

# RemGen: Remanufacturing A Random Program Generator for Compiler Testing

*The 33rd IEEE International Symposium on Software Reliability Engineering (ISSRE 2022)*

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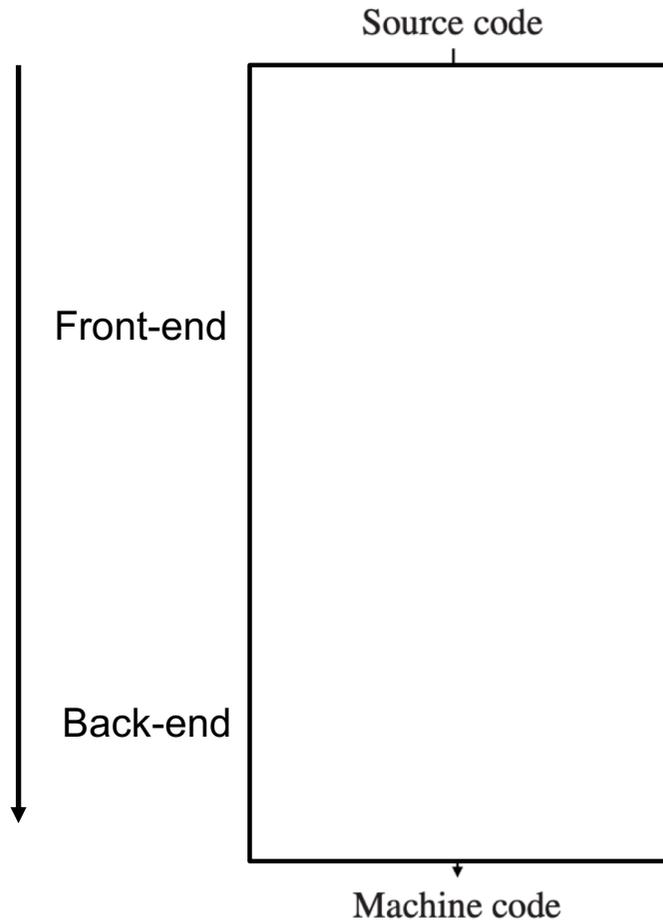
# Outlines

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- ❑ Background
- ❑ Motivation
- ❑ Approach
  - RemGen
- ❑ Evaluation
- ❑ Conclusion

# Part 1: Background

# What is a compiler ?



## □ Two mainstream compilers

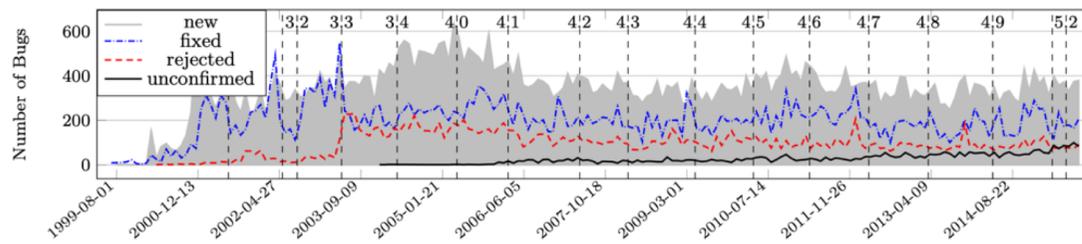
- GCC (created by 1987)
  - ~ 5,000,000 lines of code
- LLVM (created by 2003)
  - ~ 1,600,000 lines of code



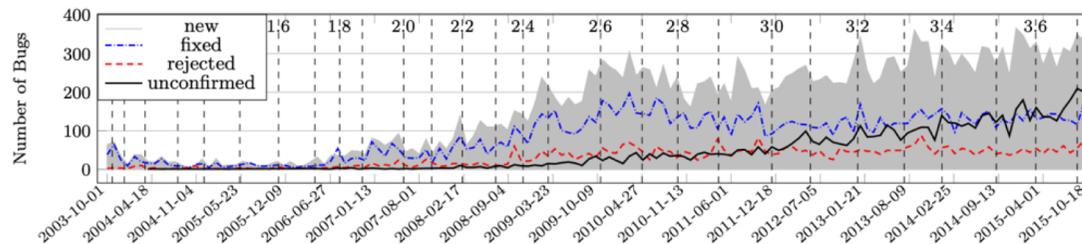
## □ Implementation of compilers is complex

- they can be unreliable and buggy

# Compilers are important but unreliable



(a) GCC.



(b) LLVM

- Cited from [1]

**Improving the reliability of compilers is still a hot topic.**



XcodeGhost

XcodeGhost Bug: affect 3418 apps



CVE-2009-1897: Kernel crash to Dos attack

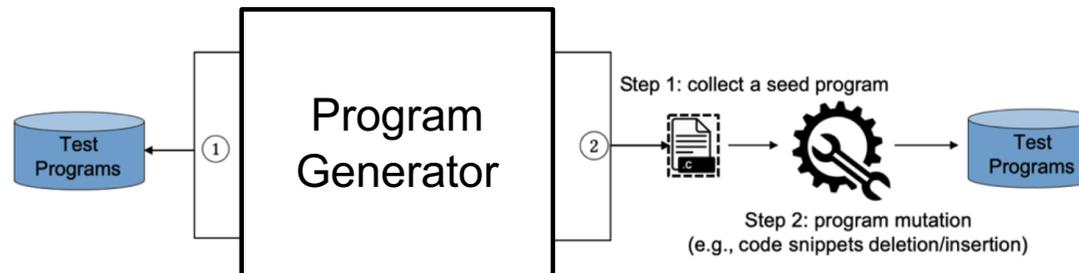
# Constructing test programs for compiler testing



Program Generator  
(e.g., Csmith)

- **Two primary approaches**
  - **1. Generation-based**
    - CCG [3], Csmith [4], and Yarpgen [5]
  - **2. Mutation-based**
    - Orion [6], Athena [7], and Hermes [8]
- **Observation: existing construction approaches all start from a random program generator!**

# Part 2: Motivation



- **Complaints from compiler testing studies or compiler expertise**
  - Csmith has found bugs before, but current production compilers are already **resilient** to it (from [5,6])
  - *Compilers have now caught up with CCG (since it's been pretty **hard to spot crashes** last time I tried. (from CCG [1])*
  - *I hadn't run Csmith for a while and it turns out LLVM is now amazingly **resistant** to it, ran a million tests overnight without finding a crash or miscompilation. (from John Regehr [9])*
  - **Same with YARPGen.** (from Dmitry Babokin [10])

**Research question:** Is it possible to make those generators effective again?

# Remanufacturing

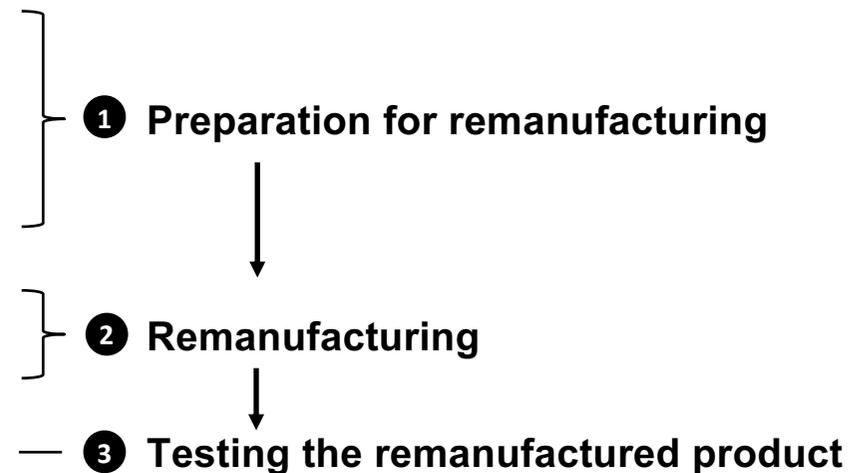


- **Definition [2]**

- A process of bringing a **used product** to a **“like new” product**, which is being regarded as a sustainable mode of manufacturing

- **Applications**

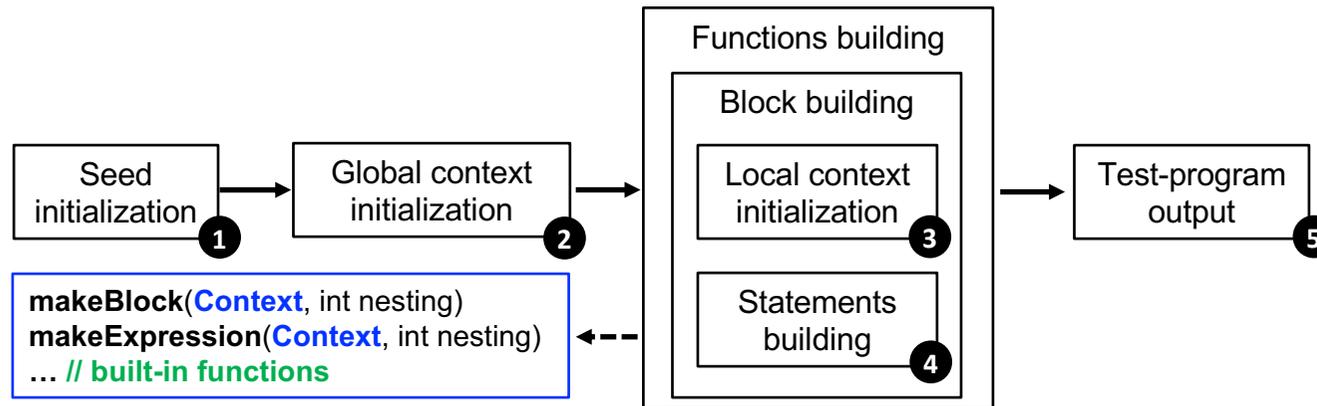
- Automobile, heavy-duty equipment, aerospace, machinery, medical devices, photocopiers, IT products [2]



**Any chance to conduct remanufacturing on a program generator?**

# Leverage capabilities in program generators

- **General workflow of a generator**



- **Key capabilities**

- (1) they support various built-in functions to generate different new valuable code snippets
- (2) the context (i.e., one of the parameters used in the built-in functions) used in generating code snippets can be reserved and then reused in a lightweight manner

# Motivation

- An example

```
1 int a, b, c, d;
2 void e() {
3     ... // code snippets generated by CCG
4     a = 7;
5     for (; a <= 78; a++) {
6         d = 3;
7         for (; d <= 73; d++) {
8             // code produced by makeBlock() highlighted in gray
9             int f = 0;
10            b += c;
11            if (b) {
12                int g = 0;
13                for (f = 5; f; g);
14            }
15        }
16    }
17 } /* Grammar Coverage : G={0,0,0,2,0,0,0,0,0,0,0} */
```

- Limitation of existing approaches

- Generation-based approaches: randomness
- Mutation-based approaches: (1) limited synthesize template to produce code snippets and (2) costly

- Our approach

- Leverage the unexplored capabilities in generators to synthesize new code snippets

# Challenges

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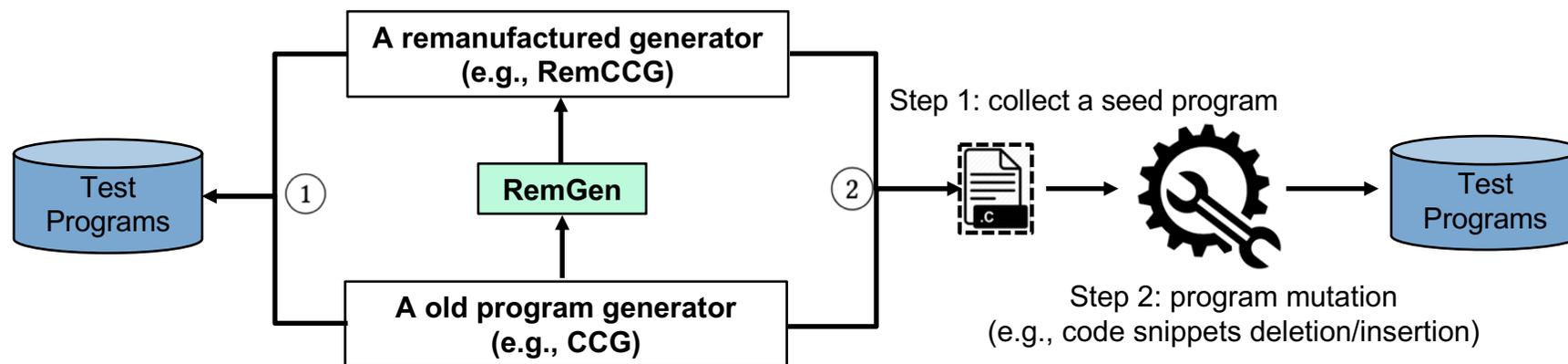


- **1. The synthesis of diverse code snippets with low effort**
  - We do not know what the trigger for a compiler bug looks like [4].
  - Efforts in synthesizing code snippets should be lightweight
- **2. The selection of the bug-revealing code snippet for constructing test programs**
  - Not all **code snippets** are equal and only few can trigger bugs [12]
  - limited computing or human resource

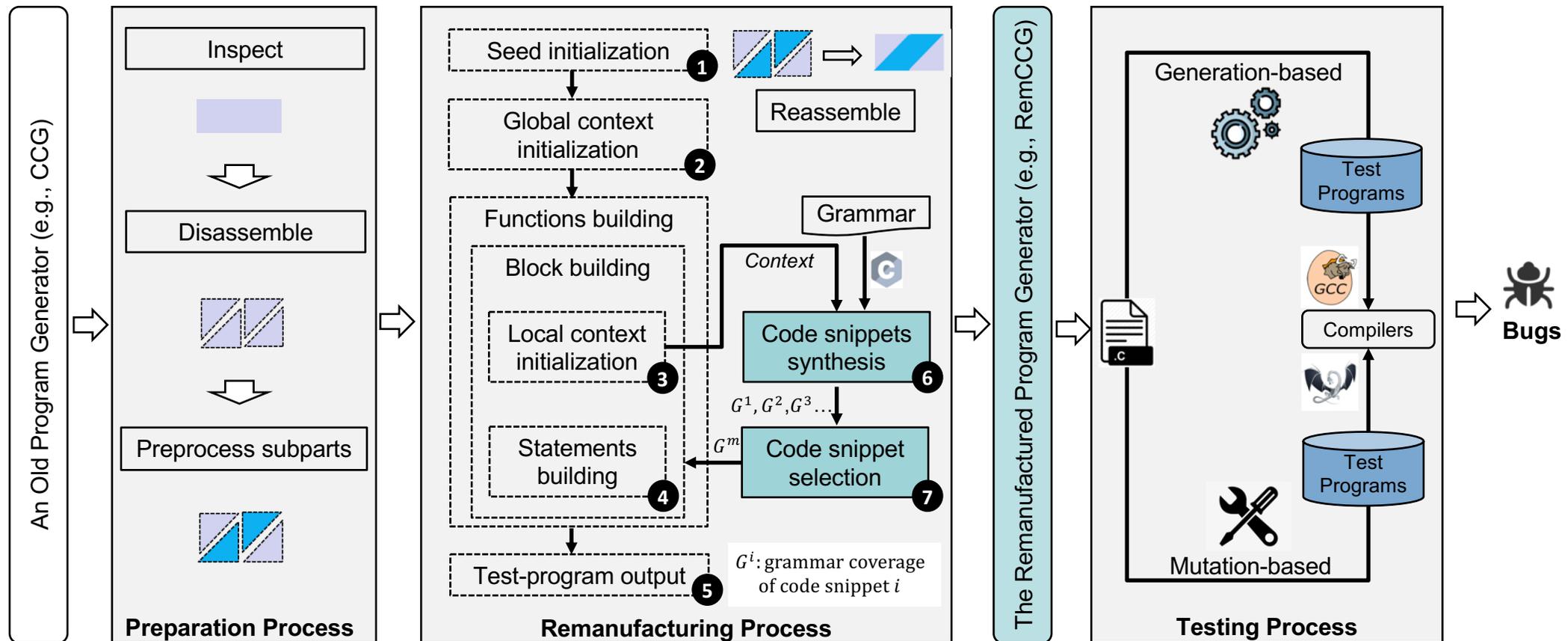
# Part 3: Approach

# Our approach: RemGen

- Highlight

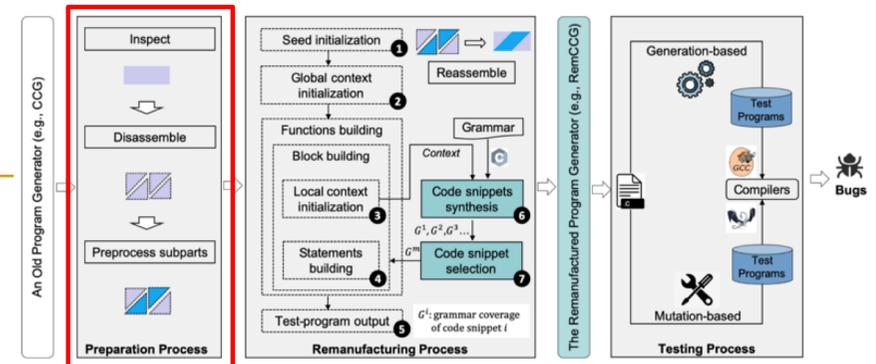


# RemGen: Overview



Preparation for remanufacturing → Remanufacturing → Testing the remanufactured product

# RemGen: Preparation process

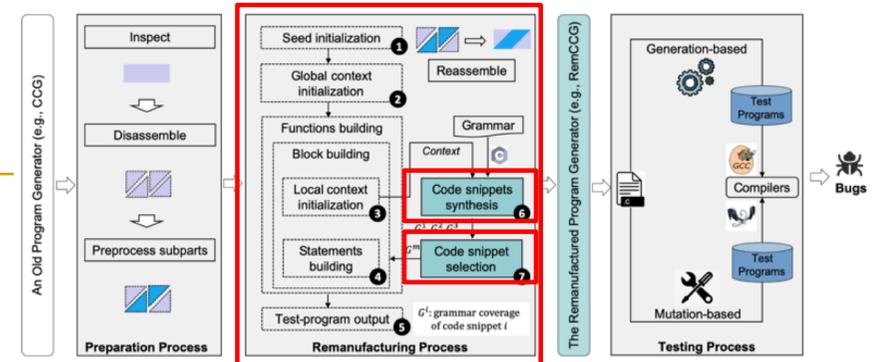


- **Inspect**
  - Checking the functionality from the input generator’s “appearances”
- **Disassemble**
  - Decomposing the test program generation components to be modularized
- **Preprocess subparts**
  - Reconstructing required components (e.g., built-in functions) to be easily integrated with other components

# RemGen: Remanufacturing process

- **Remanufacturing: two new components**

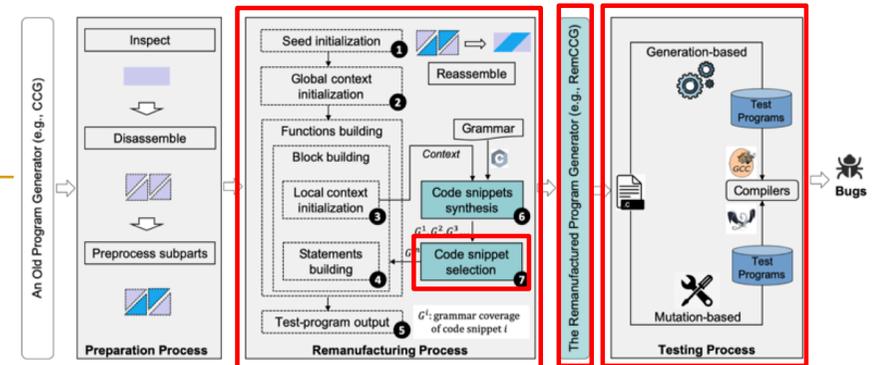
- Code snippets synthesis
- Code snippet selection



- **6 Diverse code snippets synthesis (grammar-aided)**

- Collect the required context (i.e., global and local)
  - Low effort
- Invoke the built-in functions to generate new code snippets
- utilize our new “diversity”: *grammar coverage*
  - the number of grammar rules (e.g., *if* or *for* statements) invoked during the synthesis

# RemGen: Remanufacturing process



## 7 Bug-revealing code snippet selection

- Leverage grammar coverage in the prior component
- Order produced code snippets
  - Calculate the sum of the square of each grammar coverage
- Integrate the selected code snippet to construct bug-revealing test program

### • Reassemble

### • Testing process

- More details in evaluation part

# Part 3: Evaluation

# Experimental Setup

- **We remanufactured an old program generator CCG into RemCCG under RemGen**
- **Research questions**
  - RQ1: Can RemCCG boost both generation-based and mutation-based approaches for compiler testing?
  - RQ2: Can RemCCG find new compiler bugs in practice?
- **Test settings**
  - For **RQ1**, we run over the same compiler versions used in [15] (GCC-4.4.3, LLVM-2.6)
    - Running 90 hours 10 times, count the average number of bugs detected
  - For **RQ2**, we run over current development versions of two compilers
    - Run RemCCG over the latest version of compilers

# Evaluation (1/2)

- **RQ1:** Can RemGen boost generation-based approaches for compiler testing?
  - Compare with generation-based approach: CCG [1] (baseline)
  - Compare with mutation-based approach: Hermes [8]
    - Use CCG/RemCCG to generate seed programs

TABLE I: Results of Boosting in Generation-based Approach

Subject	Tools	Average Statistics			
		<i>Cra.</i>	<i>Perf.</i>	<i>Sum.</i>	<i>Imp.</i>
GCC	CCG [3]	2.9	0.3	3.2	16%
	REMCCG	3.1	0.6	3.7	-
LLVM	CCG [3]	9.2	2.7	11.9	11%
	REMCCG	9.7	3.5	13.2	-

TABLE II: Results of Boosting in Mutation-based Approach

Subject	Tools	Average Statistics			
		<i>Cra.</i>	<i>Perf.</i>	<i>Sum.</i>	<i>Imp.</i>
GCC	Hermes(CCG)	3.0	0.5	3.5	14%
	Hermes(REMCCG)	3.2	0.8	4.0	-
LLVM	Hermes(CCG)	9.8	3.6	13.4	11%
	Hermes(REMCCG)	10.6	4.3	14.9	-

# Evaluation (2/2)

- **RQ2:** Can RemCCG find new compiler bugs in practice?

TABLE III: Results of All the Reported Bugs

Bug Status	GCC	LLVM	Total
Fixed	8	29	37
WorksForMe	0	2	2
Duplicate	2	3	5
Pending	0	12	15
<b>Total</b>	<b>10</b>	<b>46</b>	<b>56</b>

TABLE IV: Results of Bug Types of Fixed Bugs

But Types	GCC	LLVM	Total
<i>Crash</i>	6	16	22
<i>Performance</i>	2	13	15
<b>Total</b>	<b>8</b>	<b>29</b>	<b>37</b>

TABLE V: Details of Fixed Bugs

	Compiler-ID	Priority	Type	Affected. Opt.	Affected Versions
1	GCC-99694	P2	<i>Perf.</i>	-O1,2,3	<b>9.3-11.0 (trunk)</b>
2	GCC-99880	P2	<i>Crash</i>	-O3	10.2-11.0 (trunk)
3	GCC-99947	P1	<i>Crash</i>	-O3	11.0 (trunk)
4	GCC-100349	P2	<i>Crash</i>	-O2,3,s	11.0-12.0 (trunk)
5	GCC-100512	P3	<i>Crash</i>	-O2,3,s	12.0 (trunk)
6	GCC-100626	P2	<i>Crash</i>	-O1,2,3,s	11.0-12.0 (trunk)
7	GCC-102057	P3	<i>Crash</i>	-O1,2,3,s	12.0 (trunk)
8	GCC-102356	P3	<i>Perf.</i>	-O3	11.0-12.0 (trunk)
9	LLVM-49171	P3	<i>Perf.</i>	-O3	13.0 (trunk)
10	LLVM-49205	P3	<i>Perf.</i>	-O1,2,3,s	11.0-13.0 (trunk)
11	LLVM-49218	P3	<i>Crash</i>	-O1	12.0-13.0 (trunk)
12	LLVM-49396	P3	<i>Crash</i>	-O2,3,s	12.0-13.0 (trunk)
13	LLVM-49451	P3	<i>Crash</i>	-Os	13.0 (trunk)
14	LLVM-49466	P3	<i>Crash</i>	-O2	13.0 (trunk)
15	LLVM-49475	P3	<i>Perf.</i>	-O1	12.0-13.0 (trunk)
16	LLVM-49541	P3	<i>Perf.</i>	-O2,s	<b>7.0-13.0 (trunk)</b>
17	LLVM-49697	P3	<i>Crash</i>	-O3	<b>7.0-13.0 (trunk)</b>
18	LLVM-49785	P3	<i>Perf.</i>	-O3	13.0 (trunk)
19	LLVM-49786	P3	<i>Perf.</i>	-O2	13.0 (trunk)
20	LLVM-49993	P3	<i>Crash</i>	-O3	13.0 (trunk)
21	LLVM-50009	P3	<i>Crash</i>	-Os	12.0-13.0 (trunk)
22	LLVM-50050	P3	<i>Crash</i>	-O2,3,s	13.0 (trunk)
23	LLVM-50191	P3	<i>Crash</i>	-O2	13.0 (trunk)
24	LLVM-50238	P3	<i>Crash</i>	-O1,2,3,s	13.0 (trunk)
25	LLVM-50254	P3	<i>Perf.</i>	-O2,3	13.0 (trunk)
26	LLVM-50279	P3	<i>Perf.</i>	-O3	13.0 (trunk)
27	LLVM-50302	P3	<i>Perf.</i>	-O3	13.0 (trunk)
28	LLVM-50307	P3	<i>Crash</i>	-Os	13.0 (trunk)
29	LLVM-50308	P3	<i>Perf.</i>	-O1,2,3,s	12.0-13.0 (trunk)
30	LLVM-51553	P3	<i>Crash</i>	-O3	14.0 (trunk)
31	LLVM-51584	P3	<i>Perf.</i>	-O1,2,3,s	14.0 (trunk)
32	LLVM-51612	P3	<i>Crash</i>	-O2,3	14.0 (trunk)
33	LLVM-51656	P3	<i>Crash</i>	-O2,3	14.0 (trunk)
34	LLVM-51657	P3	<i>Perf.</i>	-O2,3,s	12.0-14.0 (trunk)
35	LLVM-51762	P3	<i>Perf.</i>	-O1	14.0 (trunk)
36	LLVM-52018	P3	<i>Crash</i>	-O3	14.0 (trunk)
37	LLVM-52024	P3	<i>Crash</i>	-O2	14.0 (trunk)

# Discussion

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- Effectiveness of the two proposed components
  - we compare RemCCG with its variants
- Comparison with Csmith [4] and YARPGen [5]
  - Find 164%/363% and 120%/595% more bugs than Csmith and YARPGen, in GCC/LLVM, respectively
  - This is reasonable due to the different design goal between those tools
- Limitation of RemCCG
  - Inherits the limitation from CCG: can only find two kinds of (i.e., crash and performance) bugs

# Part 5: Conclusion

# Conclusion

## Compilers are important but unreliable

XcodeGhost  
XcodeGhost Bug: affect 3418 apps

CVE  
CVE-2009-1897: Kernel crash to Dos attack

- Cited from [1]

How can we improve the reliability of compilers?

## Compilers are important but unreliable

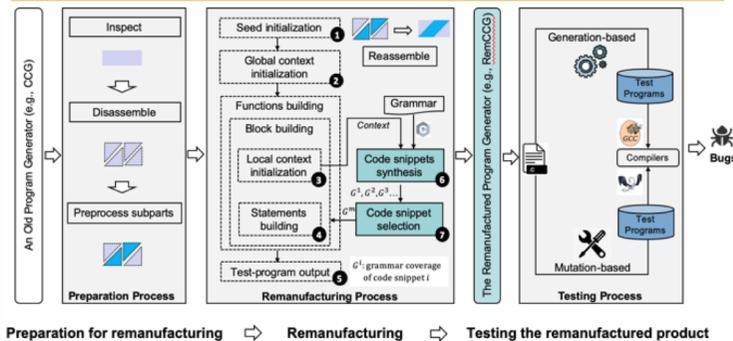
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Improving the reliability of compilers is still a hot topic.

## RemGen: Overview



## Evaluation (2/2)

- RQ2: Can RemCCG find new compiler bugs in practice?

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TABLE V: Details of Fixed Bugs

Compiler-ID	Priority	Type	Affected_Ops	Affected Versions
1	GCC-99984	P2	Prof.	-01.2.3
2	GCC-99980	P2	Crash	-01
3	GCC-99947	P1	Crash	-01
4	GCC-100049	P2	Crash	-02.3.a
5	GCC-100012	P3	Crash	-02.3.a
6	GCC-100026	P2	Crash	-01.2.3.a
7	GCC-102087	P3	Crash	-01.2.3.a
8	GCC-102196	P3	Prof.	-01
9	LLVM-49171	P3	Prof.	-01.2.3.a
10	LLVM-49205	P3	Prof.	-01.2.3.a
11	LLVM-49118	P3	Crash	-01
12	LLVM-49196	P3	Crash	-01.2.3.a
13	LLVM-49451	P3	Crash	-01
14	LLVM-49466	P3	Crash	-01
15	LLVM-49475	P3	Prof.	-01
16	LLVM-49441	P3	Prof.	-02.a
17	LLVM-49697	P3	Crash	-01
18	LLVM-49785	P3	Prof.	-01
19	LLVM-49786	P3	Prof.	-01
20	LLVM-49993	P3	Crash	-01
21	LLVM-50009	P3	Crash	-01
22	LLVM-50000	P3	Crash	-02.3.a
23	LLVM-50011	P3	Crash	-01
24	LLVM-50218	P3	Crash	-01.2.3.a
25	LLVM-50254	P3	Prof.	-01
26	LLVM-50279	P3	Prof.	-01
27	LLVM-50302	P3	Prof.	-01
28	LLVM-50307	P3	Crash	-01
29	LLVM-50308	P3	Prof.	-01.2.3.a
30	LLVM-51533	P3	Crash	-01
31	LLVM-51584	P3	Prof.	-01.2.3.a
32	LLVM-51612	P3	Crash	-01.3
33	LLVM-51606	P3	Crash	-02.3
34	LLVM-51607	P3	Prof.	-02.3.a
35	LLVM-51762	P3	Prof.	-01
36	LLVM-52018	P3	Crash	-01
37	LLVM-52024	P3	Crash	-01

Code: <https://github.com/haoxintu/RemCCG>

Email: [haoxintu.2020@phdcs.smu.edu.sg](mailto:haoxintu.2020@phdcs.smu.edu.sg)

(Please feel free to pull requests or raise any questions if you have!)

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# Thank you && Questions?

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