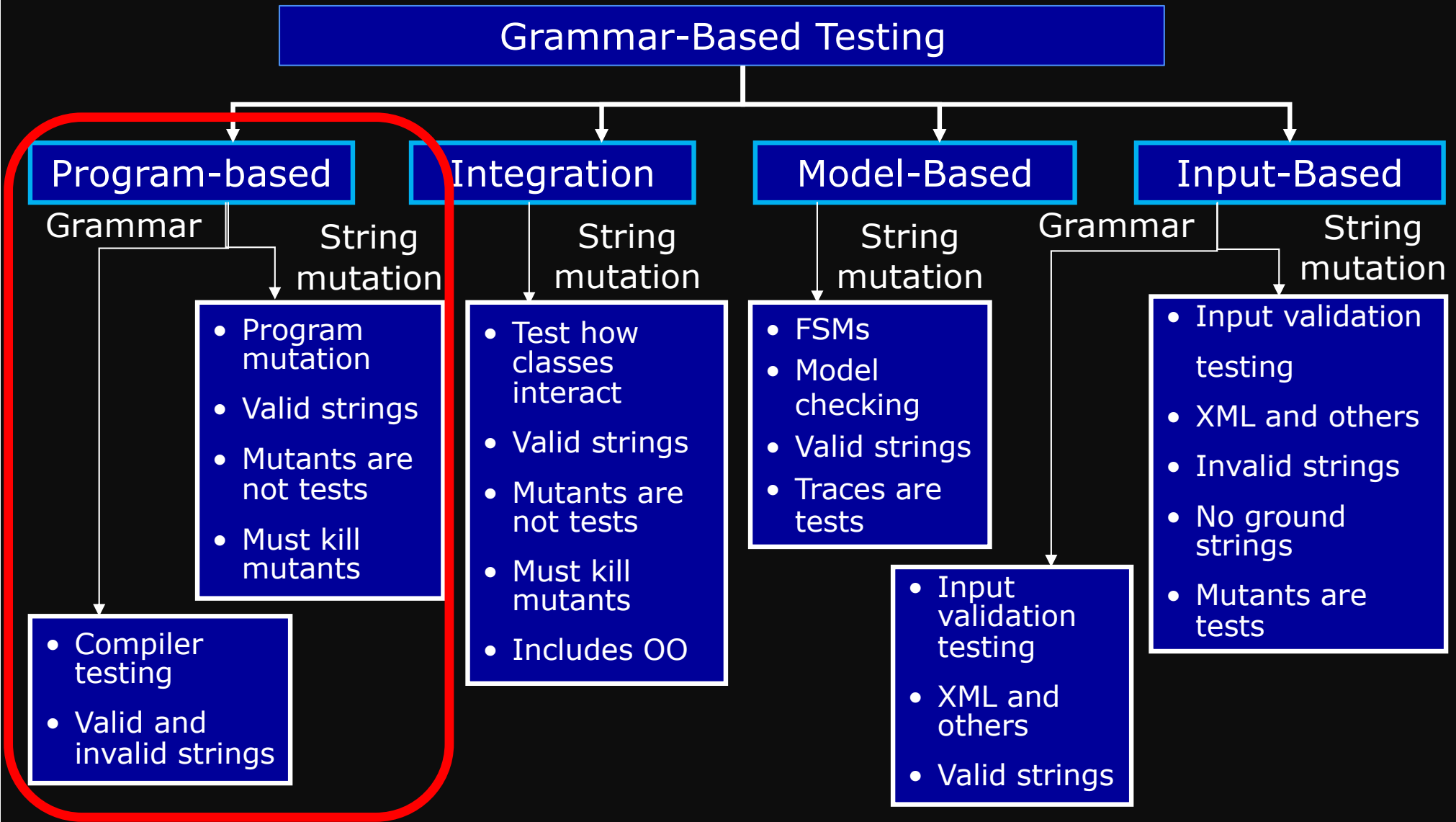


Program-based Mutation Testing

CS 3250 Software Testing

[Ammann and Offutt, “Introduction to Software Testing,” Ch. 9.2]

Instantiating Grammar-Based Testing



Syntax-Based Testing

Input space

Grammar
Mutation operators

Ground string(s)
Valid mutants
Invalid mutants

Test case
inputs

Program source code

Grammar / original program
Mutation operators

Mutants (compilable & runnable)

Test
requirements

Applying Syntax-Based Testing to Programs

- Test requirements are derived from the syntax of software artifacts
- Syntax-based criteria originated with programs and have been used mostly with program source code
- BNF criteria are most commonly used to test compilers
 - Use BNF criteria to generate programs to test all language features that compilers must process
- Mutation testing criteria are most commonly used for unit testing and integration testing

Mutation Testing

- A process of changing the software artifact based on well defined rules

Mutation operators: Rules that specify syntactic variations of strings generated from a grammar

- Rules are defined on syntactic descriptions

Grammars

- We perform mutation analysis when we want to make **systematic changes**, resulting in variations of a valid string

Mutants: Result of one application of a mutation operator

- We can mutate the syntax or objects developed from the syntax

Grammar

Ground strings
(Strings in the grammar)

Mutation Testing (Source Code)

- Inject changes into programs
- Strongest testing criterion
- Effective criterion for designing and evaluating tests
- Applied to C, C++, Java, JavaScript, Java EE, PHP, Angular, SQL, Android, spreadsheet, policy, ...

Premise:

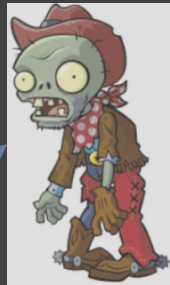
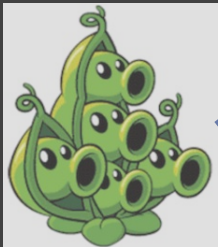
If the software has a fault, there usually are some mutants that can only be **killed** by a **test** that also detects that fault.

Kill:

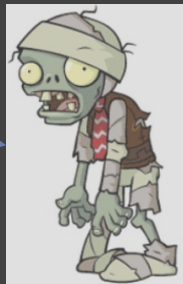
The test makes the output of the mutant **different** from the output of the original program

Mutation Testing

Effective tests



Original Program

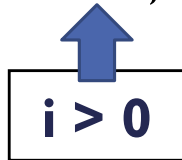


Ineffective tests



Find last index of zero

```
int lastZero (int[] x) {
    for (int i = x.length-1; i >= 0; i--) {
        if (x[i] == 0)
            return i;
    }
    return -1;
}
```



~~Input: x = {1, 2};~~
~~Output original: -1~~
~~Output mutant: -1~~

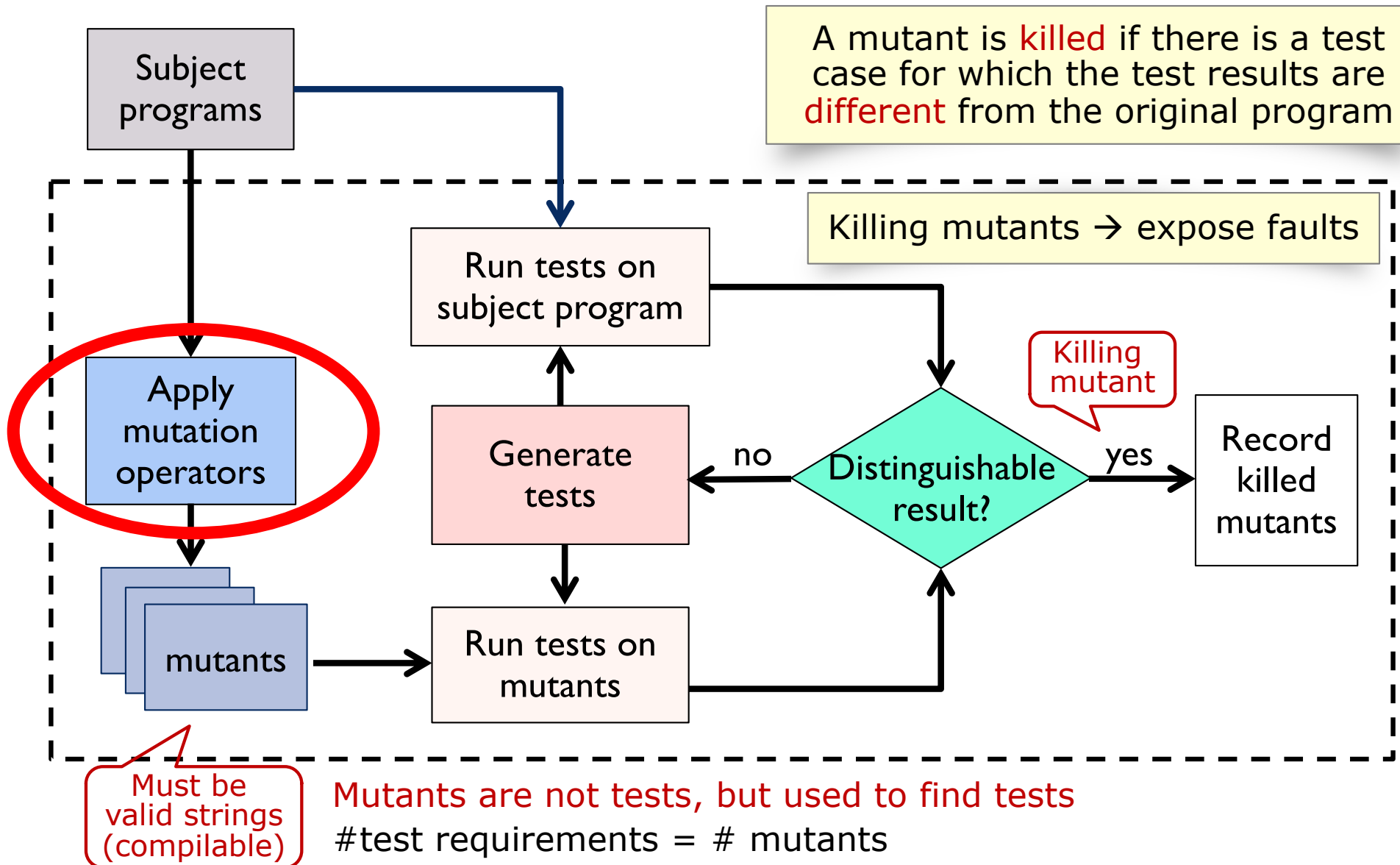
Input: x = {0, 1, 2};
 Output original: 0
 Output mutant: -1

Ineffective

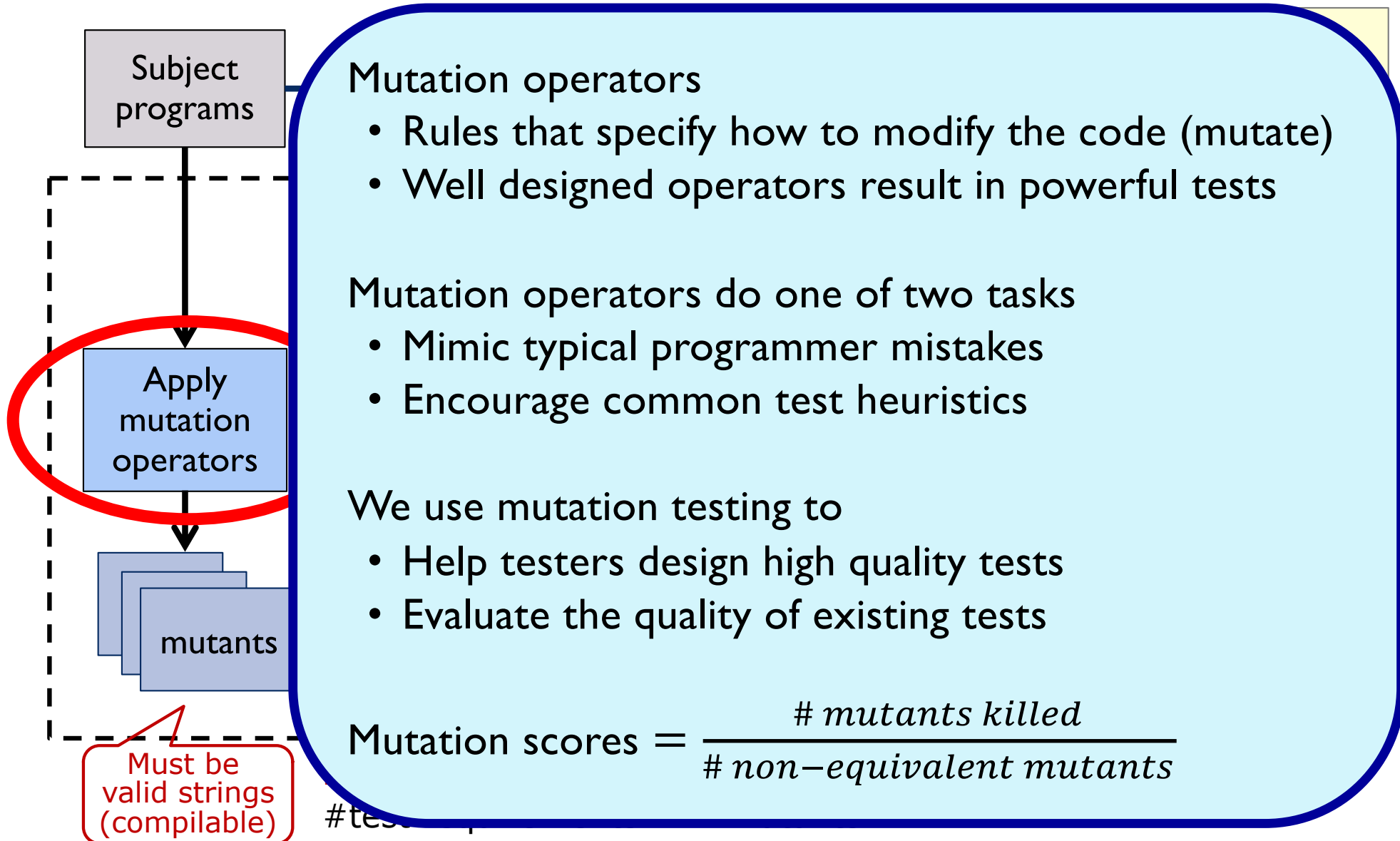
Killed!

Test x = {0, 1, 2};
 Very effective at exploring the boundary case

Mutation Testing



Mutation Testing



Mutation operators

- Rules that specify how to modify the code (mutate)
- Well designed operators result in powerful tests

Mutation operators do one of two tasks

- Mimic typical programmer mistakes
- Encourage common test heuristics

We use mutation testing to

- Help testers design high quality tests
- Evaluate the quality of existing tests

$$\text{Mutation scores} = \frac{\# \text{ mutants killed}}{\# \text{ non-equivalent mutants}}$$

tests

Killing Mutants

Given a mutant $m \in M$ for a ground string program P and a test t , t is said to **kill** m if and only if the output of t on P is **different** from the output of t on m .

- The quality of tests depends on mutation operators
- Different operators must be defined for different goals (and possibly for different programming languages)
- Testers add tests until **all** mutants have been killed
 - A mutant is killed if there is a test case for which the test results are different from the original program

Killing mutants \approx exposing faults

Categories of Mutants


- **Dead mutant**
 - A test case has killed it
 - The fault that a dead mutant represents will be detected by the same test that killed it
- **Uncompilable mutant**
 - Syntactically illegal
 - Should not be generated or should be immediately discarded
- **Trivial mutant**
 - Almost every test can kill it
- **(Functionally) equivalent mutant**
 - No test can kill it (same behavior or output as original, for all inputs)
 - Infeasible test requirements

Example: Program Mutation

```
public static int numZero(int[] x)
{
    int count = 0;
    for (int i=0; i<x.length; i++)
    {
        if (x[i] == 0)
            count++;
    }
    return count;
}
```

Original method

A fault is introduced
by mutating the code



Mutant

```
public static int numZero(int[] x)
{
    int count = 0;
    △ for (int i=1; i<x.length; i++)
    {
        if (x[i] == 0)
            count++;
    }
    return count;
}
```

Example: Program Mutation

```
public static int numZero(int[] x)
{
    int count = 0;
    △ for (int i=1; i<x.length; i++)
    {
        if (x[i] == 0)
            count++;
    }
    return count;
}
```


- $i=1$ is a mutation of $i=0$
- The code obtained by changing $i=0$ to $i=1$ is called a mutant of `numZero`
- A test kills the mutant if the mutant yields different outputs from the original code

- Consider $t1 = \{1, 0, 0\}$
 - Original returns 2, mutant returns 2, the mutant is not killed
- Consider $t2 = \{0, 1, 0\}$
 - Original returns 2, mutant returns 1, the mutant is killed

Example 2


```
public static int min(int x, int y)
{
    int v;
    if (x < y)
        v = x;
    else
        v = y;
    return v;
}
```

Original
method


```
public static int min(int x, int y)
{
    int v;
     if (x >= y)
        v = x;
    else
        v = y;
    return v;
}
```

mutant1

Each mutated statement represents a separate program

```
public static int min(int x, int y)
{
    int v;
     if (x <= y)
        v = x;
    else
        v = y;
    return v;
}
```

mutant2

```
public static int min(int x, int y)
{
    int v;
    if (x < y)
        v = x;
    else
     v = -y;
    return v;
}
```


mutant3

Example 2


Consider the following tests

- t1 = min(0, 0)
- t2 = min(0, 1)
- t3 = min(1, 0)


Which mutants will be killed by which tests?

```
public static int min(int x, int y)
{
    int v;
     if (x >= y)
        v = x;
    else
        v = y;
    return v;
}
```

mutant1

```
public static int min(int x, int y)
{
    int v;
     if (x <= y)
        v = x;
    else
        v = y;
    return v;
}
```

mutant2

```
public static int min(int x, int y)
{
    int v;
    if (x < y)
        v = x;
    else
     v = -y;
    return v;
}
```

mutant3

Example 2

	x	y	min	m1	m2	m3
t1	0	0	0	0	0	0
t2	0	1	0	1	0	0
t3	1	0	0	1	0	0

- t1 kills none of the mutants
- t2 kills m1
- t3 kills m1

```
public static int min(int x, int y)
{
    int v;
    Δ if (x >= y)
        v = x;
    else
        v = y;
    return v;
}
```

mutant1

```
public static int min(int x, int y)
{
    int v;
    Δ if (x <= y)
        v = x;
    else
        v = y;
    return v;
}
```

mutant2

Equivalent mutant

```
public static int min(int x, int y)
{
    int v;
    if (x < y)
        v = x;
    else
    Δ     v = -y;
    return v;
}
```

mutant3

Example 3

```
public static int min(int x, int y)
{
    int v;
    if (x < y)
        v = x;
    else
        v = y;
    return v;
}
```

Original method

Mutant 4: force the tester to create tests that cause every variable and expression to have the value of zero

With embedded mutants

```
public static int min(int x, int y)
{
    int v;
    if (x < y)
    if (x > y)
    {
        v = x;
        Bomb();
        v = y;
        v = failOnZero(y);
    }
    else
        v = y;
    return v;
}
```

△ 1 *Replace operator*
Immediate runtime failure .. If reached

△ 2 *Replace one variable with another*

△ 3

△ 4 *Immediate runtime failure if y == 0, else does nothing*

Mutation Coverage

Mutation Coverage (MC): For each $m \in M$, TR contains exactly one requirement, to kill m .

- The RIPR model
 - **Reachability**: the test causes the faulty (mutated) statement to be reached
 - **Infection**: the test causes the faulty statement to result in an incorrect state
 - **Propagation**: the incorrect state propagates to incorrect output
 - **Revealability**: the tester must observe part of the incorrect output
- The RIPR model leads to two variants of mutation coverage: **Strong** mutation and **Weak** mutation

1. Strong Mutation Coverage

Strong Mutation Coverage (SMC): For each $m \in M$, TR contains exactly one requirement, to strongly kill m .

- Require **RIPR**

Output of running
a test set on the
original program

\neq

Output of running
a test set on a
mutant

2. Weak Mutation Coverage

Weak Mutation Coverage (WMC): For each $m \in M$, TR contains exactly one requirement, to weakly kill m .

- Require **RI-R**
 - Check internal state immediately after execution of the mutated statement
 - If the state is incorrect, the mutant is killed
- A few mutants can be killed under weak mutation but not under strong mutation (**no propagation**)
 - Incorrect state does not always propagate to the output
- Test sets that weakly kill all mutants also strongly kill most mutants

Example (Mutant 1)

```
public static int min(int x, int y)
{
    int v;
    v = x;
    Δ 1 v = y;
    if (y < x)
    Δ 2 if (y > x)
    Δ 3 if (y < v)
    {
        v = y;
    Δ 4 v = x;
    }
    return v;
}
```

Consider mutant 1

Reachability: true

Infection: $x \neq y$

Propagation: $(y < x) = \text{false}$

Full test specification:

$$\begin{aligned} & \text{true} \wedge (x \neq y) \wedge ((y < x) = \text{false}) \\ & \equiv (x \neq y) \wedge (y \geq x) \\ & \equiv (y > x) \end{aligned}$$

Test case value:

$(x = 3, y = 5)$ strongly kill, weakly kill mutant 1

$(x = 5, y = 3)$ weakly kill, but not strongly kill

Example (Mutant 3)

```
public static int min(int x, int y)
{
    int v;
    v = x;
    v = y;
    if (y < x)
    if (y > x)
    if (y < v)
    {
        v = y;
        v = x;
    }
    return v;
}
```

△ 1

v = y;

△ 2

if (y > x)

△ 3

if (y < v)

△ 4

v = x;

Consider mutant 3

Reachability: true

Infection: $(y < x) \neq (y < v)$

However, the previous statement was $v = x$

Substitute the infection condition, we get

$(y < x) \neq (y < x)$

“Logical contradiction”

No input can kill this mutant ... “Equivalent mutant”

Designing Mutation Operators

Mutation Operators do one of two tasks:

- Mimic typical programmer mistakes
- Encourage common test heuristics

What are some of the common mistakes you may have made when writing programs?

Designing Mutation Operators (cont.)

Mutation Operators do one of two tasks:

- Mimic typical programmer mistakes
- Encourage common test heuristics

Researchers design many operators, then experimentally

- **Select** the most useful operators
- **Remove** the redundant operators

Effective Mutation Operators

- If tests that are created specifically to kill mutants created by a collection of mutation operators $O = \{o1, o2, \dots\}$ also kill mutants created by all remaining mutation operators with very high probability, then O defines an *effective* set of mutation operators

Example: Mutation Ops for Java Programs

2. AOR — Arithmetic Operator Replacement:

Each occurrence of one of the arithmetic operators $+$, $-$, $*$, $/$, and $\%$ is replaced by each of the other operators. In addition, each is replaced by the special mutation operators *leftOp*, and *rightOp*.

Example:

```
x = a + b;  
Δ 1 x = a * b;  
Δ 2 x = a % b;  
Δ 3 x = leftOp(a + b); // x = a  
Δ 4 x = rightOp(a + b); // x = b
```

[<http://cs.gmu.edu/~offutt/mujava/mutopsMethod.pdf>]

Example: Mutation Ops for Java Programs

3. ROR — Relational Operator Replacement:

Each occurrence of one of the relational operators ($<$, \leq , $>$, \geq , $=$, \neq) is replaced by each of the other operators and by falseOp and trueOp.

Example:

```

    if (m > n)
△ 1  if (m >= n)
△ 2  if (m == n)
△ 3  if (m != n)
△ 4  if (trueOp(m > n))    // if (true)
△ 5  if (falseOp(m > n))  // if (false)
```

[<http://cs.gmu.edu/~offutt/mujava/mutopsMethod.pdf>]

Example: Mutation Ops for Java Program

SDL – Statement Deletion

SDL deletes each executable statement by commenting them out. It does not delete declarations.

General
statement
deletion

```
public void test()  
{  
    int a, b;  
    a = 1;  
    b = 2;  
}
```

Original method

```
public void test()  
{  
    int a, b;  
    // a = 1;  
    b = 2;  
}
```

Mutant 1

```
public void test()  
{  
    int a, b;  
    a = 1;  
    // b = 2;  
}
```

Mutant 2

Figure 1. General statement deletion mutation operator

```
public void test()  
{  
    int a, b, c, t;  
    if (a==0)  
    {  
        b = 3;  
    }  
    for (int i = 0; i<5; i++)  
        t = t + b + c;  
}
```

Original method

```
public void test()  
{  
    int a, b, c, t;  
    // if (a==0)  
    // {  
    //     b = 3;  
    // }  
    for (int i = 0; i<5; i++)  
        t = t + b + c;  
}
```

Mutant 1

```
public void test()  
{  
    int a, b, c, t;  
    if (a==0)  
    {  
        b = 3;  
    }  
    // for (int i = 0; i<5; i++)  
    //     t = t + b + c;  
}
```

Mutant 2

Example: Mutation Ops for Web Apps

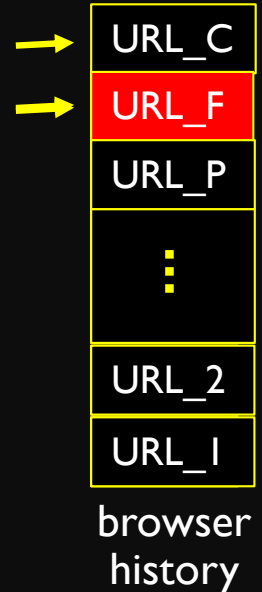
FOB – FailOnBack

```
<html>
```

```
  <body>  
  △ <body onload="manipulatehistory()">  
    <script src="failOnBack.js"></script>
```

```
  ...  
</html>
```

```
failOnBack.js function manipulatehistory()  
{  
  var currentpage = window.document.toString();  
  var currenturl = window.location.href;  
  var pageData = window.document.toString();  
  
  // add a dummy url right before the current url  
  history.replaceState( pageData, "dummyurl", "failonback.html" );  
  history.pushState( currentpage, "currenturl", currenturl);  
}  
  
// update the page content  
window.addEventListener( 'popstate', function(event) {  
  window.location.reload();  });
```



[<https://cs.gmu.edu/~offutt/documents/theses/UpsornPraphamontripong-Dissertation.pdf>]

Example: Mutation Ops for Web Apps

WSCR – Scope replacement

```
<html>
...
<jsp:useBean id = id1 scope = "page" class = class1 />
△ <jsp:useBean id = id1 scope = "session" class = class1 />
...
</html>
```

WSIR – Session initialization replacement

```
Public class logout extends HttpServlet
{
    public void doGet( ... )
    {
        session = request.getSession(true);
        △ session = request.getSession(false);
        ...
    }
}
```

WSAD – Session setAttribute deletion

```
Public class logout extends HttpServlet
{
    public void doGet( ... )
    {
        session.setAttribute(attr1, value1);
        △ // session.setAttribute(attr1, value1);
        ...
    }
}
```

[<https://cs.gmu.edu/~offutt/documents/theses/UpsornPraphamontripong-Dissertation.pdf>]

Example: Mutation Ops for Android Apps

- OnClick Event Replacement (ECR)
 - Replaces event handlers with other compatible handler

```
mPrepUp.setOnClickListener (new OnClickListener() {  
    public void onClick (View v) {  
        decrementPrepTime ();  
    });  
mPrepDown.setOnClickListener (new OnClickListener() {  
    public void onClick (View v) {  
        decrementPrepTime (); }  
});
```

- OnTouch Event Replacement (ETR)
 - Replaces OnTouch events, similar to ECR

[<https://cs.gmu.edu/~offutt/documents/theses/LinDeng-Dissertation.pdf>]

Mutation Testing in Practice

- **Strongest test criterion** but very difficult + expensive to apply
- **Subsumes** other criteria by including specific mutation operators
- **First-order mutation** due to Competent programmers and coupling effect

Do fewer

- Selective mutation operators
- Removing redundancy

Do smarter

- Weak mutation
- Distributed execution

Do faster

- Schemata

+

Automation

- Mutant generation
- Mutant execution

Summary

- Mutation is very effective – the “gold standard” of testing
- Used to **evaluate** other criteria
- Applied to various software artifacts, languages, frameworks with different implementation and specific definition of mutation operators
- Most expensive ... **# test requirements = # mutants**
- Very difficult to apply by hand – need automation
- To improve the test process, use **selective mutation operators**