

SENSA: Sensitivity Analysis for Quantitative Change-impact Prediction

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What we do

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M1, M2, M3, M4, M5

Program_{base}



M2

Candidate Change Locations



Predictive Dynamic Change-impact Analysis (CIA)



Predicted Impacts

M1, M2, M3, M5

- Challenge 1: Coarse granularity (missing details)
- Challenge 2: Large size (incurring prohibitive costs)

What we do

3

M1, M2, M3, M4, M5

Program_{base}



M2

Candidate Change Locations



Predictive Dynamic Change-impact Analysis (CIA)



Predicted Impacts

M1, M2, M3, M5

- Challenge 1: Coarse granularity

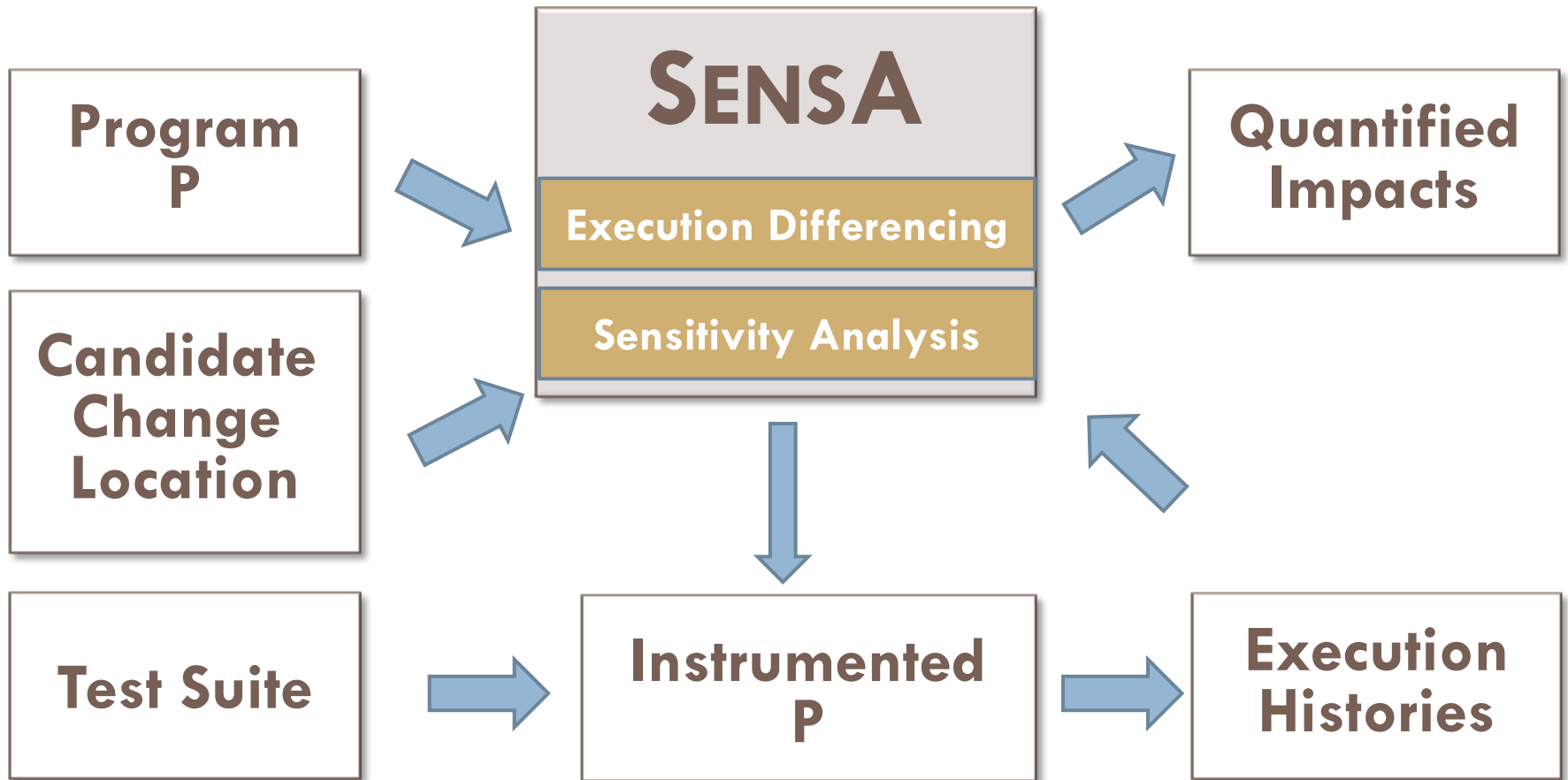
Solution: **statement-level** analysis

- Challenge 2: Large size

Solution: **prioritize** change impacts

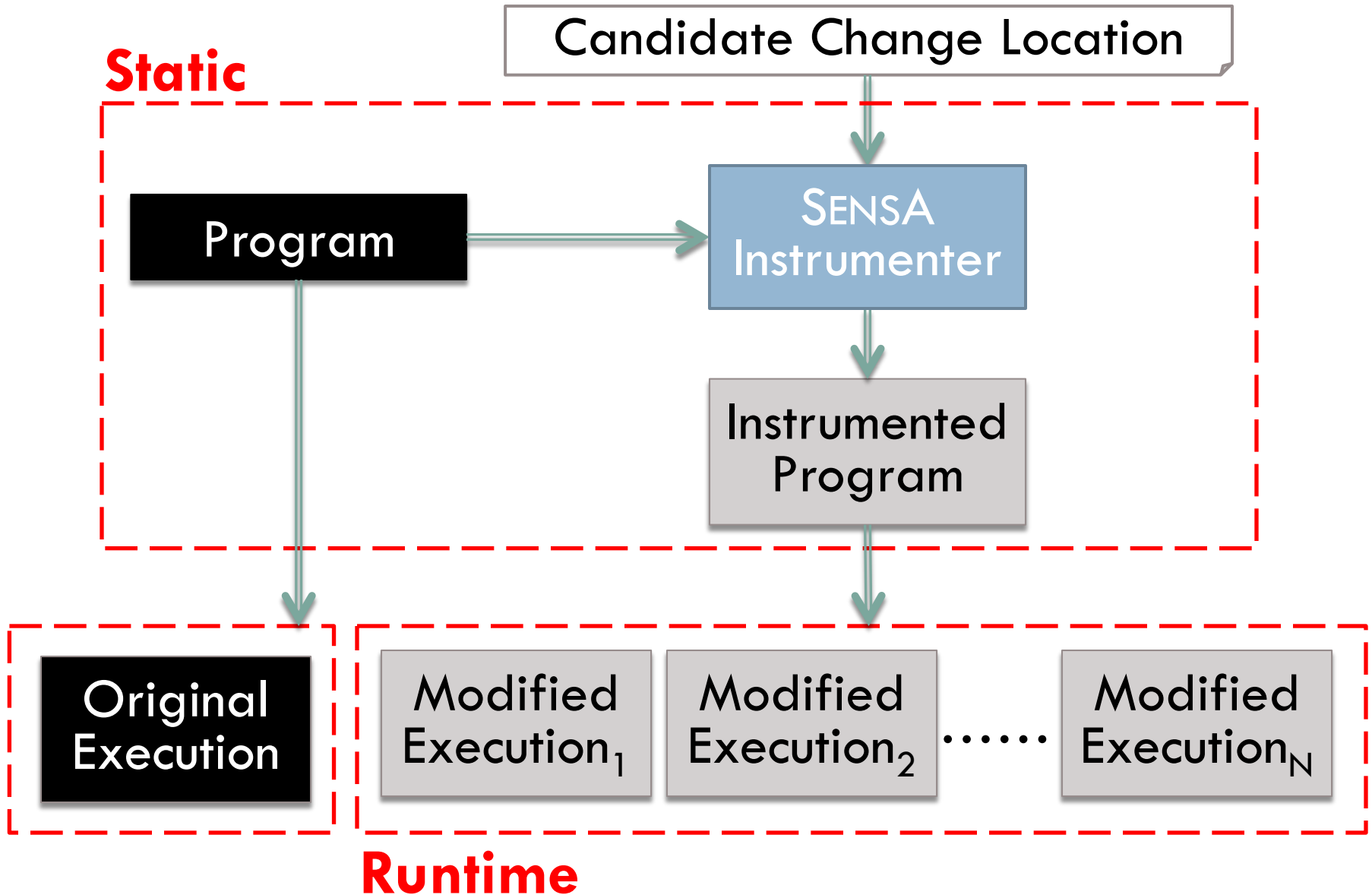
Technique: overview

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Technique: sensitivity analysis

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Technique: execution differencing

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```

1 public class A {
2     static int M1(int f, int z) {
3         M2(f+z);
4         return new B().M3(f,1); }
5     void M2(int m) {
6         if (m > 0) // change
7         C.M5(); }
8 public class B {
9     public static int t=0;
10    int M3(int a, int b) {
11        int n = b*b - a;
12        return n; }
13    static void M4() {
14        t = 10; }
15 public class C {
16     public static boolean M5() {
17         return B.t > 10; }
18
19     public static void M0() {
20         if (A.M1(4,-3) > 0)
21             B.M4(); }

```

Original Execution

Modified Execution

Execution History

Statement	Value
20	False
6	True
11	-3
12	-3
7	
17	False
4	-3

Results
(statements):

6
7
17

Impact set
(for statement 6)

Statement	Value
20	False
6	False
11	-3
12	-3
-	
-	
4	-3

How SEnSA works

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```
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19     public static void M0() {
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21             B.M4(); }
```

Original Execution

Multiple Modified Executions

Statement	Impact Frequency
6	1
7	1
17	1
2	0
⋮	0
21	0

Only one modified execution for this example

Execution Differencing

Impact Quantification

Quantified
Impact Set

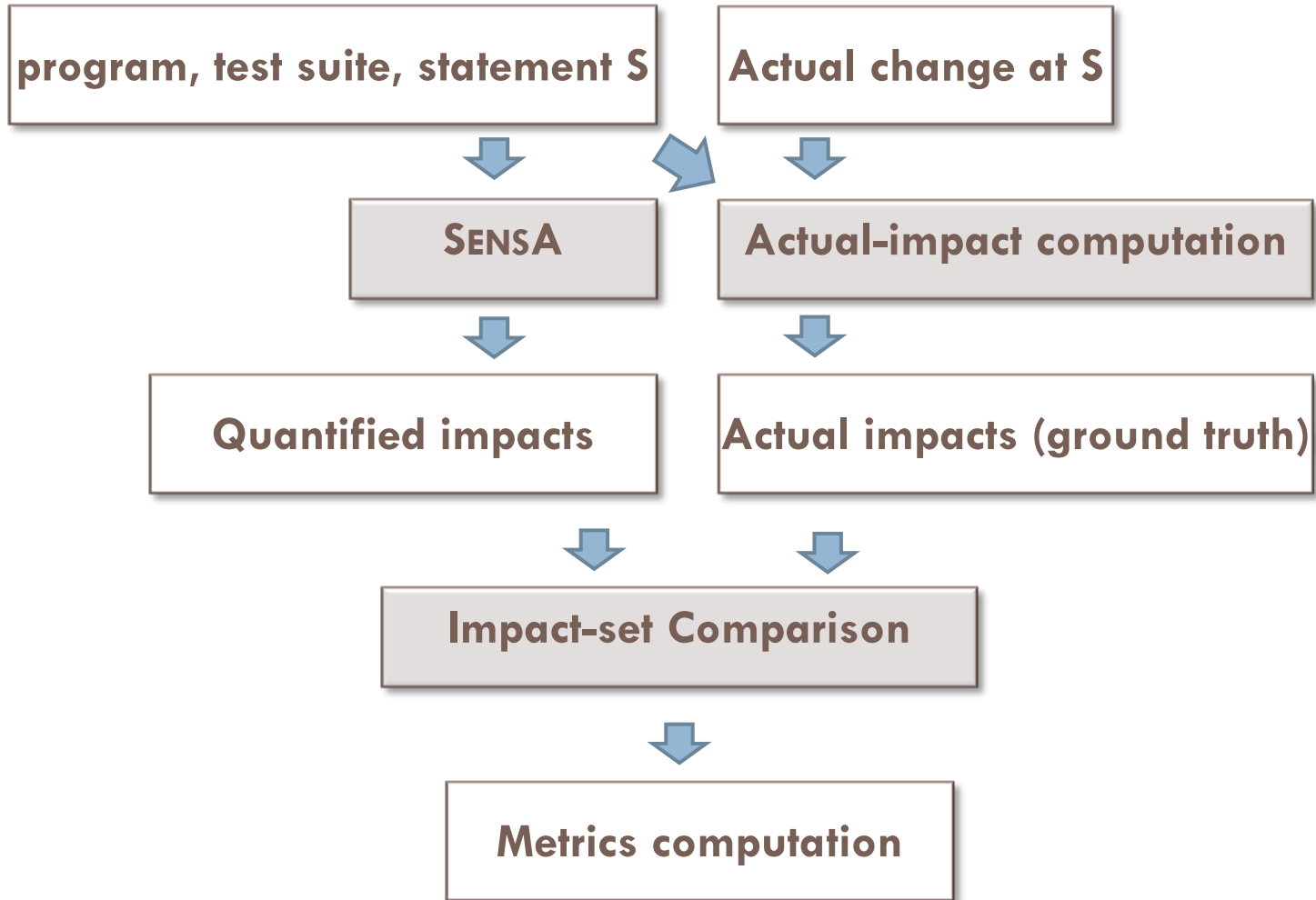
Subject programs and statistics

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Subject	Description	Lines of Code	Tests	Changes
Schedule 1	Priority Scheduler	290	2,650	7
NanoXML	XML parser	3,521	214	7
XML-Security	Encryption library	22,361	92	7
Ant	Java project build tool	44,862	205	7

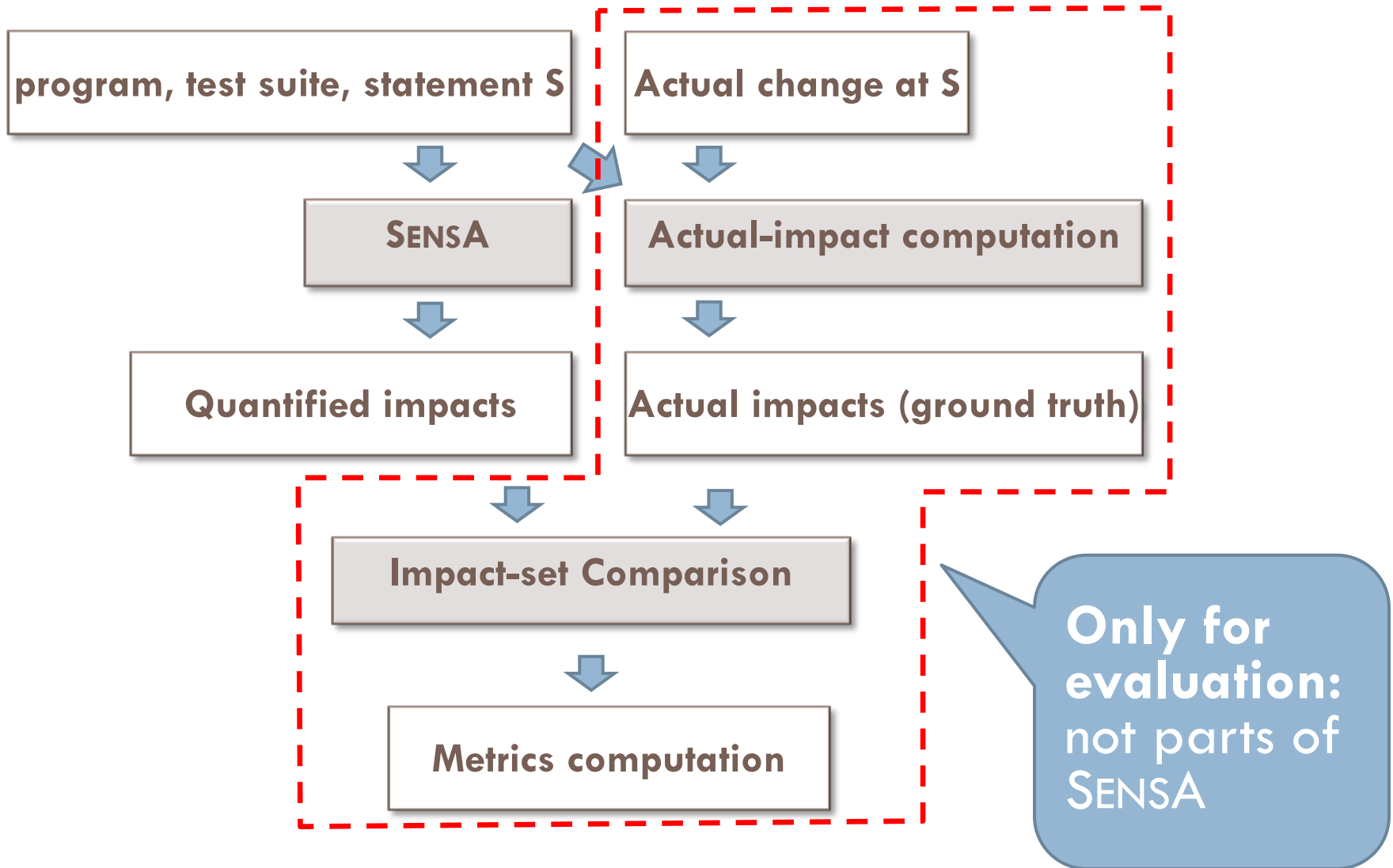
Experimental methodology

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Experimental methodology

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Experimental methodology

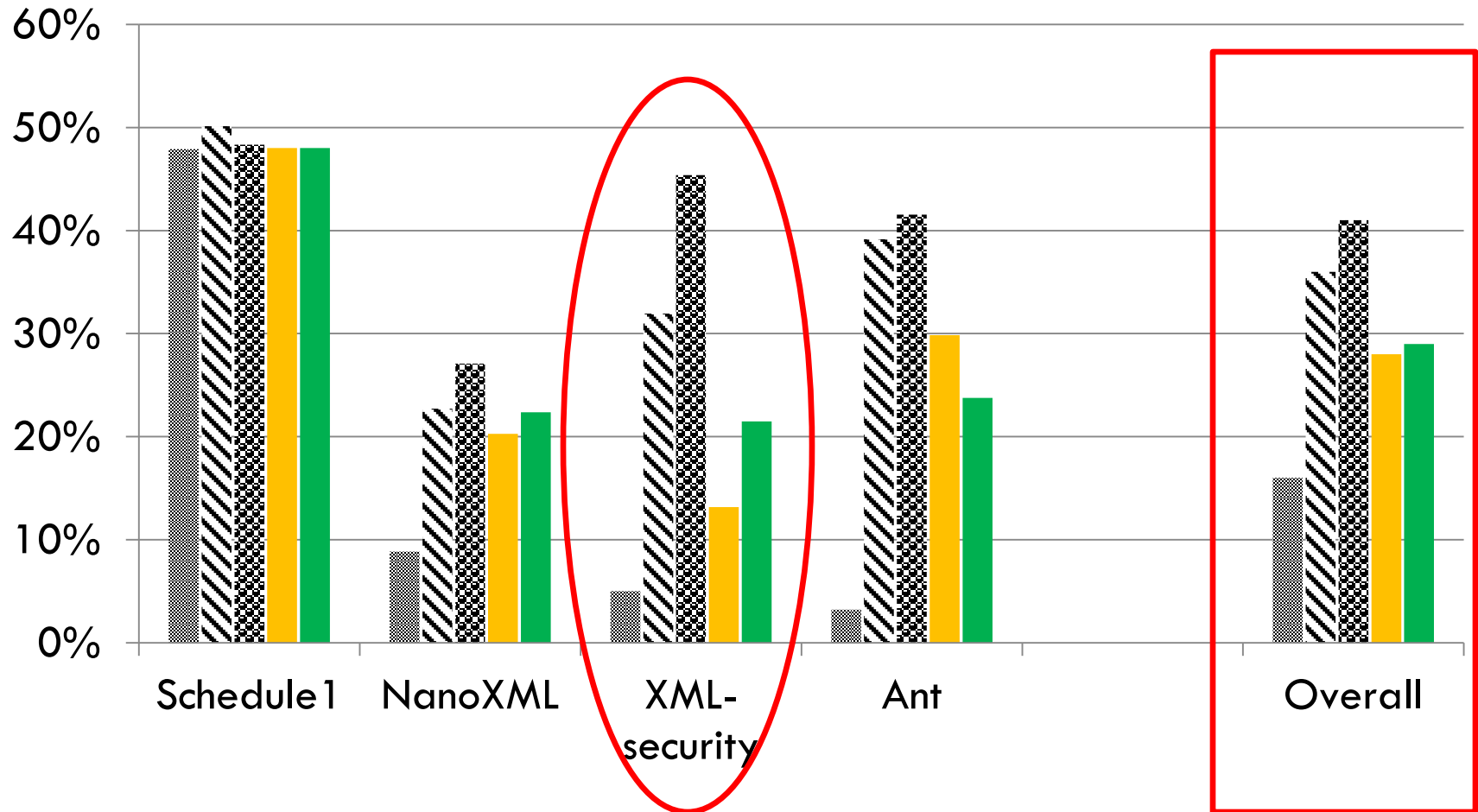
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- Metrics
 - ▣ Effectiveness: inspection effort
 - Percentage of worse-case inspection cost
 - ▣ Cost: computation time
- Two variants: SENSEA-RAND, SENSEA-INC
- Compare to: static slicing, dynamic slicing, ideal case
 - ▣ Ideal case: best prediction possible
 - use the actual impact set as the prediction result

Results: inspect effort

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■ Ideal case ▨ static slicing ▩ dynamic slicing
■ SENSEA-RAND ■ SENSEA-INC



Results: computation time

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Subject	Static analysis	Instrumented run	Post-processing
Schedule 1	6 sec	4,757 sec	1,054 sec
NanoXML	17 sec	773 sec	10 sec
XML-Security	179 sec	343 sec	21 sec
Ant	943 sec	439 sec	7 sec

- Static analysis and post-processing cost little time
- Runtime cost dominates the total cost
 - ▣ Come from multiple modified executions
 - ▣ Can be greatly reduced by executing all modifications in parallel

Results: computation time

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- Static analysis and post-processing cost little time
- Runtime cost dominates the total cost
 - ▣ Come from multiple modules
 - ▣ Can be greatly reduced if parallel

Highly Parallelizable

□ Contributions

- A novel approach to quantifying dependencies and, based on that, a quantitative dynamic impact prediction technique
- An empirical study of the new approach showing the significantly better effectiveness of the new approach than slicing, at reasonable costs

□ Future Work

- To expand the study by including more subjects and more types of changes
- To apply the dependence-quantification approach to tasks other than impact analysis



- Contributions
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Controversial statements

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- Test suite augmentation is irrelevant to alleviating the limitation of dynamic analysis that the execute set used does not fully represent the program behavior.
- Quantitative dependence analysis is more effective than traditional non-quantified dependence analysis.