

# Thesis Seminar Quantitative methods: Surveys, experiments, secondary data, longitudinal data, netnography, neuro-physiological data

### **Dr. Theresa Treffers**

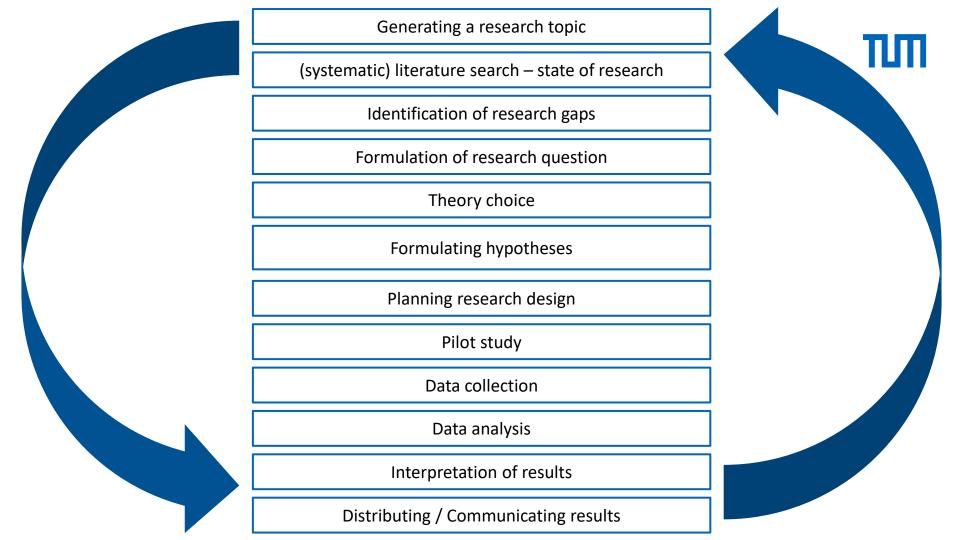
Technical University of Munich

TUM School of Management

Chair for Strategy and Organization

Prof. Dr. Isabell M. Welpe

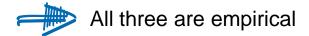




# Which research designs are there?

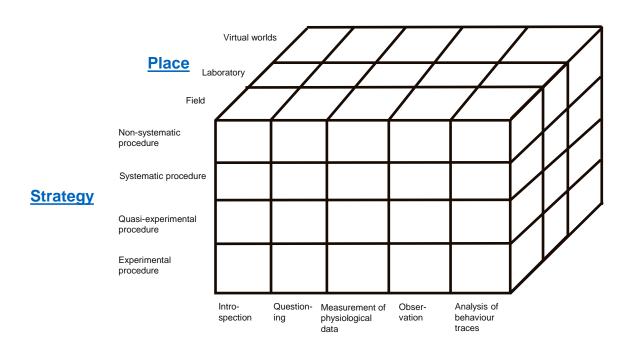


- 1. Qualitative research designs
- 2. Correlative research designs
- 3. Experimental (causal) research designs



# Classification of research designs





**Activities of the researcher** 

# Spotlight on...



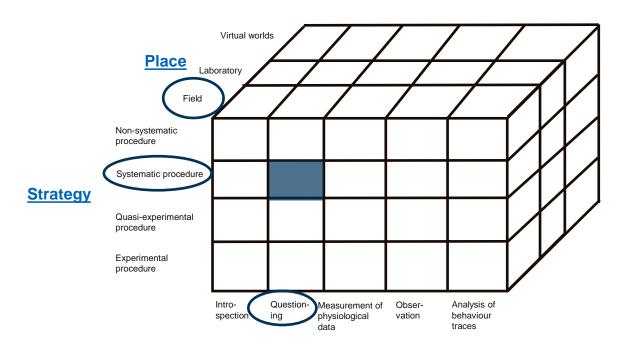




Surveys

# Field surveys





**Activities of the researcher** 

# **Questionnaire design**



- A questionnaire is a rather standardized presentation of questions and statements (=items), that subjects answer
- Differences in attributes are inferred from the subjects' answers
- Theoretical constructs are operationalized with items
- Every latent attribute / construct is measured with several items
- Every item that loads on the same attribute form a scale (factor / variable)

# Components of a questionnaire



- 1. Instructions (response-instructions for participants) Email invitation
- Closed-ended questions and statements (items)
- Given response possibilities (scales)
- 4. Participants answer items through marking a scale level
- 5. Answers to several items / statements are summarized to one factor

# Introduction to a questionnaire



Dear participant,

thank you for participating in our survey.

With this study, the Chair for Strategy and Organization of the Technical University of Munich (Prof. Dr. Isabell Welpe) seeks to better understand the current situation of the generation and implementation of innovative ideas within organizations. This study is exclusively addressed to **employees in a managing position**.

- The completion of this questionnaire will take about 10-15 minutes. For technical reasons, it is not possible to pause the questionnaire once it is started.
- The study solely serves scientific purposes and your answers will not be passed on to
  third parties. Neither your managerial colleagues nor your team members will receive
  your answers to our questions! You and your team members will be matched based on
  a coding system.
- Your answers will only be evaluated in aggregated form and completely anonymously
  by our research team. All information will be treated strictly confidential and stored
  according to the ethical guidelines of the Technical University of Munich.

If you are interested in receiving a summary of this study's results, you can provide your email address at the end of the questionnaire.

I have read and understood the information above. I hereby agree to be at least 18 years old and approve to the use of my data for internal analysis at the Technical University of Munich. I am aware that my participation is voluntary and that I can stop the survey at any time without giving reasons.

Thank you very much for your support!

Tim Kröger, Dr. Theresa Treffers, Dr. Maria Strobel, Prof. Dr. Isabell Welpe Technical University of Munich, Chair for Strategy and Organization <a href="https://www.professors.wi.tum.de/strategy/home/">https://www.professors.wi.tum.de/strategy/home/</a>

For any questions or comments about this study please contact Tim Kröger

# **Privacy statement**



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### **Questionnaire structure**



- Start with "ice breaker" questions, simple questions, interesting questions.
- No sensitive questions at the beginning.
- Questions about the constructs of interest.
- Use filters sparingly.
- Ask about socio-demographics and biographics, e.g., age, gender, education, marital status, functional background in organization etc.
- ...and team features, e.g., team size, team tenure etc.
- ...and about organizational features, e.g., size of the company, service vs production company, industry etc.

# Challenges with questionnaires



- Don't ask unnecessary questions. Always check, why you ask a question!
- Questionnaire should be as short as possible and as long as necessary.
- Questions are inadequate, e.g., are not context-specific, are too sensitive etc.
- Questionnaire design leads to early dropout.

# Response biases and possible solutions



- Social desirability: Measure for statistical control, anonymous answers
- Acquiesence (content-independent agreeableness): variation of scale poles, but watch out when analyzing your data!
- Regression to the mean: avoid central pole in scales and use an even pole number in scales
- Structural effects (Halo effects): variation of construct and item sequence
- Interviewer bias: variation of interviewer
- Self-selection of sample: ...solution depends on sample
- Non-response bias: solution depends on items / sample
  - For items: include a category "don't know"
  - For sample: Test early and late responders

# Item/Scale-Design



### 1. Closed-ended questions

- Limited number of predefined response options
- Participant selects the response option(s) that matches her/his response

### Pro:

Analysis of responses is clear and unambiguous

### Con:

Response options may be too limited



Please specify your gender.

Use **closed-ended questions** if the research question is clear and non-explorative **or** you know the response options that can be expected

# Item/Scale-Design



### 2. Open-ended questions

- Unlimited number of response options, no predefined response
- Usually an empty field or line(s) are provided for entering the response

### Pro:

- Complex answers are possible
- Responses are not limited to the researcher's selection

### Con:

Use **open-ended questions** if the research question is new and unexplored **or** you expect complex answers

- Analysis can be difficult and time-consuming (responses need to be coded)
- Objectivity is difficult to achieve (e.g., correcting an exam)

Bitte stellen Sie im folgenden Textfeld kurz und prägnant die Grundidee der Photosynthese bei Pflanzen dar

# Drop-down AND open category for "other"

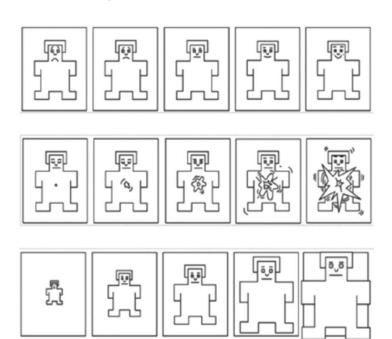


In which functio	nal area of the company d	lo you work?	
Variablenname v_3	Externer Variablenname v_3	int	Functional area
		0	please select
		1	Accounting, Finance, or Controlling
		2	Purchasing
		3	Research & Development
		4	General Management
		5	IT
		6	Customer Service
		7	Logistics or Operations
		8	Marketing
		9	Human Resource
		10	Sales
		11	Administration
		12	Inventory
		13	Production
		14	Technical Services / Maintenance
		15	Other
Variablenname v_4	Externer Variablenname v_4	varchar	Other

### **Scale format**



### 3. Rating scale



### 1. Tell us how much you agree or disagree with the following statements:

	Strongly Agree	Somewhat Agree	Neither agree nor disagree	Somewhat Disagree	Strongly Disagree
I found the website easy to navigate	0	0	•	0	0
I was able to easily find the information I needed	0	0	0	0	0
I found the overall website design to be intuitive	0	•	•	0	•

### Using a scale of 0= Not at all important to 5=Very Important, please rate the following aspects of our service in the restaurant?

	Not at all important O	1	2	3	4	Very Important 5	No Opinion
Speed of Service		F	П				
Friendliness of Staff		Г	Г			Г	
Helpfulness of Staff							
Value for Money		Г			Г	Г	

When purchasing electronic products, how often do	you do each of the fo	ollowing?			
	Never	Rarely	Sometimes	Always	Often
Read Customer Reviews					
Read Experts Reviews and Comments					
Look at technical specs (e.g. dimensions and adapters)					
Watch a video demonstration					
Watch a video submitted from another customer					

### **Scale format**



### 4. Semantic differential



Source: Schaefer & Rotte (2010)

# Self-rating / other-rating



### 1. Self-rating

The following items concern your behavior at work.

Please indicate the extent to which you agree with each of the following statements.

| Strongly disagree | Strongly disagree | Strongly agree | Strongly agre

# 2. Other-rating

Please refer to your colleague <u>#u_firstname# #u_name#</u> when ans	wering the follow	ing qu	estions	5.				
Please indicate the extent to which you agree with each of the following st	atements.							
This colleague								
	never true	never true						
helps others who have been absent.	0	0	0	0	0	0	0	
helps others who have heavy work loads.	0	0	0	0	0	0	0	
helps prient new people even though it is not required	0	0	0	0	0	0	0	

### **Scale formats**



- **Frequencies:** never, rarely, sometimes, often, always
- Intensities: not at all, a little, moderate, quite a bit, very much / extremly
- **Probabilities:** not at all, rather unlikely, likely, rather likely, for sure
- Evaluations: totally wrong, quite wrong, neither, quite right, right
- **Agreeableness:** strongly agree, somewhat agree, neither agree nor disagree, somewhat disagree, strongly disagree...

• ...

Use original answer scales.

# Scientific translation of English measures



### 1. Back-translation

- A native speaker of the target language (e.g., German native), who speaks the language of the measure (e.g., English) well translates items.
- Items are translated back from German to English by another translator.
- Original items are checked with the translated items. If they deviate (strongly), revise. If they do not deviate, translation is ok.

Source: Brislin (1970)

# Scientific translation of English measures



### 2. Translation by more translators

- Items are translated by several persons independently.
- Another person compares these translations and checks for irregularities, different meanings, mistakes etc. This person decides which translation is the best and should be used in the questionnaire.
- In general: All translators should have broad knowledge related to the measure that they should translate.



Convenient data collection

Low costs

Assesses variables that are hard to vary

**Advantages** of surveys

Representativeness

High degree of standardization

Easy to analyze



Low participation rates

Systematic sampling effects

High costs

**Disadvantages** of surveys

Inflexibility

Little control over external influences

Little feedback

### Attention - Common method bias!



Common method variance = "Variance that is attributable to the measurement method rather than to the constructs the measures represent" (Podsakoff, MacKenzie, Lee, & Podsakoff, 2003, p. 879)

### Where can common method variance result from?

### Common rater effect

- Consistency motive
- Implicit theories
- Acquiescence biases

### Item context effects

- Item priming effects
- Item embeddedness
- Scale length

### Item characteristic effect

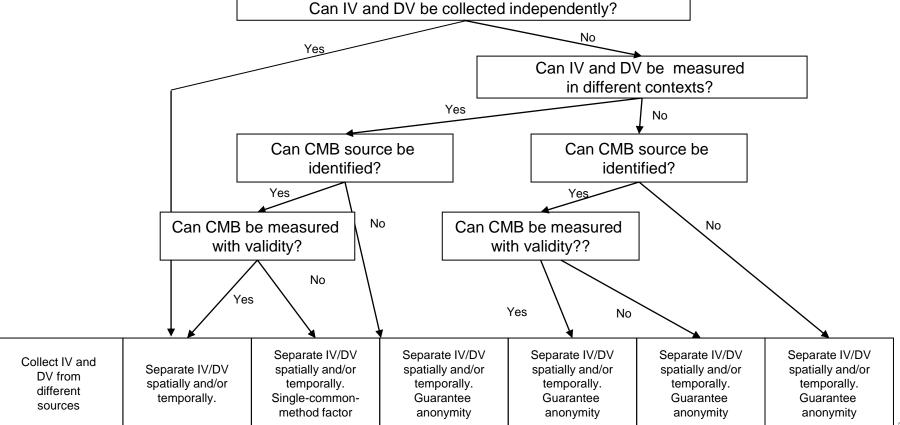
- Item social desirability
- Common scale formats / anchors

### Measurement context effects

- IV and DV measured at same time
- IV and DV measured at same location
- IV and DV measured with same medium

### How to control common method bias





# Survey design



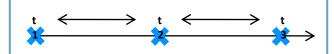


t 1

Advantage: economical

**Disadvantage**: common method bias

### **Longitudinal Studies**



**Advantage**: trends over time **Disadvantage**: long study period

### More than one respondent





**Advantage**: study of interactions, peer- report in addition to self-report **Disadvantage**: high organisational effort

Aim: avoid same time / same source data

# Which psychological tests do you know?





# **Explicit versus implicit tests**



### **Explicit**

- System 2
- Thinking Slow
- Deliberate
- Rational
- Logic-based



evaluations that can be directly expressed or publicly stated

### **Implicit**

- System 1
- Thinking Fast
- Unconscious
- Intuitive
- Emotionally-base



evaluations that occur without conscious awareness towards an attitude, object or the self



- Intelligence: Wechsler Adult Intelligence scale (WAIS-R; Silverstein, 1982)
- Personality: NEO-FFI (Big Five; Costa & McCrae, 1989)
- Interest: Strong Interest Inventory (Donnay & Borgen, 1996)
- Cognition
  - Attention: d2 test of attention (Bates et al., 2004)
  - Creativity: Alternate Uses Task (Guidford, 1967)

### Affect & Mood

- Affect: Positive and Negative Affect Schedule (PANAS; Crawford et al., 2004)
- Stress: Trier Social Stress Test (TSST; Kirschbaum et al., 1993, Individual version; von Dawans et al., 2011; Group version)



# Paper example: Positive and Negative Affect Schedule (PANAS)



J Bus Ethics (2012) 111:179-193 DOI 10.1007/s10551-011-1200-7

### An Examination of the Contribution of Dispositional Affect on Ethical Lapses

D. Jordan Lowe · Philip M. J. Reckers

Received: 13 September 2011/Accepted: 28 December 2011/Published online: 12 January 2012 © Springer Science+Business Media B.V. 2012

Abstract The popular press and academic research has focused primarily on the characteristics of corporate leaders. Subordinates have been studied much less frequently than leaders and yet they play a pivotal role in destructive leadership processes. An area holding significant potential to bring clarity to subordinates' ability to withstand (or succumb) to pressures from superiors is dispositional exaggerated) triggering event to elicit affective states. Fourth, we examined specific affective states rather than examining only general positive and negative valence categories.

Keywords Affect · Passive · Active · Unethical behavior · Conformer · Colluder



**Problem Solving:** The candle problem (Duncker, 1945)

Measures: complex problem solving

Exercise - Test yourself: THE CANDLE PROBLEM

INSTRUCTIONS: PIN THE CANDLE TO THE WALL IN SUCH A WAY THAT WHEN IT IS LIT, NO WAX DRIPS ON THE FLOOR.





Problem Solving: The candle problem (Duncker, 1945)

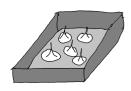
- Many people report an "AHA" experience when finding the solution of an insight problem
- Solution rate becomes higher when presented with the box and the tacks separately
- → Key to solving this task: overcome **functional fixedness**
- Interestingly, paying people for performance decreases solution rates

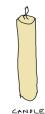
### THE CANDLE PROBLEM

INSTRUCTIONS: PIN THE CANDLE TO THE WALL IN SUCH A WAY THAT WHEN IT IS LIT, NO WAX DRIPS ON THE FLOOR.

### Can you solve it?







BOOK OF MATCHES

Box of TACK

Duncker, K., & Lees, L. S. (1945). On problem-solving. *Psychological monographs*, 58(5), i.



Creativity: Alternate Uses Task (Guidford, 1967)

Measures: divergent thinking

**Explanation:** 

Examinees are asked to list as many possible uses for a common household item

# **Exercise: Test yourself!**



### Instruction:

Please list as many uses as possible for...a shoe

What are the maximum number of unusual uses you can come up with?

→ You have 3 minutes!





### Personality: Thematic Apperception Test (TAT)

- uses a series of provocative yet ambiguous pictures about which the subject is asked to tell a story (the complete version of the test contains 32 picture cards)
- Measures: e.g. defense mechanisms, motives (achievement, power, or affiliation)
- Scoring and interpretation of the test should only be conducted by extensively trained coders
- → However, there are some new approaches:
  - Felix Schönbrodt (LMU) developed and trained a machine learning algorithm to code implicit motives in freely narrated stories triggered by stories



### Implicit Tests – Some examples



#### Attitude: Implicit Association Test (IAT; Greenwald et al., 1998)

- measures the strength of associations between concepts (e.g., Female/Male and Career/Family)
- making a response is easier when closely related items share the same response key

#### **Exercise:** Try out the IAT

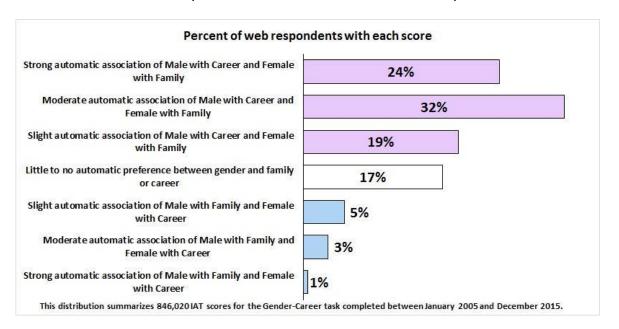
- Go to <a href="https://implicit.harvard.edu/implicit/takeatest.html">https://implicit.harvard.edu/implicit/takeatest.html</a>
- "I wish to proceed"(you can skip all the questions on your background)
- Choose "Gender Career" Task
- Conduct the test



### Implicit Tests – Some Test Examples



Attitude: Implicit Association Test (IAT; Greenwald et al., 1998)



#### Paper example: Implicit Association Test



# Will you still hire me when I am over 50? The effects of implicit and explicit age stereotyping on resume evaluations

Sara Zaniboni<sup>a</sup>, Malgorzata Kmicinska<sup>b</sup>, Donald M. Truxillo<sup>c,d</sup>, Kimberly Kahn<sup>d</sup>, Maria Paola Paladino<sup>e</sup> and Franco Fraccaroli<sup>e</sup>

<sup>a</sup>Department of Psychology, University of Bologna, Cesena, FC, Italy; <sup>b</sup>McKinsey & Company, Wroclaw, Poland; <sup>c</sup>University of Limerick-Kemmy Business School, Limerick, Ireland; <sup>d</sup>Department of Psychology, Portland State University, Portland, OR, USA; <sup>c</sup>Department of Psychology and Cognitive Sciences, University of Trento, Rovereto, TN, Italy

#### **ABSTRACT**

Multiple studies have found that older workers may be disadvantaged in their job search due to explicit age stereotypes. However, no published research has examined the effect of both explicit (conscious) and implicit (unconscious) negative age stereotypes against older workers on hiring decisions. The current study fills this gap by using an experimental design to simultaneously examine how both explicit and implicit age stereotypes affect the evaluation of resumes for older and younger job applicants. Participants completed measures of explicit age stereotypes via a questionnaire and implicit age stereotypes with an Implicit Association Test focused on older and younger working-age people. They then completed a resume screening task that included younger and older potential applicants. Results showed that participants' explicit age stereotypes positively influenced the evaluation of younger applicants' resumes but had no significant effect on the evaluation of older applicants' resumes. Conversely, implicit age stereotypes had a negative effect on the evaluation of older applicants' resumes but had no significant effect on the evaluation of younger applicants' resumes. The results suggest that both implicit and explicit age stereotypes may harm older job applicants' hireablity, but through different pathways.

#### ARTICLE HISTORY

Received 1 February 2017 Accepted 24 March 2019

#### **KEYWORDS**

Ageism; hiring discrimination; age stereotypes; implicit attitudes; resume screening

# Spotlight on...



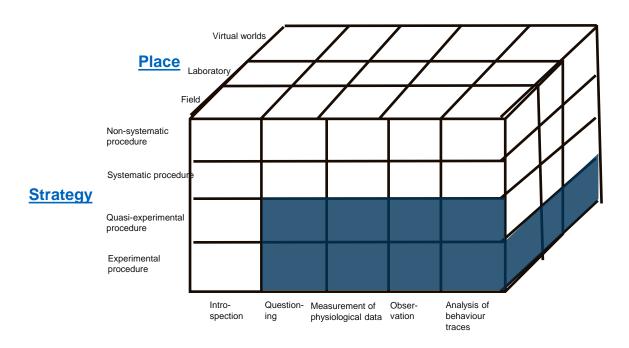




**Experiments** 

## **Experimental procedures**





**Activities of the researcher** 

## The spectrum of experiments

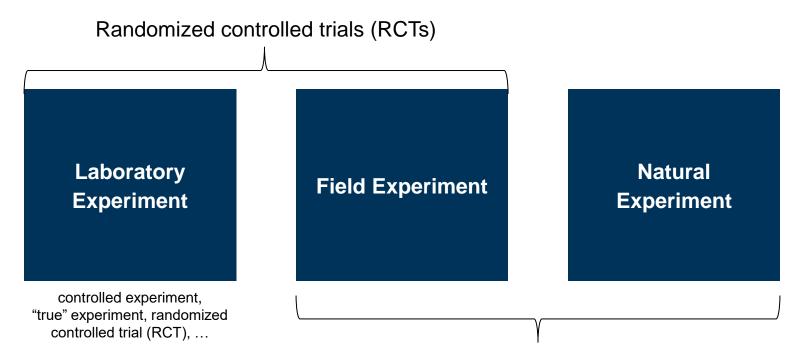


	Laboratory Experiment	Artefactual Field Experiment	Framed Field Experiment	Natural field experiment	
Participants	Students	Professionals			
Location	Laboratory		Field		
Informed consent	Knowl	edge that experiment takes	s place No knowledge		
Example	e.g., experiment that test the effects of emotions on risk-taking	e.g., experiment with CEOs that tests the effects of emotions on risk-taking	e.g., experiment with CEOs that test the effects of emotions on risk-taking in the field	e.g., experiment that measures racism by sending people of different races but otherwise similar appearance to car dealers and then observe the prices	

Source: based on List, 2011

## The spectrum of experiments

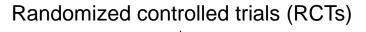


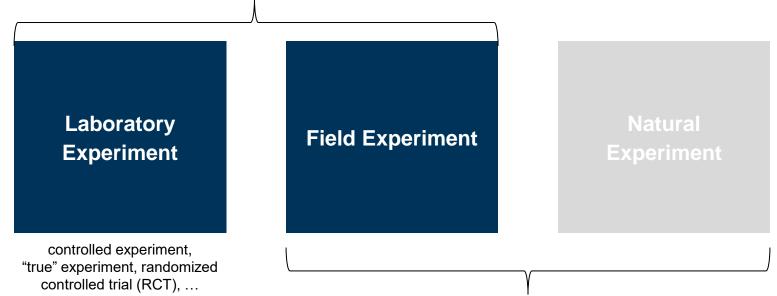


Sometimes quasi-experiments

### Types of experiments







Sometimes quasi-experiments

#### **Experiments in a nutshell**



- Systematic observation process in a controlled setting
- Controlled manipulation (treatment conditions) of the independent variable (not in natural experiments)
- Random assignment to treatment conditions (sometimes not in field/natural experiments)

Source: Huber (2005), Sarris & Reiß (2005)

#### Random Assignment



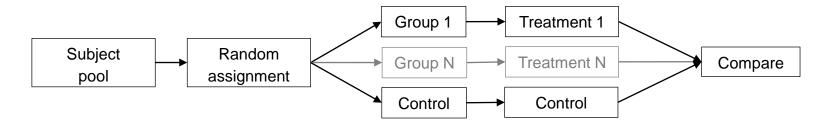
#### Random assignment ≠ Random sampling

- Units are assigned to receive the treatment or an alternative condition by a random process such as the toss of a coin or a table of random numbers
- If implemented correctly, random assignment creates two or more groups of units that are probabilistically similar to each other on the average
- Any outcome differences that are observed between those groups at the end of a study
  are likely to be due to treatment, not due to differences between those groups that already
  existed at the start of the study

#### **Experimental Design**



#### Between subject design (Between group design)



**Example 1: Two-level research design** 

Factor A	Level A1	A1
	Level A2	A2

Example 2: 2 x 2 research design

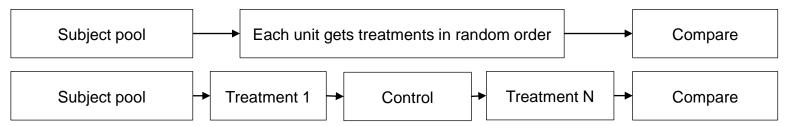
		Factor A		
		Level A1	Level A2	
Coetor D	Level B1	A1B1	A2B1	
Factor B	Level B2	A1B2	A2B2	

Source: Dunn (2009)

#### **Experimental Design**



#### Within subject design (Within group design)



# **Example 1: Independent Variable with two Levels**

Participant	Treatment Order	
1	AB	
2	ВА	

# **Example 2: Independent Variable with four Levels**

Participant	Treatment Order
1	ABCD
2	ABDC
24	DCBA

Source: Dunn (2009)

#### **Controlled manipulation**



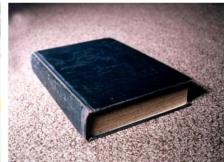
#### Example: Manipulation of Emotions

- Pictures (e.g. Lang et al., 1997)
- Scenarios (e.g. Gross & D'Ambrosio, 2004)
- Film clips (e.g. Hewig et al., 2005)
- Memories (e.g. Schaefer & Philippot, 2005)
- Speech (e.g. Brooks, 2013)

IMAP picture 8370-rafting1 (inducing excitement).



IMAP picture 7090-book (neutral).



#### **Experimental tasks**



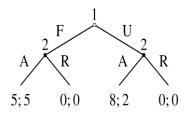
#### Tasks in Economic Research

- Ultimatum game
- Dictator game
- Trust/investment game

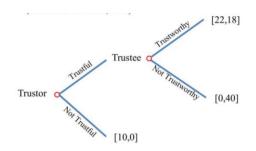
#### **Tasks in Psychological Research**

- Analytical tasks (e.g. sudoku)
- Creative tasks (e.g. drawing task)
- Decision tasks (e.g. scenarios/cases, computer games e.g. Minecraft)

#### Ultimatum game



#### Trust/Investment game



#### Dictator game



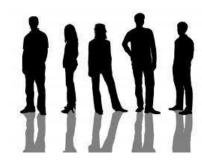
## **Example 1: Main effects**



**Hypothesis**: Students who drink coffee are more interested in survey research than students who drink tomato juice.







- 1. Sample
- 2. Independent Variable
- 3. Dependent Variable

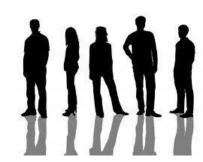
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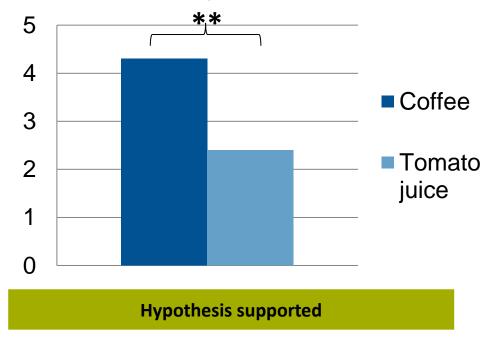


your IV "beverage" has two levels (= "factors"; coffee, tomato juice) your DV "interest in survey research" is continuous

#### Possible results



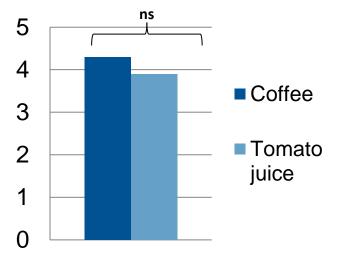
#### Interest in survey research



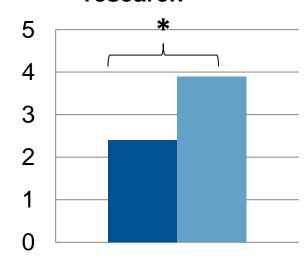
#### Possible results II







# Interest in survey research

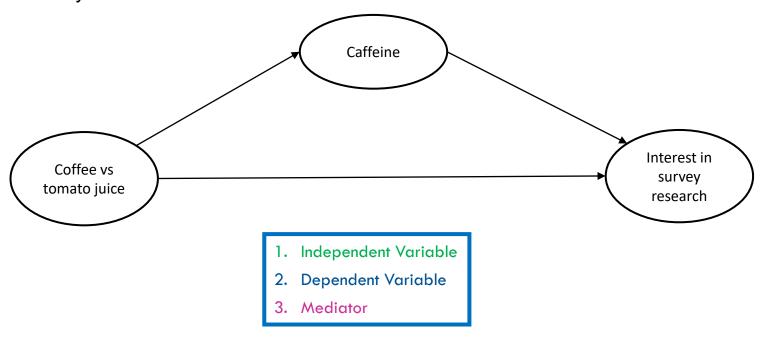


**Hypothesis not confirmed** 

#### **Example 2: Mediation**



**Hypothesis**: The positive relationship between coffee and interest in survey research is mediated by caffeine.



#### **Example 3: Moderation**



#### **Hypotheses:**

- H1. Students who drink coffee are more interested in survey research than students who drink tomato juice.
- **H2**. Eating a cookie moderates this relationship: Students who drink coffee are more interested in survey research when eating a cookie than when not eating a cookie, whereas students who drink tomato juice and eat a cookie are less interested in survey research than when not eating a cookie





- 1. Sample
- Independent Variable
- 3. Dependent Variable



#### **Example 3: Moderation**



Two independent variables with 2 levels (2 x 2 design):

- Type of beverage (coffee/tomato juice)
- Cookie (yes/no)

Dependent variable "interest in survey research" is continuous



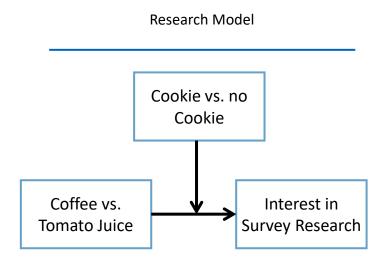


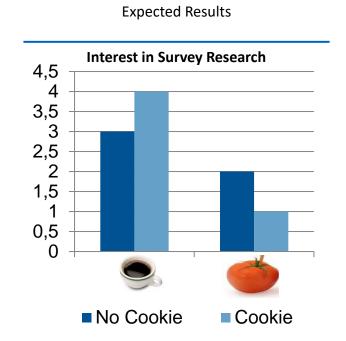
- 1. Sample
- 2. Independent Variable
- 3. Dependent Variable



#### **Research Model & Expected Results**







Students who drink coffee and eat a cookie are more interested in survey research than students who only drink coffee, whereas students who drink tomato juice and eat are cookie are less interested in survey research than when only drinking tomato juice. 

H2 supported.

# Paper example: Lab experiment





RESEARCH ARTICLE

# Joy Leads to Overconfidence, and a Simple Countermeasure

Philipp Koellinger 1,2,30 \*, Theresa Treffers 40

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- These authors contributed equally to this work.
- \* p.d.koellinger@vu.nl

#### **Abstract**

Overconfidence has been identified as a source of suboptimal decision making in many real-life domains, with often far-reaching consequences. This study identifies a mechanism that can cause overconfidence and demonstrates a simple, effective countermeasure in an incentive-compatible experimental study. We observed that joy induced overconfidence if the reason for joy (an unexpected gift) was unrelated to the judgment task and if participants were not made specifically aware of this mood manipulation. In contrast, we observed well-calibrated judgments among participants in a control group who were in their resting mood. Furthermore, we found well-calibrated judgments among participants who received the joyful mood induction together with questions that forced them to reflect on their current mood and the (ir)relevance of its cause to our judgment tasks. Our findings suggest that being aware of one's positive mood and the reason for that mood may effectively reduce overconfidence for a short period.





Citation: Koellinger P, Treffers T (2015) Joy Leads to Overconfidence, and a Simple Countermeasure. PLoS ONE 10(12): e0143263. doi:10.1371/journal. pone.0143263

Editor: Pablo Brañas-Garza, Middlesex University London, UNITED KINGDOM

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# Paper example: Lab experiment

Journal of Economic Psychology 53 (2016) 67-82



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journal homepage: www.elsevier.com/locate/joep





#### Sadder but wiser: The effects of emotional states on ambiguity attitudes



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#### ARTICLE INFO

Article history: Received 24 February 2015 Received in revised form 25 November 2015 Accepted 22 December 2015 Available online 31 December 2015

JEL classification: D03 D81

PsycINFO Classification: 2360

Keywords: Ambiguity attitude Emotion Sadness Experiment

#### ABSTRACT

Many important decisions are made without precise information about the probabilities of the outcomes. In such situations, individual ambiguity attitudes influence decision making. The present study identifies emotions as a transient cause of ambiguity attitudes. We conducted two random-assignment, incentive-compatible laboratory experiments, varying subjects' emotional states. We find that sadness induces choices that are closer to ambiguity-neutral attitudes compared with the joy, fear, and control groups, where decision makers deviate more from payoff-maximizing behavior.

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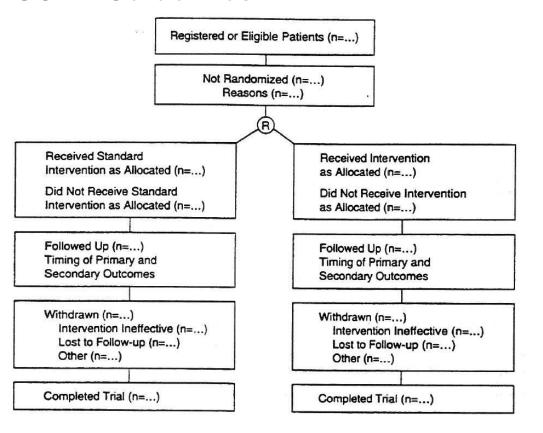
#### **RCTs: CONSORT Guidelines**



Heading	Subheading	Descriptor	Was It Reported?	On Wha
Title		Identify the study as a randomized trial.7		
Abstract		Use a structured format. <sup>8,9</sup>		
Introduction		State prospectively defined hypothesis, clinical objectives, and planned subgroup or covariate analyses. <sup>10</sup>		
Methods		State Control of the		
	Protocol	Describe		
		Planned study population, together with inclusion/exclusion criteria.		
		Planned interventions and their timing.		
		Primary and secondary outcome measure(s) and the minimum important difference(s), and indicate how the target sample size was projected. <sup>211</sup>		
		Rationale and methods for statistical analyses, detailing main comparative analyses and		
		whether they were completed on an intention-to-treat basis. 12.13		
		Prospectively defined stopping rules (if warranted).14		
	Assignment	Describe		
		Unit of randomization (eg. individual, cluster, geographic).15		
		Method used to generate the allocation schedule.16		
		Method of allocation concealment and timing of assignment.17		
		Method to separate the generator from the executor of assignment. <sup>17,18</sup>		
	Masking (Blinding)	Describe mechanism (eg., capsules, tablets); similarity of treatment characteristics (eq.		
	3 (	appearance, taste); allocation schedule control (location of code during trial and when		
		broken); and evidence for successful blinding among participants, person doing		
		intervention, outcome assessors, and data analysts. 19,20		
Results		Section 1 Section 2 Control and Control an		
	Participant Flow	Provide a trial profile (Figure) summarizing participant flow, numbers and timing of		
	and Follow-up	randomization assignment, interventions, and measurements for each randomized group. <sup>3,21</sup>		
	Analysis	State estimated effect of intervention on primary and secondary outcome measures,		
		including a point estimate and measure of precision (confidence interval).2223		
		State results in absolute numbers when feasible (eg, 10/20, not 50%).		
		Present summary data and appropriate descriptive and inferential statistics in sufficient detail to permit alternative analyses and replication. <sup>24</sup>		
		Describe prognostic variables by treatment group and any attempt to adjust for them.25		
		Describe protocol deviations from the study as planned, together with the reasons.		
Comment		State specific interpretation of study findings, including sources of bias and imprecision		
		(internal validity) and discussion of external validity, including appropriate quantitative		
		measures when possible.		
		State general interpretation of the data in light of the totality of the available evidence.		

#### **RCTs: CONSORT Guidelines**





Begg, C., Cho, M., Eastwood, S., Horton, R., Moher, D., Olkin, I., ... & Stroup, D. F. (1996). Improving the quality of reporting of randomized controlled trials: the CONSORT statement. The Journal of the American Medical Association (JAMA), *276*(8), 637-639.

### RCTs in the field: Examples



#### Dear Parents,

To show our commitment to evidence-based practice, this year's fourth grade class will be randomly assigned to one of two groups.

The treatment group will receive a good education while the control group will receive a placebo. This study will provide value for generations to come.



freshspectrum.com

#### RCTs: The Sveriges Riksbank Prize in Economic Sciences in Memory of Alfred Nobel 2019 - Esther Duflo, Abhijit Banerjee, and Michael Kremer



Abhijit Banerjee



© Nobel Media, Photo: A. Mahmoud

Esther Duflo



@ Nobel Media, Photo: A. Mahmoud

Michael Kremer



© Nobel Media, Photo: A. Mahmoud

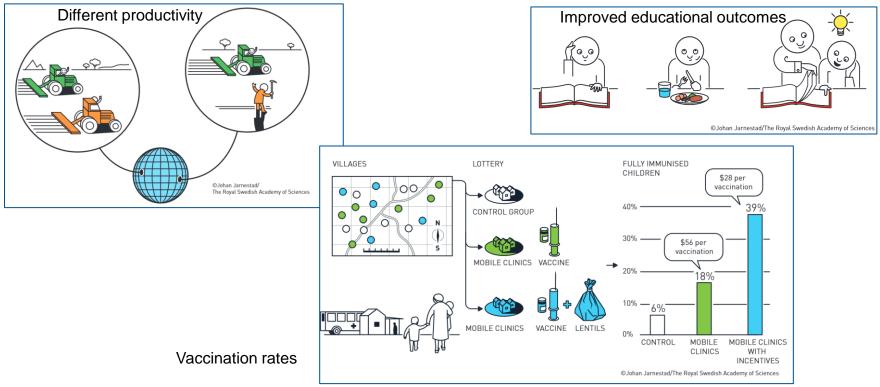
The Sveriges Riksbank Prize in **Economic Sciences in Memory** of Alfred Nobel 2019 was awarded jointly to three economists Abhijit Banerjee, Esther Duflo and Michael Kremer "for their experimental approach to alleviating global poverty."

They used RCTs to determine how to best lift people out of poverty and improve their health.

The Prize in Economic Sciences 2019. NobelPrize.org. Nobel Media AB 2020. Mon. 16 Mar 2020. https://www.nobelprize.org/prizes/economic-sciences/2019/summary/.

Callaway, E. (2019). 'Randomistas' who used controlled trials to fight poverty win economics Nobel. Nature, 14 October 2019. doi: 10.1038/d41586-019-03125-v. https://www.nature.com/articles/d41586-019-03125-v.

# RCTs: The Sveriges Riksbank Prize in Economic Sciences in Memory of Alfred Nobel 2019 - Esther Duflo, Abhijit Banerjee, and



Press release: The Prize in Economic Sciences 2019. NobelPrize.org. Nobel Media AB 2020. Tue. 17 Mar 2020. https://www.nobelprize.org/prizes/economic-sciences/2019/press-release/ Attribute "© Johan Jarnestad/The Royal Swedish Academy of Sciences"

## Paper example: field experiment



# Economica



Economica (2014) doi:10.1111/ecca.12115

#### Self-employed But Looking: A Labour Market Experiment

By PHILIPP D. KOELLINGER†, JULIJA N. MELL‡, IRENE POHL‡, CHRISTIAN ROESSLER†† and THERESA TREFFERS‡‡

Final version received 8 October 2013.

We examine whether having previously been self-employed is a negative signal on the job market. In a UK field experiment where two applications of otherwise equally qualified individuals were sent out in response to the same vacancies in human resource management, we find that entrepreneurs systematically receive fewer responses than non-entrepreneurs. Empirical studies that treat market wages as the opportunity cost of remaining self-employed are therefore likely to overestimate alternative earnings to entrepreneurship.

# Paper example: field experiment





#### The mixed effects of online diversity training

Edward H. Chang<sup>a,1</sup>, Katherine L. Milkman<sup>a</sup>, Dena M. Gromet<sup>b</sup>, Robert W. Rebele<sup>c,d</sup>, Cade Massey<sup>a</sup>, Angela L. Duckworth<sup>e</sup>, and Adam M. Grant<sup>f</sup>

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Edited by Frank Dobbin, Harvard University, Cambridge, MA, and accepted by Editorial Board Member Jennifer A. Richeson February 22, 2019 (received for review September 20, 2018)

We present results from a large (n = 3,016) field experiment at a global organization testing whether a brief science-based online diversity training can change attitudes and behaviors toward women in the workplace. Our preregistered field experiment included an active placebo control and measured participants' attitudes and real workplace decisions up to 20 weeks postintervention. Among groups whose average untreated attitudes—whereas still supportive of women-were relatively less supportive of women than other groups, our diversity training successfully produced attitude change but not behavior change. On the other hand, our diversity training successfully generated some behavior change among groups whose average untreated attitudes were already strongly supportive of women before training. This paper extends our knowledge about the pathways to attitude and behavior change in the context of bias reduction. However, the results suggest that the one-off diversity trainings that are commonplace in organizations are unlikely to be stand-alone solutions for promoting equality in the workplace, particularly given their limited efficacy among those groups whose behaviors policymakers are most eager to influence.

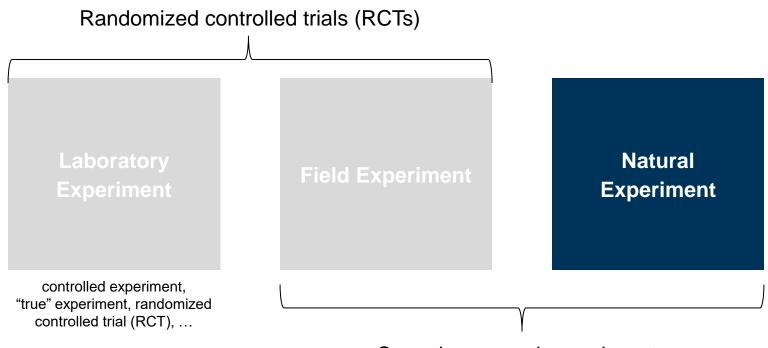
diversity training | gender | race | bias | field experiment

innovation was the measurement of objective behavioral outcome variables that were not ostensibly connected to the training, addressing key concerns about whether demand effects bias the results of past diversity training research (7).

The training we tested drew on best practices and strategies for changing attitudes and behavior from interventions conducted in a wide range of other contexts. These strategies include targeting the specific underlying psychological process believed to produce undesirable outcomes (13), offering personalized feedback about individuals' own biases to motivate change (14), destigmatizing attempts to improve on undesirable behaviors (15, 16), and offering actionable strategies for improvement and the opportunity to practice these strategies (10). Specifically, we designed the diversity training to raise awareness about the pervasiveness of stereotypes, share scientific evidence of the impact of stereotyping on important workplace behaviors, destignatize and expose participants to their own stereotyping, provide evidence-based strategies for overcoming stereotyping, and allow employees to practice deploying evidence-based strategies to combat bias by responding to different workplace scenarios. Following recommendations from correlational research on diversity programs (17), this training was also voluntary.

### **Types of experiments**





Sometimes quasi-experiments

#### **Natural experiments**



- Independent variable is not a planned intervention, but is changed naturally. Change is not controlled by the experimenter.
- Effect on outcome variable is measured.
- Assignment of subjects to groups as-if random, or as good as random

## Why natural experiments?



#### In some contexts, manipulations are:

- Expensive
- Impractical
- Unethical

# Paper example: Natural field experiment





RESEARCH ARTICL

# Show Me the Way to Go Home: An Empirical Investigation of Ride-Sharing and Alcohol Related Motor Vehicle Fatalities<sup>1</sup>

#### Brad N. Greenwood and Sunil Wattal

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In this work, we investigate how the entry of ride-sharing services influences the rate of alcohol related motor vehicle fatalities. While significant debate has surrounded ride-sharing, limited empirical work has been devoted to uncovering the societal benefits of such services (or the mechanisms which drive these benefits). Using a difference in difference approach to exploit a natural experiment, the entry of Uber Black and Uber X into California markets between 2009 and 2014, we find a significant drop in the rate of fatalities after the introduction of Uber X. Further, results suggest that not all services have the same effect, insofar as the effect of the Uber Black car service is intermittent and manifests only in selective locations (i.e., large cities). These results underscore the importance of coupling increased availability with cost savings in order to exploit the public welfare gains offered by the sharing economy. Practical and theoretical implications are discussed.

**Keywords**: Uber, sharing economy, ride-sharing, drunk driving, vehicular fatalities, difference in difference, natural experiment, platforms

# Paper example: Natural field experiment





RESEARCH ARTICLE

#### LOVE UNSHACKLED: IDENTIFYING THE EFFECT OF MOBILE APP ADOPTION IN ONLINE DATING<sup>1</sup>

#### JaeHwuen Jung

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#### Akhmed Umyarov

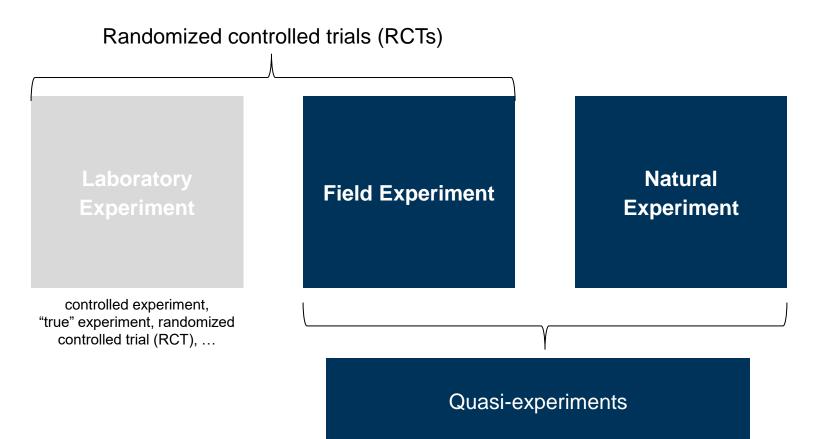
Carlson School of Managment, University of Minnesota, Minneapolis, MN 55455 U.S.A. {aumyarov@umn.edu}

The proliferation of smartphones and other mobile devices has led to numerous companies investing significant resources in developing mobile applications, in every imaginable domain. As apps proliferate, understanding the impact of app adoption on key outcomes of interest and linking this understanding to the underlying mechanisms that drive these results is imperative. In this paper, we explore the changes in user behavior induced by adoption of a mobile application, in terms of engagement and matching outcomes in the online dating context. We also identify three mechanisms that are somewhat unique to the mobile environment, but are hitherto unestablished in the literature, that drive this shift in behavior: ubiquity, impulsivity, and disinhibition. Our main identification strategy uses propensity score matching combined with difference-indifferences, coupled with a rigorous falsification test to confirm the validity of our identification strategy. Our results demonstrate that mobile app adoption induces users to become more socially engaged as measured by key engagement metrics such as visiting significantly more profiles, sending significantly more messages, and importantly, achieving more matches. We also discover various mechanisms facilitating this increased engagement: ubiquity of mobile use—users log in more, and login across a wider range of hours in the day. We find that men act more impulsively, in that they are less likely to check the profile of a user who messaged them before replying to them. This effect is not visible for women who continue to be deliberate in their checking before replying even after adoption of the mobile app. Finally, we find that both men and women exhibit disinhibition, in that users initiate actions to a more diverse set of potential partners than they did before on dimensions of race, education, and height.

Keywords: Mobile applications, online dating, social engagement, adoption, ubiquity, implusiveness, disinhibition

### **Types of experiments**





### **Quasi-Experiments**



#### What are Quasi-Experiments? They...

- ... take place in field setting
- involve a change in a key independent variable of interest
- relax <u>one or both</u> of the defining criteria of laboratory and field experiments:

NO

Random assignment to treatment conditions

Controlled manipulation of the independent variable



Assignment to intact or preexisting groups

Looking for natural occurring changes

<u>Objective:</u> strengthen causal inference while maintaining internal and external validity without interrupting "real life" through intrusive intervention (e.g. Campbell & Stanley, 1966)

Source: Grant and Wall (2009). The Neglected Science and Art of Quasi-Experimentation.

## Paper example: Quasi experiment

A threat and a challenge at the same time? A quasi-experiment about the effects of ambivalence on innovative work behavior during crisis



(working paper)

#### Ann-Carolin Ritter, Theresa Treffers, Batia Wiesenfeld

#### ABSTRACT

An economic crisis can cause a firm's demise. Some firms, however, thrive through crisis because their employees engage in innovative work behaviors, but research has not yet provided enough insights into innovative work behavior in crisis. In this study, we explore employees' innovative work behavior when they feel challenged and threatened during a crisis. We assume that this ambivalence is differently experienced by employees depending on their individual work situation and over the course of a crisis. To explore this empirical puzzle, we set up a quasi-experiment with 217 employees by using the governmental classification that declared critical and non-critical workers during the COVID-19 crisis. We measured the extent to which these two groups of workers experienced their work situation during crisis as threat and challenge, i.e., ambivalence, and its effects on innovative work behavior at the beginning and at the end of the first lock-down. Our findings show that high ambivalence has both positive and negative effects on innovative work behavior depending on employees' work situation and that these effects reverse over time. Our study contributes to research on innovative work behavior in crises and the ambivalence literature.

Keywords: Innovative Work Behavior, Crisis, Challenge, Threat, Ambivalence, COVID-19
pandemic

# Paper example: Quasi experiment

PERSONNEL PSYCHOLOGY 2002, 55



#### RECOGNIZING GOOD ATTENDANCE: A LONGITUDINAL, QUASI-EXPERIMENTAL FIELD STUDY

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Department of Management The R.B. Pamplin College of Business Virginia Polytechnic Institute and State University

K. DOW SCOTT

Institute of Human Resources and Industrial Relations Loyola University Chicago

GAIL H. McKEE

Department of Business Administration and Economics Roanoke College

Three motivational theories (need, goal, and reinforcement) suggest that recognition programs should increase employee attendance. A 1-year, quasi-experimental field study of absenteeism was conducted at 4 manufacturing plants with a total 1,100 employees. The study compared a public recognition program for improving work attendance with 3 types of controls. The personal recognition treatment showed (a) significant decreases ranging from 29% to 52% for each quarter's baseline assessment, and (b) significant decreases when the control groups showed no decrease. Employees had favorable perceptions of the public recognition program.

# Paper example: Quasi experiment





#### **Abstract**

In a field quasi experiment, customers were most satisfied with the service quality of the branch of a multinational bank where good organizational citizens had been trained as service quality leaders, and branch employees exhibited the highest conformance to the quality scheme of the bank. In a branch where service quality leaders were randomly selected for training, customer satisfaction and conformance improved more than they did in a branch where no service quality leaders were trained.

## **Spotlight on...**







Secondary data

## Types of Data (I)



Primary	Original data collected for a specific research goal.		
"Mixed" Approaches	creation of <u>original</u> quantitative data <u>from secondary sources</u>		
Secondary	Data originally <u>collected for a different purpose</u> and <u>reused</u> for another research question.		

## Types of Data (II)



Qualitative	Data involving <u>understandings</u> of the complexity, detail, and context of the research subject, often consisting of texts, such as interview transcripts and field notes, or audiovisual material.	
Quantitative	Data that <u>can be described numerically</u> in terms of objects, variables, and their values.	
Internal	Company-internal data (e.g. controlling, customer service, finance)	
External	published data (e.g. public or commercial data sets)	
<b>Meta</b> data	The <u>description</u> of a data file, usually in the form of a codebook.	

## Types of Data (III)



#### **Structured** Data

fa51a58c-e21f-7d81-d3f1-9b1ff09d552e greenovation Biotech

#### type\_org b8eee9cb-3fb9-d6eb-181f-3366e0b8fe6e apomio organization apomio 75ad4067-45a7-25e6-0978-48f6e394ad98 KevNeurotek Pharmaceuticals organization keyneurotek-pharmaceuticals a8931ddd-2903-fe5b-10b7-09c5b11d412d c-LEcta organization c-lecta deefdd8a-5c97-215e-2c08-3f4327af706f intelligent fluids GmbH organization bubbles-and-beyond de539431-f104-7aeh-h9ef-ca887463h321 InterMed Discovery organization intermed-discovery 9121408c-c5f1-67a6-ae22-212307b6f48b pluriSelect organization pluriselect 9e06f980-9ecf-d8b6-e1ff-6e597206b6f6 Microstim organization microstim 5d2160a5-cbe3-d03a-fba1-536533b81e1e Sovicell GmbH organization sovicell eee841d0-e8a4-e12f-31f9-6dfb9b770daa Leica Microsystems organization leica-microsystems 925cde12-4862-be40-9c84-9f361057c5a7 DIREVO Industrial Biotechnology organization direvo-biotech a7f14220-a470-970a-bcdd-0d0e2f6d80c6 Protagen organization protagen Res19a2a-0d26-de96-676a-c9b8ce4c75aa Amaya Biosystems organization amaxa-biosystems 10803590-185a-bee6-f4ab-905a775d5874 Vivoryon Therapeutics organization probiodrug 437d5194-a09c-824e-4c1a-d83125c2ffb5 Activaero organization activaero f6555f7f-9f29-315f-2b74-ecf217c8f63e ELARA Pharmaceuticals organization elara-pharmaceuticals cbc5e3d3-d8b2-b751-abc7-3405b3ec414a Curetis organization curetis d83bc970-4cad-aa4d-d5da-f9d32acf5f2d Cytocentrics organization cytocentrics 0d3a2da3-ec78-f0c3-b601-3dd13ff511d7 TNI medical organization tni-medical 0847a454-9e2a-0e29-9e1a-03a1804eb2d7 EBS Technologies organization ebs-technologies organization amedrix 93c18bad-7efc-f16a-fc7c-1d0e6355b313 Amedrix ca9021c6-2113-a2b8-7244-e72b92a183b8 MTM Laboratories 294a7e20-93d9-21f1-71b6-89ea4f617d77 CEVEC Pharmaceuticals organization cevec-pharmaceuticals 2a5804h6.edd4.d781.5157.h78faf0dr2r2 immatirs hinterhnologies organization immatics-biotechnologies 789d0a78-6320-66b5-a3bc-01f1ca35fb69 Caprotec Bioanalytics organization caprotec-bioanalytics 93578f7d-90e0-ba1e-5756-a37819ba896f Sloning BioTechnology organization sloning-biotechnology 707fb775-d9b8-6d14-84dc-aabc613668d7 Proteros organization proteros 4f1452a0-84f9-2d55-ec94-1163ed2b10a1 evocatal organization evocatal e3b8a018-3c69-da7a-97ec-5971313dfe07 Diaferon organization diaferon d2ade018-3bd9-ce3c-e036-a12d8789ad7a Subitec organization subited f6972826-a27b-3cad-6976-099952dd0945 BioTeSvs organization biotesys 0249643f-15eb-02a5-3b6c-3822b16d36e3 Agennix organization agennix e7577575-25a5-ca13-4670-cfb69cfcb074 Isarna Therapeutics organization isarna-therapeutics-gmbh dd139f96-52cc-112a-fdb4-aae2d1a08a2a CureVac organization curevac 5ee3b905-1091-99a2-53f0-7294031522c6 SIRS-Lab organization sirs-lab 488ae8cb-f323-4aba-aed8-9cf8e5cb9480 Cellca organization cellca cf55dc43-e415-98cc-ca71-f56a245ba5c6 AiCuris organization aicuris

organization greenovation-biotech

#### **Semi-structured** Data

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#### **Unstructured** Data



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### **Primary vs. Secondary Data**



**Primary** Original data <u>collected for a specific research goal</u>.

Advantages: Very specific

Particularly suited for answering a given research question

Disadvantages: Collection requires resources (time = money)

**Secondary** Data originally <u>collected for a different purpose</u> and <u>reused</u> for another research.

Advantages: Readily available => we can immediately start with the analysis

Can be inexpensive (but also very expensive)

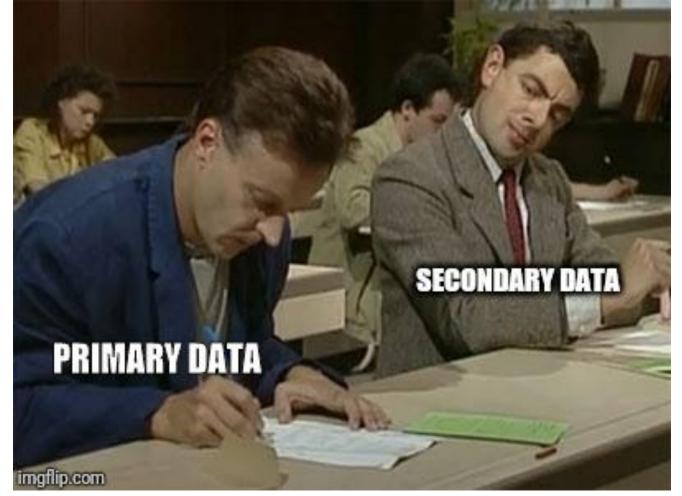
Disadvantages: Data might not exactly fit the research problem

Data might be of bad quality

Data might be old

Competitors have access to the same data





Source: https://imgflip.com/i/3jsitx



#### Step 1: Define your research topic (and question)

- Start with a thorough literature review
- Ensure that the research has relevance and is based on a sound a priori reasoning.
- A good question is what makes a study good, not a large sample size.
- Be flexible to adapt your question to the strengths and limitations of the potential datasets

#### Step 2: Select a Dataset

Step 3: Get to know your dataset

## Know your Data before Formulating a Research Question



This isn't working at all... I should warn others not to put their cart before the horse.



Step 1: Define your research topic and question

#### **Step 2: Select a Dataset**

- To increase the novelty of your work, consider selecting a dataset that has not been widely used in your field or link datasets together to gain a fresh perspective.
- Factor in dataset cost and time to acquire the actual dataset
- Consider Selecting a dataset your mentor has used previously

Step 3: Get to know your dataset



Step 1: Define your research topic and question

#### Step 2: Select a Dataset

#### Step 3: Get to know your dataset

- Learn the answers to the following questions:
  - Why does the database exist?
  - Who reports the data?
  - What are the incentives for accurate reporting?
  - How are the data audited, if at all?
  - Can you link your dataset to other large datasets?

- Read everything you can about the database
- Check to see if your measures have been validated against other sources
- Get a close feel for the data by analyzing it yourself or closely reviewing outputs if someone else is doing the programming



Step 1: Define your research topic and question

Step 2: Select a Dataset

Step 3: Get to know your dataset

- Think carefully about the [...] implications of your findings
- Be cautious when interpreting statistical significance (i.e., p-values). Large sample sizes can yield associations that are highly statistically significant but not clinically meaningful
- Think carefully about how you portray the data. A nice figure sometimes tells the story better than rows of data

#### **Secondary Data Sources - Examples**



## www.menti.com



Enter the code

8239 8286



Or use QR code

## Current use of secondary data in management research



- Currently, only a minority of articles from the area of management research uses secondary data (of both traditional and new sources)
- Example: less than 10% of articles in high-impact social science journals use secondary data in the leadership domain (Antonakis et al. 2014)



#### Can you think of any reasons for this situation?



Antonakis, J., Bastardoz, N., Liu, Y., & Schriesheim, C. A. (2014). What makes articles highly cited?. *The Leadership Quarterly*, 25(1), 152-179.

Barnes, C. M., Dang, C. T., Leavitt, K., Guarana, C. L., & Uhlmann, E. L. (2015). Archival data in micro-organizational research: A toolkit for moving to a broader set of topics. *Journal of Management*, *44*(4), 1453-1478.

### Reasons, why secondary data is not so broadly used



- The potential limitations (construct validity and omitted psychological mechanisms) outweigh the benefits for studying individual and group behavior
- Dogma about the **appropriateness** of using secondary data to conduct micro-organizational research
- The real or perceived irrelevance of secondary data to local settings
- Lack of awareness about the vast amounts of archival data that are now available (especially with respect to new data sources and types such as Big Data)
- The real or perceived inability to conduct archival research / access and analyze archival data (e.g., for working with Big Data)
- Missing recognition of the unique strengths of archival research

#### Strengths of secondary data research



- Uncovering unexpected manifestations in the real world
- Measurement of socially sensitive phenomena
- Research reproducibility
- Statistical power
- Deriving population parameter estimates
- Examining effects across time
- Differences in relationships across sociopolitical contexts
- Theory extension and testing at higher levels of analysis

#### Challenges of secondary data research



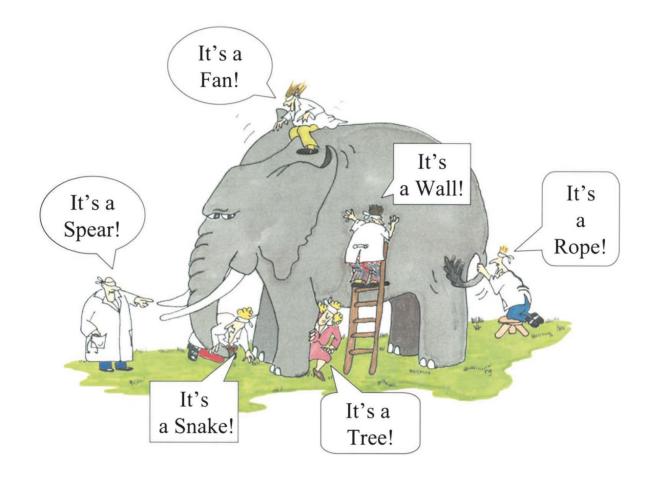
- Selecting the research question
- Construct validity (often single item measures)
- Causality
- Issues in the consistency and completeness of coverage of databases such as concerning sectoral compositions, temporal patters, geographic patterns, ...
- Data access (e.g., permission of company)
- Potential errors in the data possible
- Risk of biased samples due to voluntary information of users (e.g., employer reviewers self-select)

#### Mitigating these challenges



- Select the right archival database (databases, structured from data obtained at multiple time points, with a clear indication of which events preceded which; databases that entail data on the necessary control variables)
- Carefully select variables
- Combine multiple studies (e.g., conduct a complementary study such as an experiment)
- Combine different databases in one paper
- ...





## Spotlight on...







**Netnography** 

#### Netnography



#### Definition of netnography:

- made up of internet and ethnography
- is an approach to analyze online communities systematically
- adapts ethnographic research techniques such as observation to study cultures and communities that are emerging through computer-mediated communication

#### Forms of netnography:

- Participant-observation netnography (researchers participate in the online community)
- Nonparticipant-observation netnography (researchers lurk and unobtrusively observe community behaviors)

Belz, F. M., & Baumbach, W. (2010). Netnography as a method of lead user identification. *Creativity and Innovation Management*, 19(3), 304-313. Park, E., Im, G., Storey, V. C., & Baskerville, R. L. (2019). Never, Never Together Again: How Postpurchase Affect Drives Consumer Outcomes Within the Context of Online Consumer Support Communities. *Journal of the Association for Information Systems*, 20(1), 58-104.

## **Netnography**





## Paper example: Netnography



#### A Longitudinal Iterative Convergent Approach to Netnography

Full Paper

#### Valeria Sadovykh

PricewaterhouseCoopers and University of Auckland valeria.a.sadovykh@sg.pwc.com

#### David Sundaram

University of Auckland d.sundaram@auckland.ac.nz

#### **Abstract**

Netnography is a new approach that uses ethnographic principles to provide rich insights into human society. It combines archival and online communications, participation and observation, with new forms of digital and network data collection, analysis and research representation. While the use of Netnography is gaining momentum there are a few weaknesses that pose a limitation to its wide spread use. The limitations are in terms of single cycle studies lacking the power to unearth deep insights, to adequately understand a rapidly evolving field, and issues of generalizability and validity. Hence for the generalizability, validity, and usefulness of the method, we suggest three mechanisms to extend and enhance the Netnographic approach namely: longitudinal, iterations, and convergence. We adapted and extended the traditional Netnographic approach with a few more steps that fulfil the requirements and address the weaknesses. We have applied this approach to a longitudinal multi-year multi-iteration study.

#### Netnography (4/4)



Belz, F. M., & Baumbach, W. (2010). Netnography as a method of lead user identification. *Creativity and Innovation Management*, 19(3), 304-313.

Berthod, O., Grothe-Hammer, M., & Sydow, J. (2017). Network ethnography: A mixed-method approach for the study of practices in interorganizational settings. *Organizational Research Methods*, *20*(2), 299-323.

Mathwick, C., Wiertz, C., & De Ruyter, K. (2008). Social capital production in a virtual P3 community. *Journal of consumer research*, *34*(6), 832-849.

Park, E., Im, G., Storey, V. C., & Baskerville, R. L. (2019). Never, Never Together Again: How Postpurchase Affect Drives Consumer Outcomes Within the Context of Online Consumer Support Communities. *Journal of the Association for Information Systems*, *20*(1), 58-104.

## **Spotlight on...**







Physiological measures

## Which physiological measures do you know?





## Overview of possible measures and physiological markers



- Cardiovascular activity
- Neuroendocrine activity
- Electrodermal activity

### Autonomic nervous system (ANS) activity



Table 1 Indicators of ANS activity.

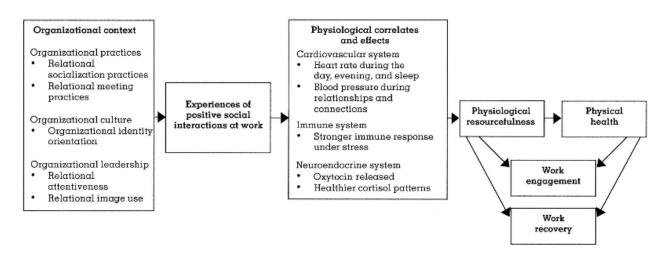
Categories of ANS activity	Brief description	What can be learned from examining this ANS activity	Key measures examined in psychophysiological research
Cardiovascular	Consists of the heart and pathways through which oxygenated blood is delivered to the periphery and deoxygenated blood is returned to the heart.	Affective states Motivation Attention Vulnerabilities in physical and mental illness	Systolic and diastolic blood pressure Heart rate Cardiac efficiency (e.g., cardiac output, ventricle contractility, total peripheral resistance) Respiration
Neuroendocrine	Focuses on the interactions between the nervous system and the hormones of the endocrine system.	Dispositional traits Behavioral tendencies Vulnerabilities in physical and mental illness The quality of social relationships	Cortisol Testosterone Dehydroepiandrosterone (DHEA) Oxytocin
Electrodermal	Examines responses in the eccrine sweat glands, widely distributed in the hands and feet.	Arousal Attention Intensity of emotion	Skin conductance response Skin conductance level

## The value of psychophysiology in organizational research



The Physiology of Positive Social Interactions at Work

- Immune from selfreport biases
- Receding conscious awareness and predicting behavior
- Offer a new set of dispositional characteristics



# Paper example: Cardiovascular activity



## NEUTRALIZING JOB STRESSORS: POLITICAL SKILL AS AN ANTIDOTE TO THE DYSFUNCTIONAL CONSEQUENCES OF ROLE CONFLICT

PAMELA L. PERREWÉ Florida State University

KELLY L. ZELLARS
University of North Carolina at Charlotte

GERALD R. FERRIS Florida State University

ANA MARIA ROSSI Clinica De Stress E Biofeedback

> CHARLES J. KACMAR Florida State University

> DAVID A. RALSTON University of Oklahoma

We examined the neutralizing effects of political skill on relationships between perceived role conflict and strain. Strain was measured as psychological anxiety, somatic complaints, and physiological strain (heart rate and systolic and diastolic blood pressure). Results support the moderating effects of political skill: greater political skill reduced the negative effects of role conflict on all types of strain.



## Exercise: Measure your heart beat with your smart phone (during/after listening to two different types of music)

## WORKING TO THE BEAT: A SELF-REGULATORY FRAMEWORK LINKING MUSIC CHARACTERISTICS TO JOB PERFORMANCE

#### Let's try differences in **tempo**:

- First, listen to Chopin's "Nocturne in D-flat major" (Slow tempo: *lento sostenuto*)
- Second, listen to Beethoven's "Moonlight" sonata (Fast tempo: presto agitato)

You can find both pieces via: <a href="http://www.workingtothebeat.com/page\_3.html">http://www.workingtothebeat.com/page\_3.html</a>

→ What do you measure? Was there a difference?



## Skin Conductance & Heart rate: How to set up a study





## Paper example: Electrodermal activity



#### GOING FOR IT ON FOURTH DOWN: RIVALRY INCREASES RISK TAKING, PHYSIOLOGICAL AROUSAL, AND PROMOTION FOCUS

CHRISTOPHER TO GAVIN J. KILDUFF New York University

LISA ORDOÑEZ University of Arizona

MAURICE E. SCHWEITZER University of Pennsylvania

Risk taking is fundamental to organizational decision making. Extending prior work that has identified individual and situational antecedents of risk taking, we explore a significant relational antecedent: rivalry. In both a field setting and a laboratory experiment, we explore how a competitor's identity and relationship with the decision maker influences risk taking. We analyze play-by-play archival data from the National Football League and find that interactions with rival (versus nonrival) partners increases risky behavior. In a laboratory experiment involving face-to-face competition, we demonstrate that rivalry increases risk taking via two pathways: increased pro-



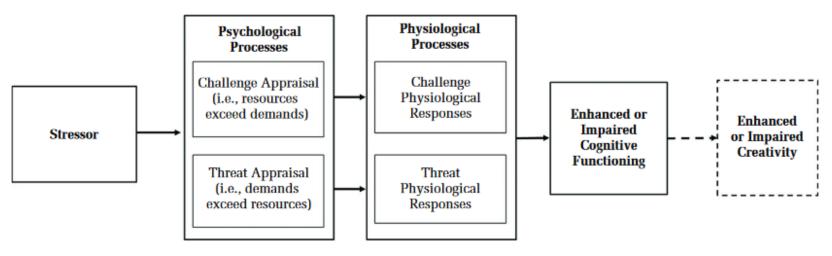




## Paper example: Neuroendocrine activity



FIGURE 2
The Biopsychosocial Model of Challenge and Threat and Implications for Creativity



## Paper example: Neuroendocrine activity



# NAS PNAS

# Endogenous steroids and financial risk taking on a London trading floor

J. M. Coates\*\*\* and J. Herbert\*\*5

\*Department of Physiology, Development and Neuroscience, University of Cambridge, Cambridge CB2 3DY, United Kingdom; \*Judge Business School, University of Cambridge, Cambridge CB2 1AG, United Kingdom; and \*Cambridge Center for Brain Repair, University of Cambridge, Cambridge CB2 0PY, United Kingdom

Edited by Bruce S. McEwen, The Rockefeller University, New York, NY, and approved November 6, 2007 (received for review May 1, 2007)

Little is known about the role of the endocrine system in financial risk taking. Here, we report the findings of a study in which we sampled, under real working conditions, endogenous steroids from a group of male traders in the City of London. We found that a trader's morning testosterone level predicts his day's profitability. We also found that a trader's cortisol rises with both the variance of his trading results and the volatility of the market. Our results suggest that higher testosterone may contribute to economic return, whereas cortisol is increased by risk. Our results

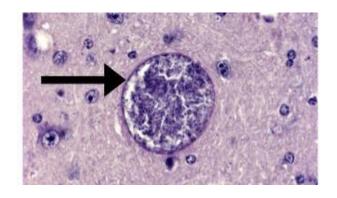
tion of the traders. The traders, in the normal course of a working day, sit in front of a bank of computer screens displaying live prices of currency, commodity, bond, and stock index futures (Fig. 1). Their trading stations also include live news-feeds, a risk-management system, and an intercom, over which a resident economist gives a commentary on the economic statistics being released around the globe. Traders on our floor could trade a wide range of assets, but most had been assigned or had chosen one or two, and all had their largest exposure to the German

## **Excursus 1: Another interesting field of study**



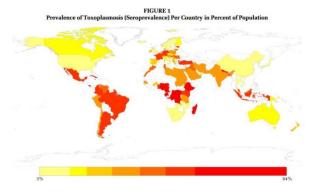
#### Toxoplasma gondii

- neuro-parasite prevalent in about a third of the world's population
- affects the neural and hormonal systems directly
- manipulates perception, cognition, and behavior of humans, and changes personality characteristics



#### **Proposition:**

Mind-affecting parasite paradigm offers many research opportunities for management sciences, especially for organizational psychology and neuroscience!



## **Excursus 1: Another interesting field of study**



#### Effects of the infection in humans:

- Increases recklessness / novelty seeking
- Increased extraversion, reduced concienciousness
- Reduced job satisfaction
- impaired basic cognitive functions, e.g. reaction times, working memory, attention

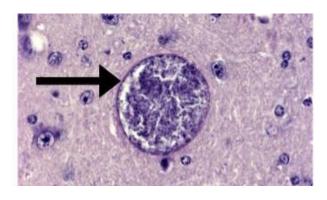
#### Possible impacts on:

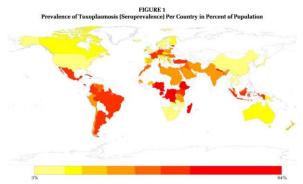
- skills and careers of employees and managers
- organizational dynamics
- intercultural management
- gender work roles





Toxoplasma-positive individual seem to differs systematically from non-infected population





## **Excursus 2: Eye-Tracking**



**Description:** focuses on the recording the movements of a participant's eyes during behavioral processes

#### What can be learned from examining this activity?

- Attention, level of processing
- Mental states
- Cognitive load
- Emotional arousal

#### **Key measures:**

- Position and number of a fixations
- Total dwell time
- Saccadic amplitude
- Pupil diameter
- Blink rate



## **Excursus 2: Eye-Tracking**



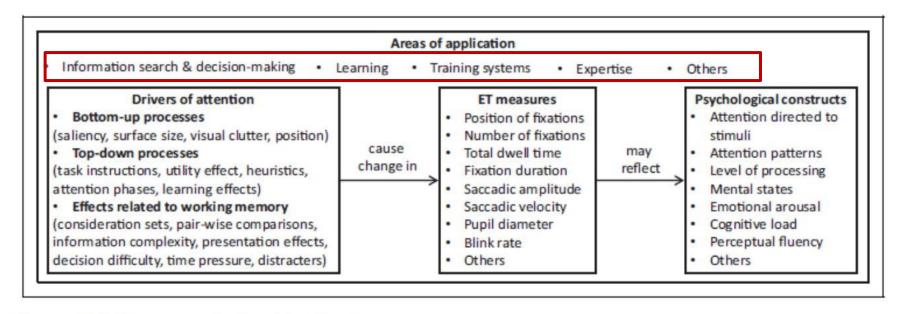


Figure 1. A Taxonomy for Eye Tracking Research.

## Tobii and Answerlab: Field-based eye tracking study





# Organizational Research Topic that could benefit from Psychophysiological Measures



- Affect in organizations
- Trust
- Power, dominance, and competitive situations
- Conflict and negotiations
- Diversity in organizations
- Health implications & Work recovery
- Engagement
- Organizational Practices
- Organizational Culture
- Organizational Leadership

### **Further readings**



#### **Physiological measures**

- Ganster, D. C., Crain, T. L., & Brossoit, R. M. (2018). Physiological measurement in the organizational sciences: A review and recommendations for future use. *Annual Review of Organizational Psychology and Organizational Behavior*, 5, 267-293.
- Heaphy, E. D., & Dutton, J. E. (2008). Positive social interactions and the human body at work: Linking organizations and physiology. *Academy of Management Review*, *33*(1), 137-162.

#### Further physiological measures

Video: <a href="https://www.youtube.com/watch?v=4maks2ls0TU">https://www.youtube.com/watch?v=4maks2ls0TU</a>

#### **Heart rate**

Massaro, S., & Pecchia, L. (2019). Heart rate variability (HRV) analysis: A methodology for organizational neuroscience.
 Organizational Research Methods, 22(1), 354-393.

#### **Skin conductance response**

• Christopoulos, G. I., Uy, M. A., & Yap, W. J. (2019). The body and the brain: measuring skin conductance responses to understand the emotional experience. *Organizational Research Methods*, 22(1), 394-420.

#### **Eye-Tracking**

• Meißner, M., & Oll, J. (2019). The promise of eye-tracking methodology in organizational research: A taxonomy, review, and future avenues. *Organizational Research Methods*, 22(2), 590-617.

## **Spotlight on...**





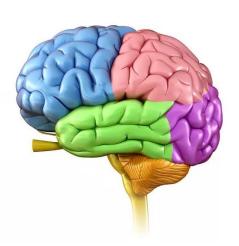


Neuroscientific methods

## Fun Facts about your brain



- 1 Weighs three pounds, has a texture like firm jelly, is made up of 75 percent water.
- Every time your heart beats, your arteries carry 20 to 25 percent of your blood to the brain.
- 3 Every time you recall a memory or have a new thought, you create a connection in the brain.
- 4 There are 100 billion neurons, but they make up only 10 percent of the brain.
- 5 Your brain is hungry.
- 6 There are 100,000 miles of blood vessels in the brain.
- 7 The brain is never at rest.
- 8 Challenging your brain prevents dementia.
- 9 The average number of thoughts per person per day is 70,000.
- 10 Brain processes information at up to 431 KM/H.



## Rough anatomical overview

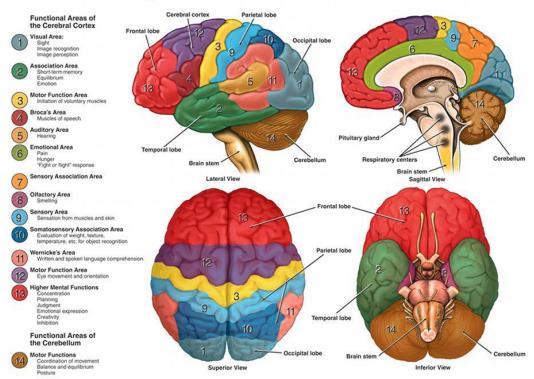




## Rough anatomical overview



#### **Anatomy and Functional Areas of the Brain**



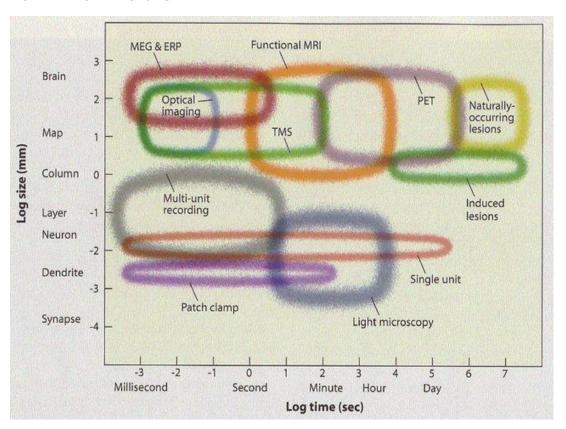
## Which neuroscientific measures do you know?





#### Overview over methods



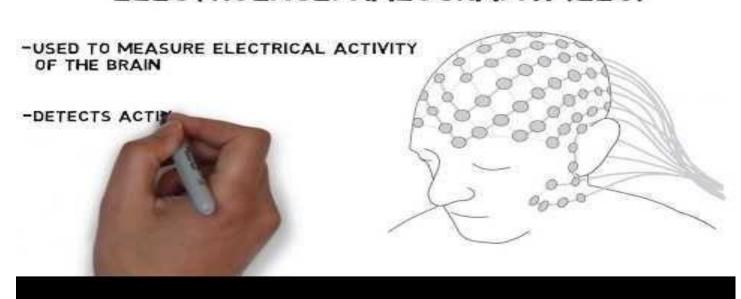


Lane, R. D., Waldstein, S. R., Chesney, M. A., Jennings, J. R., Lovallo, W. R., Kozel, P. J., ... & Cameron, O. G. (2009). The rebirth of neuroscience in psychosomatic medicine, Part I: historical context, methods, and relevant basic science. *Psychosomatic medicine*, 71(2), 117-134.

## 2-Minute Neuroscience: Electroencephalography (EEG)



#### ELECTROENCEPHALOGRAPHY (EEG)



# 2 -Minute Neuroscience: Functional Magnetic Resonance Imaging (fMRI)



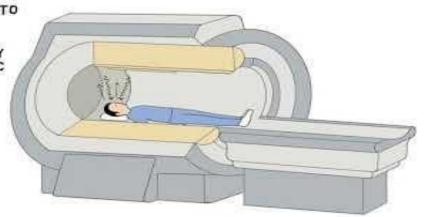
#### FUNCTIONAL MAGNETIC RESONANCE IMAGING (fMRI)

-INVOLVES EXPOSING THE BRAIN TO MULTIPLE MAGNETIC FIELDS

-HYDROGEN PROTONS RESPOND BY EMITTING AN ELECTROMAGNETIC SIGNAL

-SCANNER RECEIVES SIGNAL, USES IT TO CREATE HIGH-RES IMAGE OF THE BRAIN:





## The Added Value of Neuroscience Methods in Organizational Research



- a) a better understanding of the ontological basis of constructs of interest
- b) creating more precise or enhanced measurement, and
  - e.g. assessments of the brain (i.e., through scanning or sensing technologies) cannot lie, fake, or be prone to the myriad of biases/errors
- c) enhancing the ability to predict important organizational phenomena

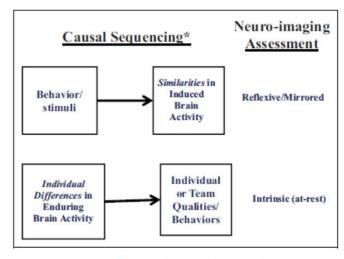


Figure 2. Alternative causal sequencing of brain activity in relation to behavior.

## Paper example: Electroencephalography (EEG)





Contents lists available at SciVerse ScienceDirect

#### The Leadership Quarterly

journal homepage: www.elsevier.com/locate/leaqua



Differentiating transformational and non-transformational leaders on the basis of neurological imaging

Pierre A. Balthazard a,\*, David A. Waldman a, Robert W. Thatcher b, Sean T. Hannah c

- A W. P. Carey School of Business, Arizona State University, USA
- b EEG and Neurolmaging Laboratory, Applied Neuroxience Research Institute, USA
- Center for the Army Profession and Bihic, West Point United States Military Academy, USA

#### ARTICLE INFO

ABSTRACT

Available online 22 September 2011

The purpose of this study was to evaluate the viability of using neurological imaging to classify transformational leaders, versus non-transformational leaders, as identified through existing psychometric methods. Specifically, power spectral analysis measures based on electroencephalograms (EEG) were used to develop and validate a discriminant function that can classify

Keywords: Transformational leadership

## Paper example: functional Magnetic Resonance Imaging (fMRI)





Lahti, T., Halko, M. L., Karagozoglu, N., & Wincent, J. (2019). Why and how do founding entrepreneurs bond with their ventures? Neural correlates of entrepreneurial and parental bonding. *Journal of Business Venturing*, *34*(2), 368-388.

#### Organizational Research Topic that could benefit from Neuroscientific Measures



#### Individual level-constructs

- Emotional Intelligence
- Mood
- Cognitive abilities
- Organizational justice
- Sensemaking

#### Team-level constructs

- Emotional contagion
- Shared mental models
- Leadership

## Food for thoughts: Some TEDx talks

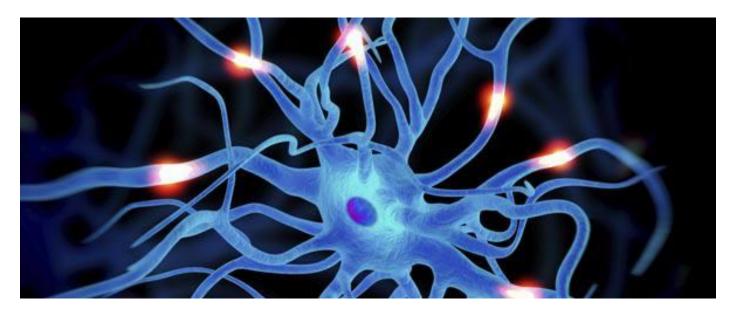


- The neuroscience of social conflict | Tim Phillips | TEDxBoston https://www.youtube.com/watch?v=AfljJGTVcKE
- The Neuroscience of Decision-Making: Are We Foul or Fair? | Kimberly Papillon |
   TEDxNashvilleWomen
   https://www.youtube.com/watch?v=aCWYkZ5i-gE
- Neuromarketing: The new science of consumer decisions | Terry Wu | TEDxBlaine https://www.youtube.com/watch?v=UEtE-el6KKs
- The Neuroscience of Leadership: Thomas Maak at TEDxESADE <a href="https://www.youtube.com/watch?v=CvOLbYChYcw">https://www.youtube.com/watch?v=CvOLbYChYcw</a>
- After watching this, your brain will not be the same | Lara Boyd | TEDxVancouver <a href="https://www.youtube.com/watch?v=LNHBMFCzznE">https://www.youtube.com/watch?v=LNHBMFCzznE</a>
- The neuroscience of social intelligence: Bill von Hippel at TEDxUQ 2014 <a href="https://www.youtube.com/watch?v=CM2wlS8UejE">https://www.youtube.com/watch?v=CM2wlS8UejE</a>

#### **Exercise!**



Which neuro-physiological measures could you apply to examine your research question/topic?



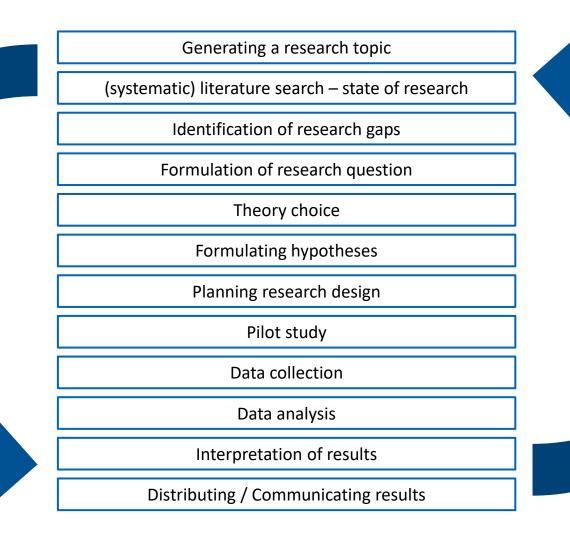
#### Caveat! No method is without flaws



- Methods are a means to an end.
   Neurological or physiological measures and technology are not silver bullets.
- Neurological mechanisms can inform various organizational behavior and practices.
- Fancy technology is not necessarily required to take an ON approach to research and practice.
  - → Have a sound design, be open-minded, and strike up collaborations.
- Conducting organizational neuroscience research is not without its challenges:
  - practical issues
  - collaborative translation
  - interpretation and communication of results

#### Beware:

- potential for excessive reductionism and ethical concerns!
- neurophilia



## **Pretesting**



Expert check or qualitative Pretest (think aloud study)	Quantitative Pretest (SPSS, Excel, STATA etc.)
Are the questions easy to understand? Can the questions be answered?	Do participants' answers have enough variance?
Are there language barriers?	Are there missing values?
Are the instructions easy to understand?	Do experimental manipulations work?
Do the technicalities work (online questionnaire, experiment)?	Do experimental tasks work?
Do participants guess the purpose of the study?	•••

. . .