Debugging (2/2)

Martin Kellogg

Reading Quiz: debugging 2

Q1: What is the inspiration for the name of the "wynot" tool?

- A. The "wynot" tool helps answer the question "why not?"
- B. It is named after the Pokémon "Wynaut"
- C. "wynot" is an abbreviation for "Worked Yesterday, NOt Today"
- **D.** None of these are the inspiration for the tool's name

Q2: Which web browser was an experimental subject in the article?

- A. Mozilla/Netscape
- B. Chromium/Google Chrome
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- "printf" debugging: using print statements to find a bug
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- delta debugging
 - a **formalization** of the scientific approach to debugging
- debuggers: inspecting program state while it is running
 we'll talk a little about how they work

Debugging (Part 2/2)

Today's agenda:

- Debugging
 - printf debugging and logging
 - delta debugging
 - debuggers

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 - sometimes considered "unprofessional"

- probably your most common debugging strategy already!
- key idea: instrument the program so that it prints the values of key variables at a part This is a misconception: professional
- advantages:
 - easy and natural
- disadvantages:
 - must recompile, re something else
- This is a misconception: professional engineers commonly use printf debugging. But printf debugging should be just one tool in your toolbox of debugging strategies!

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Definition: *logging* is the process of recording information about the program's internal state as it runs via a printf-like interface

- logging is a key technology for monitoring modern systems
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- logs also play a major role in debugging large-scale failures of important distributed systems
 - we'll discuss this more when we talk about post-mortems in our DevOps lectures, near the end of the semester

Typical example of a (Java) logging statement:

log.debug("myVariable=%s", myVariable);

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the log itself is usually a static field; the logging framework instantiates it, etc.

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f
d
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d
d
d
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"debug" means if debug-level logging isn't enabled in the framework, this becomes a no-op levels:

error \subseteq warning \subseteq info \subseteq debug

developer chooses one level, all lower level messages are also logged

Typical example of a (Java) logging statement:

log.debug("myVariable=%s", myVariable);

printf-like syntax isn't just for show: goal here is lazy evaluation, so that if debug logging isn't enabled, this string is never constructed

Typical example of a (Java) logging statement:

log.debug("myVariable=%s", myVariable);

arguments to printf passed by reference, so if debug-level logging is off, this argument's toString() method is never called

Logging: advice

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• **Do** log lots of information at debug or info level, so that if something is wrong with your service you can quickly get lots of information that you can use to debug it.

Logging: advice

- **Do** log lots of information at debug or info level, so that if something is wrong with your service you can quickly get lots of information that you can use to debug it.
- **Don't** log sensitive data (e.g., credit card numbers in plaintext!)
 - this is a surprisingly common and important problem developers have a tendency to log anything that might be useful when debugging a failure later!

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- Delta debugging is based on divide-and-conquer and relies heavily on critical assumptions (monotonicity, unambiguity, and consistency).
- It can be used to find which code changes cause a bug, to minimize failure-inducing inputs, and even to find harmful thread schedules.

Delta debugging: motivation

- Three Problems: One Common Approach
 - Simplifying Failure-Inducing Input
 - Isolating Failure-Inducing Thread Schedules
 - Identifying Failure-Inducing Code Changes

Delta debugging: motivation: inputs

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- This HTML input makes a version of Mozilla crash. Which portion is

relevant?

<SELECT NAME="op_svs" MULTIPLE SIZE=7> <OPTION VALUE="All">All<OPTION VALUE="Windows 3.1">Windows 3.1<OPTION VALUE="Windows 95">Windows 95 98">Windows 98<OPTION VALUE="Windows ME">Windows ME<OPTION VALUE="Windows 2000">Windows 2000<OPTION VALUE="Windows NT">Windows NT<OPTION VALUE="Mac System 7">Mac System 7<OPTION VALUE="Mac System 7.5">Mac System 7.5 System 7.6.1">Mac System 7.6.1<OPTION VALUE="Mac System 8.0">Mac System 8.0<OPTION VALUE="Mac System 8.5">Mac System 8.5">Mac System 8.0<OPTION VALUE="Mac System 8.0">Mac System 8.0<OPTION VALUE="Mac System 8.0"<OPTION VALUE="Mac S 8.5<OPTION VALUE="Mac System 8.6">Mac System 8.6<OPTION VALUE="Mac System 9.x">Mac System 9.x<OPTION VALUE="MacOS X">MacOS X<OPTION VALUE="Linux">Linux<OPTION VALUE="BSDI">BSDI<OPTION VALUE="FreeBSD">FreeBSD<OPTION VALUE="NetBSD">NetBSD<OPTION VALUE="Statematical contents of the statematical contents of the stat VALUE="OpenBSD">OpenBSD<OPTION VALUE="AIX">AIX<OPTION VALUE="BEOS">BEOS<OPTION VALUE="HP-UX">HP-UX<OPTION VALUE="IRIX">IRIX<OPTION VALUE="Neutrino">Neutrino<OPTION VALUE="OpenVMS">OpenVMS<OPTION VALUE="OS/2">OS/2<OPTION VALUE="OSF/1">OSSF/1">OSSC/1">OSSC/1"OSSC/1">OSSC/1"OSSC/1">OSSC/1"OSSC/1"OSSC/1">OSSC/1"OSS <SELECT NAME="priority" MULTIPLE SIZE=7> <OPTION VALUE="--">--<OPTION VALUE="P1">P1<OPTION VALUE="P2">P2<OPTION VALUE="P3">P3<OPTION VALUE="P4">P4<OPTION</pre> VALUE="P5">P5</SELECT> <SELECT NAME="bug_severity" MULTIPLE SIZE=7> <OPTION VALUE="blocker">blocker<OPTION VALUE="critical">critical<OPTION VALUE="major">major<OPTION</pre> VALUE="normal">normal<OPTION VALUE="minor">minor<OPTION VALUE="trivial">trivial<OPTION VALUE="enhancement">enhancement</SELECT>
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Implication: delta debugging will be useful for test input minimization

TION VALUE="AIX">AIX<OPTION VALUE="BeOS">BeOS<OPTION VALUE="HP-UX">HP-UX<OPTION LUE="Neutrino">Neutrino<OPTION VALUE="OpenVMS">OpenVMS<OPTION VALUE="OS/2">OS/2<OPTION VALUE="Solaris">Solaris<OPTION VALUE="SunOS">SunOS<OPTION VALUE="other">other</SELECT>

TIPLE SIZE=7> N VALUE="P1">P1<OPTION VALUE="P2">P2<OPTION VALUE="P3">P3<OPTION VALUE="P4">P4<OPTION

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Delta debugging: motivation: thread schedules



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Delta debugging: motivation: thread schedules

- Multithreaded programs can be **nondeterministic**
 - Can we find simple, bug-inducing thread schedules?



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- A new version of GDB has a UI bug
 - The old version does not have that bug (it is a **regression**)
- 178,000 lines of code have been modified between the two versions
 - Where is the bug?
 - ... and which commit is responsible for introducing it?
 - These days: **continuous integration testing** helps
 - ... but does not totally solve this. Why?

Definition: With respect to debugging, a *difference* is a change in the program configuration or state that may lead to alternate observations

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- Difference in thread schedule: difference in the time before a given thread preemption is performed
- Difference in code: different statements or expressions in two versions of a program
- Difference in program state: different values of internal variables

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 - "Find the smallest subset of a given set that is still interesting"
- Abstract solution: divide-and-conquer
 - key idea: split up the set into two subsets, check which of the two is still "interesting"
 - can be applied to working and failing inputs, code versions, thread schedules, program states, etc.

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- We will iteratively:
 - hypothesize that a small subset is interesting
 - e.g., the subset of changes {1, 3, 8} causes the bug
 - run tests to falsify our hypothesis

• Given:

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$$C = \{c_1, \dots, c_n\}$$
 (of changes)

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- C =
- Interesting(X) =


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- We could just **try all subsets** of C to find the smallest one that is Interesting
 - **Problem:** if |C| = N, this takes 2^N time
 - Recall: real-world software is **unimaginably huge**
- We want a **polynomial-time** solution
 - Ideally one that is more like log(N)
 - Or we'll loop for what feels like forever

Delta debugging: algorithm candidate

Precondition: Interesting($\{c_1 ... c_n\}$) = True $DD(\{c, ..., c_n\}) =$ if n = 1 then return $\{c_1\}$ let $P_1 = \{c_1, \dots, c_{n/2}\}$ let $P_2 = \{c_{n/2+1}, ..., c_n\}$ if **Interesting**(P₁) is True: then return $DD(P_1)$ else return $DD(P_2)$

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This is just **binary search**! It won't work if you need a big subset to be Interesting

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- Interesting is **Unambiguous**
 - Interesting(X) & Interesting(Y) \rightarrow Interesting(X \cap Y)
- Interesting is **Consistent**
 - Interesting(X) = True xor Interesting(X) = False
 - (Some formulations also allow: Interesting(X) = Unknown)

- Basic Binary Search:
 - Divide C into P_1 and P_2
 - If Interesting(P_1) = True then recurse on P_1
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 - What happens in such a case?

• By Monotonicity

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Monotonicity = Interesting(X) \rightarrow Interesting(X U {c})

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- So the Interesting subset must use a combination of elements from P₁ and P₂
- In Delta Debugging, this is called *interference*

• Why is this true?

- Why is this true?
 - \circ Consider P₁
 - Find a minimal subset D_2 of P_2
 - Such that Interesting($P_1 \cup D_2$) = True

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 - Then by Unambiguous
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 - Find a minimal subset D_2 of P_2
 - Such that Interesting($P_1 \cup D_2$) = True
 - \circ Consider P₂
 - Find a minimal subset D_1 of P_1

- Key point: combination of elements from both
- Such that Interesting($P_2 \cup D_1$) = True ele
- Then by Unambiguous
 - Interesting(($P_1 \cup D_2$) ∩ ($P_2 \cup D_1$)) = Interesting($D_1 \cup D_2$) is also minimal

• Suppose {3,6} Is Smallest Interesting Subset of {1, ..., 8}

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- Let's use DD to find it

12345678 = Interesting

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12345678 = Interesting 1234

5678



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12345678 = Interesting 1234 = ??? 5678 = ???

Next step: test P_1 and P_2
- Suppose {3,6} Is Smallest Interesting Subset of {1, ..., 8}
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12345678 = Interesting 1234 = False5678 = False

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4.0	~ 4		• • • •
12	34	56/8	= Interesting
12	34		= False
		5678	= False
12		5678	= ???
			In
			m
1		1	_

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		1	
12	34	5678	= Interesting
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12	34	5678	= Interesting
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12		5678	= False
	34	5678	= ??? Ir
			rr
			-

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1234	5678	= Interesting	D ₁ = { 3 }
1234		= False	Nouce pood to find D
	5678	= False	Now we need to find D_2
12	5678	= False	
34	5678	= True	
3	5678	= True	
1234	56	= True	

- Suppose {3,6} Is Smallest Interesting Subset of {1, ..., 8}
- Let's use DD to find it

123456	678	= Interesting	D ₁ = { 3 }
1234		= False	Nouve pood to find D
5	678	= False	Now we need to find D_2
12 5	678	= False	
345	678	= True	
3 5	678	= True	
12345		= False	

- Suppose {3,6} Is Smallest Interesting Subset of {1, ..., 8}
- Let's use DD to find it

1234	5678	= Interesting	$D_1 = \{ 3 \}$
1234		= False	
	5678	= False	$D_2 = \{6\}$
12	5678	= False	
34	5678	= True	
3	5678	= True	
1234	6	= True	

- Suppose {3,6} Is Smallest Interesting Subset of {1, ..., 8}
- Let's use DD to find it

1234	5678	= Interesting	D ₁ ={3}
1234		= False	
	5678	= False	$D_2 = \{0\}$
12	5678	= False	So, final answer
34	5678	= True	$D_1 \cup D_2 = \{3, 6\}$
3	5678	= True	1 2 4
1234	6	= True	
	1		

Delta debugging: final algorithm

Precondition: Interesting($\{c_1 ... c_n\}$) = True $DD(P, \{c, ..., c_n\}) =$ if n = 1 then return $\{c_1\}$ let $P_1 = \{c_1, \dots, c_{n/2}\}$ let $P_2 = \{c_{n/2+1}, ..., c_n\}$ if Interesting $(P_1 \cup P)$ is True then return DD (P, P_1) else if Interesting ($P_2 \cup P$) is True then return DD(P, P_2) else return **DD**(P U P₂, P₁) U **DD**(P U P₁, P₂)

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 - DD is logarithmic: 2 * log |C|
 - Why?

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 - Is this realistic?

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 - DD is logarithmic: 2 * log |C|
 - Why?
- Otherwise, DD is linear
 - Assuming constant time per Interesting() check
 - Is this realistic?
- If Interesting can return "Unknown"
 - DD is quadratic: $|C|^2 + 3|C|$
 - If all tests are Unknown except last one (unlikely)

Delta debugging: questioning assumptions

- All three assumptions are questionable
- Interesting is Monotonic
 - Interesting(X) → Interesting(X \cup {c})
- Interesting is **Unambiguous**
 - Interesting(X) & Interesting(Y) \rightarrow Interesting(X \cap Y)
- Interesting is **Consistent**
 - Interesting(X) = True xor Interesting(X) = False
 - (Some formulations also allow: Interesting(X) = Unknown)

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Monotonicity is rare in the real world. But DD still finds *an* interesting subset if Interesting is not monotonic (might not be minimal)

Delta debugging: questioning assumptions

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Ambiguity will cause DD to fail. Hint: try tracing DD on Interesting ({2, 8}) = True, but Interesting({2, 8} intersect {3, 6}) = False

Delta debugging: questioning assumptions

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Interesting is Consistent

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The world is **often inconsistent**. Example: we are minimizing changes to a program to find patches that makes it crash. Some subsets may not build or run!

Delta debugging: in the real world

- git bisect implements a DD-like algorithm (look it up!)
- for thread schedules: DejaVu tool by IBM, CHESS by Microsoft, etc.
- Eclipse plugins for code changes ("DDinput", "DDchange")
- you can also do delta debugging **by hand** (I do this often for programs that cause compiler bugs!)

Debugging (Part 2/2)

Today's agenda:

- Debugging
 - printf debugging and logging
 - delta debugging
 - debuggers

Definition: a *debugger* is "a software tool that is used to detect the source of program or script errors, by performing step-by-step execution of application code and viewing the content of code variables." [definition from Microsoft Developer Network]

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- Inspect the values of registers, memory

Definition: a *debugger* is "a software tool that is used to detect the source of program or script errors, by performing step-by-step execution of application code and viewing the content of code variables." [definition from Microsoft Developer Network]

- Can operate on source code or assembly code
- **Inspect** the values of registers, memory
- Key Features (we'll explain all of them): attach to process, single-stepping, breakpoints, conditional breakpoints, watchpoints

Debuggers: how do they work

- A *signal* is an *asynchronous* notification sent to a process about an event:
 - User pressed Ctrl-C (or did kill %pid)
 - Or asked the Windows Task Manager to terminate it
 - Exceptions (divide by zero, null pointer)
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 - Signal handlers are vulnerable to race conditions. Why?

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- There is a special system call that allows one process to act as a debugger for a target
 - What are the **security** concerns?
- Once this is done, the debugger can basically "catch signals" delivered to the target
 - this isn't exactly what happens, but it's a good explanation ...

Debuggers: how do they work: breakpoints

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A *breakpoint* is a user-specified program statement on which the debugger should stop the program and begin an interactive debugging session
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 - Attach to target
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 - Add in exception causing instructions at desired breakpoints
 - **Inspect** globals, do other debugger things, etc.

```
#define BREAKPOINT *(0)=0
int global = 11;
int debugger signal handler() {
  printf("debugger prompt: \n");
  // debugger code goes here!
void main() {
  signal(SIGSEGV, debugger signal handler) ;
  qlobal = 33;
  BREAKPOINT;
  global = 55;
  printf("Outside, global = %d\n", global);
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All code added by the debugger in **purple**

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"BREAKPOINT" macro is guaranteed to cause SIGSEGV

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at the user-specified breakpoint, the debugger **forces** a SIGSEGV (which its handler will intercept)

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- To implement this, put a breakpoint at the first instruction (= at program start)
- The "single step" or "next" interactive command is equal to:
 - Put a breakpoint at the next instruction
 - Resume execution
 - \circ (No, really.)

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- A *watchpoint* is like a breakpoint, but it stops execution after **any instruction** changes the value at location L
- How could we implement this?

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Hardware Watchpoints:

• Special register holds L: if the value at address L ever changes, the CPU raises an exception

Related tool: profilers

Note: from here on, this is **NOT** fair game for the midterm/final we did not get to these slides in class!
NOT FAIR GAME FOR EXAMS

Related tool: profilers

Definition: A *profiler* is a performance analysis tool that measures the frequency and duration of function calls as a program runs.

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 - You register a function that program calls a method, lo (cf. signal handlers)

This explanation of **sampling** leaves out some things:

- need to map PC values back to procedure names
- need to sum up map results
- sampling is cheap but can miss periodic behavior
- Alternative: use signals directly (called *sampling*)
 - Ask the OS to send you a signal every X seconds (see alarm(2))
 In the signal handler you determine the value of the target program counter and append it to a growing list file

Debugging: takeaways

- Debugging is a lot easier when you treat it as a science, rather than an art
- printf debugging and logging are good for determining what causes failures after the fact
- delta debugging is a semi-automated approach to formalizing the abstract debugging problem
 - useful way of thinking about how to debug anything
 - **try**git bisect
- debuggers are fantastic when you want to understand a program's internal state