MSR 2025, Ottawa, Canada — Vision and Reflection

# The Standard of Rigor for MSR Research A 10-Year Evolution

Bogdan Vasilescu @b\_vasilescu







Systems Department

#### About me

- Raj Reddy Associate Professor of Software and Societal Systems
- Societal Computing PhD program director
- <u>Socio-Technical Research Using Data Excavation Lab</u>





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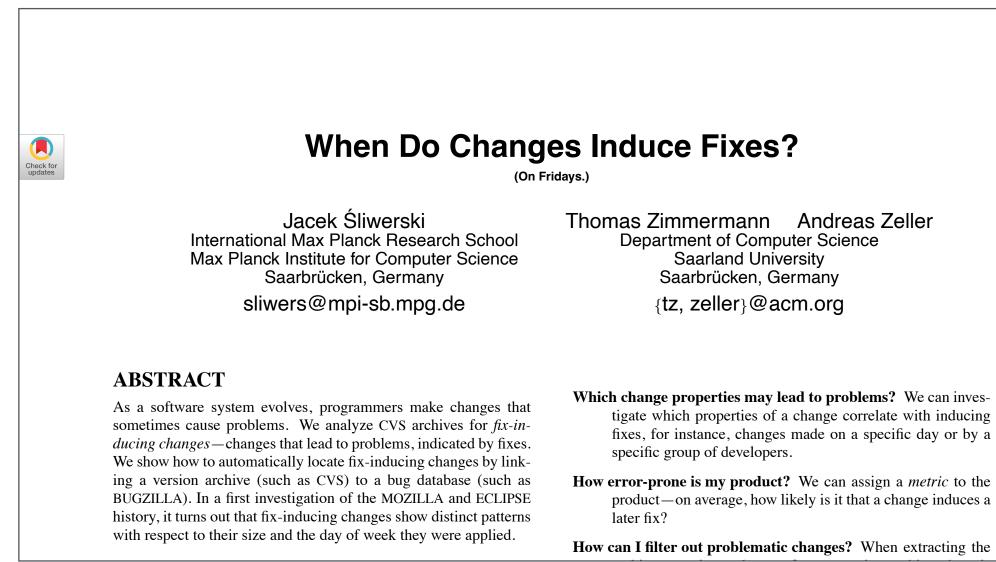






### About me

- Raj Reddy Associate Professor of Software and Societal Systems
- Societal Computing PhD program director
- Socio-Technical Research Using Data Excavation Lab
- Reading since MSR 2005, attending since MSR Summer School 2012



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Check for updates



#### Mining Email Social Networks<sup>\*</sup>

Christian Bird, Alex Gourley, Prem Devanbu, Michael Gertz Dept. of Computer Science, Kemper Hall, University of California, Davis, Davis, California Republic. cabird.devanbu@ucdavis.edu

#### ABSTRACT

Communication & Co-ordination activities are central to large software projects, but are difficult to observe and study in traditional (closed-source, commercial) settings because of the prevalence of informal, direct communication modes. OSS projects, on the other hand, use the internet as the communication medium, and typically conduct discussions in an open, public manner. As a result, the email archives of OSS projects provide a useful trace of the communication and co-ordination activities of the participants. However, there are various challenges that must be addressed before this data can be effectively mined. Once this is done,

Anand Swaminathan Graduate School of Management, University of California, Davis, Davis, California Republic.

aswaminathan@ucdavis.edu

#### **1. INTRODUCTION**

Large-scale software development projects invariably require a lot of communication and coordination (C&C) amongst the project workers. We distinguish these activities from engineering activities, where actual artifacts such as source code or documents are modified. The difficulty and intensity of the required coordination effort is quite high this is often cited as the reason why adding more developers doesn't necessarily speed-up development [4]. C&C activities influence (and are influenced by) the design, structure and evolution of software systems. In traditional, commercial software organization. C&C activities may occur inforand would be difficult to study. From if coordinat





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- Raj Reddy Associ
- Societal Comput
- <u>Socio-Technical </u>
- Reading since M



Jacek Śliwerski International Max Planck Resea Max Planck Institute for Comput Saarbrücken, German sliwers@mpi-sb.mpg

#### ABSTRACT

As a software system evolves, programmers mak sometimes cause problems. We analyze CVS arch ducing changes—changes that lead to problems, ind We show how to automatically locate fix-inducing cl ing a version archive (such as CVS) to a bug dat BUGZILLA). In a first investigation of the MOZILLA history, it turns out that fix-inducing changes show d with respect to their size and the day of week they v

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### About me

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Ric Holt Early Career Achievement award

Awarded at the 18th International Conference on Mining Software Repositories (MSR 2021)

May 17-19 2021 Virtual MSR 2021

Presented to Bogdan Vasiloscu

For his seminal contributions in the area of socio-technical behaviour of software engineer

#### **Vetworks**\*

Anand Swaminathan aduate School of Management University of California, Davis, Davis, California Republic.

waminathan@ucdavis.edu

#### **TRODUCTION**

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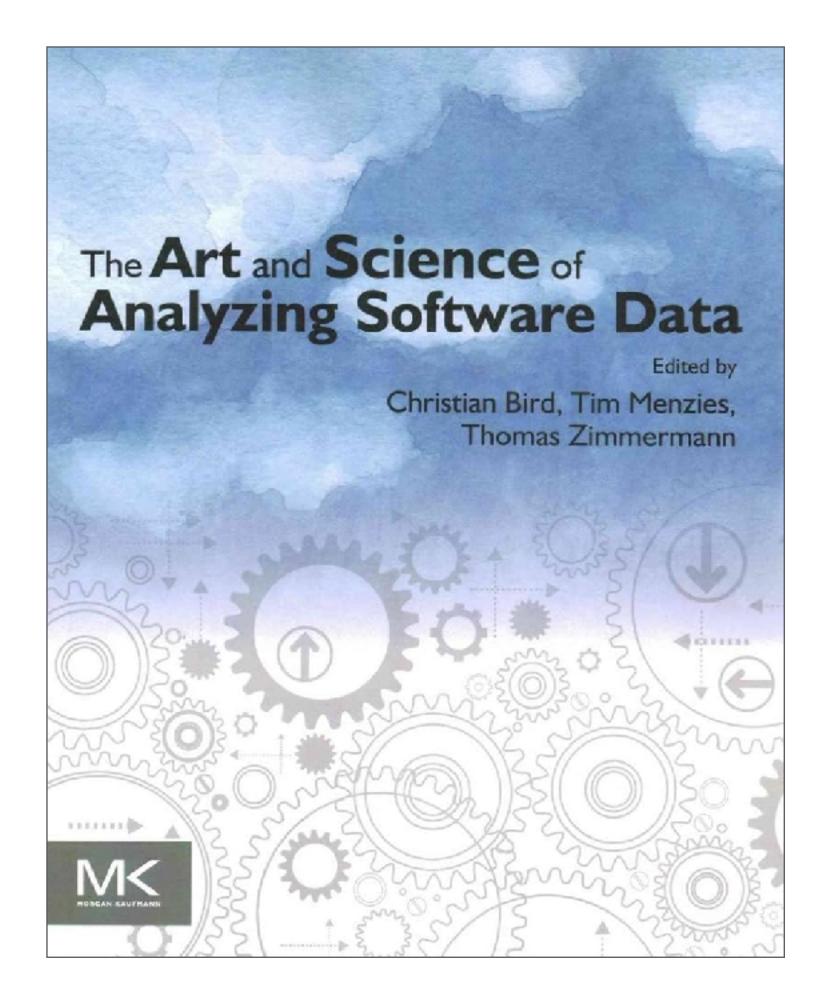
### There is no such thing as MSR!

#### MSR = Data Science + Software Engineering

Table 1.3 Mapping Information Needs (Left) to Automatic Technique (Right)				
Information Need	Description	Insight	<b>Relevant Techniques</b>	
Summarization	Search for important or unusual factors to associated with a time range.	Characterize events, understand why they happened.	Topic analysis, NLP	
Alerts (& Correlations)	Continuous search for unusual changes or relationships in variables	Notice important events.	Statistics, Repeated measures	
Forecasting	Search for and predict unusual events in the future based on current trends.	Anticipate events.	Extrapolation, Statistics	
Trends	How is an artifact changing?	Understand the direction of the project.	Regression analysis	
Overlays	What artifacts account for current activity?	Understand the relationships between artifacts.	Cluster analysis, repository mining	
Goals	How are features/artifacts changing in the context of completion or some other goal?	Assistance for planning	Root-cause analysis	
Modeling	Compares the abstract history of similar artifacts. Identify important factors in history.	Learn from previous projects.	Machine learning	
Benchmarking	Identify vectors of similarity/difference across artifacts.	Assistance for resource allocation and many other decisions	Statistics	
Simulation	Simulate changes based on other artifact models.	Assistance for general decisions	What-if? analysis	

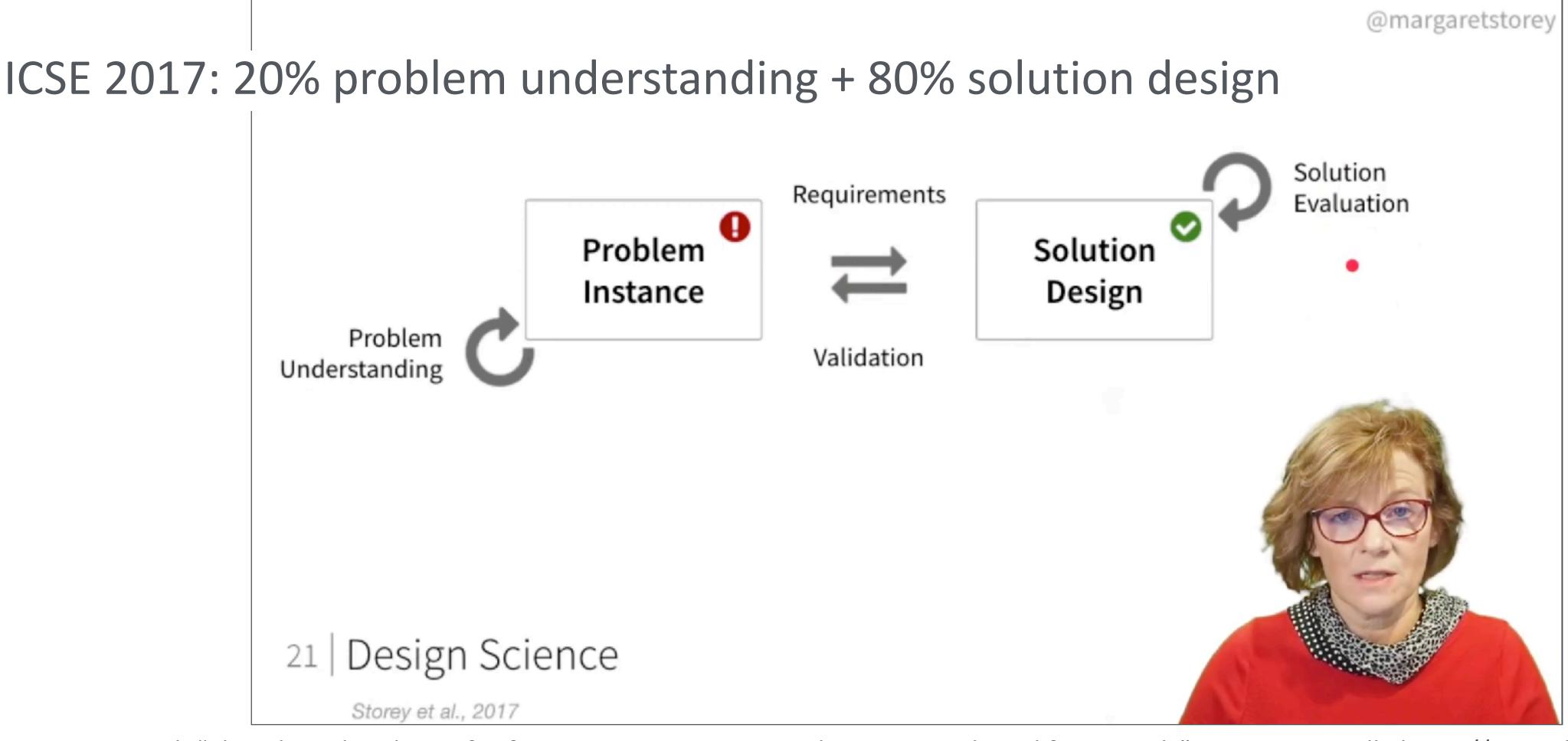
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### MSR is, more or less, quantitative empirical software engineering?



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• Storey, Ernst, et al. "The who, what, how of software engineering research: a socio-technical framework." EMSE 2020. Talk: https://youtu.be/fs2XhM5-zXI



Where is MSR now? How have we changed in the last 10 years? How to increase the impact of our work?















# MSR 2015 (Florence) vs MSR 2025 (Ottawa)







# MSR 2015 (Florence) vs <del>MSR 2025 (Ottawa)</del>



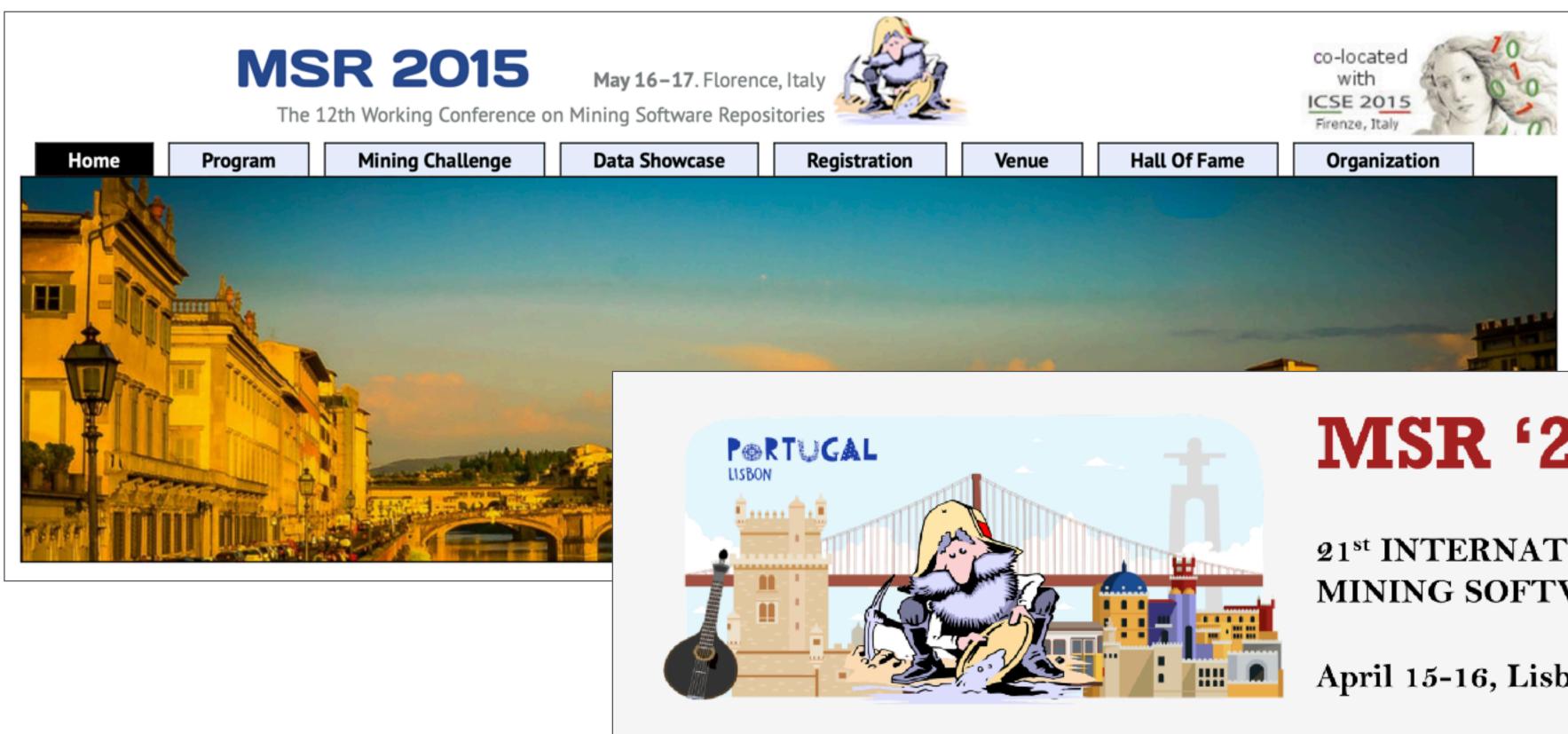
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#### No proceedings, no preprints $(\mathcal{Y}) / (\mathcal{Y})$



# MSR 2015 (Florence) vs MSR 2024 (Lisbon)



Attending -

Q Search Program -Tracks -Organization -Series -

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#### **MSR '24**

**21st INTERNATIONAL CONFERENCE ON** MINING SOFTWARE REPOSITORIES

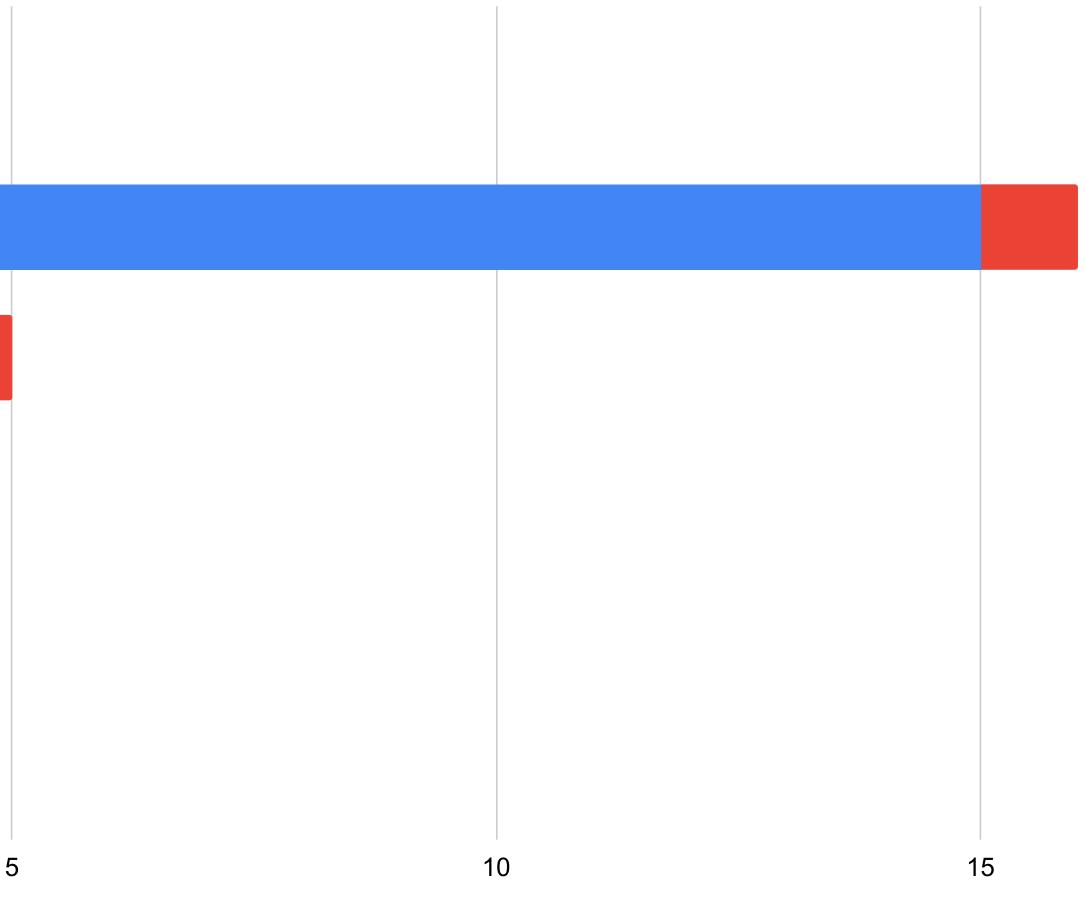
April 15-16, Lisbon, Portugal



Types of 10-page papers at MSR 2015 (Florence)

Compare algorithms / techniques to do X Exploratory study to characterize X New technique to do X Quantitatively test hypothesis Reflection on MSR assumptions Simulation to identify underlying mechanism 0

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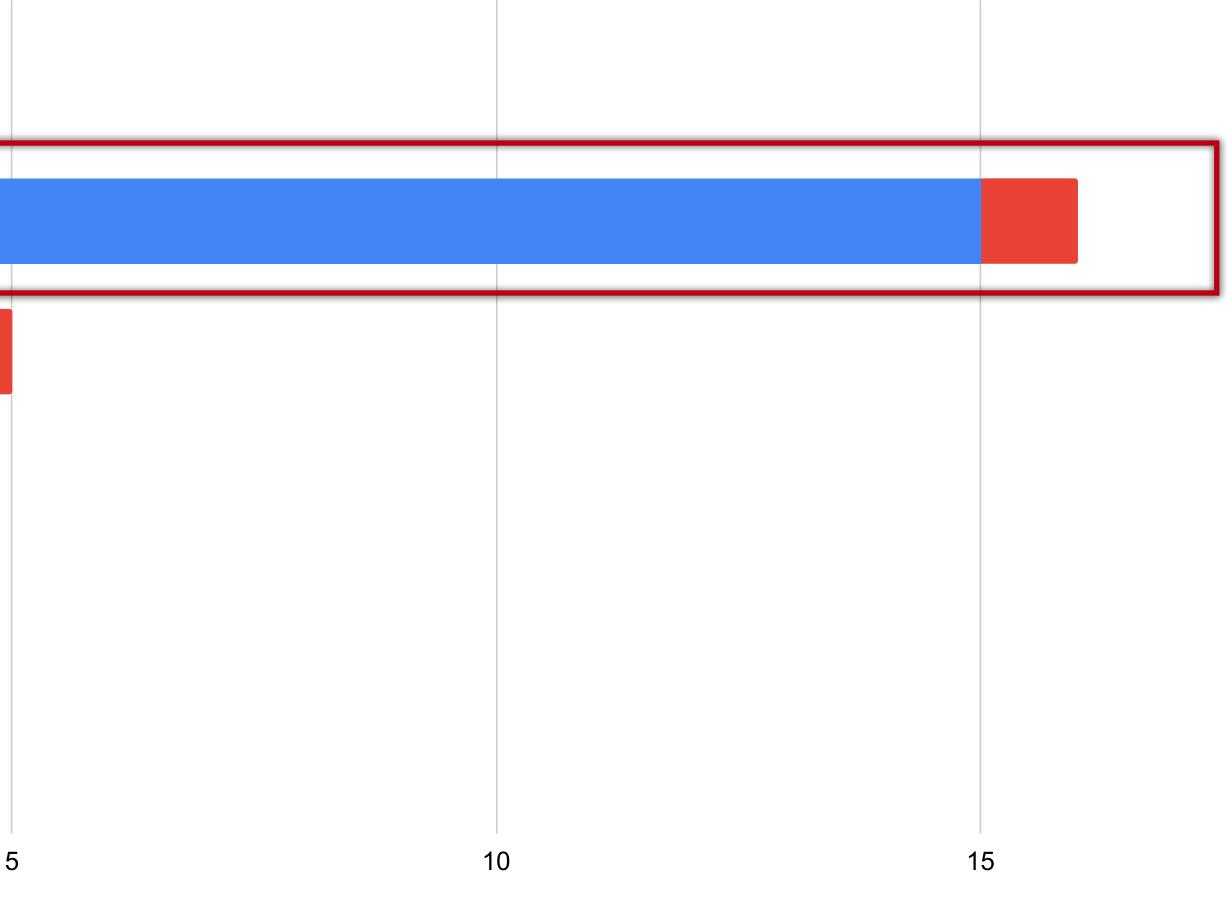




Types of 10-page papers at MSR 2015 (Florence)

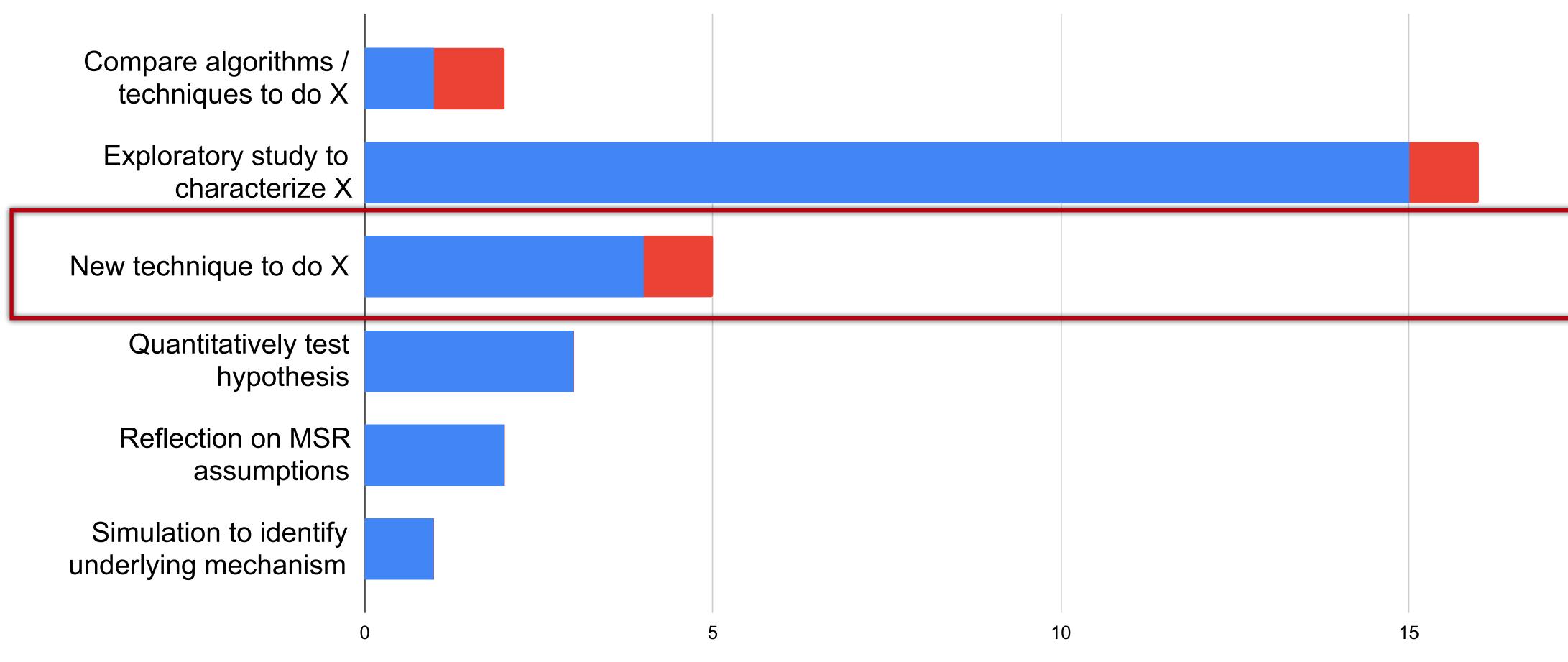
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Types of 10-page papers at MSR 2015 (Florence)

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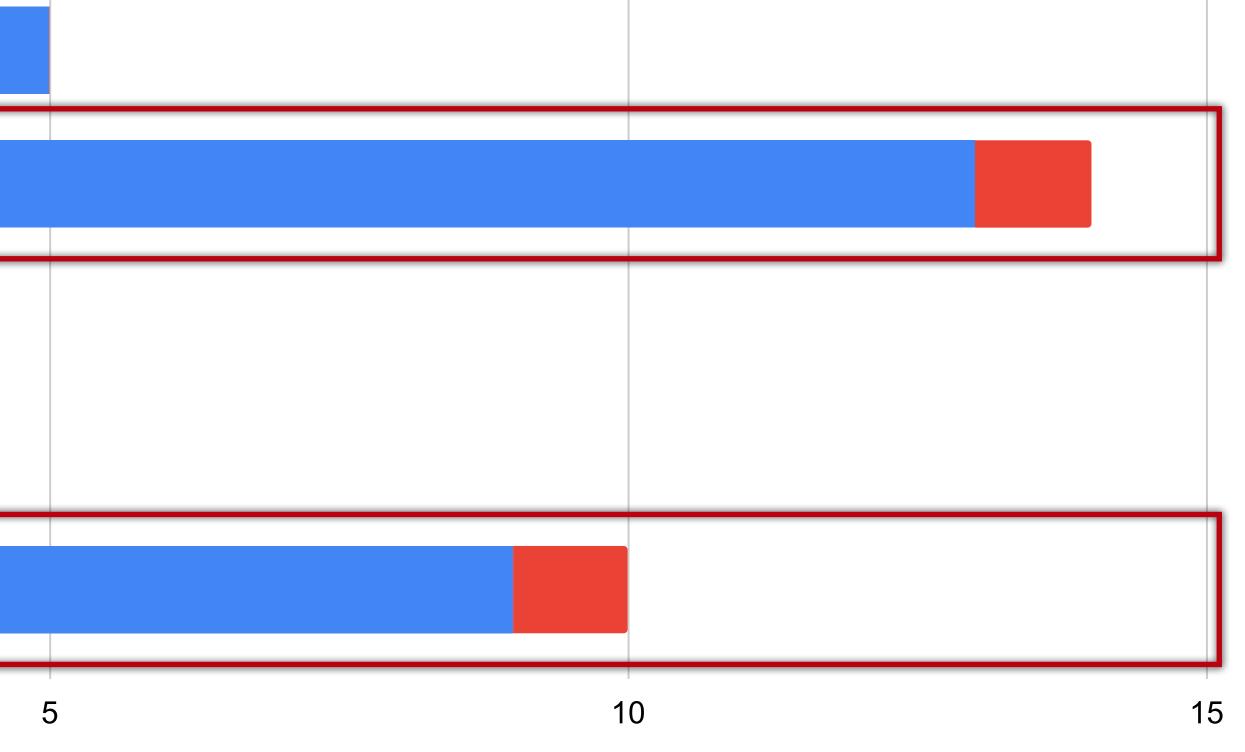


## MSR 2024 (Lisbon): 37 full papers

#### Types of 10-page papers at MSR 2024 (Lisbon)

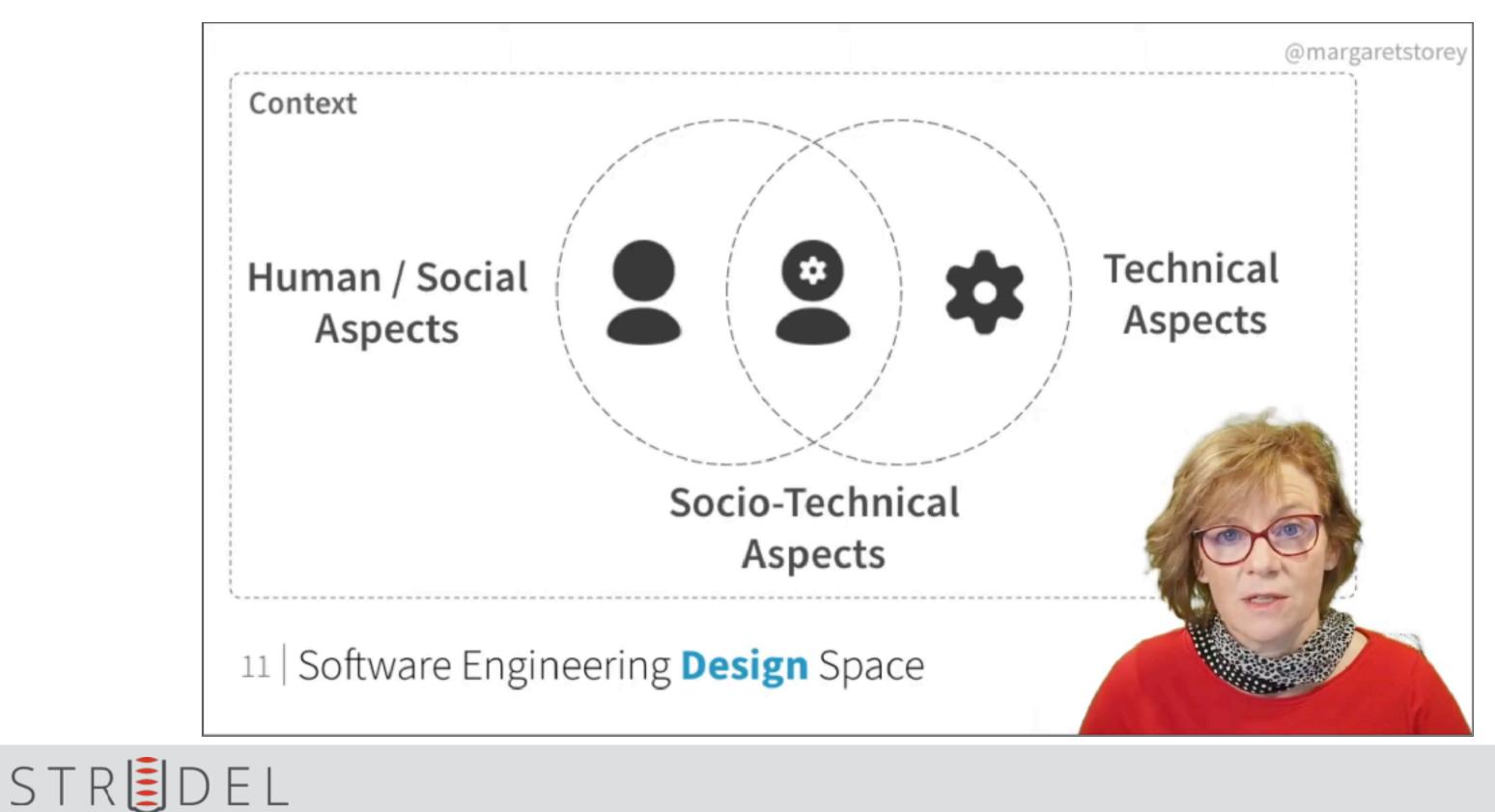
Compare algorithms / techniques to do X	
Exploratory study to characterize X	
How well can LLMs do X? / Benchmark evaluation	
New dataset / benchmark	
New technique to do X	
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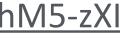


## Lots written about high-quality, impactful SE research already

- Storey, Ernst, et al. "The who, what, how of software engineering research: a socio-technical framework." EMSE 2020.
  - Argument to increase impact by increasing the emphasis on humans



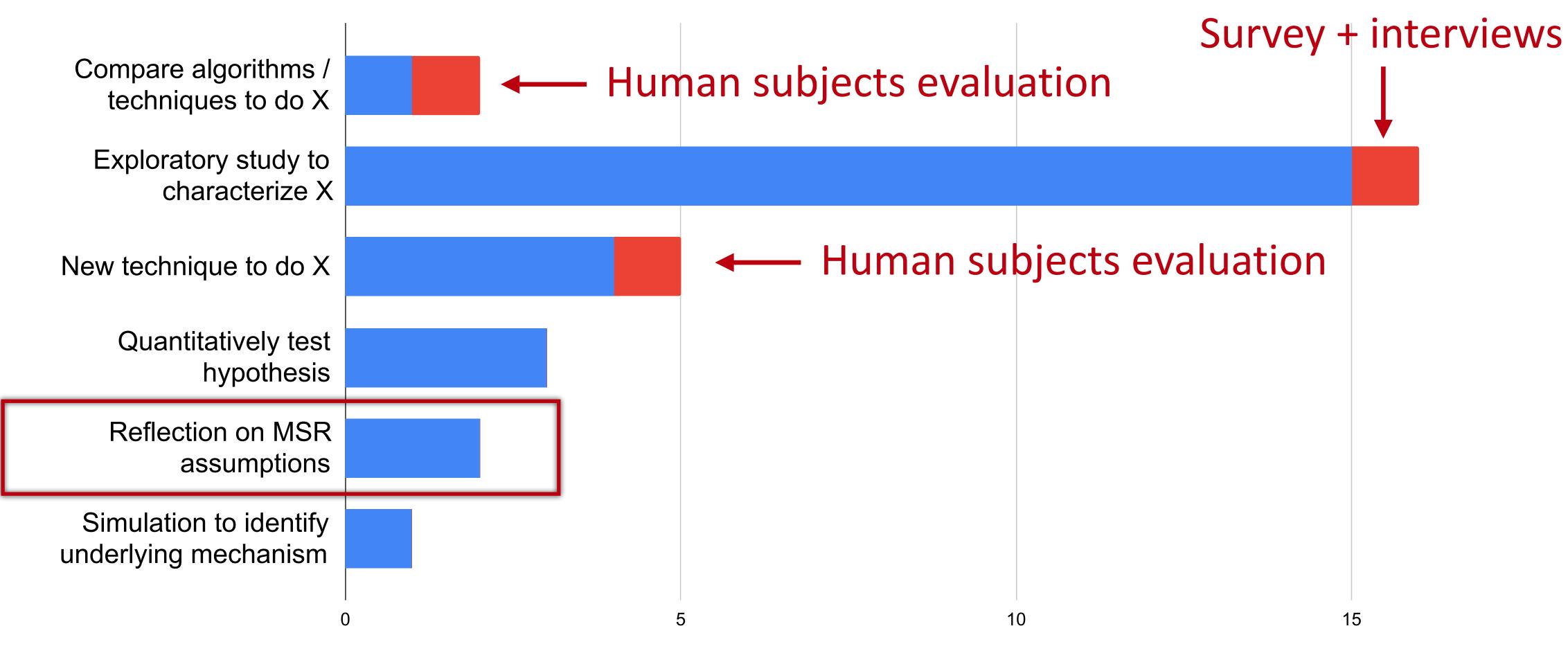
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Types of 10-page papers at MSR 2015 (Florence)

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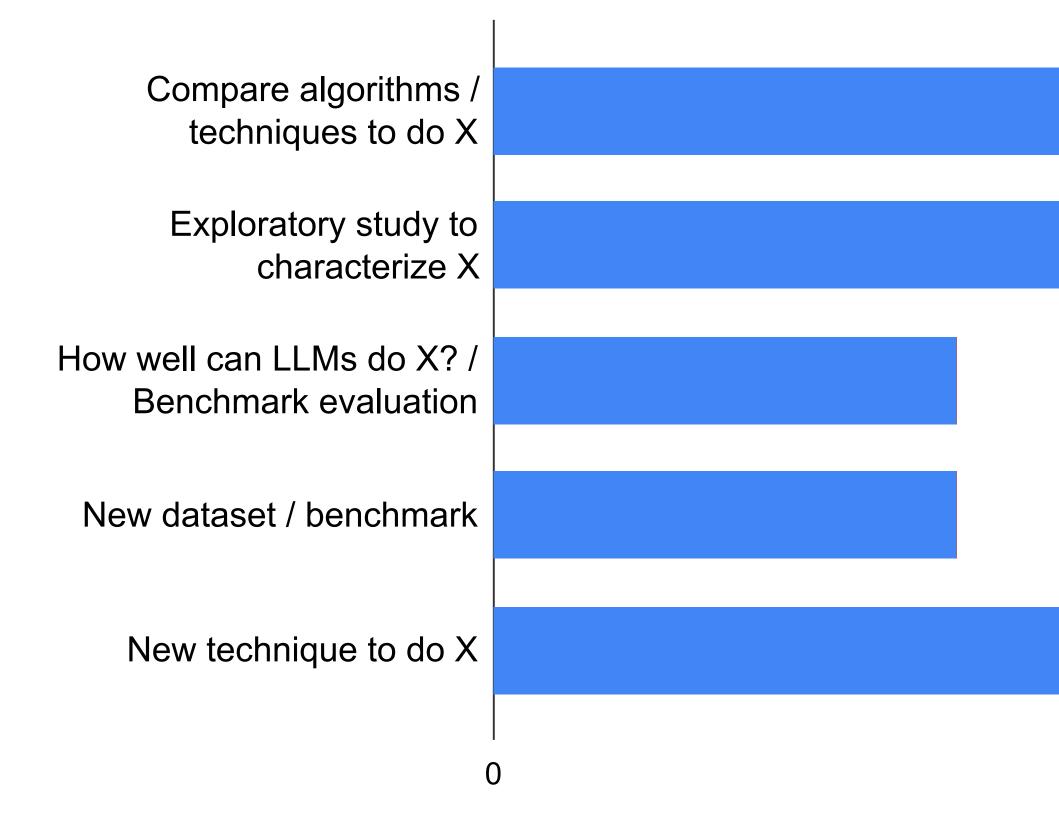


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## MSR 2024 (Lisbon): 37 full papers

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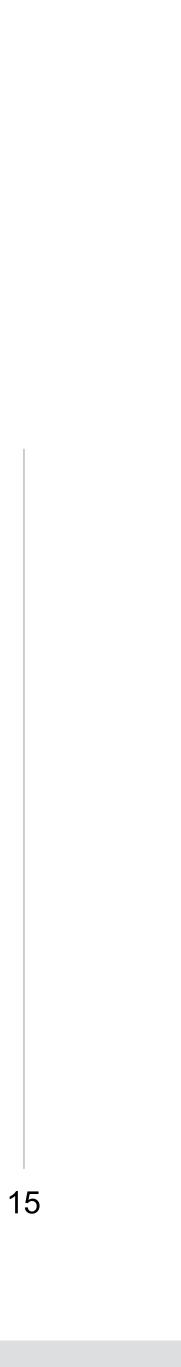


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#### Human subjects evaluation

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## Lots written about high-quality, impactful SE research already

- Mary Shaw, "Writing Good Software Engineering Research Papers." 2003
  - "Why should the reader believe your result?"
  - "What concrete evidence shows that your result satisfies your claim?"

(Among many others)

• Laurie Williams & colleagues, "Writing Good Software Engineering Research Papers: Revisited." 2017





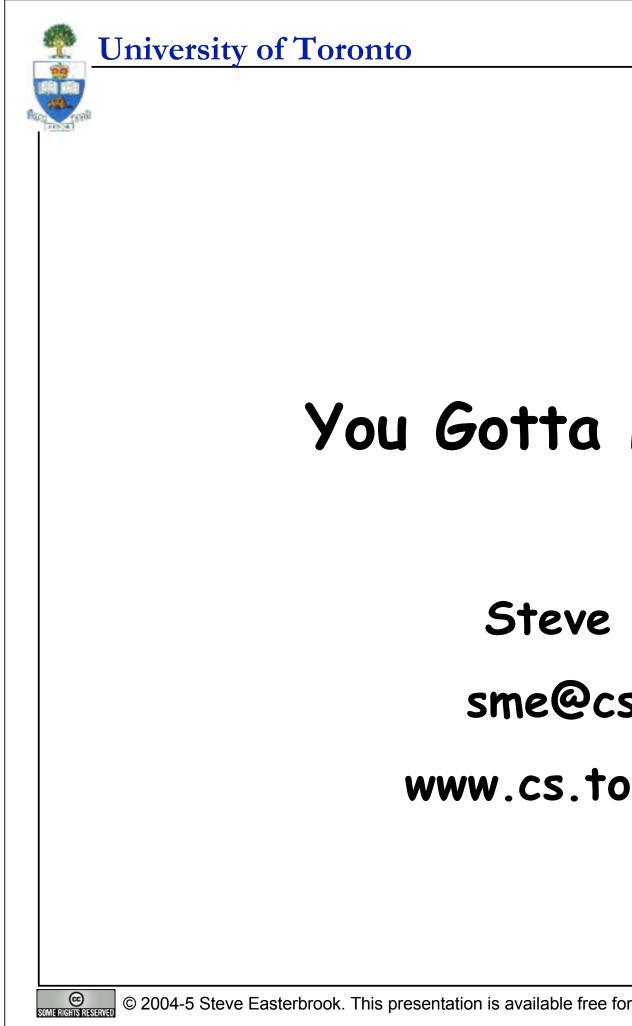
## Still, perception that MSR research is shallow ...

- In big data some patterns and associations are always visible
- Data doesn't mean insights
- "So what?"
- Etc





### We have known a solution for over 20 years



• Easterbrook. FSE 2006 Doctoral Symposium

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Department of Computer Science

#### You Gotta Have A Theory

Steve Easterbrook

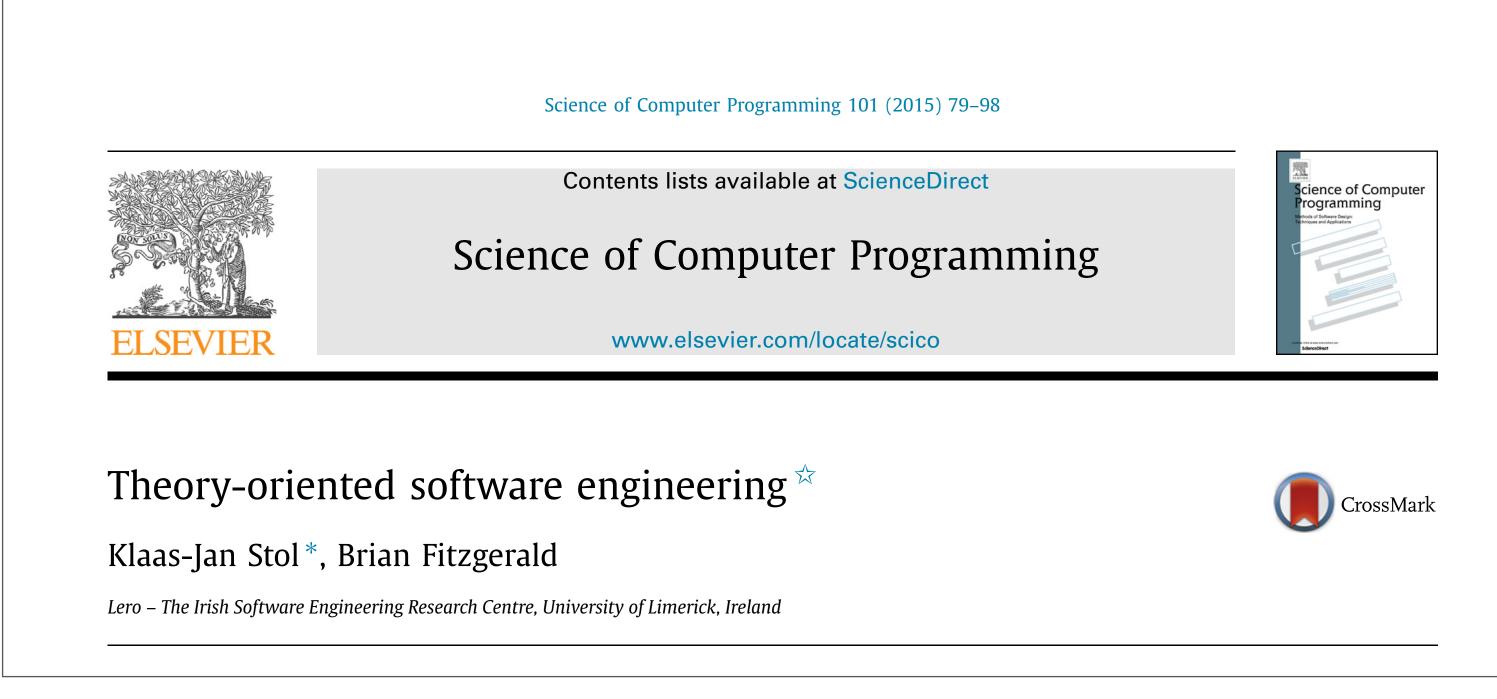
sme@cs.toronto.edu

www.cs.toronto.edu/~sme

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### The same argument reappears from time to time



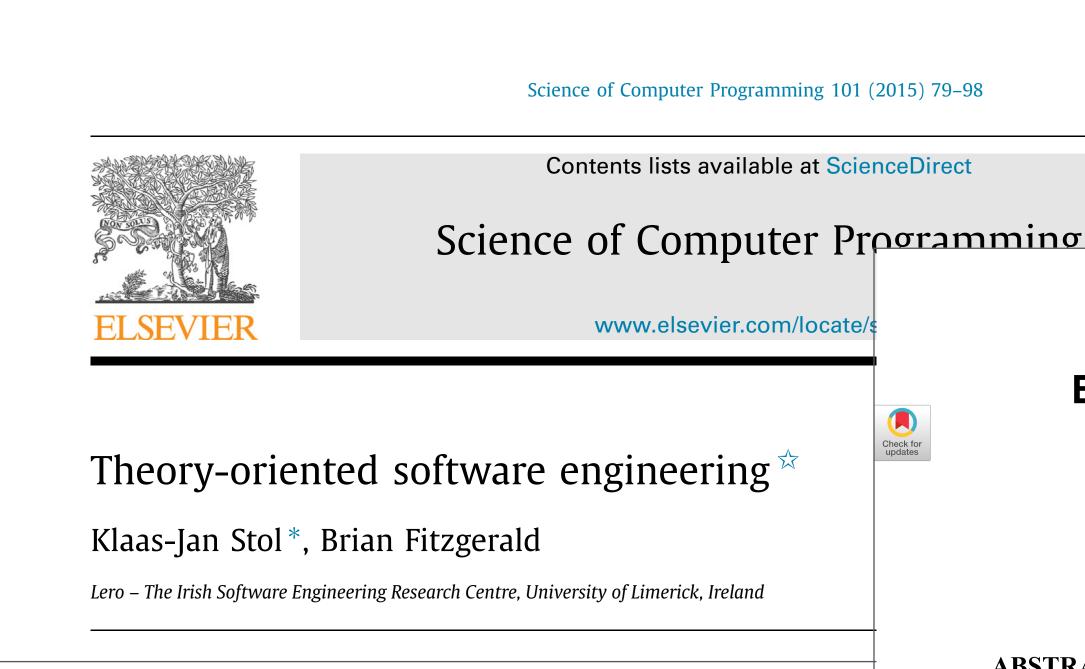
@SCP 2015







### The same argument reappears from time to time



@SCP 20<sup>-</sup>





#### **Building a Socio-Technical Theory of Coordination:** Why and How (Outstanding Research Award)

James Herbsleb Carnegie Mellon University 5000 Forbes Avenue Pittsburgh, PA 15213 +1 412 268 8933 jdh@cs.cmu.edu

#### ABSTRACT

Research aimed at understanding and addressing coordination breakdowns experienced in global software development (GSD) projects at Lucent Technologies took a path from open-ended qualitative exploratory studies to quantitative studies with a tight focus on a key problem – delay – and its causes. Rather than being directly associated with delay, multi-site work items involved more people than comparable same-site work items, and the number of people was a powerful predictor of delay. To counteract this we developed and deployed tools and practices t

or innovate. When people organize in a habitual, consistent way, for example, in collocated teams, it is easy to overlook day-to-day coordination mechanisms that are simply taken for granted. It is easy to see the importance of things such as meetings of various flavors, processes, methods, and architectural separation, which have long been studied. Other, subtler mechanisms such as informal communication, practices, habits, and shared mental models are often only made visible by their absence.

Very interesting – and often disturbing – things happen when an

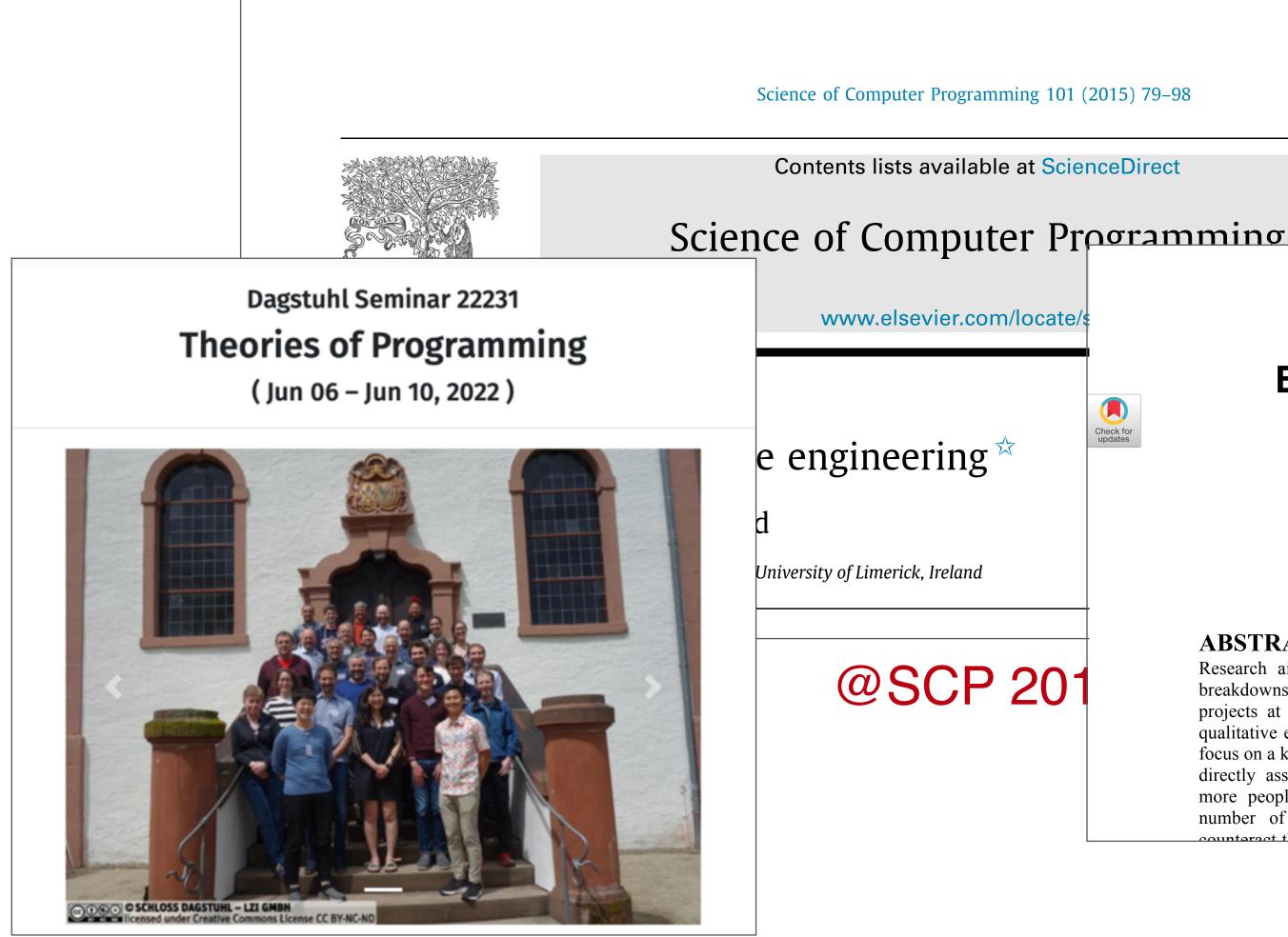
#### @FSE 2016







### The same argument reappears from time to time



#### @Dagstuhl 2022

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#### @FSE 2016







## We already have lots of CS-related theories

- Statistical theory enables proper hypothesis testing and confidence intervals
- Information theory guides efficient data encoding and compression
- Linear algebra and calculus form the backbone of most machine learning models
- Optimization theory guides efficient model training approaches
- Etc.





## But not enough good theories about SE processes and stakeholder behavior

- A theory is a set of **propositions** that are logically related, expressing the relation(s) among several different constructs and propositions.
- Theories are the building blocks of scientific knowledge.





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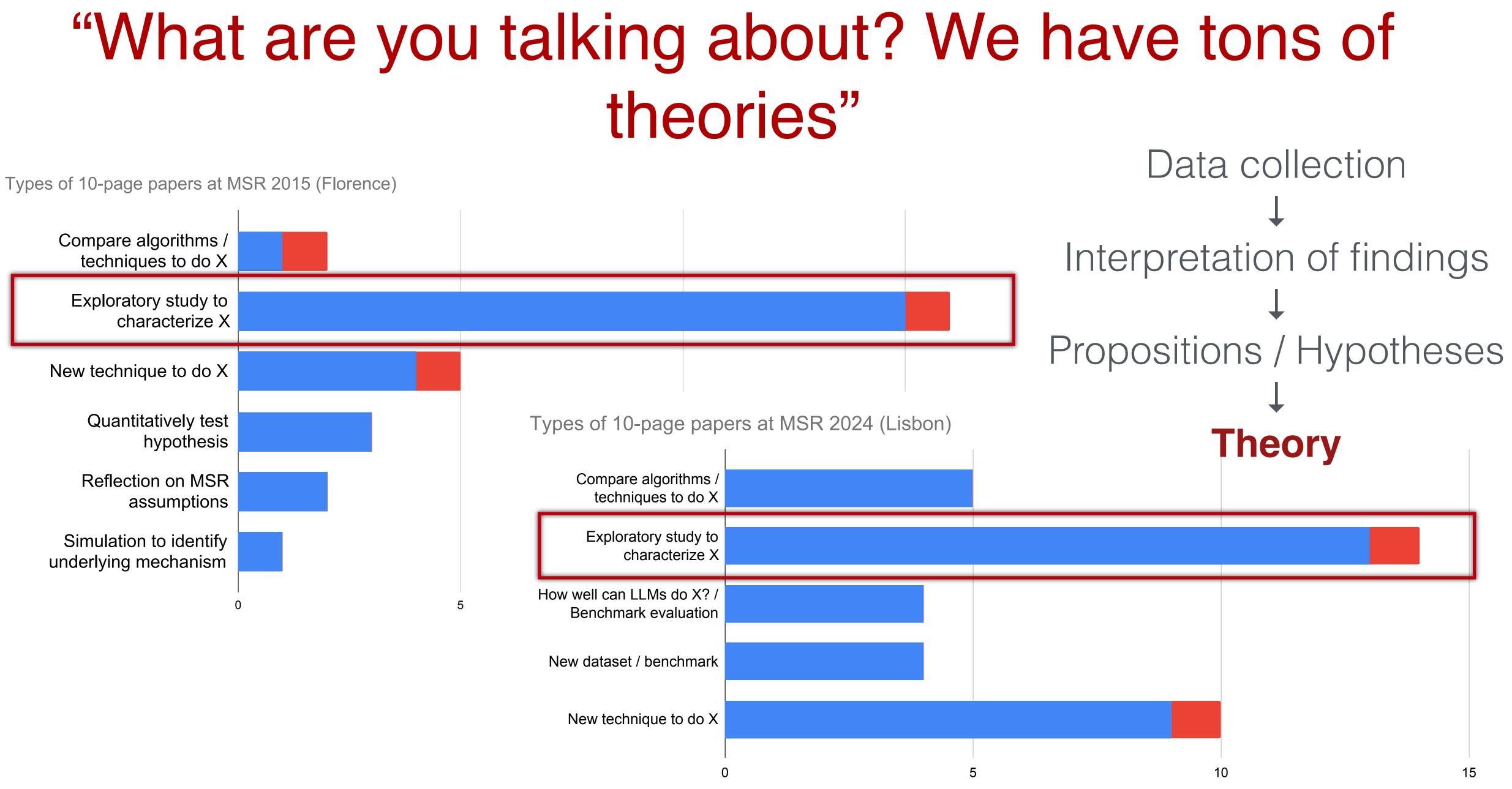


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ool nce	Thomas Zimmermann Andreas Zeller Department of Computer Science Saarland University Saarbrücken, Germany {tz, zeller}@acm.org		

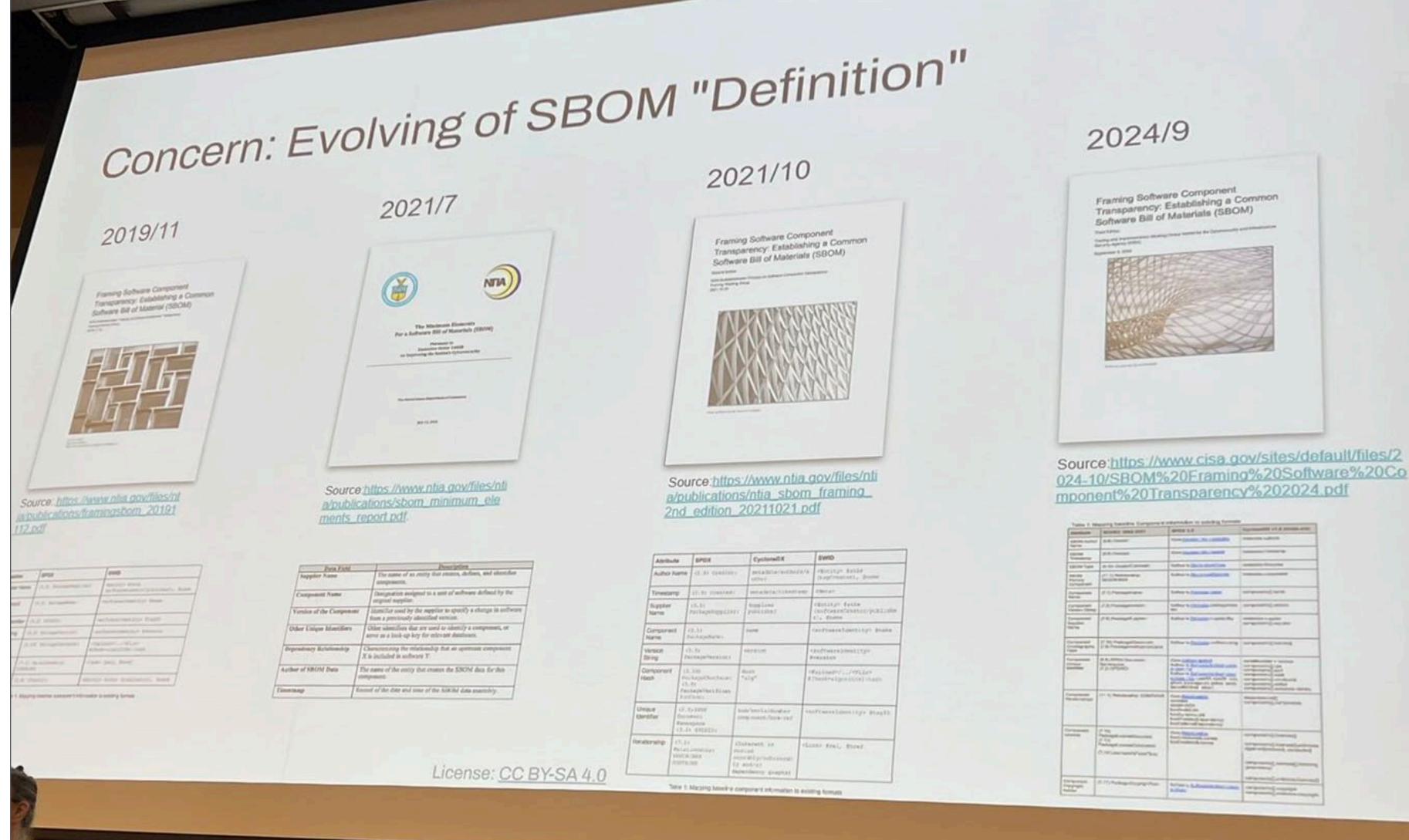




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### SBOMs are a kind of theory

024-10/SBOM%20Framing%20Software%20Co



## But not enough good theories about SE processes and stakeholder behavior

- A theory is a set of **propositions** that are logically related, expressing the relation(s) among several different constructs and propositions.
- Theories are the building blocks of scientific knowledge.
- A theory that describes a phenomenon is a valid theory.
- A good theory both explains how and why certain phenomena occur, and allows predictions to be made.

Theory Hypotheses Data collection Interpretation of findings Validation / Refinement

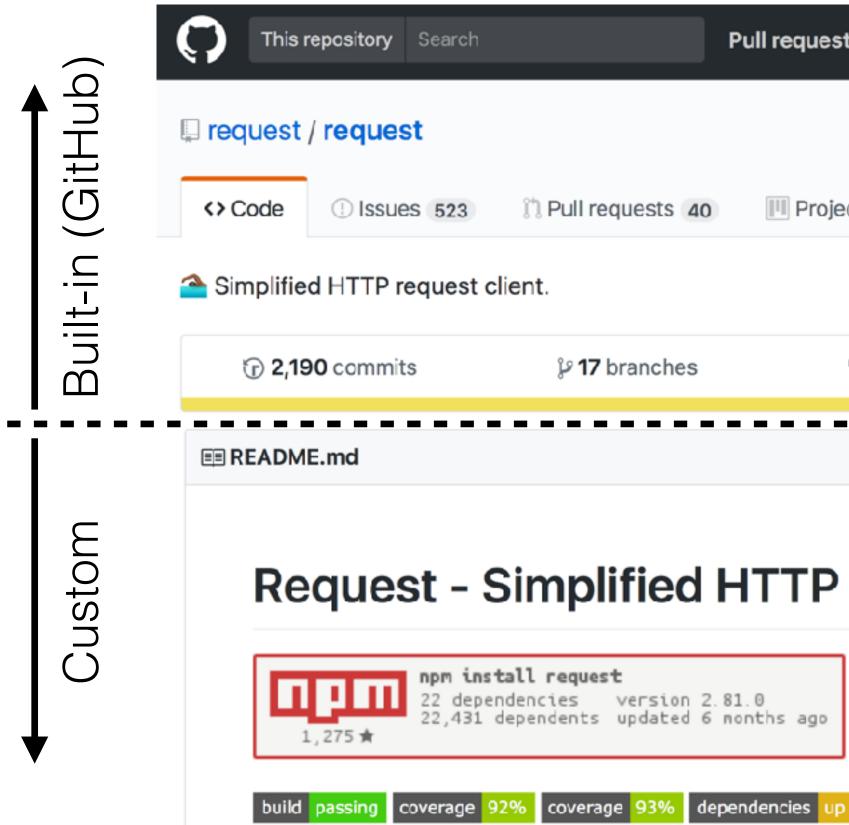






## Example: Signaling theory (Spence, 1973)

People use the visible cues on the platform as signals, to make rick inferences about unobservable traits of other users or projects.



• Trockman, Zhou, Kästner, & Vasilescu. Adding sparkle to social coding: An empirical study of repository badges in the npm ecosystem. ICSE 2018

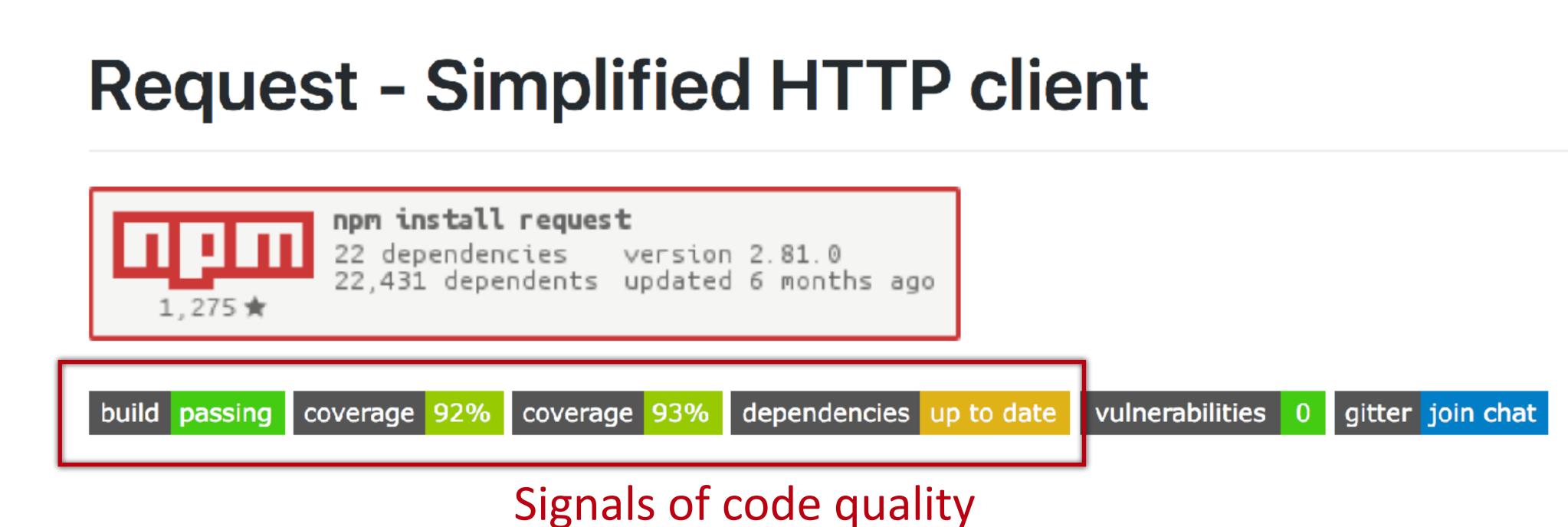


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# Example: Signaling theory (Spence, 1973)

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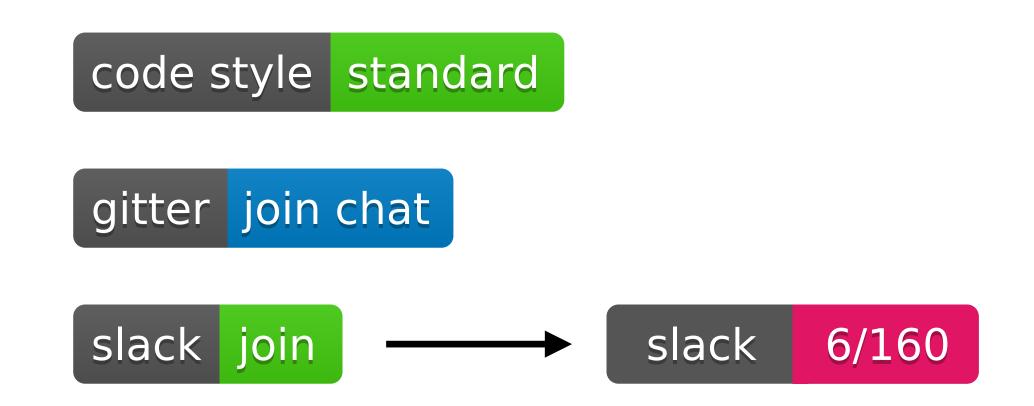
• Trockman, Zhou, Kästner, & Vasilescu. Adding sparkle to social coding: An empirical study of repository badges in the npm ecosystem. ICSE 2018





# Example: Signaling theory (Spence, 1973)

result in the two types of badges having differential effects. Harder to fake "assessment" badges provide more reliable signals.



• Trockman, Zhou, Kästner, & Vasilescu. Adding sparkle to social coding: An empirical study of repository badges in the npm ecosystem. ICSE 2018



- "Assessment" vs "conventional" signals: the cost of producing the signal should



## But not enough good theories about SE processes and stakeholder behavior

- A theory is a set of **propositions** that are logically related, expressing the relation(s) among several different constructs and propositions.
- Theories are the building blocks of scientific knowledge.
- A theory that describes a phenomenon is a valid theory.
- A good theory both explains how and why certain phenomena occur, and allows predictions to be made.
  - We don't have enough of these!



Theory Hypotheses Data collection Interpretation of findings Validation / Refinement

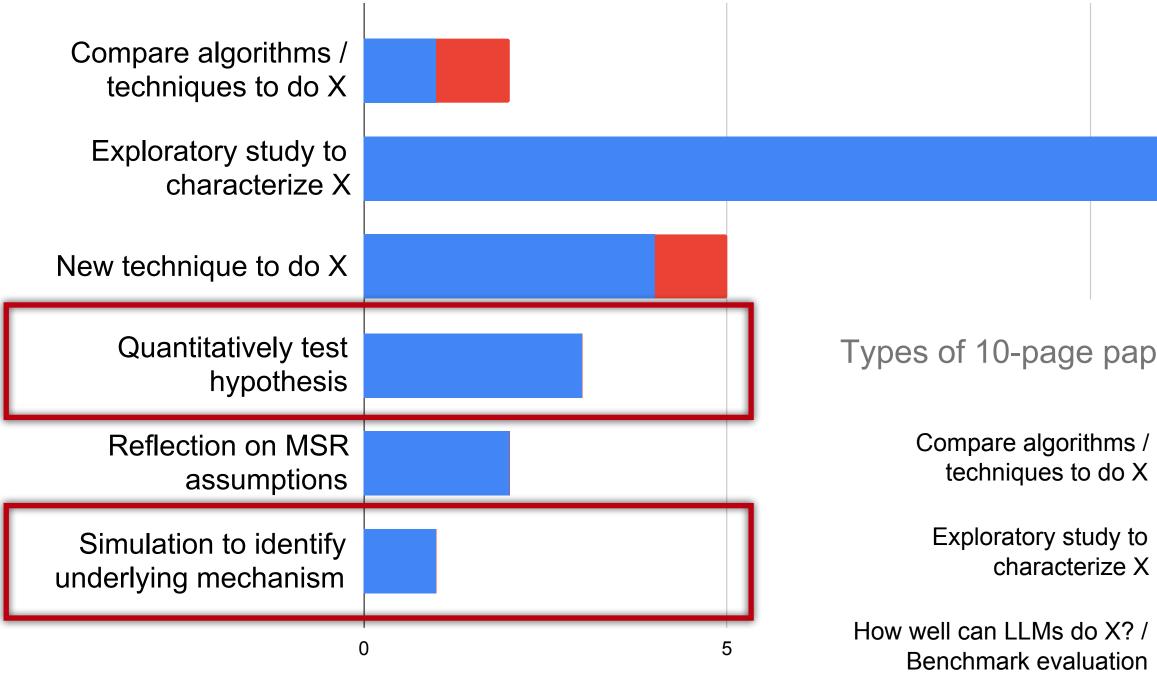






### We have very little deductive use of theories

Types of 10-page papers at MSR 2015 (Florence)

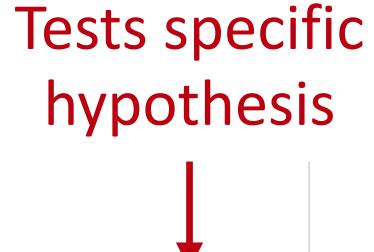


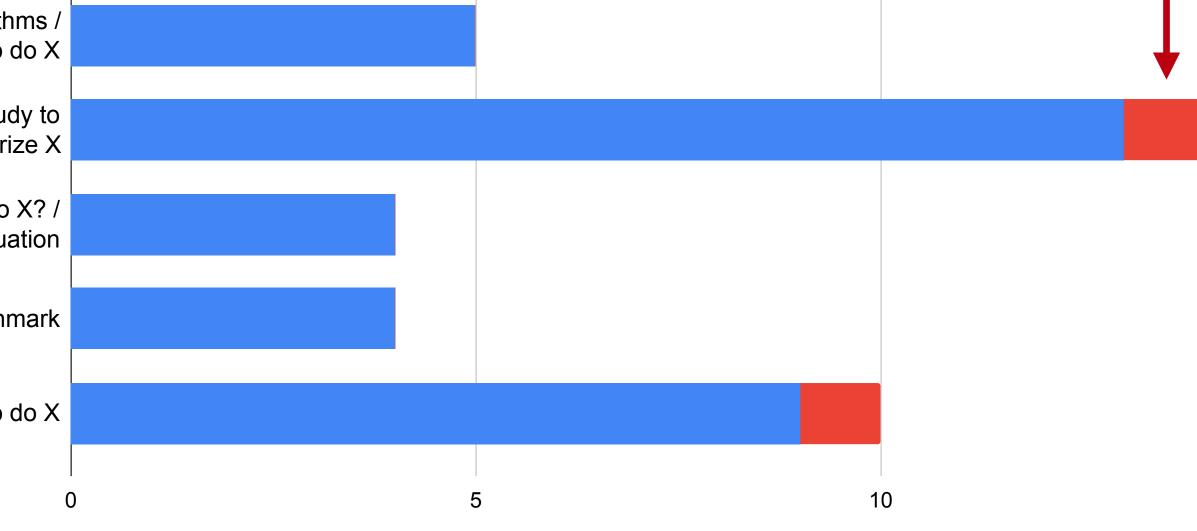
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New dataset / benchmark

New technique to do X

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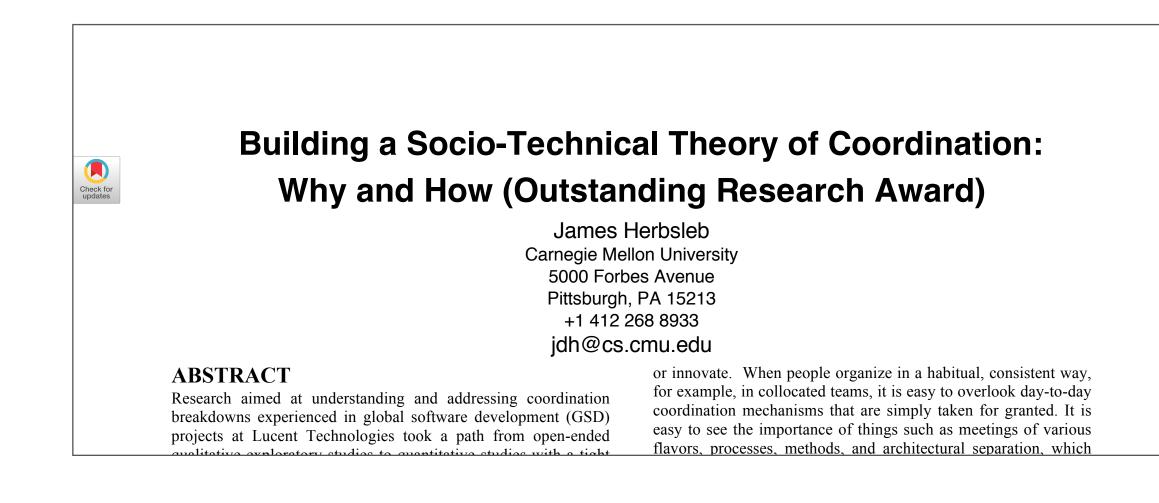




## Is there space for this kind of theory in MSR?

Herbsleb is skeptical:

- "The universal principle of interdisciplinary contempt"
- "Intellectual worth is evaluated on a single dimension from math to BS"
- "Is that really computer science?"



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Carnegie Mellon University School of Computer Science So are Menzies & Shepperd:

• "Data analytics studies are almost always theory light because they're inductive in their approach."





Contents lists available at ScienceDirect

Information and Software Technology

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

"Bad smells" in software analytics papers

Tim Menzies<sup>a,\*</sup>, Martin Shepperd<sup>b</sup>



<sup>a</sup> Dept. of Computer Science North Carolina State University, USA <sup>b</sup> Brunel Software Engineering Lab (BSEL) Dept. of Computer Science Brunel University London UB8 3PH, UK



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## Proposal: Let's establish more causal relationships

- allows predictions to be made.
  - Causal relationships allow for stronger predictions
  - Bonus points if we validate the mechanism



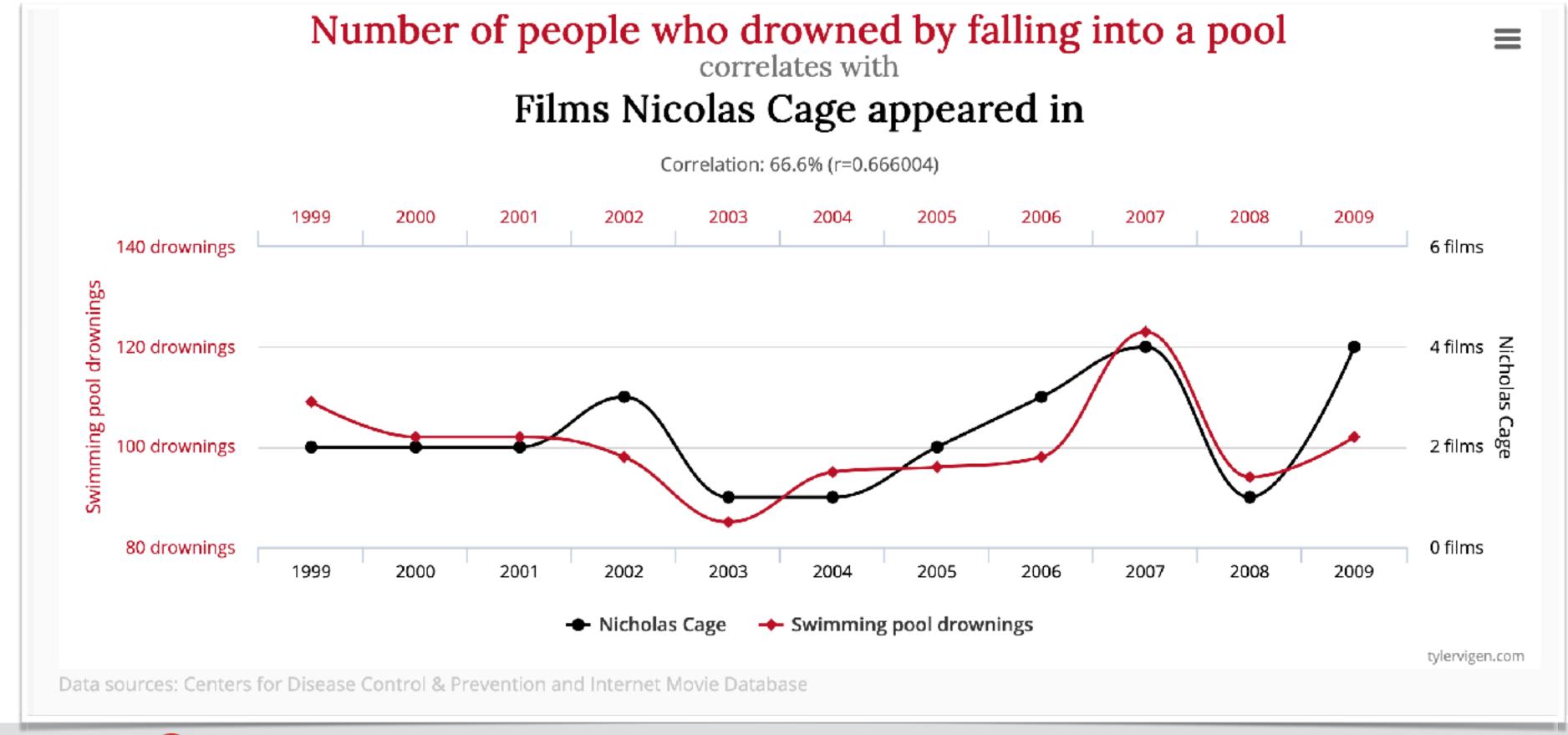
• A good theory both explains how and why certain phenomena occur, and





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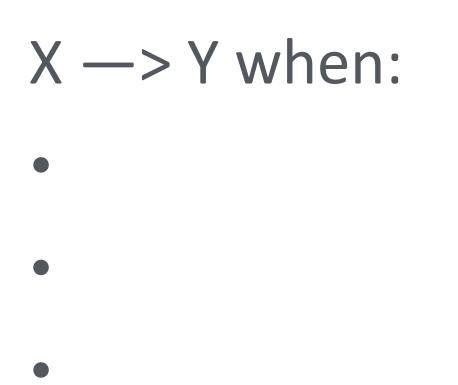
http://www.tylervigen.com/spurious-correlations





## Ingredients for establishing a causal relationship?

Three properties must hold to establish a causal relationship between X and Y.



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## Ingredients for establishing a causal relationship?

Three properties must hold to establish a causal relationship between X and Y.

 $X \longrightarrow Y$  when:

- X precedes Y
- X and Y are correlated
- We can exclude plausible alternative explanations for Y other than X







## Proposal: Let's establish more causal relationships

- A good theory both explains how and why certain phenomena occur, and allows predictions to be made.
  - Causal relationships allow for stronger predictions
  - Bonus points if we validate the mechanism
- - We are up to date on AI tech but 20 years behind on research methods?
- MSR was always about methods
  - The name itself is a method!



### • There are lots of techniques for causal inference from observational data.





### Example of tweets cause GitHub stars?

<blockquote class="twitter-tweet">l just releasec



👠 Max Woolf @minimaxir · Follow

I just released my new Python package: simpleaichat, an open-source tool for working with ChatGPT/GPT-4 with minimal code yet max flexibility!

Y

I built simpleaichat out of sheer frustration with LangChain and aim to make it the easiest way to make AI apps.

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Python package for easily interfacing with chat apps, with robust features and minimal code complexity. 용 3 중 1 ☆ 549 양 22 Contributors Used by Stars Forks	0
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Read 18 replies	

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• Fang, Lamba, Herbsleb, & Vasilescu. "This is damn slick!" Estimating the impact of tweets on open source project popularity and new contributors. ICSE 2022





## Example: Do tweets cause GitHub stars?

<blockquote class="twitter-tweet">l just releasec



👠 Max Woolf @minimaxir · Follow

I just released my new Python package: simpleaichat, an open-source tool for working with ChatGPT/GPT-4 with minimal code yet max flexibility!

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Read to replies				

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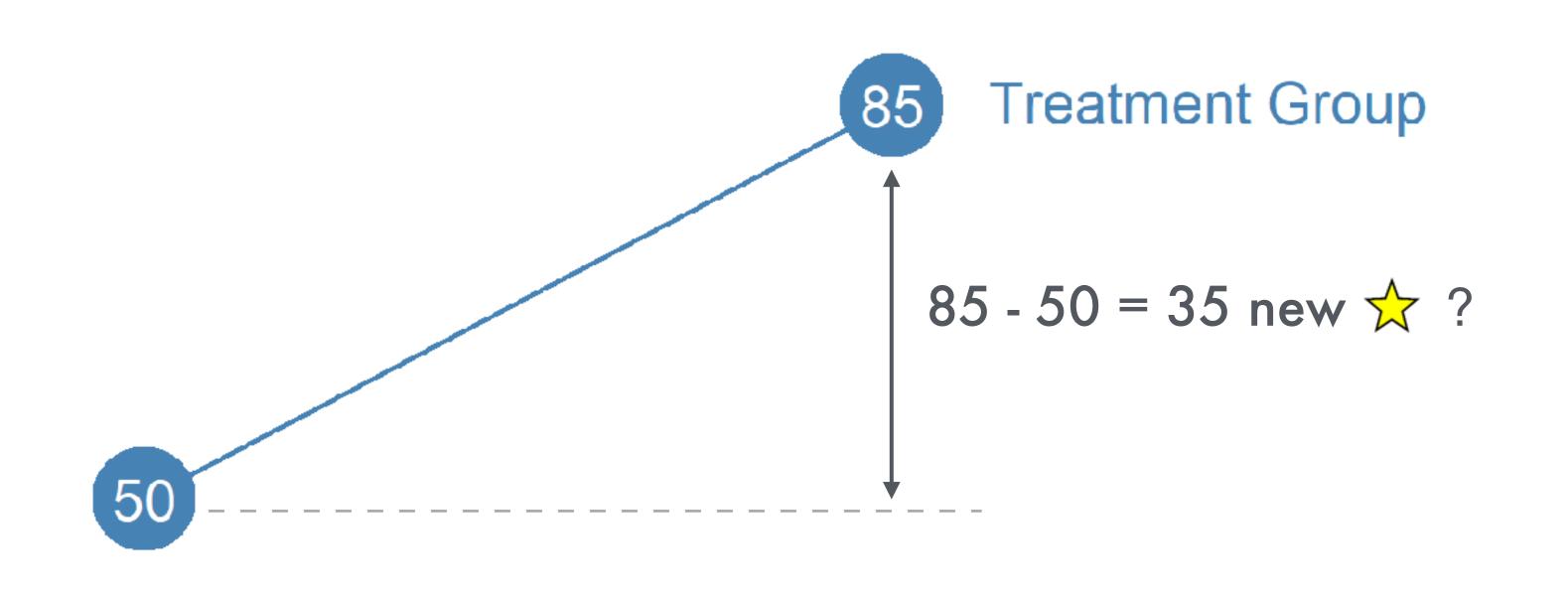
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• Fang, Lamba, Herbsleb, & Vasilescu. "This is damn slick!" Estimating the impact of tweets opposite project popularity and new contributors. ICSE 2022



### Idea: Measure how much a group mean changes before and after an intervention





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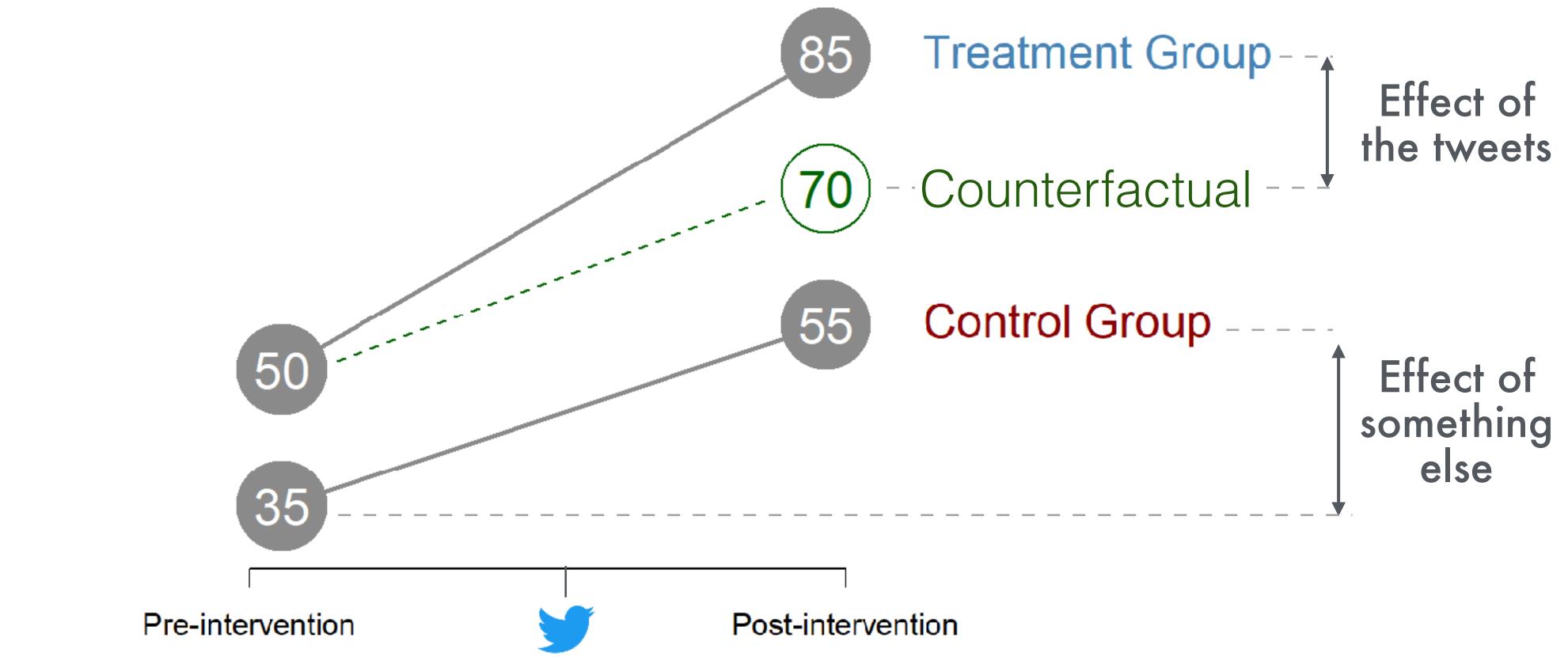


Post-intervention

• Fang, Lamba, Herbsleb, & Vasilescu. "This is damn slick!" Estimating the impact of tweets on open source project popularity and new contributors. ICSE 2022



# Better idea: Compare that change to the change in an appropriate control group



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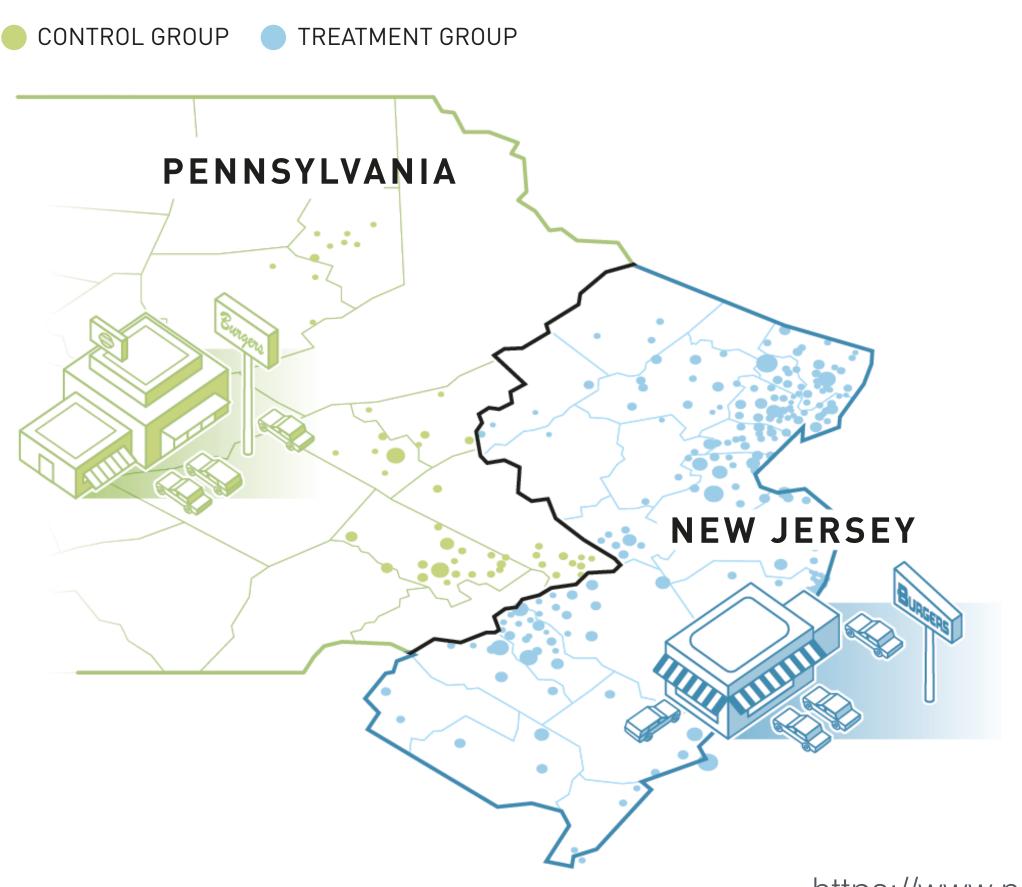


• Fang, Lamba, Herbsleb, & Vasilescu. "This is damn slick!" Estimating the impact of tweets on open source project popularity and new contributors. ICSE 2022



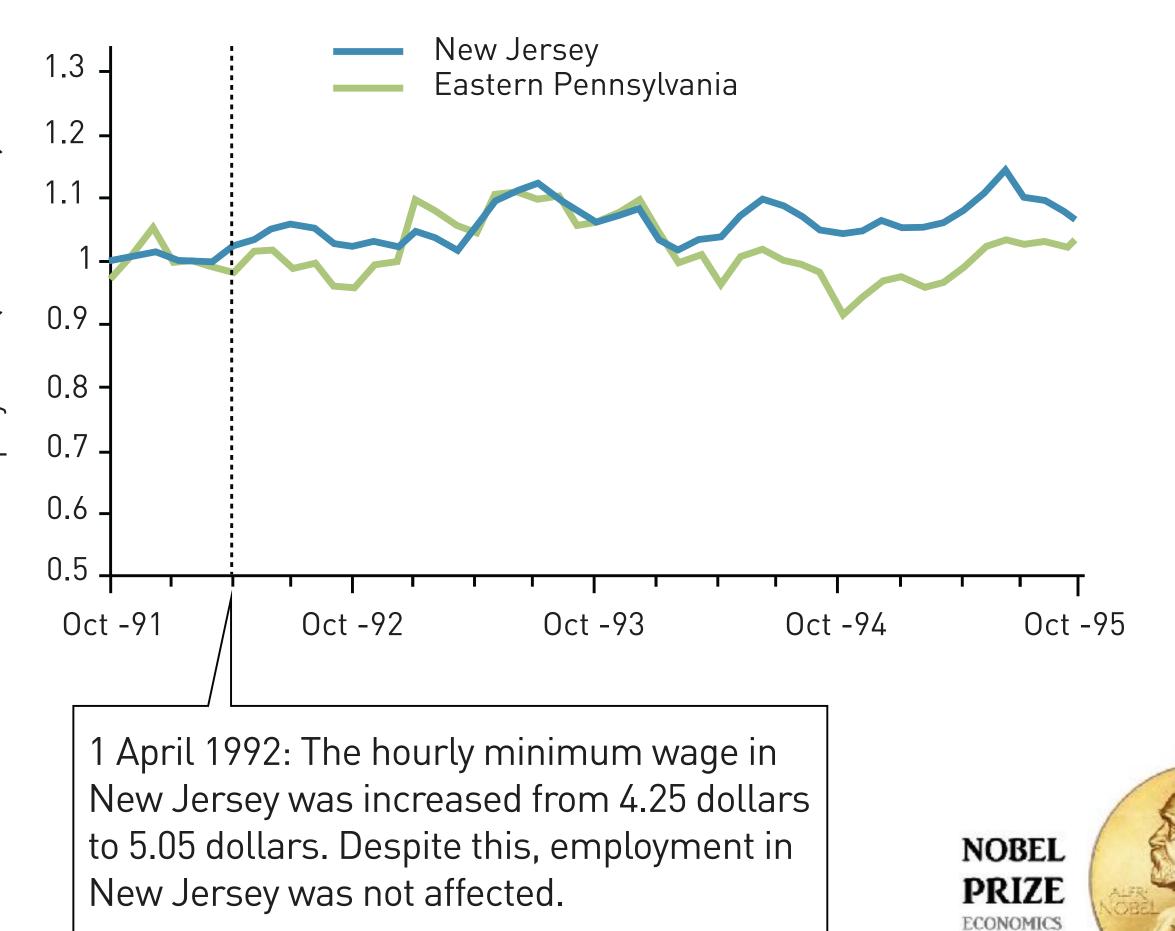


## Card and Krueger (1993) natural experiment to study how increasing the minimum wage affects employment.



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https://www.nobelprize.org/uploads/2021/10/popular-economicsciencesprize2021-2.pdf









# Another example: Donation badges decrease median bug report response times by ~2 h

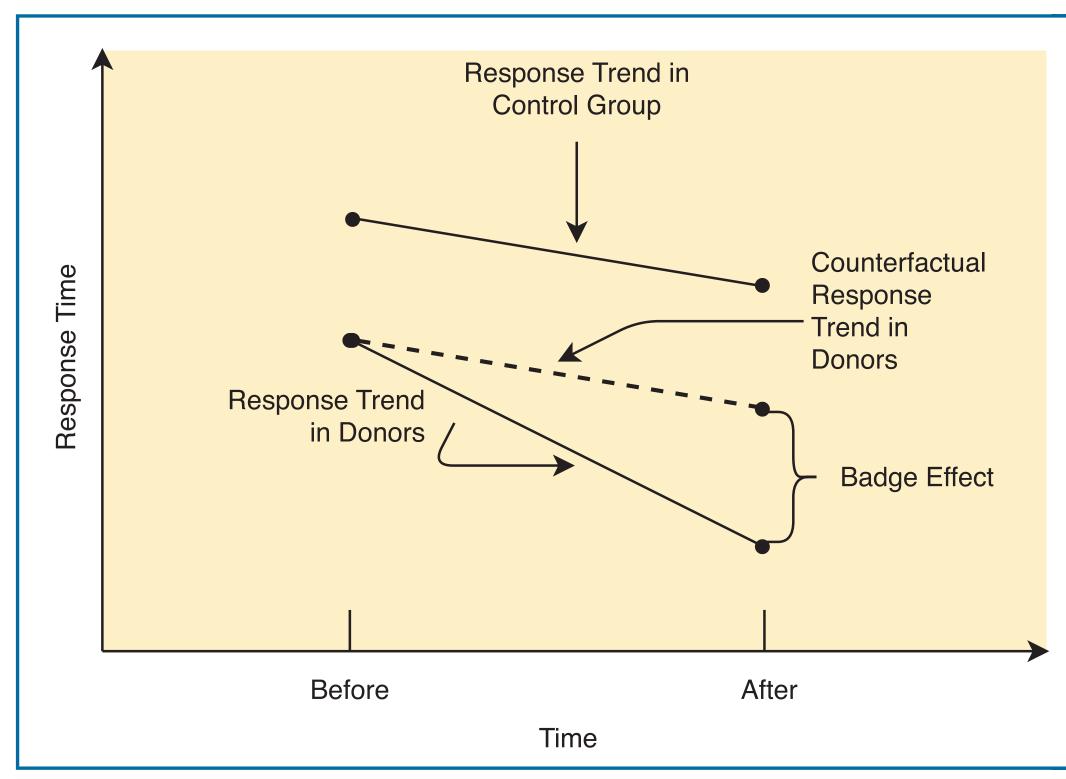
Some Eclipse donors are recognized on Bugzilla with a "Friend of Eclipse" badge.



• Nakasai, Hata, & Matsumoto. Are donation badges appealing?: A case study of developer responses to Eclipse bug reports. IEEE Software 2018.

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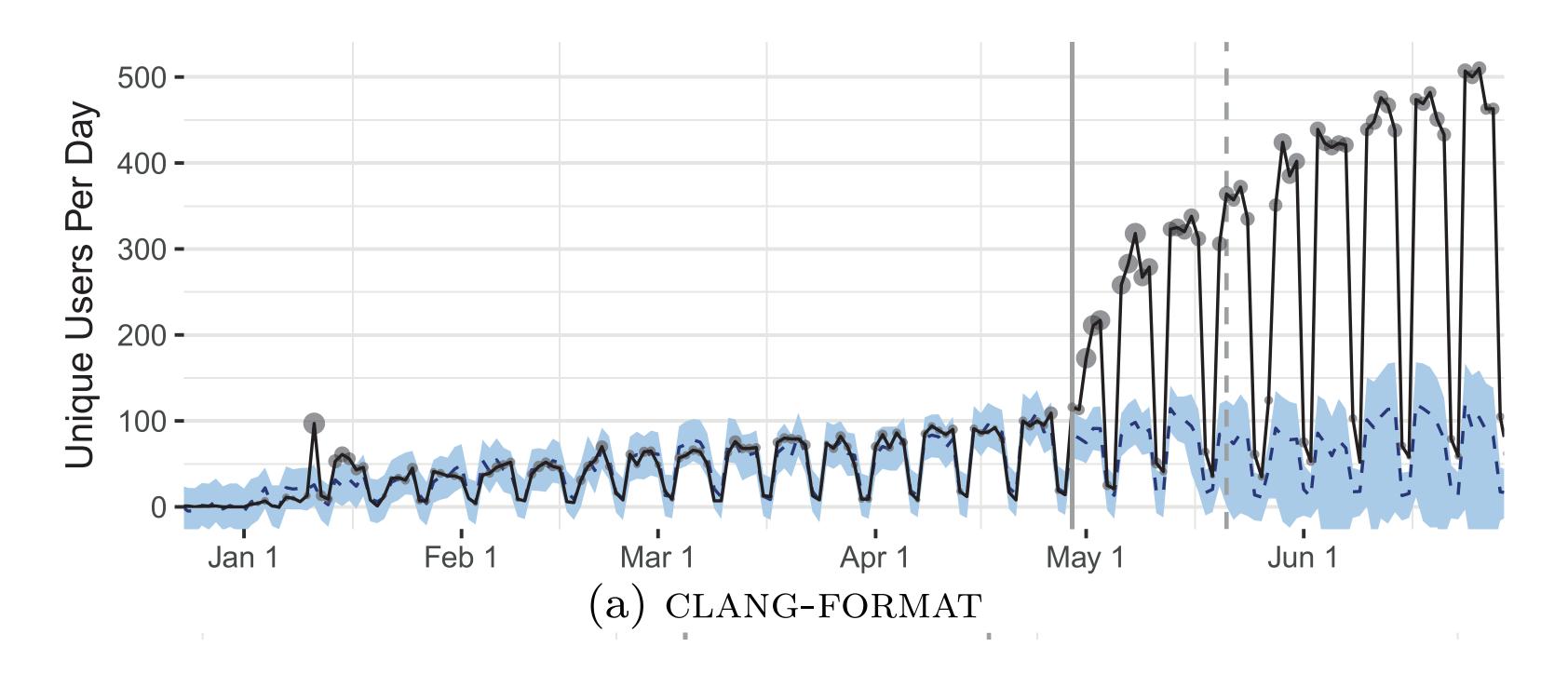


**FIGURE 1.** An example of the causal inference framework using a DID model showing response time before versus after the introduction of donation badges.



# Another example still: Advertising tools inside Google office toilets increases adoption

**CausalImpact** R package: Inferring causal impact using Bayesian structural time-series models



• Murphy-Hill, Smith, Sadowski, et al. Do developers discover new tools on the toilet?. ICSE 2019

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### Testing on the Toilet Presents... Healthy Code on the Commode



Automatic formatting for C++

by Daniel Jasper in Munich



Are you tired of hitting space and backspace more often then anything else while coding? Are you annoved by fighting over parameter and comment alignment in code reviews?

Consistent formatting allows readers to quickly scan and interpret code, dedicating their attention to what the code does and how it works. Without this consistency, effort is wasted parsing the wide variety of personal styles code might follow. However, keeping your code formatting nice and shiny is not a good task for humans. Luckily, we now have clang-format, which can do this tedious task for you.

Clang-format produces both readable and Google style-compliant code:

<pre>\$ cat file.cc</pre>	
<pre>int a;// clang-format can</pre>	
int bbb; // align trailing comments.	
<pre>#define UNDERSTAND_MULTILINE_MACROS int cc; int d;</pre>	
LOG(INFO) <<" align operators\n"<<" and many more things";	
<pre>\$ clang-format file.cc -style Google</pre>	
<pre>int a; // clang-format can</pre>	
<pre>int bbb; // align trailing comments.</pre>	
#define UNDERSTAND_MULTILINE_MACROS	λ.
int cc;	Υ.
int d;	
LOG(INFO) << " align operators\n"	
<< " and many more things";	

Conveniently integrating with your editor, you can format the current statement or a selected region (available for vim, emacs and eclipse - go/clang-format). You can also reformat unified diffs, e.g. in a CitC client, by:

\$ g4 diff -du0 | /usr/lib/clang-format/clang-format-diff.py

In addition to making the editor-based code development faster and more fun, consistently using clangformat provides other advantages:

- Code reviewers don't even need to consider whether all your spaces are correct
- Source files become fully machine editable, e.g. for API maintenance

So, give it a try and see how much fun it is to just type everything into a single line and let clang-format do the rest. If you encounter clang-format messing up the formatting, e.g. producing style guide violations, please file a bug on go/clang-format-bug

<u>clang-format</u> Learn how to use clang-format in your workflow. http://go/clang-format Find out more: go/CodeHealth

Want to see your dead code and automatically get rid of it? http://go/scythe Read all TotTs online: http://tott





## Where to start

### r-causal.org

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🔒 r-causal.org

PUBLISHED

April 11, 2025

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Causal Inference in R O

### Preface

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Asking Causal Questions

1 From casual to causal

2 The whole game: mosquito nets and malaria

3 Potential outcomes and counterfactuals

4 Expressing causal questions as DAGs

5 Causal inference is not (just) a statistical problem

6 From question to answer: stratification and outcome models

The Design Phase  $\sim$ 

7 Preparing data to answer causal questions

8 Propensity scores

9 Evaluating your propensity score model

Estimating Causal  $\,\,\,\lor\,\,$ Effects

10 Causal estimands

### Causal Inference in R

AUTHORS Malcolm Barrett Lucy D'Agostino McGowan Travis Gerke

Preface

Welcome to Causal Inference in R. Answering causal questions is critical for scientific and business purposes, but techniques like randomized clinical trials and A/B testing are not always practical or successful. The tools in this book will allow readers to better make causal inferences with observational data with the R programming language. By its end, we hope to help you:

1. Ask better causal questions.

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- 2. Understand the assumptions needed for causal inference
- 3. Identify the target population for which you want to make inferences
- 4. Fit causal models and check their problems
- Conduct sensitivity analyses where the techniques we use might be imperfect

This book is for both academic researchers and data scientists. Although the questions may differ between these settings, many techniques are the same: causal inference is as helpful for asking questions about cancer as it is about clicks. We use a mix of examples from medicine, economics, tech, and other domains to demonstrate that you need a clear causal question and a willingness to be transparent about your assumptions.

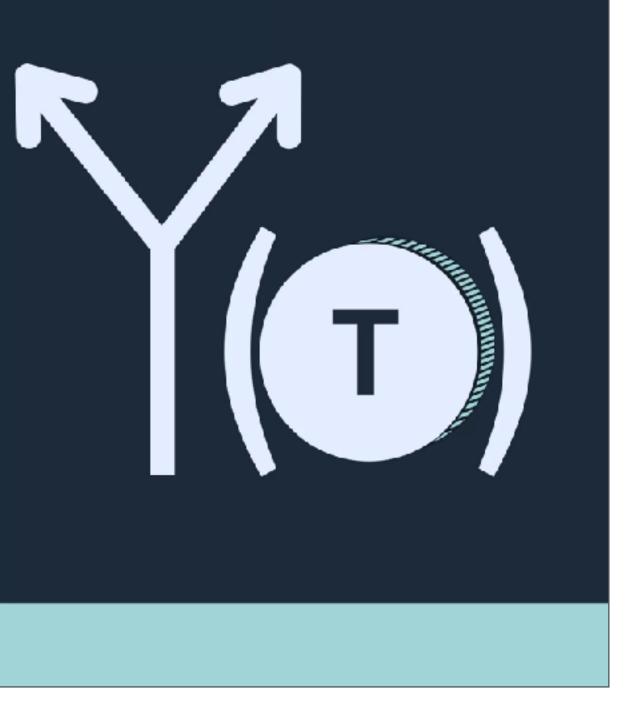
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### CAUSAL INFERENCE IN STATISTICS

With Exercises, Practice Projects, and R Code Notebooks

### Justin Belair

Lecturer and Statistical Consultant

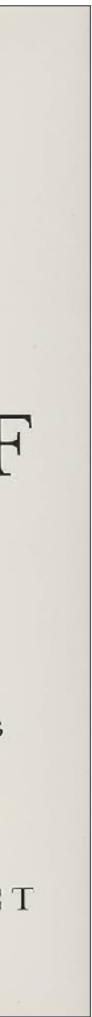


### JUDEA PEARL WINNER OF THE TURING AWARD AND DANA MACKENZIE

# THE BOOKOF WHY



### THE NEW SCIENCE OF CAUSE AND EFFECT

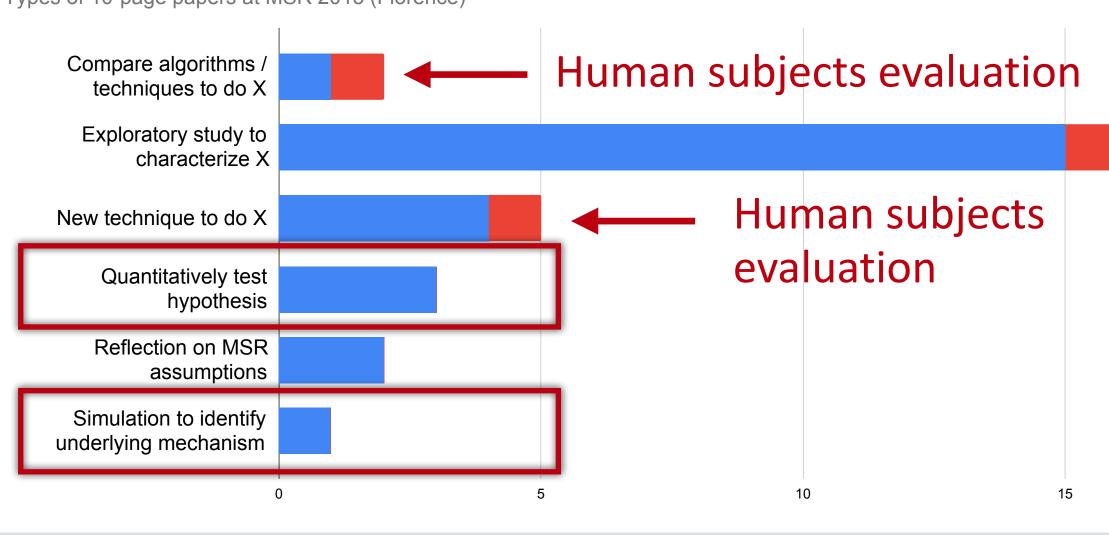




## Summary: We are a methods conference, let's step up our methods game!

### Understanding the problem:

- Less descriptives, more understanding mechanisms and testing hypotheses
- Causal relationships are good theory fragments, and allow for predictions



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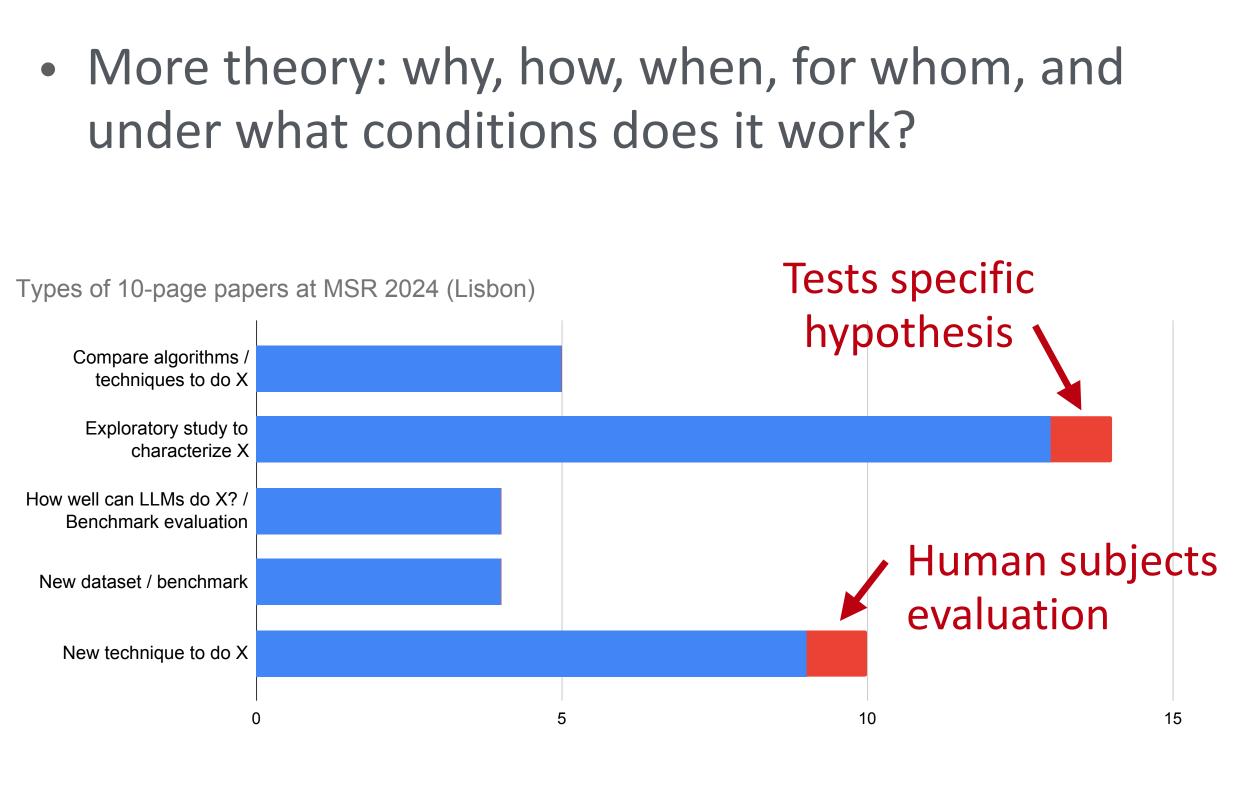
Types of 10-page papers at MSR 2015 (Florence)

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**Designing solutions:** 

- Less benchmark evaluations, more humancentered methods
- under what conditions does it work?

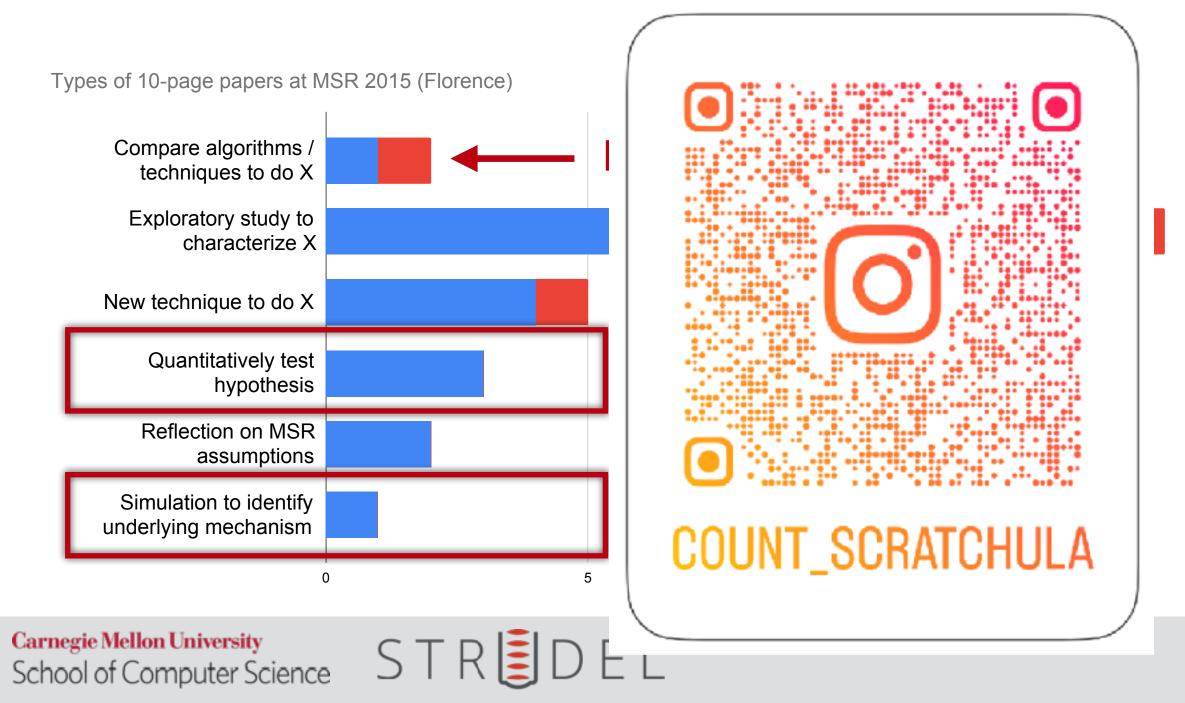




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