Using exploratory & evaluation studies







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05-899D: Human Aspects of Software Development (HASD)

Spring, 2011

Why do studies?

What tasks are most **important** (time consuming, error prone, frequent, ...)?

(exploratory studies) (potential usefulness of tool)

Are these claimed productivity benefits **real**? (evaluation studies)

Know the user!
(You may or may not be a typical developer)

Build a tool, clearly it's [not] useful!

80s SigChi bulletin: ~90% of evaluative studies found no benefits of tool

A study of 3 code exploration tools found **no benefits** [de Alwis+ ICPC07]

How do you convince real developers to **adopt** tool? Studies can provide evidence!

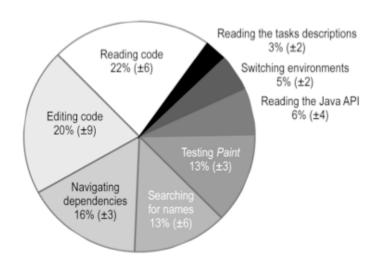
Why not just ask developers?

Estimates are biased (time, difficulty)

More likely to remember very hardest problems They are hard, but not necessarily typical

Example of data from study [Ko, Aung, Myers ICSE05]

22% of time developers copied too much or too little code



Goal: Theories of developer activity

A model describing the **strategy** by which developers **frequently** do an **activity** that describes **problems** that can be **addressed** ("design implications") through a better designed tool, language, or process that more effectively supports this strategy.

Exercise - How do developers debug?

How do developers debug?

by having the computer fix the bug for them.

by inspecting values, stepping, and setting breakpoints in debugger

by adding and inspecting logging statements

by hypothesizing about what they did wrong and testing these hypotheses.

by asking why and why didn't questions.

by following {static, dynamic, thin} slices.

by searching along control flow for statements matching search criteria

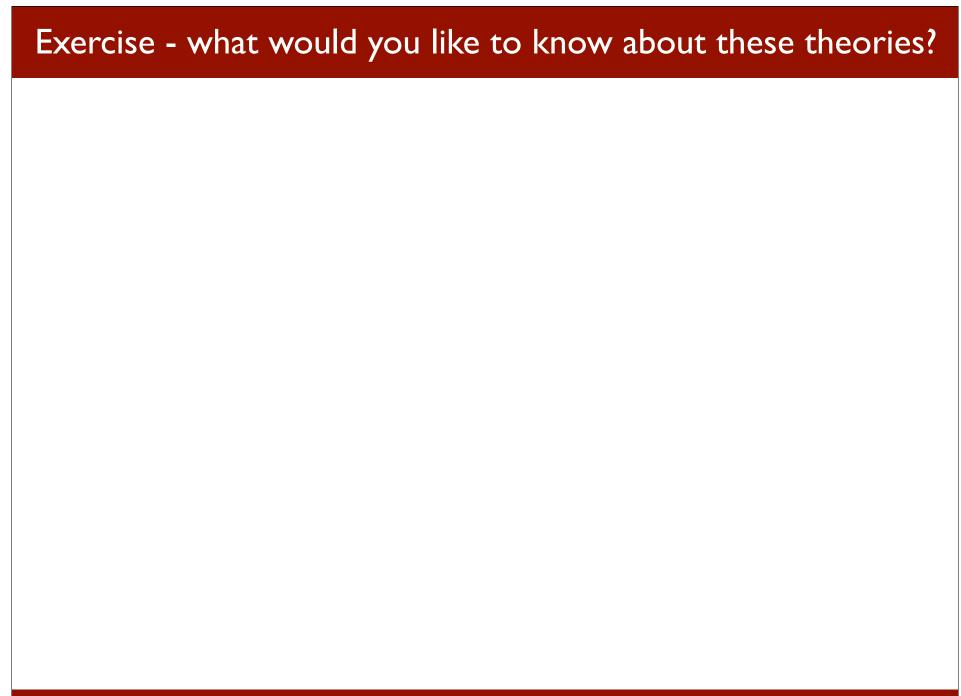
by using information scent to forage for relevant statements.

by asking their teammates about the right way to do something.

by checking documentation or forums to see if they correctly made API calls.

by checking which unit tests failed and which passed.

by writing type annotations and type checking ("well typed programs never go wrong")



Studies provide evidence for or against theories

Do developers actually do it?

Or would developers do it given better tools?

How frequently? In what situations?

What factors influence use? How do these vary for different developers, companies, domains, expertise levels, tools, or languages?

How long does it take?

Are developers successful? What problems occur?

What are the implications for design? How hard is it to build a tool that solves the problems developers experience? How frequently would it help?

A single study will not answer all these questions

But thinking about these questions helps to

- -set scope
- -describe limitations of study
- -pick population to recruit participants from
- -plan followup complementary studies

Analytical vs. empirical generalizability

Empirical: The angle of the incline significantly affects the speed an object rolls down the incline!

- -depends on similarity between situations
- -need to sample lots of similar situations
- -comes from purely quantitative measurements

Analytical: F = m * a

- -depends on theory's ability to predict in other situations
- -describes a mechanism by which something happens
- -building such models requires not just testing an effect, but understanding situations where effect occurs (often qualitative data)

Empirical vs. analytical generalizability in HASD

Empirical: developers using statically typed languages are significantly more productive than those using dynamically typed languages.

Analytical: static type checking changes how developers work by [...]

Is the question, "Does Java, SML, or Perl lead to better developer productivity even answerable?"

Types of studies

Exploratory studies

survey indirect observation contextual inquiry

. . .

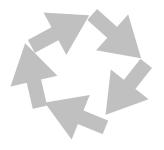
Models

questions information needs use of time

• • • •

(Expensive) evaluation studies

lab study field deployment



Generate tool designs

scenarios mockups

Implement tool

(Cheap) evaluation studies

heuristic evaluation paper prototypes participatory design

. . .

(Some) types of exploratory studies

Field observations / ethnography

Observe developers at work in the field

Natural programming

Ask developers to naturally complete a task

Contextual inquiry

Ask questions while developers do work

Surveys

Ask many developers specific questions

Interviews

Ask a **few** developers **open-ended** questions

Indirect observations (artifact studies)
Study artifacts (e.g., code, code history, bugs, emails, ...)

Field observations / ethnography

Find software developers

Pick developers likely to be doing relevant work

Watch developers do their work in their office

Ask developers to think-aloud

Stream of consciousness: whatever they are thinking about Thoughts, ideas, questions, hypotheses, etc.

Take notes, audio record, or video record

More is more invasive, but permits detailed analysis

Audio: can analyze tasks, questions, goals, timing

Video: can analyze navigation, tool use, strategies

Notes: high level view of task, interesting observations

Ko, DeLine, & Venolia ICSE07

Observed 17 developers at Microsoft in 90 min sessions
Too intrusive to audio or video record
Transcribed think-aloud during sessions

Looked for questions developers asked

information type	search times % agreed info is frequency and outcome of searches frequency of sources min mid max import. unavail. inacc. acquired deferred gave up beyond obs. br = bug report, dbug = debug	ger
information type s1 Did I make any mistakes in my new code? a2 What have my coworkers been doing? u3 What code caused this program state? r2 In what situations does this failure occur? d2 What is the program supposed to do? a1 How have resources I depend on changed? u1 What code could have caused this behavior c2 How do I use this data structure or function? d3 Why was this code implemented this way? b3 Is this problem worth fixing? d4 What are the implications of this change? d1 What is the purpose of this code? u2 What's statically related to this code? b1 Is this a legitimate problem? s2 Did I follow my team's conventions? r1 What does the failure look like?	min mid max import. unavail. inacc. acquired deferred gave up beyond obs br = bug report, dbug = debug dbug 10 compile 26 intuition 6 unit tes coworker 20 email 13 tool 4 bug alert 4 coworker 20 email 13 tool 4 bug alert 4 dbug 16 br 3 intuition 3 log 3 tools 3 code 2 coworker 20 email 13 tool 4 bug alert 4 coworker 8 inference 5 tools 3 dbug 2 commen spec 13 coworker 9 docs 5 email 1 cools 12 coworker 6 email 4 br 2 code 1 coworker 9 docs 5 intuition 4 log 4 br 4 dbug 2 im 1 code 1 spec	st 4 4 im 2 rker 1 t 1
s3 Which changes are part of this submission? c3 How I can coordinate this with this other coo b2 How difficult will this problem be to fix? c1 What can be used to implement this behavior	de? 1 1 4 ■ 75 ■ 28 ■ 30 ••• docs 2 code 1 coworker 1 2 2 4 ■ 41 ■ 15 ■ 32 ••• code 1 coworker 1 screenshot 1 or? 2 2 2 ■ 61 ■ 27 ■ 22 •• memory 1 docs 1	
a3 What information was relevant to my task?	1 1 1 ■ 59 ■ 15 ■ 13 • memory 2	

Natural programming

Design a simple programming task for users

Ask them to write solution **naturally** make up language / APIs / notation of interest

Analyze use of **language** in solutions

Advantages:

elicits the language developers expect to see open-ended - no need to pick particular designs lets developer design language

Disadvantages:

assumes the user's notation is best lets developer design notation

Pane, Ratanamahatana, & Myers '01

Grade school students asked to describe in prose how PacMan would work in each of several scenarios

Usually Pacman moves like this.



Now let's say we add a wall.



Pacman moves like this.



Not like this



Do this: Write a statement that summarizes how I (as the computer) should move Pacman in relation to the presence or absence of other things.

Pane, Ratanamahatana, & Myers IJHCS01

	Overall structure	
Programming style 54% Production rules/events 18% Constraints 16% Other (declarative) 12% Imperative	Perspective 45% Player or end-user 34% Programmer 20% Other (third-person)	Modifying state 61% Behaviors built into objects 20% Direct modification 18% Other Pictures 67% Yes
	Keywords	
AND 67% Boolean conjunction 29% Sequencing	OR 63% Boolean disjunction 24% To clarify or restate a prior item 8% "Otherwise" 5% Other	THEN 66% Sequencing 32% "Consequently" or "in that case"
	Control structures	
Operations on multiple objects 95% Set/subset specification 5% Loops or iteration	Complex conditionals 37% Set of mutually exclusive rules 27% General case, with exceptions 23% Complex boolean expression 14% Other (additional uses of exceptions)	Looping constructs 73% Implicit 20% Explicit 7% Other
	Computation	
Remembering state 56% Present tense for past event 19% "After" 11% State variable 6% Discuss future events 5% Past tense for past event	Mathematical operations 59% Natural language style — incomplete 40% Natural language style — complete Motions 97% Expect continuous motion	Insertion into a data structure 48% Insert first then reposition others 26% Insert without making space 17% Make space then insert 8% Other
576 Past tense for past event	97 % Expect continuous motion	Sorted insertion
Tracking progress 85% Implicit 14% Maintain a state	Randomness 47% Precision 20% Uncertainty without using "random" 18% Precision with hedging 15% Other	43% Incorrect method 28% Correct non-general method 18% Correct general method

Surveys

Can reach **many** (100s, 1000s) developers Websites to run surveys (e.g., SurveyMonkey)

Find participants (usually mailing lists)

Prepare multiple choice & free response questions

Multiple choice: faster, standardized response

Free response: more time, more detail, open-ended

Background & **demographics** questions E.g., experience, time in team, state of project,

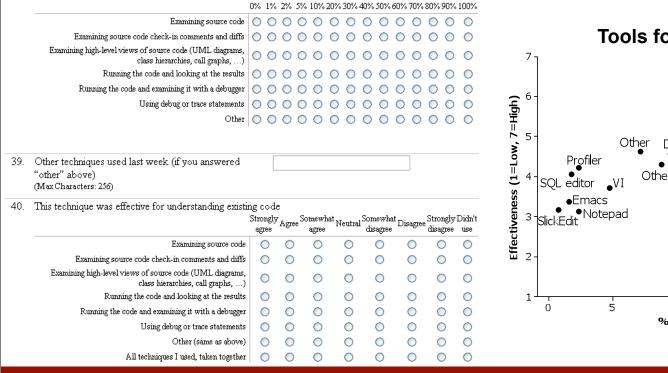
Study questions

Open comments

LaToza, Venolia, & DeLine ICSE06

104 respondents at Microsoft rated % of time on different activities Tool use frequency & effectiveness Severity of 13 "problems"

Of the time I spent understanding existing code last week, the percent of time I spent



Tools for understanding code 7 6 Other Diff tool Source Insight Visual Studio debugger SQL editor VI Emacs SlickEdit Notepad % of time understanding code

Semi-structured interviews

Develop a list of focus areas

Sets of questions related to topics

Prompt developer with question on focus areas

Let developer talk at length

Follow to lead discussion towards interesting topics

Manage time

Move to next topic to ensure all topics covered

Contextual inquiry [Beyer & Holtzblatt]

Interview while doing field observations

Learn about environment, work, tasks, culture, breakdowns

Principles of contextual inquiry

Context - understand work in natural environment

Ask to see current work being done

Seek concrete data - ask to show work, not tell

Bad: usually, generally Good: Here's how I, Let me show you

Partnership - close collaboration with user

Not interviewer, interviewee! User is the expert.

Not host / guest. Be nosy - ask questions.

Interpretation - make sense of work activity

Rephrase, ask for examples, question terms & concepts

Focus - perspective that defines questions of interest

Read Beyer & Holtzblatt book before attempting this study

Indirect observations

Indirect record of developer activity

Examples of artifacts (where to get it)

Code (open source software (OSS) codebases)

Code changes (CVS / subversion repositories)

Bugs (bug tracking software)

Emails (project mailing lists, help lists for APIs)

Collect data from instrumented tool (e.g., code navigation)

Advantages:

Lots of data, easy to obtain

Code, not developer activity

Disadvantages:

Can't observe developer activity

Malayeri & Aldrich, ESOP09

Gathering data for usefulness of language feature

Structure of study

- I. Make **hypotheses** about how code would benefit.
- 2. Use program analysis to measure **frequency** of idioms in corpus of codebases.
- 3. Have **evidence** that code would be **different** with approach.
- 4. **Argue** that different code would make developers more productive.

Example of research questions / hypotheses

- I. Does the body of a method only use subset of parameters? Structural types could make more general Are there common types used repeatedly?
- 2. How many methods throw unsupported operation exception?

Exercise: What study(s) would you use?

How would you use studies in these situations?

I. You'd like to design a tool to help web developers more easily reuse code.

2. You'd like to help developers better prioritize which bugs should be fixed.

(Some) types of exploratory studies

Field observations / ethnography

Observe developers at work in the field

Surveys

Ask many developers specific questions

Interviews

Ask a **few** developers **open-ended** questions

Contextual inquiry

Ask questions while developers do work

Indirect observations (artifact studies)
Study artifacts (e.g., code, code history, bugs, emails, ...)

Cheap evaluation studies

You have a tool idea with scenarios of how it would be used and mockups of what it would look like

You could spend 2 yrs building a static analysis to implement tool But is this the right tool? Would it really help? Which features are most important to implement?

Solution: cheap evaluation studies

Evaluate the mockup before you build the tool!

Tool isn't helpful: come up with new idea

Users have problems using tool: fix the problems

(Some) types of cheap evaluation studies

Empirical studies (w/ users)

Paper prototyping

Do tasks on paper mockups of real tool

Simulate tool on paper

Wizard of oz
Simulate tool by computing results by hand

Analytical techniques (no users)

Heuristic evaluation / cognitive dimensions Assess tool for good usability design

Cognitive walkthrough
Simulate actions needed to complete task

Paper prototyping

Build paper **mockup** of tool before building real version May be rough sketch or realistic screenshots

Experimenter **simulates** tool by adding / changing papers May have cutouts for menus, scrolling, screen objects

Good for checking if user

Understands interface **terminology**

Commands users want **match** actual commands

Able to understand what tool does

Whether **information** provided by tool helps

Challenges - must **anticipate** commands used Iteratively add commands from previous participants Prompt users to try it a different way

Challenges:

Must anticipate user questions beforehand

Wizard of oz

Participant believes (or pretends) to interact with **real** tool Experimenter **simulates** (behind the curtain) tool Computes data used by tool by hand

Original example
Voice user interface
Experimenter translates speech to text

Advantages

High fidelity - user can use actual tool before it's built

Disadvantages

Requires working GUI, unlike paper prototypes

ncreasing fidelit

Types of prototypes

Paper

- "Low fidelity prototyping"
- Often surprisingly effective
- Experimenter plays the computer
- Drawn on paper → drawn on computer

"Wizard of Oz"

- User's computer is "slave" to experimenter's computer
 - Experimenter provides the computer's output
- "Pay no attention to that man behind the curtain"
- Especially for Al and other hard-to-implement systems

Implemented Prototype

- Visual Basic
- Adobe (MacroMind) Flash and Director
- Visio
- PowerPoint
- Web tools (even for non-web Uls)
 - Html
 - Scripting
- (no database)

Real system

Better if sketchier for early design

- Use paper or "sketchy" tools, not real widgets
- People focus on wrong issues: colors, alignment, names
- Rather than overall structure and fundamental design



Heuristic evaluation [Nielsen]

- Multiple evaluators use dimensions to identify usability problems Evaluators aggregate problems & clarify
- I. Visibility of system **status** keep users informed
- 2. **Match** between system & real world Speak users language, follow real world conventions
- 3. User control & freedom undo, redo, don't force down paths
- 4. **Consistency** & standards Words, situations, actions should mean same in similar situations
- 5. **Error** prevention prevent illegal actions E.g., gray out or remove buttons user can't use

Heuristic evaluation [Nielsen]

- 6. **Recognition** rather than recall impt for infreq commands
 Select commands to perform rather than remember command
 Recognition: menus Recall: command line interface
- 7. Flexibility & **efficiency** of use make frequent actions fast Eg., keyboard accelerators, macros
- 8. Aesthetic & minimalist design remove irrelevant information

 More clutter = harder to do visual search
- Help users recognize, diagnose, & recover from errors
 Error message in language user understands
 Precisely indicate problem, suggest solution
- 10. Help & documentation
 Easy to search, task focused, concrete steps to take
 Always available

Cognitive dimensions of notations [Green & Blackwell]

Dimensions for structuring assessment based on experience

Visibility & juxtaposability

What is difficult to see or find?

If need to compare or combine parts, can see at same time?

Viscosity - how hard is it to change?

Diffuseness - brief or long winded?

Hard mental operations - what requires most mental effort?

Error proneness - are there common mistakes that irritate?

Closeness of mapping - how close is notation to what is described?

Role expressiveness - are parts easy to interpret?

Cognitive dimensions of notations [Green & Blackwell]

Hidden dependencies

Are changes to one part which affect others apparent? Do some actions cause dependencies to freeze?

Progressive evaluation - can see progress, stop and check work? Can you try out partially completed versions?

Provisionality - can sketch or try things out when playing with ideas?

Premature commitment -are actions only possible in a specific order? Do users have enough information to choose correct actions?

Consistency - do parts with similar meaning look similar? Are parts that are the same shown in different ways?

Secondary notation - is it possible to write notes to yourself?

Abstraction management - can you define your own elements?

Cognitive walkthrough

Determine the correct **sequence** of actions to perform task Build mockups (screenshot) of each step

For each step, write analysis:

- I.Will user try to **achieve** correct effect? Will user have the correct goal?
- 2. Will user **notice** correct action is available? Will user be likely to see the control?
- 3. Will user **associate** correct action w/ effect trying to achieve? After users find control, will they associate with desired effect?
- 4. If correct action performed, will user see progress to solution? Will users understand the feedback?

Exercise: What study(s) would you use?

How would you design a study(s) in these situations?

I. You're designing a tool for a new notation for visualizing software.

2. You're designing a specification language for finding bugs.

(Some) types of cheap evaluation studies

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Evaluation studies

You've built a tool

You want to write a paper claiming it's useful.

You want to get a company to try it out.

Solution: run an evaluation study
Cheap evaluation study
(Less cheap, but more convincing) evaluation study

(Some) types of evaluation studies

(Cheap) evaluation studies

Lab experiments - controlled experiment between tools Measure differences of your tool w/ competitors
Strongest quantitative evidence

Field deployments

Users try your tool in their own work

Data: usefulness perceptions, how use tool

Usually more qualitative

Lab studies

Users complete **tasks** using your tool or competitors Within subjects design - all participants use both Between subjects design - participants use one

Typical **measures** - time, bugs, quality, user perception
Also measures from exploratory observations(think-aloud)
More detailed measures = better understand results

Advantages - controlled **experiment!** (few confounds)

Disadvantages - lower **external** validity

Users still learning how to use tool, unfamiliar with code

Benefits may require longer task

Ko & Myers CHI09

20 masters students did two 30 minute tasks

Used **tutorial** to teach the tool to users

Tasks: **debug** 2 real bug reports from ArgoUML Diagnose problem & write change recommendation

Measured time, success, code exploration, perception

Resu	ılts	
Task	I	# successful time (min) 30 20 42 10 whyline control
Task	2 6 4 2 0	# successful time (min) 30 20 10 whyline control

	task 1		task 2	
	whyline	control	whyline	control
# of unique mean	1.8	13.3	1	0.6
source files viewed per minute	1.4	8.0	0.5	0.4
range of files viewed	8 – 39	10 – 66	16 – 72	6 – 44
median mean distance to key	2.2	3.4	3.6	3.3
function σ^2	0.6	0.5	0.5	0.5
# why did questions (median, range)	2, 1–4	-	4, 1–8	-
# why didn't questions (median, range)	0, 0–0	-	0, 0–2	-
median # debugger steps taken	_	9	-	14.5
median # text searches	0.5	7	1	8

Field deployments

Generally **not** controlled comparison

Can't directly compare your tool against others

Different tasks, users, code

Give your tool to developers. See how they use it

Data collection: interviews, logging data, observations

Qualitative measures

Perception: do they like the tool?

Use frequency: how often do they use it?

Uses: how do they use it? what questions? tasks? why?

Wishes: what else would they like to use it for?

Quantitative comparison possible but hard

Cherubini, Venolia, & DeLine VL/HCC07

Build large code map to be used for meetings & discussions

Hypotheses: could be used for

- I. understanding new features in code
- 2. reengineering parts of the code
- 3. transferring knowledge to new develoers

Field deployment of map for I month

Only 2 newcomers used it!

Too many or too few details for discussions

Sometimes wrong information (call graph vs inheritance)

Layout was static & couldn't be changed

Developers instead made extensive use of whiteboard

Designing an evaluation study

- I. What is your research question? What do you want to learn? Write a paper abstract with your ideal results
- 2. What type of study will you conduct?
- 3. Who will participate? Undergrads, graduate students, professionals? Closer to your target population is better Where will you recruit them from? What incentive to participate: \$\$\$, class credit, friends, ...
- 4. What tasks will they perform?

 Tasks should demonstrate tool's benefits.
- 5. What data will you collect? think aloud, post task interviews, ... screen, audio, video recording
- 6. Get Institutional Review Board (IRB) approval

Learning a new tool

Study participants will not know how to use your tool.

Solution: tutorial of your tool

What to cover:

Important features, commands of tool

What visualizations, notations mean

What questions does tool let user answer?

Example task done with tool

Use both text & hands on exercises

Let user ask experimenter questions

Piloting

Most important step in ensuring useful results!

- (I) Run study on **small** (I 4) number of participants
- (2) Fix problems with study design Was the tool tutorial sufficient? Did tasks use your tool? Enough? Did they understand your questions? (esp surveys) Did you collect the right data?
 - Are your measures correct?
- (3) Fix **usability** problems

 Are developers doing the "real" task, or messing with tool?

 Are users confused by terminology in tool?

 Do supported commands match commands users expect?
- (4) Repeat 1, 2, and 3 until no more (serious) problems

IRB Approval

Universities have an **Institutional Review Board** (IRB) responsible for ensuring human subjects treated ethically

Before conducting a human subjects study

- Must complete human subjects training (first time only)
- Submit an application to IRB for approval (2 ??? weeks approval time)

During a study

• Must administer "informed consent" describing procedures of study and any risks to participants

See http://www.cmu.edu/osp/regulatory-compliance/human-subjects.html

For more information

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Questions?