Using Qualitative Methods in Empirical Studies of Software Engineering

Carolyn Seaman

University of Maryland Baltimore County
Fraunhofer USA Center for Empirical Software
Engineering Maryland



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Definitions

- Qualitative data data in the form of text and pictures, not numbers
- Qualitative analysis analysis of qualitative data in order to discover trends, patterns, and generalizations
- Grounded theory theory formed bottom-up from the (usually qualitative) data
- Rich data data that includes a lot of explanatory and context information



Why Qualitative Methods?

- Problem: Difficult to answer complex SE questions with a purely quantitative approach because
 - Working with human subjects
 - Typically have small sample sizes
 - Experiments are expensive to run
 - Need some support for a hypothesis before investing effort in full experiment
- Solution: Use a qualitative approach that includes a quantitative aspect



Types of results

A qualitative study will result in:

- Propositions tied to a trail of "evidence"
- Well-grounded hypotheses
- Complex findings that incorporate the messiness of the phenomenon under study
- Explanations
- Areas for future study



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Types of Research Questions

Qualitative methods are most appropriate when:

- Subject of study involves human behavior
- No concrete hypotheses
- Variables hard to define or quantify
- Little previous work
- Quantitative results may be hard to interpret

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Advantages to Researchers

- Richer results
- Results more explanatory
- Closer to sources of data
- Avoid errors in interpretation



Advantages to Practitioners

- Richer, more relevant results
- Terminology of results
- More part of the research process
- Opportunity to clarify and explain findings



Overview of Techniques

Data Collection

- Prior Ethnography
- ParticipantObservation
- Interviewing
- Surveys
- Document Analysis

Data Analysis

- Coding
- ConstantComparison Method
- Cross-case analysis
- Member checking
- Auditing



Participant Observation

Definition: non-covert direct observation of phenomenon

Example: Observation of code inspection meetings

- collected both qualitative and quantitative data
- did not participate in the inspection
- used data forms as well as field notes





Observation Data Form

Inspection Data Form			
Class(es) inspected Author:	Inspection date:		Time:
Moderator: Reviewers:			
Name	Responsibility	Preparation time	Present
Amount of code insp			
Complexity of classe Discussion codes:	75.		
D = Defects Q = Questions C = Classgen defect U = Unresolved issues G/D = Global defects G/Q = Global questions P = Process issues A = Administrative issues M = Miscellaneous discussion			
Time logged (in min D Q C		G/Q P	_ A M



Field Notes Example

The "step" function is a very important but complicated function. [Reviewer1] did not have time to review it in detail, but [Author] said he really wanted someone to go over it carefully, so [Reviewer1] said she would later.

There was a 4-minute discussion of testing for proper default values. This is a problem because often the code is such that there is no way to tell what a particular variable was initialized to. [Reviewer2] said "I have no way to see initial value". This was a global discussion, relevant to many classes, including [Reviewer2]'s evidently.



Interviewing

- Interviews are good for getting
 - opinions
 - feelings
 - goals
 - procedures (both formal and informal)
- not facts



Standard Interview Formats

- Structured (standardized)
 - Tightly scripted, almost verbal questionnaire
 - Replicable, but lacks richness
 - Analyze like questionnaire
 - "How many times a day do you access the internet?

[0, 1-5, 5-10, 10-15, 15+]"



Standard Interview Formats

Unstructured

(Open/Informal/Conversational)

- Guided by a very scant script.
- Rich, but not replicable.
- Difficult to be systematic, problem of coverage.
- Minimize interviewer effects, preserves interviewee point of view.
- Interviewee led, interviewer probes.
- "Please, tell me about your internet usage..."



Standard Interview Formats

Semi-structured

- Guided by a script (interview guide), but interesting issues can be explored in more depth.
- Good balance between richness and replicability.
- Mixed analysis techniques.
- "In a typical day, how often do you use the internet?"



Interview questions

- Closed
 - Predetermined answer format (e.g. Yes/No)
 - Easier to analyze
- Open
 - No predetermined answer format
 - More complete response
- Combination
 - Closed, with opportunity to elaborate
- Probes
- Pitfalls:
 - leading questions
 - double-barreled duestions
 - judgmental questions

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Interview Guide

- A script for use by interviewer only
- "Wish list" vs. structured
- Flow/direction to interview
- Required topics
- Transitions between topic areas
- Important for replicability
- Wording and sequence are critical



Interview Design Considerations

- Context switching
- Flow between open and closed questions
- "Shape" of interview
- Most important stuff first
- Wording



Interview Shapes

- Funnel
 - Begin with open, gradually become more closed
 - Good if you're not sure what you're going to get
- Pyramid
 - Begin with closed, gradually become more open
 - Good with nervous interviewees
- Hour glass
 - Begin with open, gradually become more closed, then open up again at end to pick up things you might have missed
 - Good if you know what you want, but suspect there are important things you don't know about yet



Example Interview Guide

Interview Guide 2a: In-depth project interviews

Who: Developers on [Project1], [Project2], [Project3]

Subjects covered: general opinions of GSS processes and products

Duration: 60-90 minutes

What do you like about the current process using GSS?

What do you dislike about the current process using GSS?

Do you depend on any other groups, either for information or help with GSS, or for work to be done related to GSS?

What do you like about the applications resulting from using GSS?

What do you dislike about the applications resulting from using GSS?

Have there been any problems with the interface between GSS and other COTS products?

What do you see as the top risks associated with the use of GSS? How would you mitigate these risks?



Interviewing Pointers

- give clues about the level of detail you want
- establish rapport, but be subject neutral
- avoid jargon, esp. academese
- dispel any notion of the "right" answer
- play the novice when appropriate
- probe, but do not lead
- always be aware of your biases
- be sensitive to their work (environment/schedule)
- no more than 60 minutes
- let interviewee know next steps
- end with "anything else I should know?"
- say Thank you!



Recording of interviews

- Audiorecording
- Notetaking
- Scribing



Audiorecording

- Best memory mechanism
- Full transcription or just verbatim quotes
- Still take notes
 - Tapes fail, digital files are deleted
 - Does not record all aspects (esp. context / facial expressions)
- Required consent
 - Always ask first.
 - Do NOT hide recorder, keep it visible at all times.
 - Give the option to turn it off at any point.



Notetaking

- Very hard to take notes and interview at the same time
- There are some superresearchers who can do it
- Inevitably results in incomplete notes
- Slows down the interview
- Sometimes inevitable



Scribing

- Partner-based interviewing
- Advantages of a single contact vs. trading-off
- Can share roles (interviewer/scribe)
 - BOTH take notes, though to different degree
- Group debrief: what did you get/miss?
- Synchronize notes: overlap and emphasis
- Clarify while it is still in your head



Writing up the interview

ASAP!!!



Interview Notes

- Write it up <u>immediately</u>
- Descriptive vs. reflective notes
- Use Observer's Comments
 - Impressions, state of mind, assumptions, notes to self
- How detailed?
 - Verbatim transcript
 - only possible with audiorecording
 - Extremely labor-intensive
 - Summaries with major points quoted
 - OK, but use LOTS of quotes
 - Start closer to verbatim at the beginning of a study



Interviewing Exercise

Background:

- The National Federation of Makers of Feijoada (FNFF) is concerned that the national consumption of feijoada is declining due to decreasing quality of feijoada.
- So they have asked us to interview the top feijoada chefs in the country (as determined by regional competitions)
- The goal is to find out the secrets to master feijoada making, so that it can start to be taught in elementary schools.



Interviewing Exercise

- Three versions of the interview guide
- I will be the interviewer
- You will be the interviewees
 - So take a moment to think of your favorite feijoada chef



- 1. How often do you make feijoada and how long does it take you?
- 2. What do you think makes your feijoada the best?
- 3. Of course, you always wash your hands thoroughly before you start, right?
- 4. Do you add the sausage near the beginning or near the end of the cooking?
- 5. What kind of pot do you use?
 - 3. How long does it take to make reljoada?
 - 4. What are the ingredients you use?
 - 5. What do you think makes your feijoada the best?
 - Switching from topic to topic
 - Switching between open and closed



Constant Comparison Method

- Qualitative analysis method
- Meant to generate grounded theory
- Operates on a set of field notes
- Basic process:
 - coding
 - grouping
 - writing field memo
 - forming hypotheses
- Repeated periodically in parallel with data collection



What's a Code?

- A label
- A concept
- A topic
- A category
- A relationship
- A theme



What's Coding?

- Open coding assigning codes to pieces of textual data
 - Coded "chunks" can overlap
 - One chunk can have several codes
- Axial coding grouping, categorizing, combining coded chunks
- Selective coding making sense of it



Open Coding

What's here? What are the pieces?

- Identification/discovery of concepts
- Classification (labeling of phenomena)
- Abstraction (this is part of that)
- Comparative analysis (this is different from that)
- Categorization (organization, grouping)
- Value-neutral, at least initially
 - "complexity" not "high complexity" or "low complexity"

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Open Coding Process

- Preparing for coding
 - Read the data
 - Read background material and research design
 - Create pre-formed codes, if applicable
- Coding by hand
 - Document markup (colored pens, etc.)
 - Photocopy, scissors, and envelopes
 - MS Word comments
 - Excel
- Coding tools NVivo, Atlas TI
- Coding scheme
 - Pre formed or post formed codes
 - Constant iteration
 - Structure develops over time



Open Coding Exercise

Background:

- Study of the role of documentation in software maintenance
- Interviews with experienced software maintainers in several organizations

Process:

- I'll show you an example
- Then you'll try it code one excerpt with one code
- Find a partner compare your codings
- I'll show you my coding of the excerpt



Coding Scheme

Respondent Background Information Gathering

Human Sources of Information





Open Coding and Quantification

- One form of coding
- Objective is to derive quantitative data from qualitative data for future statistical analysis
- Usually involves counting
 - How many subjects said…?
 - How many times did subjects use the term …?
 - How many times did ...?
- Or timing
 - How long did subjects spend doing…?
 - How long did it take to …?
- Inevitably loses richness
- Often seems a little like missing the point
 - What's the point of collecting rich data when you're just going to condense it down to numbers?
- But often is an effective and necessary way to reduce the size of the data



Inspection Data Form Class(es) inspected: Inspection date: Time: Author: Moderator: Reviewers: Name Responsibility Preparation time Present Amount of code inspected: Complexity of classes: Discussion codes: D Defects Reviewer raises a question or concern and it is determined that it is a defect which the author must fix; time recorded may include discussion of the solution Questions Reviewer asks a question, but it is not determined to be a defect. Classgen defect Reviewer raises a defect caused by classgen; author must fix it, but it is recognized as a problem to eventually be solved by classgen Unresolved issues Discussion of an issue which cannot be resolved; someone else not at the meeting must be consulted (put name of person to be consulted in () beside the code); this includes unresolved classgen issues. It also includes issues which the author has to investigate more before resolving. G/D Global defects Discussion of global issues, e.g. standard practices, checking for null pointers, which results in a defect being logged (does not include classgen defects) G/Q Global questions Same as above, but no defect is logged Process issues General discussion and questions about the inspection process itself, including how to fill out forms, the order to consider material in, etc., but not the actual execution of these tasks. Administrative issues Includes recording prep time, arranging rework, announcing which products are being inspected, silence while people look through their printouts, filling out forms. Miscellaneous discussion HONORS Time logged (in minutes): UNIVERSITY © Carolyn S D Q C U G/D G/Q P A IN MARYLAND

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Lots of time for everyone trying to find right place in printout - small print is a factor				

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Axial Coding

How are things related?

- Initial process of reassembling
- Relationships among categories and codes
- Structure (why?)
- Process (how?)
- Explanations not causal prediction



Selective Coding

How does it all fit together?

- Also called sense making
- Relationships among relationships
- Theory construction
- The central category
- Storyline memos
- Role of literature
- Write, write, write!!!
- Field Memos



Field Memos

- The "single most powerful analytical tool" for qualitative researchers
- Simply, a piece of writing
- Maybe will later become part of a report, maybe will be thrown out
- Summarizes and synthesizes:
 - A proposition
 - An open question
 - A chain of evidence and logic
 - The complexity of a concept
 - Rich description
- Version control and organization



Judging Validity

- Validity of methods
 - Triangulation
 - Documentation
 - Contradictory evidence
- Weight of evidence
 - How much is enough?
 - Variety as well as quantity of evidence



Using Qualitative and Quantitative Methods Together

- Qualitative and quantitative methods best used in combination
- Can simply be used in parallel to address the same research questions
- There are other strategies to better exploit the strengths and weaknesses of the methods



Example Design 1: Statistical Hypothesis Testing with Follow-up Interviews

- Classic design often done without fully exploiting the interview data
- Example scenario:
 - Blocked subject-project experiment to evaluate a new testing technique
 - Statistical results show that technique is more effective on some applications than on others
 - Qualitative results show why



Example Design 2: Using Grounded Theory to Identify Variables

- Want to evaluate a new technique, but not sure what the evaluation criteria should be
- Example scenario:
 - Evaluating a collaborative design process
 - Use participant observation of design meetings to generate hypotheses about properties of the resulting designs
 - Grounded hypotheses are used to design a quantitative evaluation of the resulting designs



Example Design 3: Using Prior Investigation to Operationalize Variables

- Relevant variables are known, but the range and types of values is difficult to specify
- Example scenario:
 - Want to study the relationship between developer experience and types of defects
 - First use interviews to identify the range of developer experience (in its complexity) and a taxonomy of defect types
 - Quantitative study then is much more effective when using this operationalization



Conclusions

- Empirical software engineering researchers are addressing more and more complex research questions that have increasingly human elements
- Qualitative methods, usually in combination with quantitative methods, can be helpful in handling this complexity
- Qualitative methods are both flexible and rigorous
- Qualitative analysis provides richer, more relevant, and more explanatory results
- The most effective research designs combine qualitative and quantitative methods





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