# Using Combinatorial Benchmark Construction to Improve the Assessment of Concurrency Bug Detection Tools

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# **Background**

# **Concurrency Testing**

- Provide code/requirements coverage metrics plus coverage of interleaving space!
  - Coverage-based testing with manual interleaving explorations
    - **Examples:** using different OS, different hardware configurations, hand-instrumentation of delays.
  - 2. Testing with noise makers
    - Example: IBM's Concurrent Testing Tool [EFN+02] which automatically instruments source code delays

# **Background**

## **Static Analysis**

- Use techniques like call-graph analysis and lock analysis to identify potential bugs without executing the software
- Trade-off compared to testing improved performance but possibility of spurious results.
- Examples: FindBugs [HP04], JLint [Art01], Chord [NPSG09], JSure [JSu], JTest [Par] and RSAR [LHDQ10]

[HP04] D. Hovemeyer and W. Pugh. Finding bugs is easy. SIGPLAN Not., 39(12):92{106, 2004. [Art01] C. Artho. Finding faults in multi-threaded programs. Master's thesis, Institute of Computer Systems, Federal Institute of Technology, Zurich/Austin, 2001.

[NPSG09] M. Naik, C.-S. Park, K. Sen, and D. Gay. Eective static deadlock detection. In 2009 IEEE 31st Int.Conf. on Software Engineering (ICSE), pages 386-396, 2009.

[JSu] JSure for concurrency. Web page: <a href="http://www.surelogic.com/concurrency-tools.html">http://www.surelogic.com/concurrency-tools.html</a>

[Par] Parsoft JTest - Java testing, static analysis, code review. Web page: http://www.parasoft.com/jsp/products/jtest.jsp/

[LHDQ10] Z. Luo, L. Hillis, R. Das, and Y. Qi. Eective static analysis to find concurrency bugs in Java. In Proc. Of 10th IEEE Int. Working Conf. on Source Code Analysis and Manipulation (SCAM), 2010.

# **Background**

## **Software Model Checking**

- A formal methods approach involving finite state modelling of a software system
- Uses exhaustive state space search to explore all interleavings – can also use heuristic search
- Examples: Java Pathfinder (JPF) [HP00], Bogor [RDH03]

[HP00] K. Havelund and T. Pressburger. Model checking Java programs using Java PathFinder. Int. Journal on Software Tools for Technology Transfer (STTT), 2(4), 2000.

[RDH03] Robby, M. B. Dwyer, and J. Hatclliff. Bogor: an extensible and highly-modular software model checking framework. In Proc. of ESEC/FSE-11, 267-276, 2003.

# **Comparing Concurrency Bug Detection Tools**

```
package account:
//import java.lang.*;
public class Account {
    double amount:
    String...name;
    //constructor
  public Account(String nm.double amnt ) {
        amount=amnt;
        name=nm;
  //functions
  synchronized void depsite(double money){
      amount+=money;
  synchronized void withdraw(double money){
      amount-=monev;
  synchronized void transfer(Account ac.double mn){
      amount-=mn;
      ac.amount+=mn:
 synchronized void print(){
  System.out.println(name + "--"+amount);
}//end of class Account
```

```
package account:
public class ManageAccount extends Thread {
  Account account:
  static Account() accounts=new Account(10);
  static int num=2://the number of the accounts
  static int accNum=0:
 int i://the index
  public ManageAccount(String name.double amount) {
      account=new Account(name.amount):
      i=accNum;
      accounts[i]=account;
     accNum=(accNum+1)%num;
  public void run(){
  account.densite(300):
  account.withdraw(100):
  Account acc=accounts[(i+1)%num]:
  account transfer(acc,99);
  static public void printAllAccounts(){
           for (int i=0; i<num: i++){
                if( ManageAccount.accounts[j]!=null){
                    ManageAccount.accounts[j].print();
}//end of class ManageAccount.
```

# **Comparing Concurrency Bug Detection Tools**

```
package account:
                                                package account:
//import java.lang.*;
nublic class Account {
   double amount:
   String...name;
   //constructor
 public Account(String nm.double amnt ) {
                       good program
                      detection tool fitness?
 synchronized void
                 withdraw(double money){
     amount-=money;
 synchronized void transfer(Account ac.double mn){
     amount-=mn;
     ac.amount+=mn:
synchronized void print(){
 System.out.println(name + "--"+amount);
}//end of class Account
```

```
public class ManageAccount extends Thread {
  Account account:
  static Account() accounts=new Account(10);
  static int num=2://the number of the accounts
  static int accNum=0;
  int i://the index
  public ManageAccount(String name_double amount) {
      account=new Account(name.amount);
  Account acc=accounts[(i+1)%num];
  account transfer(acc,99);
  static public void printAllAccounts(){
           for (int i=0:i<num:i++){
                if( ManageAccount.accounts[j]!=null){
                    ManageAccount.accounts[j].print();
}//end of class ManageAccount.
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# Comparing Concurrency Bug Detection Tools

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      account=new Account(name.amount):
      i=accNum;
     accounts[i]=account:
     accNum=(accNum+1)%num;
  public void run(){
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  Account acc=accounts[(i+1)%num]:
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                if( ManageAccount.accounts[j]!=null){
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```

# **Motivation**

### Challenge

- How do we assess the fitness of a particular concurrency bug detection tool?
  - How do we compare it with other tools?

### **Solution**

- Empirical methods + unbiased data
- Where can we get unbiased data (i.e., programs with real concurrency bugs?) – need a benchmark!

# What is a benchmark?

A benchmark is composed of three parts [SEH03]:

- Creation of a motivating comparison
- Development of a task sample (i.e., benchmark data)
- Identification or development of performance measures

# **Developing a Concurrency Benchmark**

Building a combinatorial model

Pairwise construction

3 Acquiring benchmark examples

# **Building a Combinatorial Model**

- Combinatorial Test Design (CTD) is a well-known test planning technique
  - The test space is modelled by a set of parameters, their respective values, and restrictions on the value combinations.
- The most common application of CTD is pairwise testing covers the interaction of every pair of parameters
- A test set that covers all possible pairs of parameter values can typically detect 50%-75% of the bugs in a program [DKL+99, TL02].

# **Building a Combinatorial Model (2)**

### **Parameter & Value Selection**

 We need to identify the set of parameters and values that characterize programs in the benchmark

## **Program Size**

| Parameter                                    | Small | Medium   | Large  |
|--|-------|----------|--------|
| Number of statements                         | < 10k | 10k-100k | > 100k |
| Number of critical regions                   | < 5   | 5-20     | >20    |
| Percentage of statements in critical regions | < 5%  | 5-15%    | > 15%  |

# **Building a Combinatorial Model (3)**

### **Number of Threads**

Maximum number of threads executing in parallel during program execution

| Small | Medium | Large  | Very Large |
|-------|--------|--------|------------|
| < 5   | 5-10   | 10-100 | > 100      |

# **Building a Combinatorial Model (4)**

## **Path Error Density**

The probability of a thread interleaving manifesting a bug

| Very Low | Low   | Medium | High  |
|----------|-------|--------|-------|
| < 2%     | 2-25% | 25-75% | > 75% |

# **Bug Depth**

Minimum depth along a path that a bug can be exhibited.
 Measured in number of context switches.

| Low  | Medium | High |
|------|--------|------|
| < 25 | 25-50  | > 50 |

# **Building a Combinatorial Model (5)**

### **Bug Pattern Type**

The kind of bug exhibited by the program.

### **Bug Pattern Name**

- Nonatomic operations assumed to be atomic
- Two-state access
- Wrong long or no lock
- Double-checked lock
- Sleep
- Losing a notify
- · Blocking critical section
- Orphaned thread
- Notify instead of notify all
- Interference
- Deadlock (deadly embrace)

# **Pairwise Construction**

- Using our combinatorial model we get 44 task samples
- The task samples are selected out of over
   14,000 different programs

|    | Program<br>Size – #<br>Statements | Program<br>Size – #<br>Critical<br>Regions | Program<br>Size – %<br>Statements<br>in Critical<br>Regions | # Threads | Path Error<br>Density | Bug<br>Depth | Bug Pattern              |
|----|-----------------------------------|--|---|-----------|-----------------------|--------------|--------------------------|
| 1  | Small                             | Small                                      | Large   | Small     | Medium                | High         | TwoStageAccess           |
| 2  | Medium                            | Small                                      | Medium  | Large     | VeryLow               | Medium       | NonAtomicAssumedAtomic   |
| 3  | Large                             | Medium                                     | Small   | Small     | Low                   | Medium       | BlockingCriticalSection  |
| 4  | Medium                            | Large                                      | Large   | Medium    | Low                   | Low          | Interference             |
| 5  | Small                             | Medium                                     | Medium  | VeryLarge | High                  | Low          | OrphanedThread           |
| 6  | Large                             | Large                                      | Small   | Large     | High                  | High         | NoLock                   |
| 7  | Medium                            | Large                                      | Small   | VeryLarge | Medium                | Medium       | LostNotify               |
| 8  | Small                             | Medium                                     | Small   | Medium    | VeryLow               | High         | NotifyInsteadOfNotifyAll |
| 9  | Large                             | Small                                      | Medium  | Medium    | Medium                | Low          | SleepInsteadOfJoin       |
| 10 | Large                             | Large                                      | Large   | VeryLarge | VeryLow               | High         | Deadlock                 |
| 11 | Medium                            | Small                                      | Large   | Medium    | High                  | Medium       | DoubleCheckedLocking     |
| 12 | Small                             | Large                                      | Medium  | Small     | VeryLow               | Low          | DoubleCheckedLocking     |
| 13 | Small                             | Medium                                     | Large   | Large     | Low                   | Medium       | SleepInsteadOfJoin       |
| 14 | Medium                            | Medium                                     | Small   | Large     | Medium                | Low          | Deadlock                 |
| 15 | Large                             | Small                                      | Medium  | VeryLarge | Low                   | Medium       | NotifyInsteadOfNotifyAll |
| 16 | Large                             | Small                                      | Medium  | Small     | High                  | High         | LostNotify               |
| 17 | Medium                            | Small                                      | Small   | Small     | Low                   | High         | OrphanedThread           |
| 18 | Small                             | Large                                      | Medium  | VeryLarge | VeryLow               | Low          | BlockingCriticalSection  |
| 19 | Small                             | Medium                                     | Large   | VeryLarge | Low                   | Low          | NonAtomicAssumedAtomic   |
| 20 | Large                             | Medium                                     | Medium  | Small     | VeryLow               | Medium       | Interference             |
| 21 | Large                             | Large                                      | Small   | Small     | Medium                | High         | NonAtomicAssumedAtomic   |
| 22 | Small                             | Medium                                     | Large   | Large     | VeryLow               | Low          | LostNotify               |
| 23 | Medium                            | Small                                      | Large   | Medium    | Medium                | Medium       | NoLock                   |
| 24 | Small                             | Medium                                     | Medium  | VeryLarge | Low                   | Low          | NoLock                   |
| 25 | Small                             | Small                                      | Medium  | Small     | Low                   | Medium       | Deadlock                 |
| 26 | Small                             | Small                                      | Small   | Large     | High                  | High         | Interference             |
| 27 | Large                             | Large                                      | Small   | Medium    | High                  | Medium       | TwoStageAccess           |
| 28 | Medium                            | Medium                                     | Medium  | Large     | VeryLow               | Low          | TwoStageAccess           |
| 29 | Large                             | Large                                      | Large   | Large     | Medium                | Medium       | OrphanedThread           |
| 30 | Large                             | Medium                                     | Small   | Large     | Medium                | High         | DoubleCheckedLocking     |
| 31 | Medium                            | Large                                      | Large   | Small     | High                  | Low          | NotifyInsteadOfNotifyAll |
| 32 | Medium                            | Small                                      | Large   | Large     | Medium                | High         | BlockingCriticalSection  |
| 33 | Medium                            | Large                                      | Small   | VeryLarge | VeryLow               | High         | SleepInsteadOfJoin       |
| 34 | Small                             | Large                                      | Small   | VeryLarge | Low                   | High         | DoubleCheckedLocking     |
| 35 | Small                             | Large                                      | Small   | Large     | Medium                | Low          | NotifyInsteadOfNotifyAll |
| 36 | Small                             | Medium                                     | Large   | Small     | High                  | Medium       | SleepInsteadOfJoin       |
| 37 | Medium                            | Medium                                     | Medium  | Small     | VeryLow               | High         | NoLock                   |
| 38 | Small                             | Large                                      | Small   | VeryLarge | Low                   | Low          | TwoStageAccess           |
| 39 | Small                             | Large                                      | Large   | VeryLarge | Medium                | High         | Interference             |
| 40 | Large                             | Medium                                     | Large   | Medium    | VeryLow               | High         | OrphanedThread           |
| 41 | Medium                            | Medium                                     | Large   | Medium    | High                  | High         | Deadlock                 |
| 42 | Small                             | Medium                                     | Small   | Medium    | High                  | High         | NonAtomicAssumedAtomic   |
| 43 | Small                             | Small                                      | Large   | Medium    | Low                   | Medium       | LostNotify               |
| 44 | Small                             | Medium                                     | Medium  | Medium    | High                  | High         | BlockingCriticalSection  |

# **Acquiring Benchmark Examples**

## **Leveraging Existing Programs**

- The IBM Concurrency Benchmark [EU04]
  - 28 Java concurrency programs
- The Rungta and Mercer Model Checking Benchmark [RM07]
  - Mix of Java programs from IBM and other sources
- BugBench [LLQ+05]
  - 4 C++ concurrency programs
- Open-source repositories

[EU04] Y. Eytani and S. Ur. Compiling a benchmark of documented multi-threaded bugs. In Proc. of PADTAD 2004. [RM07] N. Rungta and E. G. Mercer. Understanding hardness in models used for benchmarking model checking techniques, Proc. of the 5th IEEE International Conference on Software Engineering and Formal Methods (SEFM 2007), pages 247-256, 2007. [LLQ+05] S. Lu, et al. Bugbench: Benchmarks for evaluating bug detection tools. In Proc. of the Workshop on the Evaluation of Software Defect Detection Tools. 2005.

# **Acquiring Benchmark Examples**

## **Using Program Mutation**

- Mutation analysis uses a set of mutation operators in which each operator corresponds to a syntactic bug pattern.
- A mutation operator is applied to a program and generates a set of mutant programs
- To generate additional examples we plan to use the concurrency mutation tool - ConMAn [Con, BCD06]
  - We will apply ConMAn to existing programs

[Con] ConMAn: Concurrency mutation analysis operators. Web page: <a href="https://github.com/sqrg-uoit/ConMAn">https://github.com/sqrg-uoit/ConMAn</a>
[BCD06] J. S. Bradbury, J. R. Cordy, and J. Dingel. Mutation operators for concurrent Java (J2SE 5.0). In Proc. of the 2nd Workshop on Mutation Analysis (Mutation 2006), pages 83-92, 2006.

# **Performance Measures**

- We need to assess the fitness of a given tool with respect to its ability to find bugs (effectiveness) and its efficiency with which the bug detection is carried out.
- Performance measures are necessary to achieve this!

How can we measure effectiveness?

How can we measure efficiency?

# **Performance Measures**

### **Effectiveness**

bug detection rate of t =
 the percentage of bugs detected by a tool t.

ease to kill a kind of bug by t =
the percentage of bugs of a given kind that are
detected by a tool t.

# **Performance Measures**

# **Efficiency**

cost (in time) to detect a bug by t =
the total time to detect the bug by a tool t

path cost to detect a bug by t =
 the number of interleaving schedules
 analyzed/executed in order to find the bug by a
 tool t

# **Conclusions & Future Work**

- We have proposed a new benchmark to assess the fitness of a concurrency bug detection tool and to compare it with other tools.
- We have also developed a new approach to benchmark construction based on combinatorial test design (CTD)

### **NEXT STEP:**

Select 44 example programs/task samples for benchmark – but first get feedback on construction from community!

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