

# Error Propagation Analysis for Multi-Threaded Programs

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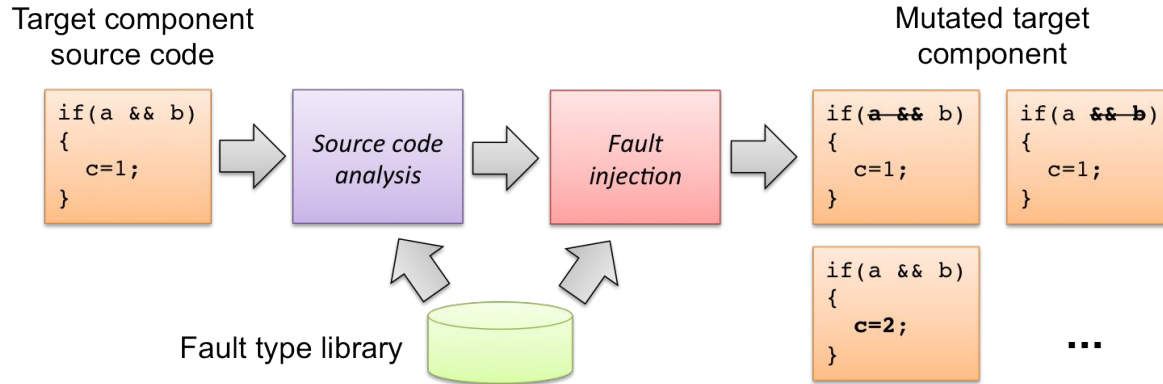


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# Fault Injection

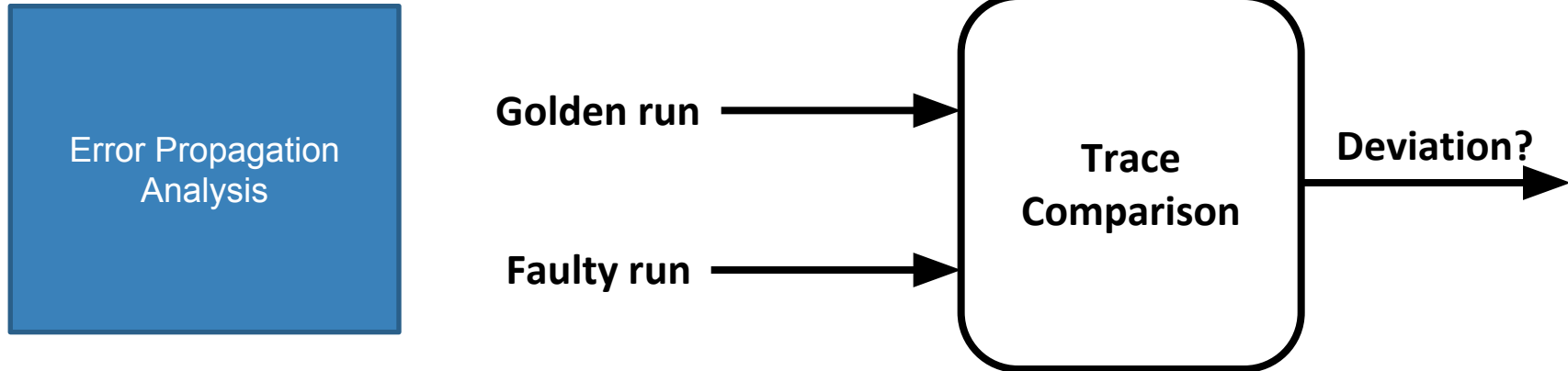
Evaluate the robustness of software



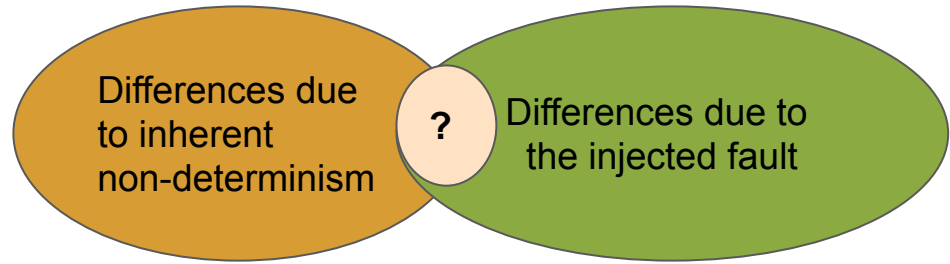
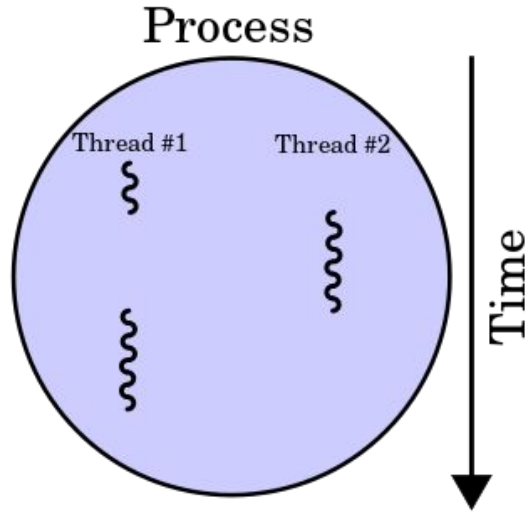
# Motivation: Error Propagation Analysis (EPA)

Compare FI run with golden run (fault free run)

Any deviation indicates error propagation



# What about Multi-threaded programs ?



**Is the difference due to the non-determinism of multi-threading OR error propagation ?**

# Example: Single-Threaded EPA

Program	Fault-free Run	Fault Injection	
A[0] = 2;	A[0] = 2;	A[0] = 2;	
A[1] = 19;	A[1] = 19;	A[1] = 91;	Injection
A[0]++;	A[0] = 3;	A[0] = 3;	
A[1]++;	A[1] = 20;	A[1] = 92;	Propagation
return A[0] + A[1];	return 23;	return 94;	Propagation

# Example: Multi-threaded EPA

Program	Thread 1 (Fault Free)	Thread 2 (Fault Free)	Thread 1 (Fault Injection)	Thread 2 (Fault Injection)	
A[0] = 2;	A[0] = 2;			A[1] = 91;	Injection
A[1] = 19;	A[0] = 3;			A[1] = 92;	Propagation
A[0]++;		A[1] = 19;	A[0] = 2;		Deviation
A[1]++;		A[1] = 20;	A[0] = 3;		Deviation
return A[0] + A[1];					

## Our Work: TraceSanitizer

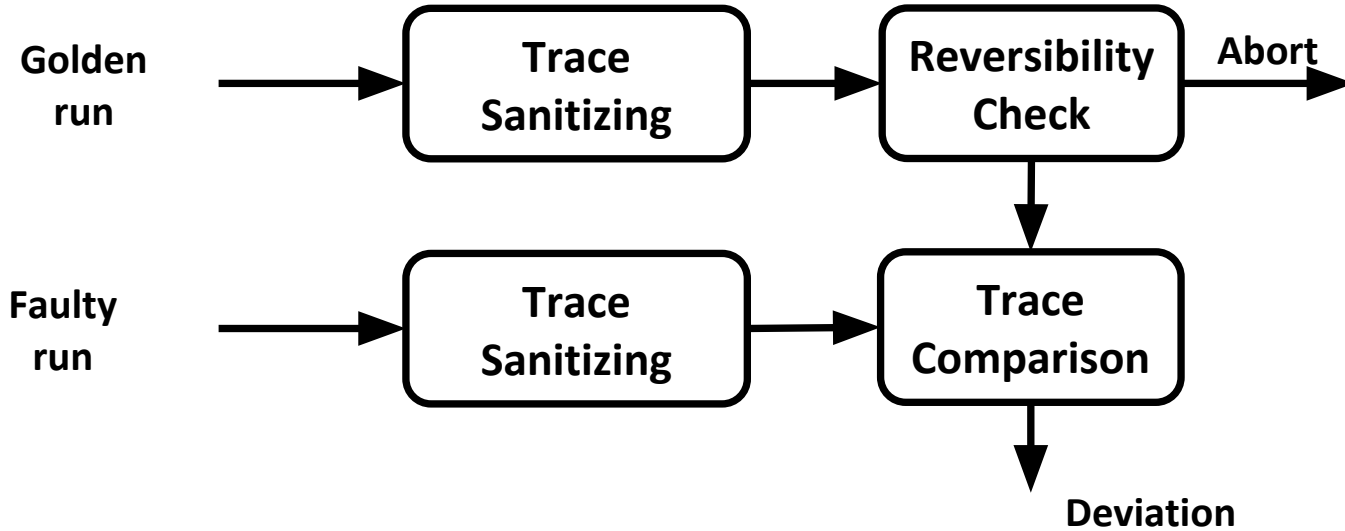
First **sound** technique to disambiguate error propagation in **multi-threaded** programs from non-determinism (**without needing any programmer annotations**)

## Intuition: Pseudo-deterministic condition

- An execution trace is pseudo-deterministic:
  - No **dependent** instructions that can occur in **reversed** order
- Pseudo-deterministic condition **guarantees** soundness
- Example: Map Reduce



# TraceSanitizer: WorkFlow

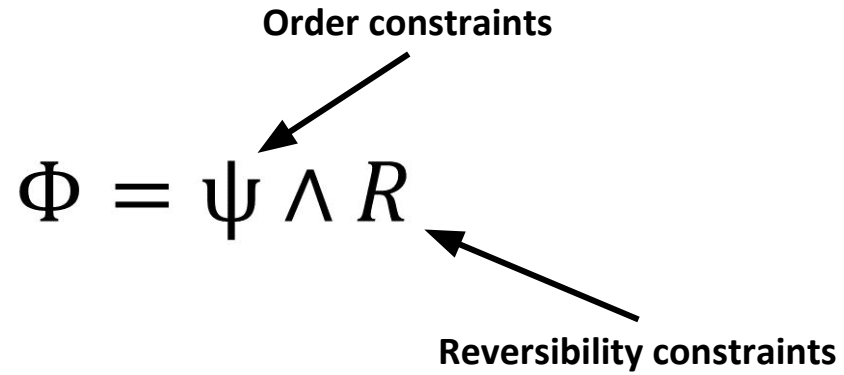


# Reversibility Check

$$\Phi = \psi \wedge R$$

Order constraints

Reversibility constraints

The diagram shows the equation  $\Phi = \psi \wedge R$  centered on the page. Above the variable  $\psi$ , the text "Order constraints" is written, with a black arrow pointing downwards to  $\psi$ . Below the variable  $R$ , the text "Reversibility constraints" is written, with a black arrow pointing upwards to  $R$ .

# Example: TraceSanitizer Operation

## Original Trace

```
0 call-pthread_create 0  
  → 7ffcf3282e8 0 400ae0 0  
0 call-pthread_create 0  
  → 7ffcf3282e0 0 4012c0 0  
1 call-inc 0  
1 alloca 7f0ccbc55d58 8  
1 alloca 7f0ccbc55d50 8  
1 store 0 7f0ccbc55d50  
2 call-inc 0  
2 alloca 7f0ccb454d58 8
```

## Sanitized Trace

```
T_0 call-pthread_create-u 0  
  → o4 0 400ae0 0  
T_0 call-pthread_create-u 0  
  → o5 0 4012c0 0  
T_0_0 call-inc 0  
T_0_0 alloca o6 1 8  
T_0_0 alloca o7 1 8  
T_0_0 store 0 o7  
T_0_1 call-inc 0  
T_0_1 alloca o8 1 8
```

# Evaluation

- Implemented as a pass in the LLVM compiler
- C/C++ programs from the PARSEC and Phoenix benchmarks
- Reversibility check with the Z3 SMT solver
- Injected 5 different types of software faults (5000 injections each)

# False positives and Time Taken

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<b>Program</b>	<b># Threads</b>	<b>False Positives</b>	<b>Reversibility Check Time</b>
<b>quicksort</b>	<b>72</b>	<b>0</b>	<b>30 min</b>
<b>pca</b>	<b>17</b>	<b>0</b>	<b>150 min</b>
<b>kmeans</b>	<b>65</b>	<b>0</b>	<b>82 min</b>
<b>blackscholes</b>	<b>3</b>	<b>0</b>	<b>1 min</b>
<b>swaptions</b>	<b>4</b>	<b>0</b>	<b>145 min</b>

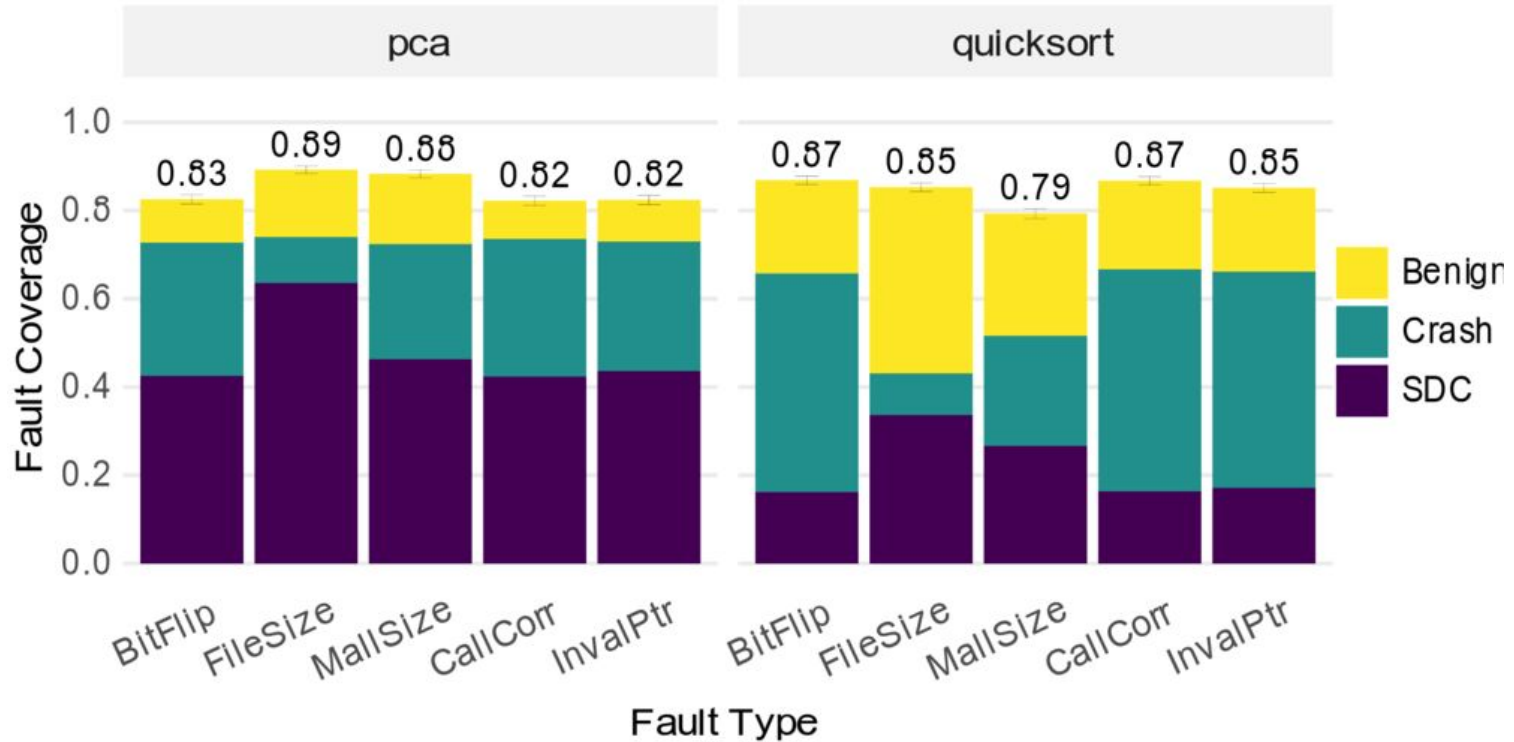
# Fault Model

**Residual software bugs that are hard to detect through regression or unit tests**

## **Faults Considered:**

- Bit Flip
- File I/O Buffer Overflow
- Buffer Overflow Malloc
- Function Call Corruption
- Invalid Pointer

# Fault Injection Results



# Summary

Non-Determinism in multi-threaded programs is bad for EPA

TraceSanitizer (TS): First **Sound** technique to perform EPA for a class of Multi-threaded programs (**pseudo-deterministic**)

- Condition encoded as reversibility check - SMT solvers
- Completely automated; no program annotations needed

Evaluation shows TS has **0% false-positives, incurs reasonable overheads and provides high fault coverage**

<https://github.com/DEEDS-TUD/TraceSanitizer>