

# Using Program Mutation for the Empirical Assessment of Fault Detection Techniques

## A Comparison of Concurrency Testing and Model Checking

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How can we increase our confidence in  
the correctness of concurrent programs?



Leveraging the full power  
of multicore processors demands  
new tools and new thinking  
from the software industry.

## Software and the Concurrency Revolution

Concurrency has long been touted as the "next big thing" and "the way of the future," but for the past 30 years, mainstream software developers have been able to ignore it. Our parallel future has finally arrived: new machines will be parallel machines, and this will require major changes in the way we develop software.

The introductory article in this issue ("The Future of Multiprocessors" by Avi Chikrii and Lance Hammond) describes the hardware progress behind this shift in computer architecture from uniprocessors to multicore processors, also known as CMPs (chip multiprocessors). (For related analysis, see "The Free Lunch Is Over: A Fundamental Shift Toward Concurrency in Software.")

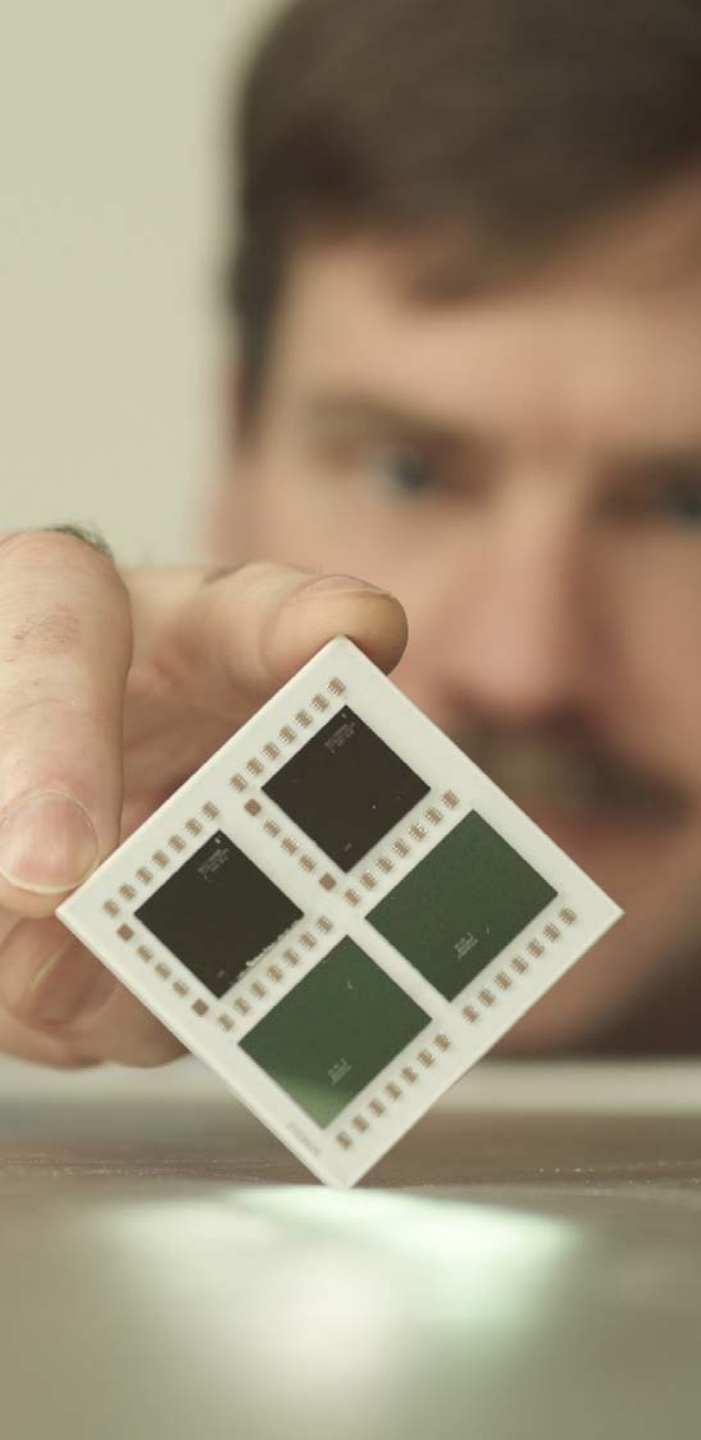
In this article we focus on the implications of concurrency for software and its consequences for both programming languages and programmers.

The hardware change is that clock rates and transistors describe the performance of a fundamental skill in computing. For the past three decades, improvements in semiconductor fabrication and processor implementation produced steady increases in the speed at which computers executed existing sequential programs. The architectural changes in multicore processors have not only changed existing applications and therefore have little value for most existing mainstream software. For the foreseeable future, today's desktop applications will

HERB SUTTER AND JAMES LARUS, MICROSOFT

“...humans are quickly overwhelmed by concurrency and find it much more difficult to reason about concurrent than sequential code. Even careful people miss possible interleavings...”

- Herb Sutter & James Larus, Microsoft [SL05]

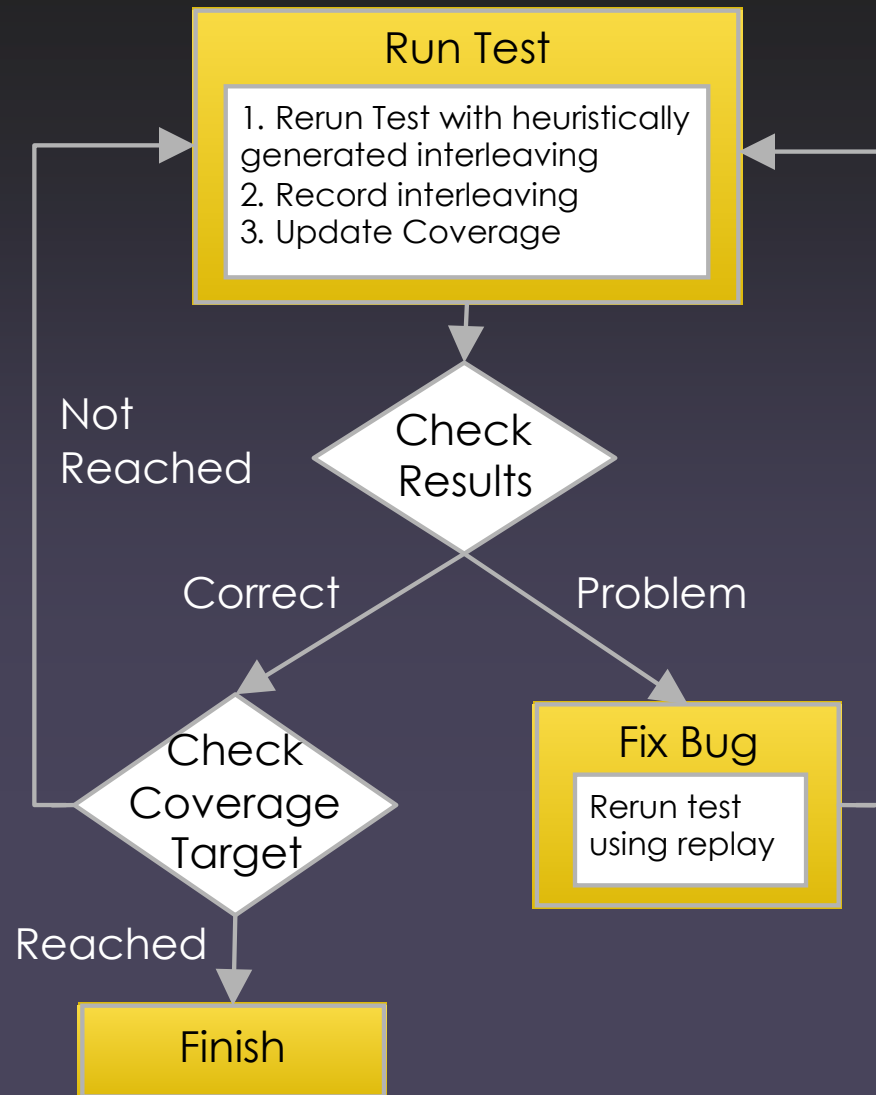


In the future applications will need to be **concurrent** to fully exploit CPU throughput gains [Sut05]

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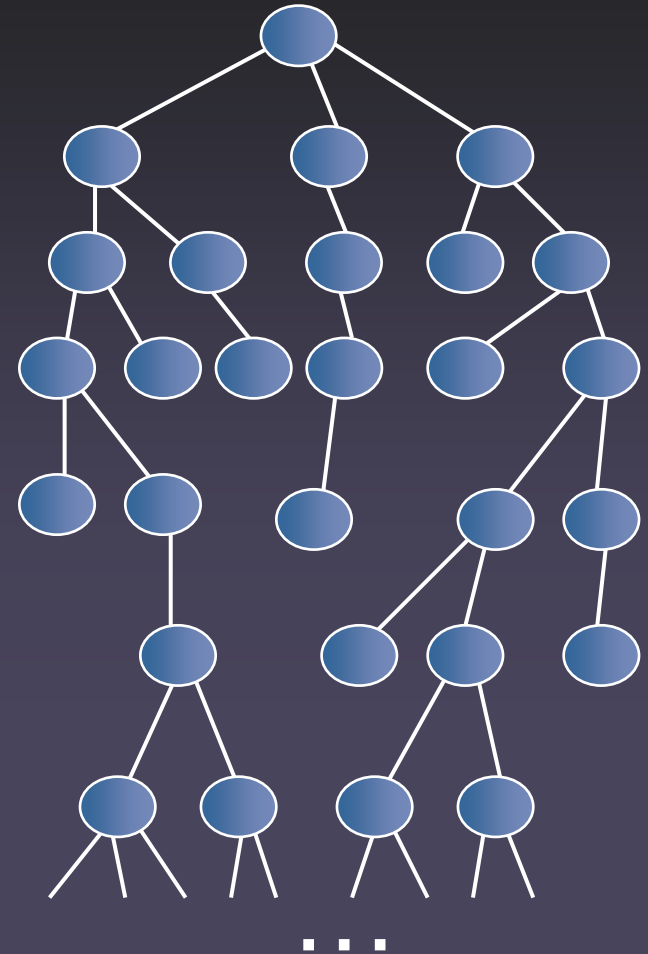
[Sut05] H. Sutter. The free lunch is over: A fundamental turn toward concurrency in software. *Dr. Dobbs Journal*, 30(3), Mar. 2005.

# Concurrency Testing with IBM's ConTest



# Model Checking with Java Pathfinder (JPF)

- Model checking **exhaustively** searches the entire state space of a program (i.e., all interleavings)
- Allows for the analysis of **assertions** and **deadlock** detection



# Research Goals

1. To **compare** the effectiveness and efficiency of different fault detection techniques using mutation
2. To better **understand** any **complementary** relationship that might exist between different techniques

# Our Approach

- Conduct **controlled experiments** to evaluate the ability of various tools to detect bugs in faulty programs
- For example:
  - Testing with ConTest
  - Model Checking with Java PathFinder
- We use **mutation** to generate the faulty programs required for our experiments



# Our Approach

- Mutation [Ham77,DLS78] traditionally used within the **sequential testing** community
  - evaluate the effectiveness of test suites
- Mutation relies on **mutation operators** (*patterns*) to generate faulty versions of the original program called **mutants**

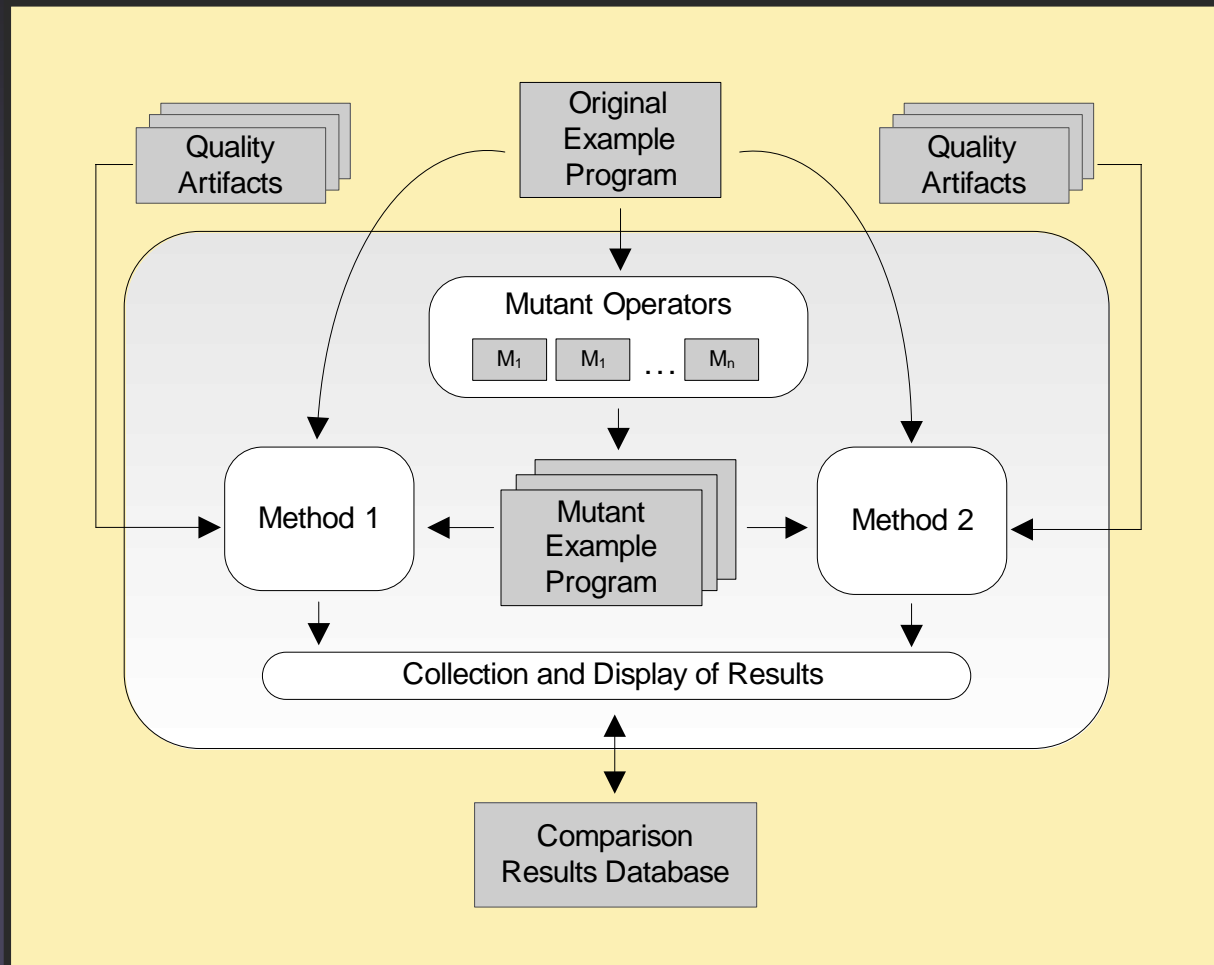
Mutant score of  $t$  = % of mutants detected (*killed*) by a technique  $t$  (e.g., testing, model checking)

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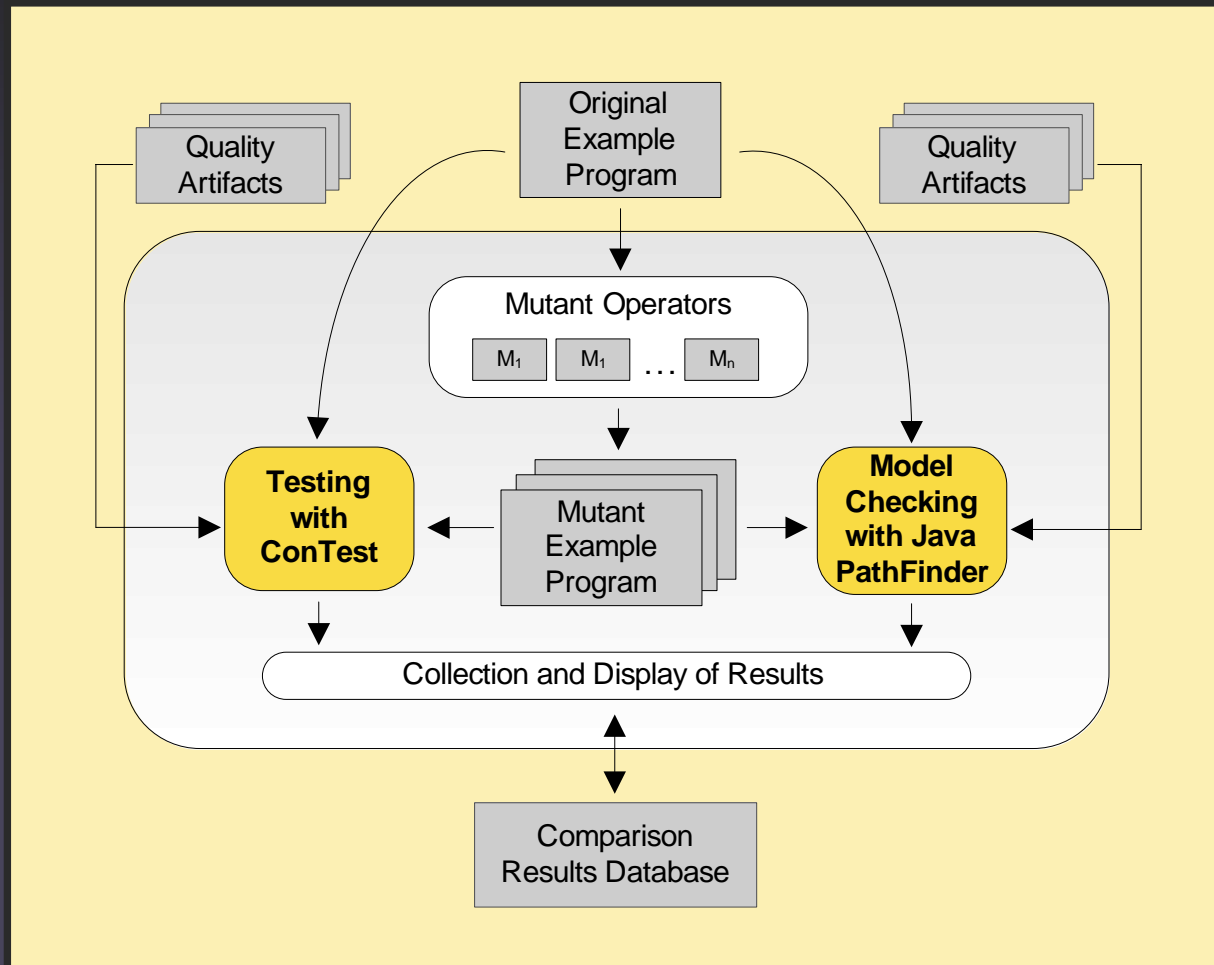
[Ham77] R.G. Hamlet. Testing programs with the aid of a compiler. IEEE Trans. on Soft. Eng., 3(4), Jul. 1977.

[DLS78] R. A. DeMillo, R. J. Lipton, and F. G. Sayward. Hints for test data selection: help for the practicing programmer. IEEE Computer, 11(4):34–41, Apr. 1978.

# Research Methods

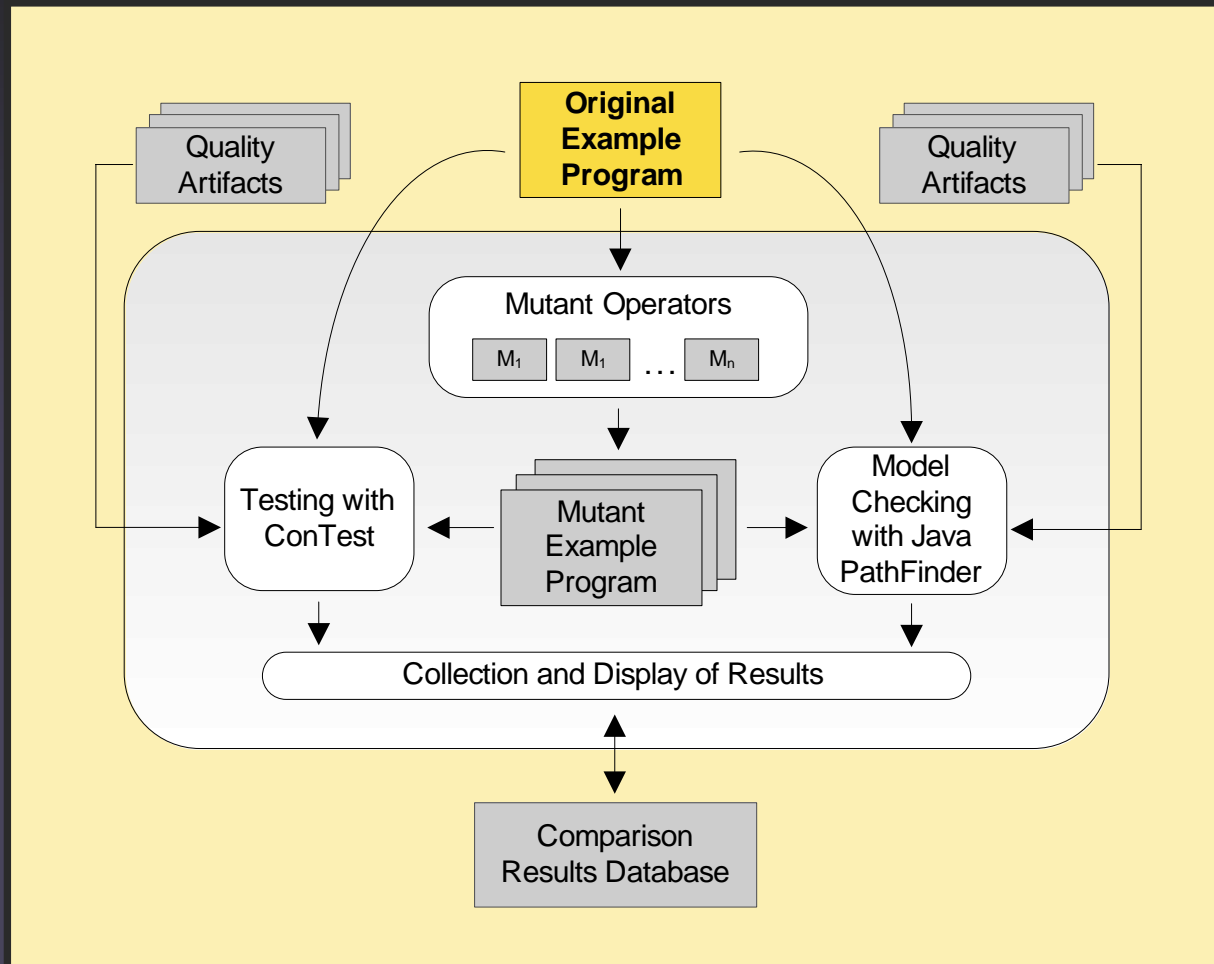


# Experimental Setup



## Approach Selection

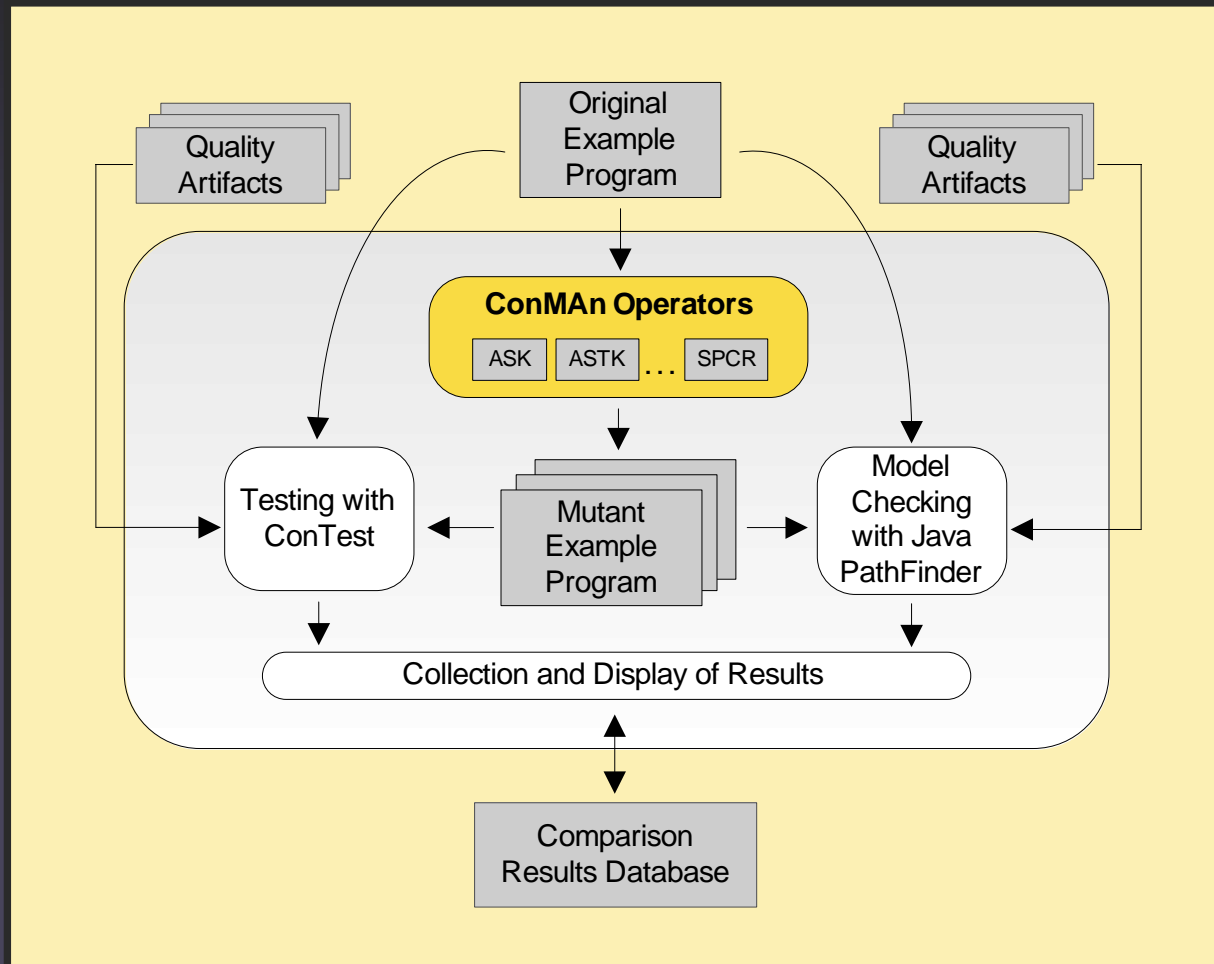
# Experimental Setup



**Approach  
Selection**

**Example  
Program  
Selection**

# Experimental Setup



Approach  
Selection

Example  
Program  
Selection

Mutation  
Selection

# The ConMAAn Operators

- **ConMAAn** = **Con**currency **M**utation **A**nalysis
- What are the ConMAAn operators?
  - “...a *comprehensive* set of 24 operators for Java that are *representative* of the kinds of bugs that often occur in concurrent programs.”
  - based on an existing fault model for Java concurrency [FNU03]
- Can be used as a **comparative** metric

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[FNU03] E. Farchi, Y. Nir, and S. Ur. Concurrent bug patterns and how to test them. In *Proc. of IPDPS 2003*.

# Example ConMAn Mutation

## SKCR – Shrink Critical Region

```
Object lock1 = new Object();
```

```
...
```

```
public void m1 () {
```

```
    <statement n1>
```

```
    synchronized (lock1) {
```

```
        //critical region
```

```
        <statement c1>
```

```
        <statement c2>
```

```
        <statement c3>
```

```
    }
```

```
    <statement n2>
```

```
...
```

# Example ConMAn Mutation

## SKCR – Shrink Critical Region

```
Object lock1 = new Object();
```

```
...
```

```
public void m1 () {
```

```
  <statement n1>
```

```
  synchronized (lock1) {
```

```
    //critical region
```

```
    <statement c1>
```

```
    <statement c2>
```

```
    <statement c3>
```

```
  }
```

```
  <statement n2>
```

```
...
```

```
Object lock1 = new Object();
```

```
...
```

```
public void m1 () {
```

```
  <statement n1>
```

```
  //critical region
```

```
  <statement c1>
```

```
  synchronized (lock1) {
```

```
    <statement c2>
```

```
  }
```

```
  <statement c3>
```

```
  <statement n2>
```

```
...
```



# Example ConMAn Mutation

## SKCR – Shrink Critical Region

```
Object lock1 = new Object();
```

```
...
```

```
public void m1 () {
```

```
  <statement n1>
```

```
  synchronized (lock1) {
```

```
    //critical region
```

```
    <statement c1>
```

```
    <statement c2>
```

```
    <statement c3>
```

```
  }
```

```
  <statement n2>
```

```
...
```

```
Object lock1 = new Object();
```

```
...
```

```
public void m1 () {
```

```
  <statement n1>
```

```
  //critical region
```

```
  <statement c1>
```

```
  synchronized (lock1) {
```

```
    <statement c2>
```

```
  }
```

```
  <statement c3>
```

```
  <statement n2>
```

```
...
```

**No Lock Bug!**

# Example ConMAn Mutation

## ESP – Exchange Synchronized Block Parameters

```
Object lock1 = new Object();
Object lock2 = new Object();
...
synchronized (lock1) {
  <statement c1>
  ...
  synchronized (lock2) {
    <statement c2>
    ...
  }
}
...
```

# Example ConMAn Mutation

## ESP – Exchange Synchronized Block Parameters

```
Object lock1 = new Object();
Object lock2 = new Object();
...
synchronized (lock1) {
  <statement c1>
  ...
  synchronized (lock2) {
    <statement c2>
    ...
  }
}
...
```

```
Object lock1 = new Object();
Object lock2 = new Object();
...
synchronized (lock2) {
  <statement c1>
  ...
  synchronized (lock1) {
    <statement c2>
    ...
  }
}
...
```

# Example ConMAn Mutation

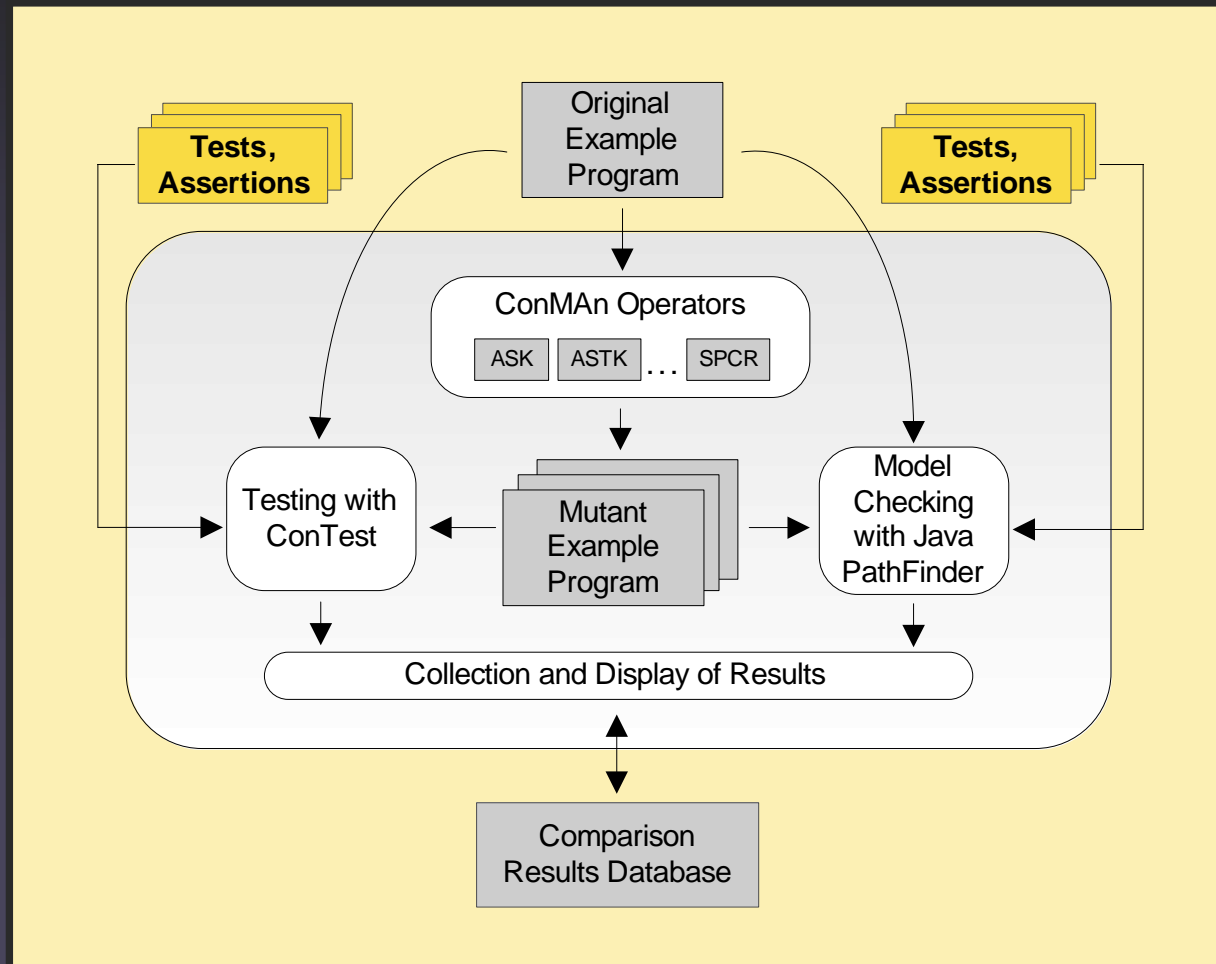
## ESP – Exchange Synchronized Block Parameters

```
Object lock1 = new Object();
Object lock2 = new Object();
...
synchronized (lock1) {
  <statement c1>
  ...
  synchronized (lock2) {
    <statement c2>
    ...
  }
}
...
```

```
Object lock1 = new Object();
Object lock2 = new Object();
...
synchronized (lock2) {
  <statement c1>
  ...
  synchronized (lock1) {
    <statement c2>
    ...
  }
}
...
```

Deadlock bug!

# Experimental Setup



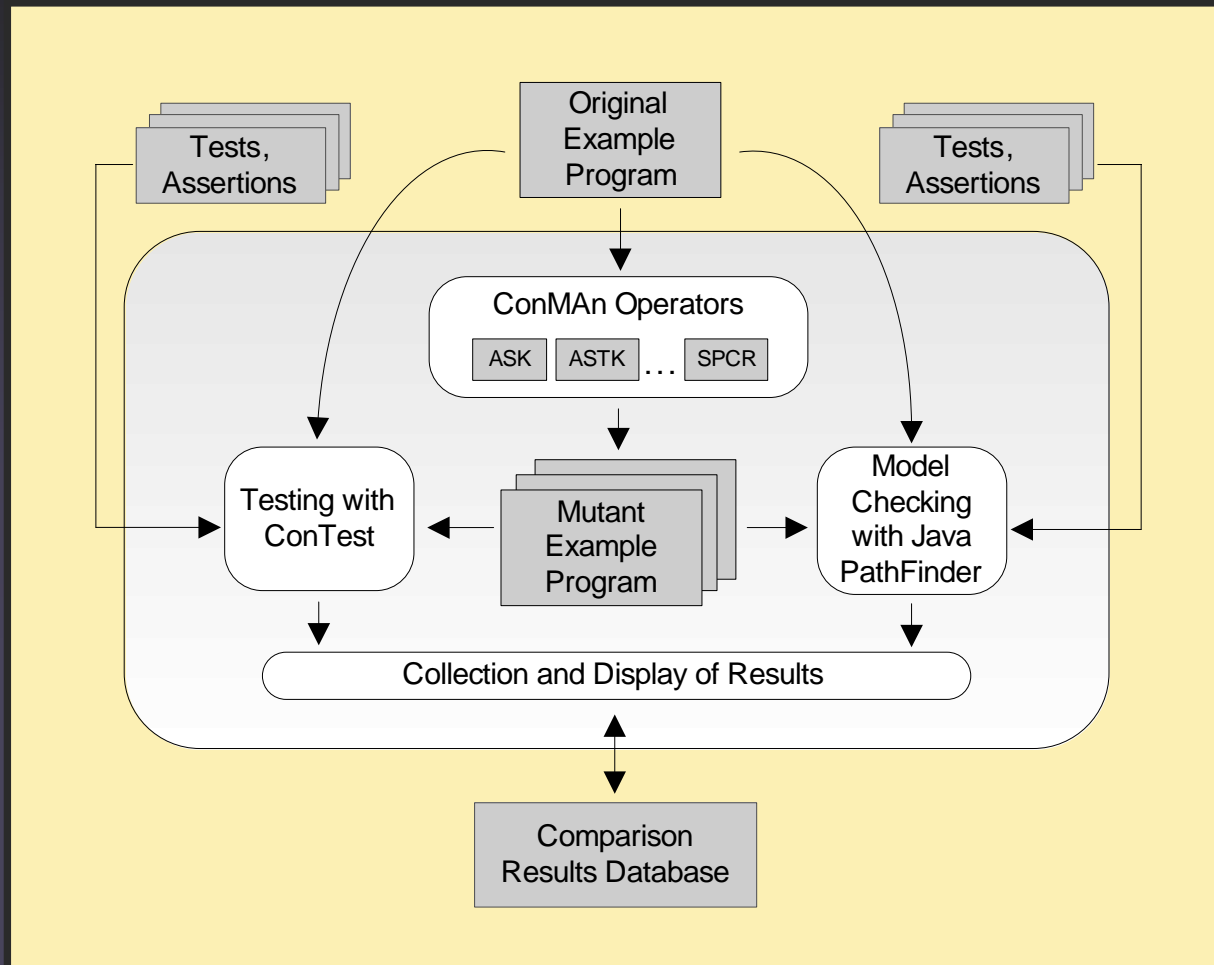
**Approach  
Selection**

**Example  
Program  
Selection**

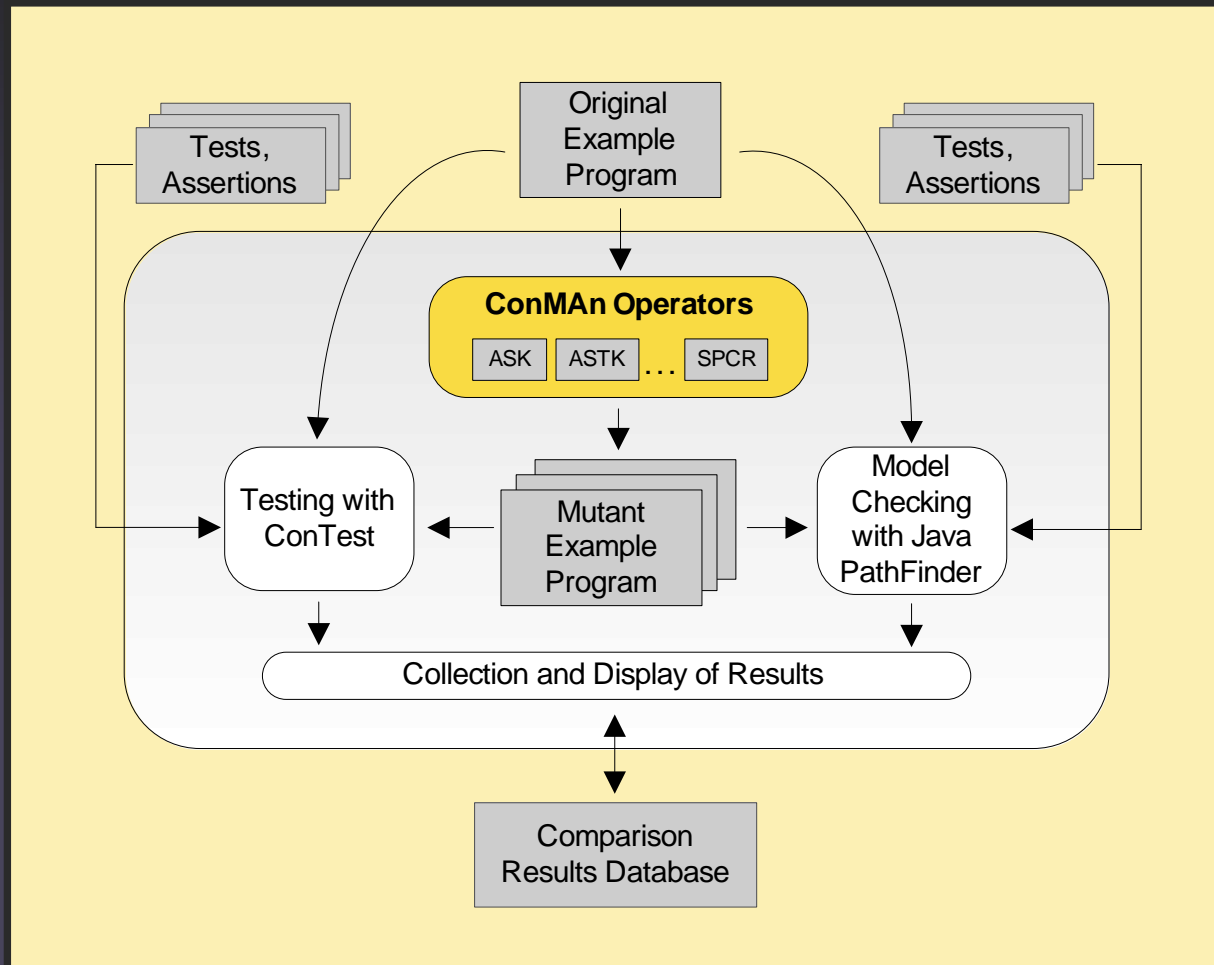
**Mutation  
Selection**

**Program  
Artifact  
Selection**

# Experimental Procedure

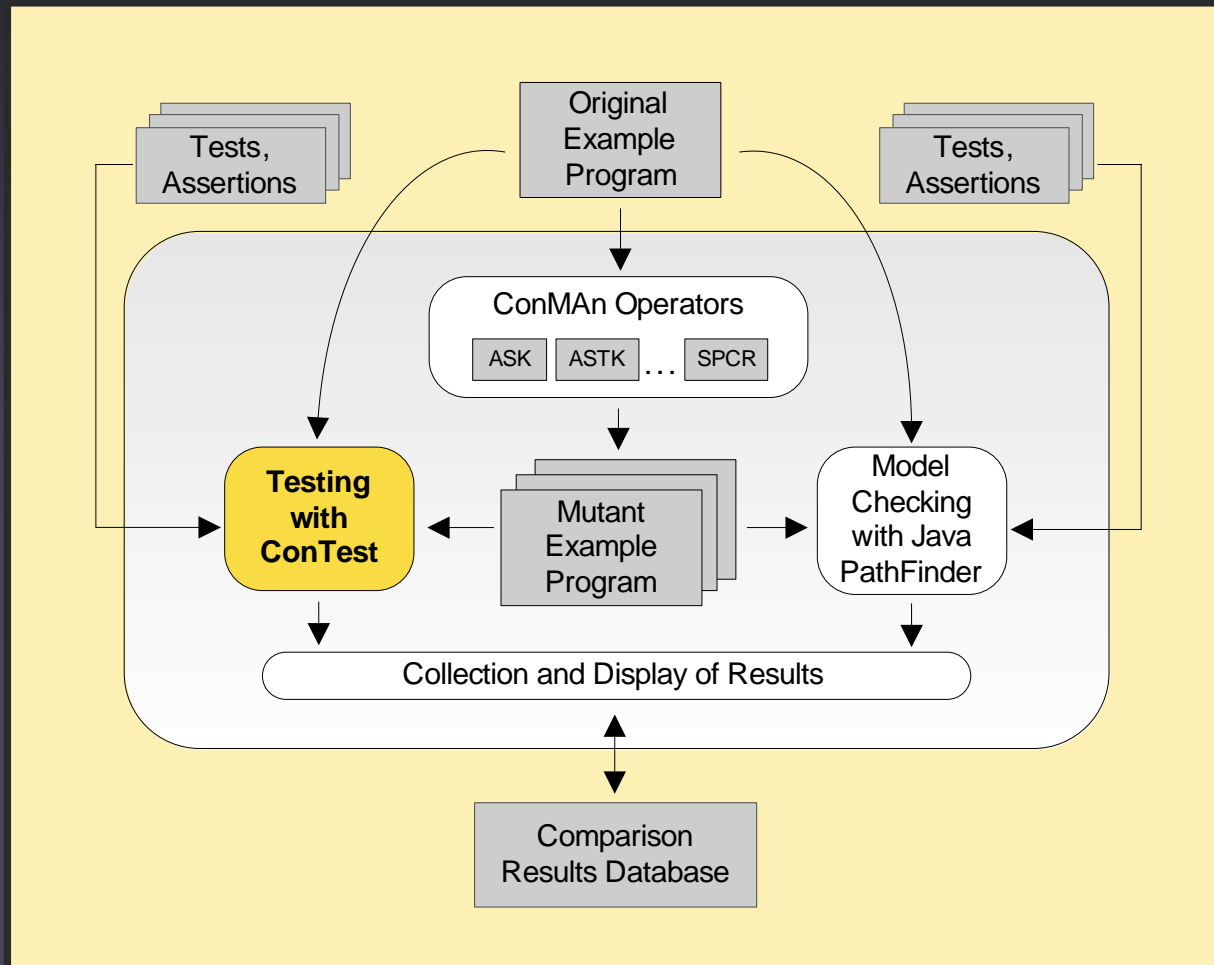


# Experimental Procedure



## Mutant Generation

# Experimental Procedure

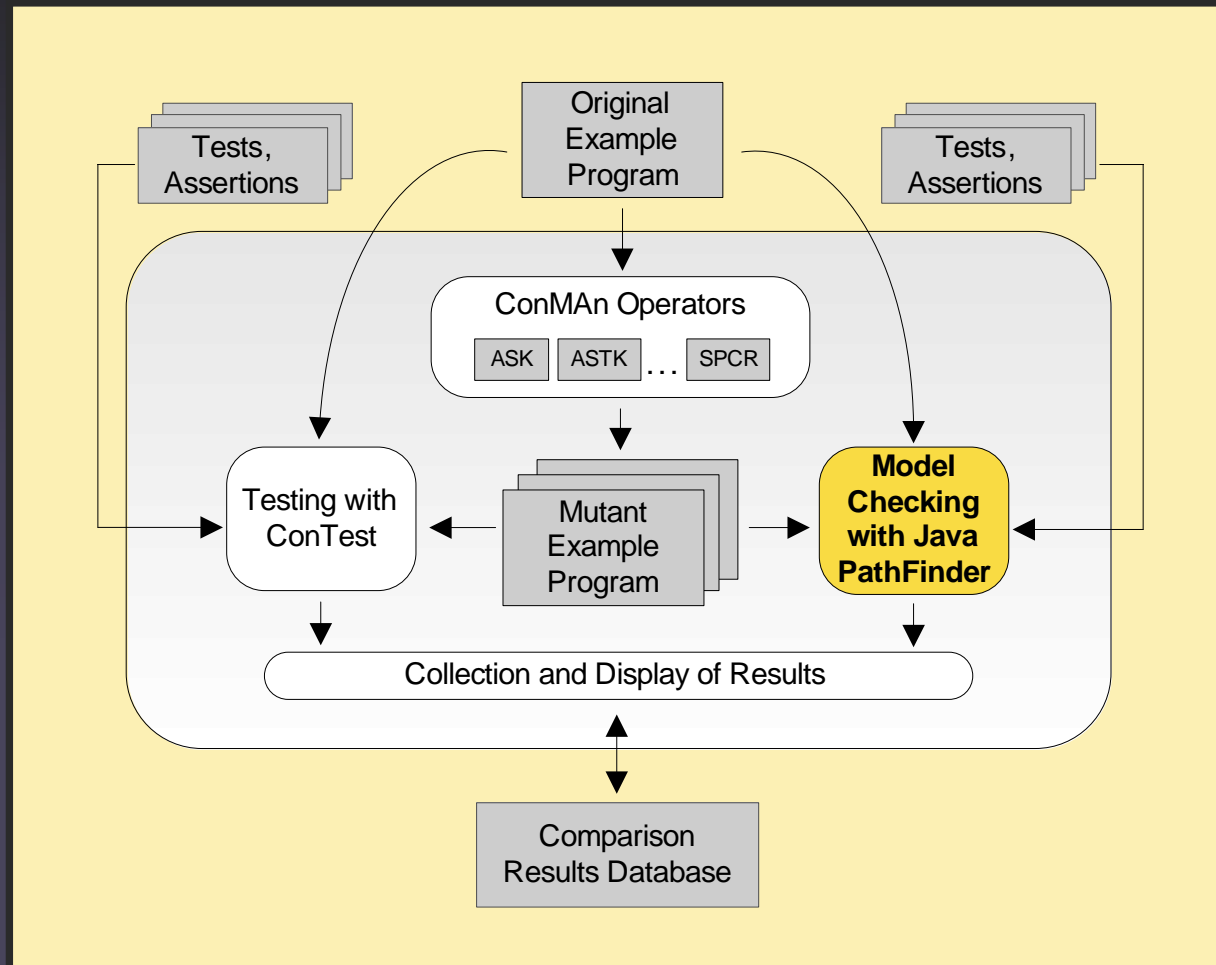


Mutant  
Generation

Testing



# Experimental Procedure

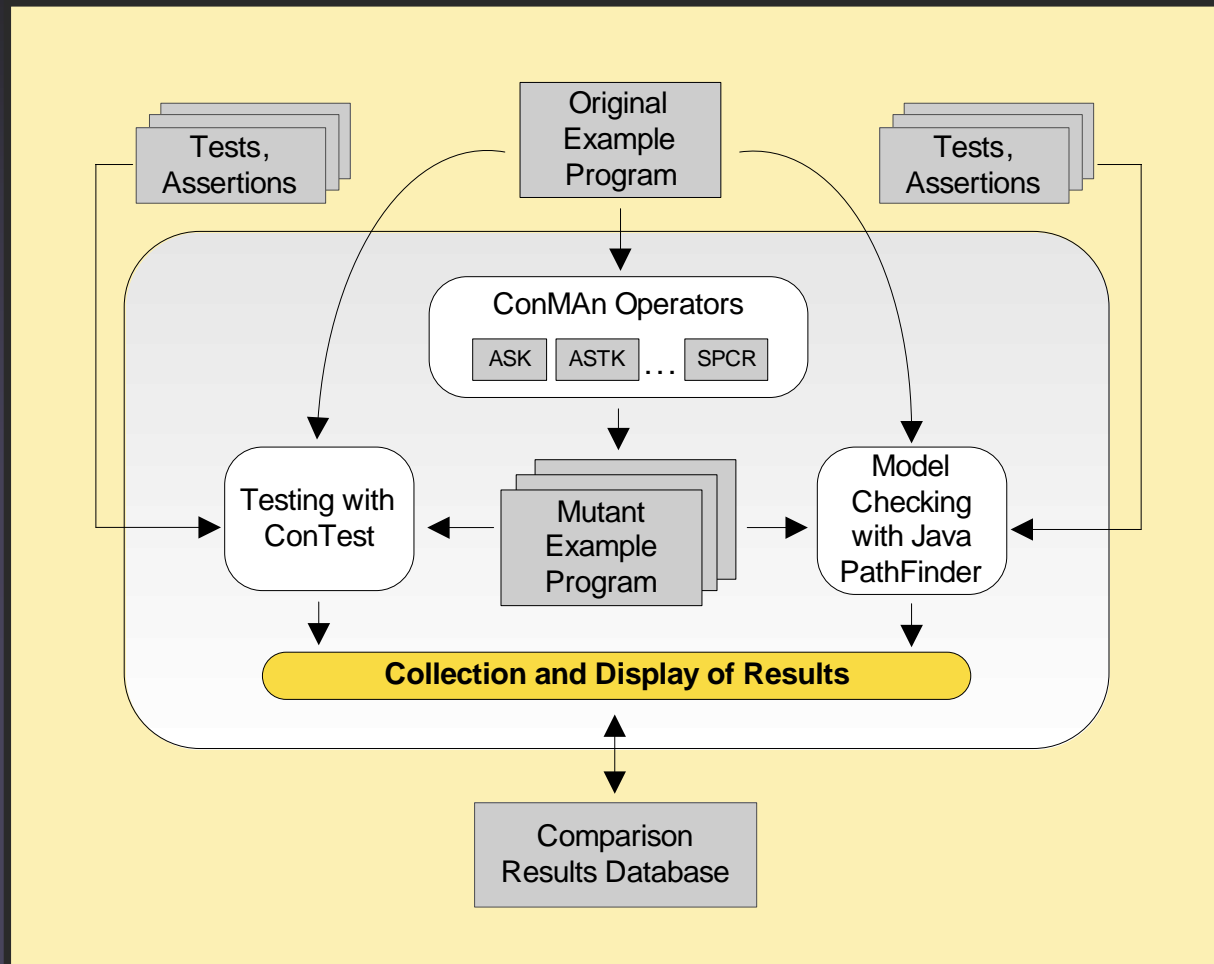


**Mutant  
Generation**

**Testing**

**Model  
Checking**

# Experimental Procedure



Mutant  
Generation

Testing

Model  
Checking

Collection  
and Display  
of Result

# The ExMAn Framework

- **ExMAn** = **Ex**perimental **M**utation **An**alysis
- What is ExMAn?
  - “ExMAn is a *reusable* implementation for building different *customized* mutation analysis tools for comparing *different* quality assurance techniques.”
  - ExMAn **automates** the experimental procedure
- ExMAn will be **publicly released** in a few weeks

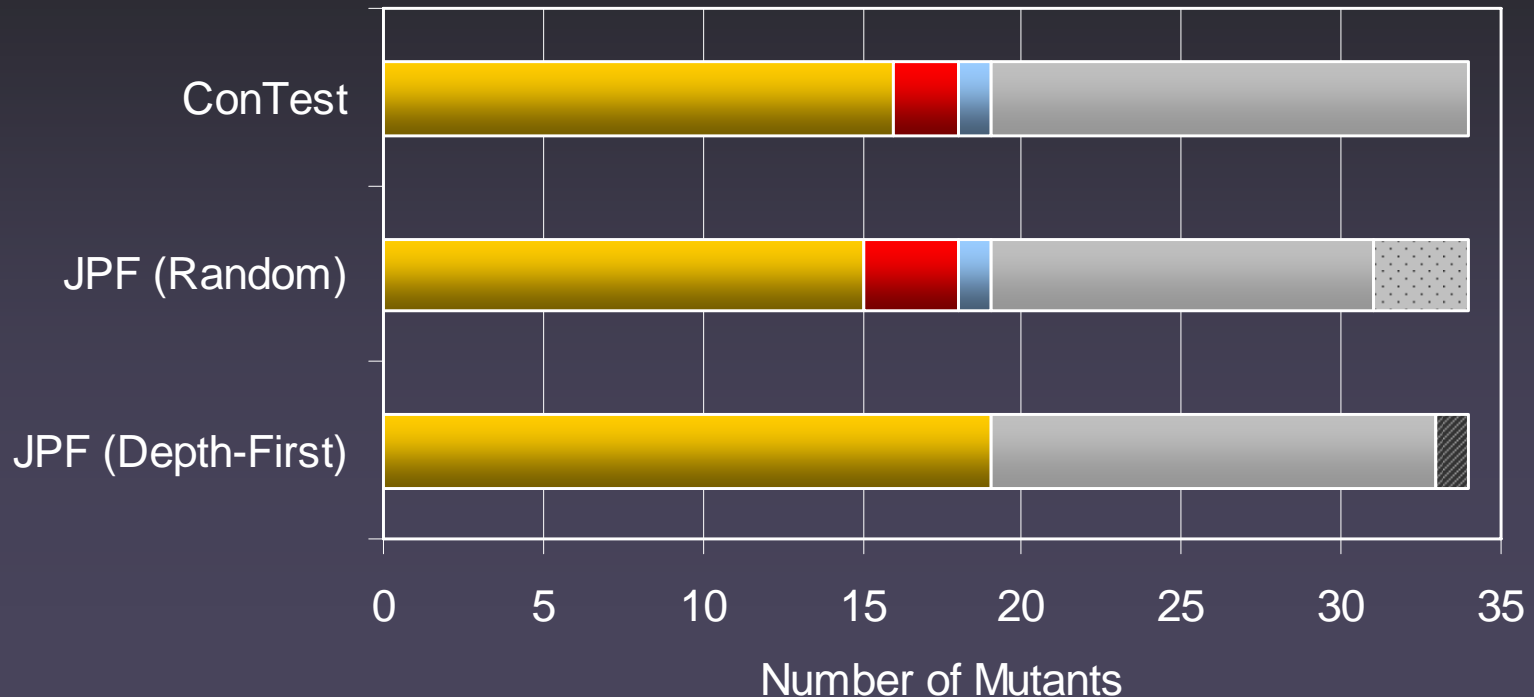
# ConTest vs. Java PathFinder

- How do we better understand the **effectiveness** of each technique?
  - We **measure the mutant score** for each technique (dependent variable)
  - We **vary the analysis technique** (factor)
  - We **fix all other independent variables**
    - quality artifacts (tests and properties),  
example programs ...

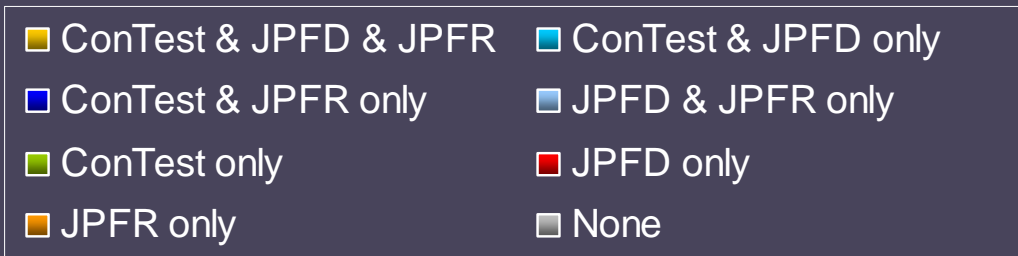
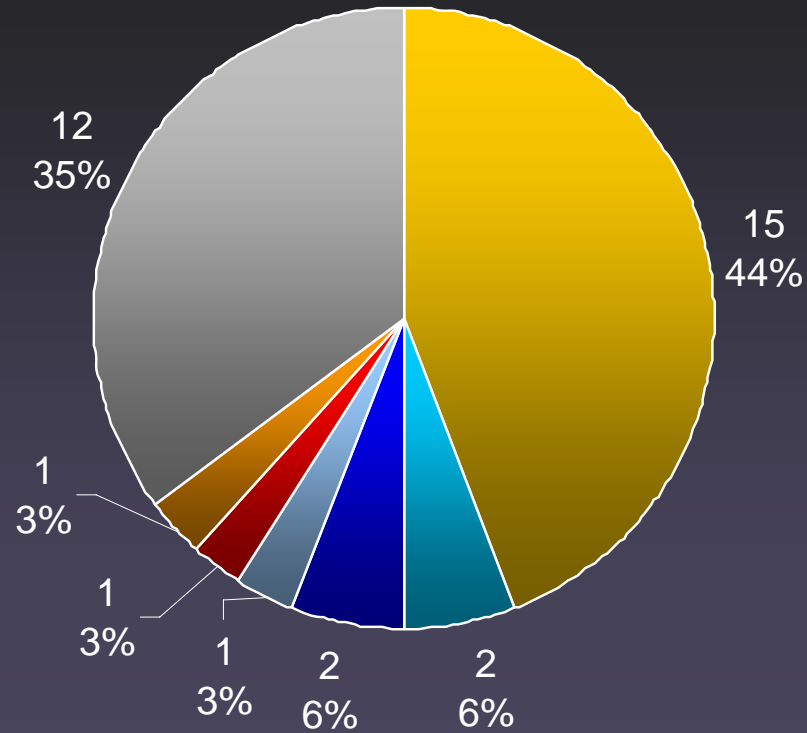
# Example Programs

- **Ticket Order Simulation**
  - Simulates multiple agents selling tickets for a flight
- **Linked List**
  - Involves storing data in a concurrent linked list (data structure)
- **Buffered Writer**
  - Two different types of writer threads are updated a buffer that is being read by a reader thread
- **Account Management System**
  - Manages a series of transactions between a number of accounts

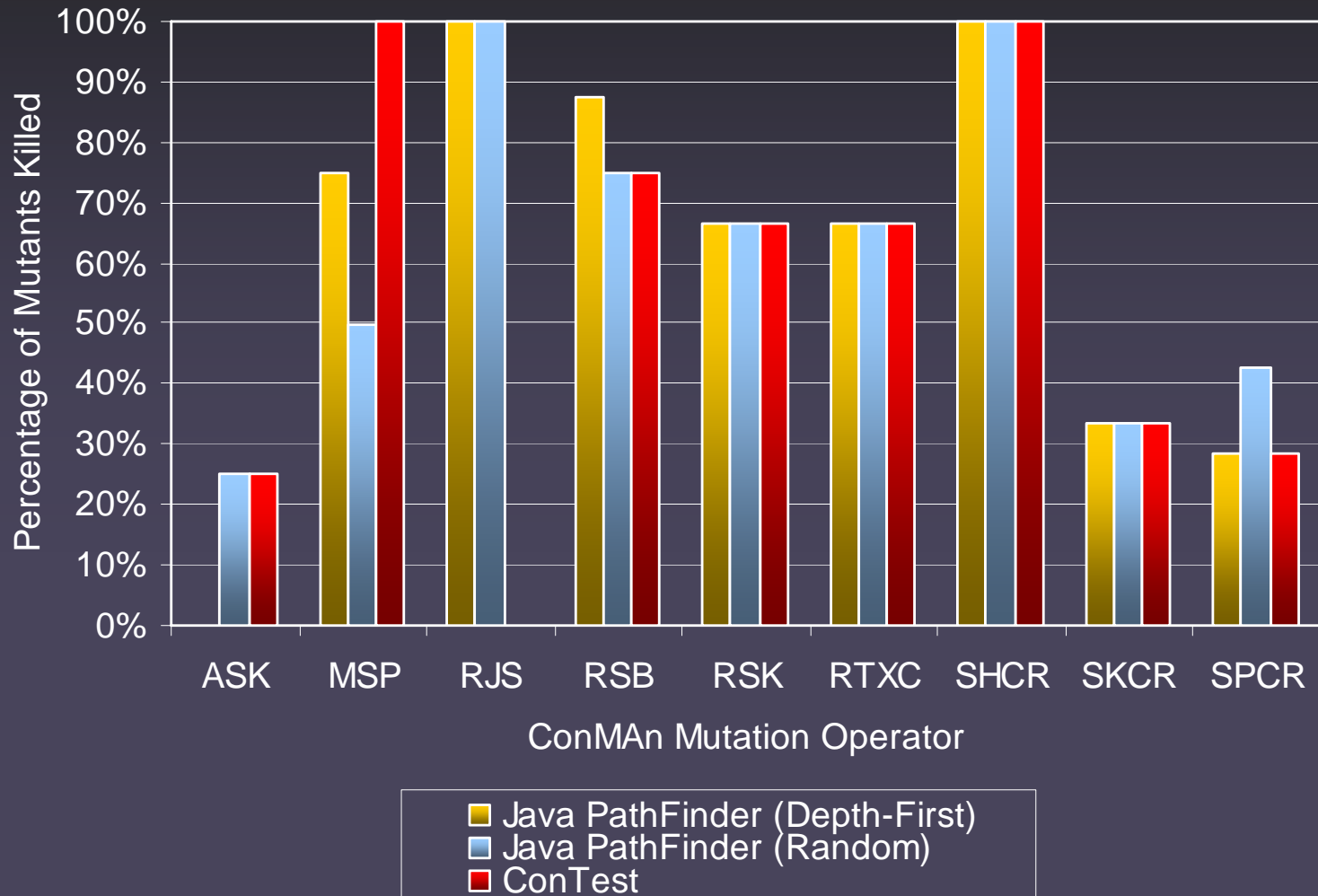
# Quantity of Mutants Killed



# Detection of Mutants



# Ease to Kill





# ConTest vs. Java PathFinder

- How do we better understand the **efficiency** of each technique?
  - If ConTest and Java PathFinder are both capable of finding a fault in a program is either of them **faster**?

# ConTest vs. Java PathFinder

- **Experimental Setup**

- *null hypothesis ( $H_0$ )*: Time to detect a fault for JPF > Time to detect a fault for ConTest
- *dependent variable(s)*: analysis time
- *independent variables*:
  - *factor*: analysis technique
  - *fixed*: quality artifacts (tests and properties)  
software under evaluation

# ConTest vs. Java PathFinder

- Time for ConTest (seconds)
  - Mean = 2.0314
  - Median = 1.2030
- Time for Java PathFinder (seconds)
  - Mean = 3.2835
  - Median = 2.3320
- Conducted a **paired t-test** for  $n=19$ 
  - P-value = 0.0085 (**reject  $H_0$  at the 0.05 level**)
  - JPF is not more efficient than ConTest for our example programs

# Threats to Validity

- internal validity
- external validity:
  - Threats to external validity include:
    - the software being experimented on is not representative of software in general
    - the mutant faults do not adequately represent real faults for the programs under experiment
- construct validity
- conclusion validity

# Contributions

- A **set of generalized mutation-based methods** for conducting controlled experiments of different quality assurance approaches with respect to fault detection.
- The implementation of the **ExMAAn** framework to automate and support our methodology.
  - The contribution of ExMAAn includes its abilities to act as an **enabler** for further research

# Contributions

- The development of the **ConMAN** operators for applying our methodology with concurrent Java applications.
  - The application of the ConMAN operators provides the community with a large set of **new programs** to use in evaluating concurrent Java applications.
- **Empirical results** on the effectiveness of testing and model checking as fault detection techniques for concurrent Java applications.

# Future Work

- Further Empirical Studies... 😊
  - depth (need more experiments comparing testing and model checking)
  - breadth (other experiments)

# Comparative Assessment of Testing and Model Checking Using Program Mutation

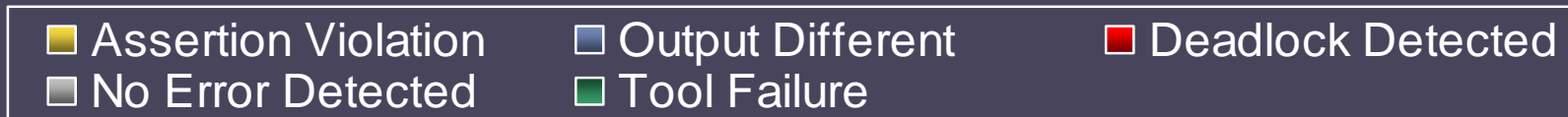
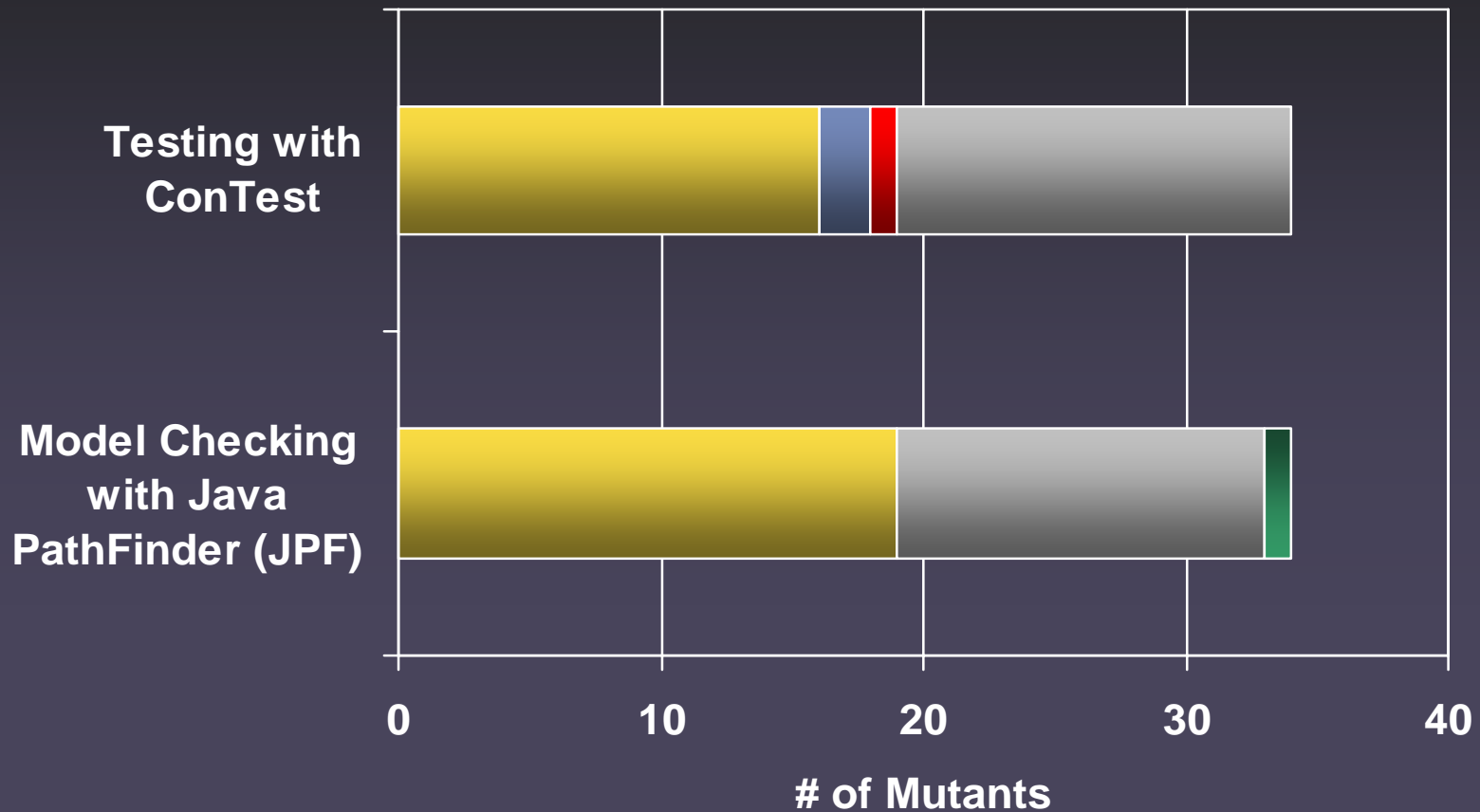
## Research Talk

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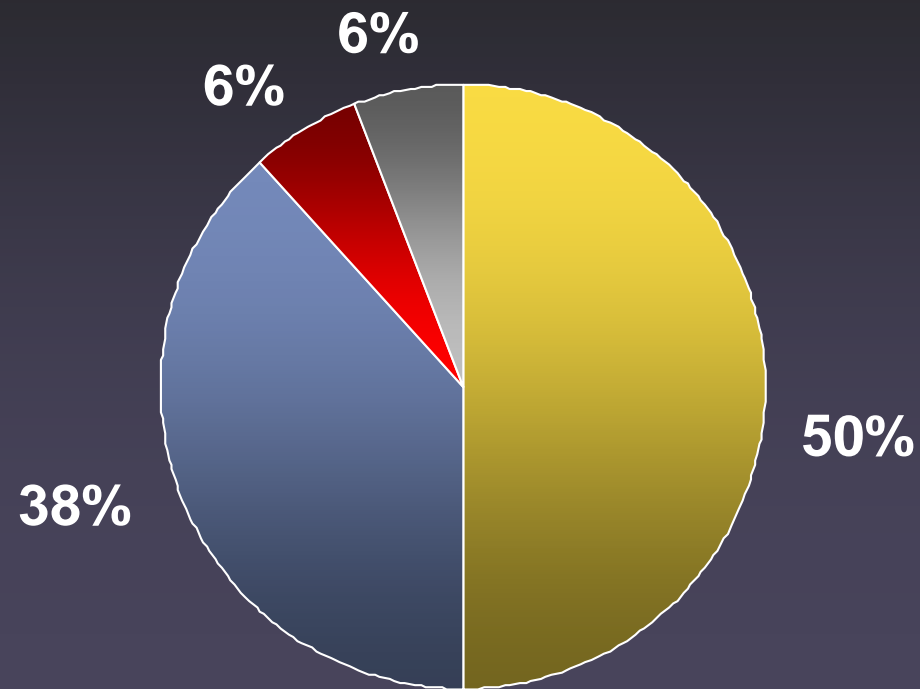
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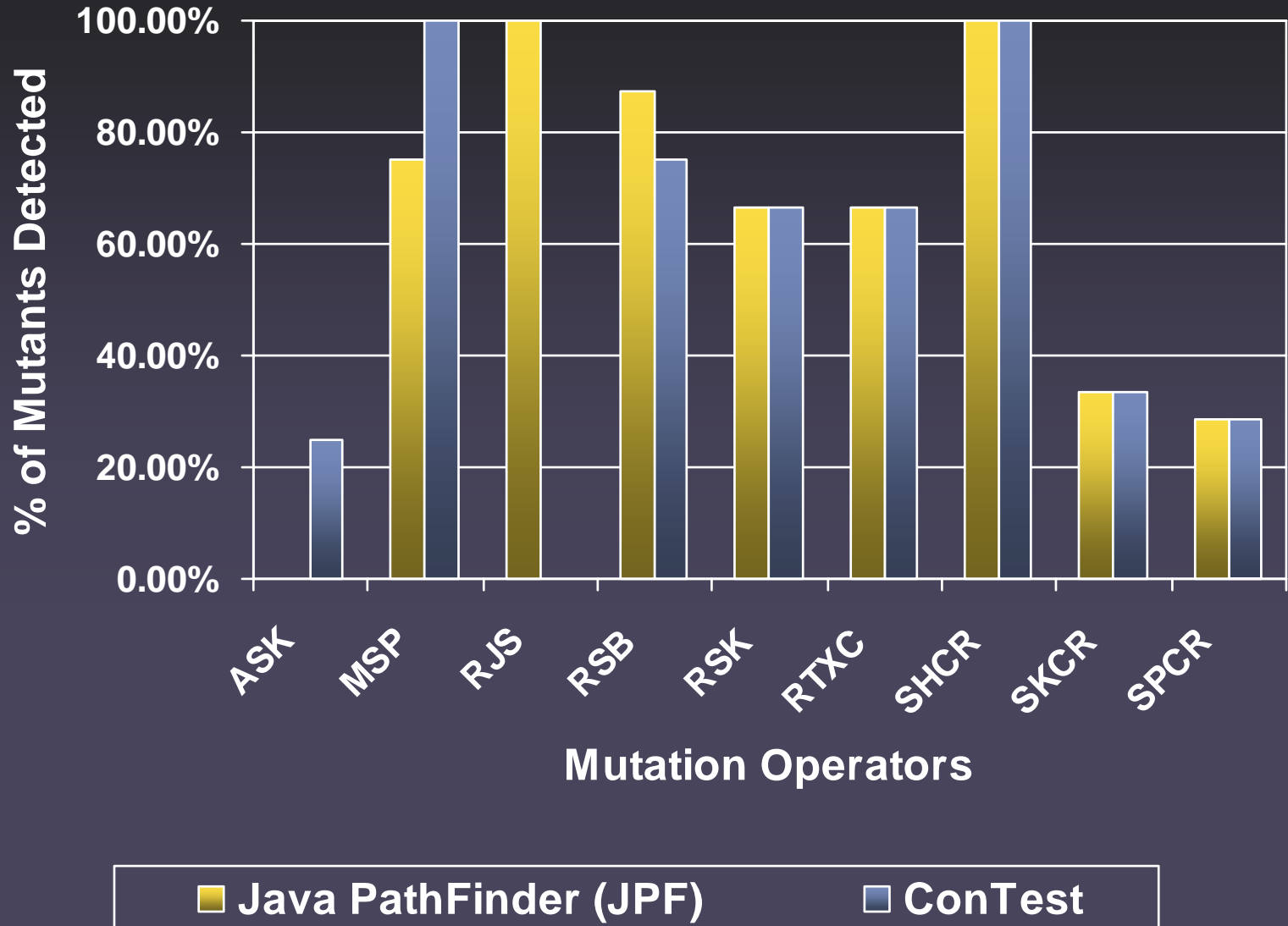
# Quantity of Mutants Killed



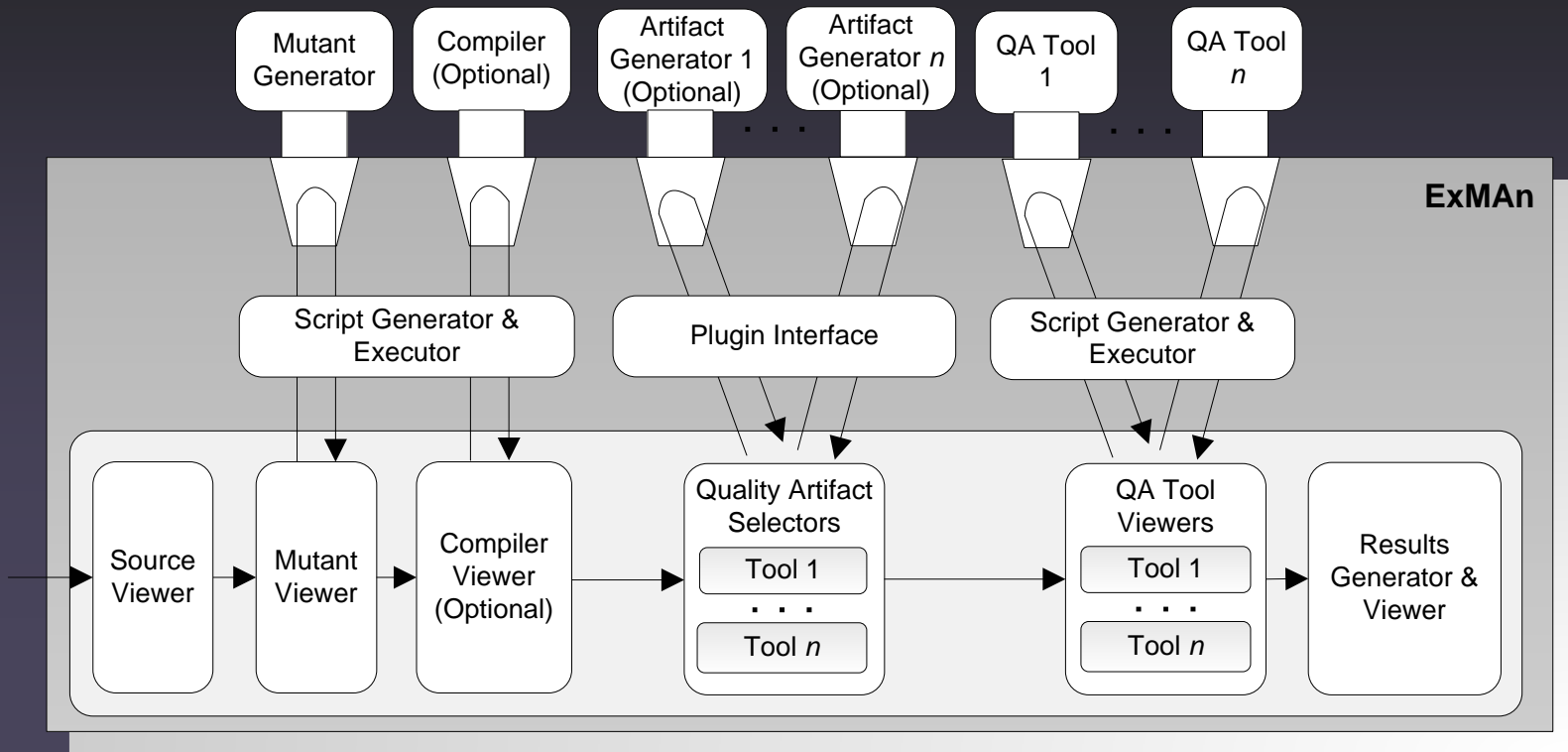
# Detection of Mutants



# Ease to Kill



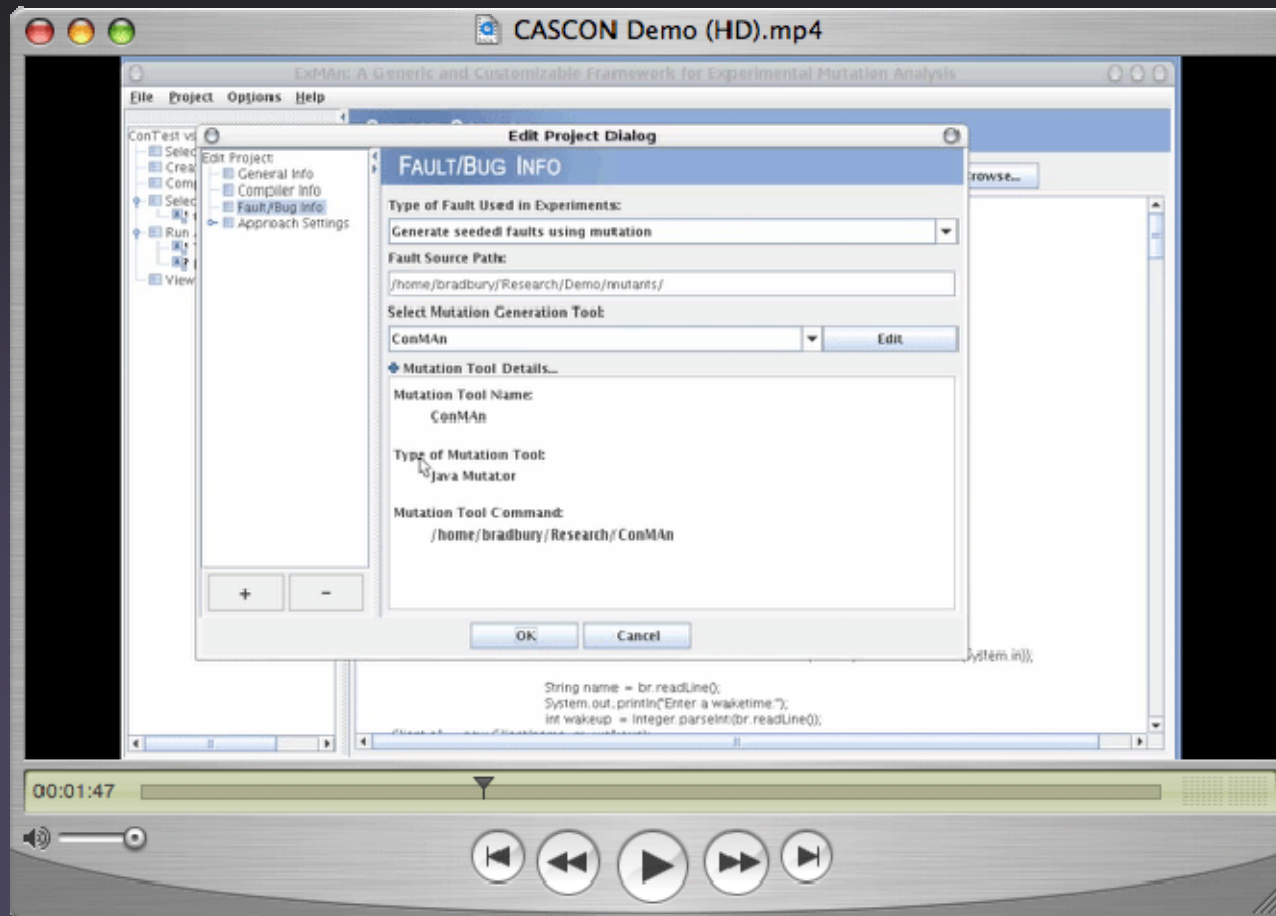
# ExMAn Architecture



# Mutant Scores of JPF, ConTest and ConTest+JPF

Example Program	ConTest Mutant Score	JPF Mutant Score	ConTest+JPF Mutant Score
BufWriter	38.9%	50%	50%
LinkedList	50%	50%	50%
TicketsOrderSim	100%	100%	100%
AccountProgram	78%	56%	78%
<b>TOTAL</b>	<b>56%</b>	<b>56%</b>	<b>62%</b>

# Video Demo



- Available at:  
<http://www.cs.queensu.ca/~bradbury/videos/CASCON2006.mp4>