

# Semantic Crash Bucketing

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Claire Le Goues



# The Problem: Duplicate Crashes

- Large-scale automated testing
  - Fuzzing
  - Symbolic execution

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- Large-scale automated testing
  - Fuzzing
  - Symbolic execution
- Heuristic deduplication techniques
  - Call stack hash
  - Branch sequence

# Example: SQLite Bug

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select e.* ,0 from(s,(L))e;
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Prevents null  
dereference here

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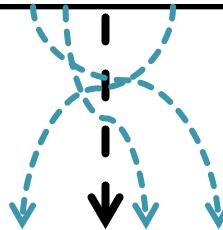
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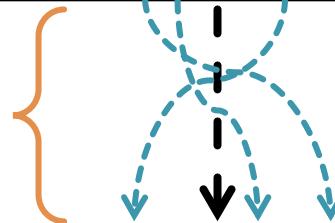
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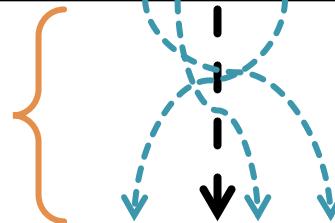
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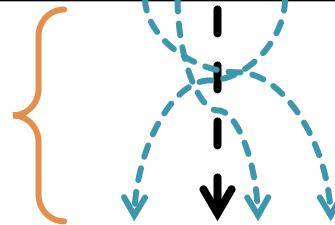
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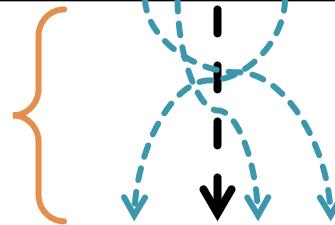
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Source of imprecision



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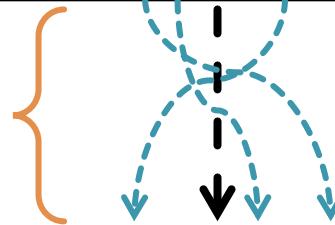
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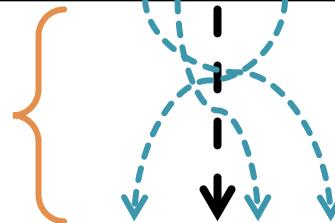
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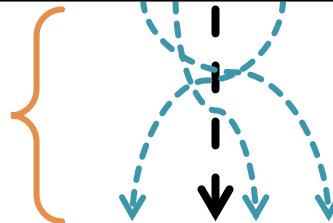
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Catches all input variants

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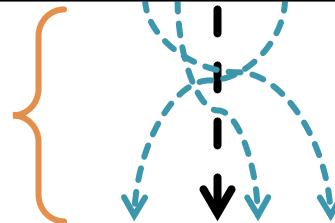
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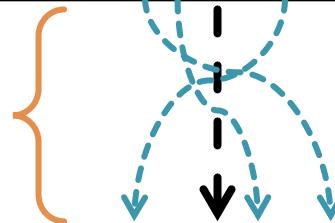
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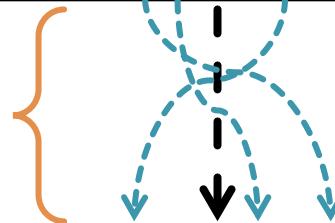
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Catches the same input variants!

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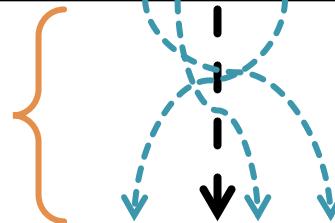
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Bug specific!

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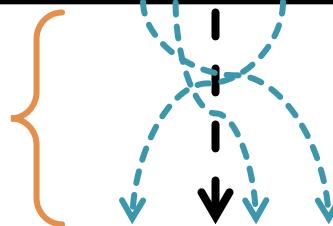
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**Suppose we have a bug**

**An ideal way to remove duplicate  
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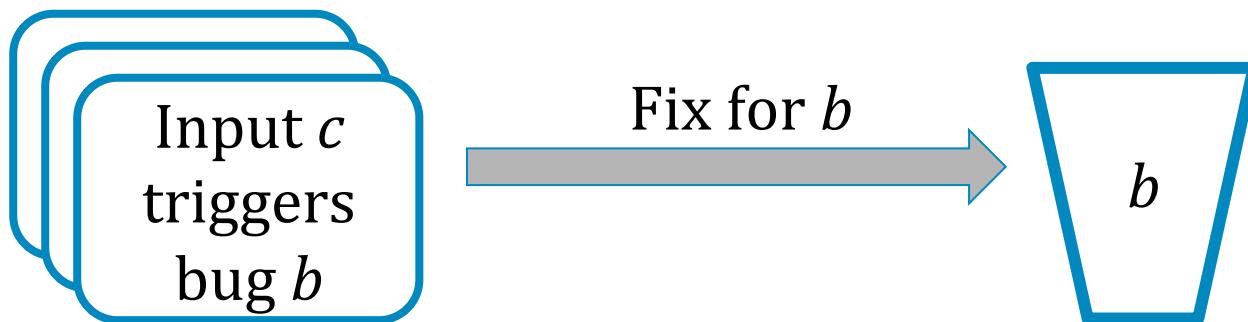
**Fix the bug!**

# An Ideal Solution: No Duplicates

- Intuition: a fix maps all crashing inputs of that bug to non-crashing state.

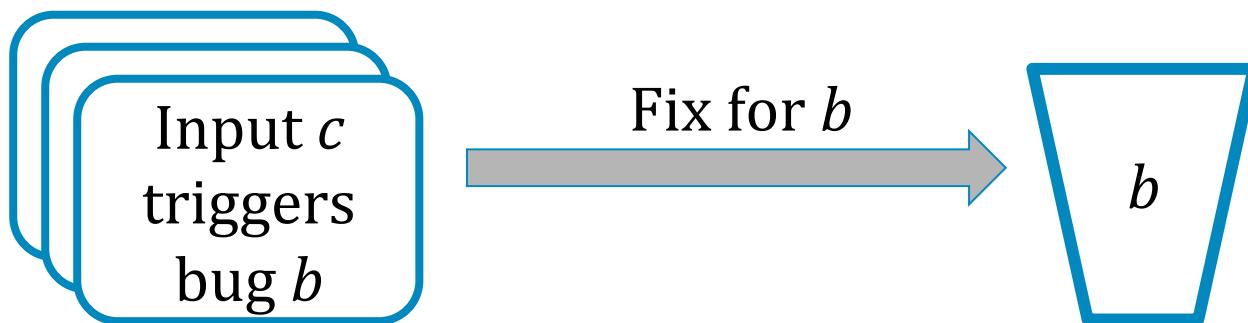
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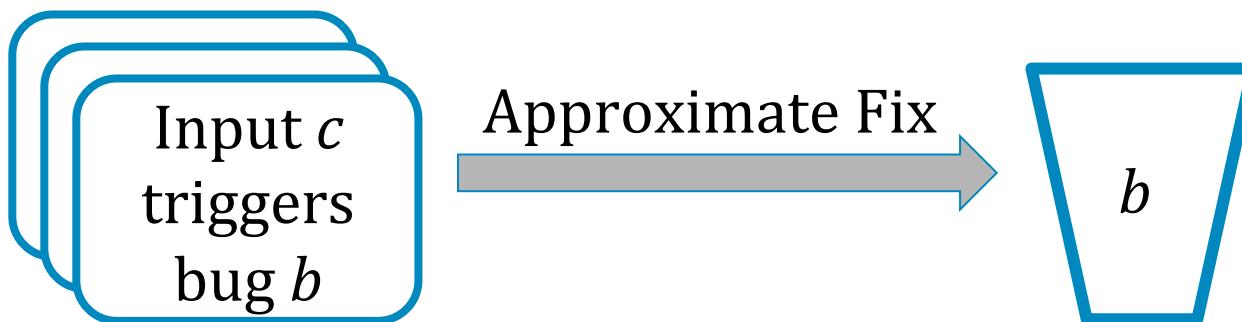


- Needs to be a “correct” developer fix
  - Expensive
  - Hard to automate

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- Maps crashing inputs as a function of program transformation (semantic delta).



# Semantic Crash Bucketing

- Rule-based approach
  - Fix templates (per bug class)

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- Null dereferences
- Buffer overflows

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Patch templates

(what to change)

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Bug-specific  
semantic cues

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(when to apply)

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Run Crashing Input

Check for null variables

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--- a/src/resolve.c  
+++ b/src/resolve.c  
@@ -164,6 +164,9 @@ int sqlite3MatchSpanToCol(const char *zSpan, const char  
*zCol, const char *zTab, const char *zDb){  
    int n;  
  
    for(n=0; ALWAYS(zSpan[n]) && zSpan[n]!='.'; n++){}  
    if( zDb && (sqlite3StrNICmp(zSpan, zDb, n)!=0 || zDb[n]!=0) ){  
        return 0;
```

# Approximate Fixes for Null Derefs

```
if (zSpan == null) {  
    exit(101);  
}
```

Run Crashing Input

Generate candidate patch

```
--- a/src/resolve.c  
+++ b/src/resolve.c  
@@ -164,6 +164,9 @@ int sqlite3MatchSpanName(const char *zSpan, const char  
*zCol, const char *zTab, const char *zDb){  
    int n;  
  
    for(n=0; ALWAYS(zSpan[n]) && zSpan[n]!='.'; n++){}  
    if( zDb && (sqlite3StrNICmp(zSpan, zDb, n)!=0 || zDb[n]!=0) ){  
        return 0;
```

# Approximate Fixes for Null Derefs

```
if (zSpan == null) {  
    exit(101);  
}
```

Run Crashing Input

Validate

```
--- a/src/resolve.c  
+++ b/src/resolve.c  
@@ -164,6 +164,9 @@ int sqlite3Matri...unName(const char *zSpan, const char  
*zCol, const char *zTab, const char *zDb){  
    int n;  
  
+    if(zSpan == NULL) {  
+        exit(101);  
+    }  
    for(n=0; ALWAYS(zSpan[n]) && zSpan[n]!='.'; n++){}  
    if( zDb && (sqlite3StrNICmp(zSpan, zDb, n)!=0 || zDb[n]!=0) ){
```

# Evaluating Approximate Fixes

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1. Compare to bucketing obtained by ground truth developer fixes

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1. Compare to bucketing obtained by ground truth developer fixes
  - Do approximate fixes "overfit" or hide other bugs?
2. Compare bucketing to state-of-art fuzzer deduplication

# Experimental Setup: Bugs with Ground Truth

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- Collect developer fixes
  - 18 null dereference bugs
  - 3 buffer overflow bugs
  - 6 real world projects

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SQLite

PHP

w3m

R

Conntrackd

libmad

# Experimental Setup: Crash Corpus Generation

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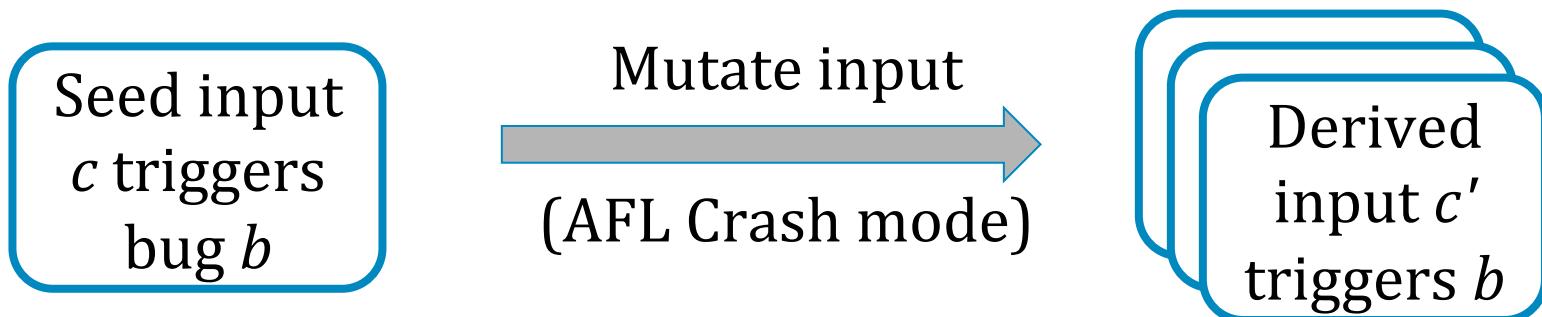
- Organic fuzzing campaigns nondeterministic and expensive

# Experimental Setup: Crash Corpus Generation

- Organic fuzzing campaigns nondeterministic and expensive
- Instead: mutate initial seed crashing input to generate derived crashing inputs

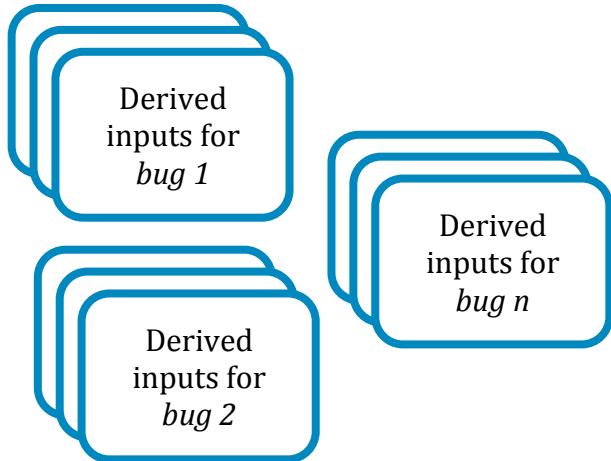
# Experimental Setup: Crash Corpus Generation

- Organic fuzzing campaigns nondeterministic and expensive
- Instead: mutate initial seed crashing input to generate derived crashing inputs



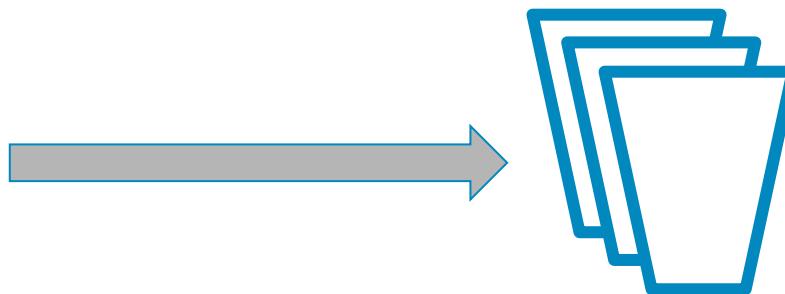
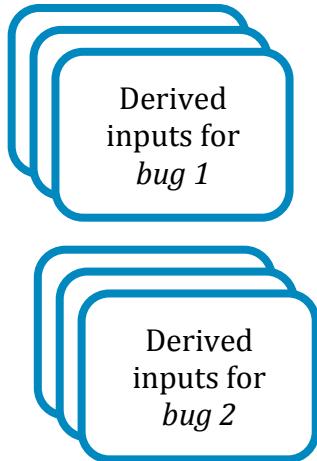
# Experimental Setup: Comparing Fuzzers

## Crash Corpus



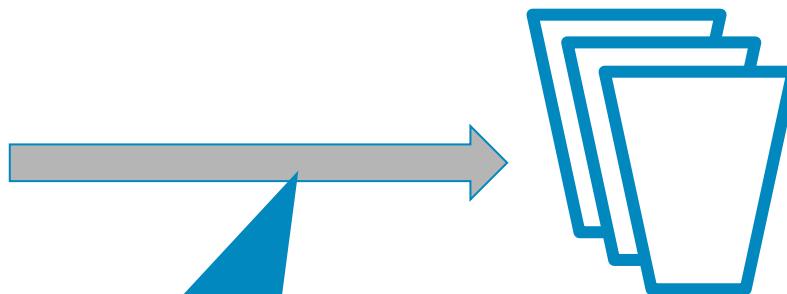
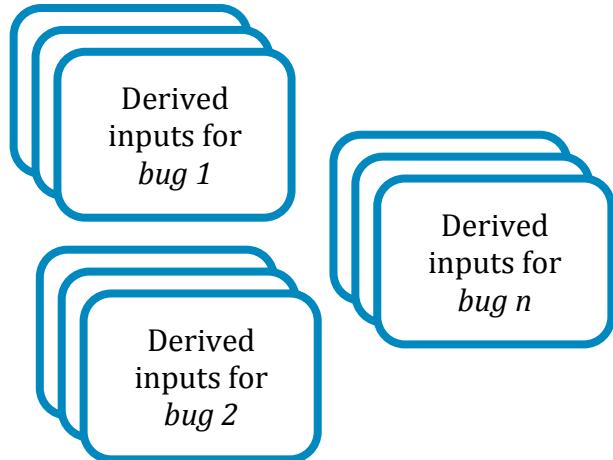
# Experimental Setup: Comparing Fuzzers

## Crash Corpus



# Experimental Setup: Comparing Fuzzers

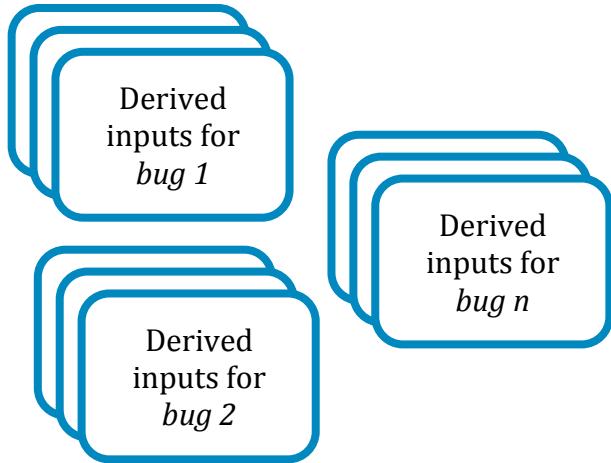
## Crash Corpus



- AFL-Fuzz
- CERT Basic Fuzzing Framework
- Honggfuzz

# Experimental Setup: Comparing Fuzzers

## Crash Corpus



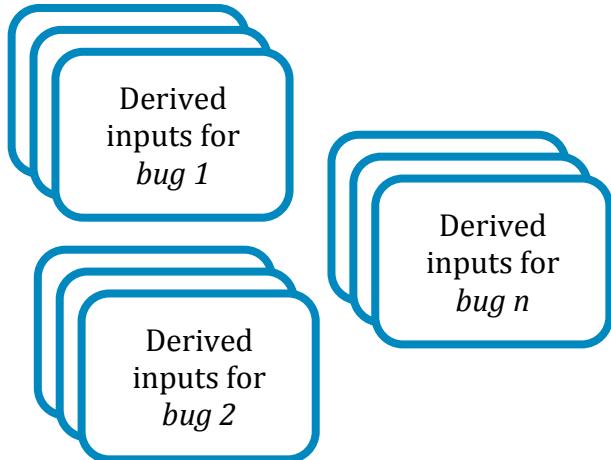
1 hour campaign

(per fuzzer)

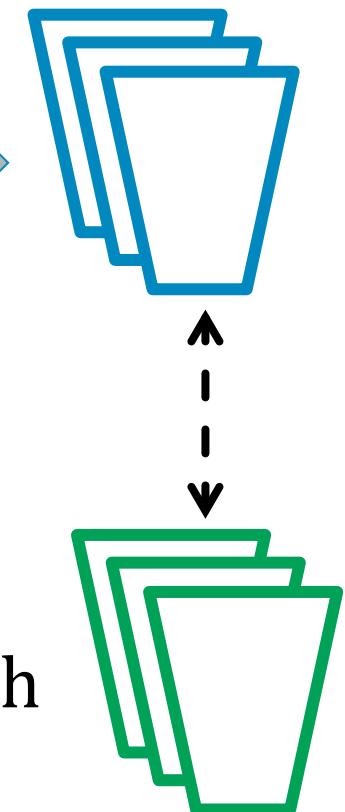


# Experimental Setup: Comparing Fuzzers

## Crash Corpus



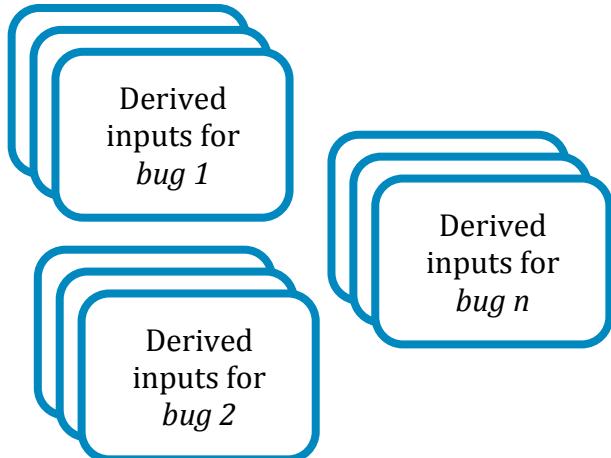
1 hour campaign  
(per fuzzer)



## Compare Ground Truth

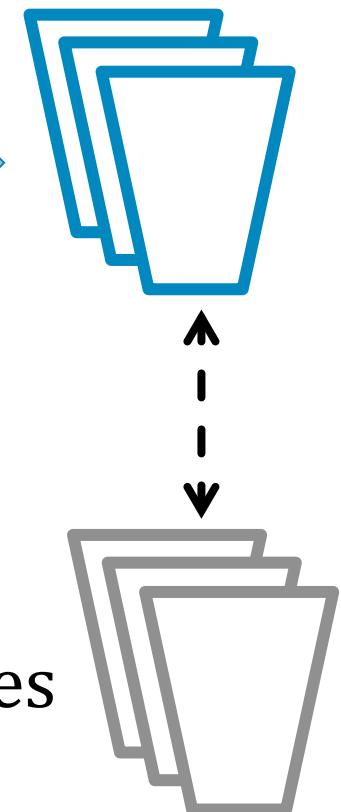
# Experimental Setup: Comparing Fuzzers

## Crash Corpus



1 hour campaign

(per fuzzer)



Compare Approximate Fixes

# Key Result

- Approximate fixes equal to ground truth for 19 out of 21 bugs

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- Approximate fixes equal to ground truth for 19 out of 21 bugs
- Just 3 duplicates total
  - AFL-Fuzz: 754
  - BFF: 41
  - HonggFuzz: 1,037

# SQLite Results

# SQLite Results

(lower is better)

Project	Type	Crash Corpus	SCB	AFL	BFF	HFuzz
SQLite	Null Deref		191			
			482			
			153			
			326			
			139			
			66			
			97			
			235			
			389			
			270			
			167			
			108			

# SQLite Results

(lower is better)

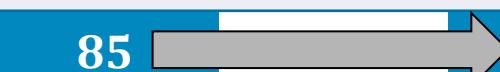
Project	Type	Crash Corpus	SCB	AFL	BFF	HFuzz
SQLite	Null Deref	191	1			
		482	0			
		153	0			
		326	0			
		139	0			
		66	0			
		97	0			
		235	0			
		389	0			
		270	0			
		167	2			
		108	0			

# SQLite Results

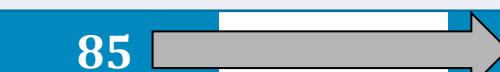
(lower is better)

Project	Type	Crash Corpus	SCB	AFL	BFF	HFuzz
SQLite	Null Deref	191	<b>1</b>	25	2	10
		482	<b>0</b>	85	2	4
		153	<b>0</b>	38	6	16
		326	<b>0</b>	48	0	1
		139	<b>0</b>	34	0	0
		66	<b>0</b>	21	0	0
		97	<b>0</b>	20	0	0
		235	<b>0</b>	82	1	3
		389	<b>0</b>	29	1	1
		270	<b>0</b>	65	0	1
		167	<b>2</b>	45	0	4
		108	<b>0</b>	36	0	0

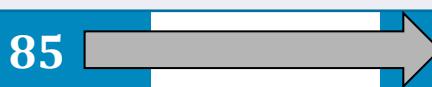
# Duplication sensitivity to bug type

Project	Type	Crash Corpus	SCB	AFL	BFF	HFuzz
SQLite	Null Deref	191	1	25	2	10
		482	0	85	 85	4
		153	0	38	6	16
		326	0	48	0	1
		139	0	34	0	0
		66	0	21	0	0
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R	Overflow	7	0	5		145

# SCB does uniformly better

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# Summary

## Approximate fixes remove imprecision | Rule-based patch template application

```

--- a/src/select.c
+++ b/src/select.c
@@ -4153,7 +4153,7 @@ static int selectExpander(Walker *pWalker, Select *p)
{
    /* A sub-query in the FROM clause of a SELECT */
    assert( pSel!=0 );
    assert( pFrom->pTab==0 );
    sqlite3WalkSelect(pWalker, pSel);

    pFrom->pTab = pTab = sqlite3DbMallocZero(db, sizeof(Table));
    if( pTab==0 ) return WRC_Abort;
}

Source of imprecision { Catches the same input variants!

```

```

--- a/src/resolve.c
+++ b/src/resolve.c
@@ -164,6 +164,9 @@ int sqlite3MatchSpanName(const char *zSpan, const char
*zCol, const char *zTab, const char *zDb){
    int n;

+ if(zSpan == NULL) {
+     exit(101);
+ }
    for(n=0; ALWAYS(zSpan[n]) && zSpan[n]!='.'; n++){}
    if( zDb && (sqlite3StrNICmp(zSpan, zDb, n)!=0 || zDb[n]!=0 ) ){
        return 0;
    }
}

```

## Fewer duplicates than state of art

- Approximate fixes equal to ground truth for 19 out of 21 bugs
- Just 3 duplicates total
  - AFL-Fuzz: 754
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		270	0	65	0	1
	Overflow	167	2	45	0	4
R		7	0	5	145	



Another Person  
Follow

Follow



Anybody know of good tools for reducing "qualitatively identical" crashes from fuzzing?  
Example: memcpy crash with invalid pointers can hit the aligned or unaligned path but are both essentially the same bug if the call stack up to that point is identical

8:15 PM - 22 Feb 2018

# Approximate Fixes for Overflows

```
size_t angelic_length = 1;  
strncpy(%%%DST%%%, %%%SRC%%%, angelic_length);
```

Run Crashing Input

Scan trace for potentially unsafe library calls

```
if (GetNextItem(fp, buf, 0, &state)) { fclose(fp); return 0;} /* [ */  
    for(i = 0; i < 256; i++) {  
        if (GetNextItem(fp, buf, i, &state)) { fclose(fp); return 0; }  
        strcpy(encnames[i].cname, buf+1); // overflow  
        ...  
        if (!isPDF) strcat(enccode, "]\\n");  
    return 1; // segfault triggered (maybe)  
}
```

# Approximate Fixes for Overflows

```
size_t angelic_length = 1;  
strncpy(encnames[i].cname, buf+1, angelic_length);
```

Run Crashing Input

Actual fix

```
if (GetNextItem(fp, buf, 0, &state)) { fclose(fp); return 0;} /* [ */  
    for(i = 0; i < 256; i++) {  
        if (GetNextItem(fp, buf, i, &state)) { fclose(fp); return 0; }  
+        strncpy(encnames[i].cname, buf+1, 39);  
        ...  
        if (!isPDF) strcat(enccode, "]\\n");  
    }  
    return 1;  
}
```