	They will evaluate the proposed modelling language (i.e., DMML) and automated
	reasoning
Comparison	DMML will be compared with the $i^*$ modelling framework
Outcome	It is expected that the use of DMML in designing digital motivation would be more
	effective, efficient, useful, and satisfactory in comparison to other goal-oriented mod-
	elling languages
Context	The experiment would be carried on in the context of a business information system

https://cebma.org/faq/what-is-a-picoc/

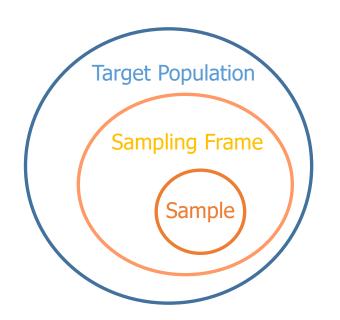
## Population

#### What or who is being studied?

- •Population: Complete set of items that share at least one property in common (e.g. all software developers in the world)
- •Subpopulation: Subset of a population that shares one or more additional properties (e.g. all German software developers)
- Target population: Subset of a population that the researcher wants to draw conclusions about with his/her research (e.g. all software developers in the world or all German Java software developers)
- •Sample: Subset of a population that does not require to share additional properties. Usually drawn from the population using a sampling frame (e.g. list of all software developers working on a project).
- •Unit of observation: Entity described by the data that one analyzes (e.g. individual developers or commits)
- •Unit of analysis: Entity being analyzed in the study (e.g. software development teams or the development activity of developers)

## Sampling

- **Recruiting**: Getting people to participate in the study, selecting artifacts to study
- Probability vs. non-probability sampling
- Sampling influences external validity (generalization of results)
- "Convenience sampling" and "snowball sampling" common

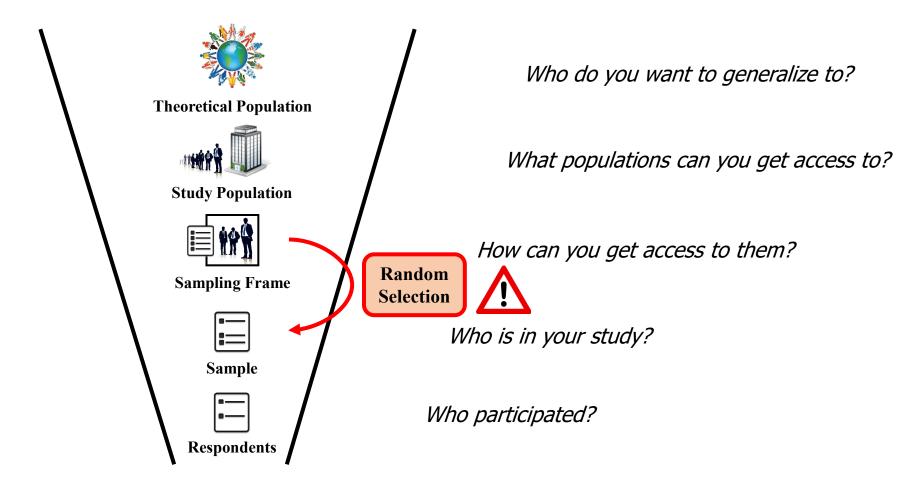


"Real-world" performance bugs

Performance bugs documented as issues in open source GitHub projects

Random Sampling

## Sampling: Ideal Scenario



Based on: http://www.socialresearchmethods.net/kb/sampterm.php

## Sampling: Common Scenario

**Main problem:** Availability of suitable sampling frames, reachability of participants.

→ Reliance on available subjects: convenience sampling, snowball sampling

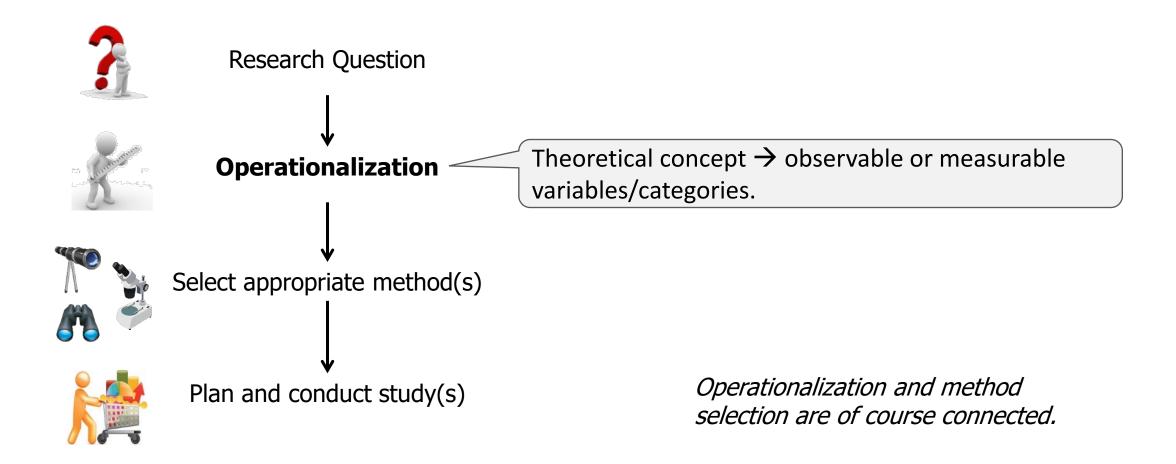


- → Likely leads to **biased samples**:
  - Human participants: Self-selection bias
  - Researchers contact people from their own social and cultural group / select artifacts that they already know
  - Limited generalizability

#### **Strategies:**

- (Try to) select broad cross-section of the target population
- Clear description of sampling approach and participants/selected artifacts
- Take care not to overgeneralize
- Alert readers to the limitations

## Study Design



## Operationalization: Measurement

- "Measure what is measurable, and make measurable what is not so." (attributed to Galileo Galilei)
- Measurement is central to the scientific method
- Mapping from studied object to a scale, e.g.

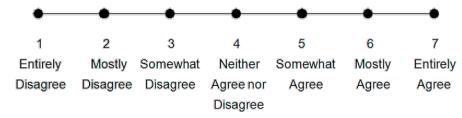
height: people 
$$\to \mathbb{R}^{\geq 0}$$
  
sex: people  $\to$  {male, female, intersex}



- Scale types: nominal (gender), ordinal (very unhappy, unhappy, ..., very happy), interval (temp. °C), ratio scales (temp. K, height)
- Examples from SE: software metrics like bugs per line of code or cyclomatic complexity

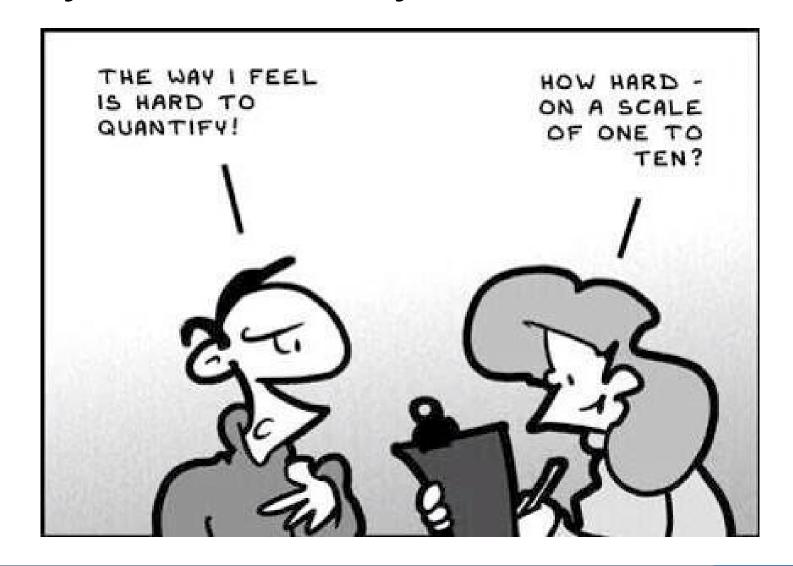
#### Objective vs. Subjective Measures

- Software artifacts: objective measures exist (e.g. software metrics)
- Human subjects:
  - Measuring more difficult
  - Few objective measures can be obtained easily (e.g. demographic data)
  - Many properties cannot be measured directly (e.g. cognitive load, program comprehension)
  - Self-reports: many cognitive biases involved, but strategies exist
  - Likert scale: participant is asked to rate his/her agreement with a statement



• Semantic differential: "measures people's reactions to stimulus words and concepts in terms of ratings on bipolar scales defined with contrasting adjectives at each end" [Heise70]  $\frac{Good}{3} = \frac{1}{2} = \frac{Bad}{3}$ 

## Objective vs. Subjective Measures



## "Measuring" Behavior

• Many sources for behavioral data can be utilized e.g. to analyze usability of a tool or search for usage patterns

- Sources include:
  - Source code repository (commit history)
  - Bug tracking system
  - Electronic traces of social interaction (e.g. mailing list, online discussions, tweets)
  - Video recordings and audio recordings of actual behavior (e.g. screen recordings of tool usage, pair programming sessions)
  - Log files (e.g. from instrumented tools)







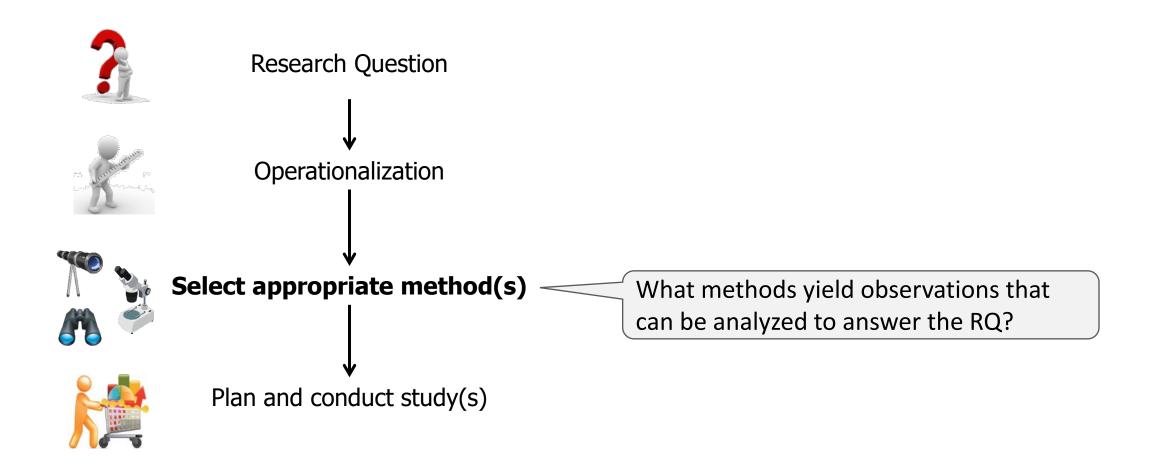






Analysis can be difficult and time-consuming (→ lecture "Qualitative Analysis")

#### From Research Question to Study Design



#### Scientific Workflow

