RTL-REPAIR: Fast Symbolic Repair of Hardware Design Code

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Paper PDF



Code on Github







RTL Design

```
class Counter extends Module {
  val io = IO(new CounterIO)

  val count = RegInit(0.U(4.W))
  val overflow = RegInit(false.B)
  when(io.enable) {
    count := count + 1.U
  }
  when(count === "b1111".U) {
    overflow := true.B
  }

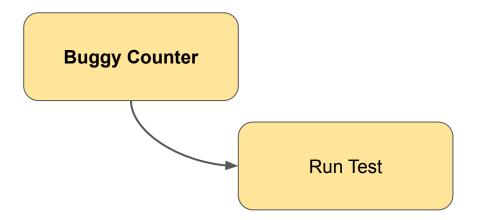
  io.count := count
  io.overflow := overflow
}
```

Buggy Counter

```
class Counter extends Module {
  val io = IO(new CounterIO)

  val count = RegInit(0.U(4.W))
  val overflow = RegInit(false.B)
  when(io.enable) {
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  }
  when(count === "b0111".U) {
    overflow := true.B
  }

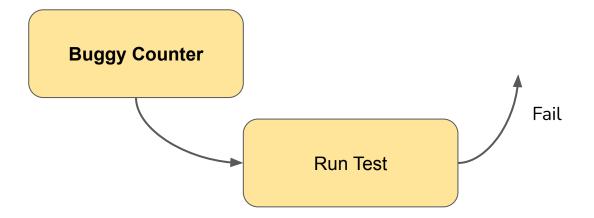
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```



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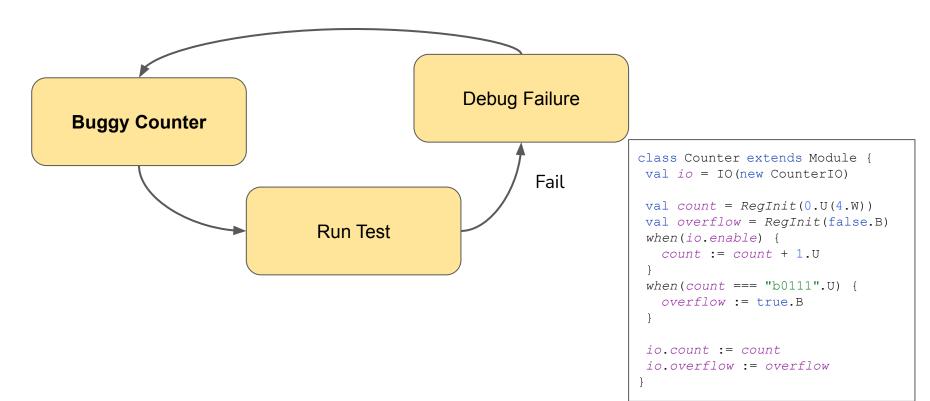
  io.count := count
  io.overflow := overflow
}
```

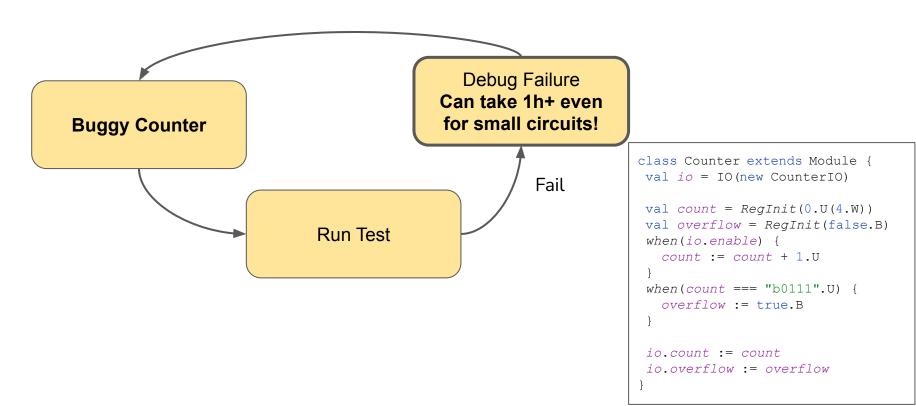


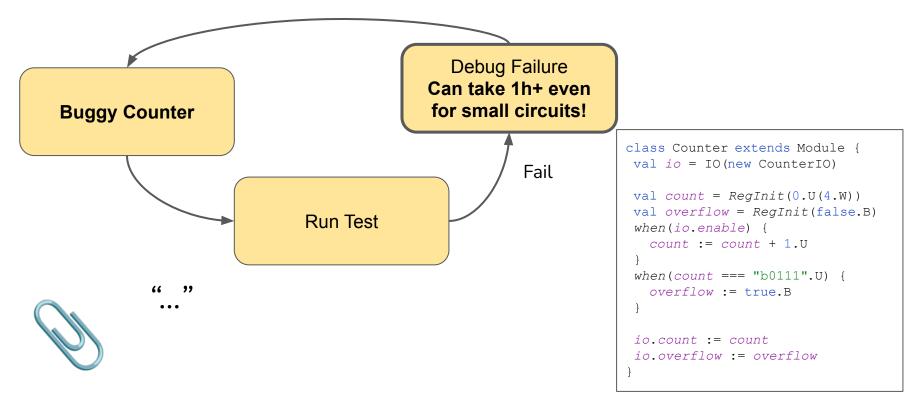
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class Counter extends Module {
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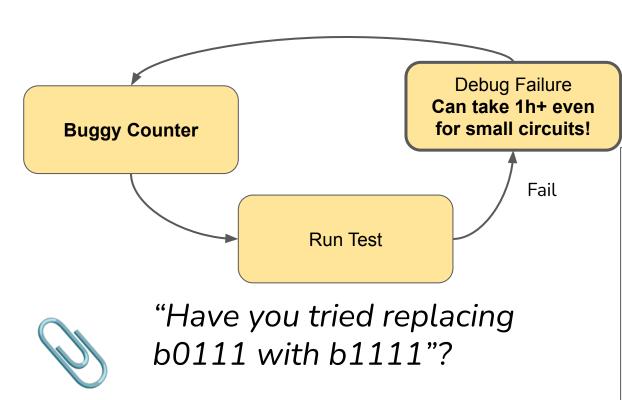
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Problem Statement

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- given a failing input / output trace

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- given a RTL design written in Verilog
- given a failing input / output trace
- can we find a (minimal) change to the Verilog code that will make the input / output trace pass?

Prior Work: CirFix^[1]

provides a benchmark consisting of
 32 defects across 11 different designs

[1]: Ahmad, Hammad, Yu Huang, and Westley Weimer.
"CirFix: Automatically Repairing Defects in Hardware Design Code."
27th ACM International Conference on Architectural Support for Programming Languages and Operating Systems, 2022.

[2]: Le Goues, Claire, ThanhVu Nguyen, Stephanie Forrest, and Westley Weimer. "GenProg: A Generic Method for Automatic Software Repair."

IEEE Transactions on Software Engineering 2011

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Prior Work: CirFix^[1]

- provides a benchmark consisting of
 32 defects across 11 different designs
- proposes a genetic algorithm based technique modelled after GenProg^[2] which uses repair templates and mutation to find a possible repair
- repairs can take from 8s 8h

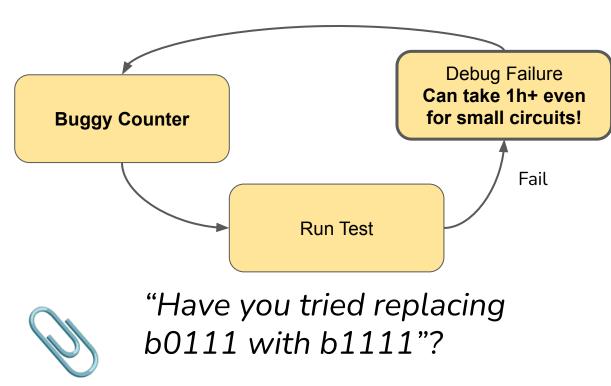
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```

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8s - 8h is too long to wait!

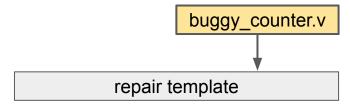


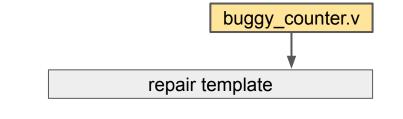
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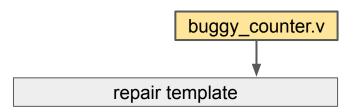
io.count := count
  io.overflow := overflow
}
```

buggy_counter.v



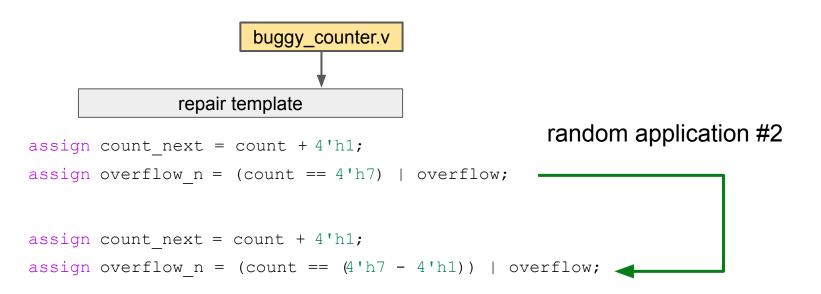


```
assign count_next = count + 4'h1;
assign overflow_n = (count == 4'h7) | overflow;
```



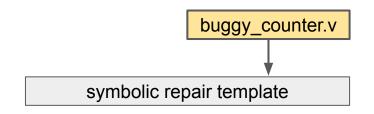
```
assign count_next = count + 4'h1;
assign overflow_n = (count == 4'h7) | overflow;
assign count_next = count + 4'h1 - 4'h1;
assign overflow n = (count == 4'h7) | overflow;
```

random application #1



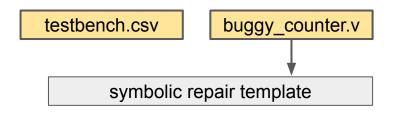
```
symbolic repair template

assign count_next = count + 4'h1;
assign overflow n = (count == 4'h7) | overflow;
```



Expresses all possible changes guarded by synthesis variables.

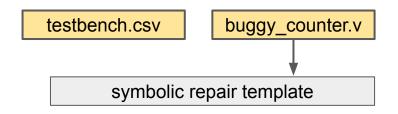
```
assign count_next = count + 4'h1; assign overflow_n = (count == 4'h7) | overflow; assign count_next = count + ((\phi_0)? \alpha_0 : 4'h1); assign overflow_n = (count == ((\phi_1)? \alpha_1 : 4'h7)) | overflow;
```



Standard Bounded Model Checking:

 \exists enable₀, enable₁. error (find inputs such that an assertion is violated)

```
assign count_next = count + 4'h1; assign overflow_n = (count == 4'h7) | overflow; assign count_next = count + ((\phi_0)? \alpha_0 : 4'h1); assign overflow n = (count == ((\phi_1)? \alpha_1 : 4'h7)) | overflow;
```



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assign count_next = count + 4'h1;
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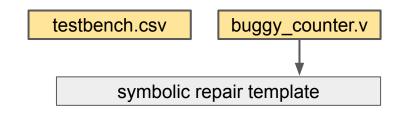
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```

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Repair Query

 $\exists \ \phi_i, \ \alpha_i$. enable $_0 = 1 \ \land \ \text{count}_0 = 0 \ \land \ \dots$ (find synthesis constants such that inputs and outputs conform to our testbench trace)



```
assign count_next = count + 4'h1;
assign overflow_n = (count == 4'h7) | overflow;
```

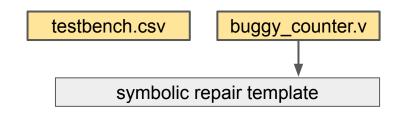
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```
minimal change: s.t. min(sum(\varphi_i))
```



```
assign count_next = count + 4'h1;
assign overflow_n = (count == 4'h7) | overflow;
```

assign count_next = count + $((\phi_0)? \alpha_0 : 4'h1);$

assign overflow_n = (count == ((ϕ_1)? α_1 : 4'h7)) | overflow;

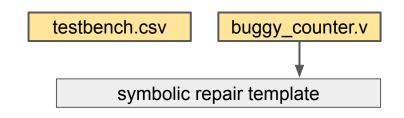
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```
minimal change: s.t. min(sum(\varphi_i)) assert( true ) \rightarrow SAT / UNSAT
```



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```

assign count_next = count + $((\phi_0)? \alpha_0 : 4'h1);$

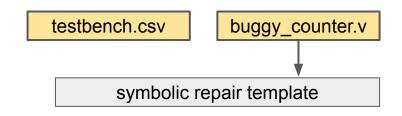
assign overflow_n = (count == ((ϕ_1)? α_1 : 4'h7)) | overflow;

Standard Bounded Model Checking:

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```
assign count_next = count + 4'h1;
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```

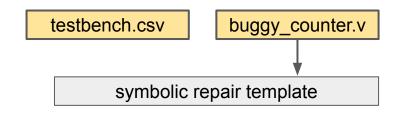
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assign count_next = count + ((\phi_0)? \alpha_0 : 4'h1); assign overflow n = (count == ((\phi_1)? \alpha_1 : 4'h7)) | overflow;
```

Standard Bounded Model Checking:

∃ enable₀, enable₁. error (find inputs such that an assertion is violated)

Repair Query

```
minimal change: s.t. min(sum(\phi_i)) assert(sum(\phi_i) == 1) \rightarrow SAT / UNSAT
```



```
assign count_next = count + 4'h1;
assign overflow_n = (count == 4'h7) | overflow;
```

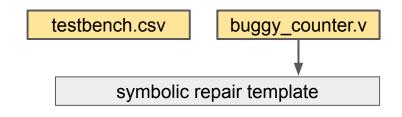
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assign count_next = count + ((\phi_0)? \alpha_0 : 4'h1); assign overflow n = (count == ((\phi_1)? \alpha_1 : 4'h7)) | overflow;
```

Standard Bounded Model Checking:

 \exists enable₀, enable₁. error (find inputs such that an assertion is violated)

Repair Query

```
minimal change: s.t. min(sum(\varphi_i)) assert(sum(\varphi_i) == 2) \rightarrow SAT / UNSAT
```



```
assign count next = count + 4'h1;
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```

```
assign count next = count + ((\phi_0)? \alpha_0 : 4'h1);
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```

Standard Bounded Model Checking:

∃ enable₀, enable₁ . error (find inputs such that an assertion is violated)

Repair Query

 $\exists \phi_i, \alpha_i$ enable $= 1 \land count = 0 \land ...$ (find synthesis constants such that inputs and outputs conform to our testbench trace)

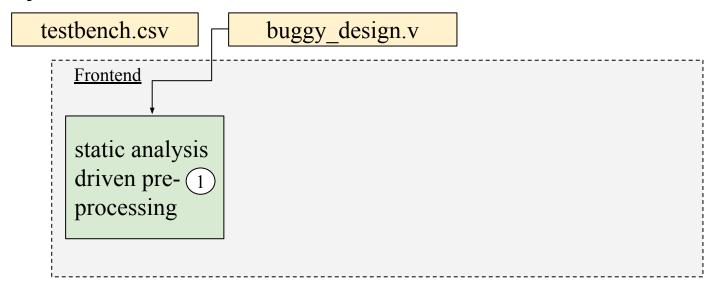
minimal change: s.t. min(sum(φ_i))

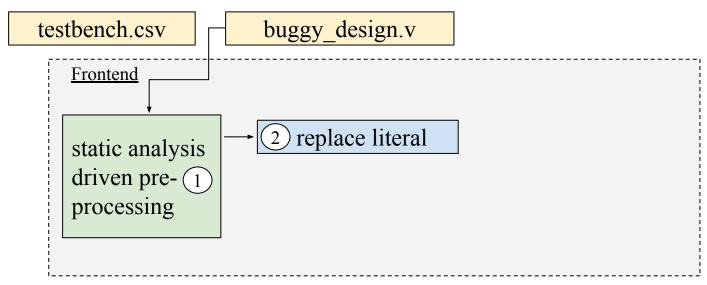
$$\mathsf{assert}(\mathsf{sum}(\phi_i) == 2) \to \mathsf{SAT}/\mathsf{UNSAT}$$

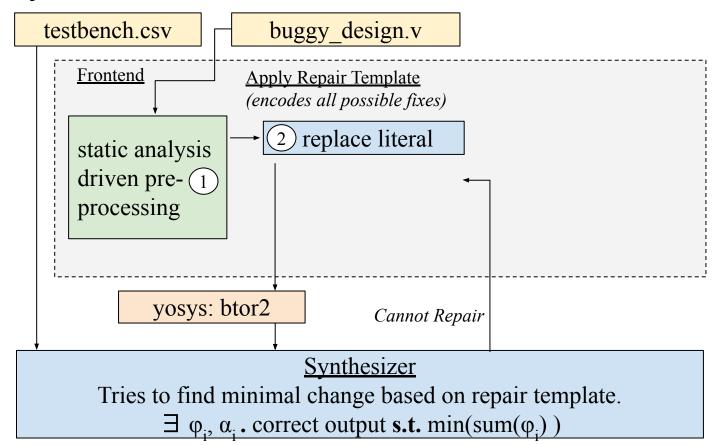


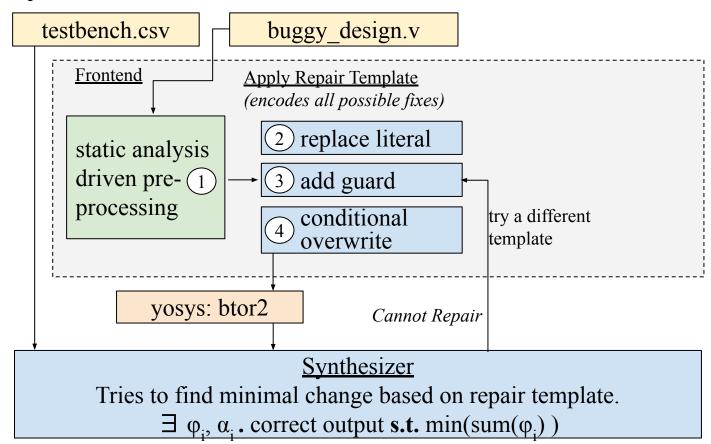
testbench.csv buggy_design.v

Frontend

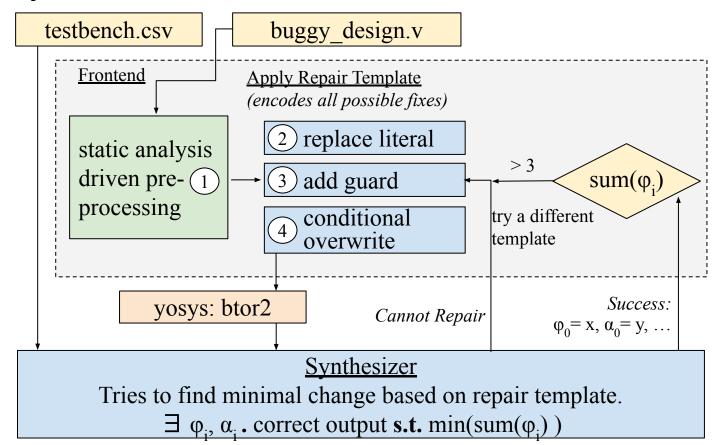




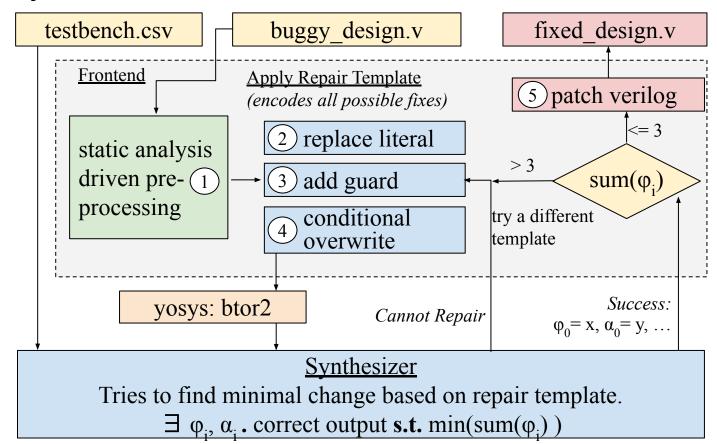




System Overview



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Decoder Benchmark Repairs

decoder_w1: Two separate numeric errors

```
- ({en,A,B,C} == 4'b1010)? 8'b1111 1011 :

+ ({en,A,B,C} == 4'b1000)? 8'b1111 1011 :

({en,A,B,C} == 4'b1011)? 8'b1111 0111 :

({en,A,B,C} == 4'b1100)? 8'b1110 1111 :

({en,A,B,C} == 4'b1101)? 8'b1101 1111 :

({en,A,B,C} == 4'b1110)? 8'b1011 1111 :

({en,A,B,C} == 4'b1111)? 8'b0111 1111 :

- diff original vs. bug 8'b0111 1111;
```

Our Tool: repair after 0.4s

Cirfix: repair after 7h (63,000x slower!)

Decoder Benchmark Repairs

decoder w1: Two separate numeric errors

```
- ({en,A,B,C} == 4'b1010)? 8'b1111 1011 :- ({en,A,B,C} == 4'b1000)? 8'b1111 1011 :

+ ({en,A,B,C} == 4'b1000)? 8'b1111 1011 :+ ({en,A,B,C} == 4'b1010)? 8'b1111 1011 :

- ({en,A,B,C} == 4'b1011)? 8'b1111 0111 :- ({en,A,B,C} == 4'b1011)? 8'b1111 0111 :- ({en,A,B,C} == 4'b1001)? 8'b1110 1111 :- ({en,A,B,C} == 4'b1100)? 8'b1110 1111 :- ({en,A,B,C} == 4'b1101)? 8'b1101 1111 :- ({en,A,B,C} == 4'b1101)? 8'b1101 1111 :- ({en,A,B,C} == 4'b1110)? 8'b1011 1111 :- ({en,A,B,C} == 4'b1110)? 8'b1011 1111 :- ({en,A,B,C} == 4'b1111)? 8'b0111 1111 :- ({en,A,B,C} == 4'b1111]? 8'b011
```

Our Tool: Correct repair after 0.4s

Cirfix: repair after 7h (63,000x slower!)

Decoder Benchmark Repairs

decoder w1: Two separate numeric errors

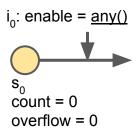
```
+ (\{en,A,B,C\} == 4'b1000)? 8'b1111 1011 :+ (\{en,A,B,C\} == 4'b1010)? 8'b1111 1011 :
 (\{en,A,B,C\} == 4'b1011)? 8'b1111 0111 : (\{en,A,B,C\} == 4'b1011)? 8'b1111 0111 :
  (\{en,A,B,C\} == 4'b1100)? 8'b1110 1111 : (\{en,A,B,C\} == 4'b1100)? 8'b1110 1111 :
  (\{en,A,B,C\} == 4'b1101)? 8'b1101 1111 : (\{en,A,B,C\} == 4'b1101)? 8'b1101 1111 :
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  (\{en,A,B,C\} == 4'b1111)? 8'b0111 1111 : (\{en,A,B,C\} == 4'b1111)? 8'b0111 1111
                           8'b1111 1111; -
                                                                     8'b0111 1111;
   diff original vs. bug
                                             diff bug vs. our repair
                           8'b0111 1111;
                                                                     8'b1111 1111:
 (\{en,A,B,C\} == 4'b1000)? 8'b1111 1011 :
 (\{en,A,A,C\} == 4'b1000)? 8'b1111 1011 :
 (\{en,A,B,C\} == 4'b1011)? 8'b1111 0111 :
+ (\{en,A,B,C-1\}==4'b1011)? 8'b1111 0111 :
  (\{en,A,B,C\} == 4'b1100)? 8'b1110 1111 :
                                                                 Out tool performs a
  (\{en,A,B,C\} == 4'b1101)? 8'b1101 1111 :
  (\{en,A,B,C\} == 4'b1110)? 8'b1011 1111 :
  (\{en,A,B,C\} == 4'b1111)? 8'b0111 1111 :
                                                                 minimal repair.
           diff bug vs. CirFix repair
```

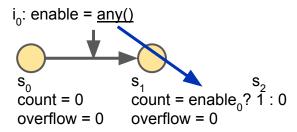
 $-(\{en,A,B,C\} == 4'b1010)? 8'b1111 1011 :-(\{en,A,B,C\} == 4'b1000)? 8'b1111 1011 :$

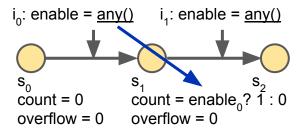
CirFix (7h): repair passes testbench, but changes code that is never tested.

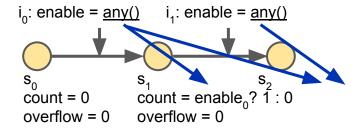
Our Tool: Correct repair after 0.4s

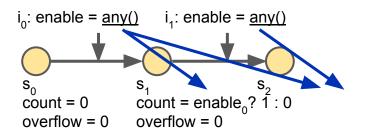
Cirfix: The Correct repair after 7h (63,000x slower!)



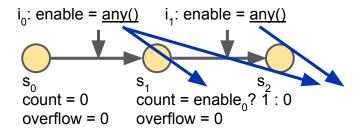




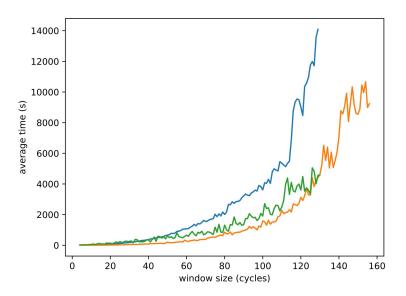


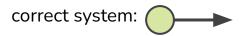


The more cycles we unroll for, the longer the solver takes!



The more cycles we unroll for, the longer the solver takes!

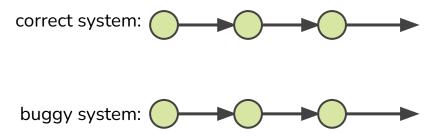


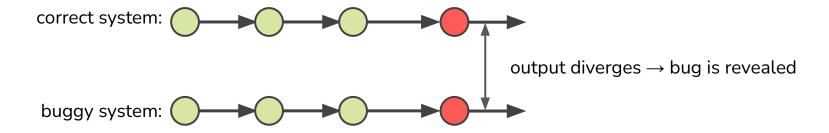


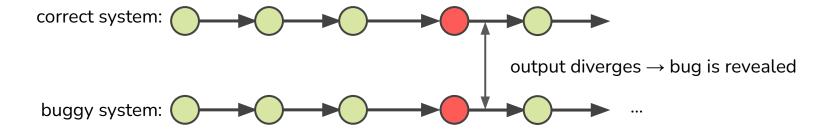
buggy system:

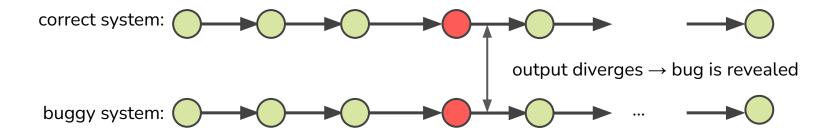


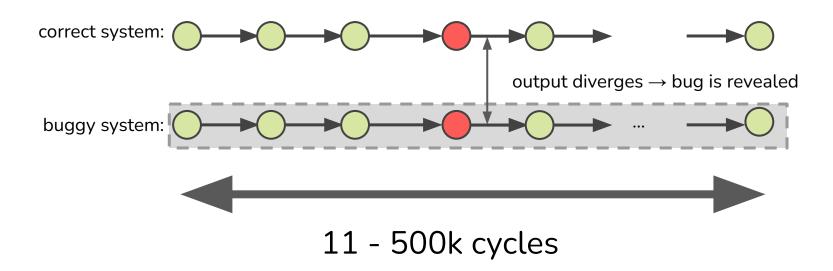




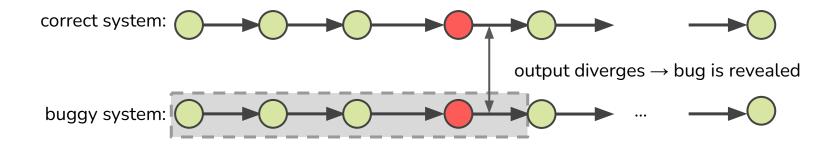




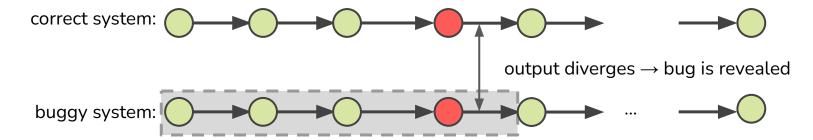




Only Symbolically Execute to First Failure

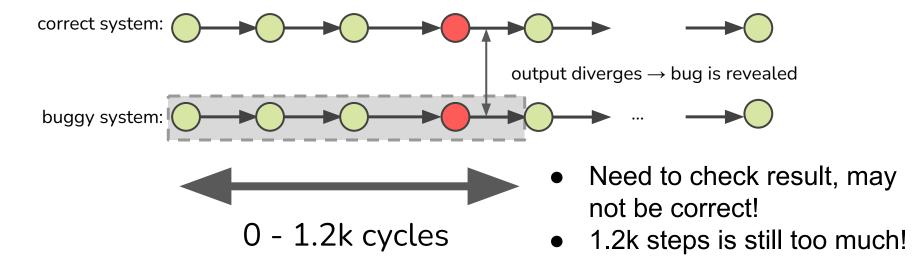


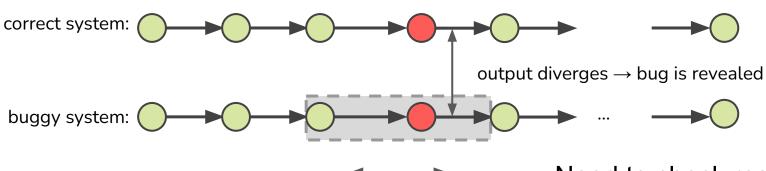
Only Symbolically Execute to First Failure



 Need to check result, may not be correct!

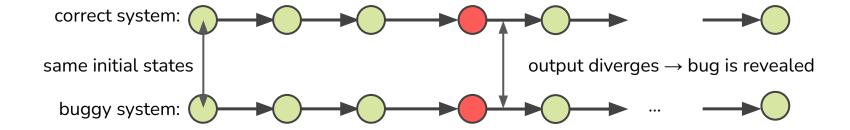
Only Symbolically Execute to First Failure

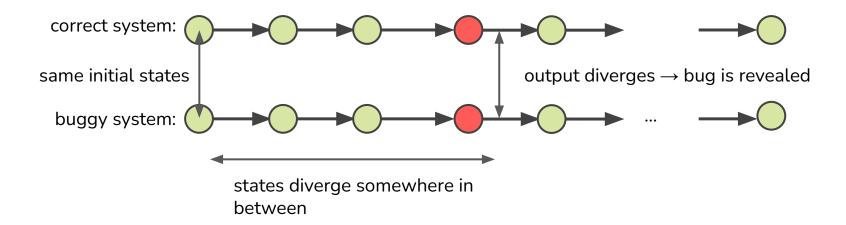


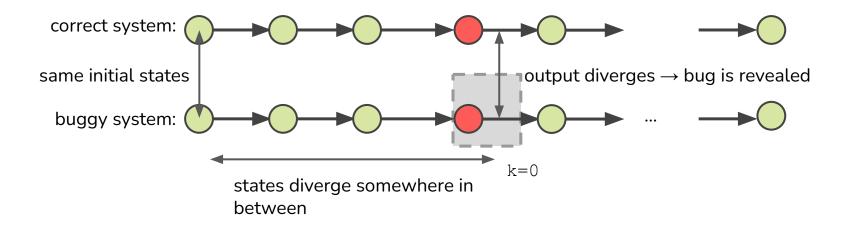


Can we make the window even smaller?

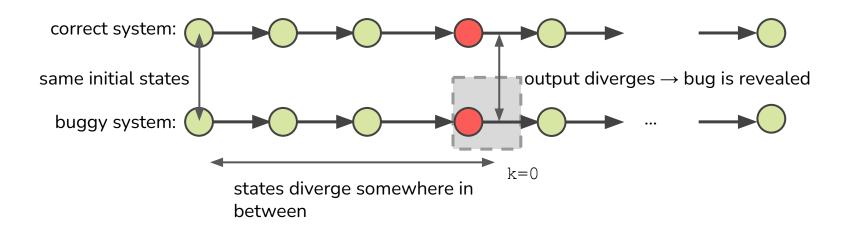
- Need to check result, may not be correct!
- 1.2k steps is still too much!





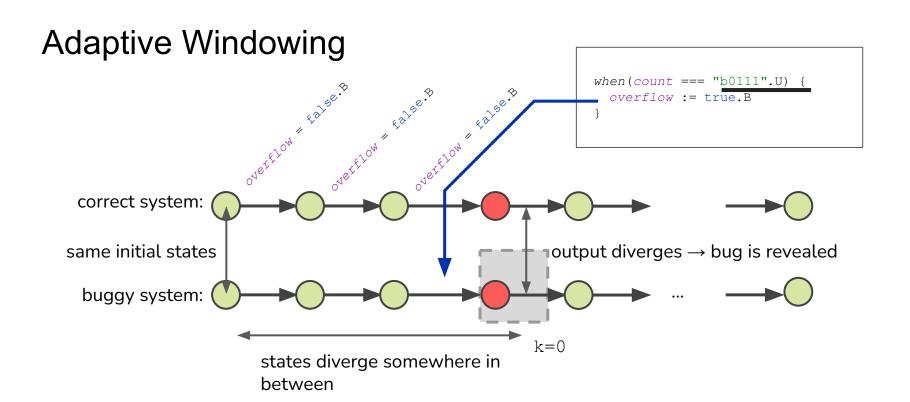


```
when(count === "b0111".U) {
  overflow := true.B
}
```

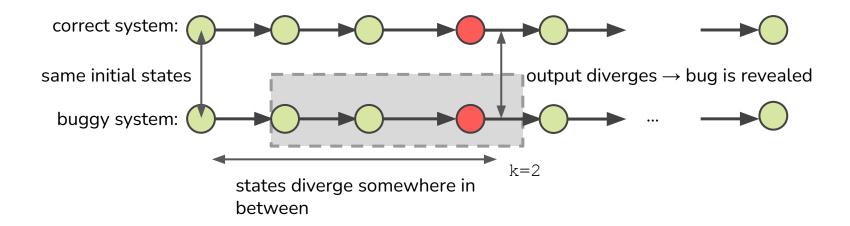


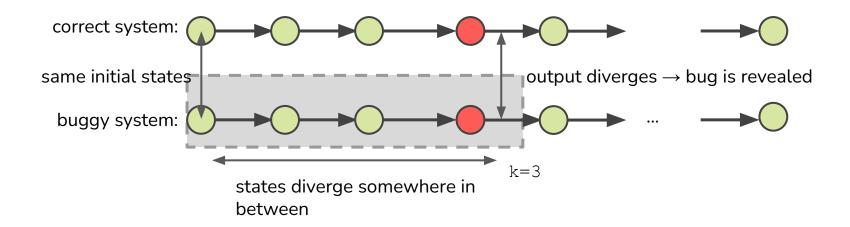
Adaptive Windowing when (count === "b0111".U) overflow := true.B correct system: same initial states output diverges \rightarrow bug is revealed buggy system: k=0states diverge somewhere in

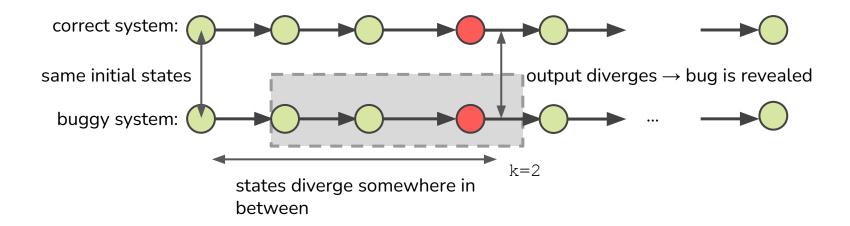
between



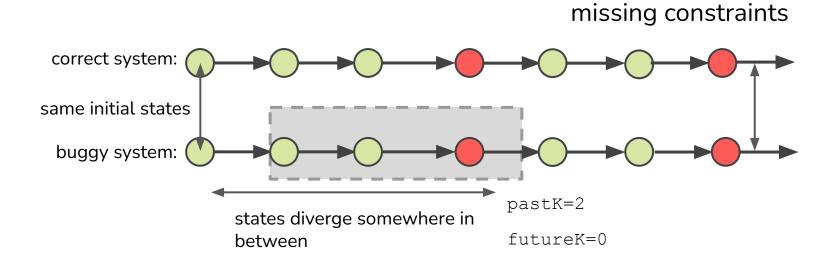
Adaptive Windowing when (count === "b0111".U) overflow := true.B correct system: same initial states output diverges \rightarrow bug is revealed buggy system: k=1states diverge somewhere in between

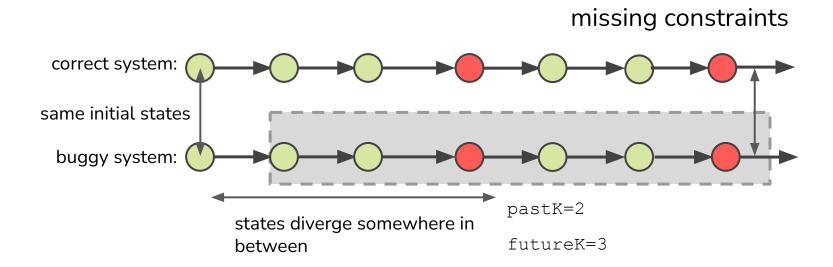






same initial states buggy system: states diverge somewhere in between





```
localparam READ ACT = 5'b10000;
- localparam READ NOP1 = 5'b10001;
+ localparam READ_NOP1 = 5'b10000;
diff original vs. bug
```



```
localparam READ ACT = 5'b10000;
- localparam READ NOP1 = 5'b10001;
+ localparam READ_NOP1 = 5'b10000;
diff original vs. bug
```

Window Refinement around Step 130



```
localparam READ ACT = 5'b10000;
- localparam READ NOP1 = 5'b10001;
+ localparam READ_NOP1 = 5'b10000;
diff original vs. bug
```

Window Refinement around Step 130

```
pastK=0, futureK = 0, k=0
pastK=0, futureK = 2, k=2
pastK=2, futureK = 2, k=4
```

ASPLOS'22: X Timeout after 12h

```
localparam READ ACT = 5'b10000;
- localparam READ NOP1 = 5'b10001;
+ localparam READ_NOP1 = 5'b10000;

diff original vs. bug
```

Window Refinement around Step 130

```
pastK=0, futureK = 0, k=0
pastK=0, futureK = 2, k=2
pastK=2, futureK = 2, k=4
```

```
ASPLOS'22: X Timeout after 12h
```

```
READ ACT: begin
- next = READ NOP1;
+ next = 5'b11101;
    // ..
end
- READ NOP1: begin
+ 5'b11101: begin
    // ..
end

diff bug vs. our repair
```

```
localparam READ ACT = 5'b10000;
- localparam READ NOP1 = 5'b10001;
+ localparam READ_NOP1 = 5'b10000;

diff original vs. bug
```

Window Refinement around Step 130

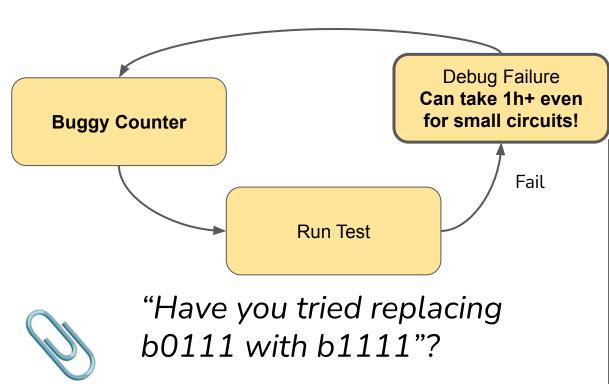
```
pastK=0, futureK = 0, k=0
pastK=0, futureK = 2, k=2
pastK=2, futureK = 2, k=4
```

```
ASPLOS'22: X Timeout after 12h Our Tool: ✓ Correct repair in 3s
```

```
READ ACT: begin
- next = READ NOP1;
+ next = 5'b11101;
    // ..
end
- READ NOP1: begin
+ 5'b11101: begin
    // ..
end

diff bug vs. our repair
```

Automated RTL Repair

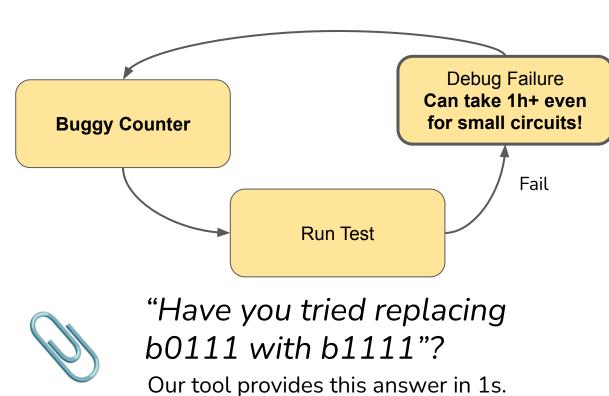


```
class Counter extends Module {
  val io = IO(new CounterIO)

val count = RegInit(0.U(4.W))
  val overflow = RegInit(false.B)
  when(io.enable) {
    count := count + 1.U
  }
  when(count === "b0111".U) {
    overflow := true.B
  }

io.count := count
  io.overflow := overflow
}
```

Automated RTL Repair



```
class Counter extends Module {
  val io = IO(new CounterIO)

  val count = RegInit(0.U(4.W))
  val overflow = RegInit(false.B)
  when(io.enable) {
    count := count + 1.U
  }
  when(count === "b0111".U) {
    overflow := true.B
  }

  io.count := count
  io.overflow := overflow
}
```

Benchmark Overview

	RTL-Repair			CirFix [6]		
	#	median	max	#	median	max
Correct Repairs	16	0.70s	13.17s	10	2.53min	14.19h
≭ Wrong Repairs	2	0.51s	0.68s	11	2.03h	9.50h
○ Cannot Repair	14	5.64s	59.81s	11	16.00h	16.00h

We solve many of the benchmarks, at **interactive speeds**.

RTL-REPAIR: Fast Symbolic Repair of Hardware Design Code

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Featuring numerous repair examples!



Paper PDF



Code on Github







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