

# Applicability of Mutation Testing to Space Software

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ADCSS 2023 - November 15<sup>th</sup>, 2023



# Fault-based, Automated Quality Assurance Assessment and Augmentation for Space Software 2 (FAQAS-1 & 2)



**SnT/University of Luxembourg**

- Technology provider



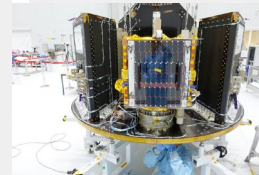
**Gomspace Luxembourg (GSL)**

- Develop Nanosatellites
- Case study provider
- Technology validator




**LuxSpace**

- Develop Microsatellites
- Case study provider
- Technology validator




**Huld - Finland**

- Develop SW solutions
- ISVV supplier
- Case study provider
- Technology validator



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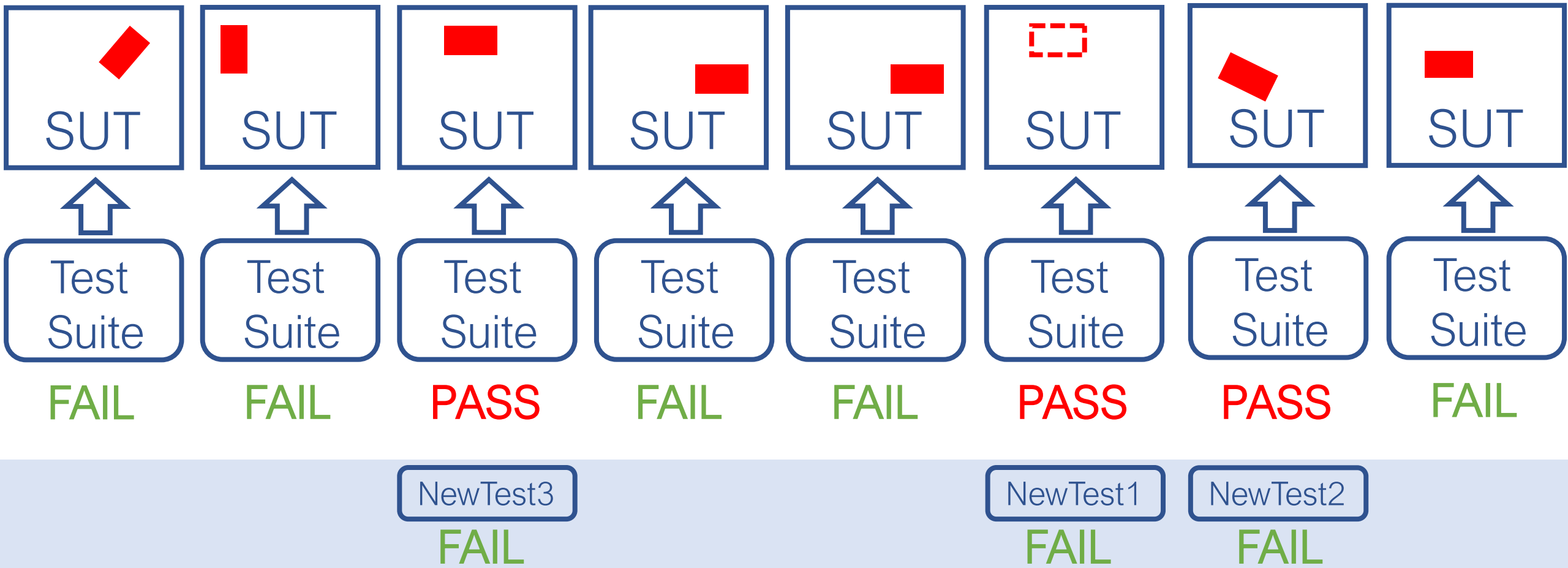
<https://faqas.uni.lu/>





How to ensure  
thorough testing?

# Mutation Analysis and Testing

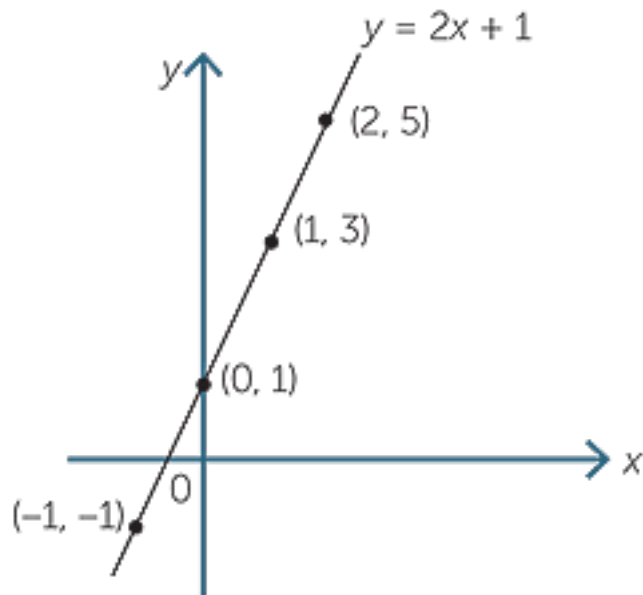


Improve with Automatically Generated Test Cases

# Simplified example

# Software Under Test

```
//  
// Computes the y in a straight line.  
// Return the result of  $m \cdot x + c$   
//  
int computeY( int m, int x, int c){ ...
```



# Software Under Test

```
//  
// Computes the y in a straight line.  
// Return the result of m*x+c  
//  
int computeY( int m, int x, int c){ ...
```

Is this test suite effective?

# Test Suite

```
void test_non_zero() {  
    int res = computeY( 1, 2, 2);  
    //1*2+2 = 4  
    assert( 4 == res);  
}  
  
void test_zero_coefficients() {  
    int res = computeY( 0, 3, 0);  
    //0*2+0 = 0  
    assert( 0 == res);  
}  
  
void test_zero_x() {  
    int res = computeY( 2, 0, 0);  
    //2*0+0 = 0  
    assert( 0 == res);  
}
```



# Software Under Test

```
//  
// Computes the y in a straight line.  
// Return the result of m*x+c  
//  
int computeY( int m, int x, int c){  
    return m*x+c;  
}
```

# Test Suite

```
void test_non_zero() {  
    int res = computeY( 1, 2, 2);  
    //1*2+2 = 4  
    assert( 4 == res);  
}  
  
void test_zero_coefficients() {  
    int res = computeY( 0, 3, 0);  
    //0*2+0 = 0  
    assert( 0 == res);  
}  
  
void test_zero_x() {  
    int res = computeY( 2, 0, 0);  
    //2*0+0 = 0  
    assert( 0 == res);  
}
```

# Software Under Test

```
//
// Computes the y in a straight line.
// Return the result of m*x+c
//
int computeY( int m, int x, int c){
    return m*x+c;
}
```

100% statement coverage

100% branches coverage

100% MC/DC

# Test Suite

```
void test_non_zero() {
    int res = computeY( 1, 2, 2);
    //1*2+2 = 4
    assert( 4 == res);    PASS
}                          1*2*2 = 4

void test_zero_coefficients() {
    int res = computeY( 0, 3, 0);
    //0*2+0 = 0
    assert( 0 == res);    PASS
}                          0*2*0 = 0

void test_zero_x() {
    int res = computeY( 2, 0, 0);
    //2*0+0 = 0
    assert( 0 == res);    PASS
}                          2*0*0 = 0
```

# Software Under Test

```
//
// Computes the y in a straight line.
// Return the result of m*x+c
//
int computeY( int m, int x, int c){
    return m*x*c;
}
```

We create mutants by automatically applying a set of “mutation operators”.

For simplicity, we apply only the “arithmetic operator deletion” operator

# Test Suite

```
void test_non_zero() {
    int res = computeY( 1, 2, 2);
    //1*2+2 = 4
    assert( 4 == res);
}

void test_zero_coefficients() {
    int res = computeY( 0, 3, 0);
    //0*2+0 = 0
    assert( 0 == res);
}

void test_zero_x() {
    int res = computeY( 2, 0, 0);
    //2*0+0 = 0
    assert( 0 == res);
}
```

# Software Under Test

```
//
// Computes the y in a straight line.
// Return the result of m*x+c
//
int computeY( int m, int x, int c){
    return m*x+c;
}
```

## MUTANT1

```
int computeY( int m, int x, int c){
    return m*x;
}
```

## MUTANT2

```
int computeY( int m, int x, int c){
    return x*c;
}
```

# Test Suite

```
void test_non_zero() {
    int res = computeY( 1, 2, 2);
    //1*2+2 = 4
    assert( 4 == res);
}

void test_zero_coefficients() {
    int res = computeY( 0, 3, 0);
    //0*2+0 = 0
    assert( 0 == res);
}

void test_zero_x() {
    int res = computeY( 2, 0, 0);
    //2*0+0 = 0
    assert( 0 == res);
}
```

# Software Under Test

```
//
// Computes the y in a straight line.
// Return the result of m*x+c
//
int computeY( int m, int x, int c){
    return m*x+c;
}
```

## MUTANT1

```
int computeY( int m, int x, int c){
    return m*x;
}
```

## MUTANT2

```
int computeY( int m, int x, int c){
    return x*c;
}
```

# Test Suite

```
void test_non_zero() {
    int res = computeY( 1, 2, 2);
    //1*2+2 = 4
    assert( 4 == res);    FAIL
}                          1*2 = 2
```

```
void test_zero_coefficients() {
    int res = computeY( 0, 3, 0);
    //0*2+0 = 0
    assert( 0 == res);    PASS
}                          0*2 = 0
```

```
void test_zero_x() {
    int res = computeY( 2, 0, 0);
    //2*0+0 = 0
    assert( 0 == res);    PASS
}                          2*0 = 0
```

# Software Under Test

```
//
// Computes the y in a straight line.
// Return the result of m*x+c
//
int computeY( int m, int x, int c){
    return m*x*c;
}
```

MUTANT1

```
int computeY( int m, int x, int c){
    return m*x;
}
```

MUTANT2

```
int computeY( int m, int x, int c){
    return x*c;
}
```

# Test Suite

```
void test_non_zero() {
    int res = computeY( 1, 2, 2);
    //1*2+2 = 4
    assert( 4 == res);    PASS
}                          2*2 = 4
```

```
void test_zero_coefficients() {
    int res = computeY( 0, 3, 0);
    //0*2+0 = 0
    assert( 0 == res);    PASS
}                          2*0 = 0
```

```
void test_zero_x() {
    int res = computeY( 2, 0, 0);
    //2*0+0 = 0
    assert( 0 == res);    PASS
}                          0*0 = 0
```

# Software Under Test

```
//  
// Computes the y in a straight line.  
// Return the result of m*x+c  
//  
int computeY( int m, int x, int c){  
    return m*x*c;  
}
```

```
MUTANT1  
int computeY( int m, int x, int c){  
    return m*x;  
}
```

```
MUTANT2  
int computeY( int m, int x, int c){  
    return x*c;  
}
```

Mutation score = 50%  
(test suite incomplete)

The live mutant lacks 'm'.  
It means that  
we are not testing  
the effect of  
'm' on the result

# Software Under Test

```
//
// Computes the y in a straight line.
// Return the result of m*x+c
//
int computeY( int m, int x, int c){
    return m*x+c;
}
```

MUTANT1

```
int computeY( int m, int x, int c){
    return m*x;
}
```

MUTANT2

```
int computeY( int m, int x, int c){
    return x*c;
}
```

# Test Suite

Create an additional test case that verifies the effect of 'm' on the result

```
void test_MUTANT_2() {
    int res = computeY( 3, 2, 2);
    //3*2+2 = 8
    assert( 8 == res);
}
```

Mutant killed:  $3*2*2 \neq 2*2$

Bug discovered: test case fails with original program

$3*2*2=12$





# FAQAS - FAQAS2

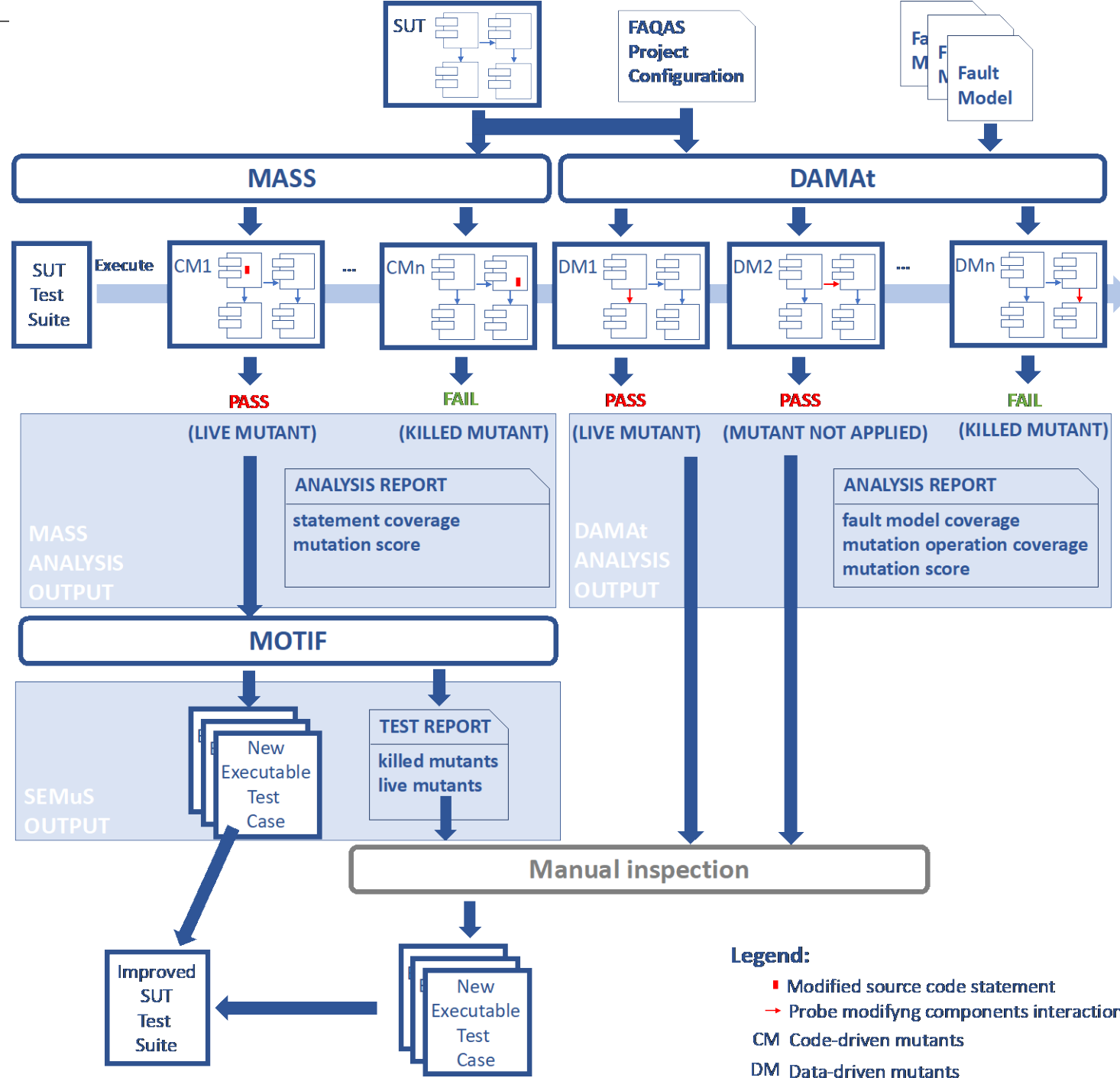
**Fault-based, Automated Quality Assurance Assessment and Augmentation for Space Software**

**APPLICABILITY OF MUTATION TESTING METHOD FOR FLIGHT SOFTWARE.**

Activity No. 100028866 in the esa-star system

**IMPROVE MUTATION TESTING IN SPACE SOFTWARE SYSTEMS.**

Activity No. 1000033730 in the esa-star system



# Problems Addressed

- How to make mutation analysis scale?
- How to assess if test suites verify components integration properly?
- How to generate test cases that kill mutants in C software?

# Problems Addressed

- How to make mutation analysis scale?

- How to assess if test suites v properly?

- How to generate test cases

<https://github.com/SNTSVV/MASS>

## Mutation Analysis for Cyber-Physical Systems: Scalable Solutions and Results in the Space Domain

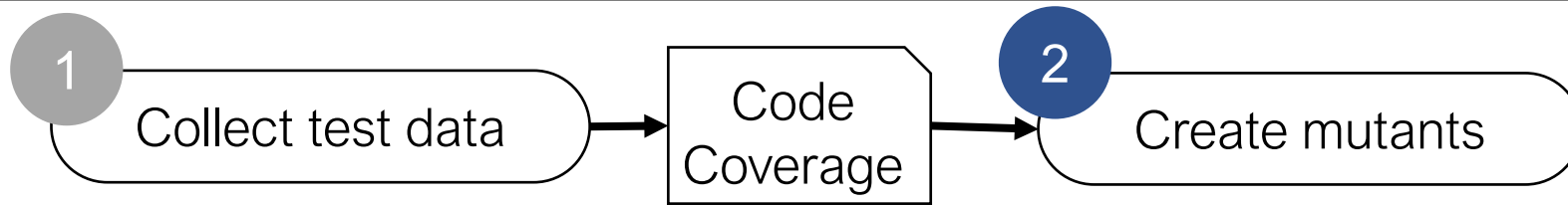
Oscar Cornejo<sup>id</sup>, Fabrizio Pastore<sup>id</sup>, *Member, IEEE*, and Lionel C. Briand<sup>id</sup>, *Fellow, IEEE*

**Abstract**—On-board embedded software developed for spaceflight systems (*space software*) must adhere to stringent software quality assurance procedures. For example, verification and validation activities are typically performed and assessed by third party organizations. To further minimize the risk of human mistakes, space agencies, such as the European Space Agency (ESA), are looking for automated solutions for the assessment of software testing activities, which play a crucial role in this context. Though space software is our focus here, it should be noted that such software shares the above considerations, to a large extent, with embedded software in many other types of cyber-physical systems. Over the years, mutation analysis has shown to be a promising solution for the automated assessment of test suites; it consists of measuring the quality of a test suite in terms of the percentage of injected faults leading to a test failure. A number of optimization techniques, addressing scalability and accuracy problems, have been proposed to facilitate the industrial adoption of mutation analysis. However, to date, two major problems prevent space agencies from enforcing mutation analysis in space software development. First, there is uncertainty regarding the feasibility of applying mutation analysis optimization techniques in their context. Second, most of the existing techniques either can break the real-time requirements common in embedded software or cannot be applied when the software is tested in Software Validation Facilities, including CPU emulators and sensor simulators. In this paper, we enhance mutation analysis optimization techniques to enable their applicability to embedded software and propose a pipeline that successfully integrates them to address scalability and accuracy issues in this context, as described above. Further, we report on the largest study involving embedded software systems in the mutation analysis literature. Our research is part of a research project funded by ESA ESTEC involving private companies (GomSpace Luxembourg and LuxSpace) in the space sector. These industry partners provided the case studies reported in this paper; they include an on-board software system managing a microsatellite currently on-orbit, a set of libraries used in deployed cubesats, and a mathematical library certified by ESA.

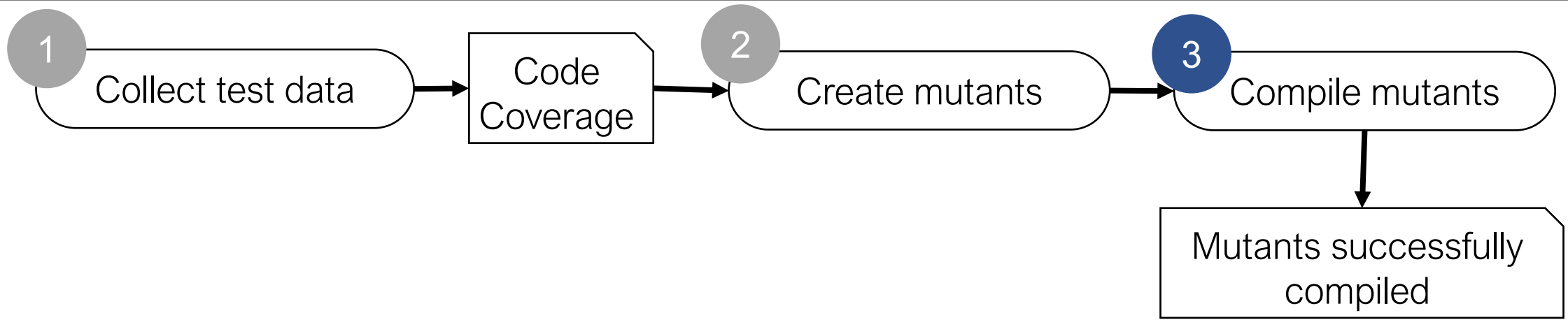
**Index Terms**—Mutation analysis, mutation testing, space software, embedded software, cyber-physical systems

# Mutation Analysis for Space Software (MASS)

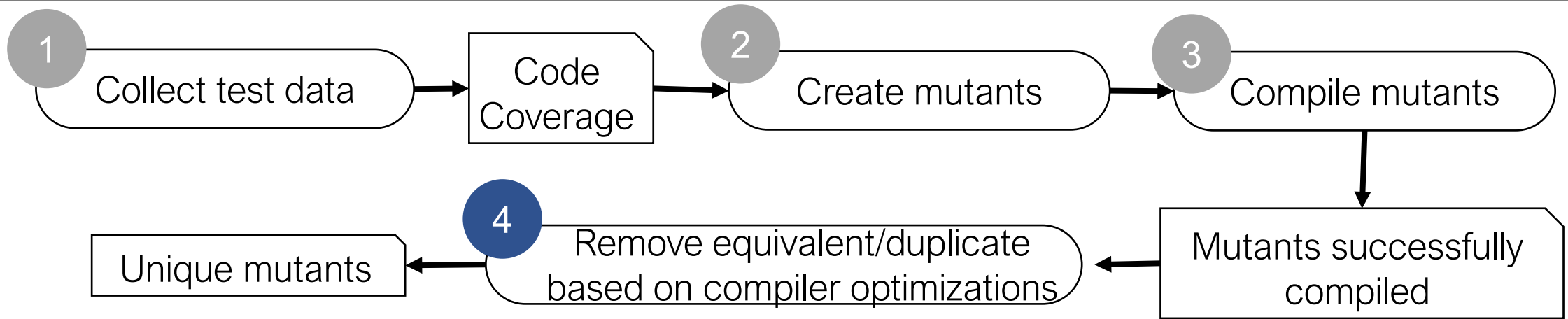


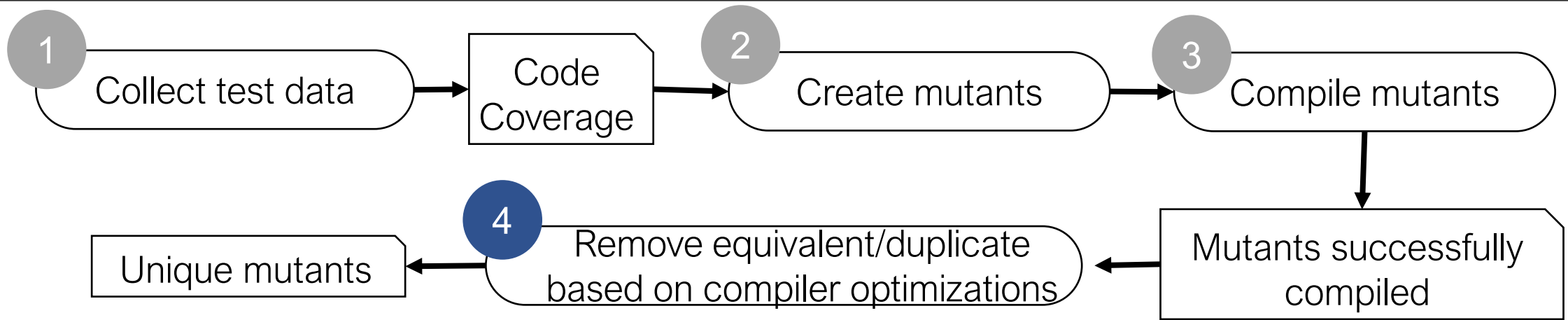


	Operator	Description*
Sufficient Set	ABS	$\{(v, -v)\}$
	AOR	$\{(op_1, op_2) \mid op_1, op_2 \in \{+, -, *, /, \%\} \wedge op_1 \neq op_2\}$ $\{(op_1, op_2) \mid op_1, op_2 \in \{+=, -=, *=, /=, \%= \} \wedge op_1 \neq op_2\}$
	ICR	$\{(i, x) \mid x \in \{1, -1, 0, i + 1, i - 1, -i\}\}$
	LCR	$\{(op_1, op_2) \mid op_1, op_2 \in \{\&\&, \ \ \} \wedge op_1 \neq op_2\}$ $\{(op_1, op_2) \mid op_1, op_2 \in \{\&=,  =, \&= \} \wedge op_1 \neq op_2\}$ $\{(op_1, op_2) \mid op_1, op_2 \in \{\&,  , \&\& \} \wedge op_1 \neq op_2\}$
	ROR	$\{(op_1, op_2) \mid op_1, op_2 \in \{>, >=, <, <=, ==, !=\}\} \{(e, !(e)) \mid e \in \{\text{if}(e), \text{while}(e)\}\}$
	SDL	$\{(s, \text{remove}(s))\}$
	UOI	$\{(v, -v), (v, v-), (v, ++v), (v, v++)\}$
OODL Set	AOD	$\{((t_1 \text{ op } t_2), t_1), ((t_1 \text{ op } t_2), t_2) \mid op \in \{+, -, *, /, \%\}\}$
	LOD	$\{((t_1 \text{ op } t_2), t_1), ((t_1 \text{ op } t_2), t_2) \mid op \in \{\&\&, \ \ \}\}$
	ROD	$\{((t_1 \text{ op } t_2), t_1), ((t_1 \text{ op } t_2), t_2) \mid op \in \{>, >=, <, <=, ==, !=\}\}$
	BOD	$\{((t_1 \text{ op } t_2), t_1), ((t_1 \text{ op } t_2), t_2) \mid op \in \{\&,  , \wedge\}\}$
	SOD	$\{((t_1 \text{ op } t_2), t_1), ((t_1 \text{ op } t_2), t_2) \mid op \in \{\gg, \ll\}\}$
Other	LVR	$\{(l_1, l_2) \mid (l_1, l_2) \in \{(0, -1), (l_1, -l_1), (l_1, 0), (\text{true}, \text{false}), (\text{false}, \text{true})\}\}$









Original program

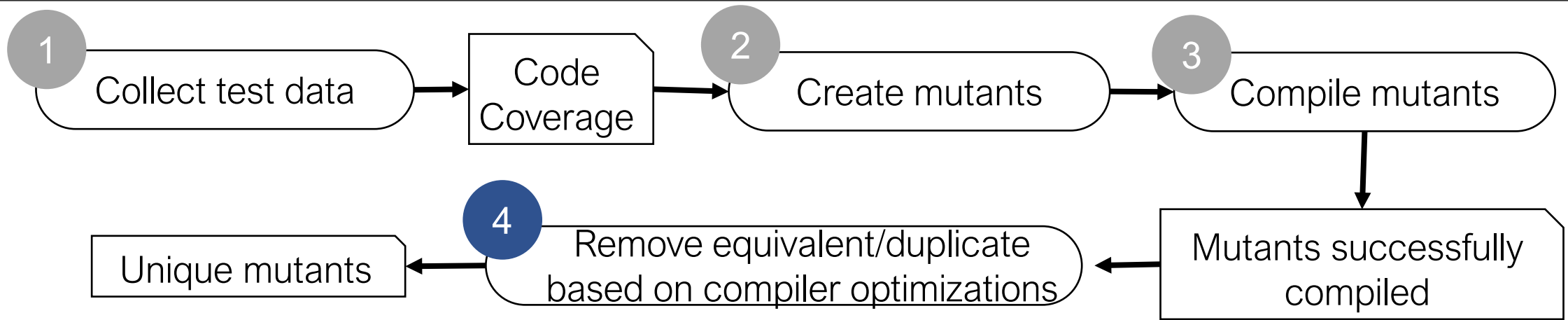
```
int abs( int x){  
    if ( x < 0 )  
        return -x;  
    return x;  
}
```

Mutant

```
int abs( int x){  
    if ( x <= 0 )  
        return -x;  
    return x;  
}
```

Equivalent:

returns the same output for any input



```

int same( int a[],
          int b[],
          int len){
    int i=0;
    if ( len < 0 ) return -1;
    while ( i < len ){
        if ( a[i] != b[i] )
            return 0;
        i++;
    }
    return 1;
}

```

Original program

```

int same( int a[],
          int b[],
          int len){
    int i=0;
    if ( len < 0 ) return -1;
    while ( i < 0 ){
        if ( a[i] != b[i] )
            return 0;
        i++;
    }
    return 1;
}

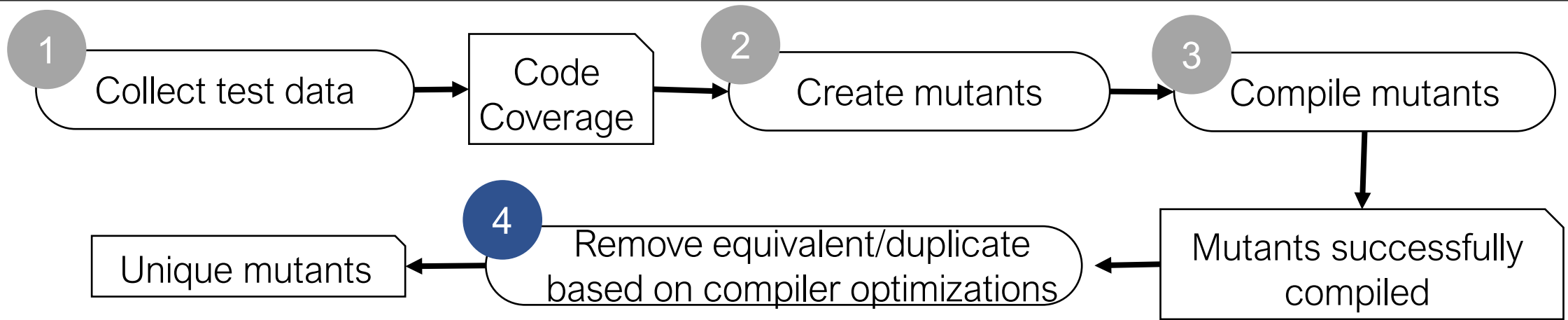
```

Duplicate mutants: both skip the loop and return 1

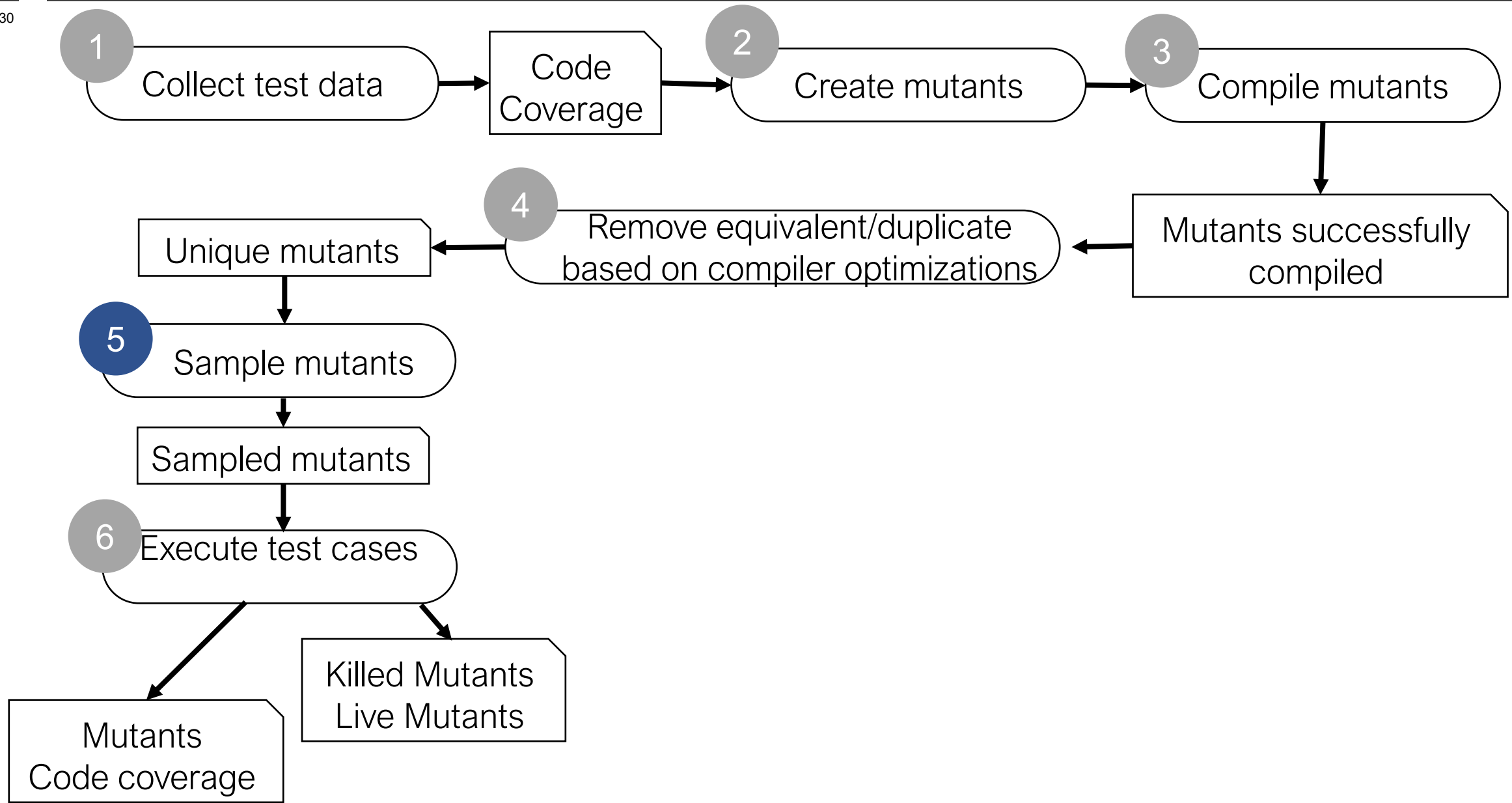
```

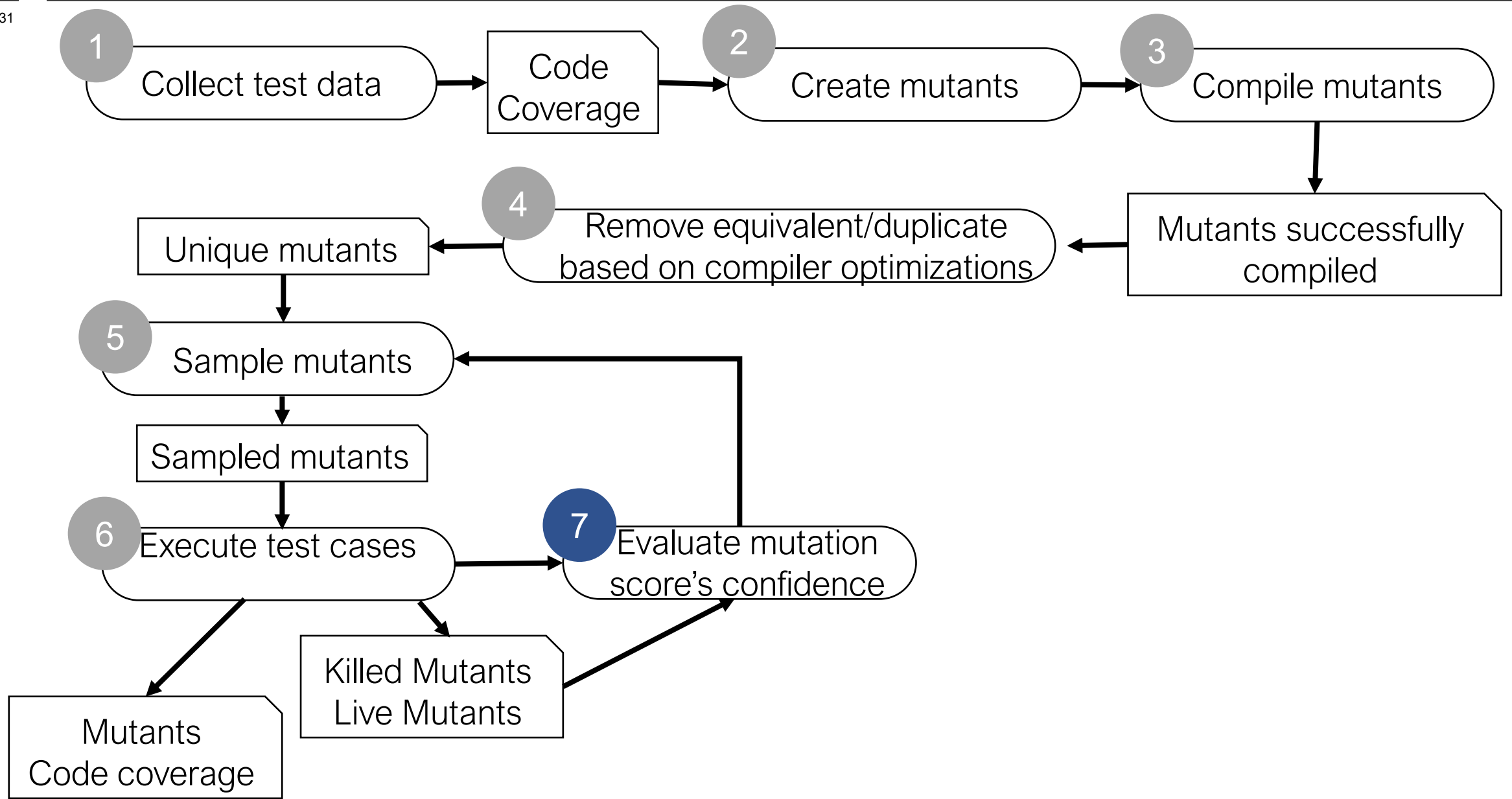
int same( int a[],
          int b[],
          int len){
    int i=0;
    if ( len < 0 ) return -1;
    while ( i > len ){
        if ( a[i] != b[i] )
            return 0;
        i++;
    }
    return 1;
}

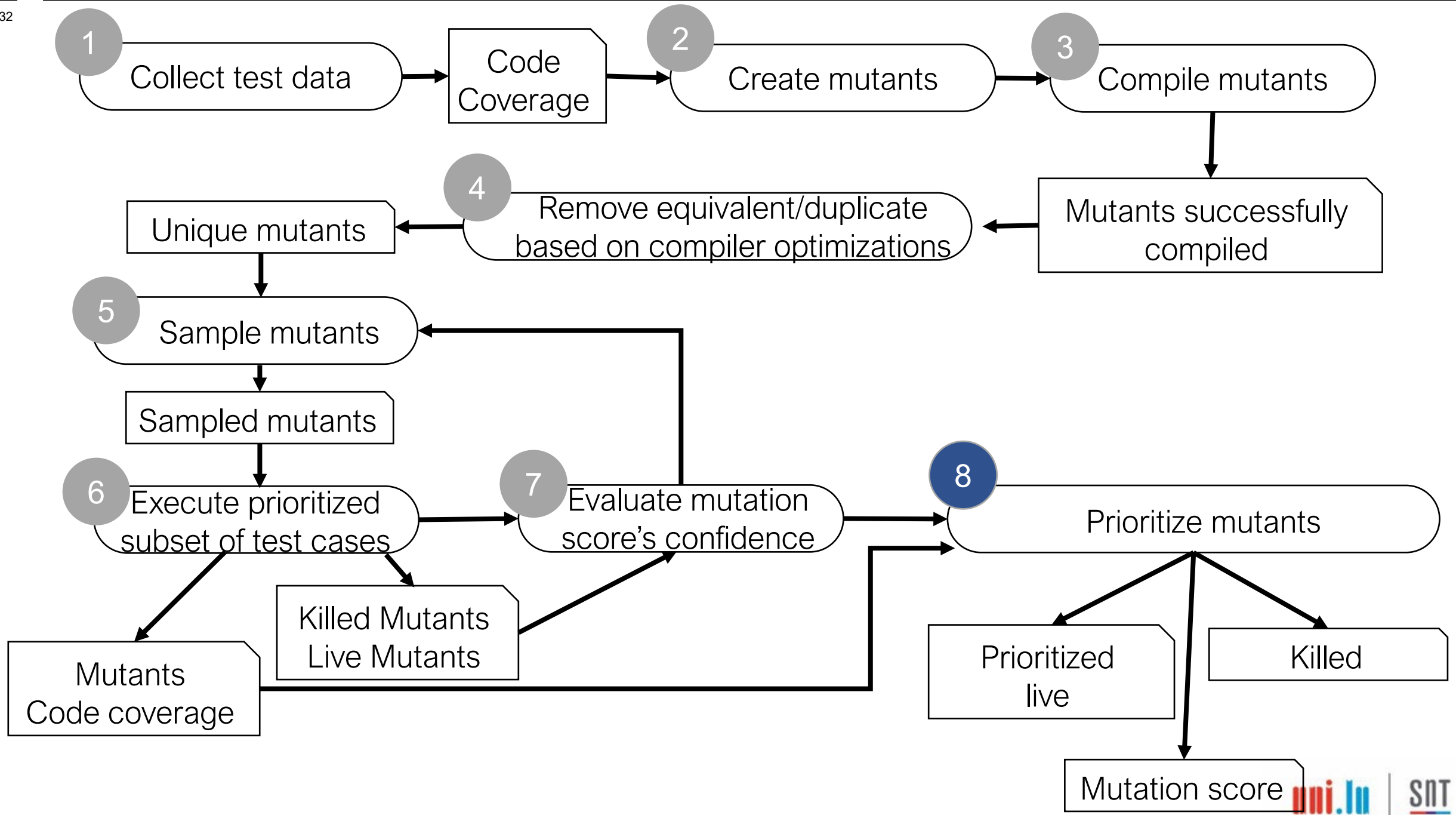
```

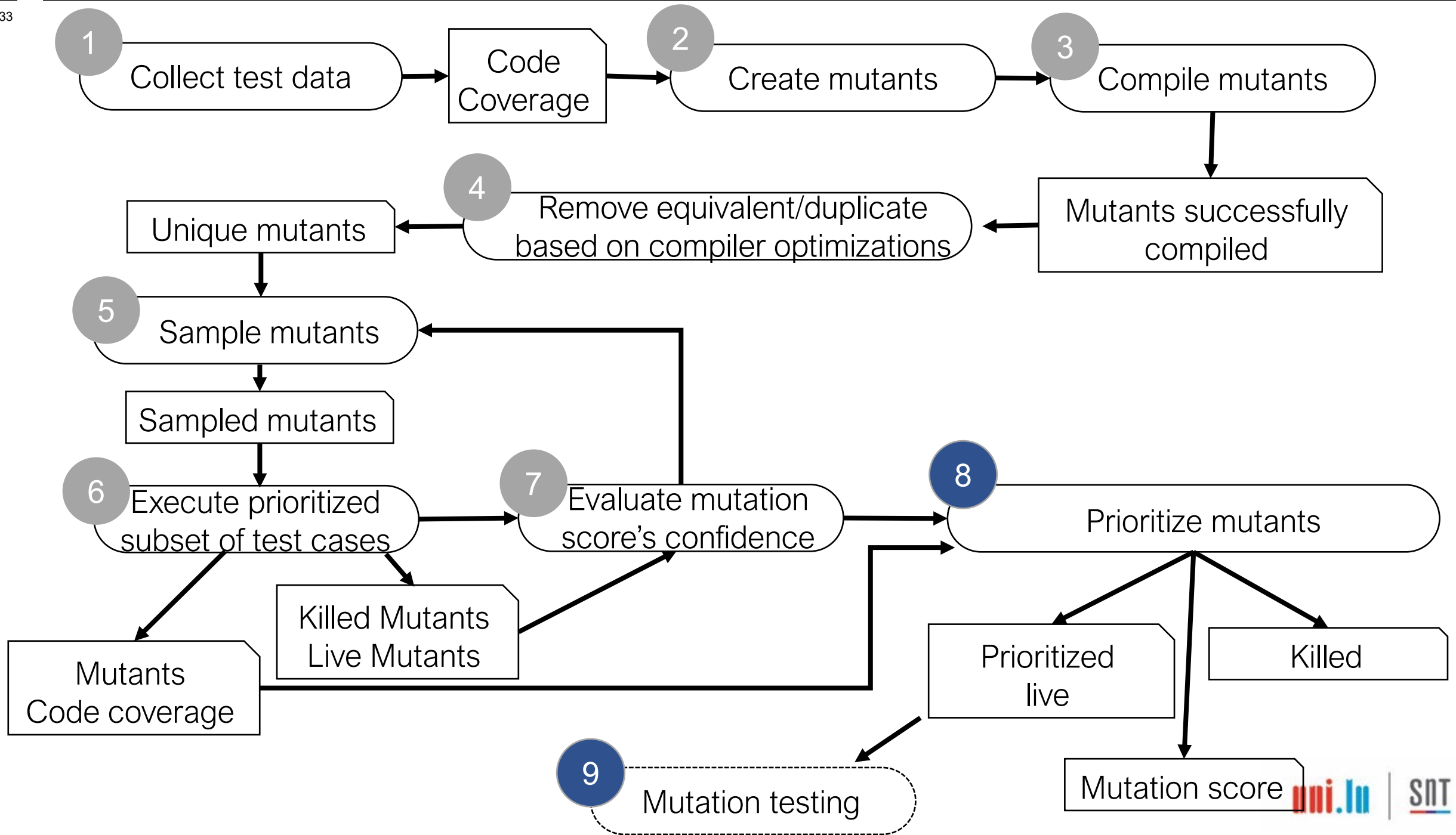


- Equivalent programs may lead to same executables after compiler optimizations
- We compile the original software and every mutant multiple times
  - once for each optimization option (i.e., -O0, -O1, -O2, -O3, -Os, -Ofast in GCC)
  - we compute the SHA-512 hash summary of the generated executable
  - we compare hash summaries







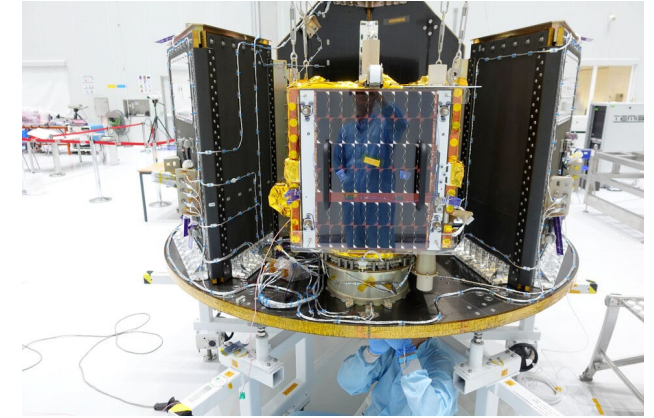




# Empirical Evaluation

# Case study subjects

- Control software of LuxSpace's ESAIL satellite
- Control software of Huld's Bepicolombo satellite
- Network, Configuration, and Utility libraries from GomSpace's nanosatellites
- MLFS - Mathematical Library for Flight Software by ESA



Subject	LOC	Test suite	# Test Cases
ESAIL (subset)	2,235	System	384
LibNet	9,836	Integration	89
LibConf	3,179	Integration	170
LibUtil	10,576	Unit	201
MLFS	5,402	Unit	4042
Bepicolombo	30,000	System	133

# Results

- For our largest subject, MASS makes mutation analysis feasible in half a day with 100 nodes in a grid infrastructure (more than 100 days without MASS)
- Overall key findings:
  - Discovered lack of oracles (e.g., do not verify all the entries of a structure)
  - reported missing test cases for exception handling code
  - detected incomplete verification of math formulae

```
# Copyright (c) University of Luxembourg 2021.
# Created by Oscar Eduardo CORNEJO OLIVARES, oscar.cornejo@uni.lu, SnT, 2021.
#

# set SRCIROR path
# example: $HOME/FAQAS/MASS
export SRCIROR=/home/vagrant/FAQAS/MASS

export LLVM_BUILD=${SRCIROR}/llvm-build
export SRCIROR_SRC_MUTATOR=${SRCIROR}/SRCMutation/build/mutator
export SRCIROR_LLVM_BIN=${LLVM_BUILD}/Release+Asserts/bin/
export SRCIROR_LLVM_INCLUDES=${LLVM_BUILD}/Release+Asserts/lib/clang/3.8.0/include/
export SRCIROR_COMPILER=${SRCIROR}/PythonWrappers/mutationClang
export MASS=${SRCIROR}/MASS

####

# set directory path where MASS files can be stored
# example: APP_RUN_DIR=/opt/example
export APP_RUN_DIR="/home/vagrant/mass_workspace"

# specifies the building system, available options are "Makefile" and "waf"
# example: BUILD_SYSTEM="Makefile"
export BUILD_SYSTEM="waf"

# directory root path of the software under test
# example: PROJ=$HOME/mlfs
export PROJ=/home/vagrant/libutil

# directory src path of the SUT
# example: PROJ_SRC=$PROJ/libm
export PROJ_SRC=/home/vagrant/libutil/src

# directory test path of the SUT
# example: PROJ_TST=$HOME/unit-test-suite
export PROJ_TST=/home/vagrant/libutil/tst

# directory coverage path of the SUT
# example: PROJ_COV=$HOME/blts_workspace
export PROJ_COV=${PROJ_TST}

# directory path of the compiled binary
# example: PROJ_BUILD=${PROJ}/build-host/bin
export PROJ_BUILD=/home/vagrant/libutil/build/

# list of folders not to be included during the analysis
# example: COVERAGE_NOT_INCLUDE="tst\libutil\libgscsp\libparam_client"
export COVERAGE_NOT_INCLUDE=

# filename of the compiled file/library
# example: COMPILED=libmlfs.a
export COMPILED=libgsutil.so

# path to original Makefile
```



Len of time.mut.45.2\_5\_35.ROR.gs\_time\_sleep\_ns|src/linux/time.c 1

size list A: 3

size list B: 6

size list equivalents: 0

MutationScore

step number 7

waiting for IdentifyEquivalents to be completed

Executing MutationScore...

##### MASS Output #####

## Total mutants generated: 639

## Total mutants filtered by TCE: 171

## Sampling type: uniform

## Total mutants analyzed: 47

## Total killed mutants: 38

## Total live mutants: 9

## Total likely equivalent mutants: 0

## MASS mutation score (%): 80.85

## List A of useful undetected mutants: /home/vagrant/mass\_workspace/DETECTION/test\_ru

## List B of useful undetected mutants: /home/vagrant/mass\_workspace/DETECTION/test\_ru

## Number of statements covered: 118

## Statement coverage (%): 4.15

## Minimum lines covered per source file: 0

## Maximum lines covered per source file: 32

# Problems Addressed

- How to make mutation analysis scale?
- How to assess if test suites verify components integration properly?
- How to generate test cases that

<https://github.com/SNTSVV/DAMAT>

2182

IEEE TRANSACTIONS ON SOFTWARE ENGINEERING, VOL. 49, NO. 4, APRIL 2023

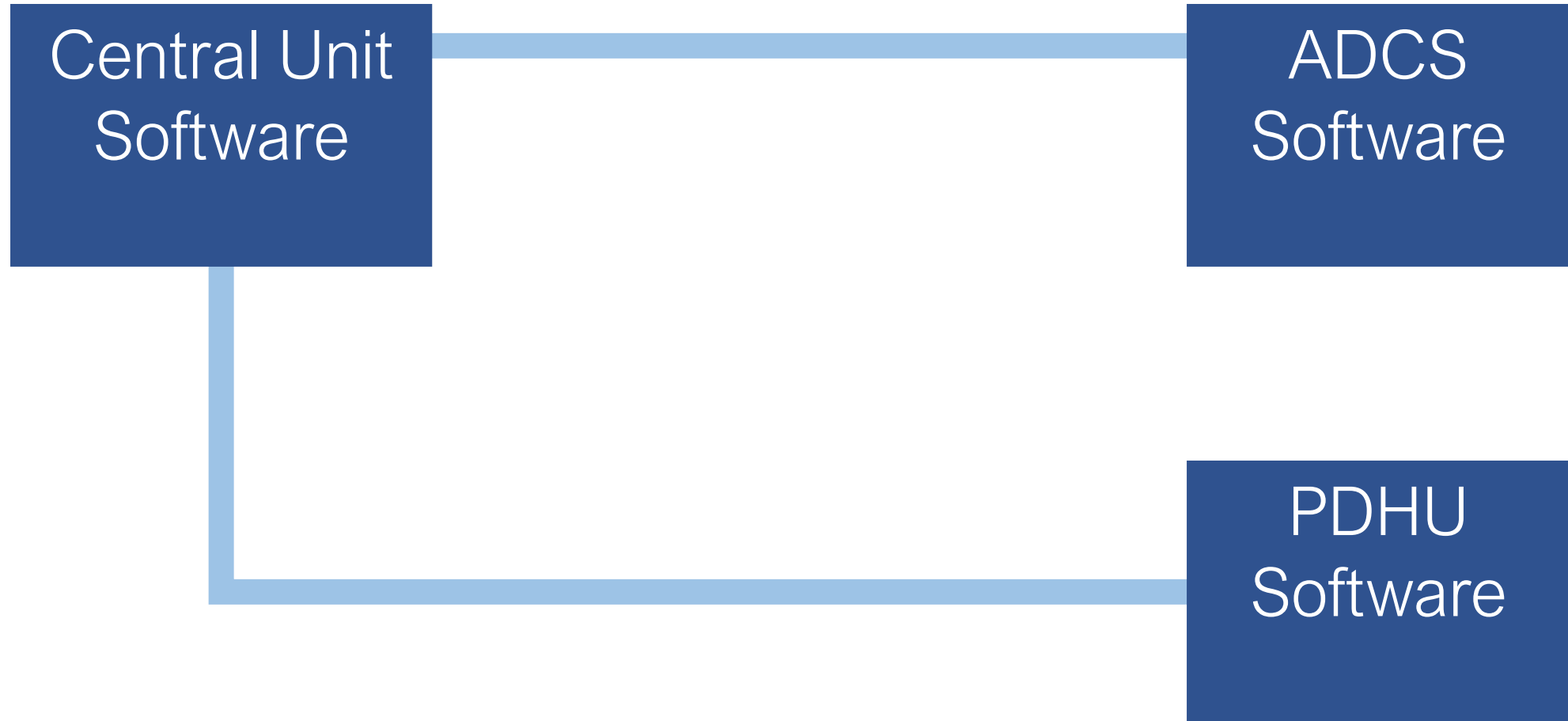
## Data-Driven Mutation Analysis for Cyber-Physical Systems

Enrico Viganò, Oscar Cornejo<sup>1</sup>, Fabrizio Pastore<sup>1</sup>, *Member, IEEE*, and Lionel C. Briand<sup>2</sup>, *Fellow, IEEE*

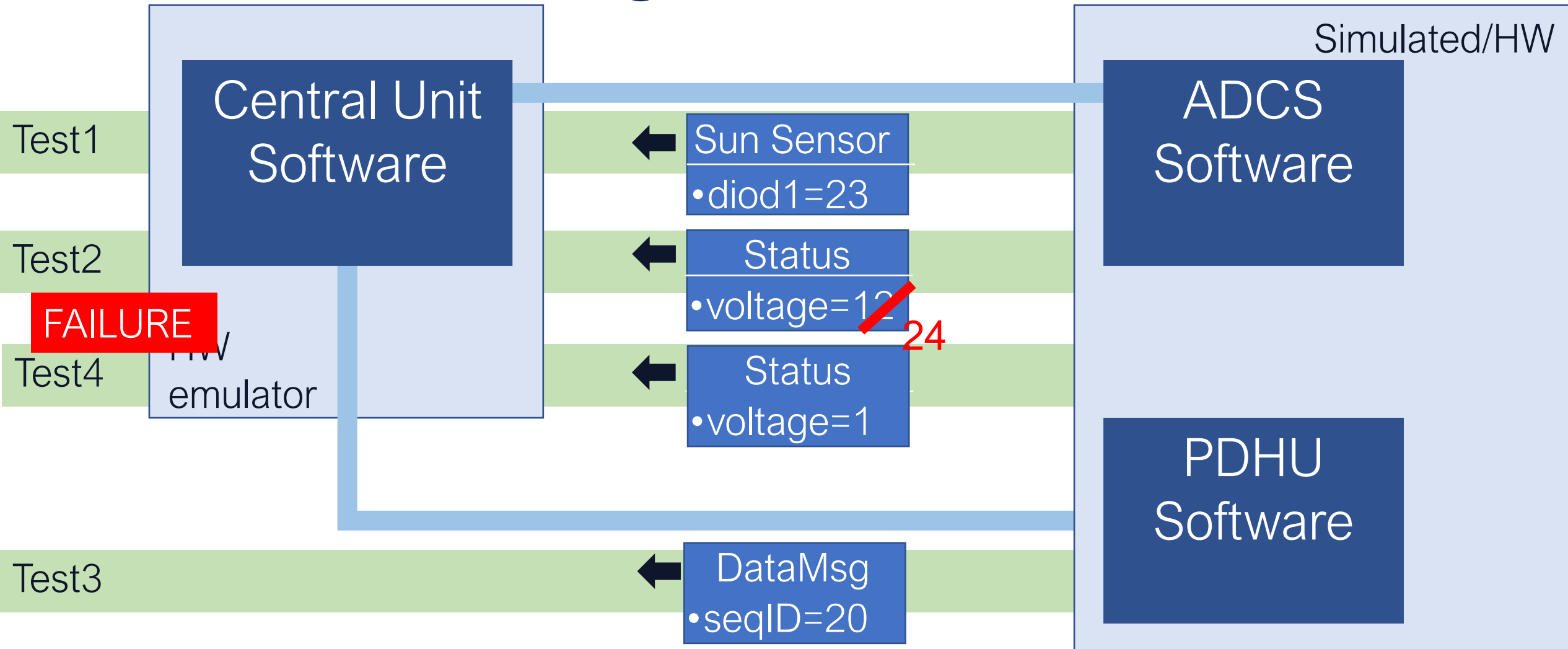
**Abstract**—Cyber-physical systems (CPSs) typically consist of a wide set of integrated, heterogeneous components; consequently, most of their critical failures relate to the interoperability of such components. Unfortunately, most CPS test automation techniques are preliminary and industry still heavily relies on manual testing. With potentially incomplete, manually-generated test suites, it is of paramount importance to assess their quality. Though mutation analysis has demonstrated to be an effective means to assess test suite quality in some specific contexts, we lack approaches for CPSs. Indeed, existing approaches do not target interoperability problems and cannot be executed in the presence of black-box or simulated components, a typical situation with CPSs. In this article, we introduce *data-driven mutation analysis*, an approach that consists in assessing test suite quality by verifying if it detects interoperability faults simulated by mutating the data exchanged by software components. To this end, we describe a data-driven mutation analysis technique (*DaMAT*) that automatically alters the data exchanged through data buffers. Our technique is driven by fault models in tabular form where engineers specify how to mutate data items by selecting and configuring a set of mutation operators. We have evaluated *DaMAT* with CPSs in the space domain; specifically, the test suites for the software systems of a microsatellite and nanosatellites launched on orbit last year. Our results show that the approach effectively detects test suite shortcomings, is not affected by equivalent and redundant mutants, and entails acceptable costs.

**Index Terms**—Cyber-physical systems, CPS interoperability, integration testing, mutation analysis

# CPS Components



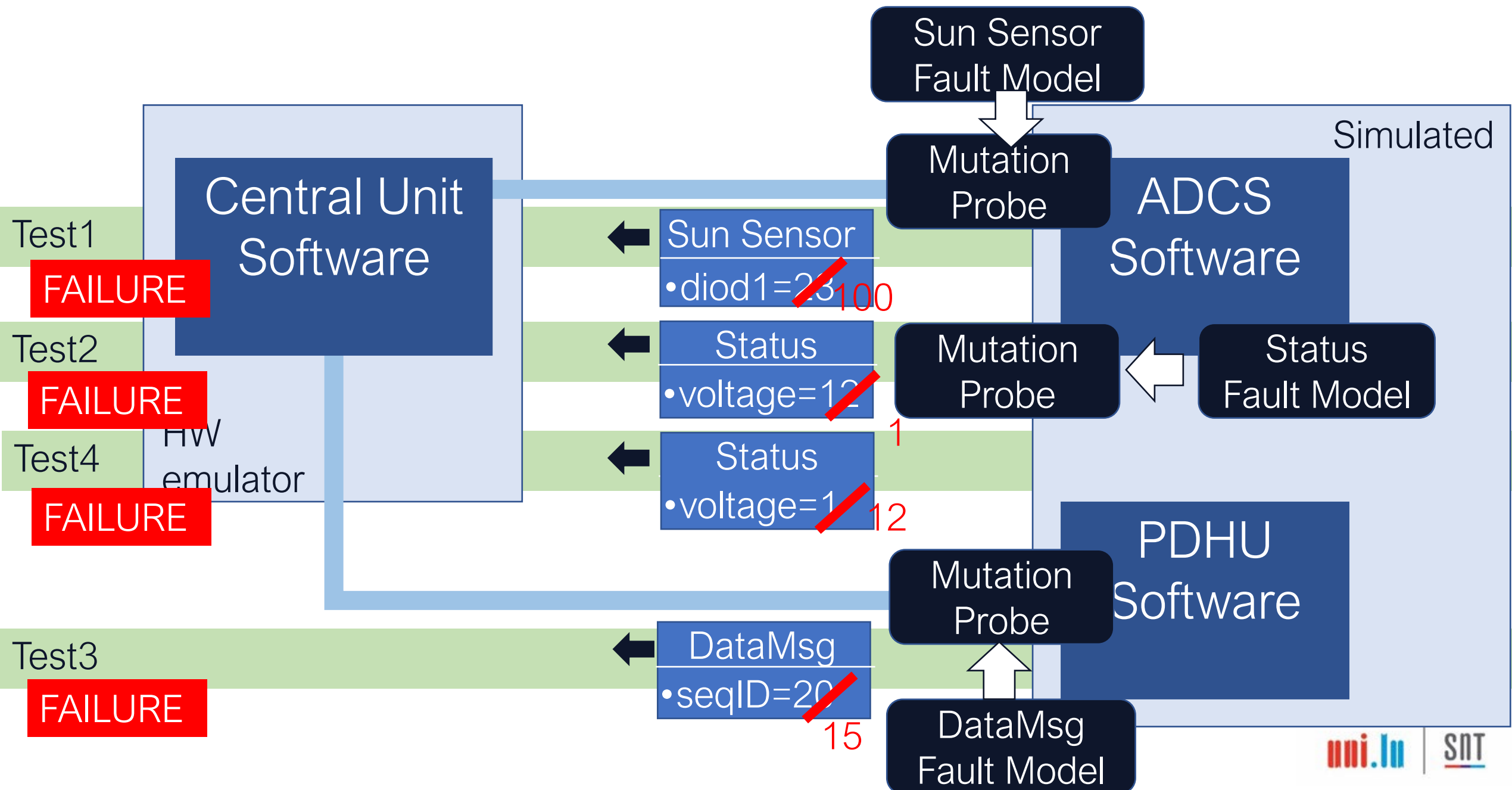
# Testing CPS Software



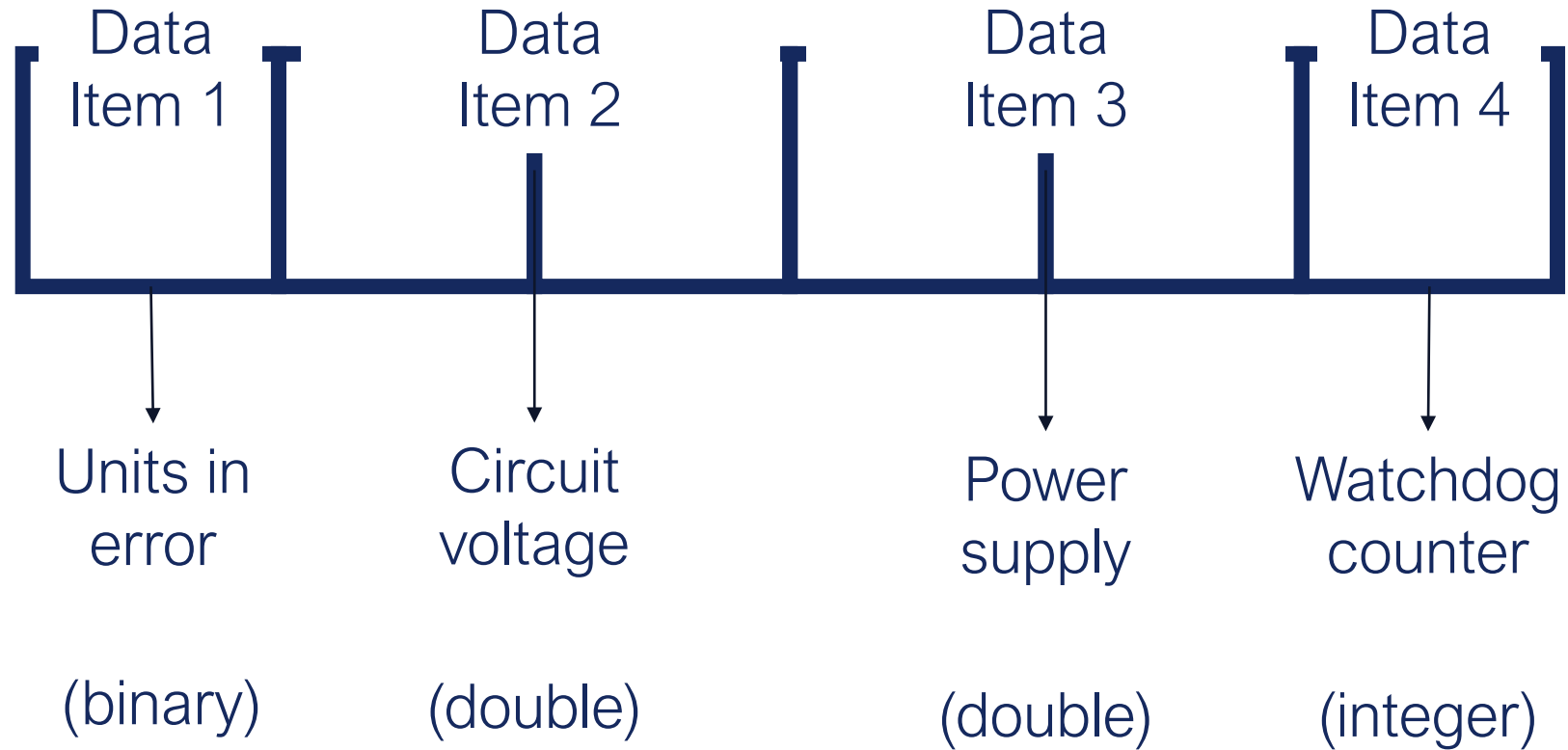


How to assess if  
a test suite  
exercises components'  
integration properly?

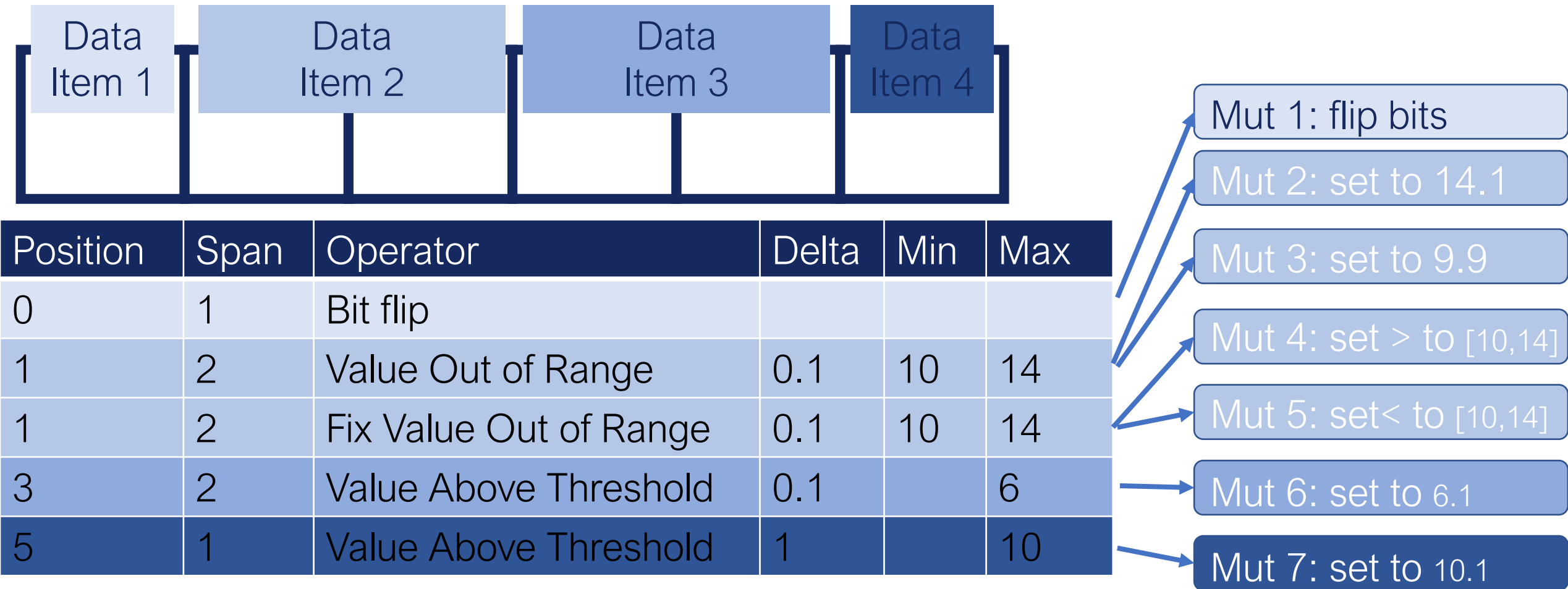
# Data-driven Mutation Analysis



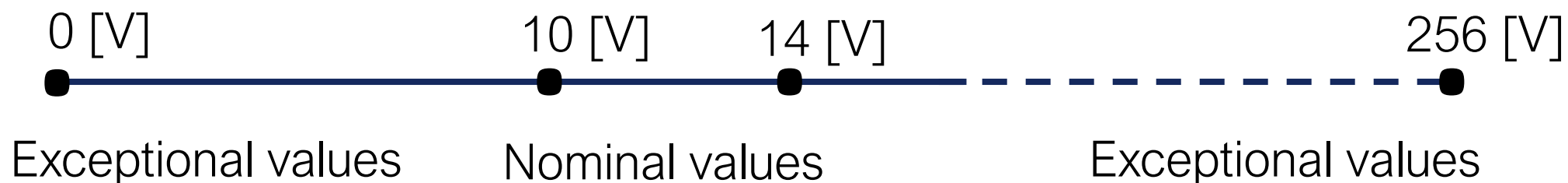
# Message Data Buffers



# From Fault Model to Mutants



# Example: Stateless Numerical



Operator	Delta	Min	Max
Value Out of Range	0.1	10	14

Status  
•voltage=12



Status  
•voltage=14.1

Status  
•voltage=15



Status  
•voltage=13

Status  
•voltage=12



Status  
•voltage=9.9

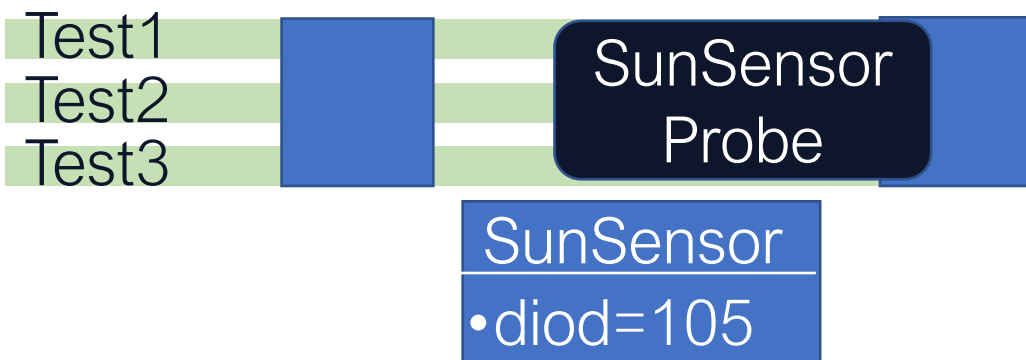
Status  
•voltage=9



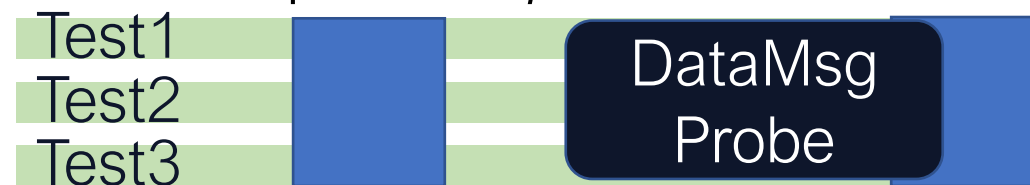
Status  
•voltage=11

# Mutants

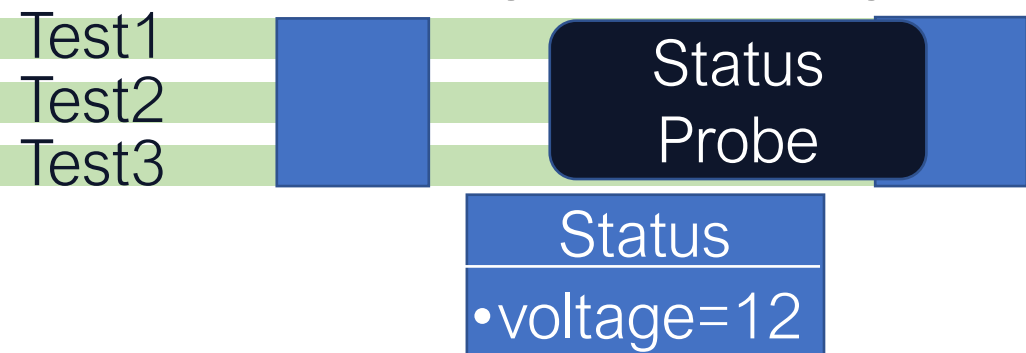
Mut1: set *diod* above 100 threshold



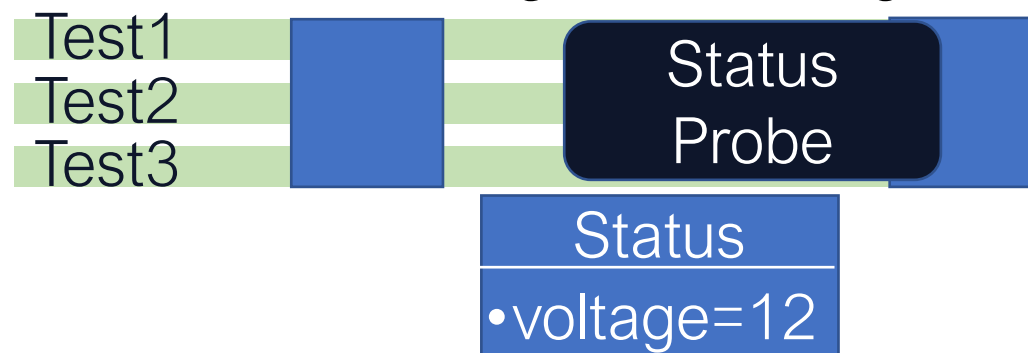
Mut2: replace *seqID* with random



Mut3: set *voltage* above range

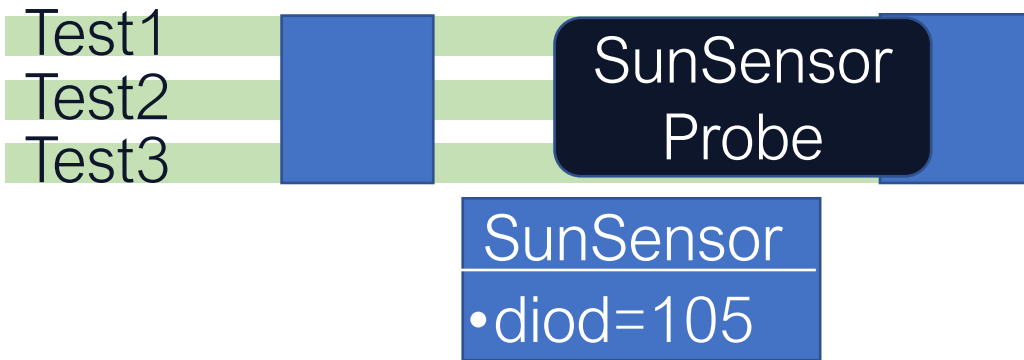


Mut4: set *voltage* below range



# All Mutants are Tested

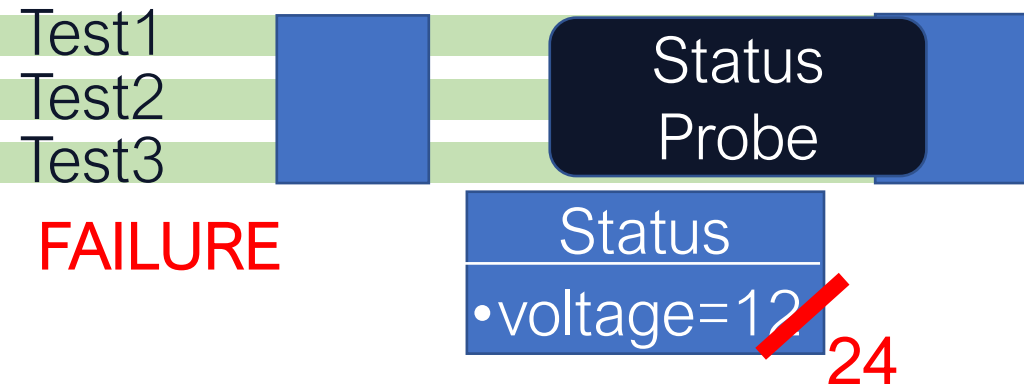
Mut1: set above 100 threshold



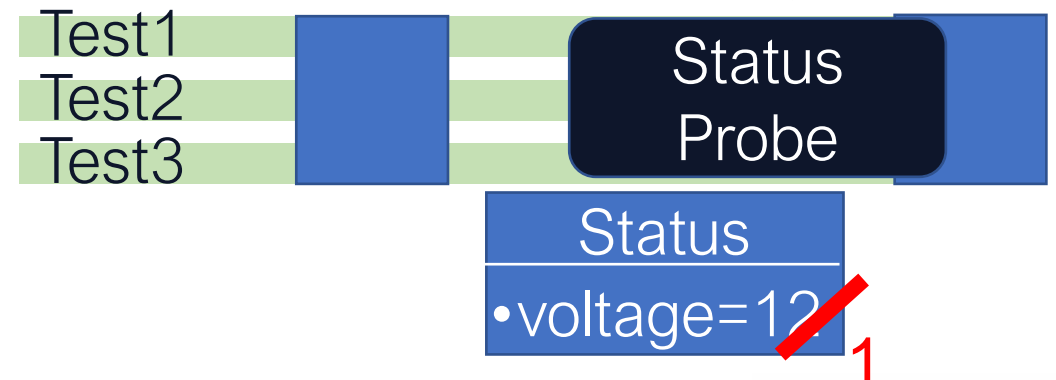
Mut2: replace with random



Mut3: set above range



Mut4: set below range



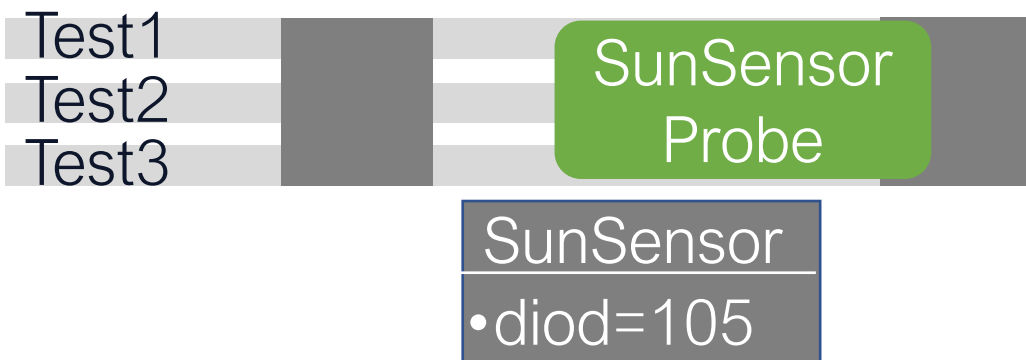


# Three Metrics

# Fault Model Coverage:

% fault models covered  
(%message types exercised)

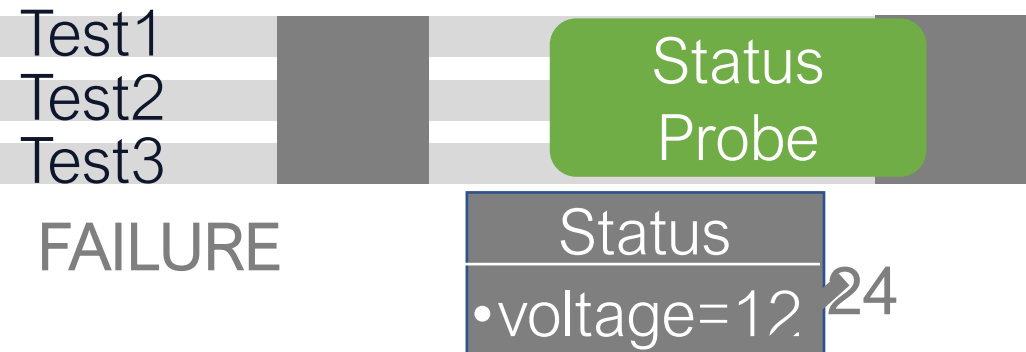
Mut1: set above 100 threshold



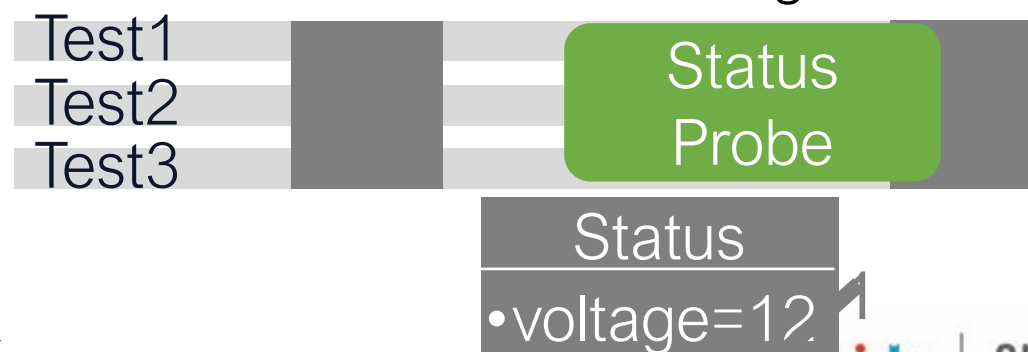
Mut2: replace with random



Mut3: set above range



Mut4: set below range

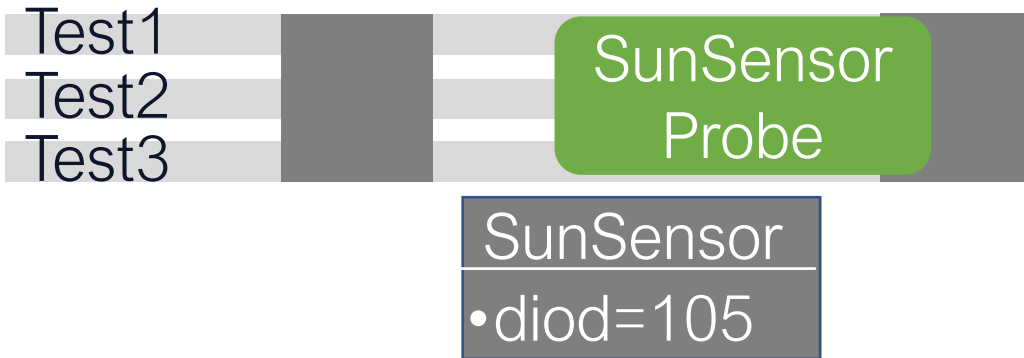


$\frac{2}{3} = 66.6\%$

# Mutation Operation Coverage:

% executed probes that mutated some data item  
(% input partitions being exercised)

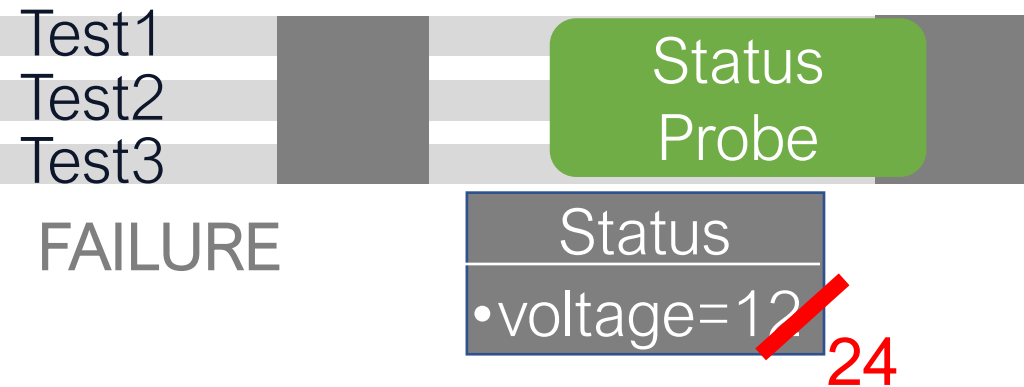
Mut1: set above 100 threshold



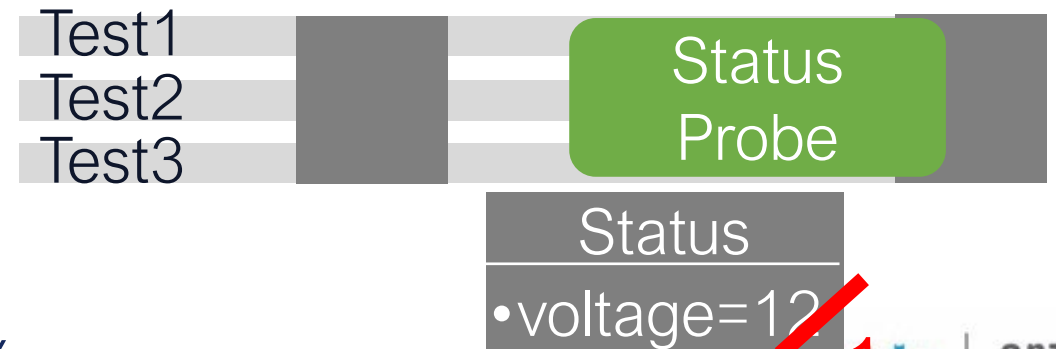
Mut2: replace with random



Mut3: set above range



Mut4: set below range

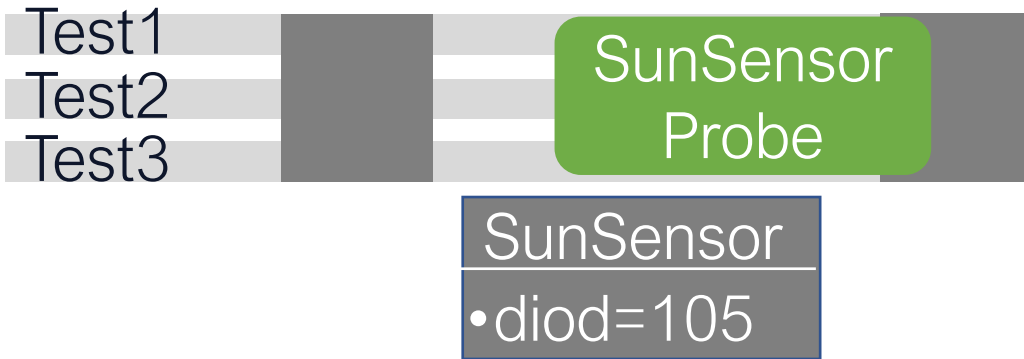


$$\frac{2}{3} = 66.6\%$$

# Covered Mutation Score:

% mutants that mutated some data and lead to failures

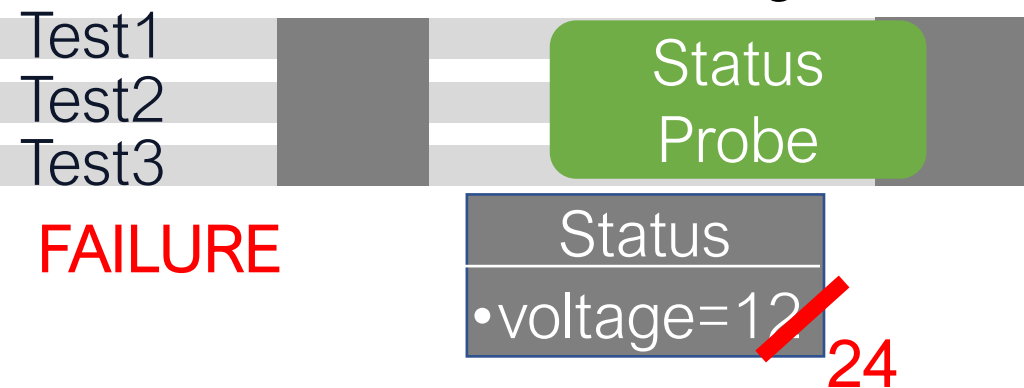
Mut1: set above 100 threshold



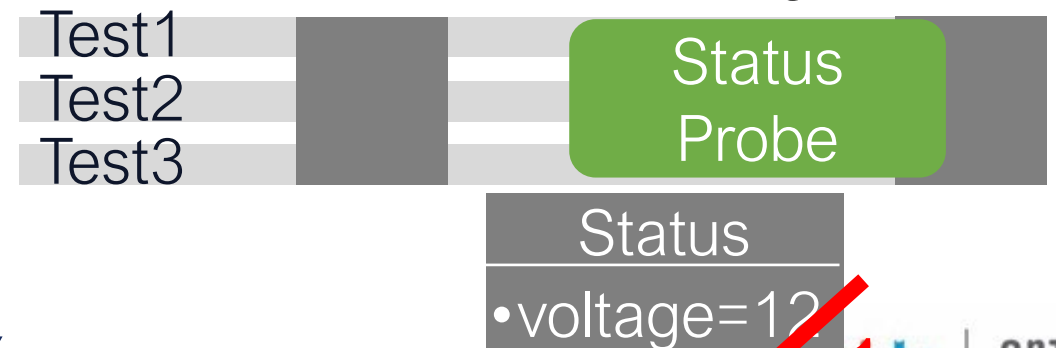
Mut2: replace with random



Mut3: set above range



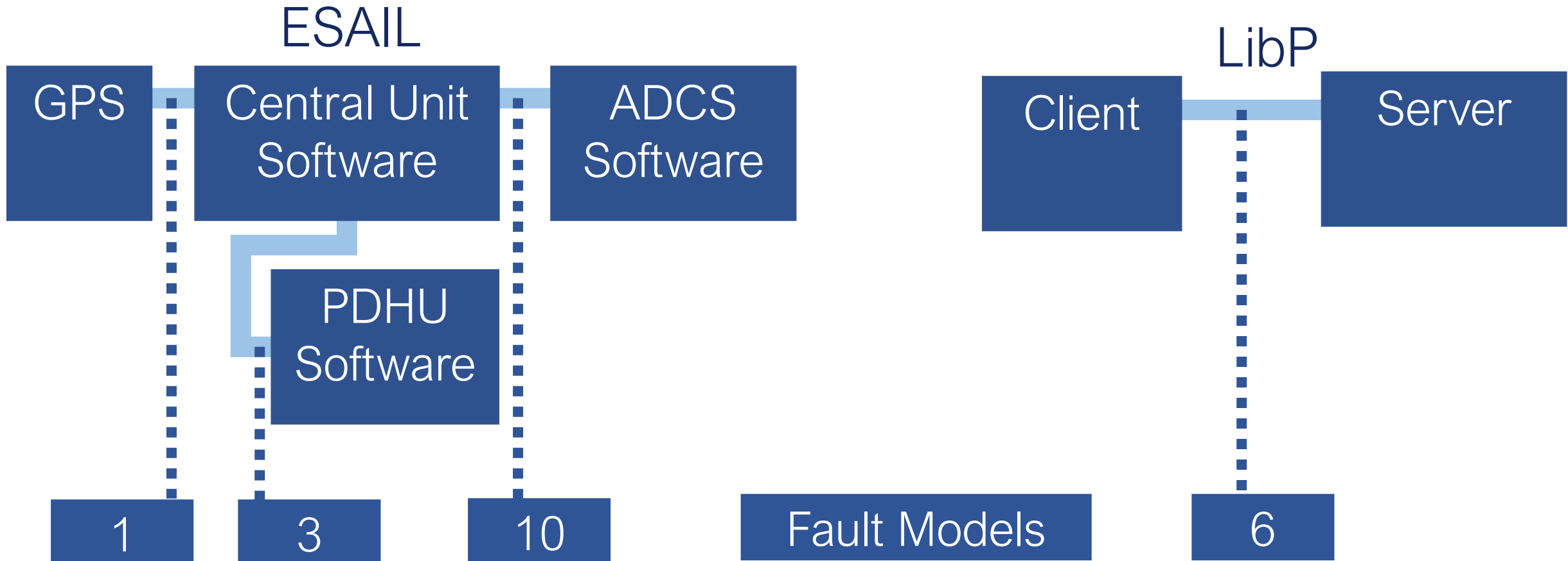
Mut4: set below range



$\frac{1}{2} = 50.0\%$

# Empirical Assessment

# Subjects



# Empirical Results

- Successfully identified: uncovered message types (1), uncovered input partitions (48), and poor oracles (60).
  - Live mutants can be killed by introducing oracles that:
    - verify additional entries in the log files
    - verify additional observable state variables
- verify not only the presence of error messages but also their content.
  - The configuration of our toolset (configure operators and insert mutation probes) for each subject took between 3 and 20 working hours.

# Problems Addressed

- How to make mutation analysis scale?
- How to assess if test suites verify components integration properly?
- How to generate test cases that kill mutants in C software?

<https://github.com/SNTSVV/MOTIF>

**ASE 2023**

## **Fuzzing for CPS Mutation Testing**

Jaekwon Lee<sup>\*,‡</sup>, Enrico Viganò<sup>\*</sup>, Oscar Cornejo<sup>\*</sup>, Fabrizio Pastore<sup>\*</sup>, Lionel Briand<sup>\*,‡</sup>

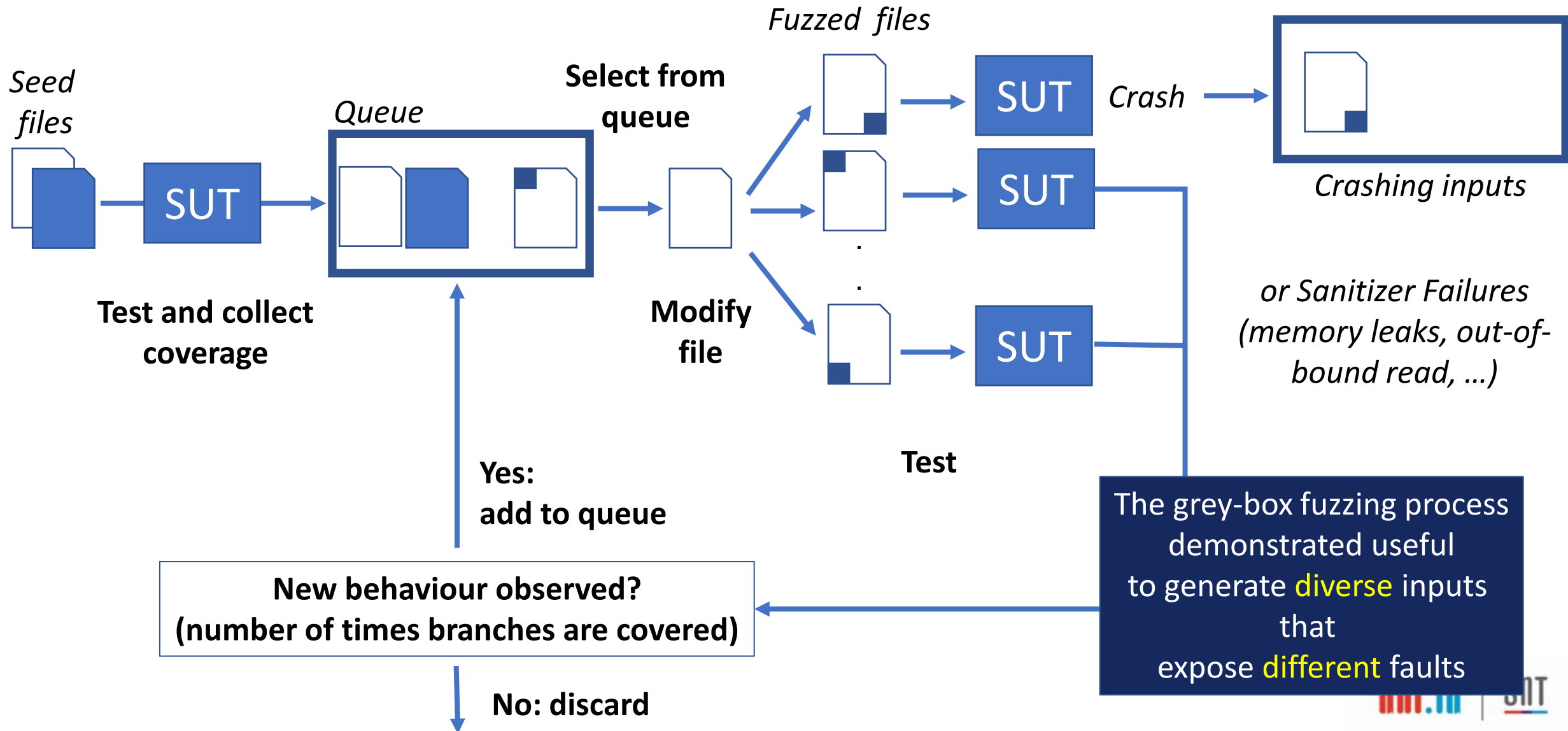
*<sup>\*</sup>University of Luxembourg, <sup>‡</sup>University of Ottawa*

*Luxembourg, LU; Ottawa, CA*

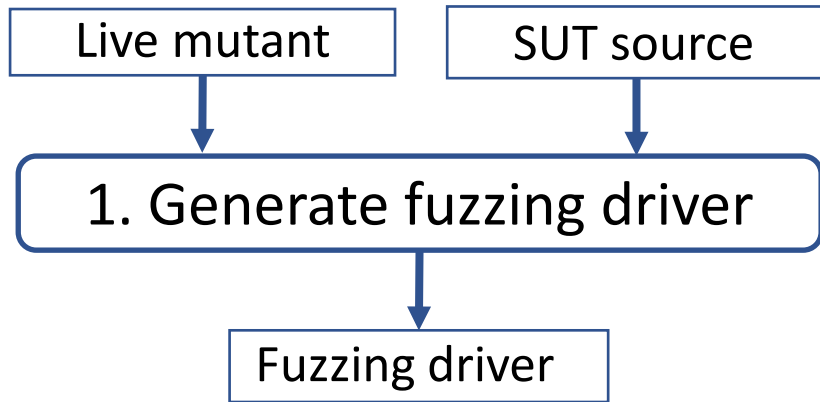
{jaekwon.lee,enrico.vigano,oscar.cornejo,fabrizio.pastore,lionel.briand}@uni.lu



# Grey-box Fuzzing: An Evolutionary Testing Approach



# MutatiOn Testing with Fuzzing (MOTIF)



```

0100100001110110000
1100101101110110000
0101101101110110000
  
```

```

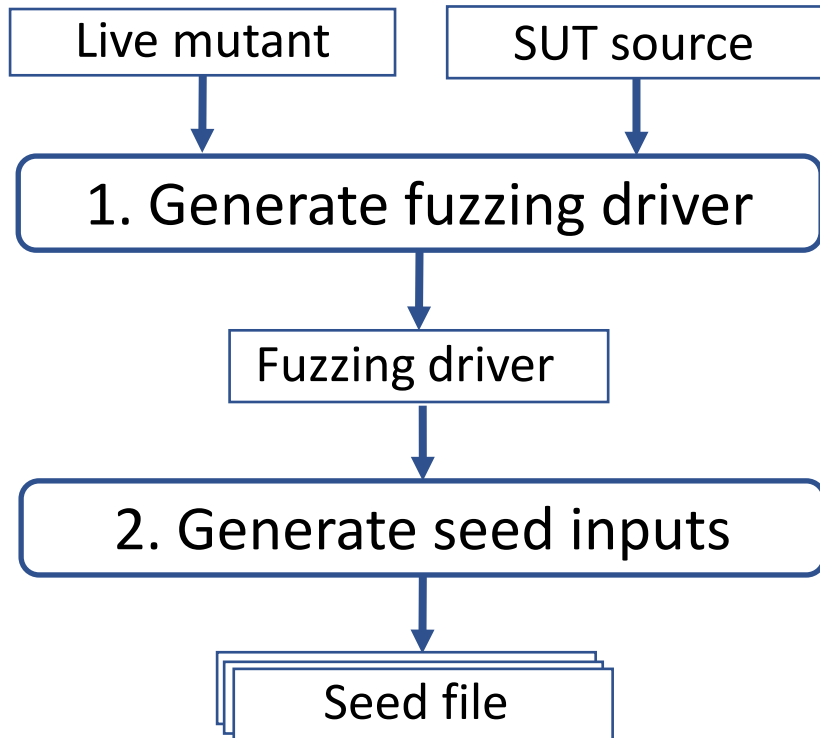
int main(...){
  double x = load(..);
  double y = load(..);
  int z = load(..);

  double m_x = load(..);
  double m_y = load(..);
  int m_z = load(..);

  ret = max(x,y,z); //invoke original
  //invoke mutated
  mut_ret = mut_max(m_x,m_y,m_z);

  if( ! match ( ret, mut_ret ) ){ abort(); }
  if( ! match ( x, m_x ){ abort() };
  if( ! match ( y, m_y ) { abort() };
  if( ! match ( z, m_z ) { abort() };
  
```

# MutatiOn Testing with Fuzzing (MOTIF)



```

1011111111110000000
1101111111110000000
1111111111111111111
  
```

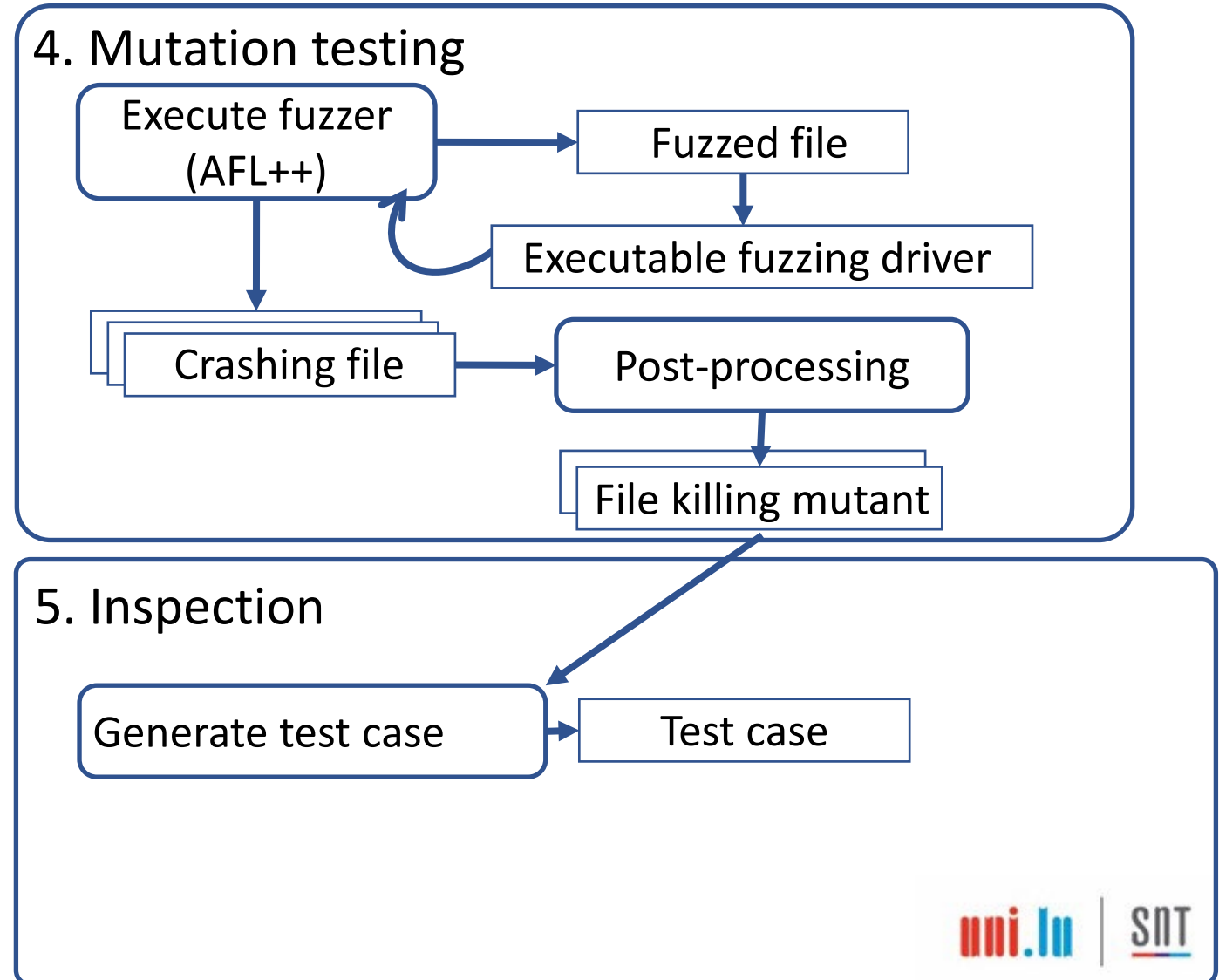
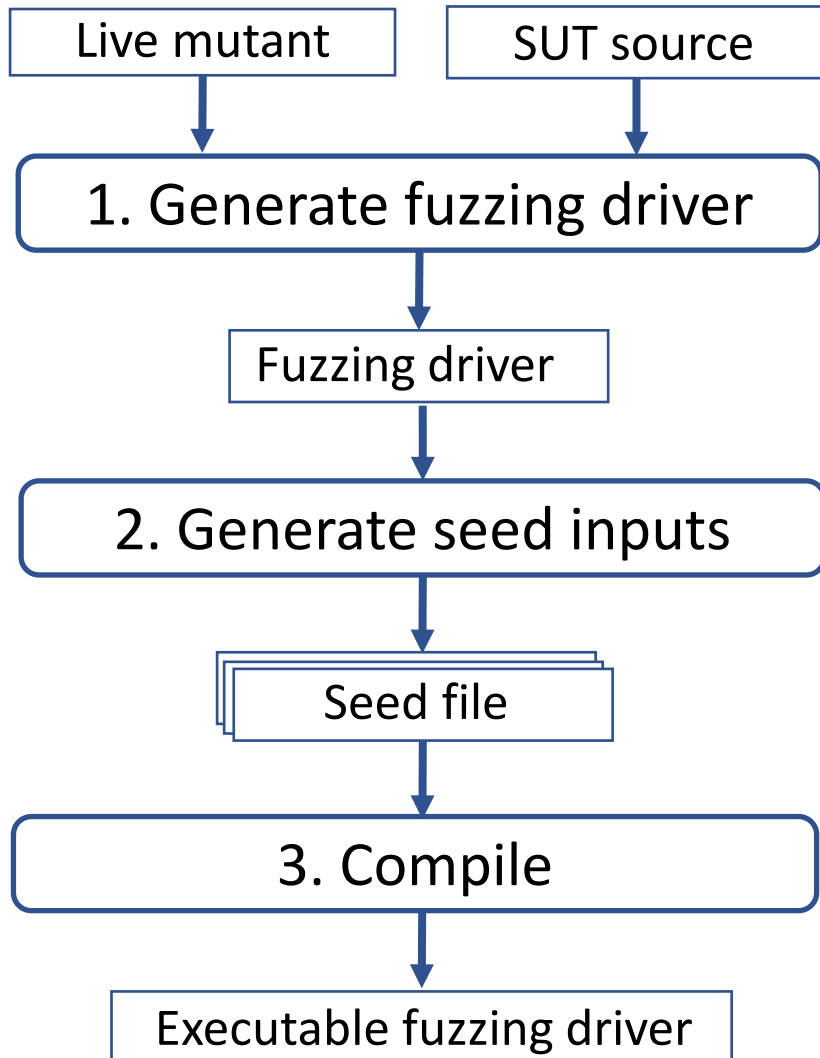
```
int max(double x, double y, int z){
```

```

1111111111111111111
1111111111111111111
1111111111111111111
0000000000000000001
  
```

```
int is_valid(struct T_POS p, int p){
```

# MutatiOn Testing with Fuzzing (MOTIF)

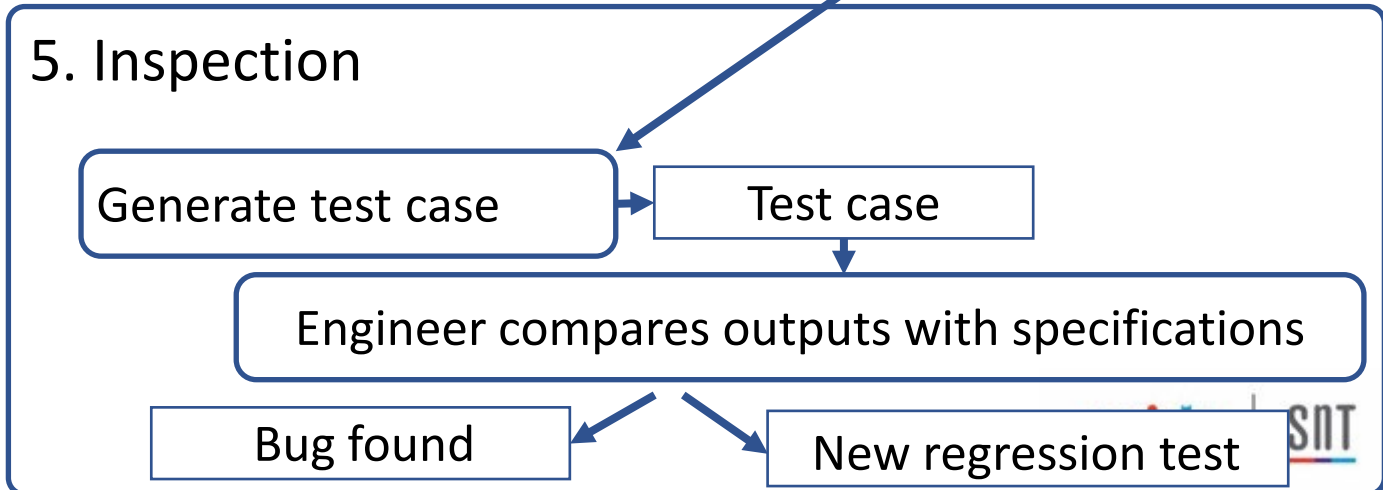
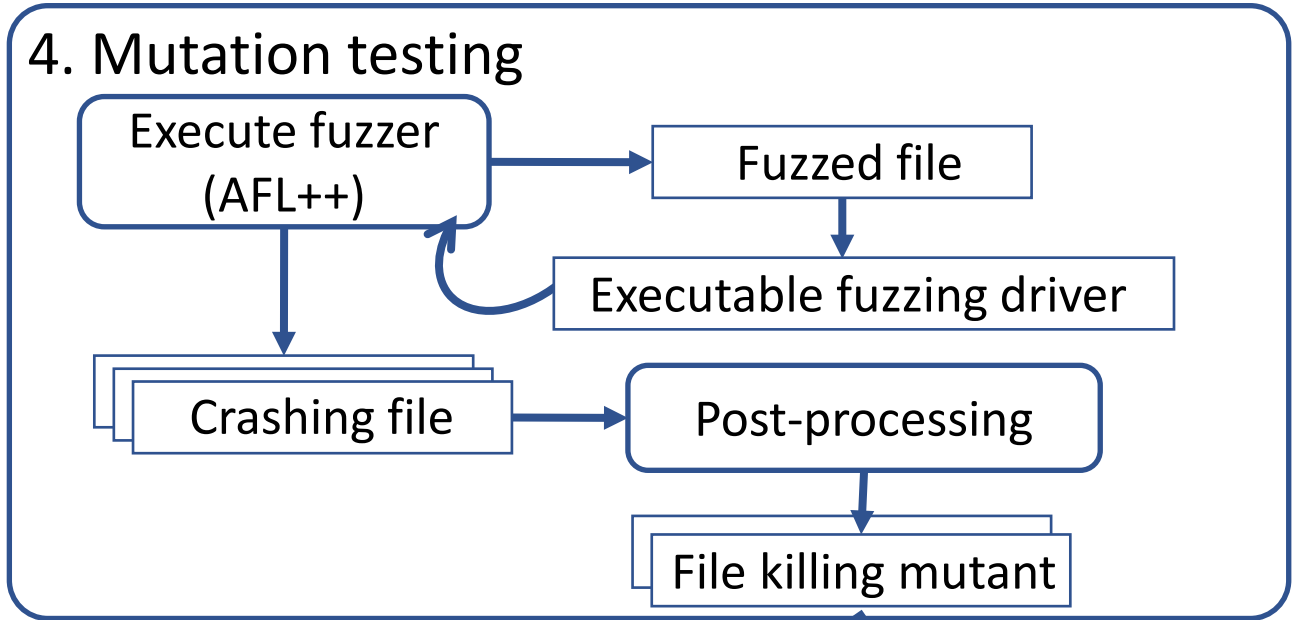


# g with Fuzzing (MOTIF)

```
*****  
* Define input and expected values in hex  
*****  
const char input_data_base[8] = {0xFF,0xFF,0xFF,0xFF,0xFF,0xFF,0xFF,0xFF};  
const char input_data_add[8] = {0xFF,0xFF,0xFF,0xFF,0xFF,0xFF,0xFF,0xFF};  
  
const char expected_base[8] = {0xFF,0xFF,0xFF,0xFF,0xFE,0xD7,0x94,0x1};  
const char expected_add[8] = {0xFF,0xFF,0xFF,0xFF,0xFF,0xFF,0xFF,0xFF};  
  
const char expected_return[4] = {0x00,0x00,0x00,0x00};  
  
/*****  
* Entry for test driver  
*****  
int main(int argc, char** argv)  
{  
    (void)argv;  
    (void)argv;  
  
    /* Declare variable to hold function returned value */  
    int function_return;  
  
    /* declaring the input variables for function */  
    gs_timestamp_t base;  
    gs_timestamp_t add;  
  
    /* Copy data */  
    memcpy(&base, input_data_base, sizeof(base));  
    memcpy(&add, input_data_add, sizeof(add));  
  
    /* Print parameter values of the function */  
    printf("\n");  
    printf_hex("MOTIF-INPUT: base (gs_timestamp_t) = ", "\n", (char *)&base, sizeof(base));  
    printf_hex("MOTIF-INPUT: add (gs_timestamp_t) = ", "\n", (char *)&add, sizeof(add));  
  
    /* Calling the function under test */  
    printf("Calling the function.. \n");  
    function_return = timestamp_add(&base, &add);  
  
    /* Print parameter values of the function */  
    printf("\n");  
    printf_hex("MOTIF-FUNCTION-OUTPUT: base (gs_timestamp_t) = ", "\n", (char *)&base, sizeof(base));  
    printf_hex("MOTIF-FUNCTION-OUTPUT: add (gs_timestamp_t) = ", "\n", (char *)&add, sizeof(add));  
    printf("MOTIF-FUNCTION-OUTPUT: function_return (int) = %d\n", function_return);  
  
    assert(0==compare((char *)&base, expected_base, sizeof(base)));  
    assert(0==compare((char *)&add, expected_add, sizeof(add)));  
    assert(0==compare((char *)&function_return, expected_return, sizeof(function_return)));  
  
    printf("PASS\n");  
  
    return 0;  
}
```

Assign fuzzer inputs to input variables

Inspect results



# Empirical Results

Subject	Live mutants	Mutants killed by MOTIF	Generated test cases
ASN1Lib	1,347	1,161 – 86.19%	350
MLFS	3,891	1,392 – 35.77%	410
Satellite CSW	581	203 – 34.90%	203
Utility library	443	234 – 52.82%	64

- Effectiveness vary from subject to subject
  - Mathematical functions with narrow constraints are harder to test
- We identified 5 faults in one subject

Project



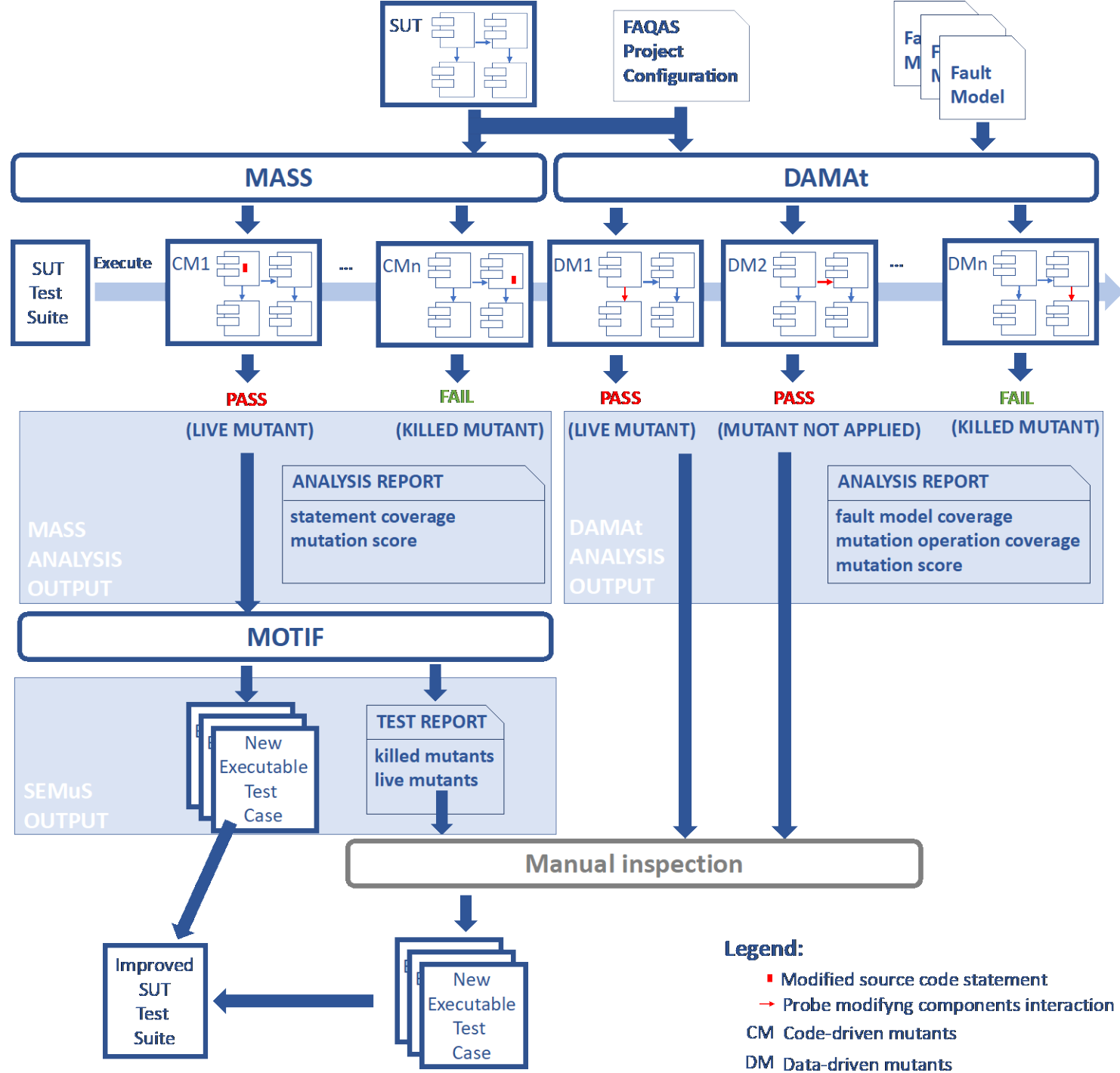
test.c

- > AFL++
- ▼ case\_studies
  - ▼ ASN1
    - > mutants
    - > repos
    - config.py
    - live\_mutants
    - mutants.tar
    - README.md
    - src.tar
    - test.asn
    - README.md
  - > containers
  - > pipeline
  - > scripts
  - > test
  - > tools
    - .gitignore
    - LICENSE.txt
    - NOTICE.txt
    - README.md
    - run.py
    - run\_cancel.py
    - run\_list.py
    - setup.py
    - Vagrantfile
- External Libraries
- > Scratches and Consoles

```
1  /*
2  Code automatically generated by asn1scc tool
3  */
4  #include <limits.h>
5  #include <string.h>
6  #include <math.h>
7
8  #include "asn1crt_encoding.h"
9  #include "asn1crt_encoding_upper.h"
10
11 #include "test.h"
12
13 const MyInt myVar = 4;
14 const ConfigString myStrVar = "This is a test";
15 const FixedLenConfigString myStrFixed = "Hello";
16 const T_TypeThatMustNotBeMappedExceptInPython push_it = {
17     .config = "Config",
18     .param = 5,
19     .fixstr = "World",
20     .exist = {
21         .fixstr = 1
22     }
23 };
```

✔ 516 ^ v

# FAQAS Methodology

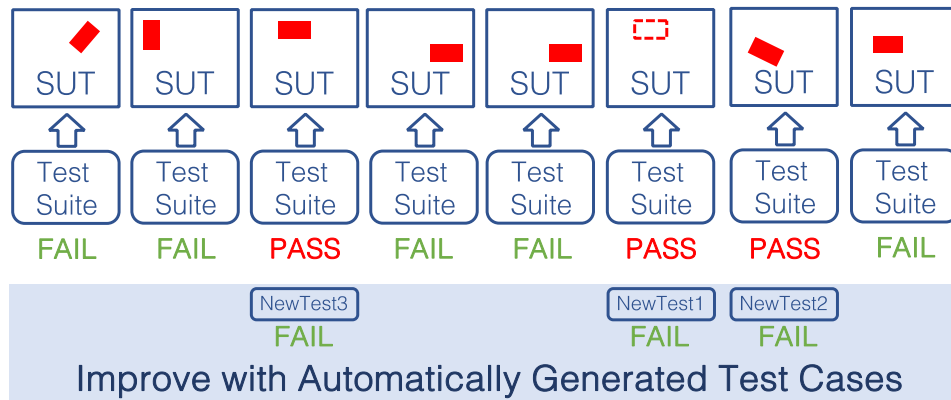


<http://faqas.uni.lu>



## How to ensure thorough testing?

### Mutation Analysis and Testing



### Problems Addressed

- How to make mutation analysis scale?
- How to assess if test suites verify components integration properly?
- How to generate test cases that kill mutants in C software?

## Ongoing work

- Guidelines for mutation score: what to target?
- Integration with known frameworks (libcheck, googletest)
- Automated configuration for data-driven mutation analysis

# Applicability of Mutation Testing to Space Software

Fabrizio Pastore,

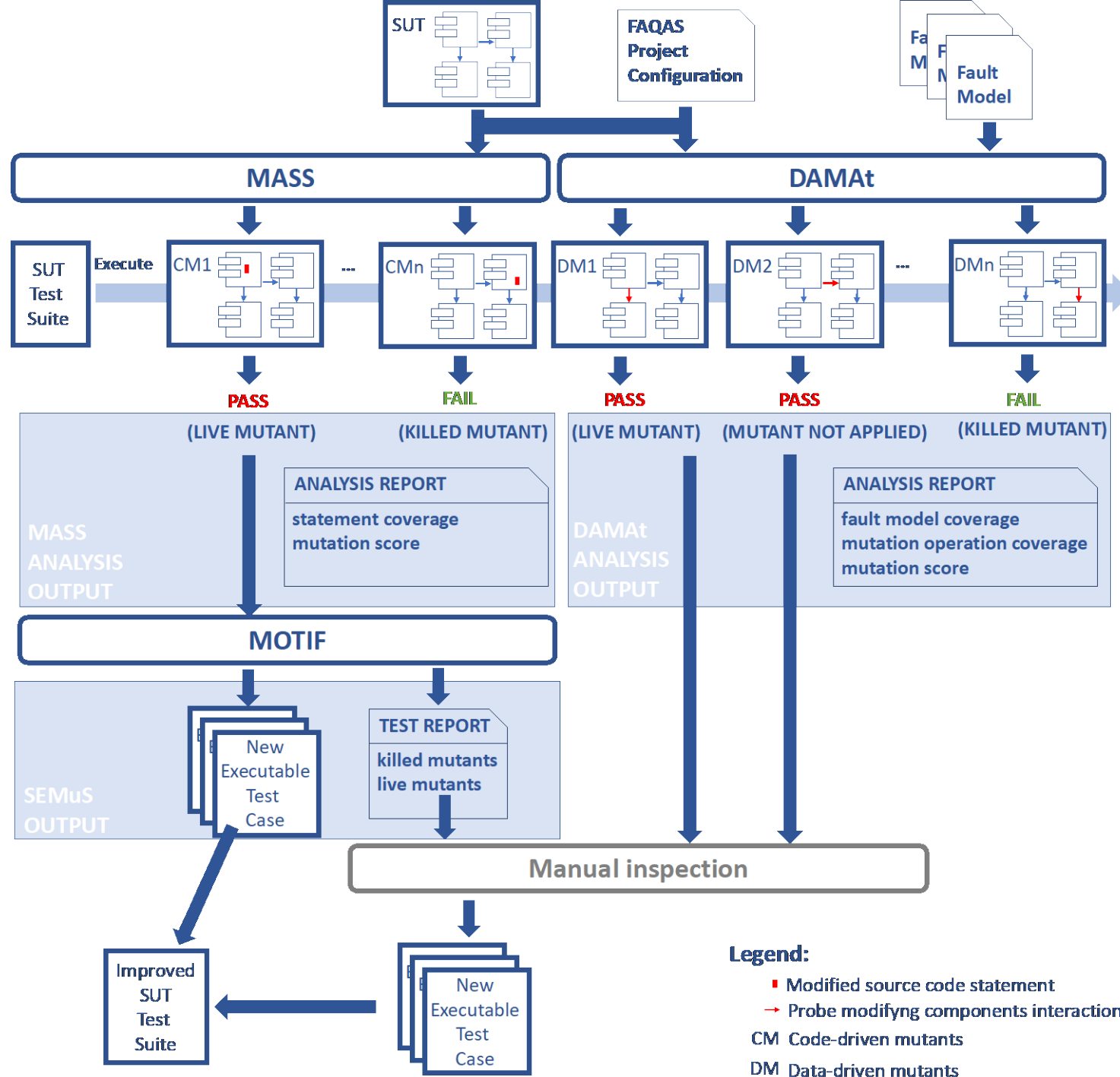
Jaekwon Lee, Enrico Viganò, Oscar Cornejo, Lionel Briand

University of Luxembourg  
(fabrizio.pastore@uni.lu)

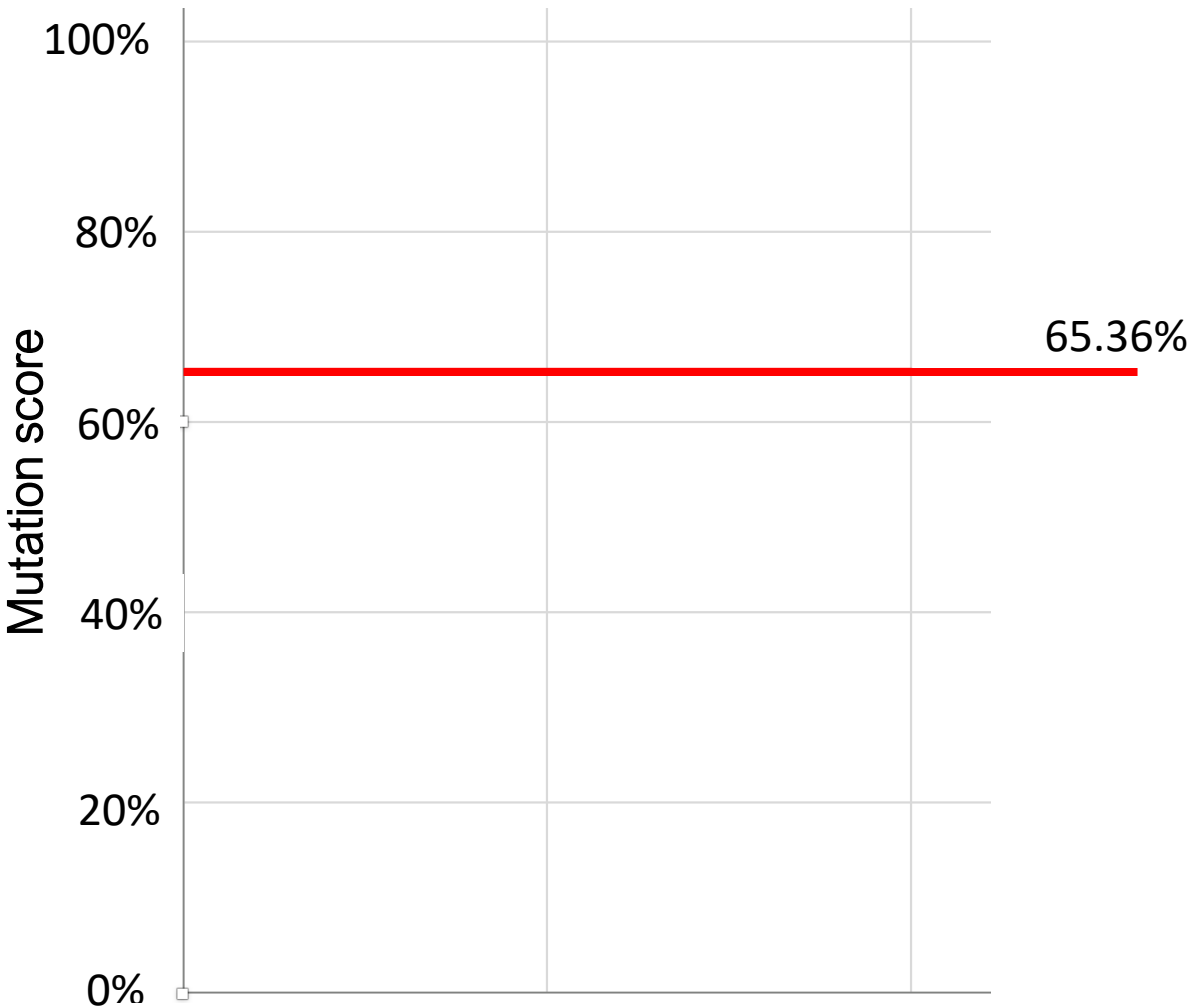
ADCSS 2023 - November 15<sup>th</sup>, 2023



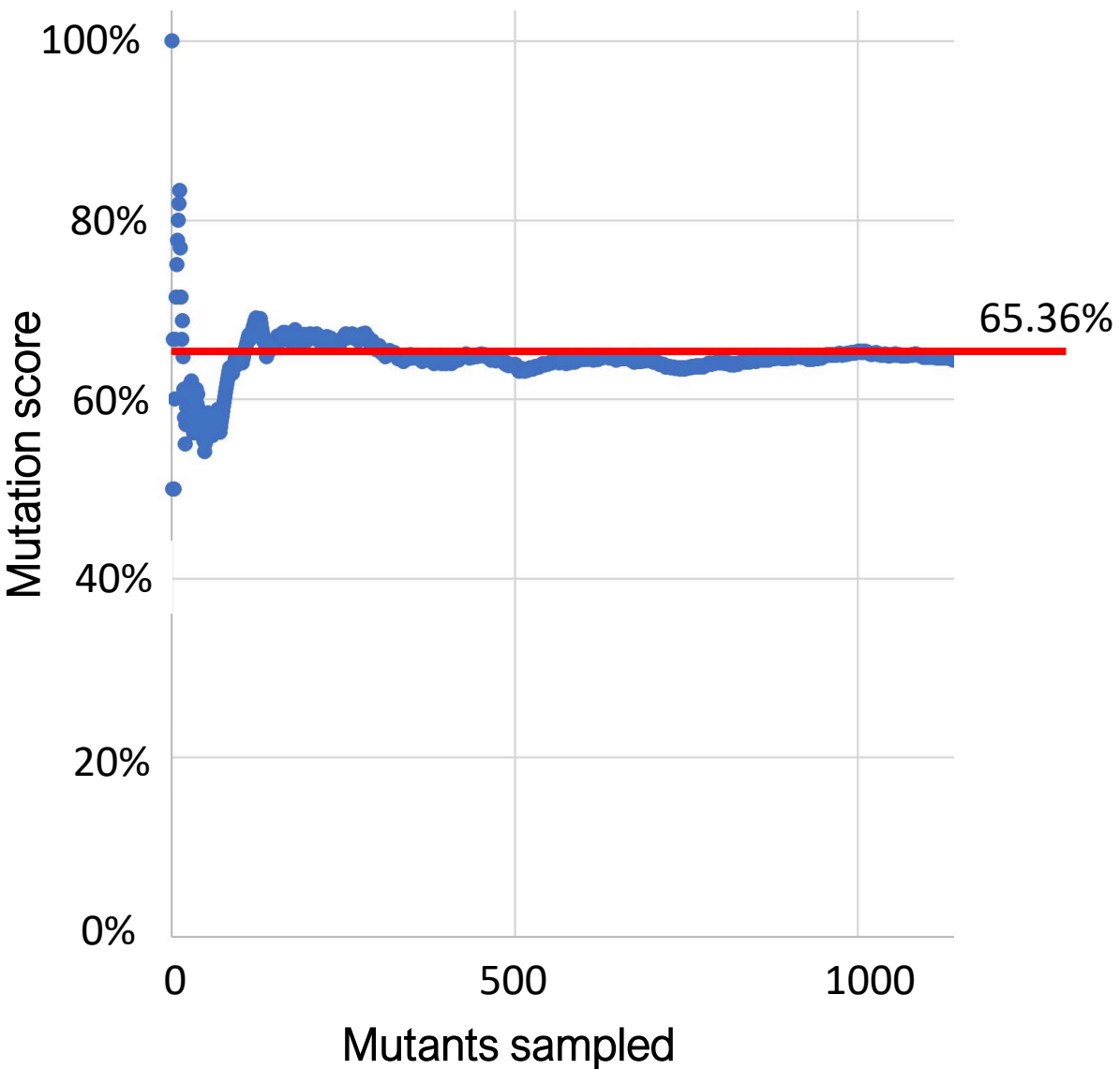
Backup



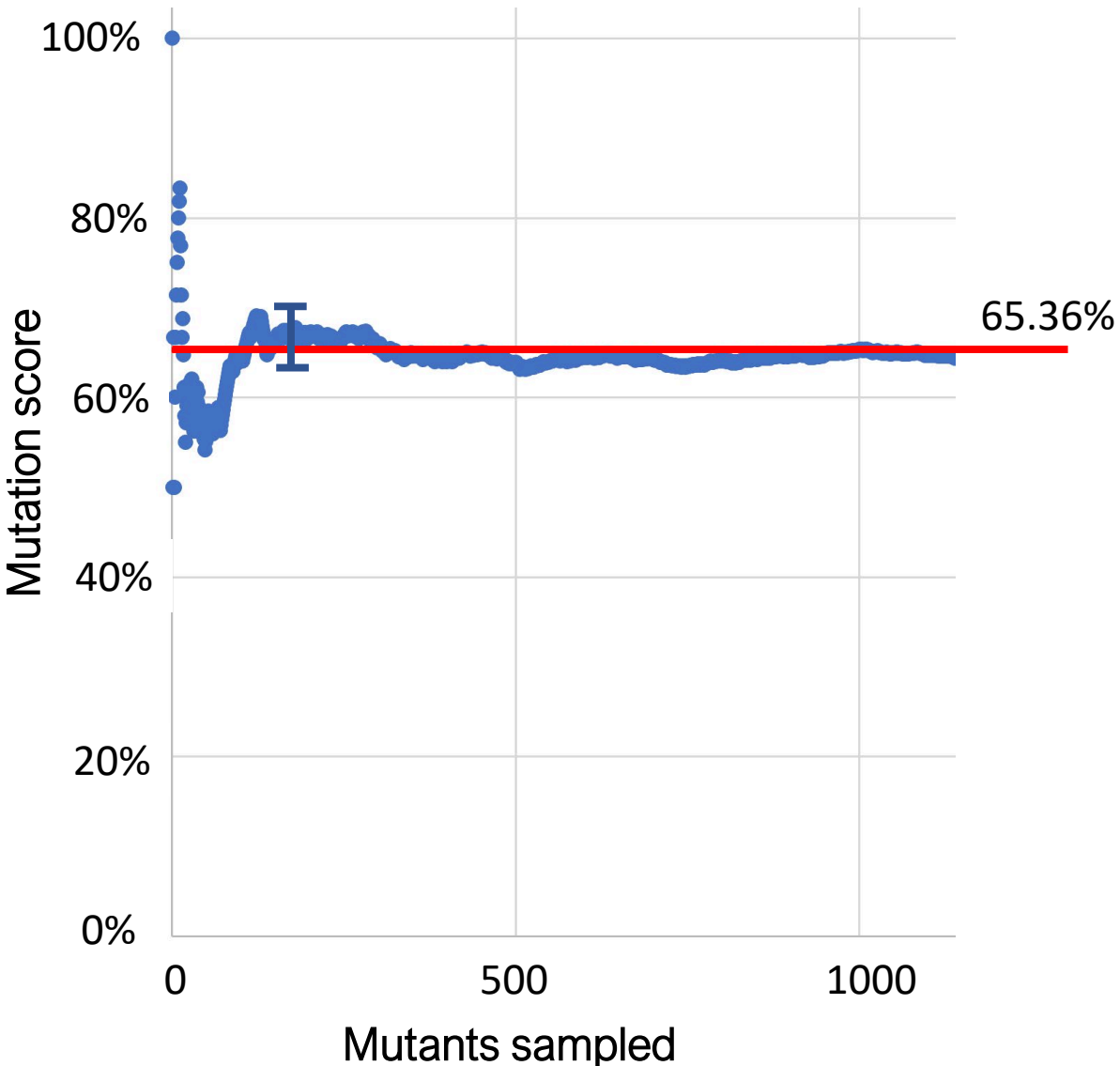
# Mutants sampling with FSCI



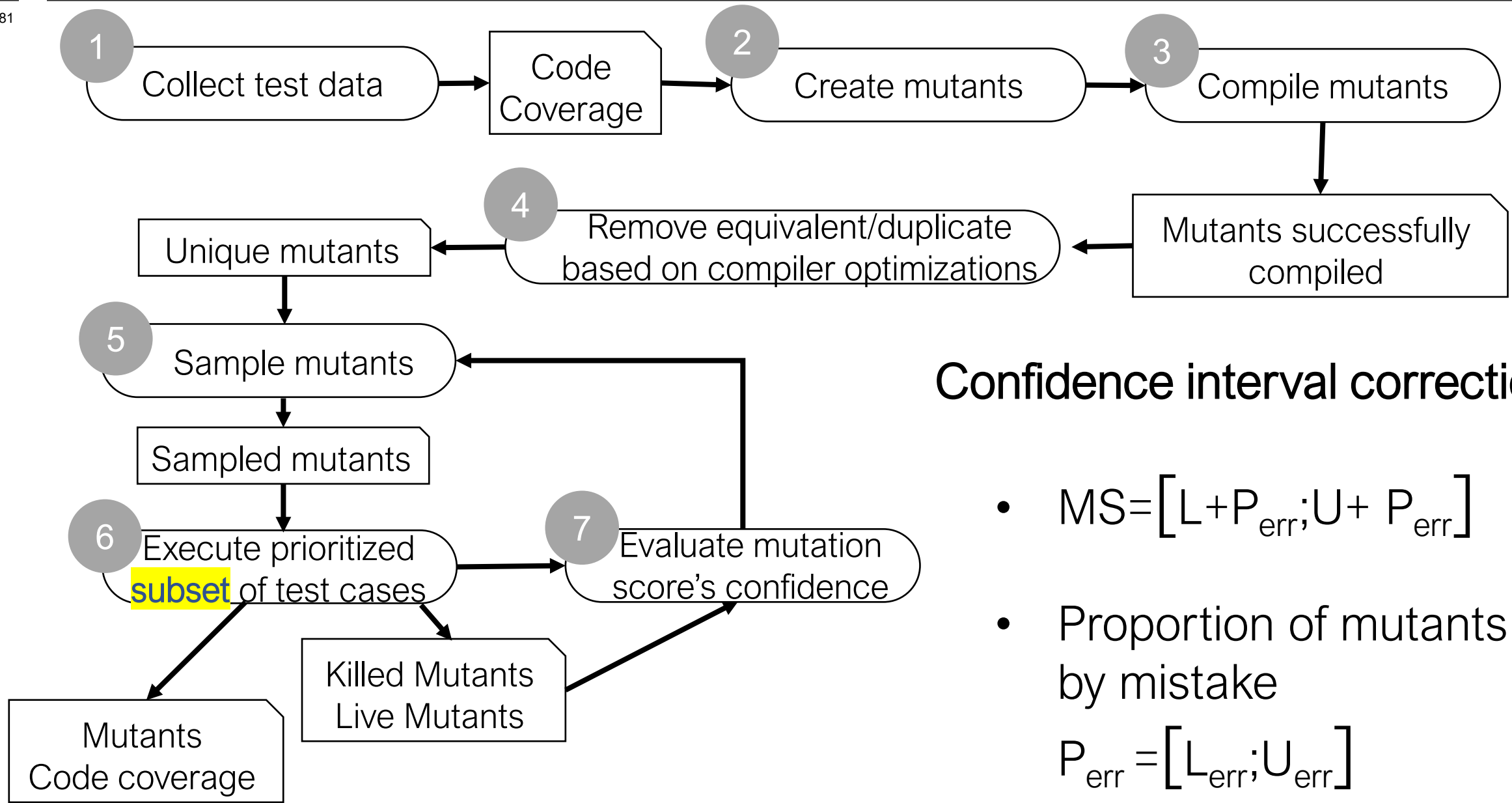
# Mutants sampling with FSCI



# Mutants sampling with FSCI



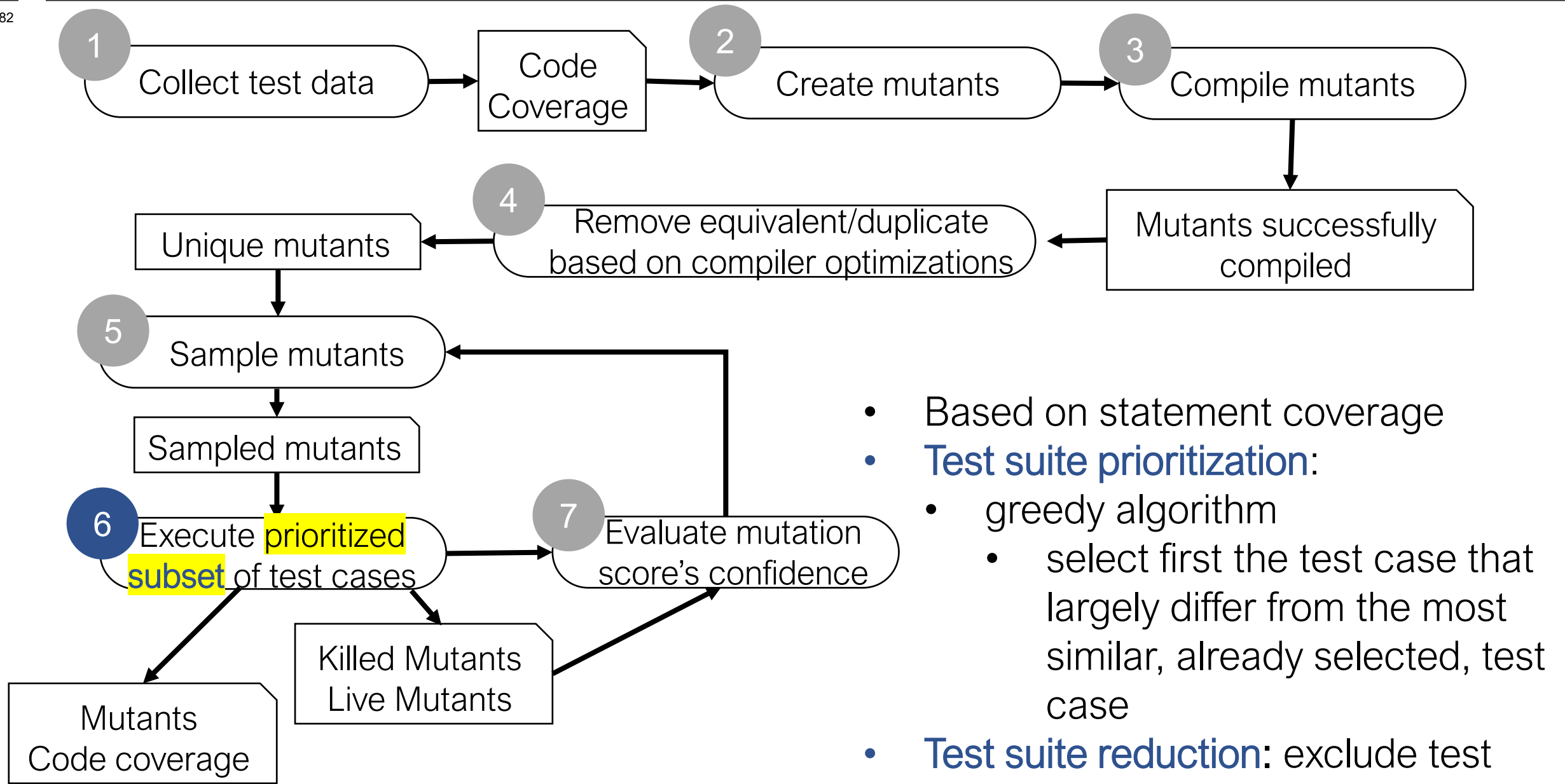
- A **confidence interval** captures a range that has a probability (e.g., 95%) of including the estimated value (the mutation score)
  - $MS \in [L;U]$
- Fixed-width sequential confidence interval (FSCI) method:
  - stop sampling when  $(U - L)$  is small
  - difference between estimated MS and actual one is at most 5 percentage p.



## Confidence interval correction

- $MS = [L + P_{err}; U + P_{err}]$
- Proportion of mutants live by mistake  
 $P_{err} = [L_{err}; U_{err}]$
- $MS = [L + L_{err}; U + U_{err}]$





- Based on statement coverage
- **Test suite prioritization:**
  - greedy algorithm
    - select first the test case that largely differ from the most similar, already selected, test case
- **Test suite reduction:** exclude test cases with a distance of zero
- Cosine distance: best accuracy

# Fault Model Example



Position	Span	Type	Operator	Delta	Min	Max
0	1	Binary	Bit flip			
1	2	Double	Value Out of Range	0.1	10	14
1	2	Double	Fix Value Out of Range	0.1	10	14
3	2	Double	Value Above Threshold	0.1		6
5	1	Integer	Value Above Threshold	1		10

# 12 Mutation Operators

Value out of range (VOR)

Fix value out of range (FVOR)

Value above threshold (VAT)

Fix value above threshold (FVAT)

Value below threshold (VBT)

Fix value below threshold (FVBT)

Bit flip (BF)

Random legal value (INV)

Illegal value (IV)

Amplified signal (AS)

Shifted signal (SS)

Flatten signal (HV)

# Fault Modelling Methodology

