#### Reducing the Costs of Bounded-Exhaustive Testing

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What/Why? Costs Contributions

# Bounded-Exhaustive Testing

Automated testing approach that checks a system under test for all inputs within given bounds

- Many faults can be revealed with small inputs
- Exhaustive testing within bounds catches "corner cases"

Used in academia and industry to test real-world applications

- Refactoring Engines Eclipse & NetBeans [Daniel et al. FSE 07]
- ► Web Traversal Agent from Google [Misailovic et al. FSE 07]
- ► XPath Compiler at Microsoft [Stobie ENTCS 05]
- Constraint Analyzer [Khurshid & Marinov J-ASE 04]
- ► Fault-Tree Analyzer for NASA [Sullivan et al. ISSTA 04]
- ► Protocol for Dynamic Networks [Khurshid & Marinov ENTCS 01]

What/Why? Costs Contributions

# Steps of Bounded-Exhaustive Testing

#### User

- Describes inputs and bounds
- Provides test oracles

Tool

- Generates all inputs within bounds
- Executes them on system under test
- Checks outputs using oracles

User

- Waits for generation/execution/checking
- Inspects failing tests

What/Why? Costs Contributions

# Costs of Bounded-Exhaustive Testing

User	. Human time
<ul> <li>Describes inputs and bounds</li> </ul>	
<ul> <li>Provides test oracles</li> </ul>	
Tool	. Machine time
Generates all inputs within bounds	
<ul> <li>Executes them on system under test</li> </ul>	
<ul> <li>Checks outputs using oracles</li> </ul>	
User	. Human time
<ul> <li>Waits for generation/execution/checking</li> </ul>	
Inspects failing tests	

Bounded-Exhaustive Testing Case Study: Testing Refactoring Engines

Reducing Costs

Conclusions

What/Why? Costs Contributions

#### Costs can be significant

Example magnitudes from our case study

- ▶ 1-2 hours to describe inputs (not addressed in this paper)
- Thousands of inputs generated/executed/checked
- Total testing time takes hours
- Finding the first failure can take tens of minutes
- Hundreds of failing tests need to be inspected

What/Why? Costs Contributions

## Contributions: Reducing several costs

Three novel techniques that reduce several costs

- Machine time
- Human waiting time
- Inspection effort

Case study: Testing of Eclipse Refactoring Engine

Refactorings & Refactoring Engines Why Test Refactoring Engines? Bounded-Exhaustive Testing of Refactoring Engines Results and Costs

# Refactorings & Refactoring Engines

Refactorings are behavior-preserving program transformations that improve program design

- Change internals of code, not external behavior
- Examples: rename class, move method, encapsulate field, etc.

Refactoring engines are tools that automate the application of refactorings

Key component of most modern IDEs such as Eclipse

Refactorings & Refactoring Engines Why Test Refactoring Engines? Bounded-Exhaustive Testing of Refactoring Engines Results and Costs

### Refactoring Example: Pull Up Method

Moves a method from a subclass into one of its superclasses



Refactorings & Refactoring Engines Why Test Refactoring Engines? Bounded-Exhaustive Testing of Refactoring Engines Results and Costs

### Refactoring Example: Pull Up Method

Moves a method from a subclass into one of its superclasses

```
// Before refactoring
class A {
} 

class B extends A {
    int f;

    void m()| {
        this.f = 0;
    }
}
```

Warning: Cannot move 'm' without moving 'f'

Refactorings & Refactoring Engines Why Test Refactoring Engines? Bounded-Exhaustive Testing of Refactoring Engines Results and Costs

# Why Test Refactoring Engines?

Widely used

Complex

- Complex inputs: programs
- Complex code: program analysis and transformation

Can silently corrupt large parts of programs

A bug in refactoring engine can be as unpleasant as a bug in compiler or libraries

Refactorings & Refactoring Engines Why Test Refactoring Engines? Bounded-Exhaustive Testing of Refactoring Engines Results and Costs

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# Bounded-Exhaustive Testing of Refactoring Engines

ASTGen framework [Daniel et al. FSE 07]:

- Allows users to write Abstract Syntax Tree (AST) generators
- Provides library of basic generators which can be composed
- Executes generators to generate ASTs (all within bounds)
- Applies refactorings on generated ASTs
- Checks results with oracles

Refactorings & Refactoring Engines Why Test Refactoring Engines? Bounded-Exhaustive Testing of Refactoring Engines Results and Costs

## ASTGen: Example Inputs

Description: Three classes related through sub/super class and inner/outer class relationships. A sub class has a method that refers to a field in a super class and also has another method that invokes that method

```
public class A {
                          public class A {
                                                   public class A {
public int f;
                           public int f;
                                                    public int f;
class C {
                           class B extends C {
                                                    class B extends C {
  public int f:
                            private void m(){
                                                     private void m(){
                                                      super.f=0;
                             new A().f=0;
                            void mPrime(){
                                                     void mPrime(){
class B extends A.C {
  private void m(){
                             m();
                                                      m();
  this.f=0;
  void mPrime(){
                                                    class C {
  m();
                          class C
                                                     public int f;
                           public int f;
                                                    }
```

Refactorings & Refactoring Engines Why Test Refactoring Engines? Bounded-Exhaustive Testing of Refactoring Engines Results and Costs

#### ASTGen: Example Generator

#### Triple Class Method Child Generator:



Refactorings & Refactoring Engines Why Test Refactoring Engines? Bounded-Exhaustive Testing of Refactoring Engines Results and Costs

## Results and Costs

Promising results

- Dozens of faults found and reported in Eclipse and NetBeans
- Being included in the NetBeans testing process

Costs

		Num of	Total		Num of	Num of
Refactoring	Generator	Inputs	Time	TTFF	Failures	Faults
EncapsulateField	DualClassFieldReference	23760	427:09	73:34	486	3
PullUpMethod	TripleClassMethodChild	1152	27:02	9:09	160	2
	DualClassMethodChild	576	13:22	n/a	0	0
RenameField	DualClassFieldReference	23760	629:01	n/a	0	0

Time To First Failure (TTFF)

- User wait time after starting tool until a failing test is found
- Important metric in an interactive testing scenario

Sparse Test Generation Structural Test Merging Oracle based Test Clustering

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#### Three Techniques to Reduce Costs

Sparse Test Generation

Reduces TTFF (but increases the total time)

Structural Test Merging

Reduces the total time and TTFF

Oracle-based Test Clustering

Reduces human effort for inspection

Sparse Test Generation Structural Test Merging Oracle based Test Clustering

#### Sparse Test Generation

Observation: Failing tests often located close together due to combinatorial nature of generation



Intuition: Jump through input space to find failures faster

 Width and periodicity of failing runs unknown, so random jumps within bounded length

Sparse Test Generation Structural Test Merging Oracle based Test Clustering

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### Sparse Test Generation

Two passes through test generation:

- Sparse Generation
  - Jumps through the generation sequence with random jumps within bounded length
  - Significantly improve TTFF while slightly increasing total time
  - $\blacktriangleright$  Random jump lengths between 1-20, expect  ${\sim}10\%$  increase in total time
- Exhaustive Generation
  - Performs basic exhaustive generation
  - No compromise in failure-detection capability

Sparse Test Generation Structural Test Merging Oracle based Test Clustering

## Sparse Test Generation Results

#### Up to 10x improvement in TTFF

 $ightarrow \sim 10\%$  increase in Total Time

		Total Time		Time TTFF		Num of	Num of
Refactoring	Generator	Dense	Sparse	Dense	Sparse	Failures	Faults
EncapsulateField	DualClassFieldReference	n/a 13:22 14:14		73:34	7:14	486	3
Dull In Mathad	TripleClassMethodChild			9:09	1:01	160	2
Pullopiviethod	DualClassMethodChild					0	0
RenameField	DualClassFieldReference	629:01	689:17	n/a		0	0

Sparse Test Generation Structural Test Merging Oracle based Test Clustering

### Sparse Test Generation Results

 Also significantly improves APFD (Average Percentage Fault Detection)

		AF	PFD	Num of	Num of
Refactoring	Generator	Dense	Sparse	Failures	Faults
EncapsulateField	DualClassFieldReference	58.03	97.59	486	3
Dull In Mathead	TripleClassMethodChild	13.19	95.77	160	2
FullOpiviethou	DualClassMethodChild	n/a		0	0
RenameField	DualClassFieldReference			0	0

Sparse Test Generation Structural Test Merging Oracle based Test Clustering

# Structural Test Merging

Inspired by previous work on Test Granularity [Rothermel et al. ICSE 02]

- Append smaller tests to form larger tests
- Smaller number of larger tests rather than larger number of smaller tests
- Save setup and teardown costs
- Could mask old faults or reveal new faults

#### Challenge and solution

- Cannot generally append two ASTs to form larger ASTs
- Merge structurally smaller inputs to form larger inputs
- Save setup, teardown, and execution costs

Sparse Test Generation Structural Test Merging Oracle based Test Clustering

# Structural Test Merging: Recall the Example

#### Unmerged generator structure:



Sparse Test Generation Structural Test Merging Oracle based Test Clustering

# Structural Test Merging: Unmerged inputs

#### Unmerged test inputs from generator

public class A {
 public int f;
 class B extends C {
 private void m(){
 this.f=0;
 }
 void mPrime(){
 m();
 }
 }
 class C {
 public int f;
 }
}

public class A {
 public int f;
 class B extends C {
 private void m(){
 [super.f=0;]
 }
 void mPrime(){
 m();
 }
 }
}
class C {
 public int f;
}

Sparse Test Generation Structural Test Merging Oracle based Test Clustering

# Structural Test Merging: Merged versions

#### Merged generator and test input



Sparse Test Generation Structural Test Merging Oracle based Test Clustering

## Structural Test Merging: Results

Refactoring	Generator	Merging Level	Num of Inputs	Total Time	TTFF	Num of Failures	Num of Faults
		M0	23760	427:09	73:34	486	3
EncapsulateField	DualClassFieldReference						
	TripleClassMethodChild						
PullUpMethod	DualClassMethodChild						
RenameField	DualClassFieldReference						

Sparse Test Generation Structural Test Merging Oracle based Test Clustering

## Structural Test Merging: Results

Refactoring	Generator	Merging Level	Num of Inputs	Total Time	TTFF	Num of Failures	Num of Faults
		M0	23760	427:09	73:34	486	3
EnconculateField		M1	3960	71:50	12:03	354	3
Encapsulaterielu	DualClassFieldReference						
	TripleClassMethodChild						
PullUpMethod							
	DualClassMethodChild						
RenameField	DualClassFieldReference						

Sparse Test Generation Structural Test Merging Oracle based Test Clustering

## Structural Test Merging: Results

		Merging	Num of	Total		Num of	Num of
Refactoring	Generator	Level	Inputs	Time	TTFF	Failures	Faults
Enconculate Field		M0	23760	427:09	73:34	486	3
		M1	3960	71:50	12:03	354	3
Encapsulaterield	DualClassFieldReference	M2	72	1:19	0:13	31	2
		M3	18	0:26	0:06	8	2
	TripleClassMethodChild						
PullupMothod							
Fullopivietilod	DualClassMethodChild						
RenameField							
	DualClassEieldBoforopoo						
	DualClassFieldReference						

Sparse Test Generation Structural Test Merging Oracle based Test Clustering

# Structural Test Merging: Results

		Merging	Num of	Total		Num of	Num of
Refactoring	Generator	Level	Inputs	Time	TTFF	Failures	Faults
		M0	23760	427:09	73:34	486	3
En annovilata Einid	DualClass Field Deferrers	M1	3960	71:50	12:03	354	3
Elicapsulaterielu	DualClassFieldReference	M2	72	1:19	0:13	31	2
		M3	18	0:26	0:06	8	2
	TripleClassMethodChild	M0	1152	27:02	9:09	160	2
		M1	192	3:57	1:25	96	2
PullupMothod		M2	48	0:47	0:17	24	2
Fullopivietilod	DualClassMethodChild	M0	576	13:22	n/a	0	0
		M1	96	1:49	n/a	0	0
		M2	24	0:21	n/a	0	0
RenameField		M0	23760	629:01	n/a	0	0
	DualClass Field Deference	M1	3960	107:26	n/a	0	0
	DualClassFieldReference	M2	72	1:56	n/a	0	0
		M3	18	0:34	n/a	0	0

Sparse Test Generation Structural Test Merging Oracle based Test Clustering

# Oracle-based Test Clustering

Inspired by work in test clustering/filtering/indexing/bucketing

- Relies on oracles that provide more than just pass/fail
- Groups failing tests based on oracle information to reduce the inspection time
- Abstraction of information provided by oracles
  - "field f not visible" instead of "field f not visible at line 2 col 5"

Sparse Test Generation Structural Test Merging Oracle based Test Clustering

### Oracle-based Test Clustering Results

#### Handful of clusters instead of hundreds of failures

		Num of	Num of	Num of
Refactoring	Generator	Failures	Clusters	Faults
EncapsulateField	DualClassFieldReference	486	4	3
Bull InMethod	TripleClassMethodChild	160	3	2
Pullopiviethod	DualClassMethodChild	0	0	0
RenameField	DualClassFieldReference	0	0	0

Comparison with three other techniques available in the paper

## Conclusions

Bounded-Exhaustive Testing effective but has many costs Presented three techniques that reduce some costs

- Sparse Test Generation reduces TTFF
- Structural Test Merging reduces total machine time
- Oracle-based Test Clustering reduces human inspection effort

Ongoing work: reduce human effort in writing generators

- UDITA: unified declarative/imperative generation
- Promising results: shorter generators (easier to write), faster generation, more bugs