

An Empirical Comparison of Test Suite Reduction Techniques for User-session-based Testing of Web Applications

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User-session-based Testing



User session

home.jsp?user=sprengle
myinfo.jsp
updateinfo.jsp?addr=xxx&email=yyy

Web
Application
code



➤ User sessions as test cases

- Real usage of Web applications
- Beta/maintenance testing phases

User-session-based Testing



User session

home.jsp?user=sprengle
myinfo.jsp
updateinfo.jsp?addr=xxx&email=yyy

Web
Application
code

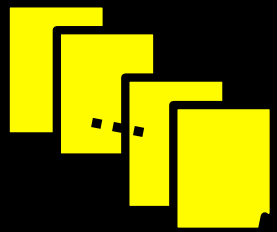


- User sessions as test cases
 - Real usage of Web applications
 - Beta/maintenance testing phases
- **Problem**: potentially collect too many user sessions to test practically

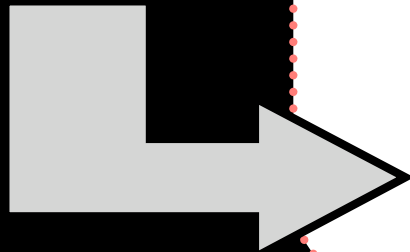
Suite Reduction: State of the Art

- **Goal:** maintain the original suite's effectiveness
 - e.g., code coverage, fault detection
- **Approaches to Reduction**
 - Requirements-based
 - Concept-based
- **Paper's Focus: Empirical Study**
 - What are the techniques' tradeoffs?
 - Which is the most practical technique?

Requirements-based Reduction



Original test suite T

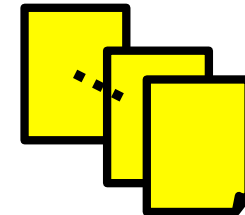
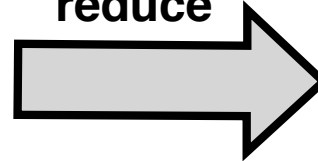


choose criterion, collect data,
create requirements
mapping for each test case

```
r1 → t0, t2, ..., tj
r2 → t7
...
rn → t1, t9, ..., tn
```

r → set of test cases that
meet requirement

reduce



Reduced test suite T'

Test Case
Selection

Alternatives:

- Random
- Greedy
- Harrold, Gupta, Soffa [HGS93]

Requirements-based Mapping

- Selection: ensures that the reduced test suite covers **all** requirements

		Test Cases					
		T0	T1	T2	T3	T4	T5
Requirements	R0	•	•	•			•
	R1	•	•			•	
	R2				•		
	R3	•				•	
	R4	•			•	•	
	R5		•	•	•		•
	R6		•	•	•		

Requirements that the test case covers

Test Case Selection: Random

- Randomly choose next test case

Choosing **T2**
covers **R0, R5, R6**

		Test Cases					
		T0	T1	T2	T3	T4	T5
Requirements	R0	•	•	◆			•
	R1	•	•			•	
	R2				•		
	R3	•				•	
	R4	•			•	•	
	R5		•	◆	•		•
	R6		•	◆	•		

Test Case Selection: Random

- Randomly choose next test case

Choosing T2 covers R0, R5, R6
Choosing T1 also covers R1

		Test Cases					
		T0	T1	T2	T3	T4	T5
Requirements	R0	•	◆	•			•
	R1	•	◆			•	
	R2				•		
	R3	•				•	
	R4	•			•	•	
	R5		◆	•	•		•
	R6		◆	•	•		

Test Case Selection: Random

- Randomly choose next test case

Choosing T2
covers R0, R5, R6
Choosing T1 also
covers R1
Choosing T0
covers R3, R4

		Test Cases					
		T0	T1	T2	T3	T4	T5
Requirements	R0	◆	●	●			●
	R1	◆	●			●	
	R2				●		
	R3	◆				●	
	R4	◆			●	●	
	R5		●	●	●		●
	R6		●	●	●		

Test Case Selection: Random

- Randomly choose next test case

Choosing T2
covers R0, R5, R6
Choosing T1 also
covers R1
Choosing T0
covers R3, R4
Choosing **T5** adds
nothing

		Test Cases					
		T0	T1	T2	T3	T4	T5
Requirements	R0	•	•	•			◆
	R1	•	•			•	
	R2				•		
	R3	•				•	
	R4	•			•	•	
	R5		•	•	•		◆
	R6		•	•	•		

Test Case Selection: Random

- Randomly choose next test case

Choosing T2
covers R0, R5, R6

Choosing T1 also
covers R1

Choosing T0
covers R3, R4

Choosing T5 adds
nothing

Choosing **T3** gets
R2

		Test Cases					
		T0	T1	T2	T3	T4	T5
Requirements	R0	•	•	•			•
	R1	•	•			•	
	R2				♦		
	R3	•				•	
	R4	•			♦	•	
	R5		•	•	♦		•
	R6		•	•	♦		

Test Case Selection: Random

- Randomly choose next test case

Reduced test suite:
{T0, T1, T2, T3, T5}

		Test Cases					
		T0	T1	T2	T3	T4	T5
Requirements	R0	•	•	•			•
	R1	•	•			•	
	R2				•		
	R3	•				•	
	R4	•			•	•	
	R5		•	•	•		•
	R6		•	•	•		

Test Case Selection: Greedy

- Select next test case to cover most uncovered requirements

		Test Cases					
		T0	T1	T2	T3	T4	T5
Requirements	R0	•	•	•			•
	R1	•	•			•	
	R2				•		
	R3	•				•	
	R4	•			•	•	
	R5		•	•	•		•
	R6		•	•	•		

Test Case Selection: Greedy

- Select next test case to cover most uncovered requirements

Choosing **T1** covers
R0, R1, R5, R6

		Test Cases					
		T0	T1	T2	T3	T4	T5
Requirements	R0	•	◆	•			•
	R1	•	◆			•	
	R2				•		
	R3	•				•	
	R4	•			•	•	
	R5		◆	•	•		•
	R6		◆	•	•		

Test Case Selection: Greedy

- Select next test case to cover most uncovered requirements

Choosing T1 covers
R0, R1, R5, R6

Choosing **T3** covers
R2, R4

		Test Cases					
		T0	T1	T2	T3	T4	T5
Requirements	R0	•	•	•			•
	R1	•	•			•	
	R2				◆		
	R3	•				•	
	R4	•			◆	•	
	R5		•	•	◆		•
	R6		•	•	◆		

Test Case Selection: Greedy

- Select next test case to cover most uncovered requirements

Choosing T1 covers
R0, R1, R5, R6

Choosing T3 covers
R2, R4

Choosing **T4** covers
R3

		Test Cases					
		T0	T1	T2	T3	T4	T5
Requirements	R0	•	•	•			•
	R1	•	•			◆	
	R2				•		
	R3	•				◆	
	R4	•			•	◆	
	R5		•	•	•		•
	R6		•	•	•		

Test Case Selection: Greedy

- Select next test case to cover most uncovered requirements

Reduce Suite:

{T1, T3, T4}

		Test Cases					
		T0	T1	T2	T3	T4	T5
Requirements	R0	•	•	•			•
	R1	•	•			•	
	R2				•		
	R3	•				•	
	R4	•			•	•	
	R5		•	•	•		•
	R6		•	•	•		

Test Case Selection: HGS

- Select next test case to cover the least-covered requirement

Cardinality: # of test cases that cover each requirement

			Test Cases					
			T0	T1	T2	T3	T4	T5
Requirements	R0	4	●	●	●			●
	R1	3	●	●			●	
	R2	1				●		
	R3	2	●				●	
	R4	3	●			●	●	
	R5	4		●	●	●		●
	R6	3		●	●	●		

Test Case Selection: HGS

- Select next test case to cover the least-covered requirement

Only **T3** covers **R2**

			Test Cases					
			T0	T1	T2	T3	T4	T5
Requirements	R0	4	•	•	•			•
	R1	3	•	•			•	
	R2	1				•		
	R3	2	•				•	
	R4	3	•			•	•	
	R5	4		•	•	•		•
	R6	3		•	•	•		

Test Case Selection: HGS

- Select next test case to cover the least-covered requirement

Only **T3** covers **R2**

Choosing **T3** covers **R2, R4, R5, R6**

		Test Cases						
		card	T0	T1	T2	T3	T4	T5
Requirements	R0	4	•	•	•			•
	R1	3	•	•			•	
	R2	1				◆		
	R3	2	•				•	
	R4	3	•			◆	•	
	R5	4		•	•	◆		•
	R6	3		•	•	◆		

Test Case Selection: HGS

- Select next test case to cover the least-covered requirement

Only T3 covers R2

Choosing T3 covers R2, R4, R5, R6

R3 is covered by two test cases.

Choose the test case that covers most uncovered requirements, T0

		Test Cases						
		card	T0	T1	T2	T3	T4	T5
Requirements	R0	4	•	•	•			•
	R1	3	•	•			•	
	R2	1				◆		
	R3	2	•				•	
	R4	3	•			◆	•	
	R5	4		•	•	◆		•
	R6	3		•	•	◆		

Test Case Selection: HGS

- Select next test case to cover the least-covered requirement

Only **T3** covers R2

Choosing T3 covers R2, R4, R5, R6

R3 is covered by two test cases.

Choose the test case that covers most uncovered requirements, **T0**

		Test Cases						
		card	T0	T1	T2	T3	T4	T5
Requirements	R0	4	◆	●	●			●
	R1	3	◆	●			●	
	R2	1				●		
	R3	2	◆				●	
	R4	3	◆			●	●	
	R5	4		●	●	●		●
	R6	3		●	●	●		

Test Case Selection: HGS

- Select next test case to cover the least-covered requirement

Reduced Suite:

{T0, T3}

			Test Cases					
			T0	T1	T2	T3	T4	T5
Requirements	R0	4	•	•	•			•
	R1	3	•	•			•	
	R2	1				•		
	R3	2	•				•	
	R4	3	•			•	•	
	R5	4		•	•	•		•
	R6	3		•	•	•		

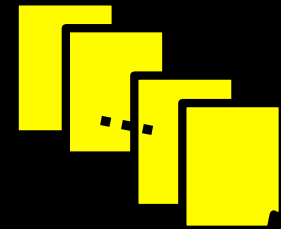
Test Case Selection Alternatives

- Select test case until suite satisfies criterion
 - **Random**: randomly
 - **Greedy**: test case that covers most requirements
 - **HGS**: test case that covers the least-covered requirement

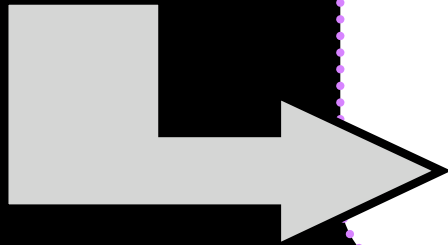
Test Case Selection: Expected Tradeoffs

- Random
 - + Simple algorithm
 - Larger reduced suites
- Greedy
 - + Closer to minimal reduced suite
 - But not minimal
- HGS
 - + Approximates minimal covering reduced suite
 - More complicated algorithm (tie-breaking strategies)

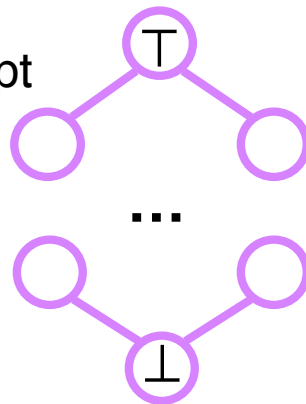
Concept-based Reduction



Original test suite T

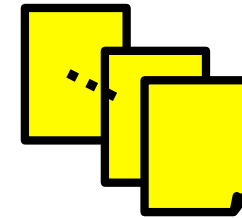
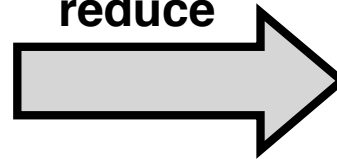


create concept lattice



concept lattice

reduce



Reduced test suite T'

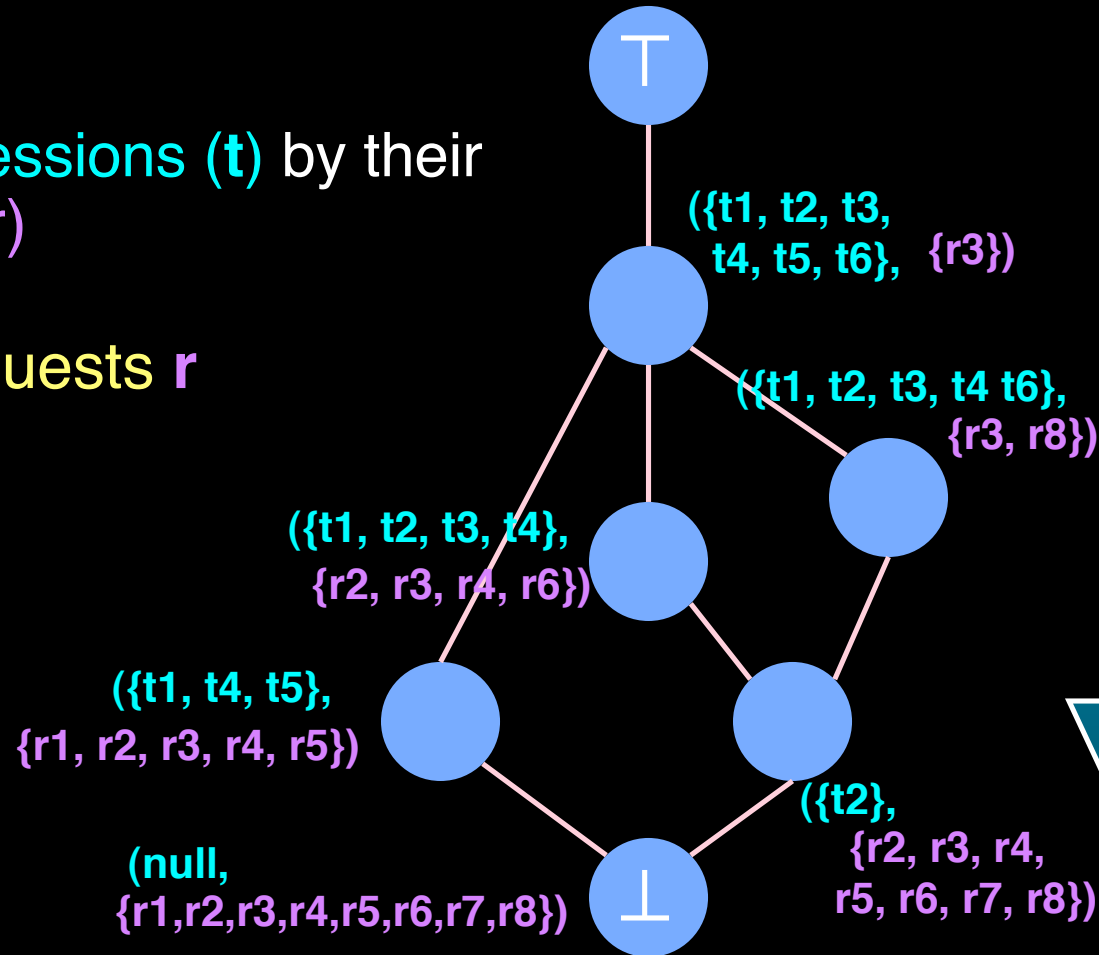
- Designed for Web applications [ASE04]
- Cluster user sessions by common URLs
 - Represent similar use cases
- Apply heuristic to select from clusters

Clustering User Sessions via Concept Analysis

$(\{t_1, t_2, t_3, t_4, t_5, t_6, t_7\}, \text{null})$

Cluster user sessions (t) by their single URLs (r)

Relation: t requests r



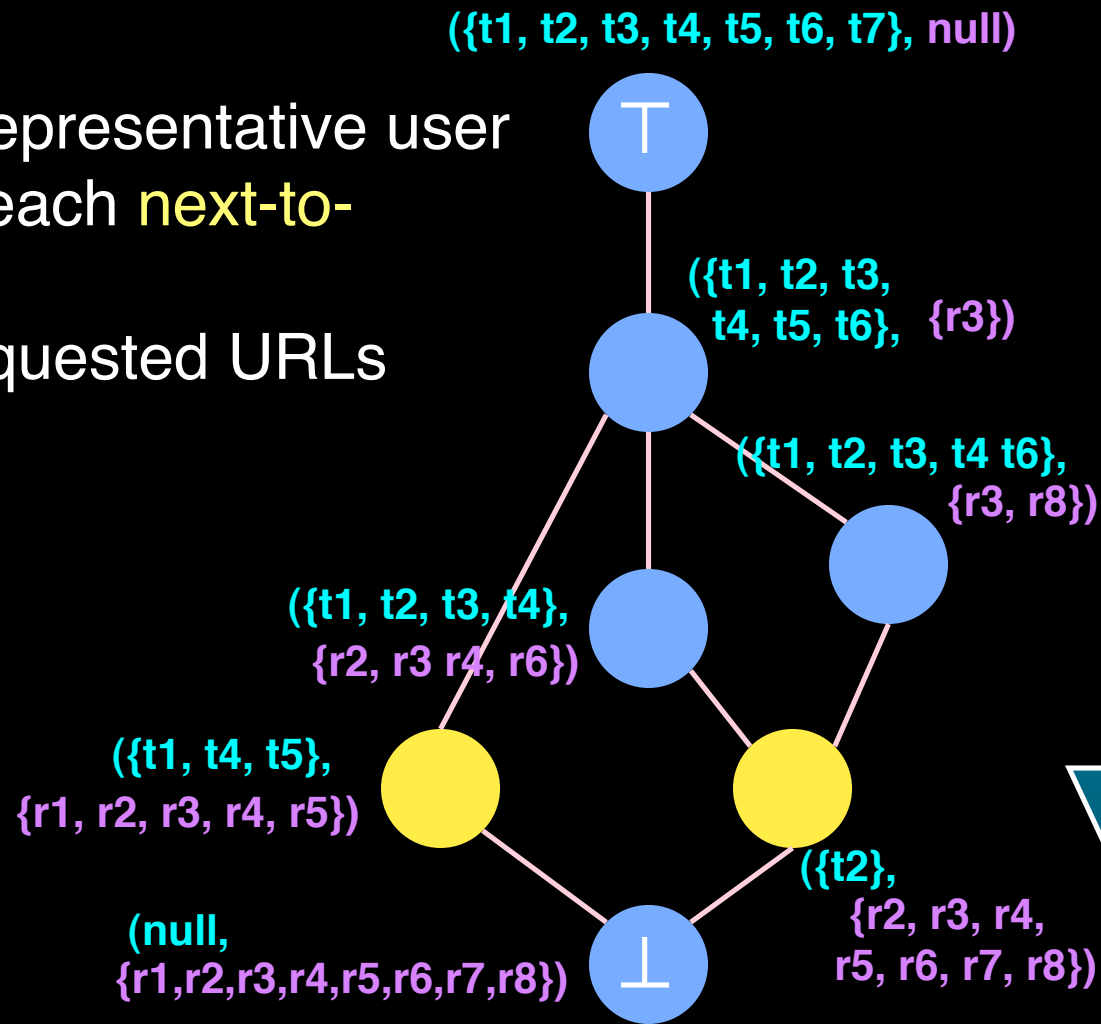
Attribute similarity increases

[ASE04]

Test Suite Reduction Heuristic

Choose one representative user session from each **next-to-bottom node**

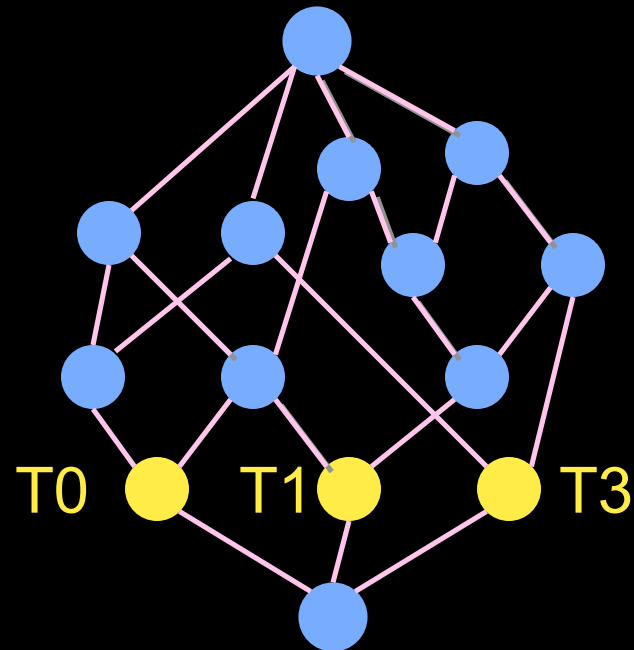
- Union of requested URLs



[ASE04]

Concept-based Reduction: Example

- Choose from next-to-bottom nodes
 - Side-effect: covers URLs



Only 1 session in each next-to-bottom node

		Test Cases					
		T0	T1	T2	T3	T4	T5
Requirements	R0	•	•	•			•
	R1	•	•			•	
	R2				•		
	R3	•				•	
	R4	•			•	•	
	R5		•	•	•		•
	R6		•	•	•		

Empirical Study: Questions

- How well does each technique reduce the test suite?
- How effective is the program coverage of each reduced suite?
- How effective is the fault detection of each reduced suite?
- What are the time and space costs of each technique?

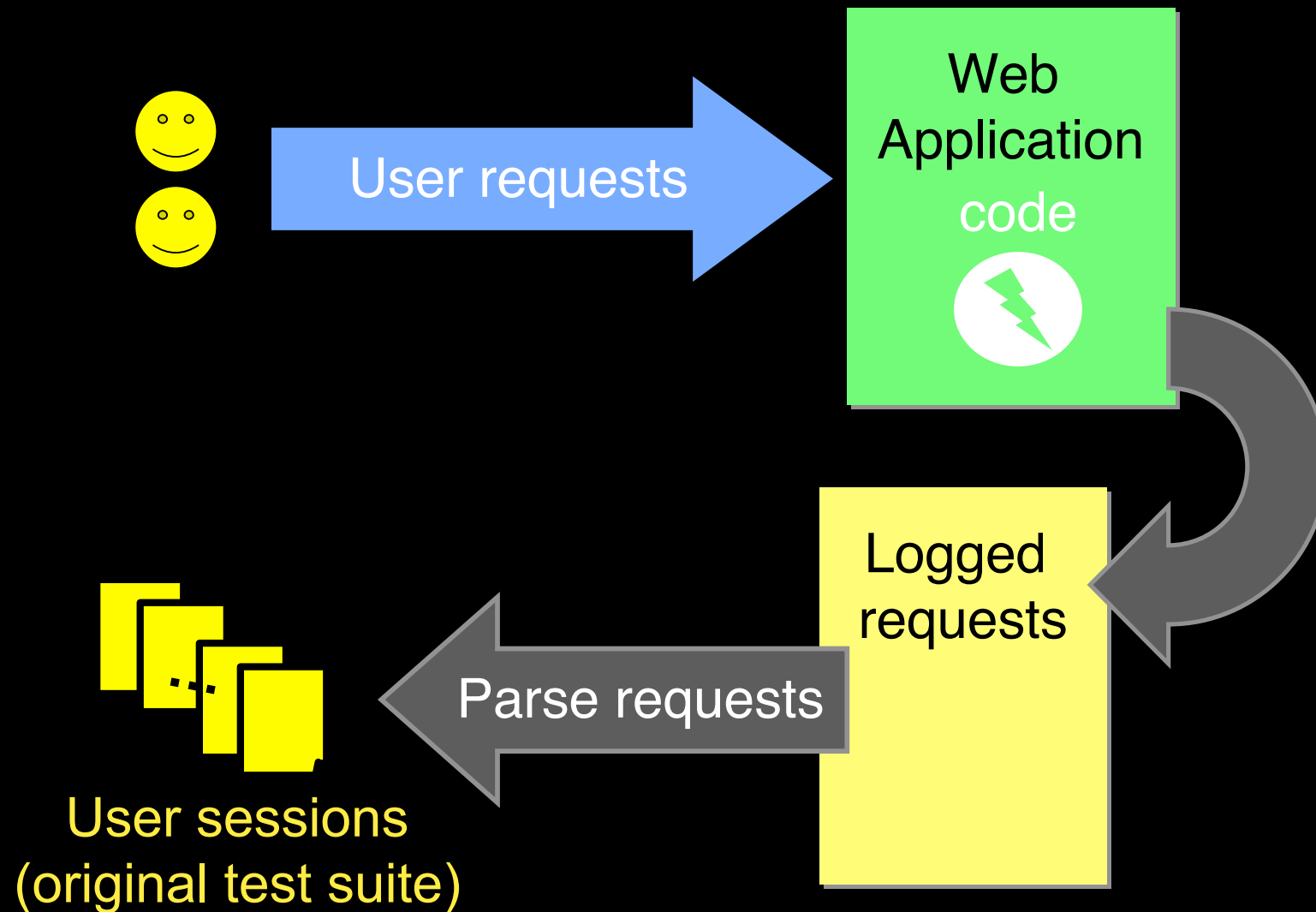
Empirical Study: Expected Results

- How well does each technique **reduce** the test suite?
 - HGS approximates minimal covering set
 - Reduced Suite Size:
Random > Greedy, Concept > HGS
- How effective is the **program coverage** of each reduced suite?
 - Program-based *must* match original suite's
 - Concept represents use cases not included by simple URL coverage
 - **Program-requirements-based \geq Concept**
 - **Concept > URL-requirements-based**

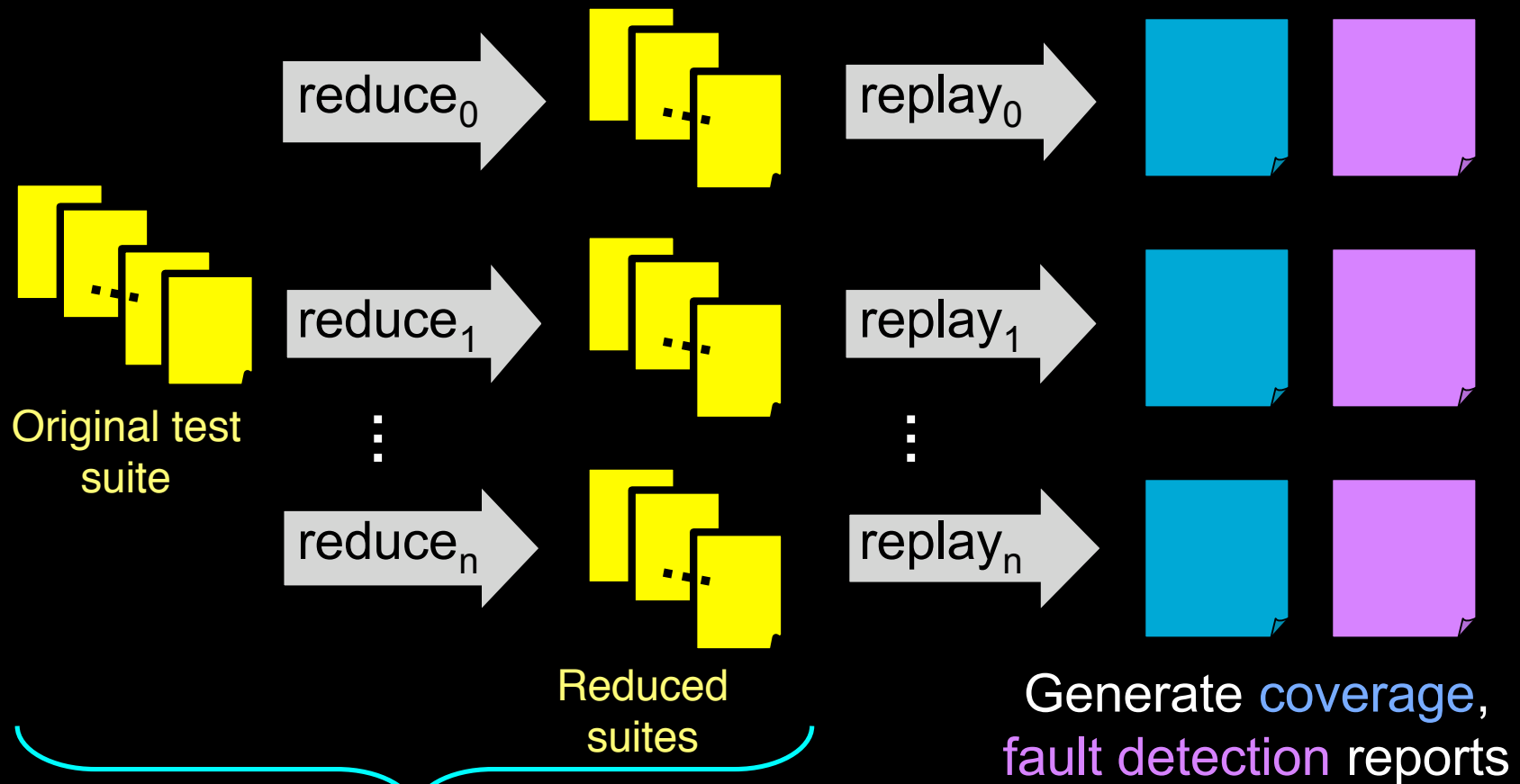
Empirical Study: Expected Results

- How effective is the **fault detection** of each reduced suite?
 - Concept represents use cases not captured by URL coverage
 - **Program-requirements-based \geq Concept**
 - **Concept $>$ URL-requirements-based**
- What are the **time** and **space costs** of each technique?
 - Requirements-based: creating req. mappings
 - Concept: creating lattice
 - **Requirements-based $>$ Concept**

Empirical Study: Methodology



Empirical Study: Methodology



Measure time, space to generate reduced suites

- includes generating mappings, concept lattice

Compared techniques

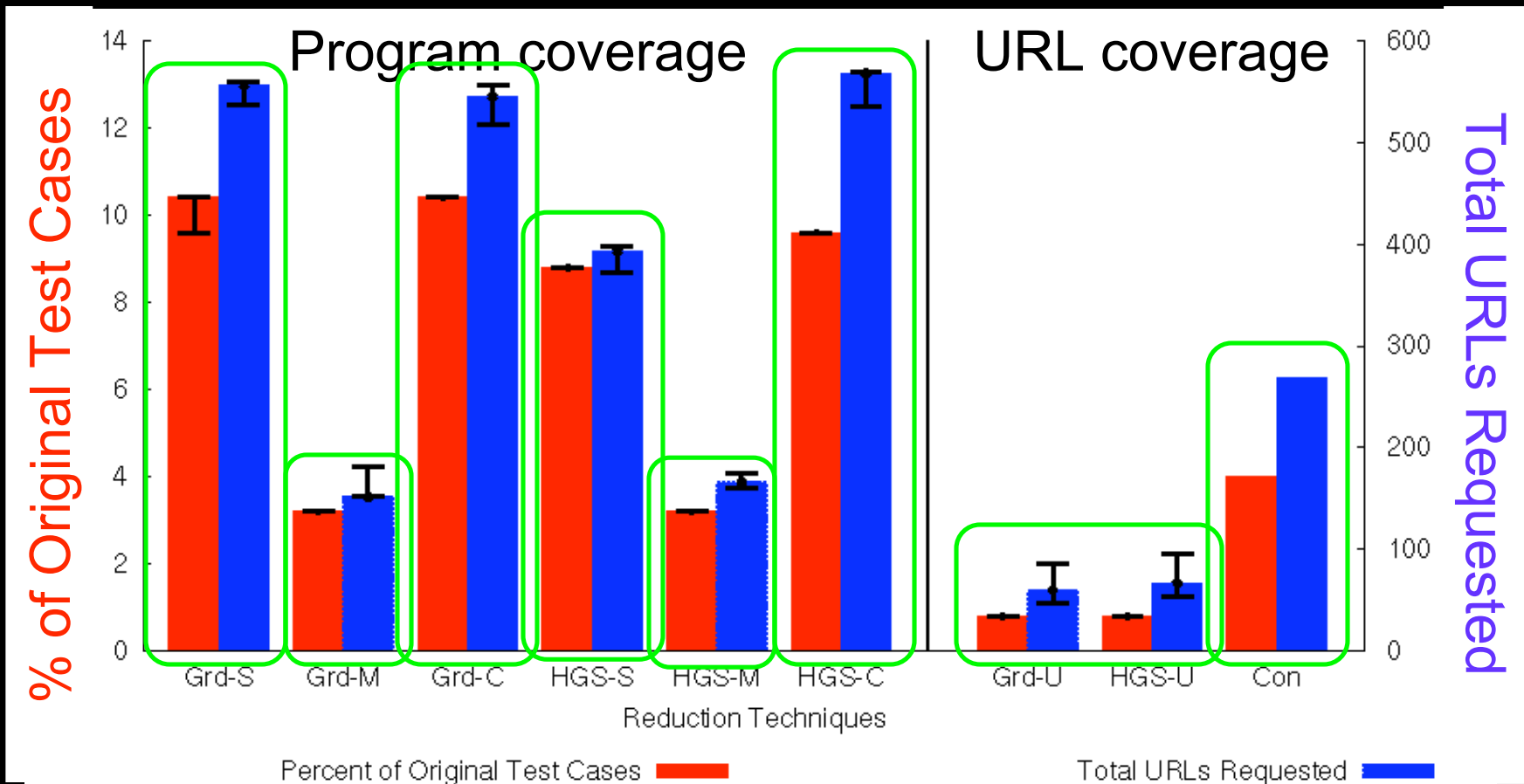
- Requirements-based
 - Selection: Random, Greedy, HGS
 - Requirements: all-statements, all-methods, all-conditionals, all-URLs
 - HGS, Greedy, Random are **nondeterministic**
 - Run 100 times for each requirement
 - Generated **1200 reduced suites** for each app
- Concept-based
 - Selection: from next-to-bottom nodes
 - If >1 session in node,
 - choose randomly, most URLs, least URLs

Subject Applications

➤ Java-based Web applications

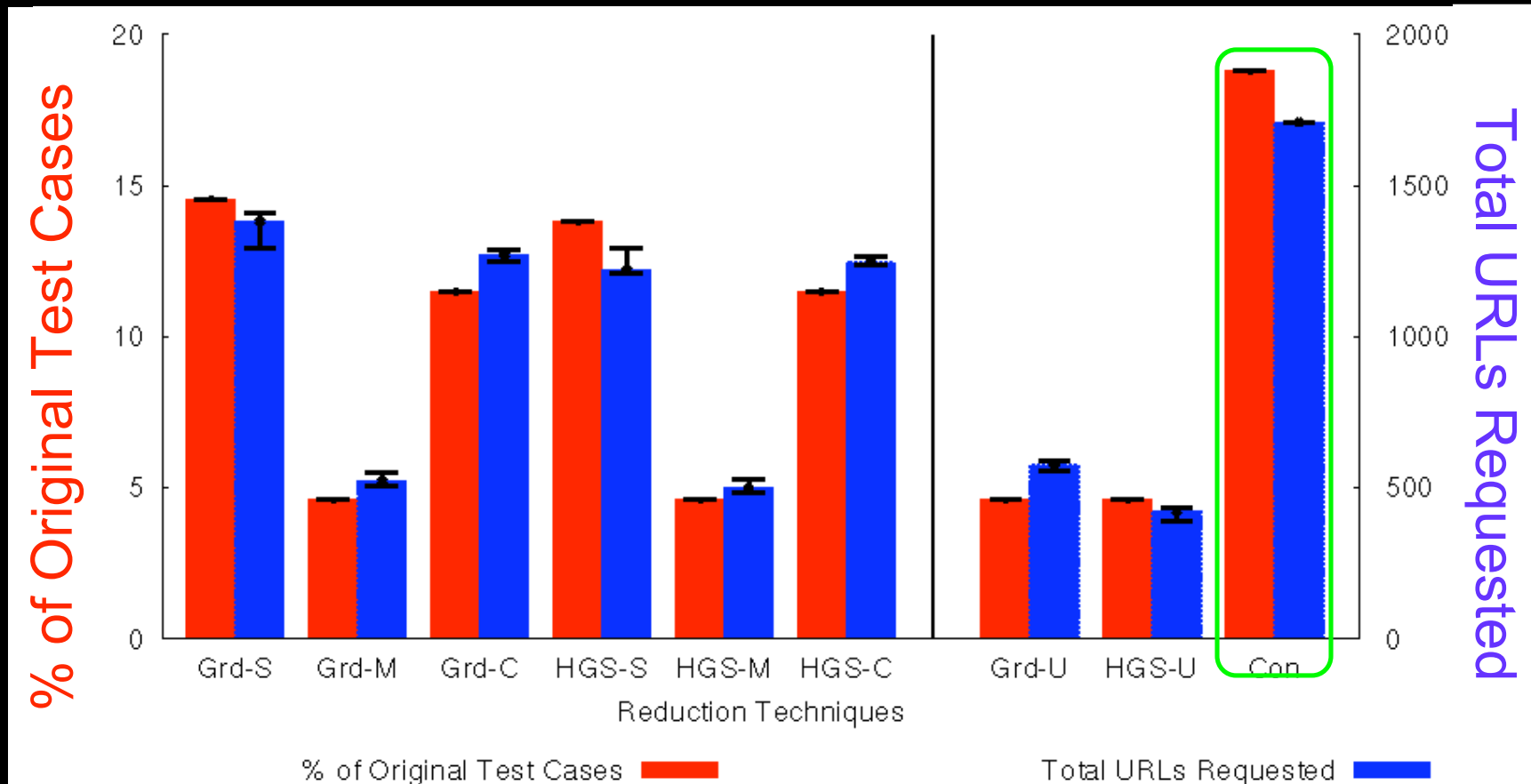
Metrics	Bookstore	CPM
Classes	11	75
Methods	385	172
Conditionals	1808	1274
NC LOC	7791	9300
Seeded Faults	40	86
# User Sessions	125	261
Total URLs Req	3640	3881

Bookstore: Size of Reduced Suites



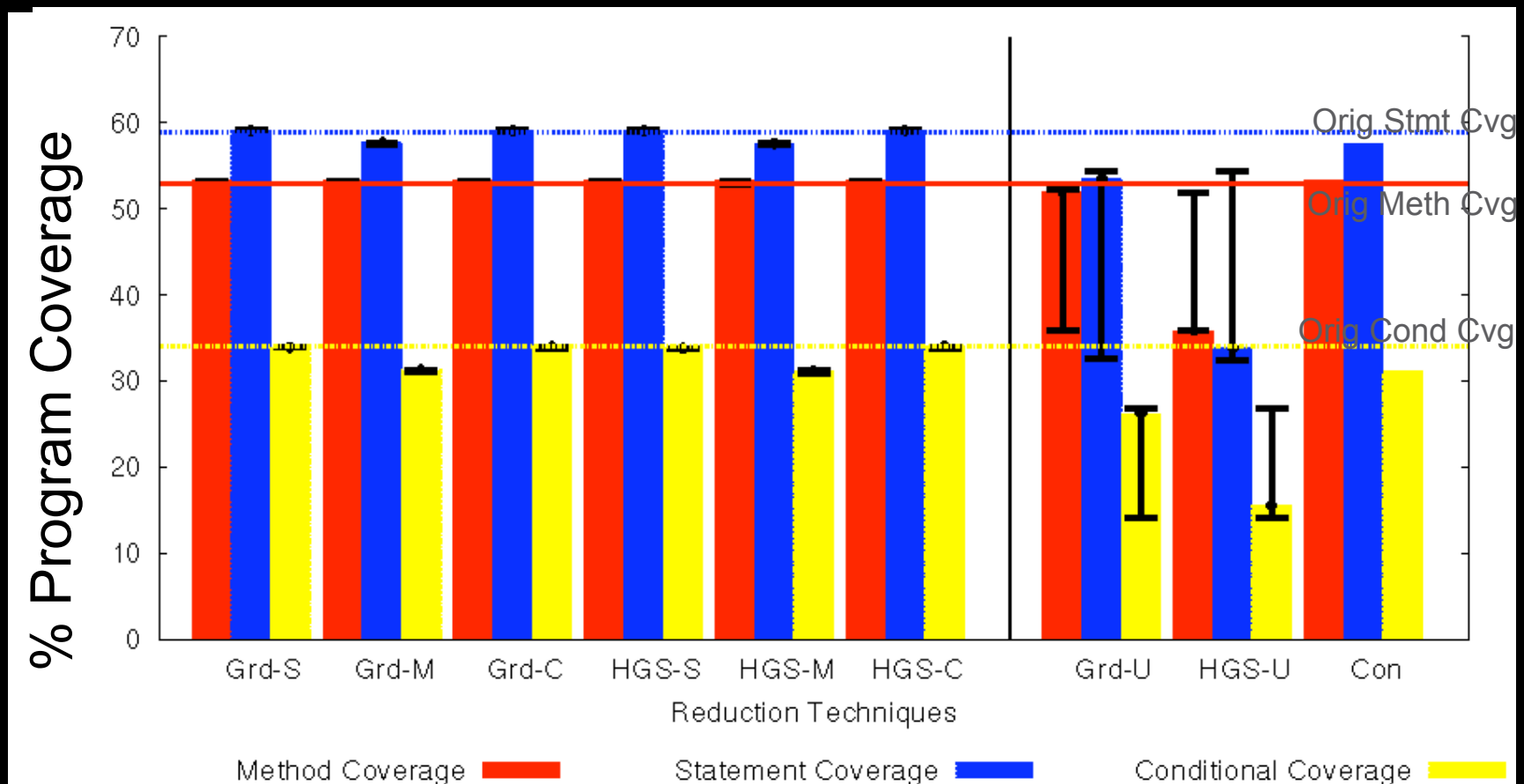
- Greedy/HGS Stmt, Cond > Concept
- Concept > Greedy/HGS Method, URL

CPM: Size of Reduced Suites



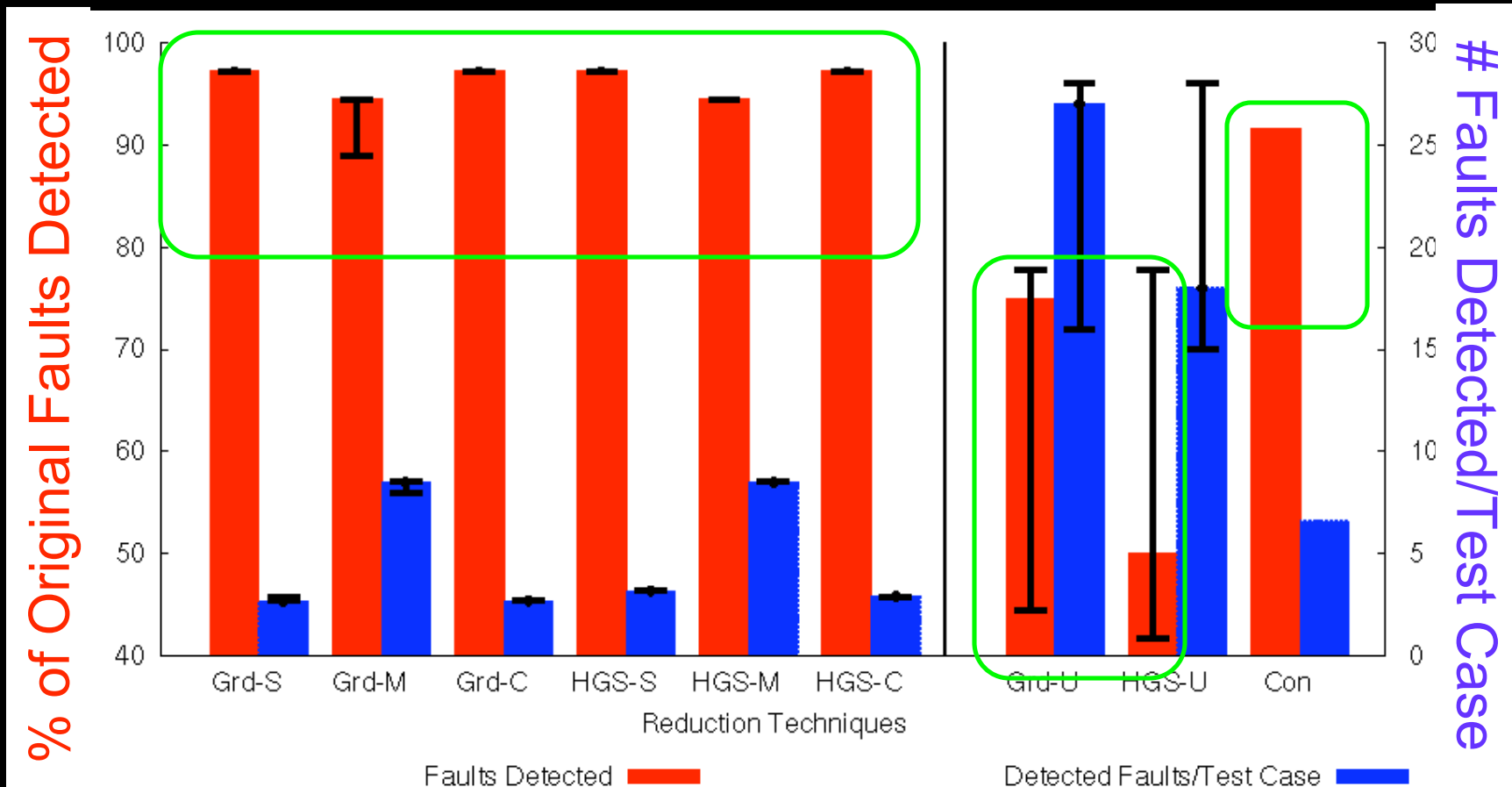
- Concept > all others
- Greedy/HGS: Stmt, Cond > URL, Method

Bookstore: Program Coverage



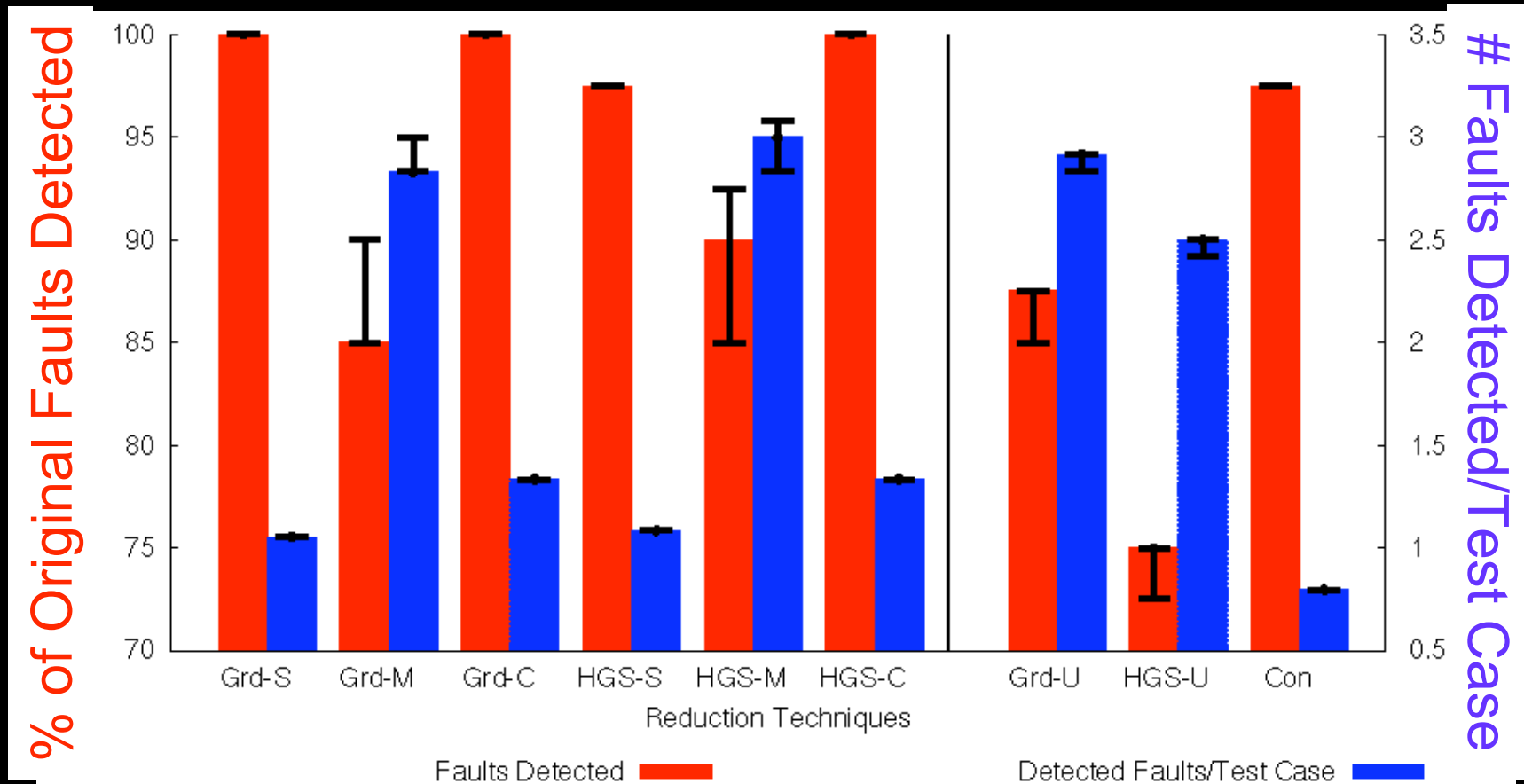
- Concept nearly matches original suite's cvg
- Simple URL coverage: not sufficient

Bookstore: Detected Faults



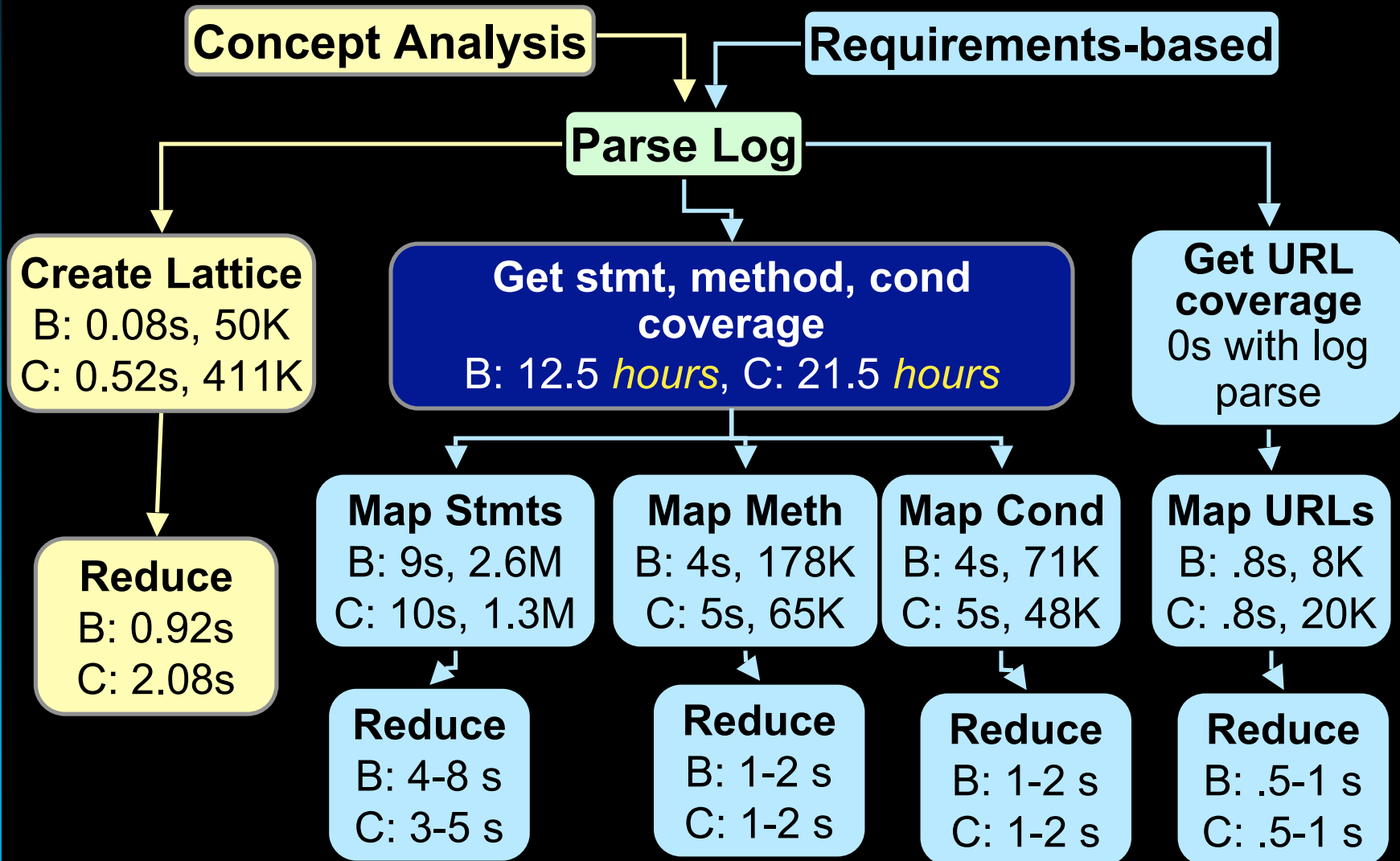
- Greedy/HGS Prog > Concept
- Concept > Greedy/HGS URL

CPM: Detected Faults



- Better fault detection with larger suites
- Greedy/HGS stmt,cond > Concept > Greedy/HGS url, meth

Time and Space Costs



Analysis Summary

- Coverage, Fault Detection
 - ✓ Concept \approx Program-reqs-based
- Size
 - Concept $\langle \rangle$ HGS
 - Depends on req, original suite
 - Nondeterministic algorithms
 - ✓ Random $>$ Greedy \geq HGS
- Time Cost
 - ✓ Program-reqs-based $>>$ Concept

Study Discussion

- Generalize findings as original test suite increases
 - Requirements-mapping cost increases
 - More variation in reduced suite for reqs-based techniques
- Recommended Reduction: **Concept**
 - Much **cheaper** reduction cost
 - **Consistent, comparable** coverage, fault detection

Future Work

- Extend experimental study
 - Different size of original test suites
 - Larger original test suites
 - More applications
 - Additional variations of Concept-based
- Characterize undetected faults
 - Guide improvements to Concept-based

<http://www.cis.udel.edu/~hiper>