

# **Software Testing, Quality Assurance & Maintenance—Lecture 11**

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# Part I

## Reducing Inputs



# L<sup>A</sup>T<sub>E</sub>X errors

```
) (/usr/share/texlive/texmf-dist/tex/latex/epstopdf-pkg/epstopdf-base.sty
(/usr/share/texlive/texmf-dist/tex/latex/latexconfig/epstopdf-sys.cfg))
(/usr/share/texlive/texmf-dist/tex/latex/upquote/upquote.sty)
(/usr/share/texlive/texmf-dist/tex/latex/inconsolata/otlzi4.fd)
Overfull \hbox (3.22516pt too wide) in paragraph at lines 84--84
[[[]\OTl/cmr/m/n/9 Discussion: $\OTl/zi4/m/n/9 https : / / tex . meta . stackex
change . com / questions / 6255 / why-[]does-[]tex-[]require-[]such-[]elaborate
-[]mwes$|
```

! Package tikz Error: Giving up on this path. Did you forget a semicolon?.

See the tikz package documentation for explanation.

Type H <return> for immediate help.

...

l.97 \end{tikzpicture}

? ■

To ask for help on StackExchange, need a  
**Minimal Working Example.**



# Fixing a bug

- ① need to reproduce the bug, so need a working example;
- ② better yet: a *minimal* working example is easier to deal with.

# MWEs and Fuzzing

Fuzzers produce large inputs.

When input contains extraneous context,  
hard to understand what's happening.

## Reducing an input

We'll show a way to **reduce** a failing input:

“to identify those circumstances of a failure that are relevant for the failure to occur, and to *omit* (if possible) those parts that are not”

# A Mystery

```
class MysteryRunner(Runner):  
    def run(self, inp: str) -> Tuple[str, Outcome]:  
        x = inp.find(chr(0o17 + 0o31))  
        y = inp.find(chr(0o27 + 0o22))  
        if x >= 0 and y >= 0 and x < y:  
            return (inp, Runner.FAIL)  
        else:  
            return (inp, Runner.PASS)
```

Fails on some inputs. Can use  
RandomFuzzer to find a failure.



# Fuzzing a Failure

```
def fuzz_mystery_runner():  
    mystery = MysteryRunner()  
    random_fuzzer = RandomFuzzer()  
    while True:  
        inp = random_fuzzer.fuzz()  
        result, outcome = mystery.run(inp)  
        if outcome == mystery.FAIL:  
            break  
    print (result)
```

This works and eventually finds a failing input.  
(Manually, took me 6 tries.)

```
$ python3 mystery_runner.py  
(%*50 1)-&7,;49:4?%:43*(-.
```

But why?

## Part II

# Manual Input Reduction

# Divide and Conquer

Kernighan and Pike recommend:

Proceed by binary search. Throw away half the input and see if the output is still wrong; if not, go back to the previous state and discard the other half of the input.

# Does this work?

```
>>> from mystery_runner import *
>>> failing_input = "(%*50 1)-&7,;49:4?%:43*(-."
>>> mystery = MysteryRunner()
>>> mystery.run(failing_input)
('(%*50 1)-&7,;49:4?%:43*(-.', 'FAIL')
>>> half_length = len(failing_input) // 2 # integer division
>>> first_half = failing_input[:half_length]
>>> mystery.run(first_half)
('(%*50 1)-&7,', 'FAIL')
```

Progress! Halved the original input.

# Failing at Failing

```
>>> quarter_length = len(first_half) // 2
>>> first_quarter = first_half[quarter_length:]
>>> mystery.run(first_quarter)
(' 1)-&7,', 'PASS')
>>> second_quarter = first_half[:quarter_length]
>>> mystery.run(second_quarter)
(' (%*50 ', 'PASS')
```

Same trick doesn't work again.

The code says it's looking for two characters, but in our test case, the characters aren't in the same quarter.



Part III

# **Delta Debugging**

## A Change in Perspective

We tried direct binary search—didn't work.

**Delta debugging** is another way.

We instead *remove* smaller and smaller parts of the input,  
and see if it still fails.

Intuitively: more likely to keep the brokenness.

## Example: Removing Quarters 1

Let's start with the first quarter.

```
>>> quarter_length=len(failing_input)//4
>>> input_without_first_quarter=failing_input[
                                     quarter_length:]
>>> mystery.run(input_without_first_quarter)
(' 1)-&7,;49:4?%:43*(-.', 'PASS')
```

PASS, so must keep 1st quarter.



## Example: Removing Quarters 2

Now for the second quarter.

```
>>> input_without_second_quarter=failing_input[:  
                                             quarter_length]+  
                                             failing_input[  
                                             quarter_length*2:]  
>>> mystery.run(input_without_second_quarter)  
( '(%*50 ,;49:4?%:43*(-.', 'PASS')
```

We knew this already:  
must keep the first half.

We also know we can discard the second half, but let's see.

## Example: Removing Quarters 3, 4

```
>>> input_without_3rd_quarter=  
    failing_input[:quarter_length*2]+failing_input[  
                                                quarter_length*3:]  
>>> mystery.run(input_without_3rd_quarter)  
( '%*50  1)-&7?%:43*(-.', 'FAIL' )  
>>> input_without_4th_quarter=failing_input[:quarter_length*3]  
>>> mystery.run(input_without_4th_quarter)  
( '%*50  1)-&7,;49:4', 'FAIL' )
```

This doesn't tell us anything new,  
but we're sort of following the algorithm.

(The algorithm doesn't actually quite work  
like this.)

# Infrastructure for Reducing

An abstract base class that doesn't really do anything.

```
class Reducer:
    def __init__(self, runner: Runner, log_test: bool = False)
        -> None:

        # ...

    def test(self, inp: str) -> Outcome:
        # ...

    def reduce(self, inp: str) -> str:
        # here, non-real (abstract) impl
```

# Caching

We can cache results:

```
class CachingReducer(Reducer):  
    def test(self, inp):  
        if inp in self.cache:  
            return self.cache[inp]  
  
        outcome = super().test(inp)  
        self.cache[inp] = outcome  
        return outcome
```

# Actually reducing 1

Here is the outer loop for delta debugging.

```
class DeltaDebuggingReducer(CachingReducer):
    def reduce(self, inp: str) -> str:
        self.reset()
        assert self.test(inp) != Runner.PASS

    n = 2          # Initial granularity
    while len(inp) >= 2:
        start = 0.0
        subset_length = len(inp) / n
        some_complement_is_failing = False
        # inner loop goes here
```

We initialize `n` to specify that we divide the input into halves at first.

Also, we set the subset length to the current input length, divided by `n`.

## Actually reducing 2

Now the inner loop:

```
# remove chunks of size len(inp)/n
while start < len(inp):
    complement = inp[:int(start)] + \
        inp[int(start + subset_length):]
    if self.test(complement) == Runner.FAIL:
        # save the failing test, decrease n
        inp = complement
        n = max(n - 1, 2)
        some_complement_is_failing = True
        break
    start += subset_length
if not some_complement_is_failing:
    # all subtests pass, get half-as-small chunks.
    if n == len(inp):
        break
    n = min(n * 2, len(inp))
return inp
```

# Running the delta debugger

```
dd_reducer = DeltaDebuggingReducer(mystery, log_test=True)
dd_reducer.reduce(failing_input)
```

and there is an example run in the *Fuzzing Book*, which I'll show excerpts from:

```
Test #1 ' 7:,>((/$$-/->. ;. =; (.%! :50#7*8=$&&=$9!%6(4=&69\':\ '<3+0-3.24#7=!&60)2/+";+<7+1<2!4$>92+$1<(3%&5\''># ' 49 PASS
Test #2 '\ '<3+0-3.24#7=!&60)2/+";+<7+1<2!4$>92+$1<(3%&5\''># ' 49 PASS
Test #3 " 7:,>((/$$-/->. ;. =; (.%! :50#7*8=$&&=$9!%6(4=&69': " 48 PASS
Test #4 '50#7*8=$&&=$9!%6(4=&69\':\ '<3+0-3.24#7=!&60)2/+";+<7+1<2!4$>92+$1<(3%&5\''># " 49 PASS
Test #5 "50#7*8=$&&=$9!%6(4=&69':<7+1<2!4$>92+$1<(3%&5\''># " 49 PASS
Test #6 '50#7*8=$&&=$9!%6(4=&69\':\ '<3+0-3.24#7=!&60)2/+";+' 48 FAIL
...
Test #23 '(460)' 5 FAIL
Test #24 '460)' 4 PASS
Test #25 '(0)' 3 FAIL
Test #26 '0)' 2 PASS
Test #27 '(' 1 PASS
Test #28 '()' 2 FAIL
Test #29 ')' 1 PASS
'()'
```

## Solving the mystery

Answer: system fails on an input with a ( and then a ) .



## Delta debugger commentary

Wouldn't want to do this manually on this input:  
random input is harder to understand than a  
human-generated one.

Assuming that the system is deterministic, we can run  
the algorithm and get the answer.

Also assume: test cases can run quickly enough that we  
can afford dozens of iterations.

These are the same conditions as for fuzzing to work  
well.

## Commentary continued

Implementation checks that the initial test case does fail.

Delta debugging is best-case  $O(\log n)$  and worst-case  $O(n^2)$ .

# Minimality

We get a 1-minimal test case:  
removing any character is guaranteed to  
not fail.

In the example, we see that the  
single-paren cases pass.

This is a local minimum: might be some  
other smaller test case that one would  
reach with different choices.

## Advantages of minimality

- reduces cognitive load for the programmer:  
no irrelevant details, easier to understand what's happening.
- easier to communicate:  
“MysteryRunner fails on ” ( ) ”” vs  
“MysteryRunner fails on 4100-character  
input (attached)”
- helps identifying duplicates (to some extent— assuming failure has a single cause).