Empirical Software Engineering

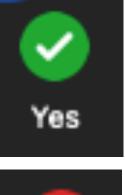
ECE1724H S2 (Winter2021)

Shurui Zhou Assistant Professor shuruiz@ece.utoronto.ca



Lecture Logistics during a Pandemic

• If you can hear me in zoom, please click



otherwise, click



First of all:

You are not alone! We are undertaking this new experience together.



This is not normal. We understand.

• Expect:

- Internet and bandwidth issues
- Timezone issues
- Distractions -- parents, siblings, pets
- Feeling isolated, feeling overwhelmed
- Many additional sources of stress
- Hard time dealing with *everything*...

Talk to us about accommodations of any kind!

Simulating in-class Experience

- Discussions and interactions are important. We'll have regular in-class discussions and exercises
- Use chat or "raise hand" feature
- Muted by default, keep camera on if possible
- Attend lecture live, recordings only as backup
- I may call on you
- Contact me for accommodations!

Shurui Zhou <u>https://www.eecg.utoronto.ca/~shuruiz/</u>shuruiz@ece.utoronto.ca



2014 - 2020 Ph.D.

School of Computer Science Institute for Software Research



2020 Fall – Assistant Professor

| Research | |
|-----------|--|
| Interests | |

- Software Engineering (SE)
- SE for AI
- Al for SE
- Collaborative Software Development
- Open Source





Help software developers to better collaborate

+ Advances in tooling & SE principles
+ Insights from other disciplines
+ Mix a wide range of research methods





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Course Goal

- Motivate the need for an empirical basis for research claims
- Better consumers of empirical research results
- See the variety of kinds of methods available, clear idea about when to use them
- Cover the principal empirical methods applicable to human subjects studies
- Prepare students for advanced research:
 - └ Learn how to plan, conduct and report on empirical investigations.
 - ⇔ Understand the key steps of a research project:
 - formulating research questions,
 - theory building,
 - > data analysis (using both qualitative and quantitative methods),
 - building evidence,
 - assessing validity,
 - > publishing.
- Relate these methods to relevant meta-theories in the philosophy and sociology of science

Learning Goals

- Understand what research designs and research methods are available for empirical research
- Combine research methods in a mixed-methods design
- Collect and analyze qualitative and quantitative data
- Run statistical tests and interpret results
- Build, validate, and interpret regression models
- Draw conclusions from empirical data
- Present results verbally and in writing
- ... and more (see the syllabus doc on Quercus)

| Week | Торіс |
|------|---|
| 1 | Introduction |
| 2 | Literature Review and Theory |
| 3 | Interviews |
| 4 | Grounded Theory |
| 5 | Surveys |
| 6 | Introduction to Measurement |
| 7 | Experimentation |
| 8 | Quasi-experimental Design & Linear Regression |
| 9 | Time Series Analysis |
| 10 | Mixed-methods |
| 11 | Text Mining |
| 12 | Social Network Analysis |

Topics

- Overarching concerns
 - Epistemic base
 - Human subjects
- Research Designs
 - Case studies
 - Grounded theory
 - Experiments
 - Quasi-experiments
 - Mixed methods

- Data Collection
 - Interviews
 - Surveys
 - Observation/ethnography
 - Archival data
- Data Analysis
 - Coding
 - Network methods
 - Counterfactual causal reasoning

Intended Audience

- This is an advanced course:
 - assumes a strong grasp of the key research questions in your own research area, and that you are already doing independent research
- Focus:
 - How do people use computer technology?
 - How does this technology (re-)shape human activities?
 - How can we apply qualitative and quantitative techniques from the behavioural sciences to help answer these questions?
- The course is aimed at students who:
 - ...plan to conduct research that demands some empirical validation
 - ...wish to establish an empirical basis for an existing research programe
 - ...wish to apply these techniques in related fields (e.g. Cog Sci,)
- Note: we will *not* cover the kinds of experimental techniques used in CS systems areas, nor in medical/biological research
 - Focus is on the relationship between human activity and computer technology

Lectures

Thursday 1:00-4:00 pm EST (1:10-2pm + 2:10-3pm + 3:10-4pm)

Break: (remind me if I forget!)

Stand/stretch frequently,

Drink water, Try to change location in your room or apartment

- Zoom

- 'U of T time' — classes start at 10 minutes past the hour, and wrap at the top of the hour.

- Office hour by appointment

Readings

- Major component is discussion of weekly readings
- Please read the set papers before the seminar
- Students present papers 10-15 min each

Activities

- Read method descriptions / how-tos
- Critique papers that use these methods
- Exercises where you get some experience with some of the methods
- Project on your own research topic
 - Review literature
 - Design and plan a study
 - Write as proposal

Evaluation

- 40% assignments
- 50% research project
 - 10% initial project description (proposal)
 - 2% interim report
 - 8% final presentation
 - 30% final report
- 10% participation and in-class presentations

Class (zoom) etiquette

- You have to be authenticated to enter Zoom
- If you want to ask questions or make comments, use your microphone (or raise your hand)
- Arrive on time
- Add your picture to Zoom (camera use encouraged!)

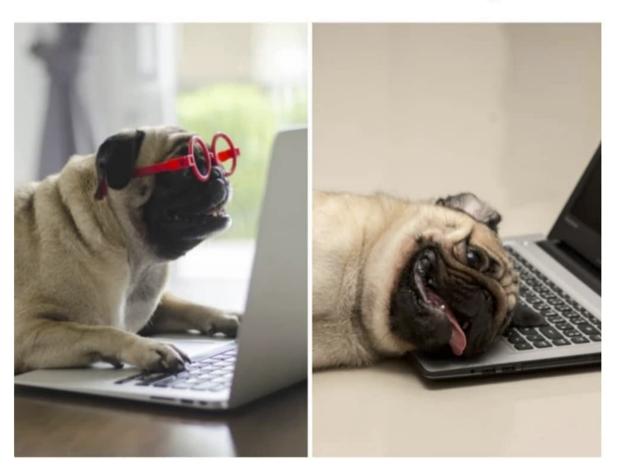
Teachers in normal classes



Teachers now



Zoom meeting, Zoom meeting, with video audio only



https://memes.com/blog/these-hilarious-zoom-memes-are-way-to-real



Zoom meeting, Zoom meeting audio only with video



https://memes.com/blog/these-hilarious-zoom-memes-are-way-to-real



When the teacher calls on you during Zoom and you pretend that the connection is bad





Teaching Assistant



Karthik Mohan

MEng Computer Engineering <u>karthik.mohan@mail.utoronto.ca</u> <u>https://karthmnz.github.io/</u>

Disclaimer

- First time teaching + second time online teaching
- 17-803 (2018): Empirical Methods (CMU)

https://github.com/bvasiles/empirical-methods

+ CSC485 (2020) Empirical SE: Bridging Research and Practice (University of Victoria)

https://github.com/margaretstorey/EmseUvic2020

+ CSC2130 (2014): Empirical Research Methods for Computer Scientists (UofT)

http://www.cs.toronto.edu/~sme/CSC2130/index.html

License

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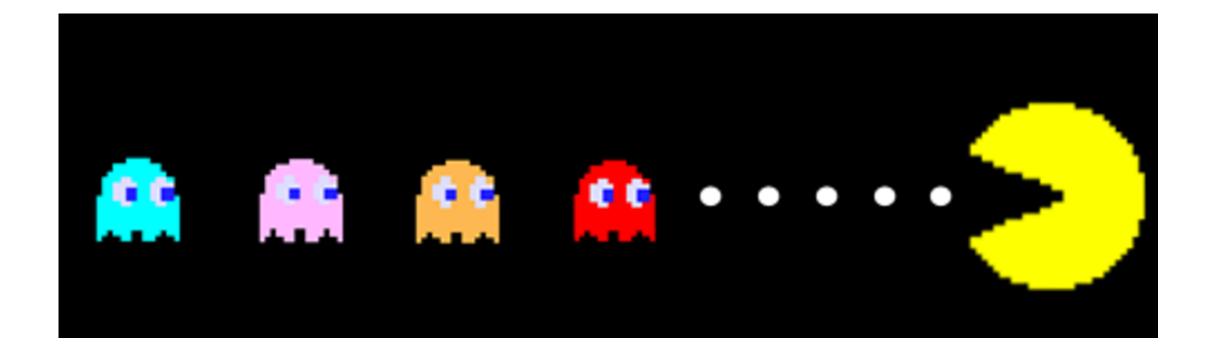




Software Engineering + Empirical Methods

Software is eating the world.... Marc Andreessen

https://a16z.com/2011/08/20/why-software-is-eating-the-world/



(Competing) concerns in SE...

- Code: faster, cheaper, more features, more reliable/secure
- **Developers**: more productive, more skilled, happier, better connected
- Organizations/communities: attract/retain contributors,

encourage a participatory culture, increase value

The Edward S. Rogers Sr. Department









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"Measuring programming progress by lines of code is like measuring aircraft building progress by weight."



"In IBM there's a religion in software that says you have to count K-LOCs, ... How big a project is it? ... And IBM wanted to sort of make it the religion about how we got paid. How much money we made off OS 2, how much they did. How many K-LOCs did you do? And we kept trying to convince them - hey, if we have - a developer's got a good idea

and he can get something done in 4K-LOCs instead of 20K-LOCs, should we make less money? Because he's made something smaller and faster, less KLOC."

--- Steve Ballmer

https://www.pbs.org/nerds/part2.html

Output Unwatch Contributions <> Code (!) Issues 1.3k 11 Pull requests 2 Projects 🛄 Wiki Actions U Security Feb Mar Arx May Contribution graph can be harmful to contributors #627 () Open mxsasha opened this issue on Apr 1, 2016 · 197 comments Summary of pull requests, issues opened, and commits. Lear 0 mxsasha commented on Apr 1, 2016 ···· ··· Contributions in the last year A common well-being issue in open-source communities is the tendency of people to over-commit. Many contributors care 235 total many contributors work next to a full-time job. Feb 8, 2015 - Feb 8, 2016 many different days as possible, generally making more contributions, and making contributions on multiple days in a row

Contributing graphs considered k https://www.hanselman.com/

Stepping away from our work regularly is not only important to uphold high quality work, but also to maintain our well-being. For example, I personally do not generally work in the weekends. That's completely healthy. I take a step back from work and spend time on other things. But in the contribution graph it means I can never make a long streak, even though I do work virtually every day except weekends. So the graph motivates me to work in my weekends as well, and not take breaks. And

☐ isaacs / github

Insights

deeply, at the risk of saying yes too often harming their well-being. Open-source communities are especially at risk, because

The contribution graph and the statistics on it, prominent on everyone's profile, basically rewards people for doing work on as without a break.



Pixel Art



Included "art" from left to right: kitty, oneup, oneup2, hackerschool, octocat, octocat2

https://github.com/gelstudios/gitfiti



Some questions practitioners may care about....

- What is a good architecture to solve problem x? [Devanbu]
- What makes a really awesome programmer? [Software managers]
- How to build a great development team? [Google]
- How is program knowledge distributed? [Naur]
- What is the ideal software engineering process? [Facebook, Microsoft, IBM,...]
- What tools/practices support a participatory development process? [Storey et al.]

Some questions practitioners may care about...

What metrics are the **best predictors of failures**?

What is the data quality level used in empirical studies and how much does it actually matter?

How can I tell if a piece

If I increase test coverage, will that actually increase software quality?

Are there any metrics that are indicators of failures in both Open Source and Commercial domains?

I just submitted a bug report. Will it be fixed? Should I be writing unit tests in my software project?

Do cross-cutting concerns

of software will have vulnerabilities?

cause defects?

Is strong code ownership good or bad for software quality?

Does Distributed/Global software development affect quality?

Does Test Driven Development (TDD) produce better code in shorter time?





Replying to @timkhiggins

Yes, excessive automation at Tesla was a mistake. To be precise, my mistake. Humans are underrated.

12:54 PM - 13 Apr 2018







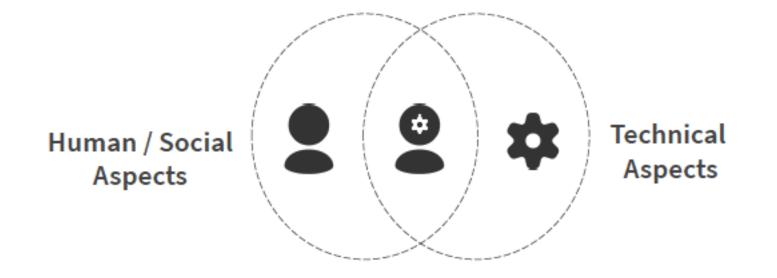
Distracting work Environment Meetings

Non-development work

Developer Study

 https://insights.stackoverflow.com/survey/2019#work-_-greatestchallenges-to-productivity

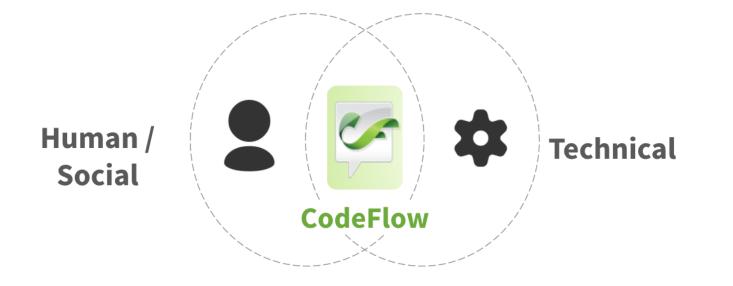
Software Engineering Design Space



Socio-Technical Aspects



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Socio-Technical

Joint Optimization – Code Review

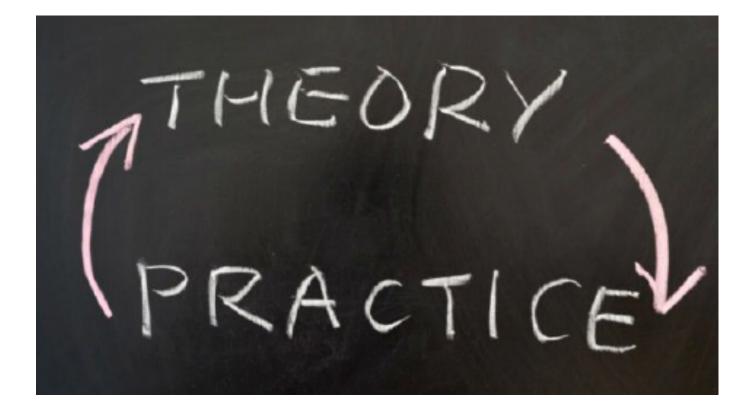
CodeFlow: Improving the Code Review Process at Microsoft, Czerwonka et al. 2018.

Success practice transfer stories from research

- Automated testing (Facebook)
- Code review tools (Microsoft)
- Software Analytics (Hassan et al.)

Research success?





Dispelling myths in software engineering (or creating new ones?)

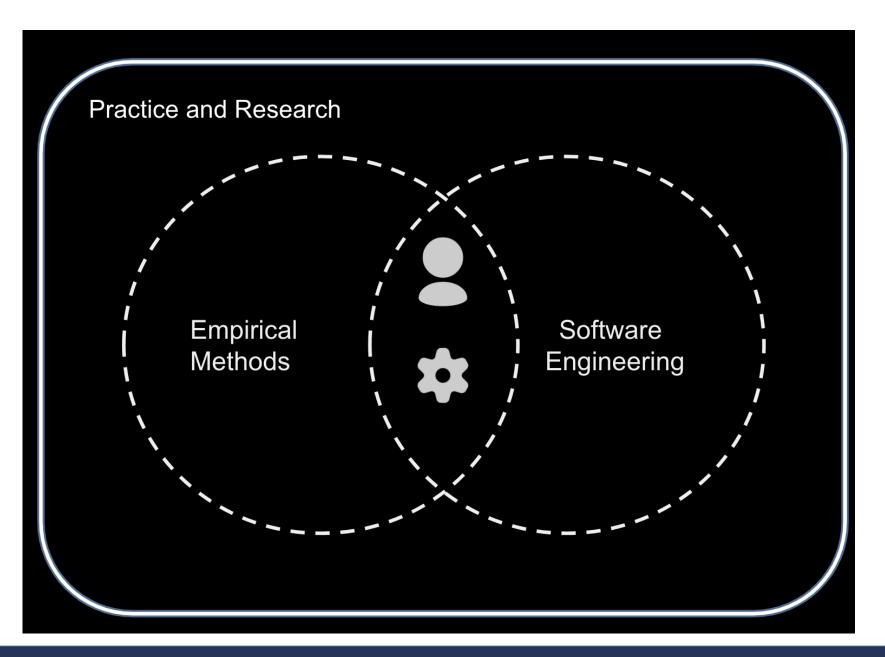
- Does increasing code coverage of testing reduce bugs? No, wasting time testing simple code may increase the presence of bugs! [Mockus et al.]
- Test driven development reduces bugs, but increases time delivering code [Nagappan et al.]
- Geographical distance doesn't matter much [Bird et al.]
- Code clones do not reduce quality in code [Rahman et al.]

References for previous slide

- A. Mockus, N. Nagappan, and T. Dinh-Trong, "Test coverage and post-verification defects: A multiple case study," in ESEM, 2009, pp. 291–301. (note see also this reference for a more recent paper on this! <u>https://ink.library.smu.edu.sg/cgi/viewcontent.cgi?article=4915&context=sis_res</u> earch)
- Nagappan, N., Maximilien, E.M., Bhat, T. et al. Realizing quality improvement through test driven development: results and experiences of four industrial teams. Empir Software Eng 13, 289–302.
- C. Bird, N. Nagappan, P. Devanbu, H. Gall and B. Murphy, "Does distributed development affect software quality?: an empirical case study of windows vista", Communications of the ACM, vol. 52, no. 8, pp. 85-93, 2009.
- M. S. Rahman and C. K. Roy, "On the Relationships Between Stability and Bug-Proneness of Code Clones: An Empirical Study," 2017 IEEE 17th International Working Conference on Source Code Analysis and Manipulation (SCAM), Shanghai, 2017, pp. 131-140.

"Academic software engineering research is a backwater with a tenuous connection to practical software development", Derek Jones

- Lack of industrial relevance (doesn't scale or solve industry problems) [Briand]
- Poor replication of software engineering studies [Menzies et al.]
- Poor actionability (practitioners know which modules are buggy...)
- Perils of mining software repositories [Kaliamvakou, German et al.]
- Lack of focus on human/social aspects [Storey et al.]



1968 NATO Conference on Software Engineering

 international experts on computer software who agreed on defining best practices for software grounded in the application of engineering.



"Academic software engineering research has been a backwater primarily staffed by those interested in theory, with a tenuous connection to practical software development."

- Lack of industrial relevance (doesn't scale or solve industry problems) [Briand]
- **Poor replication** of software engineering studies [Menzies et al.]
- **Poor actionability** (practitioners know which modules are buggy...)
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Derek M. Jones

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43rd INTERNATIONAL CONFERENCE ON MAY 23-29, 2021 SOFTWARE ENGINEERING

ESEC/FSE 2020 Sun 8 - Fri 13 November 2020 Sacramento, California, United States Attending • Program • Tracks • Organization • Q Search Series •



Sign i

ASE 2020

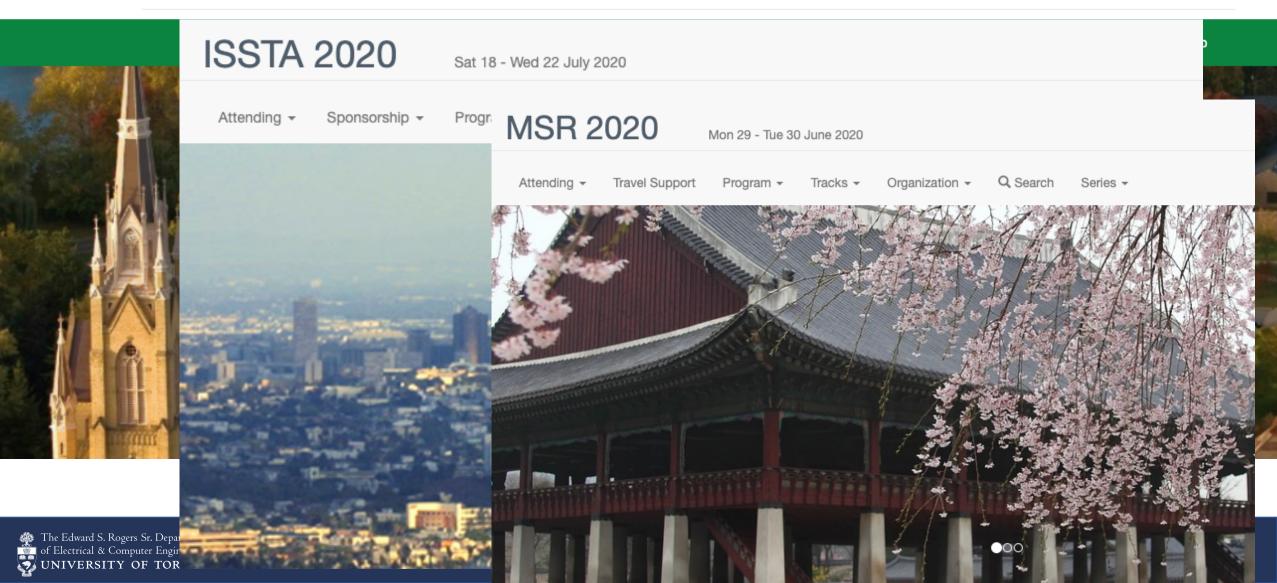
Mon 21 - Fri 25 September 2020 Melbourne, Australia





29th IEEE International Requirements Engineering Conference

Notre Dame, South Bend, USA September 20-24, 2021



Agenda for today

- Introduction
 - Who are you?
 - What's your research?
 - What would make this course valuable to you?
- Why empirical methods?
- Research designs
- Course overview

Let's go around the "room" for introductions:







Name (preferred name)

What's your (research) background? What would make this course valuable to you? One topic you are particularly interested in, if any?



Agenda

- Introduction
 - Who are you?
 - What's your research?
 - What would make this course valuable to you?
- Why empirical methods?
 - Research designs
 - Course overview

Is this your research plan?

- Step 1: Build a new tool
- Step 2:
- Step 3: Profit

Engineering vs. Science

• Traditional View:

Scientists... create knowledge study the world as it is are trained in scientific method use explicit knowledge are thinkers

• More realistic View

Scientists...

create knowledge are problem-driven seek to understand and explain design experiments to test theories prefer abstract knowledge but rely on tacit knowledge

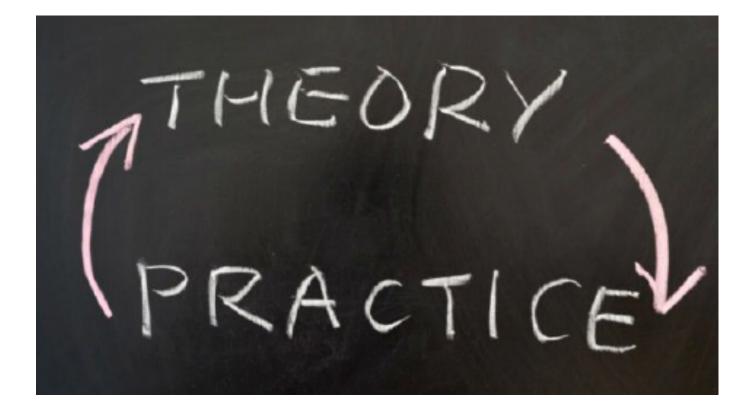
Engineers...

apply that knowledge seek to change the world are trained in engineering design use tacit knowledge are doers

Engineers...

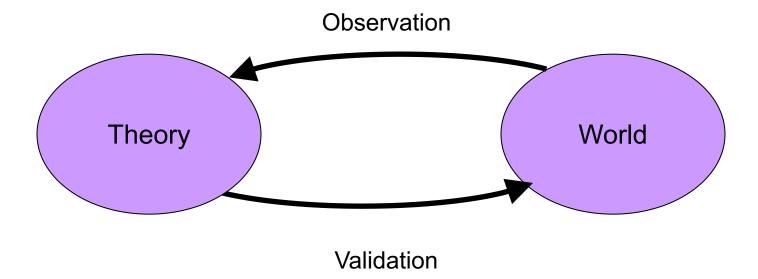
create knowledge are problem-driven seek to understand and explain design devices to test theories prefer contingent knowledge but rely on tacit knowledge

Both involve a mix of design and discovery



Scientific Method

- No single "official" scientific method
- Somehow, scientists are supposed to do this:



Observe!





Help software developers to better collaborate

+ Advances in tooling & SE principles
+ Insights from other disciplines
+ Mix a wide range of research methods



Fork-based Dev. Changed Everything

GitHub Bitbucket GitLab

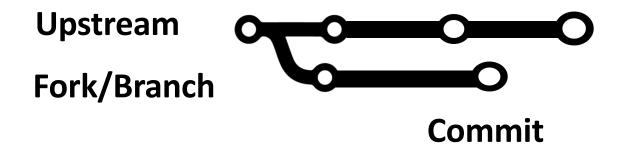


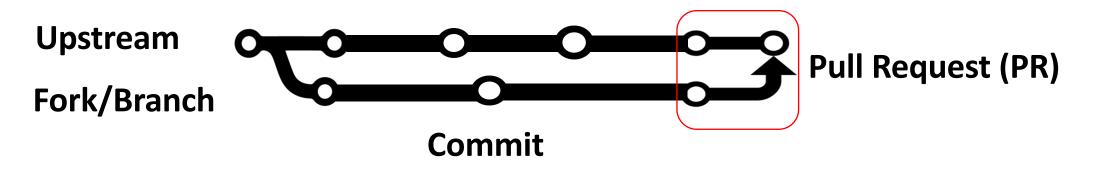












Fork-based / Branch-based / Pull-based Dev.

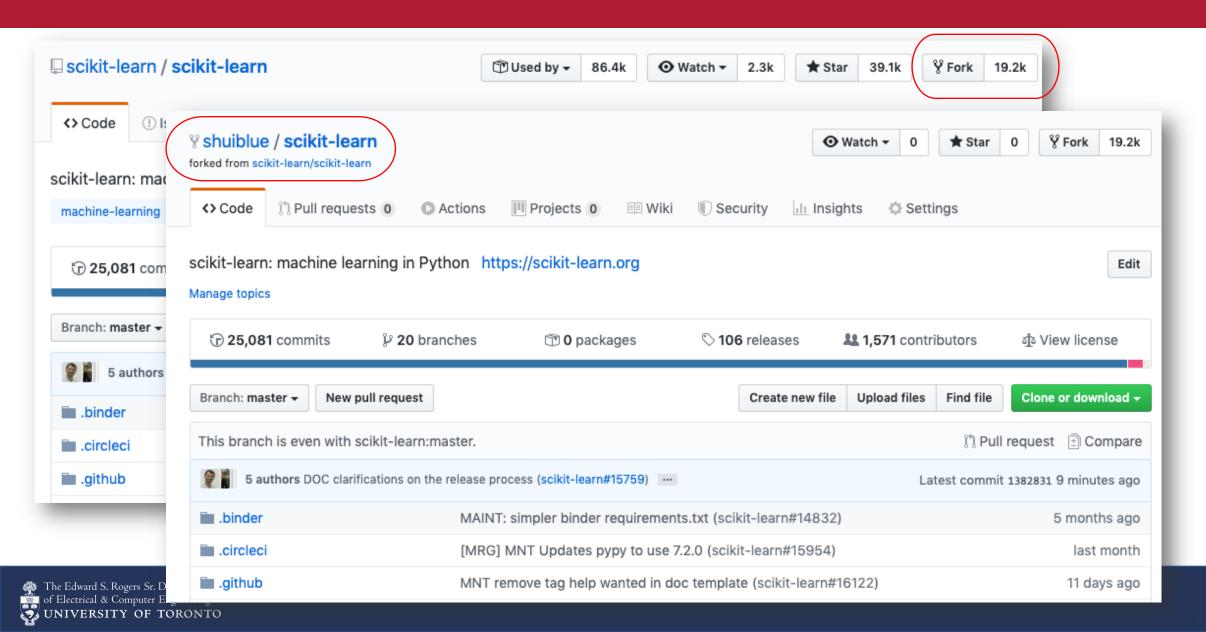
Pull Request / Merge Request



Fork-based Dev. Lowers Entry Barriers

| scikit-learn / scikit-learn | Û | Used by 👻 | 86.4k | | 2.3k | 🖈 Star | 39.1k | ¥ Fork | 19.2 |
|--|-------------------------|-------------|----------------|---------------|----------------------------|------------|-------|---------------------------------------|-------------------------|
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| machine-learning python statistics data-science | data-analysi | 5 | | | | | | | |
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Fork-based Dev. Lowers Entry Barriers

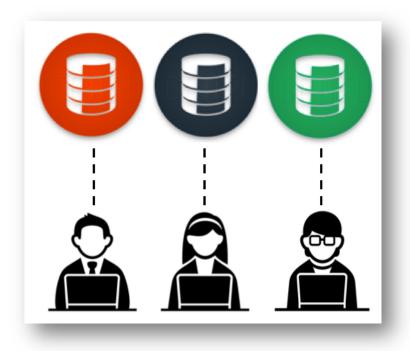


Fork-based Dev. Lowers Entry Barriers



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| ĵ 723 Open ✓ 8,461 Closed Author → | Label - Projects - | Milestones - | Reviews - | Assignee - | Sort - | | | | | | |
| 1 [MRG] Fix FutureWarning in plot_partial_dependent #16256 opened 2 minutes ago by ksslng | ce_visualization_api. | ру • | | | | | | | | | |
| [MRG] Adding explained variances to sparse pca #16255 opened 1 hour ago by Batalex | | | | | | | | | | | |
| 1 "Improved error message when plotting a not fitted #16253 opened 1 hour ago by Rick-Mackenbach | l tree." × | | | | ⊊ 2 | | | | | | |
| In ENH Add 'if_binary' option to drop argument of One #16245 opened 23 hours ago by rushabh-v • Changes requested | HotEncoder ✓ | | | | ₽ 24 | | | | | | |





| #Forks | #GitHub Projects |
|----------|------------------|
| >50 | 114,120 |
| >500 | 9164 |
| >1,000 | 2236 |
| >5,000 | 198 |
| >10,000 | 72 |
| >100,000 | 2 |



open source

[GHTorrent 2019-06]

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| #Forks | #GitHub Projects |
|----------|------------------|
| >50 | 114,120 |
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open source

[GHTorrent 2019-06]



| #Forks | #GitHub Projects |
|----------|------------------|
| >50 | 114,120 |
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open source

[GHTorrent 2019-06]

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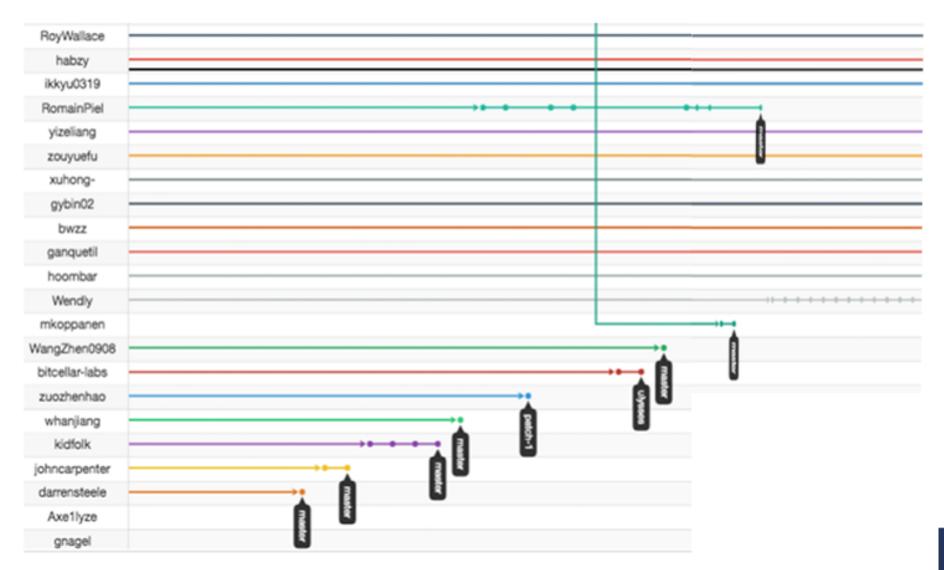


🐲 The Edward S. Rogers Sr. Department

Computer Engineer pg UNIVERSITY OF TORONTOCOM/CUSTOMER-STORIES?type=enterprise



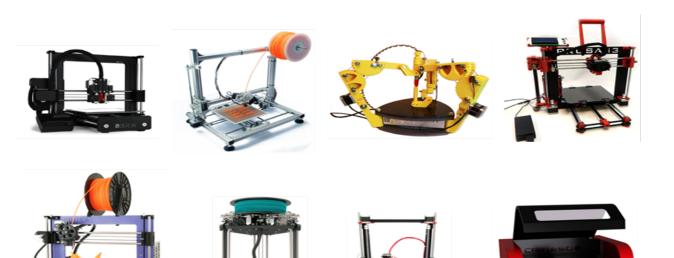
Problem -- Lost Contributions



Problem -- Redundant Development

| foosel commented on Aug 22, 2017 Owner + 🙂 | | | | | | |
|---|--|--|--|--|--|--|
| Sorry, but I can't stop laughing right now. I added <i>exactly</i> the same kind of functionality yesterday (just with a configurable ambient value and a debug command to also modify it during run time). See fbcbb3f | | | | | | |
| | | | | | | |
| Noiredd commented on Nov 3, 2017 Member + 🐑 | | | | | | |
| Duplicate of #5869 and #5972 , partially also #5879 . | | | | | | |

Problem -- Fragmented Community





Problem -- Fragmented Community









Behind the Scenes Bytes

3D Printer Firmware – Which to Choose and How to Change It?

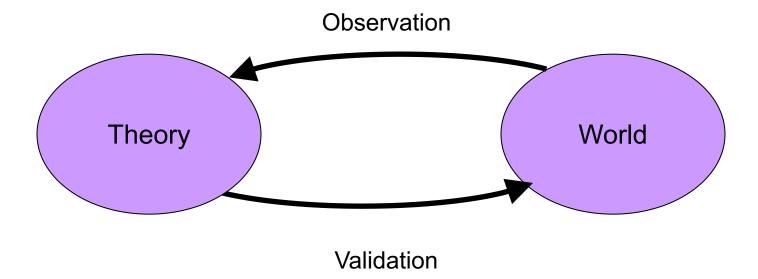


by <mark>Michael Jones</mark> Apr 4, 2018



Scientific Method

- No single "official" scientific method
- Somehow, scientists are supposed to do this:



Lost Contribution

Redundant Development

Fragmented Community





Redundant Development

Fragmented Community





Similar Problems Happen in Industry

It is hard for individual teams to know who is doing what, which features exist elsewhere, and what code changes are made in other forks [1,2].



[1] Thorsten Berger, Divya Nair, Ralf Rublack, Joanne M Atlee, Krzysztof Czarnecki, and Andrzej Wąsowski. 2014. Three Cases of Feature-based Variability Modeling in Industry. In Proc. Int'l Conf. Model Driven Engineering Languages and Systems (MoDELS)

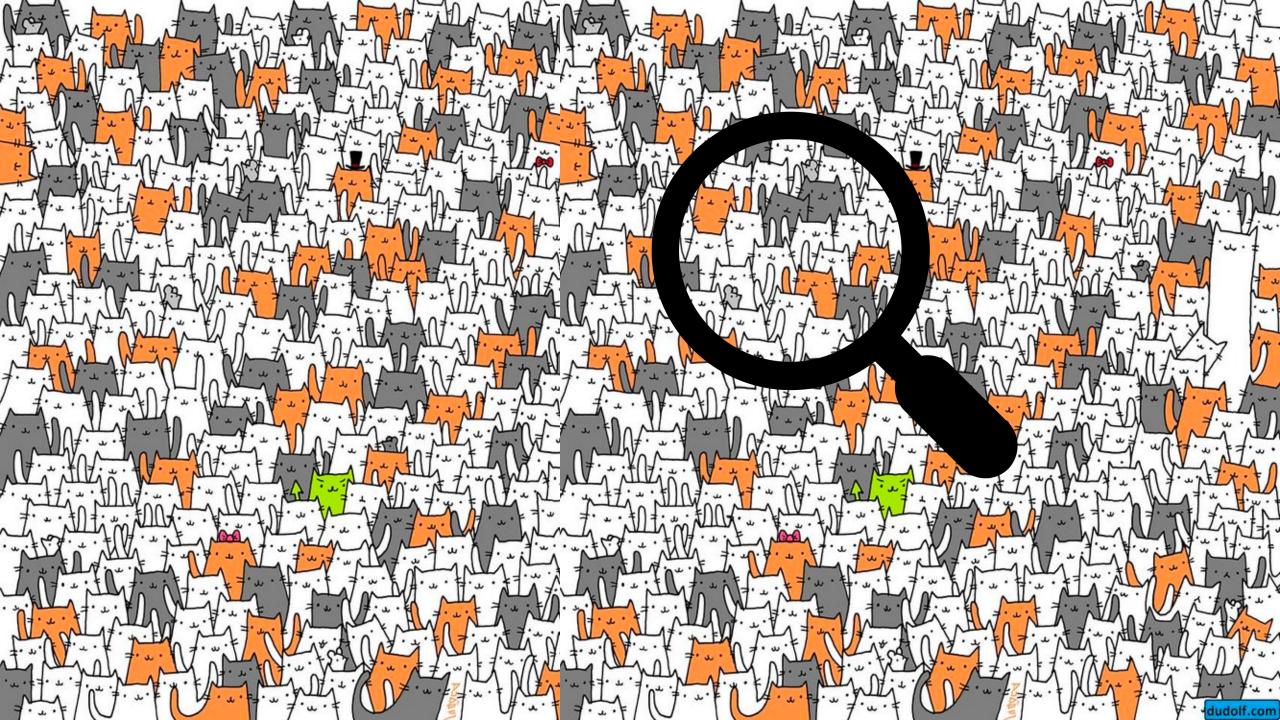
[2] Anh Nguyen Duc, Audris Mockus, Randy Hackbarth, and John Palframan. 2014. Forking and Coordination in Multi-platform Development: A Case Study. In Proc. Int'l Symp. Empirical Software Engineering and Measurement (ESEM). ACM

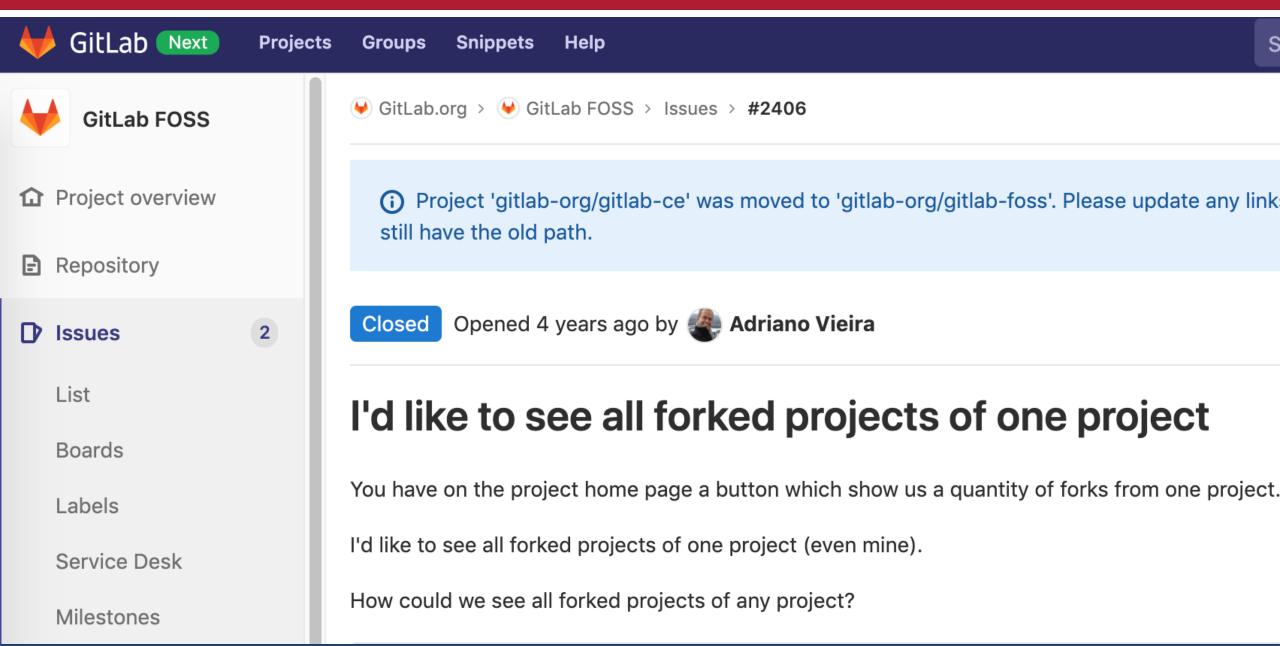
Lost Contribution

Redundant Development

Fragmented Community







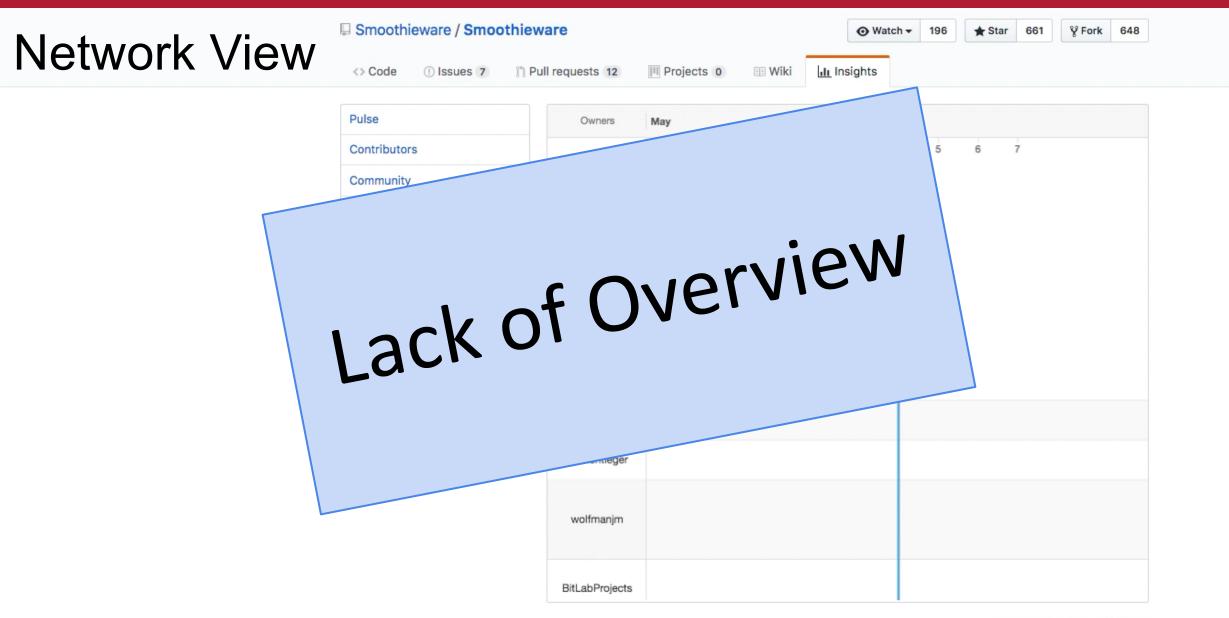
Forks

List of Forks

| 🦊 GitLab | GitLab.org / GitLab Community Edition | ڳ Fork Q Search |
|-------------------|--|----------------------------------|
| Go to group | 8 forkes: 4 public and 3 protected | Recently created Q Search forks |
| Projects | aleksandrs-lebovskis / omnibus-gitlab Why relevant, or what is fixed or whatever copy goes here, in other words why this forked exists. | より14 公7 |
| Files | bbodenmiller / omnibus-gitlab Why relevant, or what is fixed or whatever copy goes here, in other words why this forked exists. | ₽1 公7 |
| Commits Builds | chaws / omnibus-gitlab Why relevant, or what is fixed or whatever copy goes here, in other words why the project was forked. | 20 公0 |
| Graphs | chinnyannieb / omnibus-gitlab Why relevant, or what is fixed or whatever copy goes here, in other words why the project was forked. | 20公0 |
| Milestones | why relevant, or what is fixed or whatever copy goes here, in other words why the project was forked. | 0公 04 |
| Merge Requests | donkey / omnibus-gitlab Why relevant, or what is fixed or whatever copy goes here, in other words why the project was forked. | 10公0 |
| Labels | 2 protected forks you have no access to. | |

| Network Viev | Smoothieware / Smoothieware | | | | Watch ▼ | 196 | ★ Star | 661 | 8 Fork | 648 | | | |
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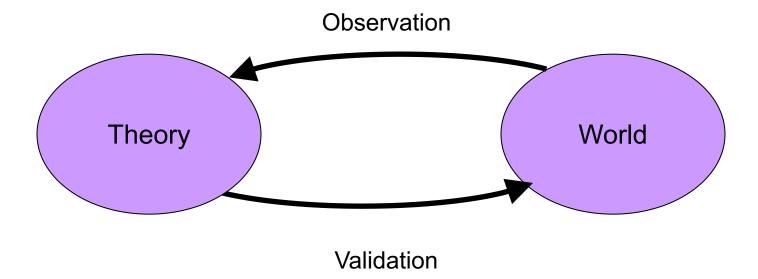
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| Community | | |
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| Network | | |
| Forks | | |
| | | + |
| | 626Pilot | |
| | clementleger | |
| | wolfmanjm | |
| | BitLabProjects | |



Keyboard shortcuts available 🥅

Scientific Method

- No single "official" scientific method
- Somehow, scientists are supposed to do this:

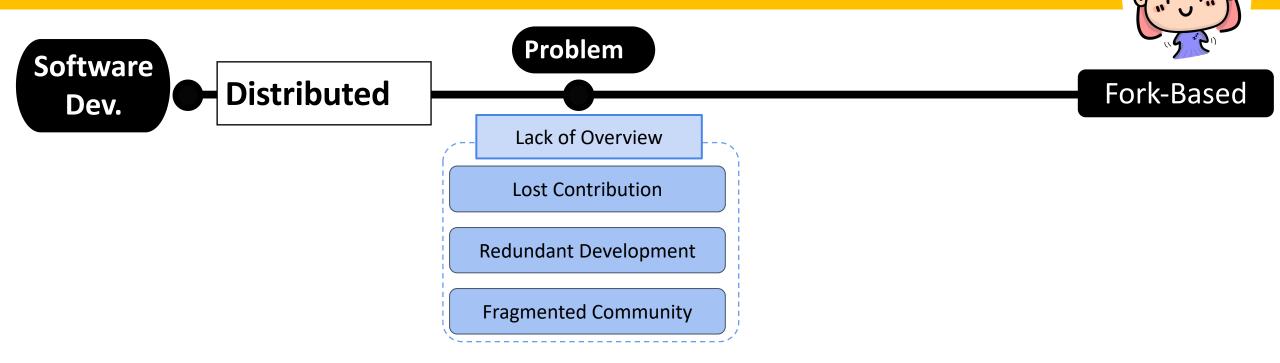


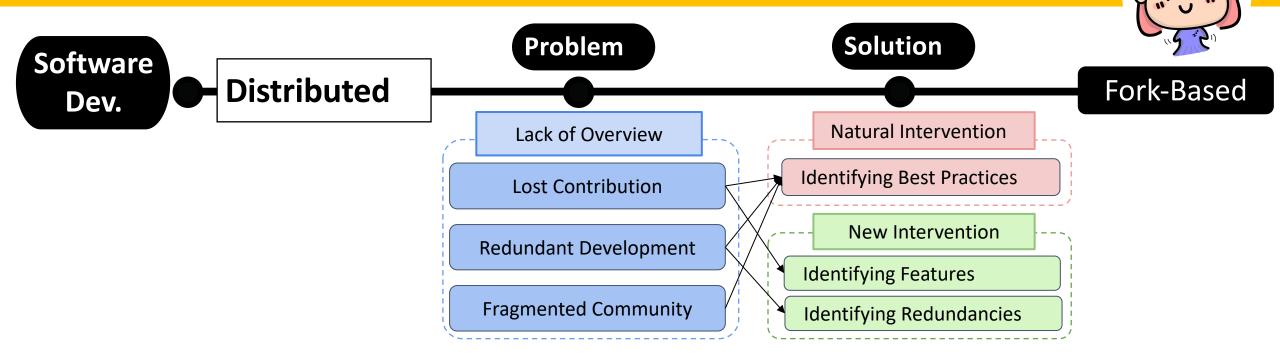


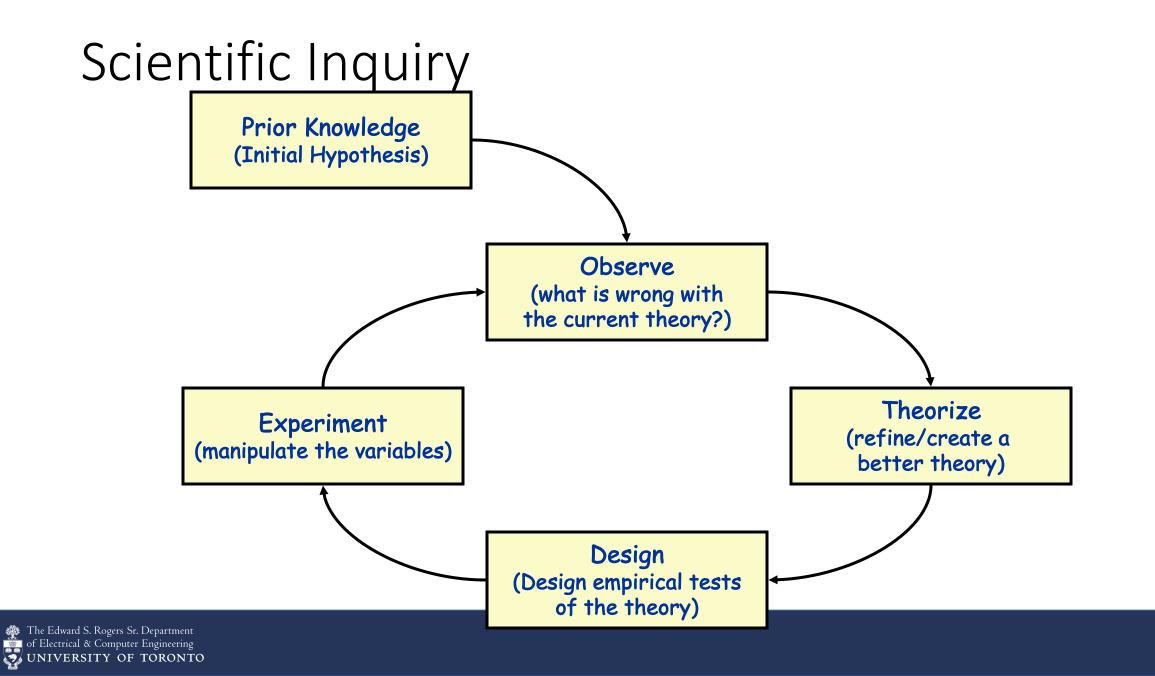


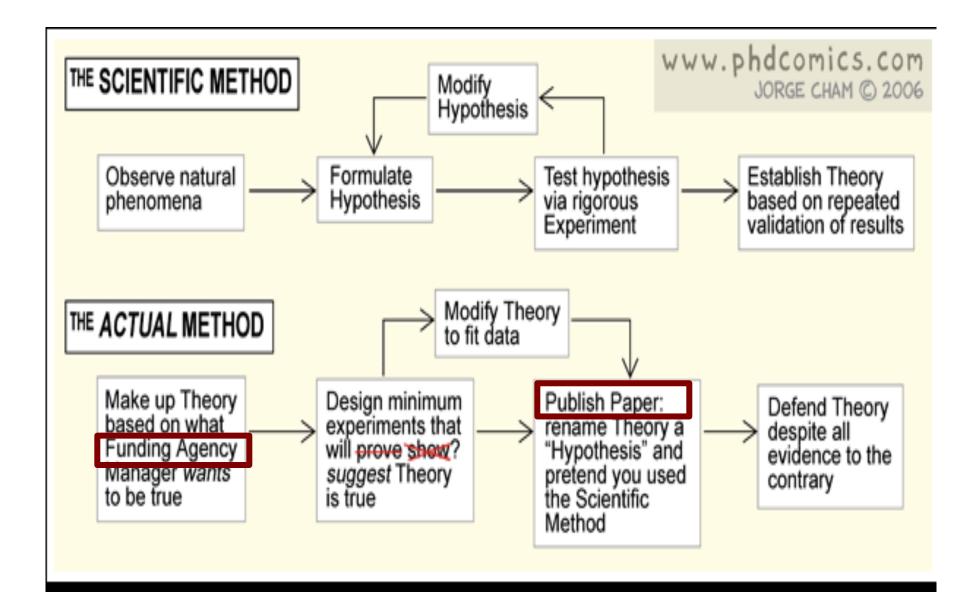












Observe!



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Some Characteristics of Science

- Science seeks to improve our understanding of the world.
- Explanations are based on observations
 - Scientific truths must stand up to empirical scrutiny
 - Sometimes "scientific truth" must be thrown out in the face of new findings
- Theory and observation affect one another:
 - Our perceptions of the world affect how we understand it
 - Our understanding of the world affects how we perceive it
- Creativity is important
 - Theories, hypotheses, experimental designs
 - Search for elegance, simplicity

Empirical Methods

- Why?
 - Accurate perception is hard
 - How to gather evidence and draw conclusions
- There are many methods, no mechanical formulas



A Variety of Reasons for Doing a Study

- Observation
 - E.g., a better understanding of how software engineers/designers/... work
- Identification of problems with state-of-the-art
- Evaluating a new tool/technique
 - E.g., evidence that approach A is better than B

. . .

How to validate your claims?

A Variety of Types of Questions

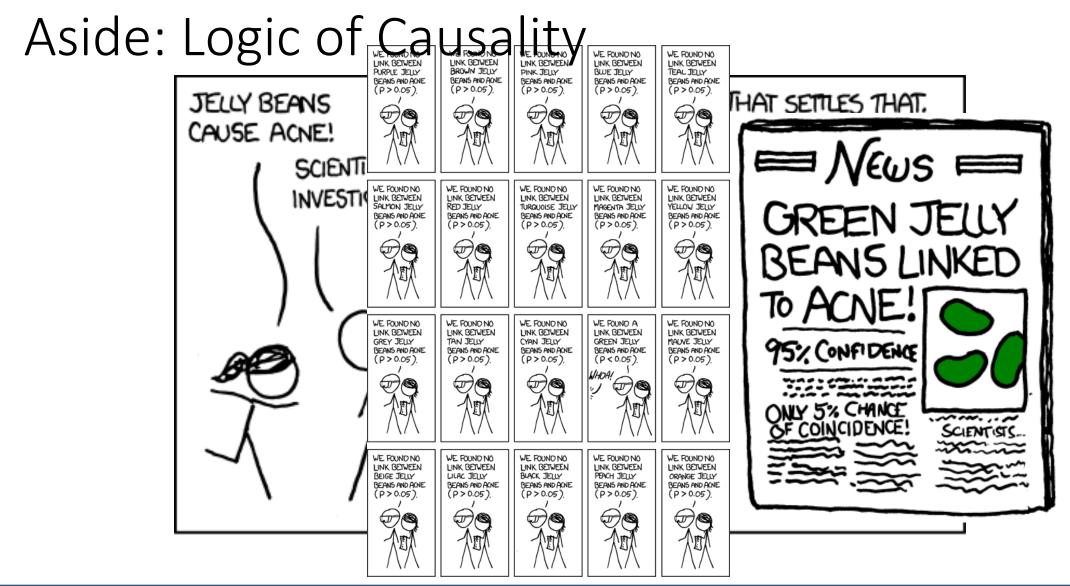
- What's going on here?
- What does an example look like?
- How are several instances same/different?
- What things/events co-occur?
- Do X and Y have a causal relation?
- Does the effect of X on Y vary depending on the value of Z?
- •

. . .

How to approach an answer?

Aside: Logic of Causality

- In a sense, the logic of hypothesis testing is flawed
 - If X, then Y (if theory true, hypothesis must be true)
 - Observe that Y
 - Therefore, X
- Example
 - If my technology is effective, people using it will perform better
 - People using it perform better
 - Therefore, my technology is effective
- Fallacy: affirming the consequent
- Problem of confounding multiple possible causes



Source: http://xkcd.com/882/

Agenda

- Introduction
 - Who are you?
 - What's your research?
 - What would make this course valuable to you?
- Why empirical methods?
- Research designs
- Course overview



Meet Stuart Dent

- Name:
 - Stuart Dent (a.k.a. "Stu")
- Advisor:
 - Prof. Helen Back
- Topic:
 - Merging Stakeholder views in Model Driven Development
- Status:
 - 2 years into his PhD
 - Has built a tool [Stu-Merge]
 - Needs an evaluation plan



Stu's Evaluation Plan

• Formal Experiment





- Independent Variable: Stu-Merge vs. Rational Architect (RA)
- Dependent Variables: Correctness, Speed, Subjective Assessment
- Task: Merging Class Diagrams from two different stakeholders' models
- Subjects: Grad Students in SE
- H₁: "Stu-Merge produces correct merges more often than RA"
- H₂: "Subjects produce merges faster with Stu-Merge than with RA"
- H₃: "Subjects prefer using Stu-Merge to RA"
- Results
 - H₁ accepted (strong evidence)
 - H₂ & H₃ rejected
 - Subjects found the tool unintuitive



Threats to Validity

- Construct Validity
 - What do we mean by a merge? What is correctness?
 - 5-point scale for subjective assessment insufficient discriminatory power
 - (both tools scored very low)
- Internal Validity
 - Confounding variables: Time taken to learn the tool; familiarity
 - Subjects were all familiar with RA, not with Stu-merge
- External Validity
 - Task representativeness
 - class models were of a toy problem
 - Subject representativeness
 - Grad students as sample of what population?
- Theoretical Reliability
 - Researcher bias
 - subjects knew Stu-merge was Stu's own tool



YOUR FEEDBACK



"Measuring programming progress by lines of code is like measuring aircraft building progress by weight."



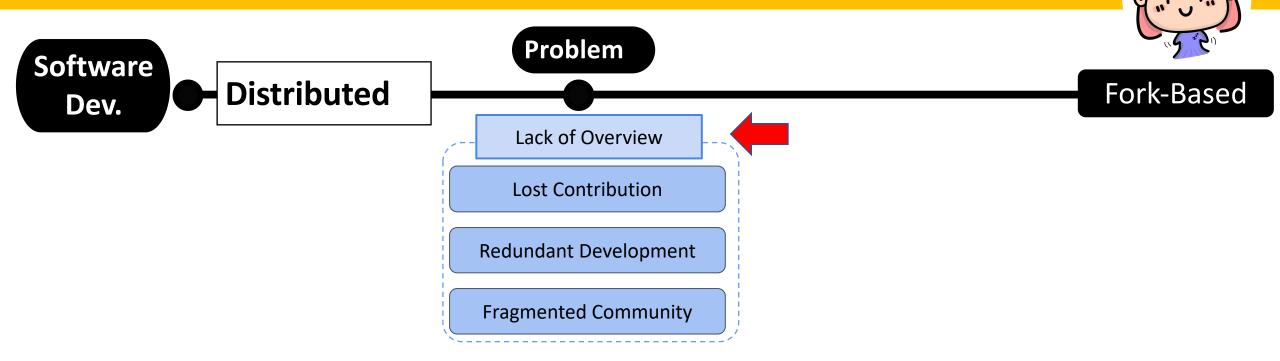
Threats to Validity

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YOUR FEEDBACK

Improving Collaboration Efficiency



Human-subject Study - Usefulness

Can INFOX help developers to gain

a better overview of repository forks?

| Feature | ibradypod/phantomjs, last commmit:May 28 | | | | |
|---------|--|-----|--|--|--|
| onre. | onresourcerequest, bodi, downloadmultibuffer, qnetworkrepli, respons, qbytearray, data, reply, buffers | | | | |
| hea. | header, getcookiestringfromurl, bodi, cookie, get, qurl, qnetworkrepli, respons, url | | | | |
| sett. | settings, a, phantomcfg, not, bug, fix, websecurityen, qwebset, setattribute, qwebsettings | | | | |
| Feature | raff/phantomjs, last commmit: Mar 5 | LOC | | | |
| dow. | download, com, pull, file, ad, support, ariya, http | | | | |
| get | get, qt, are, kei_enter, el, mouse, require, clicks, hard, absolute, setfocus, button, coordinates, keypress | 29 | | | |
| Feature | ricokahler/phantomjs, last commmit:Feb 2 | LOC | | | |
| readlin | readlin, asyncreadrequest, asyncread, qobject, qstring, readline, data, qvariant, m_file, m_data, file, read | 30 | | | |
| uint | uint, tmp_value_, value, tmp, octet, qvariant, data, namesize_, readrawdata, fromvalue | 80 | | | |
| frame | frame, bmconsumeok, bmdeliver, method_id, id_enum, bmgetempty, bmreject, bmrecover | 29 | | | |
| cono. | conoack, 0x04, consumeoptions, coexclusive, declar_flag, consumeoption, conolocal, conowait, flag | 36 | | | |
| Feature | DeviaVir/phantomjs, last commmit: Jan 25, 2016 | LOC | | | |
| allow | allow, set, customwebpag, ratio, m_customwebpag, devicepixelratio, webpage, setdevicepixelratio | 7 | | | |

| Problem | | | | | |
|--------------|---|------------------------|-----------------------|---------------|--------------------------------|
| Network View | Code Issues D N P | | Projects D 🗉 Wiki 🔟 H | ⊕ Watch + 196 | ★ Star 661 ¥ Fork 648 |
| | Pulse Contributors Community Commits Code frequency Dependency graph Network Forks | Owners Smoothieware | May 1 2 3 | | 6 7 |
| | | 626Pliot | | | |
| | | dementieger | | | |
| | | wolfmanjim | | | |
| | | BitLab Projects | | | |
| | | | | | Keyboard shortcuts available 🖂 |





Interesting and Reusable Contribution

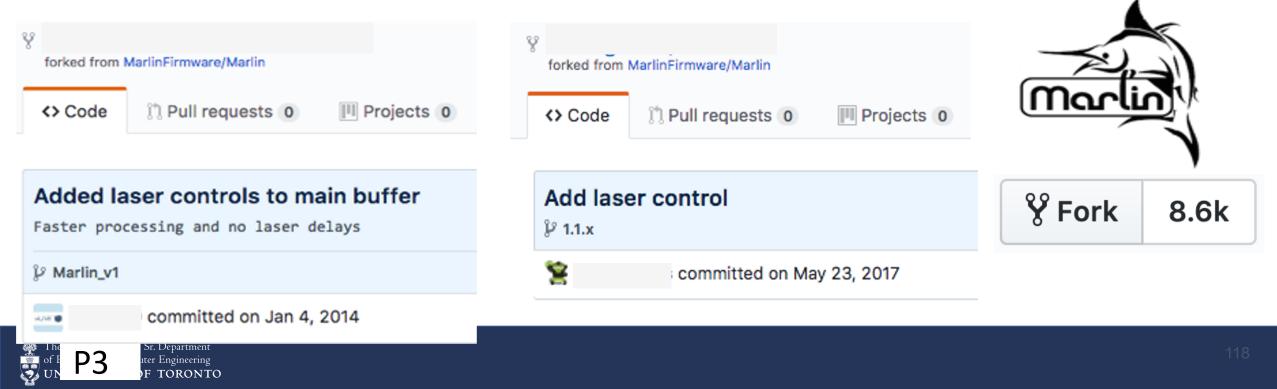
P5: "If it is only exists in this fork, then I want to

somehow get this fork into my fork."

Human-subject Study - Usefulness

Redundant Development

"It does look like somebody did a very simple one-function. I think they should use our code, there is great reason to use it."





Is drug A better than drug B?



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You gotta have a theory!



Some Definitions

→A model is an abstract representation of a phenomenon or set of related phenomena

Some details included, others excluded

→A theory is a set of statements that explain a set of phenomena

Serves to explain and predict

Service of the servic

Sconcepts, relationships, causal inferences

(operational definitions for theoretical terms)

→A hypothesis is a testable statement derived from a theory
♦ A hypothesis is not a theory!

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Projects are different



- Centralized Mgmt
- Upfront Coordination through Issue Tracker

- De-centralized Mgmt
- No Upfront Coordination

Coordination Mechanism Affects Forking Practices

Organizational Theory

Centralization makes it easier to coordinate the divisions' product types but more difficult to take advantage of the divisions' private information. [Brandts et al. 2018]

+ Advances in tooling & SE principles

+ Insights from other disciplines

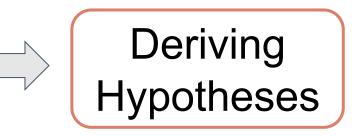
+ Mix a wide range of research methods

What characteristics and practices of a project associate with efficient forking practices?

Research Method

Interviewing Stakeholders

Literature/Theory Search



Centralized Management → Larger portion of contributing forks

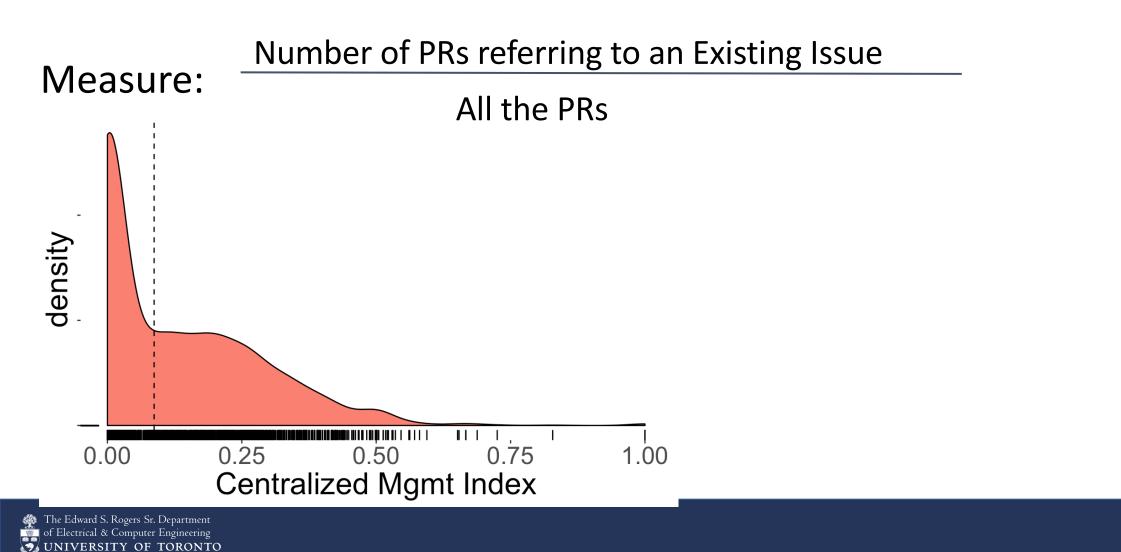
Operationalization - Centralized Management

Measure: Number of PRs referring to an Existing Issue All the PRs

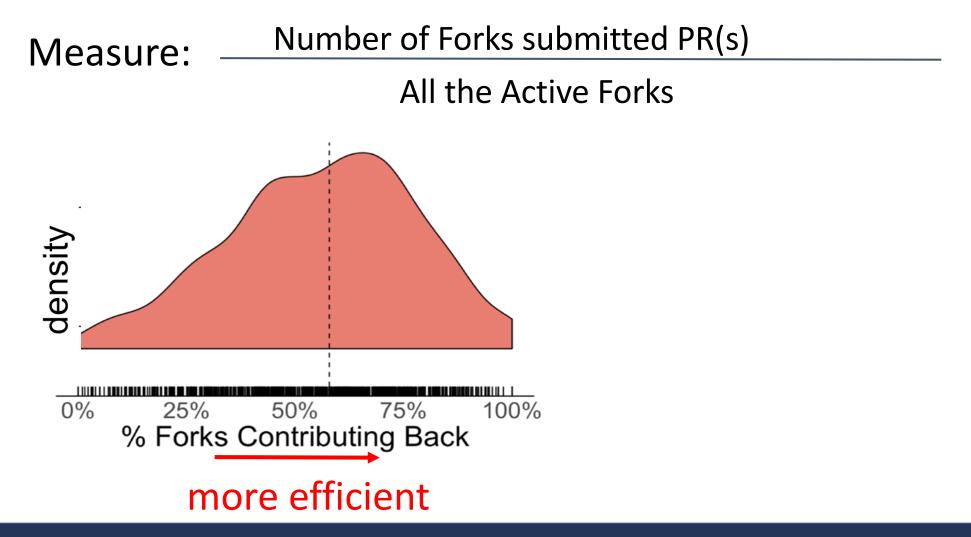
Fix issue #13048 - Documentation regarding p-value bootstrapping #14759

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Operationalization - Centralized Management



Operationalization – Contributing Forks



A simpler definition

A (good) Theory is the best explanation of all the available evidence

The Role of Theory Building

- Theories lie at the heart of what it means to do science.
 - Production of generalizable knowledge
- Theory provides orientation for data collection
 - Cannot observe the world without a theoretical perspective
- Theories allow us to compare similar work
 - Theories include precise definition for the key terms
 - Theories provide a rationale for which phenomena to measure
- Theories support analytical generalization
 - Provide a deeper understanding of our empirical results
 - ...and hence how they apply more generally
 - Much more powerful than statistical generalization

Stu's Theory



- Background Assumptions
 - Large team projects, models contributed by many actors
 - Models are fragmentary, capture partial views
 - Partial views are inconsistent and incomplete most of the time
- Basic Theory
 - (Brief summary:)
 - Model merging is an exploratory process, in which the aim is to discover intended relationships between views. 'Goodness' of a merge is a subjective judgment. If an attempted merge doesn't seem 'good', many need to change either the models, or the way in which they were mapped together.
 - [Still needs some work]
- Derived Hypotheses
 - Useful merge tools need to represent relationships explicitly
 - Useful merge tools need to be complete (work for any models, even if inconsistent)

What type of question are you asking?

→Existence:

♥ Does X exist?

→Description & Classification

- ♥ What is X like?
- ♦ What are its properties?
- ✤ How can it be categorized?
- ✤ How can we measure it?
- ♥ What are its components?

→Descriptive-Comparative

✤ How does X differ from Y?

→Frequency and Distribution

How often does X occur?What is an average amount of X?

→Descriptive-Process

- ✤ How does X normally work?
- ✤ By what process does X happen?
- ♥ What are the steps as X evolves?

→ Relationship

- ♦ Are X and Y related?
- Do occurrences of X correlate with occurrences of Y?

→Causality

- ♥ Does X cause Y?
- ♥ Does X prevent Y?
- ♦ What causes X?
- ♦ What effect does X have on Y?

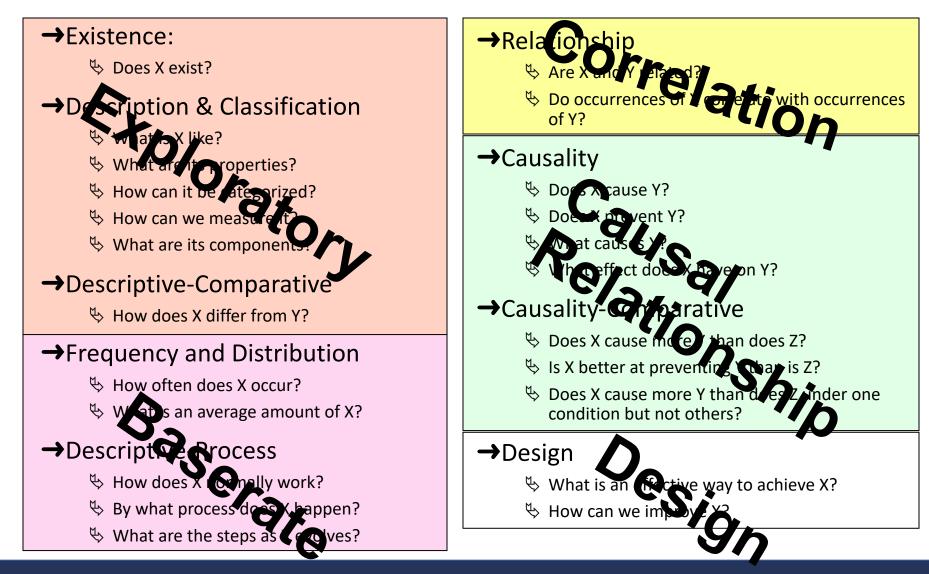
→Causality-Comparative

- ✤ Does X cause more Y than does Z?
- ♥ Is X better at preventing Y than is Z?
- Does X cause more Y than does Z under one condition but not others?

→Design

- ♦ What is an effective way to achieve X?
- ♥ How can we improve X?

What type of question are you asking?



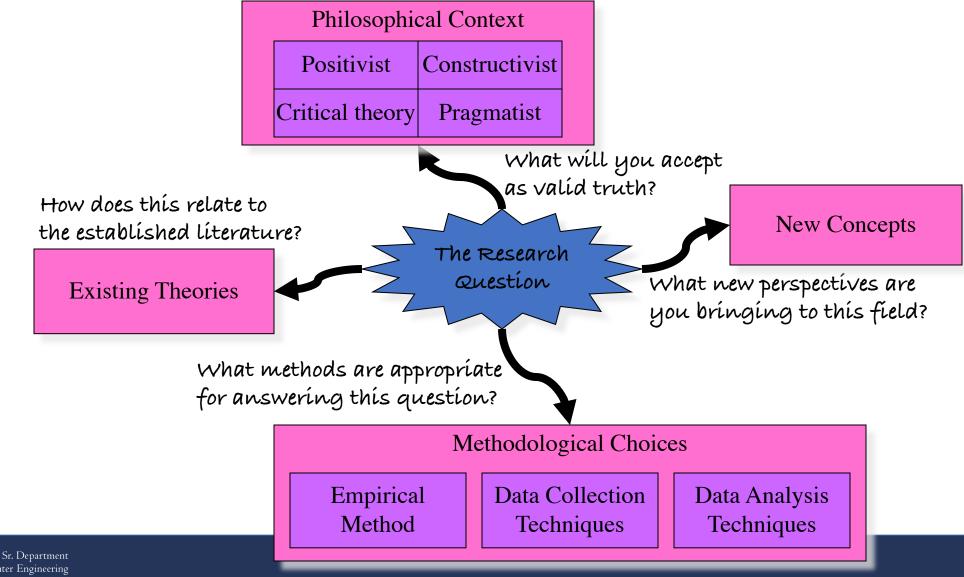
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Stu's Research Question(s)

- Existence
 - Does model merging ever happen in practice?
- Description/Classification
 - What are the different types of model merging that occur in practice on large scale systems?
- Descriptive-Comparative
 - How does model merging with experit representation of relationships differ from model merging without such representation? tor
- Causality
 - Does an explicit representation of the relationship between models cause developers to explore different ways of merging models?
- Causality-Comparative
 - Does the algebraic representation of relationships in Stu's tool lead developers to explore more than do pointcuts in AOM?

Putting the Question in Context



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Many available methods...

Common "in the lab" Methods

Controlled Experiments

- Rational Reconstructions
- Exemplars
- Benchmarks
- Simulations

Common "in the wild" Methods

- Quasi-Experiments
- Case Studies
- Survey Research
- Ethnographies
- Action Research

O Artifact/Archive Analysis ("mining"!)

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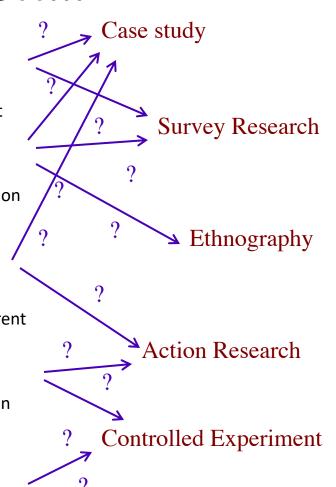
Empirical Methods

- Used in many forms and phases of research
 - Understand problem
 - Current practice
 - Demonstrate utility of solution
- Selection of methods depends on
 - State of knowledge
 - Question researcher is asking
 - Nature of contribution
- Each method has its own standards and techniques for rigor



Stu's Method(s) Selection...

- Existence
 - Does model merging ever happen in practice?
- Description/Classification
 - What are the different types of model merging that occur in practice on large scale systems?
- Descriptive-Comparative
 - How does model merging with explicit representation of relationships differ from model merging without such representation?
- Causality
 - Does an explicit representation of the relationship between models cause developers to explore different ways of merging models?
- Causality-Comparative
 - Does the algebraic representation of relationships in Stu's tool lead developers to explore more than do pointcuts in AOM?





No method is perfect

Don't get hung up on methodological purity

Pick something and get on with it

Some knowledge is better than none



All Methods are flawed

- E.g. Laboratory Experiments
 - Cannot study large scale software development in the lab!
 - Too many variables to control them all!
- E.g. Case Studies
 - How do we know what's true in one project generalizes to others?
 - Researcher chose what questions to ask, hence biased the study
- E.g. Surveys
 - Self-selection of respondents biases the study
 - Respondents tell you what they think they ought to do, not what they actually do
- ...etc...

Strategies to overcome weaknesses

- Theory-building
 - Testing a hypothesis is pointless (single flawed study!)...
 - ...unless it builds evidence for a clearly stated theory
- Empirical Induction
 - Series of studies over time...
 - Each designed to probe more aspects of the theory
 - ...together build evidence for a clearly stated theory
- Mixed Methods Research
 - Use multiple methods to investigate the same research question
 - Each method compensates for the flaws of the others
 - ...together build evidence for a clearly stated theory

Okay, but...

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Why Build a Tool?

→Build a Tool to Test a Theory

Stool is part of the experimental materials needed to conduct your study

→Build a Tool to Develop a Theory

STheory emerges as you explore the tool

→Build a Tool to Explain your Theory

STheory as a concrete instantiation of (some aspect of) the theory



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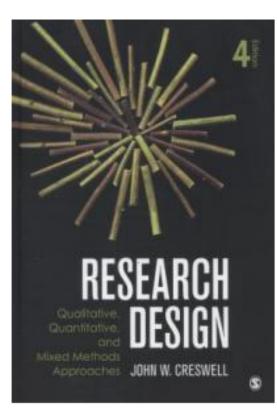


Help software developers to better collaborate

+ Advances in tooling & SE principles
+ Insights from other disciplines
+ Mix a wide range of research methods



Textbook



Research design : qualitativ approaches /

John W. Creswell.

| edition | Fourth edit |
|-------------|--------------|
| imprint | Thousand (|
| description | xxix, 273 pa |
| ISBN | 978145222 |
| format(s) | Book |

JOHN W. CRESWELL • J. DAVID CRESWELL



FIFTH EDITION RESEARCH DESIGN

Qualitative, Quantitative, and Mixed Methods Approaches

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Professionalism

- Being a professional means you should work well with others
- The best professionals are those who make those around them better
- If you feel someone is not treating you or someone else in a professional manner, you have two options:
 - If you feel you have the standing to do so, speak up!
 - Reach out to the course staff, and we will meet with you privately to discuss it, as well as preserve your anonymity

Academic Honesty

- In a nutshell: do not copy, do not lie, do not share or publicly release your solutions
- If you feel overwhelmed or stressed, please come and talk to us

Before next lecture

- Assignment 1
- Sign up for presentations