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DIPARTIMENTO
DI INFORMATICA

(Re)Use of Research Results ... why should we?

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Who am I



- ⇒ **Associate Professor** at the Department of Informatics - University of Bari (www.di.uniba.it)
- ⇒ **Coordinator of the «Process & Product Quality»** area @Software Engineering Research LAB (serlab.di.uniba.it)
- ⇒ **Quality Manager** @SER&Practices Spin-Off (<https://serandp.com/en/>)
- ⇒ **Member** of the International Software Engineering Reserch Netwok (**ISERN**)



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[@mtbaldassarre](https://twitter.com/mtbaldassarre)

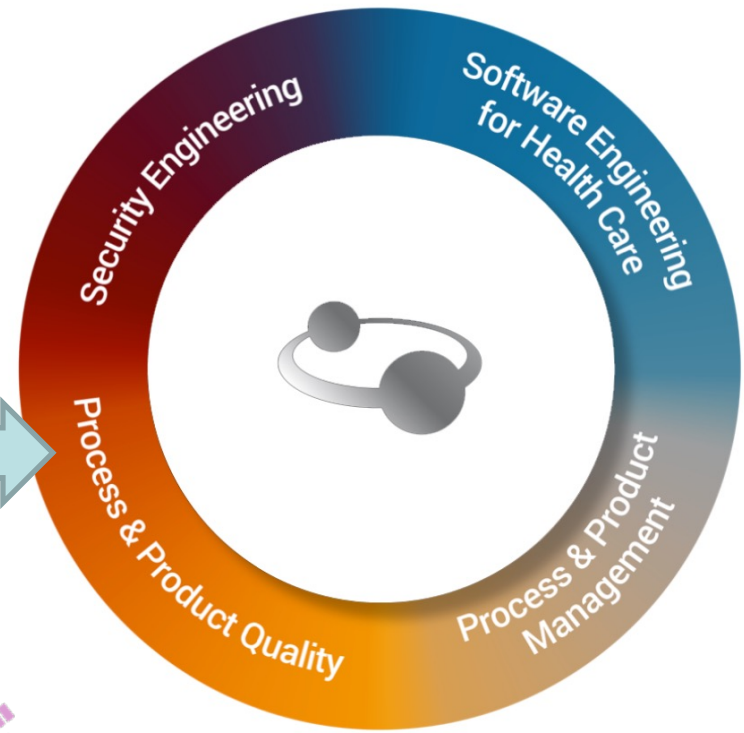
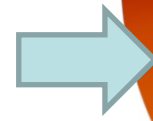
CS Department – Dipartimento di Informatica BARI - Puglia







SERLAB
Software Engineering Research
UNIVERSITÀ DEGLI STUDI DI BARI



⇒ Main research interests:

- ❑ SOFTWARE PROCESS AND PRODUCT QUALITY
- ❑ HUMAN FACTORS IN SOFTWARE ENGINEERING
- ❑ EMPIRICAL SOFTWARE ENGINEERING

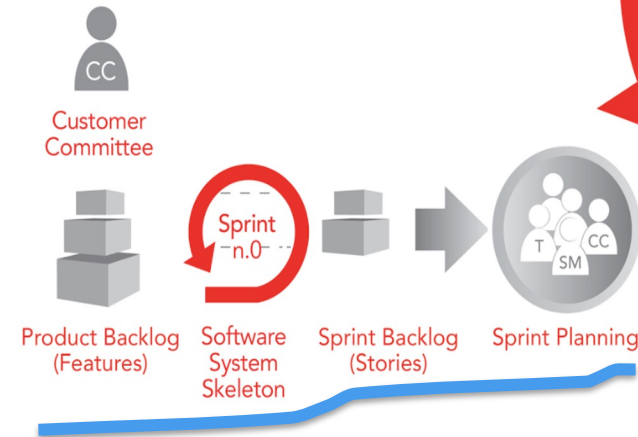


Agile User&Quality Oriented Development...

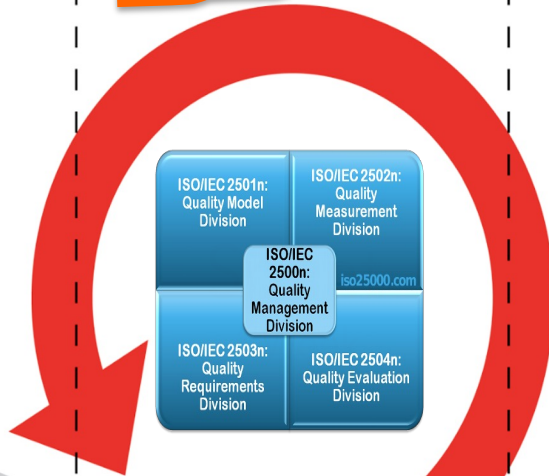
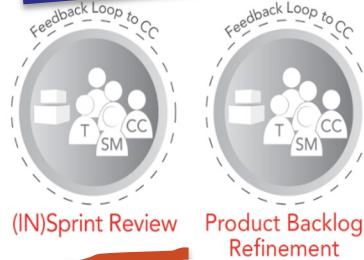
Inception

PO - Product Owner
SM - ScrumMaster
T - Team
CC - Customer Committee

Input from End-Users, Customers, Context and Field Studies

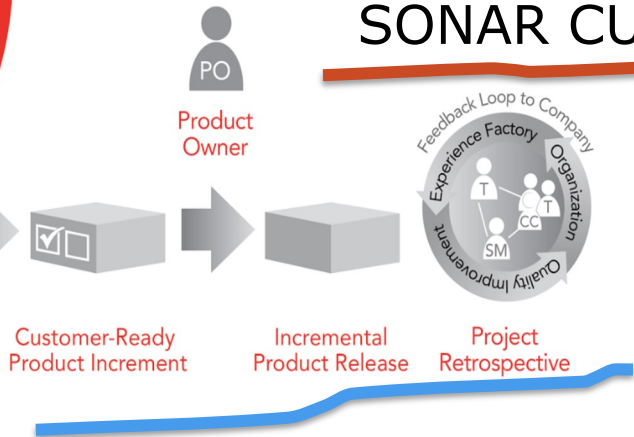


Development



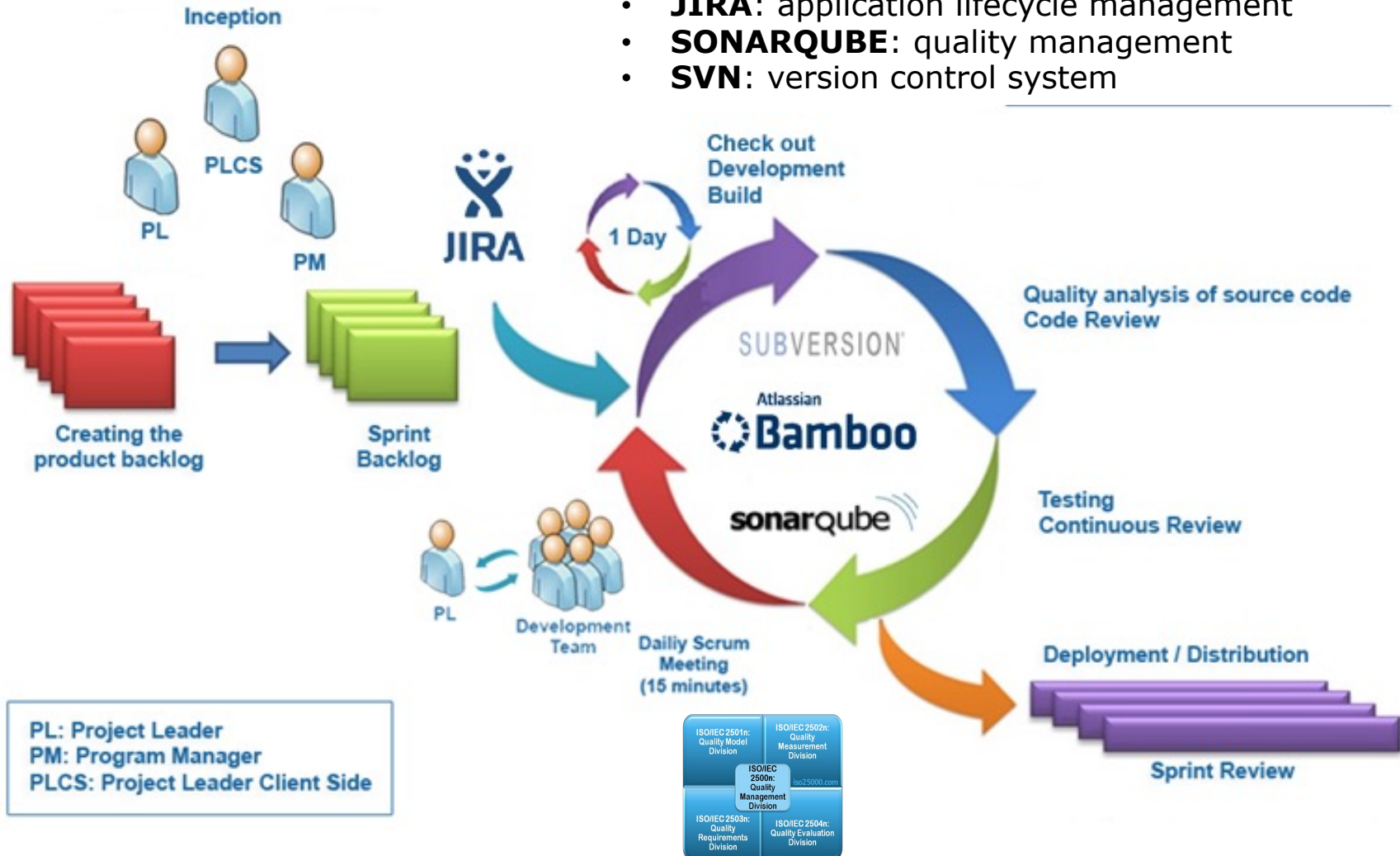
Delivery

- GIT
- ASANA
- JENKINS
- GRADLE
- KIUWAN
- SONAR CUBE



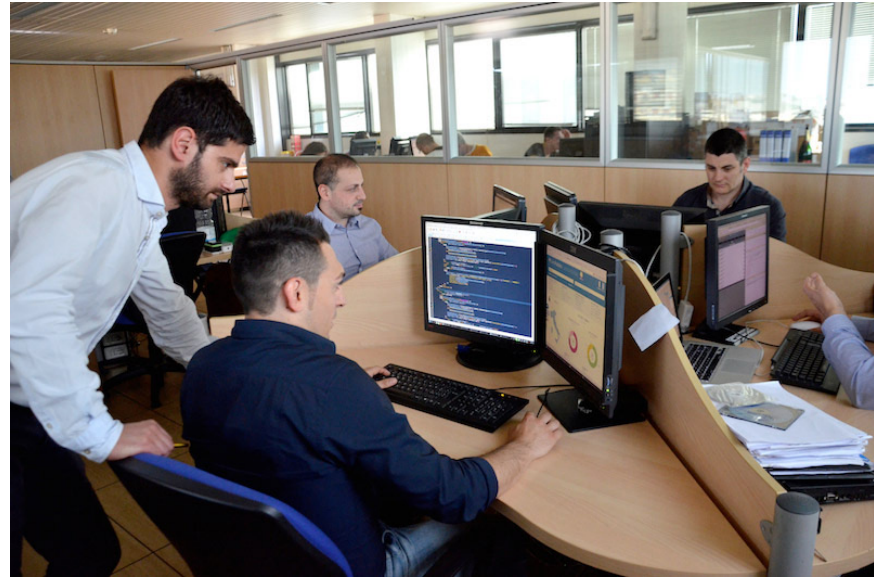
...Agile User&Quality Oriented Development

- **BAMBOO**: continuous integration/deployment
- **JIRA**: application lifecycle management
- **SONARQUBE**: quality management
- **SVN**: version control system



Spin-off of the University of Bari -
established in 2006.

30 employees



- ❑ 9001:2008 - Quality management systems - Requirements
- ❑ 14001: 2004 - Environmental management systems
- ❑ 25000:2014 - Systems and software engineering – **First in Italy to assess certification of a software product**



9001:2008

14001:2004

25000:2014



- ❑ SERLab carries out research and empirical validation of results
- ❑ SER&P transfers the results of these activities to industry; provides data and industrial context for field experimentation



SER&P
Software Engineering Research & Practices



SOFTWARE SYSTEM DESIGN & DEVELOPMENT



SOFTWARE PROCESS & PRODUCT QUALITY



SOFTWARE SYSTEM GOVERNANCE & SECURITY



PROJECT MANAGEMENT



RESEARCH COLLABORATIONS

ISERN



International Software Engineering Research Network



INDUSTRIAL COLLABORATIONS



Is it important for a scientist to
Report Research Results so others
can (Re)Use them?

*" ... the ideas we can **most trust** are those that have been the **most tried and tested**.*

*For that reason many of us are involved in this process called 'science' which **produces trusted knowledge** by sharing one's ideas and trying out and testing the ideas of others ... "*

cit. Popper



Produce & Report research results



ReUse results/findings ...



... to improve reproducibility and transparency

«RESULTS PARADOX»



«RESULTS PARADOX»

«FACTS & TRUTH»

Keep research results at arm's length



Objective investigator – detective



Follows data with discipline;
never indulges in data
massaging or cherry picking

«BE PERSUASIVE»

Pressure of publishing clear
novel and positive findings
on behalf of funding
agencies, evaluation
committees



Good lawyer



Arguments and produces
amounts of beautiful and
convincing results





⇒ Researchers attempt to solve this paradox ...
questionable research practices ... reduce
confidence of conclusions ... harm reproducibility ...



Questionable Research Practices (QPRs) Hurt Science ...



HARKing (Hypothesizing After Results are Known)

Neat data, what explains it?

- Acceptable in explanatory not confirmatory



Post-hoc Rationalizing

Story-telling to explain the data found in a study

- Acceptable in explanatory/inductive theory building not confirmatory

John LK, Loewenstein G, Prelec D (2012) Measuring the prevalence of questionable research practices with incentives for truth telling. *Psychol Sci* 23(5):524–532.
<https://doi.org/10.1177/0956797611430953>



... Questionable Research Practices Hurt Science

File-drawer effect

- Hmm, bad outcome, bin it. Negative result – reject. Not published. Do not appear in meta-analysis and SLRs

Forking paths in data analysis choices after seeing the data (Researcher Bias)

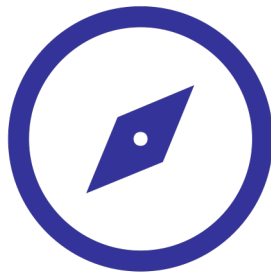
- Let's use a Kruskal-Wallis test and then a Lewandowski-Neymar test of significance (instead of?)

QRPs result when publication **venue** and publication **significance/novelty** are emphasized over replication & soundness of the method



Registered Reports

free researchers from the pressure to engage in QRPs



Avoid the RESULTS-ORIENTATION
Deal with RESEARCHER BIAS



Focus on SOUNDNESS OF THE
RESEARCH PLAN & SIGNIFICANCE
OF THE RESEARCH QUESTION

⇒ Ernst, N.A., Baldassarre, M.T. Registered reports in software engineering. *Empir Software Eng* **28**, 55 (2023). <https://doi.org/10.1007/s10664-022-10277-5>

Registered Reports ... why?



Pre-registration (clinical trials): register your protocol including planned hypothesis, data collection, data analysis that is «registered» BEFORE the study is conducted



Protocol comits to analysis and expected outcomes

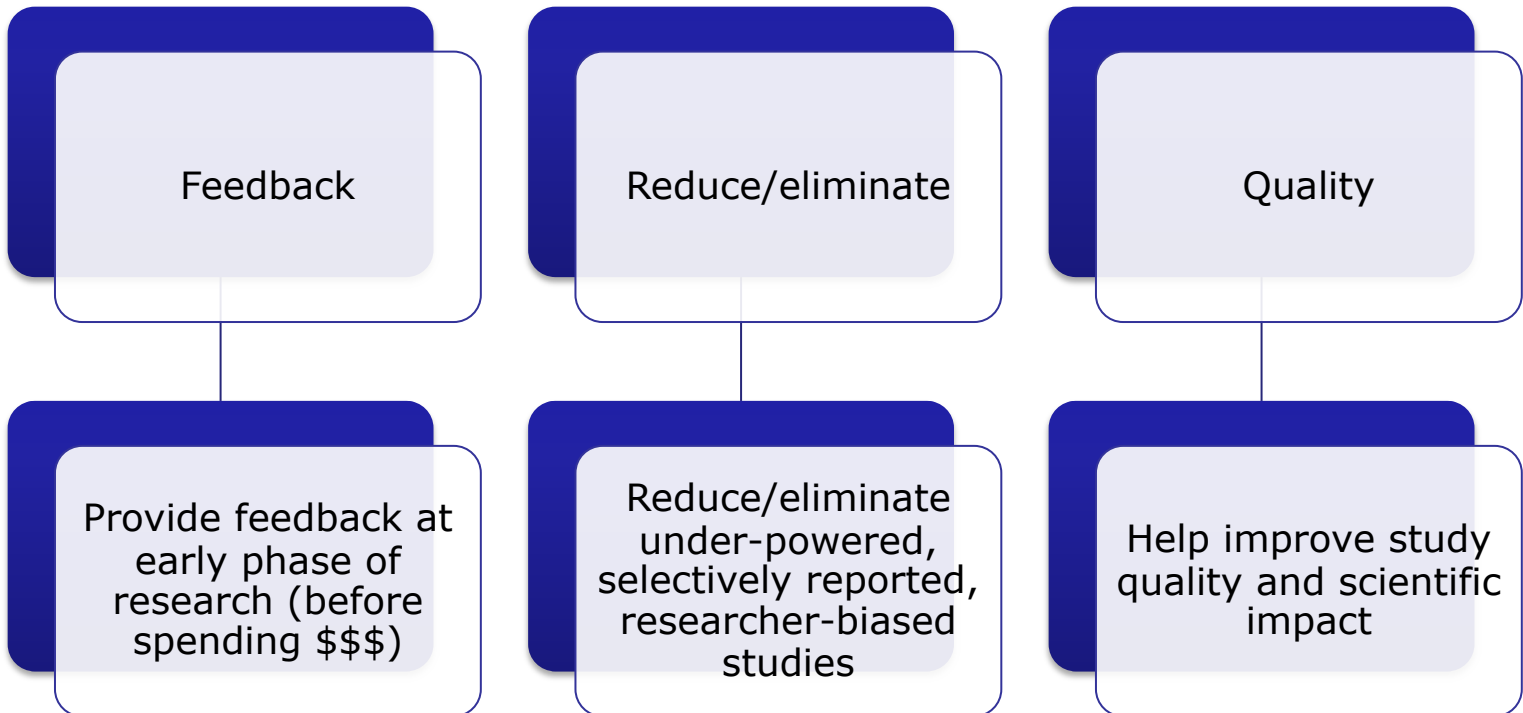


Registered Report: Peer-reviewed pre-registration



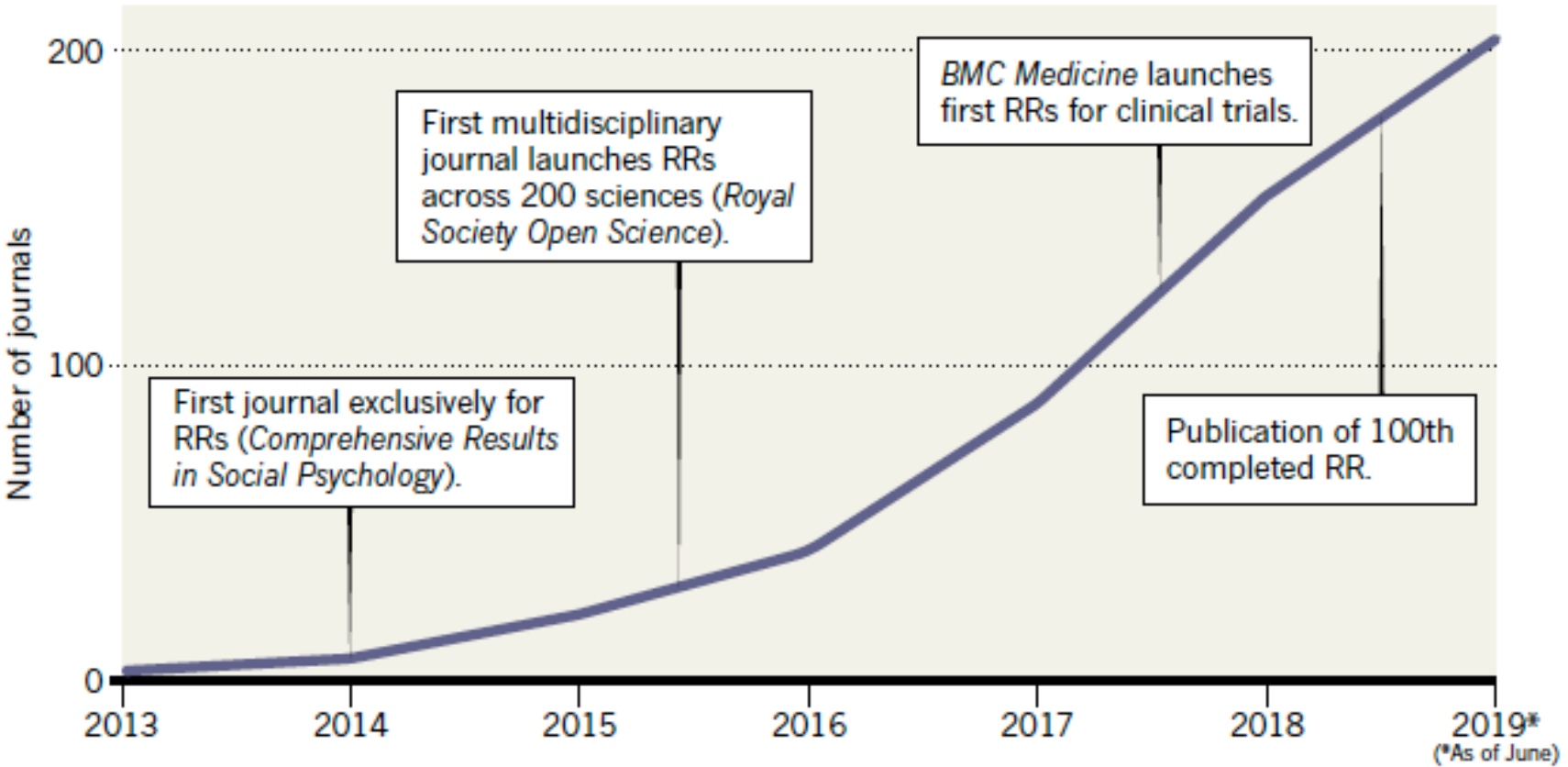
... Registered Reports ... why?

⇒ Benefits



RAPID RISE

Since 2013, the number of journals offering Registered Reports (RRs) has risen to more than 200 titles.



SOURCE: C. CHAMBERS

RR in SW_Engineering

EMSE J. → MSR,
ICSME, then ESEM,
now CHASE, SANER,
ICPC

TOSEM (direct submit)

CSE special issue

(ACM, Springer, T&F)





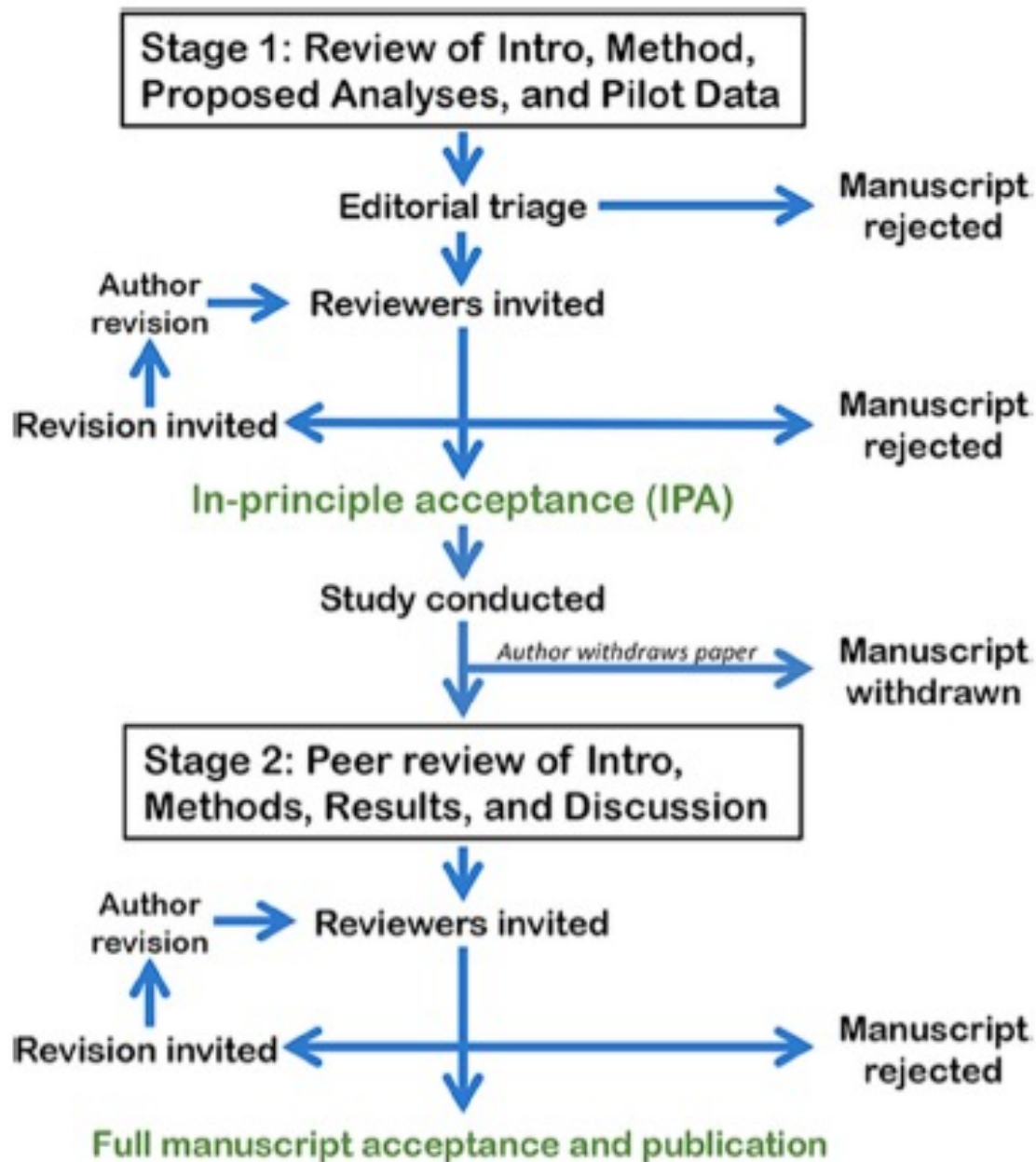


Fig. 1 Stages of the Registered Reports workflow. Center for Open Science (<https://www.cos.io/initiatives/registered-reports/#tabid3>) CC-BY-NoDerivs 4.0

Phase 1 – Review Criteria

Is this study novel, significant, able to find effects?

1. **Importance** of the research question(s).
2. Logic, rationale, and plausibility of the **proposed hypotheses**.
3. **Soundness** and **feasibility** of the methodology and analysis pipeline (including statistical power analysis where appropriate).
4. **Clarity** and degree of methodological detail for replication.
5. Will results obtained **test** the stated hypotheses?

Phase 2 – Review Criteria

Did the authors execute on Phase 1 plan?

1. Whether the data are able to test the authors' proposed hypotheses by satisfying the approved outcome-neutral conditions (such as quality checks, positive controls)
2. Whether the Introduction, rationale and stated hypotheses **are the same** as the approved Stage 1 submission (required)
3. Whether the authors adhered **precisely** to the registered experimental procedures
4. Whether any unregistered post hoc analyses added by the authors are **justified**, methodologically sound, and informative
5. Whether the authors' conclusions are **justified** given the data



Current state of RR in SE

MSR 2020 feedback on IPA:

“I think it is a key principle. However, in a way it also **raises the bar** significantly for the Registered Reports”

“[...] the fact that the results are missing, helps reviewers and authors **focus on the methodological issue**, which is a great added value in the review process [...]”

MSR Results - IPA

“During my review, though, I had the feeling that **more interaction with the authors** could add even further value”

“I think the **EMSE paper still needs a careful assessment**, as it is still possible that the operation or the application of the protocol turns out to be wrong [...]”

“I felt a **bit uncomfortable to have this burden** on my shoulders as a reviewer so early in the process.”

No (3 responses):

“A registered report may be, and should be allowed to be, risky and, therefore, may not work out. The ensuing work should be **subject to full and normal review.**”



In general, would you participate again (as reviewer or authors)?

25 responses

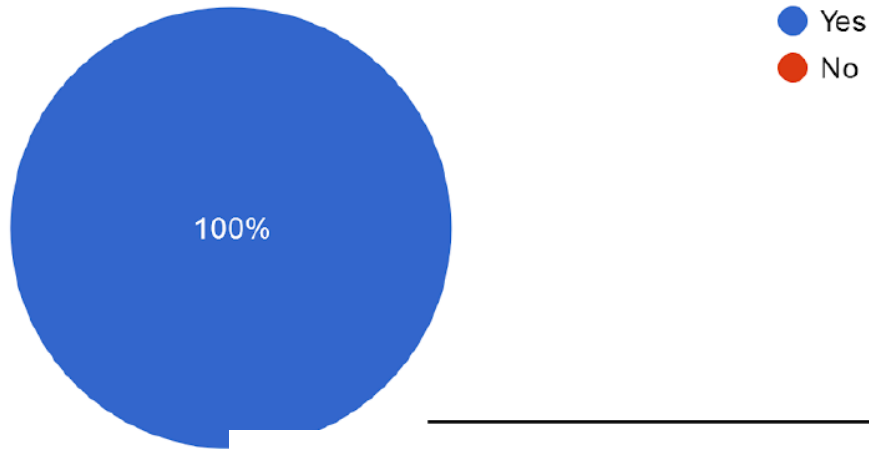


Table 1 RR submissions and publications since inception at EMSE

Venue	Stage 1		Stage 2	
	Submissions	IPAs	Submissions	Publications
MSR 2020	13	6	4	3
MSR 2021	10	6	4	1
MSR 2022	14	2	1	0
ICSME 2020	7	4	3	2
ICSME 2021	n/a	6	3	0
ESEM 2021	n/a	4	1	0
ESEM 2022	13	3	0	0

Note that some studies were affected by the COVID-19 pandemic. Data may be incomplete as tracking submissions can be challenging

Open Issues and Questions



Pros & Cons of RR

RRs provide early-stage feedback to authors and reduce researcher bias problems

Table 2 Benefits and disadvantages of registered reports in SE

Benefits	Disadvantages
Shareable protocols for research replication.	More effort from researchers.
Focus is on research, not publication.	Limited acceptance by journals so far.
Improved rigour in reporting.	Rigour can mean different things to different people/communities (Storey et al. 2020).
Early peer review on research approach.	Not all research strategies are registerable.

Three faces of RR

RR to prevent questionable research practices

Tell the world what you will do, then do it

RR as doctoral symposium

Early feedback before expensive data collection

RR as 1st round review

Pre-empt journal review with in-principle acceptance

To what CS studies could it apply?

Most suited to post-positivist, confirmatory studies with clear hypotheses.



Admin Challenges

CS has conference and journals - no one else does

Journals and conference **rarely share admin** interfaces (HotCRP vs Editorial Manager - and they are usually terrible)

Hard to manage reviewer discussions esp longitudinally

Currently, stick Phase 1 on Arxiv/[OSF.io](https://osf.io)/Github

Have to **explicitly coach** reviewers (not yet mature, but true of other formats)

Manually track in progress RR on Google Sheets (low *vacation factor*)



Admin Challenges

Reviewer/editor burden is increasingly a problem (overall, not just RR)
Accepting 5 IPAs at 3 conferences a year = 15 journal submissions in the next 12-18 months, with publication 24-36 months after that
+ who is asked to be conference track chair? What freedoms do they have?

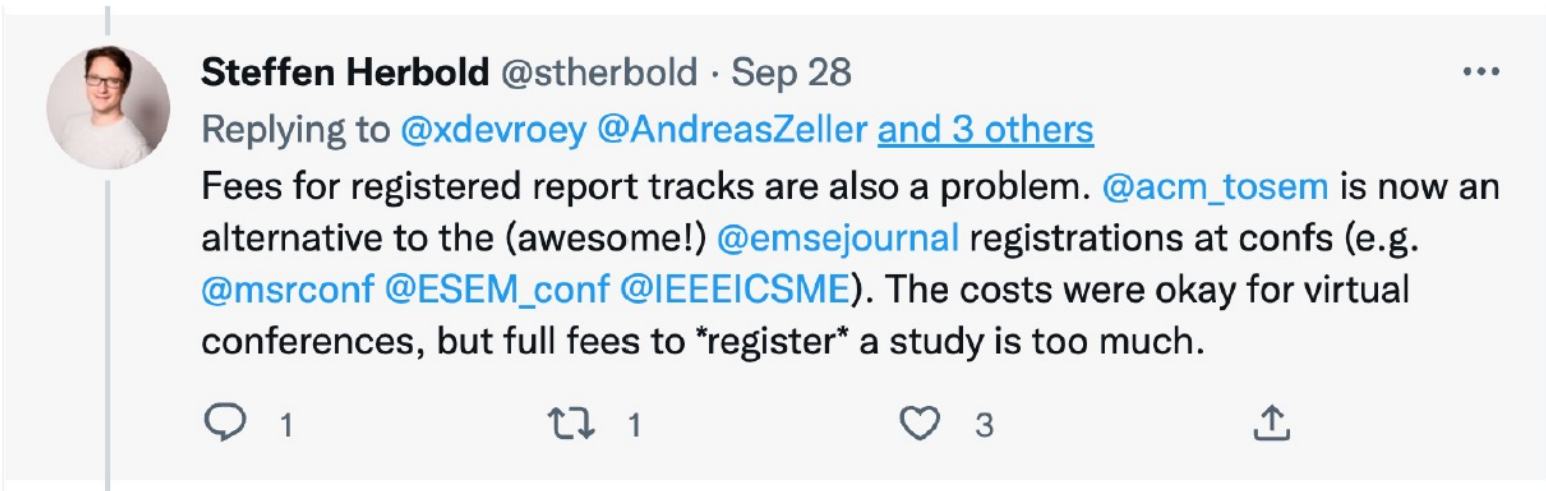
Minor shenanigans - reviewer COI, authorship incentives



Admin Challenges – J1C2?

Publication models run into journal profit models

First phase - Journal - then present at conference?



RRs

Enhance Reproducibility

- Standardization of submitted protocols

Are more likely
to report
Negative
Results

Reviewers can
help authors
improve the
protocol
beforehand ->
prevents flaws

Are a PLAN....
Not a PRISON

- Flexibility is not lost ... rather the possibility of airbrushing changes out of the picture

Department of Reuse

Ultimately RR is about pre-specifying analysis. One way to do that is to reuse analysis protocols from other papers.

Done all the time in medicine; rarely in CS except in benchmarks.

Q: to what extent are artifacts such as protocols reused?



<https://reuse-dept.org/>

Artifact Creation, sharing and Reuse



SE researchers
share artifacts

Not only
publications ...
Ideas, methods,
datasets, tools



Artifacts engage replication and
reproducibility



Science produces more types of
artifacts than just publications



Researchers use some but not
not necessarily all artifacts from
other work








HOW DO WE CAPTURE REUSE?

Badging – Artifact Evaluation Committees

The authors of accepted conference papers submit software packages that, in theory, let others re-execute that work. These evaluation committees award “badges”

Table 1. Badges such as the ones shown in this table are currently awarded at conferences.² This table is based on ACM’s badge program, however, analogous badges are used at other conferences. Images used by permission of the Association for Computing Machinery.

Available	Functional	Reusable	Reproduced	Replicated
				
<p>In a public repository with a long-term retention policy. A DOI needs to be provided.</p>	<p>Artifacts are documented, consistent, complete, exercisable, and include evidence of verification and validation.</p>	<p>Functional, significantly exceed minimal functionality.</p>	<p>Results of this paper have been reproduced by a different team using the original artifact.</p>	<p>Results of this paper have been replicated by a different team without the original artifact.</p>



Badging – Artifact Evaluation Committees



Fig. 4. Artifact evaluation committee sizes 2011-2019. From Hermann et al. [8]

Is the artifact evaluation process is creating reused artifacts?

We queried ACM Portal for ICSE papers between 2011 to 2021, to find 2.4% of papers with an artifact badge.



Of these, 111 available, 74 reusable, 24 functional, NO replicated or reproduced artifacts.



approach to recording Research Reuse -> REUSE GRAPH



Filter
Reuse type
Methodology

Department of Reuse

- under development / data widely incomplete -

Researchers

Whose artifacts are reused (R+)

- Jacques Klein
- Yves Le Traon
- Martin Monperrus
- David Lo
- Georgios Gousios

Who reuse artifacts (R)

- Shangwen Wang
- Xiaoguang Mao
- Yang Liu
- Ming Wen
- Zhenchang Xing

Artifacts

Most reused (R+)

Towards Evaluating the Robustness of Neural Networks [14]
 Defects4J: a database of existing faults to enable controlled testing studies for Java programs [15]
 Deep Residual Learning for Image Recognition [16]
 Grounded theory in software engineering research [17]

Most reusing (R)

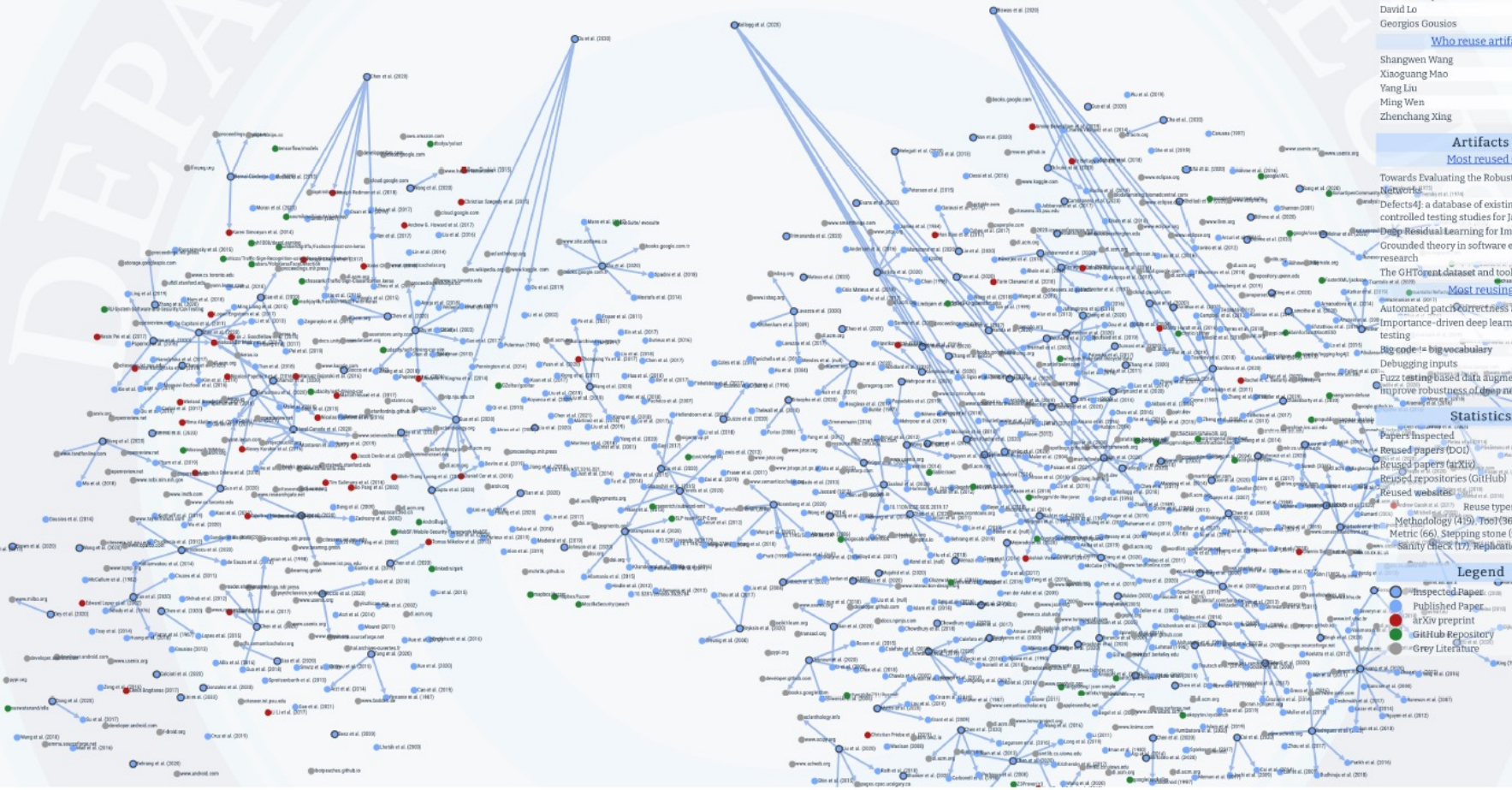
The GitHub dataset and tool suite [18]
 Automated patch correctness assessment [19]
 Importance-driven deep learning system testing [20]
 Big code = big vocabulary [21]
 Debugging inputs [22]
 Fuzz testing based data augmentation to improve robustness of deep neural networks [23]

Statistics

Papers Inspected 126
 Reused papers (DOI) 285
 Reused papers (arXiv) 1
 Reused repositories (GitHub) 77
 Reused websites 6
 Reuse types
 Methodology (419), Test (360), Dataset (193), Metric (66), Stepping stone (57), Statistics (2), Sanity check (17), Replication (4), Other (6)

Legend

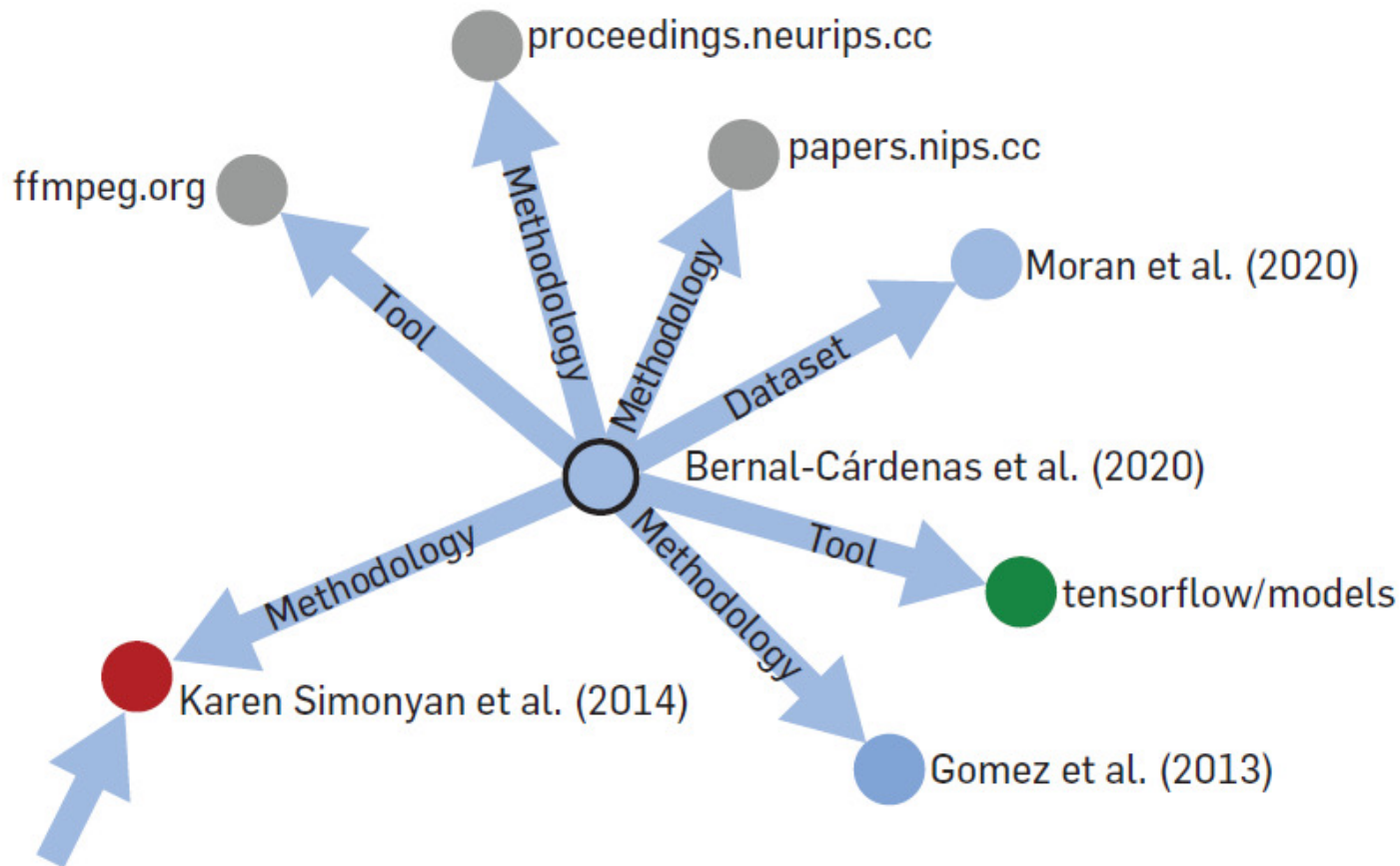
- Inspected Paper
- Published Paper
- arXiv preprint
- GitHub Repository
- Grey Literature



- ⇒ Researchers read 170 SE papers selected from 6 major 2020 conferences
- ⇒ Teams were asked to record six types of reuse
- ⇒ Each edge connects papers to the prior work they are (re)using



This figure shows reuse from Bernal-Cárdenas et al.⁷ Edges reflect tool, dataset, and methodology reuse. Red nodes indicate arXiv preprint; green represents a GitHub repository; blue denotes a published paper, and grey indicates other websites or grey literature locations. <https://www.reuse-dept.org/doi/10.1145/3377811.3380328>.



ROSE festival (Rewarding Open Science Replication and Reproduction in SE)

ICSE 2023

Call for Participation

Authors of papers with results that have been replicated or reproduced (*) by subsequent work (i.e. by **other** researchers) are invited to submit 1 one page ascii document to timm@ieee.org, title "ROSE'23 submission" that offers:

- a 4 line (or less) description of the original results
- a 4 line (or less) description of what was found by the other researchers
- references to both the original paper and the subsequent work.

Accepted submissions will be offered a lightning talk slot at the ICSE'23 ROSE Festival.

DATES:

Submission: March 31, 2023

Notification: April 7, 2023

ROSE festival: dates TBD, some lunchtime in main ICSE conference

FOR MORE INFO:

timm@ieee.org

NOTES: (*)

Important Dates

⌚ AoE (UTC-12h)

Fri 31 Mar 2023 new
Submission

Fri 7 Apr 2023 new
Notification

ROSE

 **Tim Menzies** Chair
North Carolina State University
 United States

 **Neil Ernst** Chair
University of Victoria
 Canada

 **Ben Hermann** Chair
TU Dortmund
 Germany

 **Maria Teresa Baldassarre** Chair
Department of Computer Science, University of Bari
 Italy

Repeatability, Reproducibility, Replicability

Repeatability



Original Team



Original Setup

Reproducibility



Different Team



Original Setup

Replicability



Different Team



Different Setup



The Rose Initiative (Recognizing and Rewarding Open Science in Software Engineering) is an international, multi-conference workshop that will continually report updates to the software engineering reuse graphs.

Credits & Special Thanks



Empirical Software Engineering (2023) 28:55
<https://doi.org/10.1007/s10664-022-10277-5>

EDITORIAL



Registered reports in software engineering

Neil A. Ernst¹ · Maria Teresa Baldassarre²

Accepted: 14 December 2022

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Abstract

Registered reports are scientific publications which begin the publication process by first having the detailed research protocol, including key research questions, reviewed and approved by peers. Subsequent analysis and results are published with minimal additional review, even if there was no clear support for the underlying hypothesis, as long as the approved protocol is followed. Registered reports can prevent several questionable research practices and give early feedback on research designs. In software engineering research, registered reports were first introduced in the International Conference on Mining Software Repositories (MSR) in 2020. They are now established in three conferences and two pre-eminent journals, including this one (EMSE). We explain the motivation for registered reports, outline the way they have been implemented in software engineering, and outline some ongoing challenges for addressing high quality software engineering research.

Keywords Registered report · Research methods · Software engineering

1 Introduction

Registered reports are a model of scholarly publication which prioritize the importance of study design and significance rather than study outcomes. Focusing on whether the study was suitable to support the inferences of interest decouples publication from a focus on headline-worthy 'significant' results.

In software engineering (SE) research, empirical methods are now standard. The top conferences in the field emphasize "the extent to which the paper's contributions and/or

Communicated by: Robert Feld and Thomas Zimmermann

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Credits & Special Thanks



COMMUNICATIONS
CACM.ACM.ORG OF THE **ACM** 02/2023 VOL.66 NO.02

(Re)Use of Research Results (Is Rampant)

BY MARIA TERESA BALDASSARRE, NEIL ERNST, BEN HEERMANN, TIM MENZIES, AND RAHUL VERIDHA

Extracting the Essential Simplicity of the Internet

Overcoming the Data Bottleneck
HPC Forecast: Cloudy and Uncertain
Programming's Premature Obituary
Computational Linguistics Finds Its Voice

501.12.1244.020475

Prior pessimism about reuse in software engineering research may have been a result of using the wrong methods to measure the wrong things.

ACCORDING TO POPPER, "the ideas we can most trust are those that have been the most tried and tested. For that reason, many of us are involved in this process called "science," which produces trusted knowledge by sharing one's ideas and trying out and testing the

idea of others. Science and scientists form communities where people do each other the courtesy of examining, clarifying, critiquing, and improving a large pool of ideas.

According to this definition, one measure of a scientific community's health is how much it reuses results. By that measure, the software engineering research community might seem to be very unhealthy. In 2019, it is reported that from 1974 to 2019, only 72 studies had been replicated by the same studies." In February 2022, as a double-check for the latter's conclusion, we queried the ACM Portal for products from the International Conference on Software Engineering (ICSE), the field's premier conference between 2011 and 2021.

Key Insights

- Researchers must take back control over how our products are shared.
- Results should not be locked away behind paywalls that block access to results and archive outdated views on science. Doing open review feeds, research communities can stay the real partners of inference between their work.
- For example, in SE, researchers often share many artifacts, ranging from ideas to paper-based methods, datasets, and tools. While exact replication of results is rare, we can report just from one year that there are hundreds of cases where one researcher used some but not all of the artifacts from other work.
- We ask others to join us in this effort to re-examine toward the reality of 21st-century science.

Abstract

Results of this paper have been submitted to a different forum, a different venue, without the repeat effort.

apparent then real—at least in software engineering. We describe the effort of re-evaluating research where teams of researchers around the world read 176 (2011 conference) papers from engineering. This work gave the "reuse graph" in Figure 1. In each edge, complete papers appear work they are (re)using, full citations, when compared to community re-evaluating methods, artifact tracks or

bibliometric searches^[10], these reuse graphs require less effort to build and verify. For example, it took around 12 minutes per paper for our team from Hong Kong, Canada, the UK, India, Sweden, Finland, and Australia to apply this reuse graph methodology to software engineering.

The rest of this article discusses generating, applying, and the value of our reuse graphs. Before beginning, we offer the following introductory research. This article is written as a product of sorts, against how we currently assess science and scientific output. This article's authors have worked as researchers for decades, supervising graduate students and organizing prominent conferences and journals. Based on that experience, we assert

* That case included the authors of this paper who only bring from six reviewers, and bring along top team members, interns, students, former interns from other institutions, and others that join through various means. We gratefully acknowledge their work and the work of their graduate students. We gratefully call out the work of others from other institutions, students,

References

- ⇒ Chambers C. What's next for registered reports, *Nature* 573, 187-189 (2019) doi: <https://doi.org/10.1038/d41586-019-02674-6>
- ⇒ Popper, K. *Conjectures and Refutations: The Growth of Scientific Knowledge*. Routledge (1963)
- ⇒ Fabio Q. B. da Silva, Marcos Suassuna, A. César C. França, Alicia M. Grubb, Tatiana B. Gouveia, Cleiton V. F. Monteiro, and Igor Ebrahim dos Santos. 2012. Replication of empirical studies in software engineering research: a systematic mapping study. *Empirical Software Engineering* (Sept. 2012). <https://doi.org/10.1007/s10664-012-9227-7>
- ⇒ Ernst, N.A., Baldassarre, M.T. Registered reports in software engineering. *Empir Software Eng* 28, 55 (2023). <https://doi.org/10.1007/s10664-022-10277-5>



Figure. Watch the authors discuss this work in the exclusive *Communications* video.
<https://cacm.acm.org/videos/reuse-of-research>



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THANK
YOU

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