

Cloud-based Testing

Summer School on Software Evolution: From Monolithic to Cloud-Native

**Sebastiano Panichella
Zurich University of Applied Science (ZHAW)**

Institute of Applied Information Technology (InIT)



spanichella@gmail.com and panc@zhaw.ch

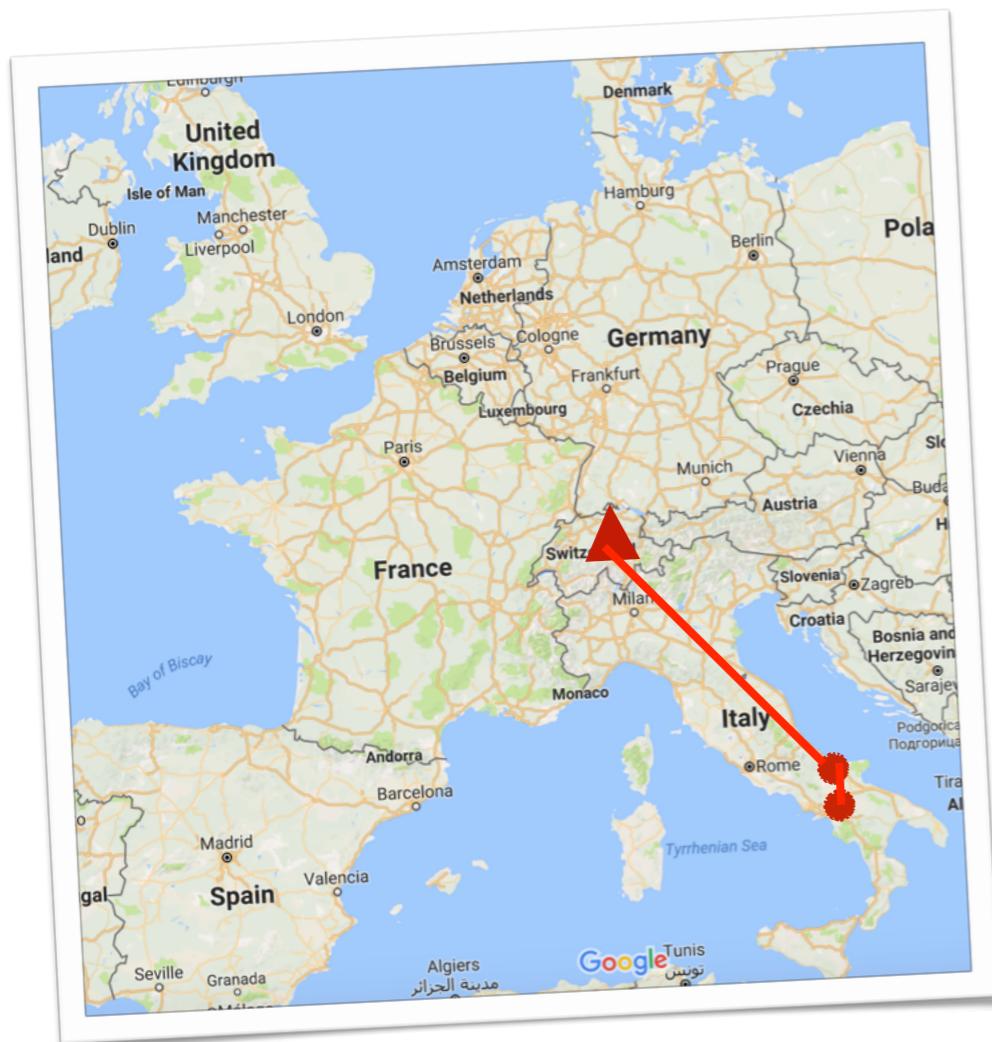


@spanichella



<https://www.zhaw.ch/en/about-us/person/panc/> or <https://spanichella.github.io/>

My Background



**Zurich University of
Applied Science**
Senior Computer Science Researcher
Since August 2018

Zürcher Hochschule
für Angewandte Wissenschaften



University of Zurich
Research Associate
October 2014 - August 2018



**University of
Zurich^{UZH}**

University of Sannio
PhD Student
June 2014



University of Salerno
Master Student
December 2010



- Main topics
- Related topics
- Secondary topics

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- Program Comprehension & Maintenance (PC&M):**
- Traceability Recovery ●
 - Generation of source code documentation ●
 - Profiling developers ●
 - Dependencies analysis in software ecosystems ●

PhD thesis:

“Supporting Newcomers in Software Development Projects”

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PC&M + Mobile computing (MC):

- [Machine Learning & Genetic Algorithms](#) ●
- Defect Predictions
- [Mobile computing](#) ● ●
- Mobile testing & User Feedback Analysis
(User Reviews + NLP analysis)
- [Code Review & Continuous Delivery](#) ●
- Prioritization of Static Analysis Warning
- [Summarization Techniques](#) ●
- for Code,
- Change,
- Testing and User Feedback



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- [Test case generation and assessment](#)
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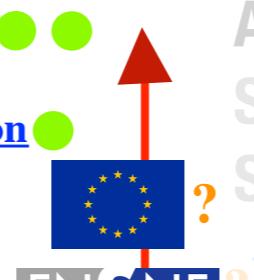
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Outline

PART I

1) Research Context and Motivation

PART II

2) Literature review on:

- Testing Challenges in the Cloud
- Automated Testing
- Cloud-based testing demonstration

3) Future Work

Who Are You?



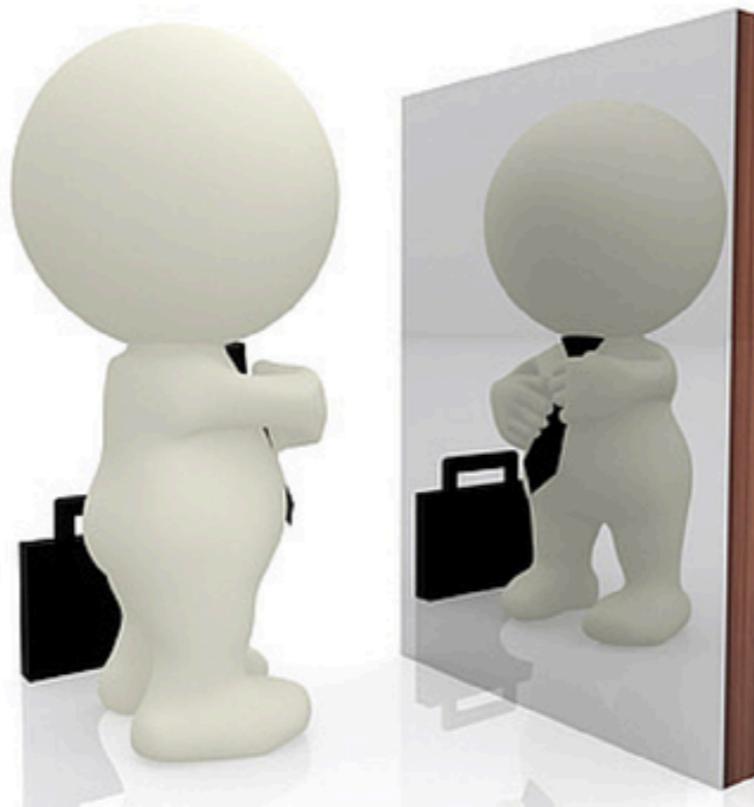
Bachelor student?

Master student?

Part-time student?

P.h.D. student?

Who
Are You?



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Who Are You?



Talk a bit about
your-self...

- short bio...
- why you decided to register to this summer-school?
- what do you want to achieve from it?

Outline

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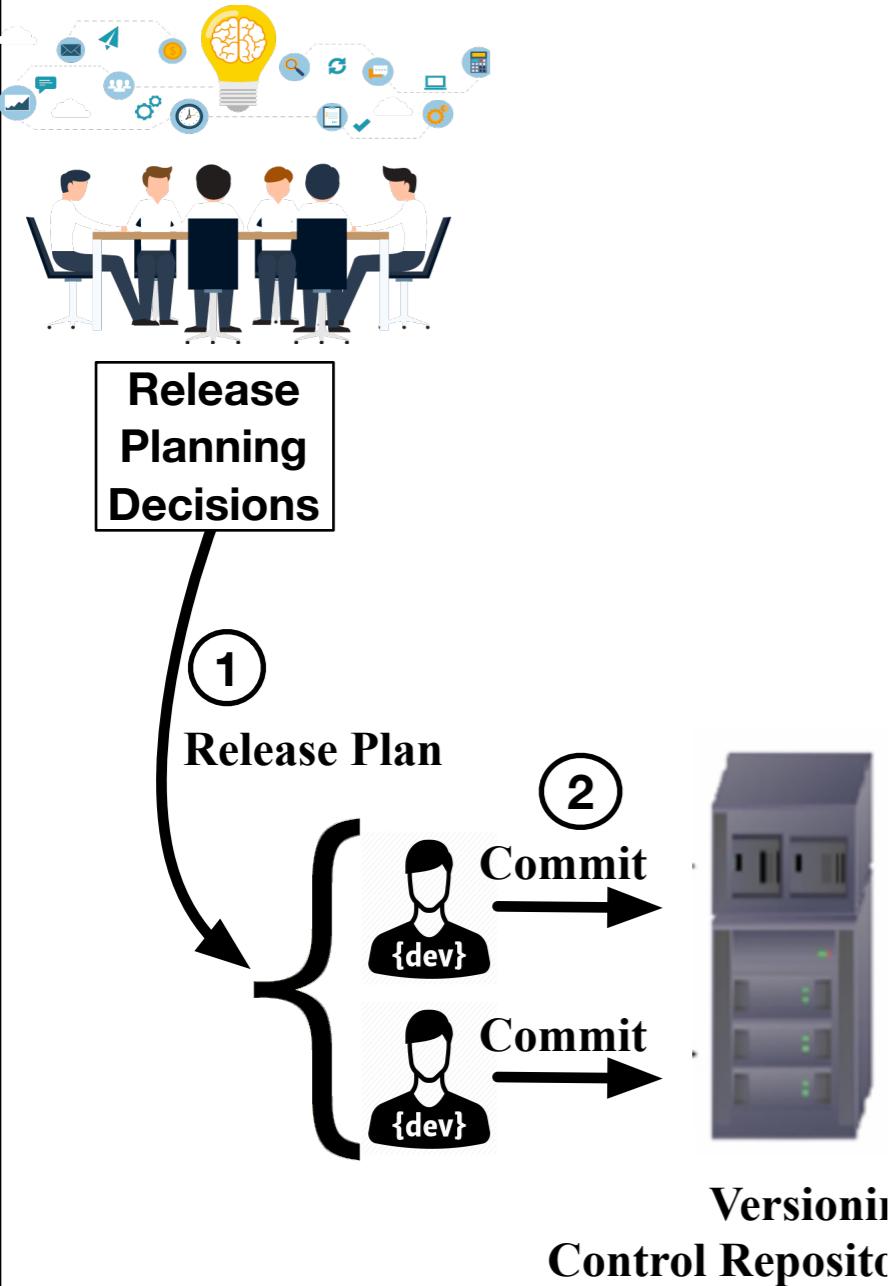
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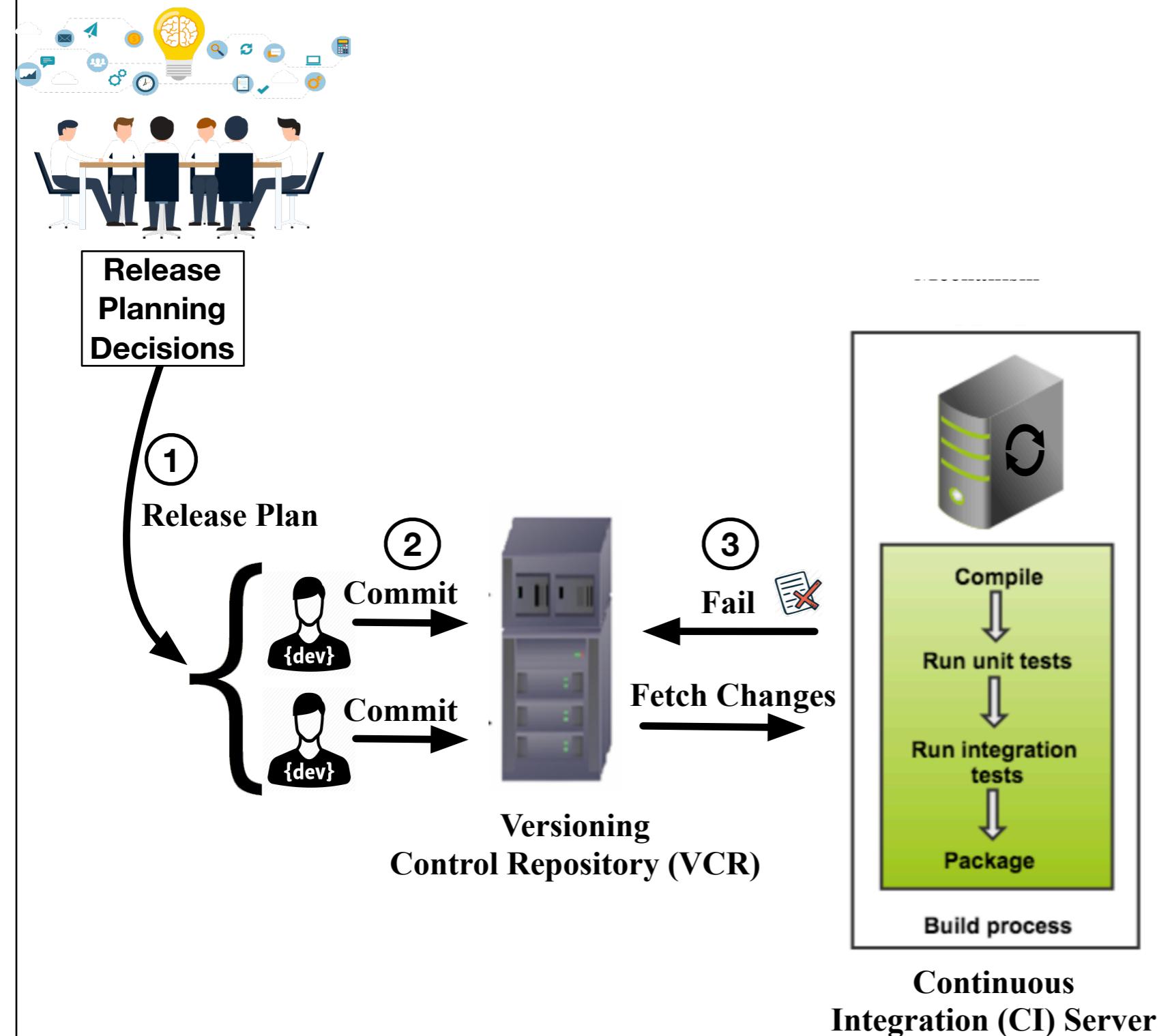
Research Context and Motivation

Simplified Development Process



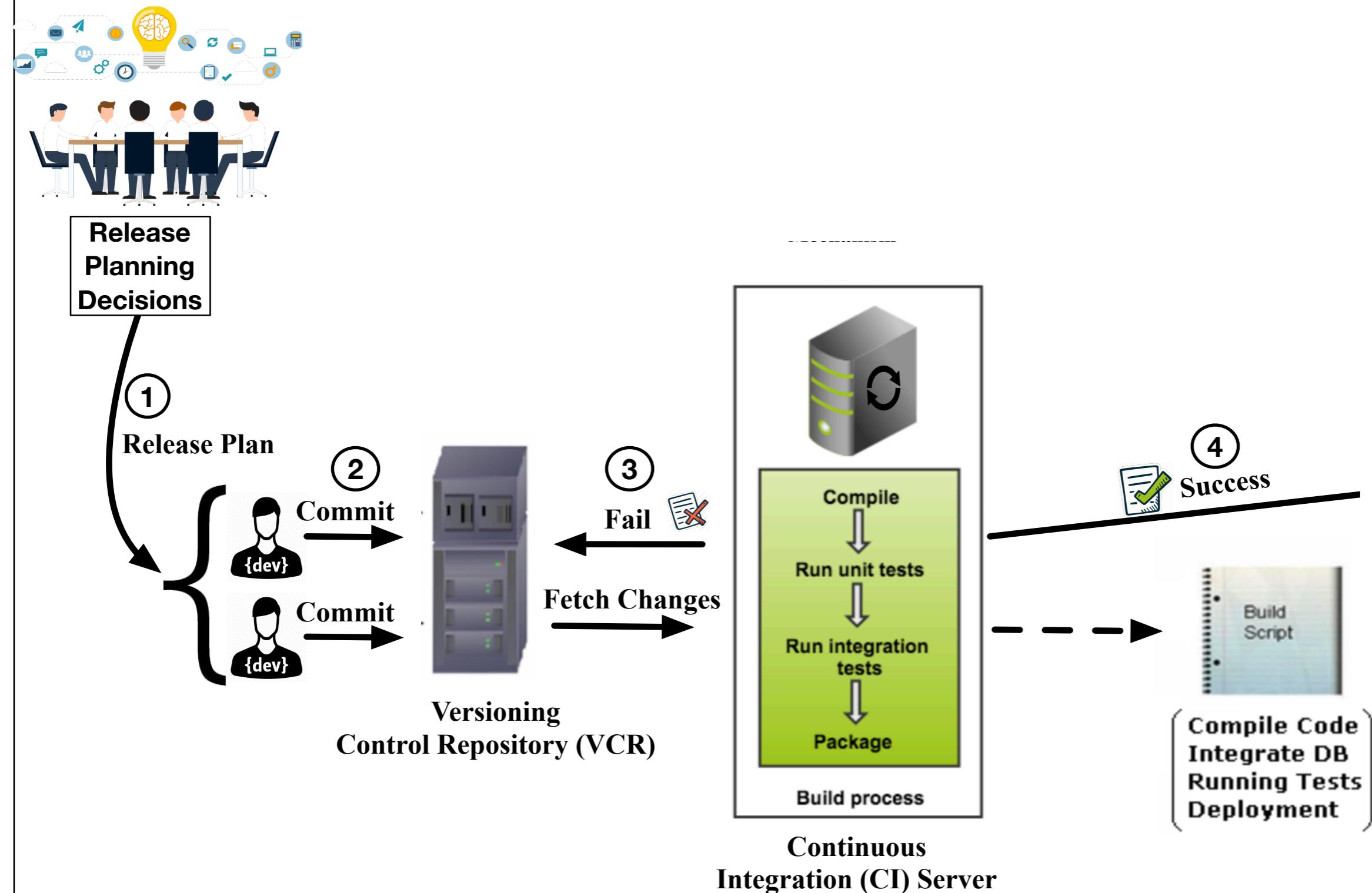
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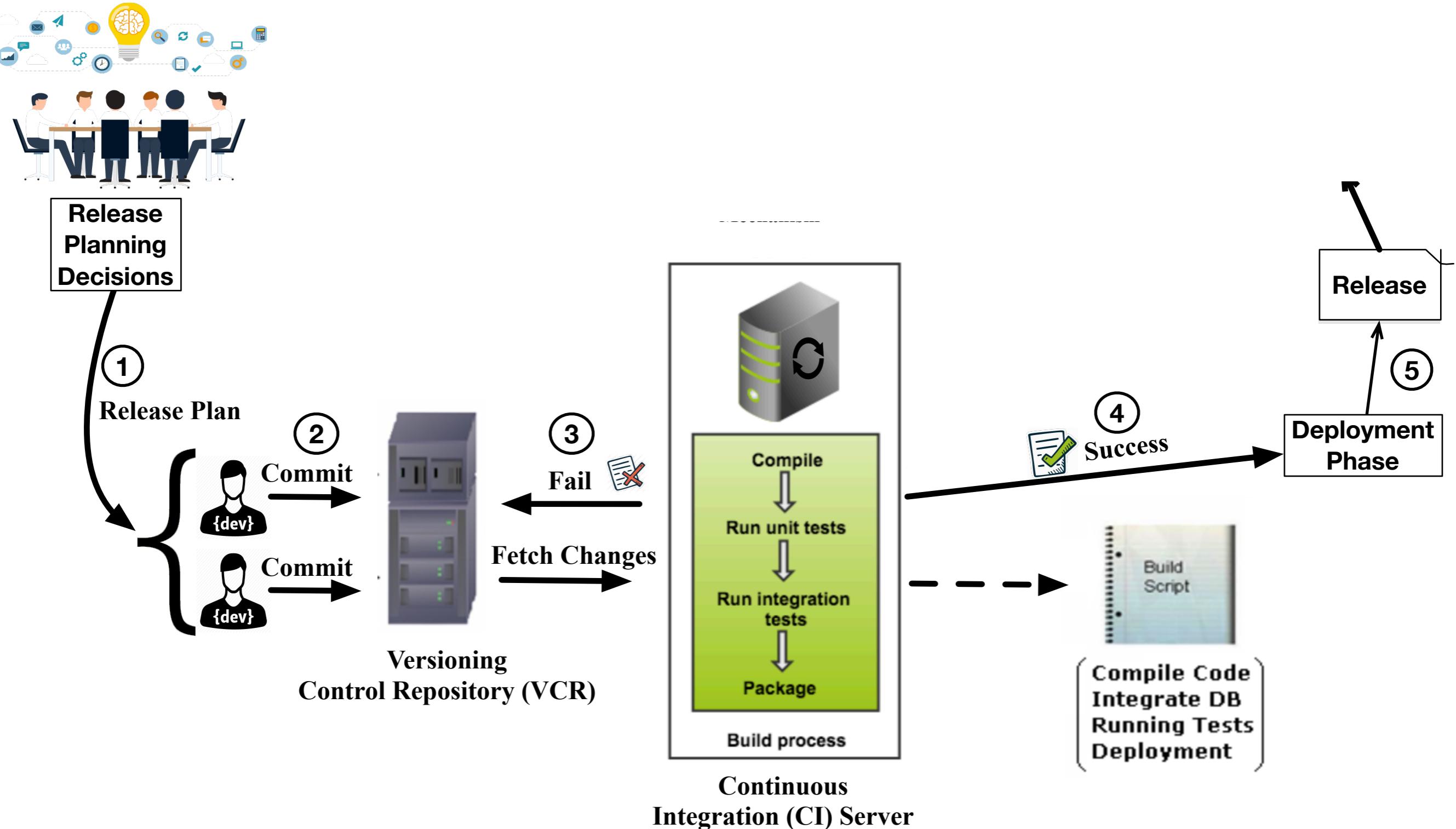
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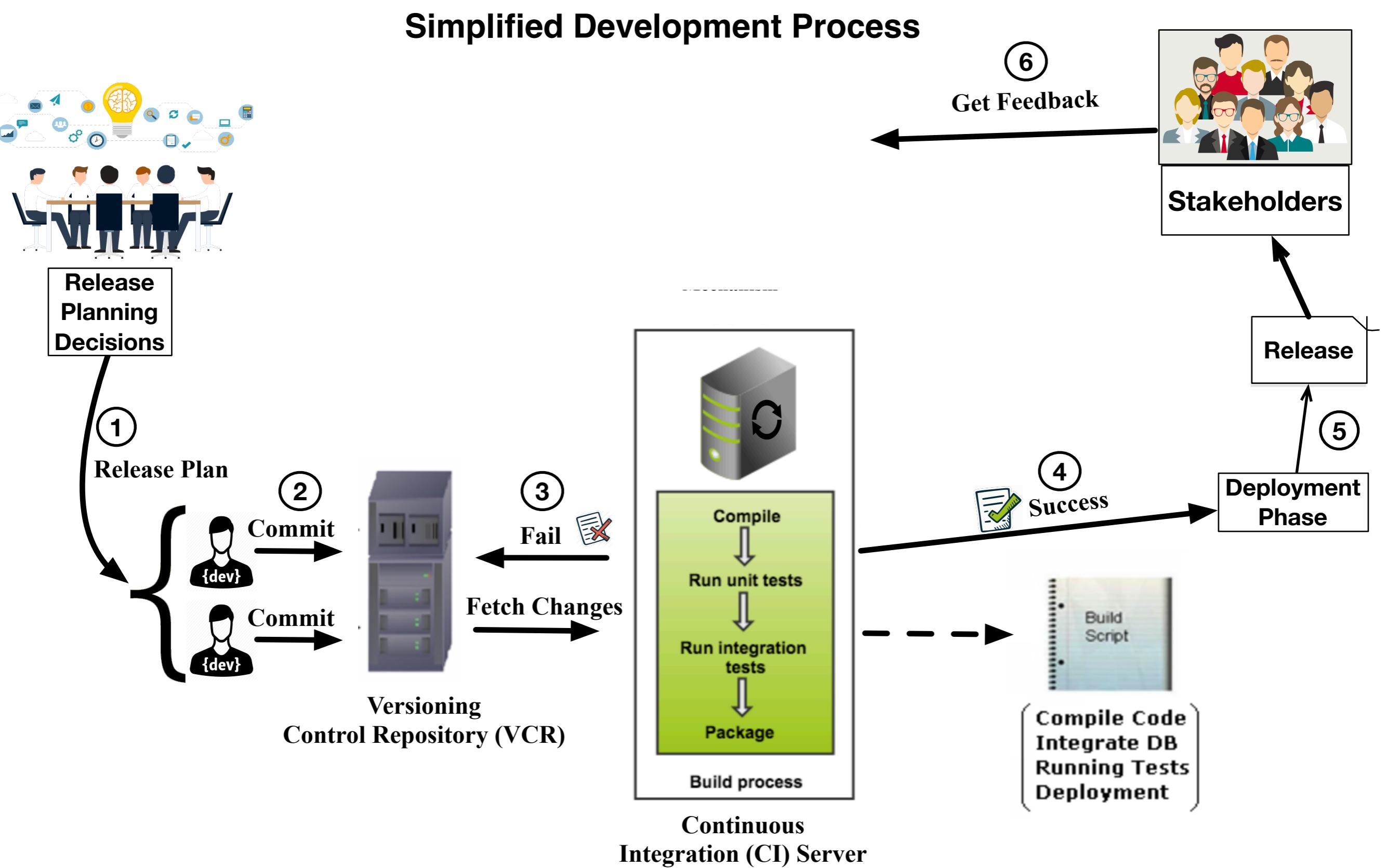


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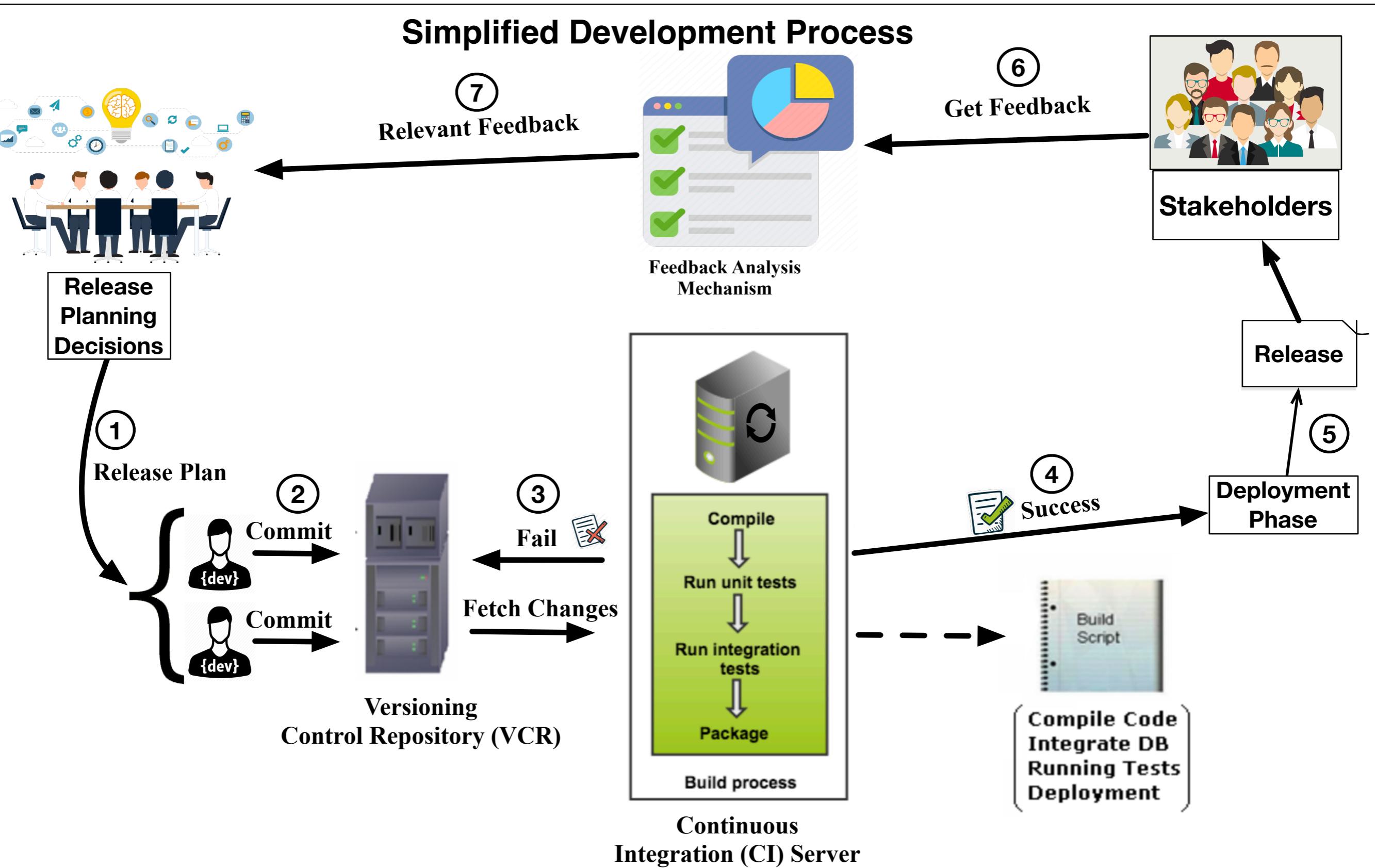
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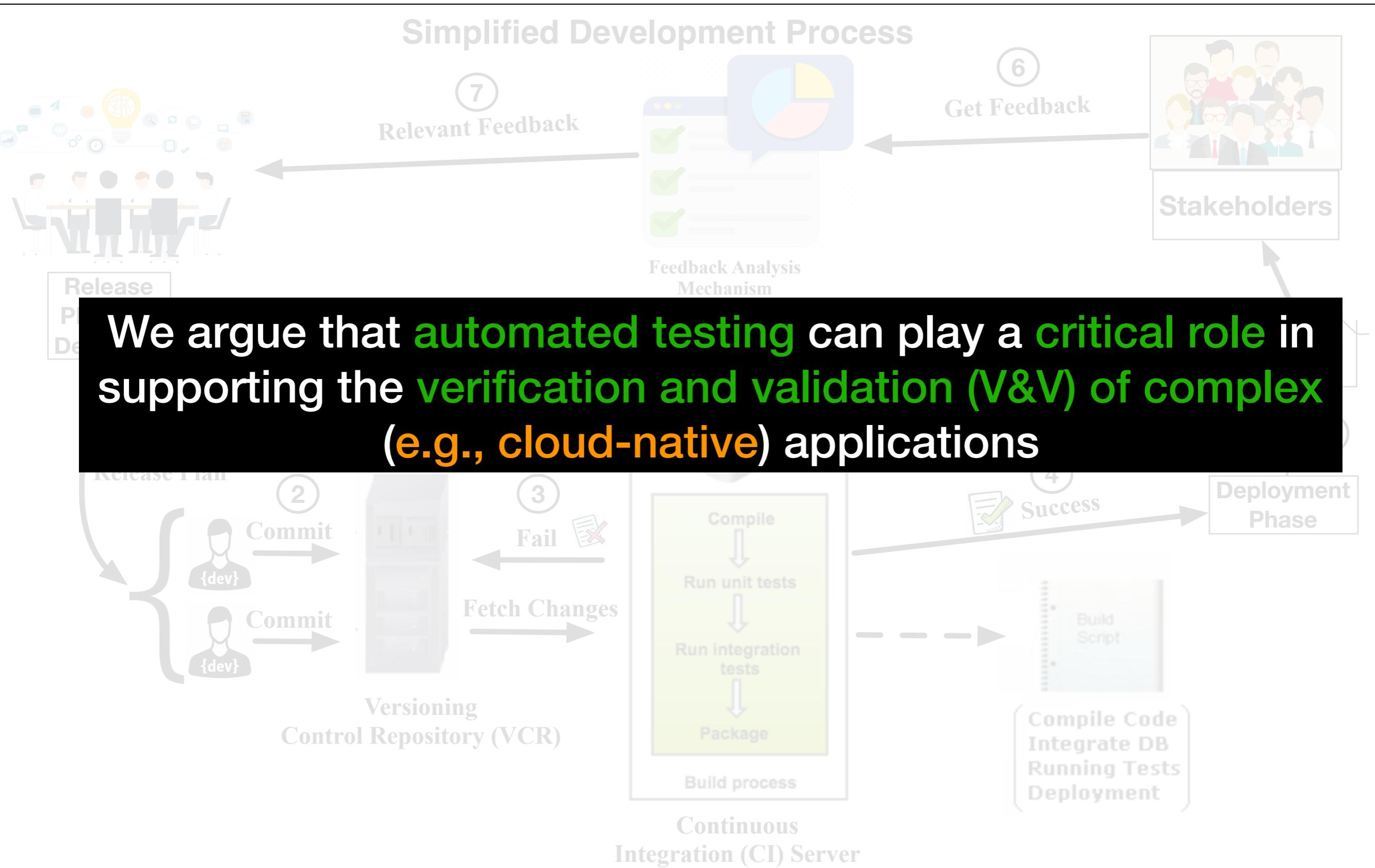
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Research Context and Motivation



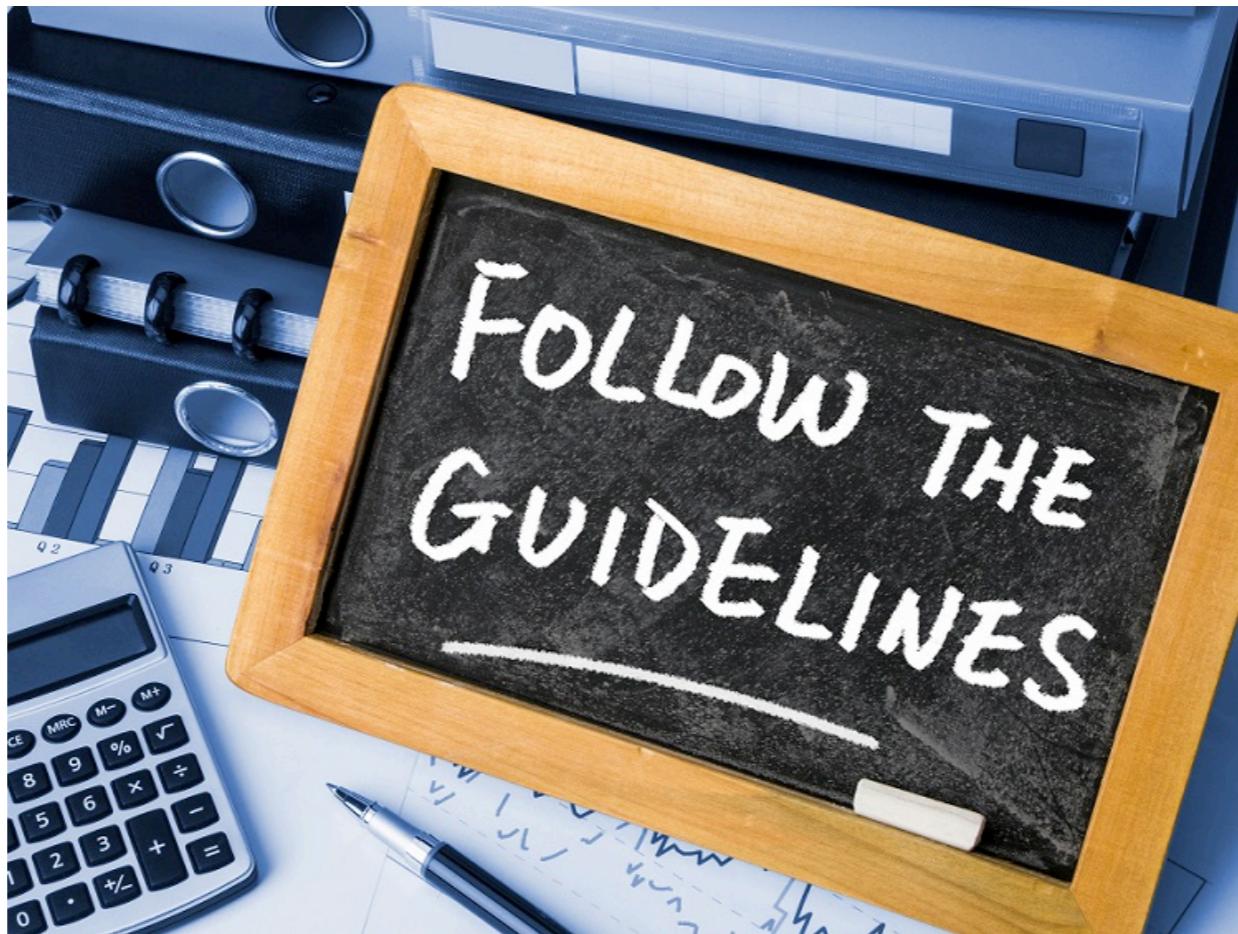
How to come up with a Vision?

“No Silver Bullet, but...”



How to come up with a Vision?

“..there are guidelines...”

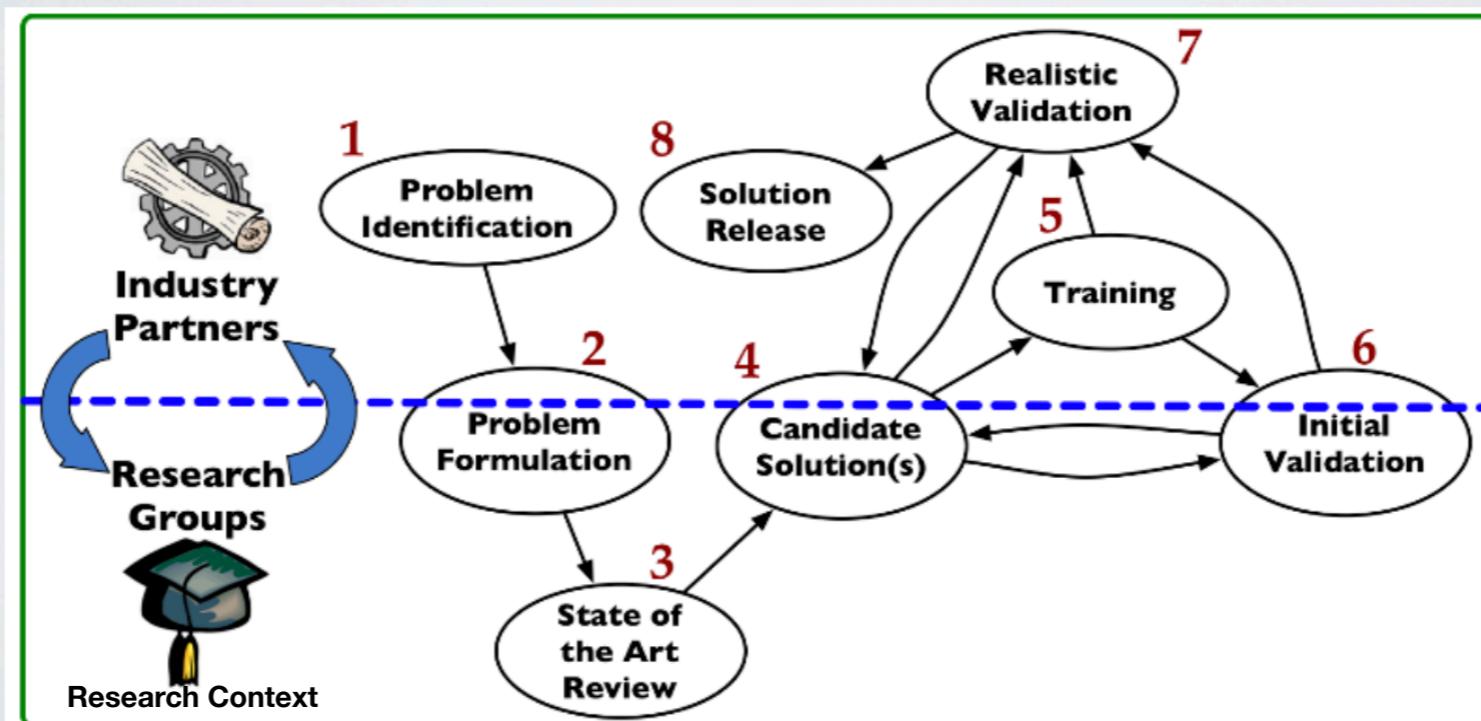


How to come up with a Vision?

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Mode of Collaboration

- Strong emphasis on applied research, driven by needs
- Tight, long-term industrial collaborations



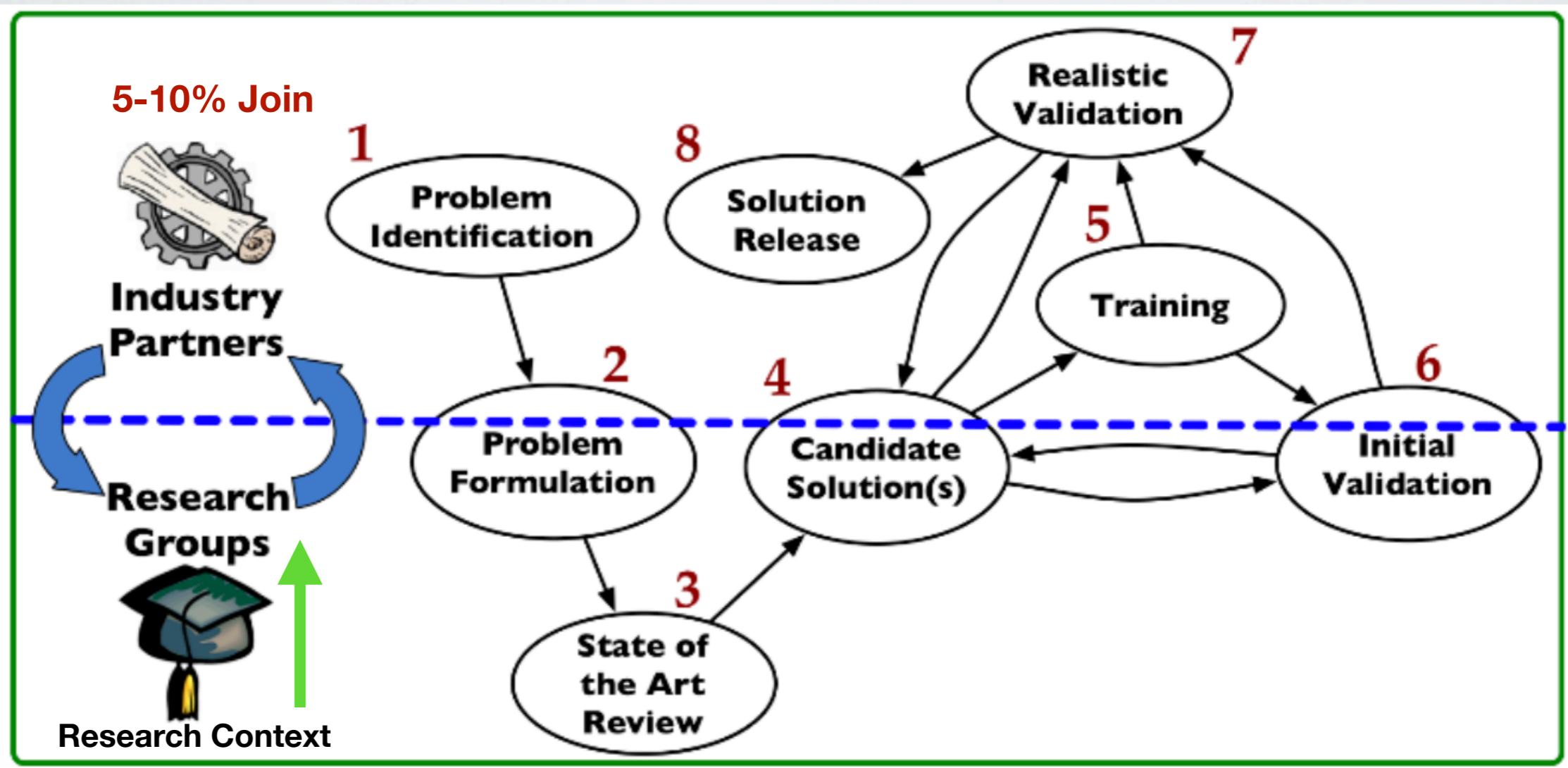
4

“Why and How to Get a PhD?” Prof. Briand - well known for his applied research

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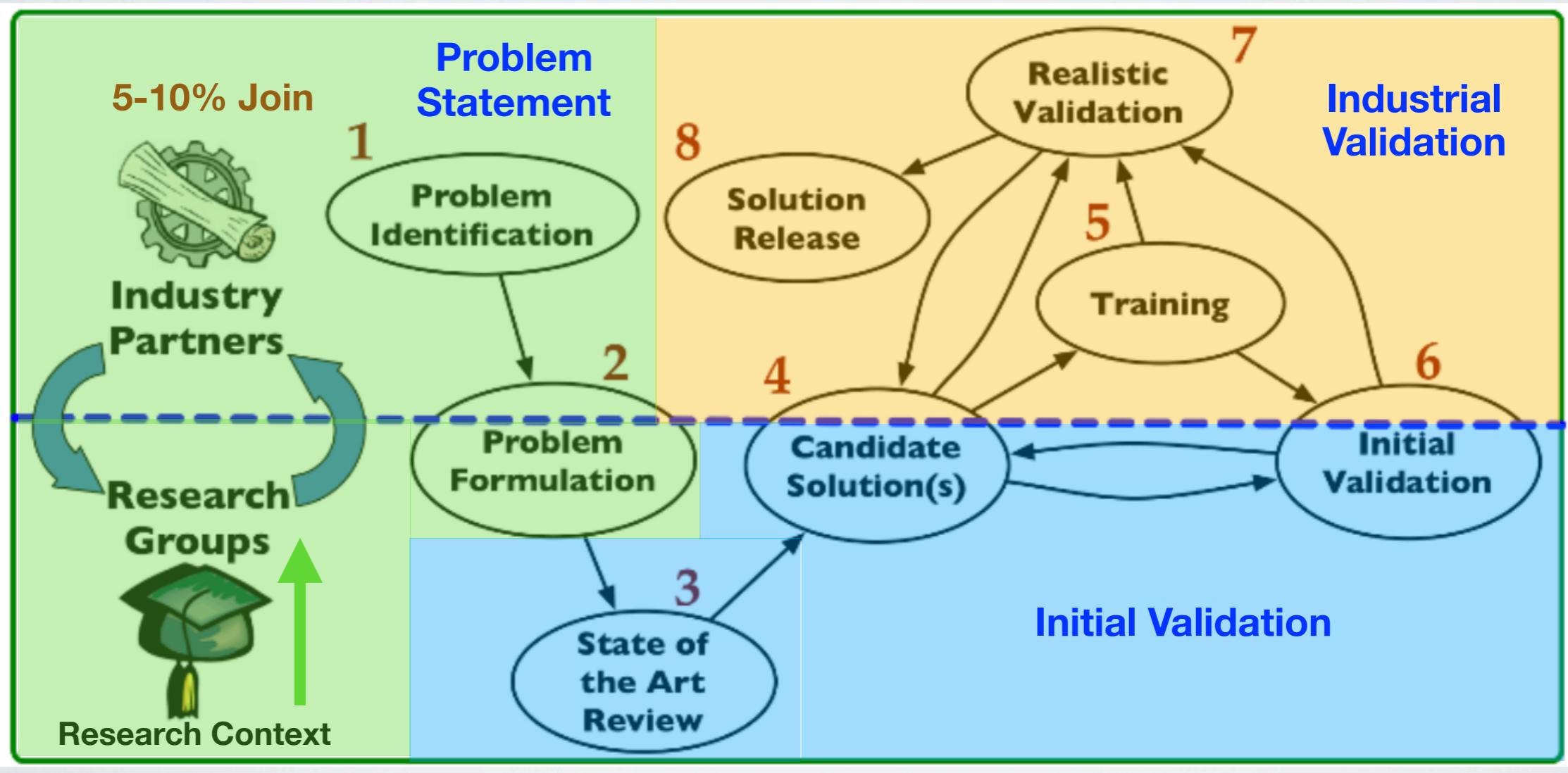
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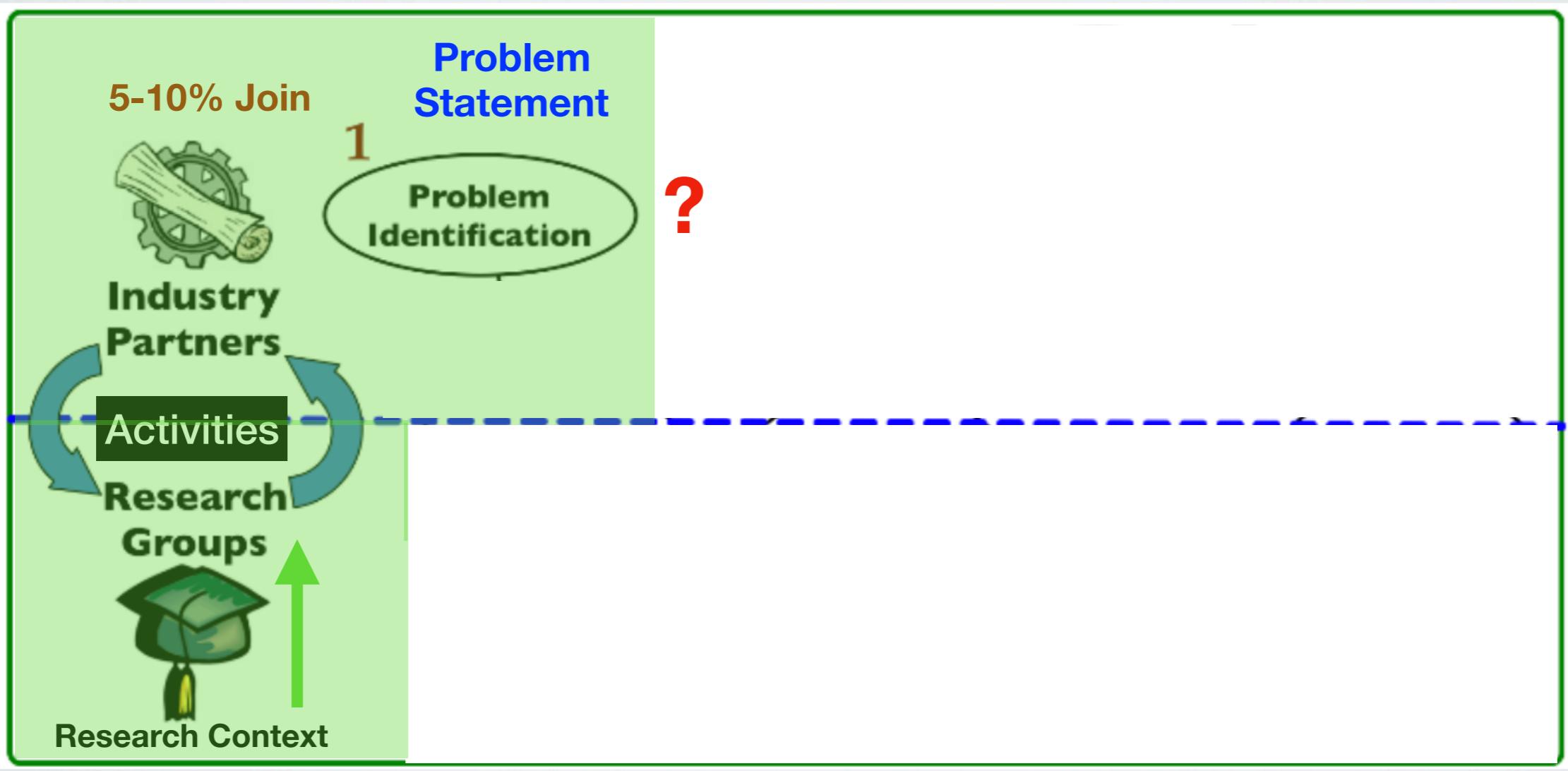


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Industrial Relevance of the Problem?

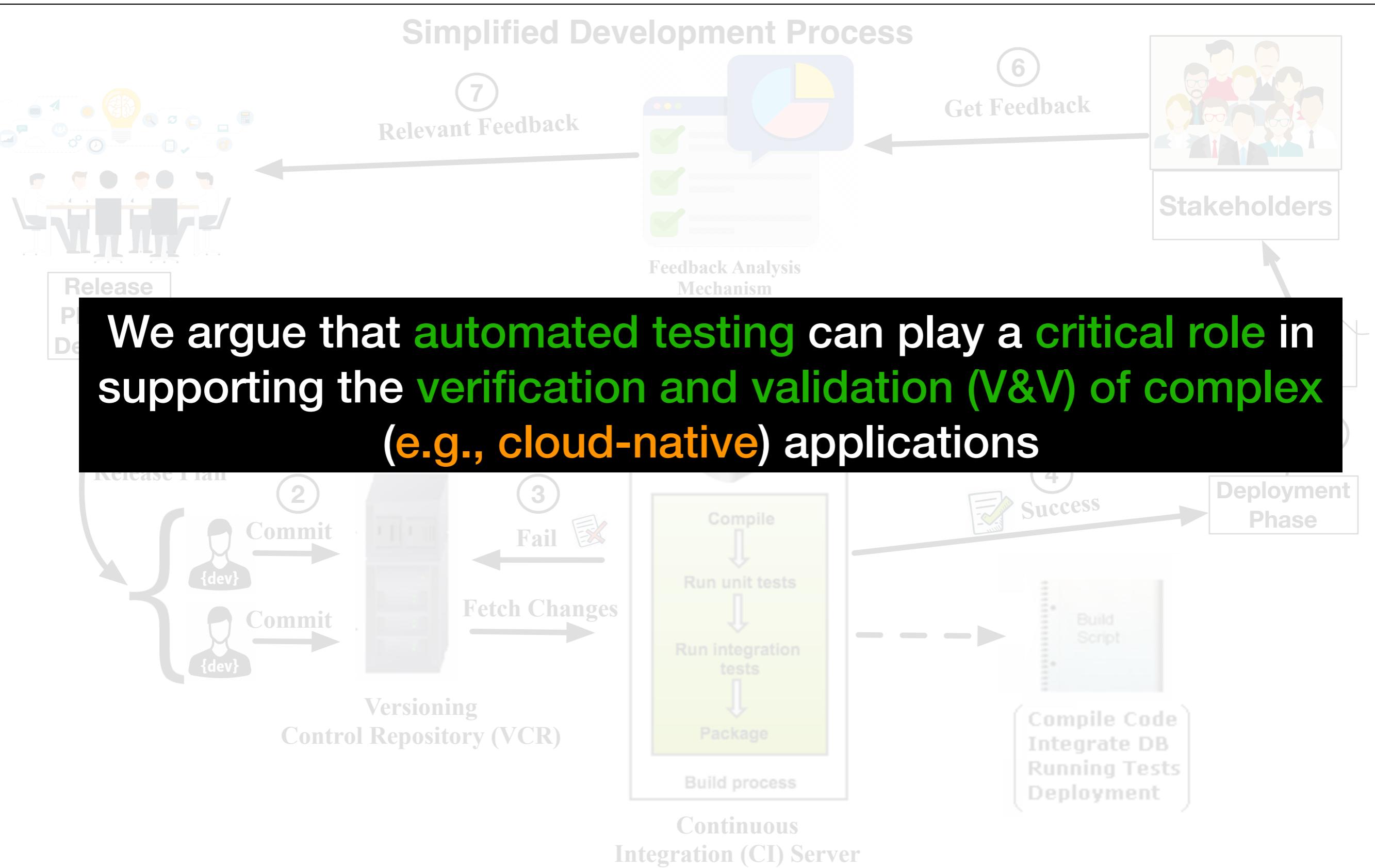
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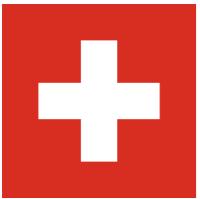


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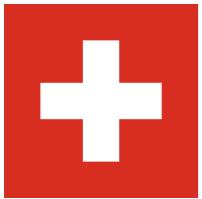
Industrial Relevance of the Problem?





Research Context



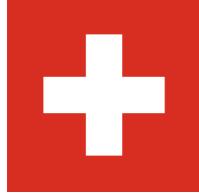


Research Context



Millions of embedded systems (controlled by complex **embedded software**) are connected over the Internet and collect information about the real world





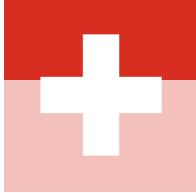
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Etc.



Industrial Relevance of the Problem?



SIEMENS



amanox solutions



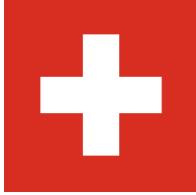
Etc.



Millions of embedded systems (controlled by complex **embedded software**) are connected over the Internet and collect information about the real world

Test Suite Generation

75% of these **companies** interested to **solutions** for debugging and testing their **cloud-native applications**



Research Challenges and Opportunities

DENSO
Crafting the Core

SIEMENS

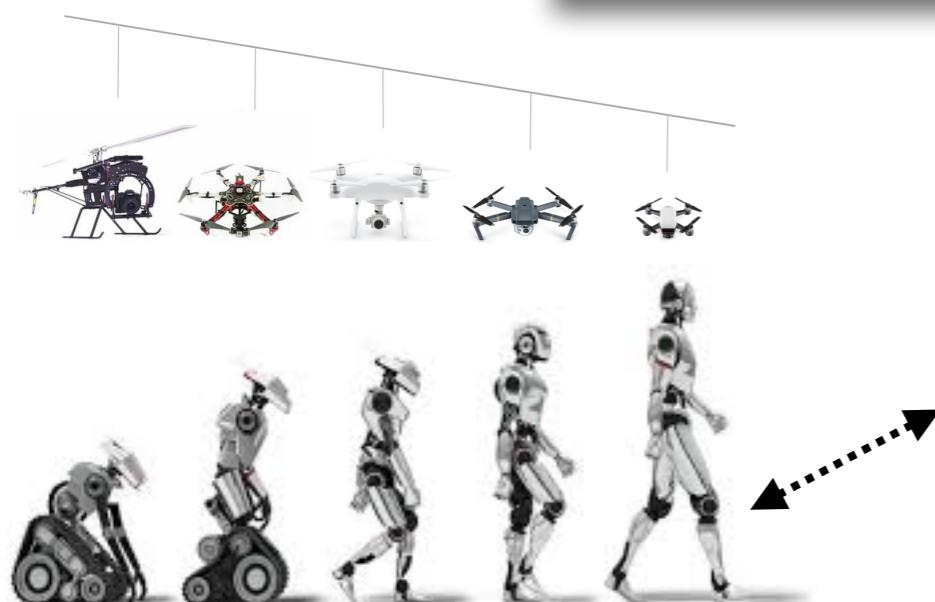
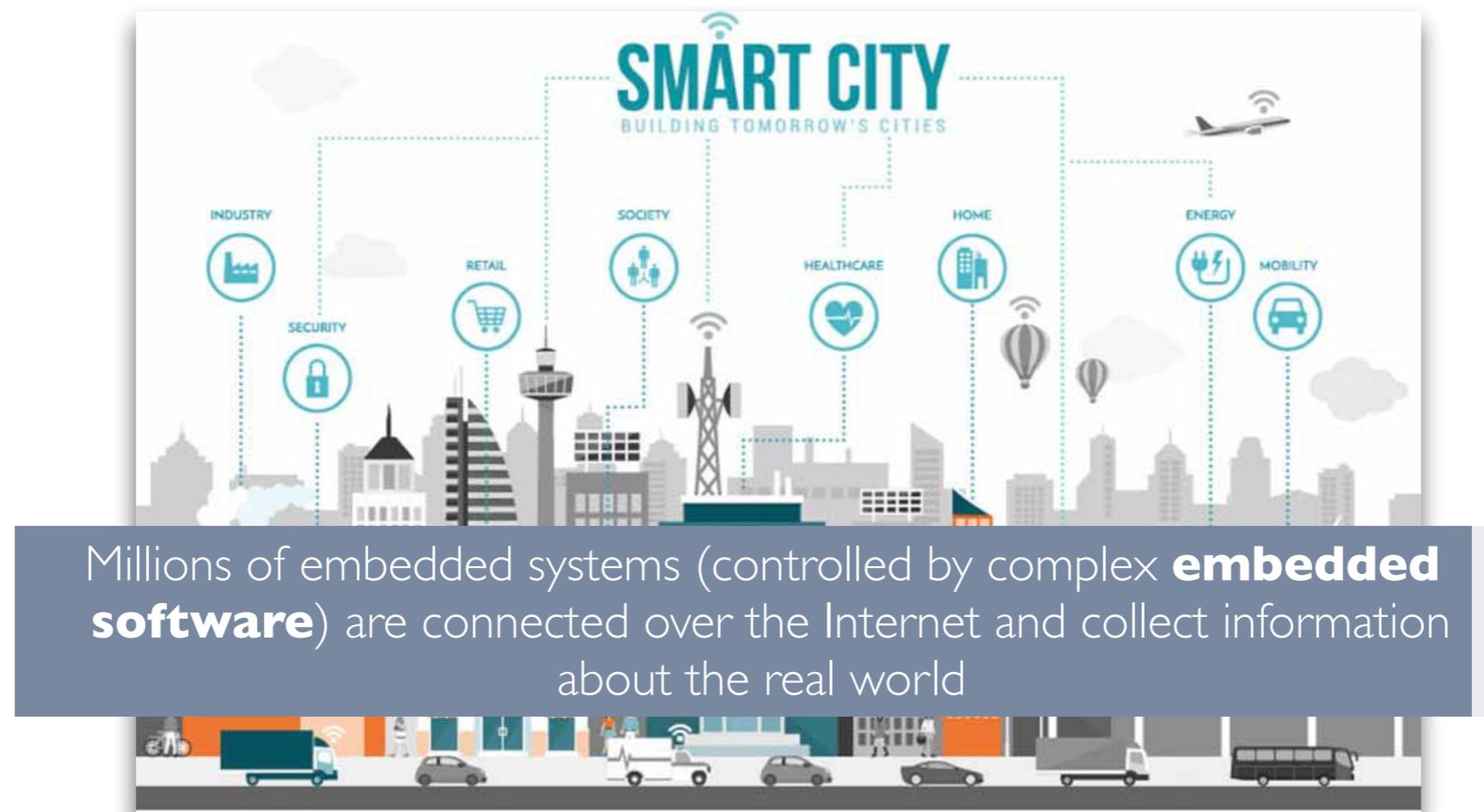
arconnex
innovative collaboration

redhat

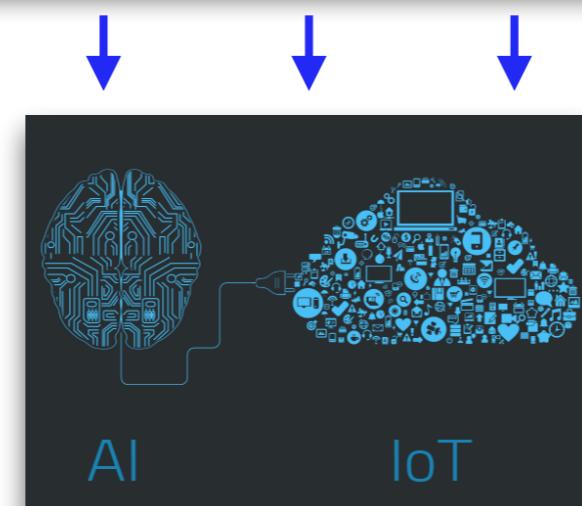
amanox solutions

swisscom

Etc.

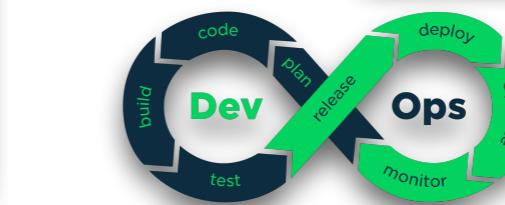


1) Robotics



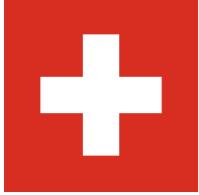
2) Artificial Intelligence (AI)

zhaw
School of Engineering



3) DevOps, IoT, Intelligence (AI), Automated Testing (AT)

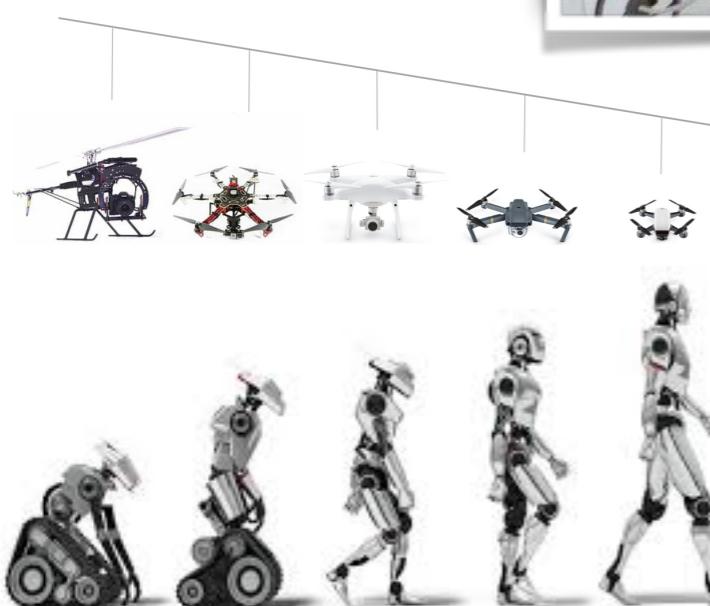




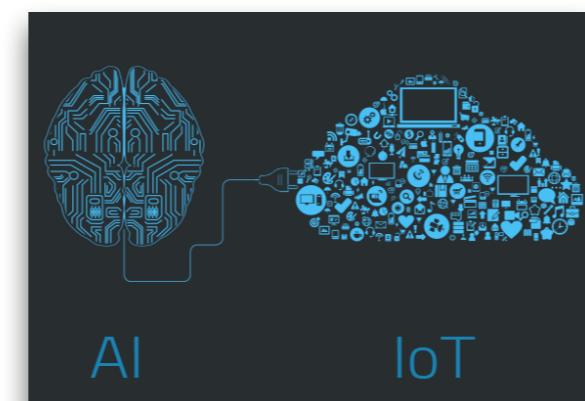
Research Challenges and Opportunities



Next
10 Years

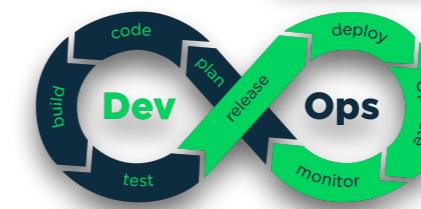
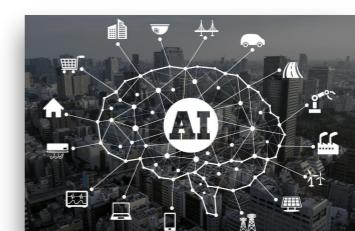
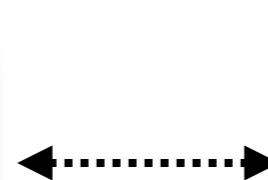


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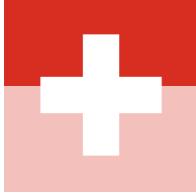
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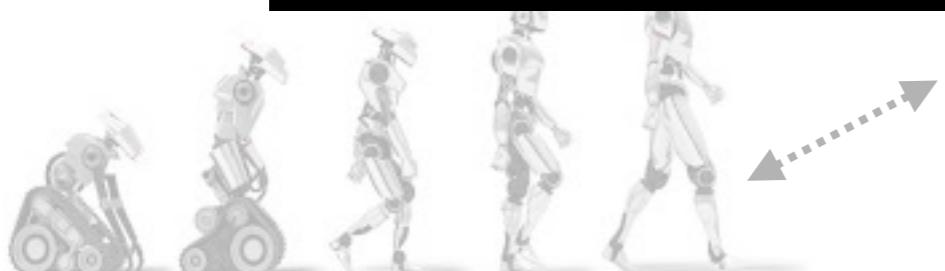
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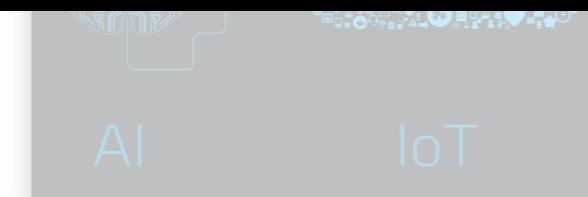
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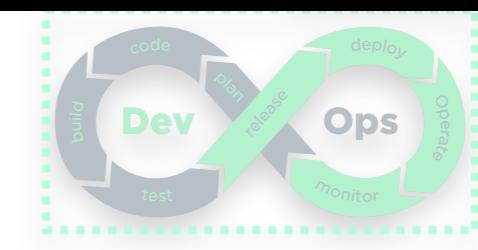


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Industrial Relevance of the Problem?

Cost of Developing, Maintaining and Testing IoT Systems



National Institute of
Standards and Technology



UNIVERSITY OF
CAMBRIDGE

**Over \$ 59 billion
cost to US economy in 2016**

**\$ 312 billion
worldwide cost in 2016**

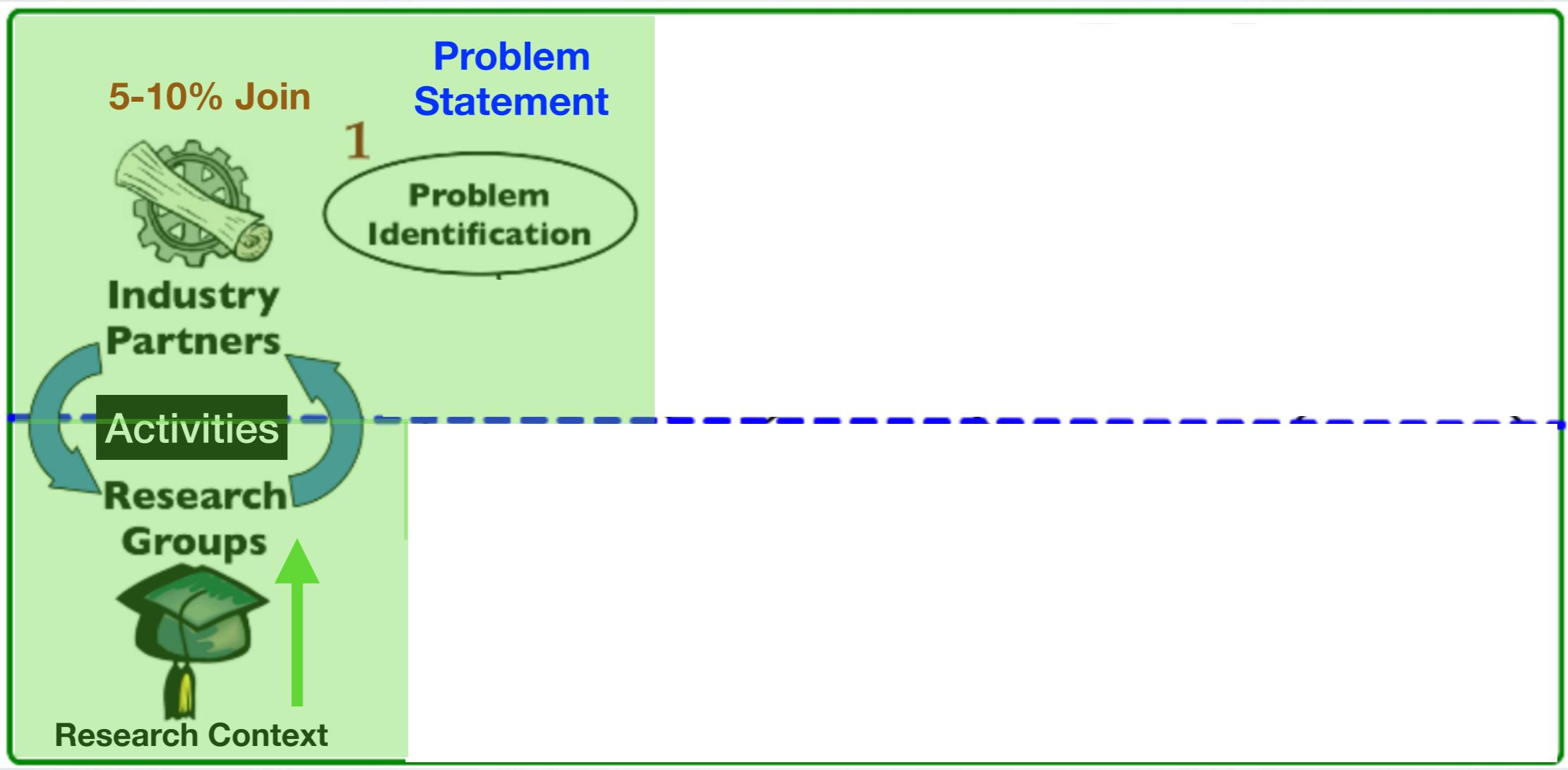
50% of all time spent developing software is
spent finding and fixing bugs

40%-50%

could be saved with proper Software Maintenance and Testing

Industrial Relevance of the Problem?

- Strong emphasis on applied research, driven by needs
- Tight, long-term industrial collaborations



“Why and How to Get a PhD?” Lionel Briand

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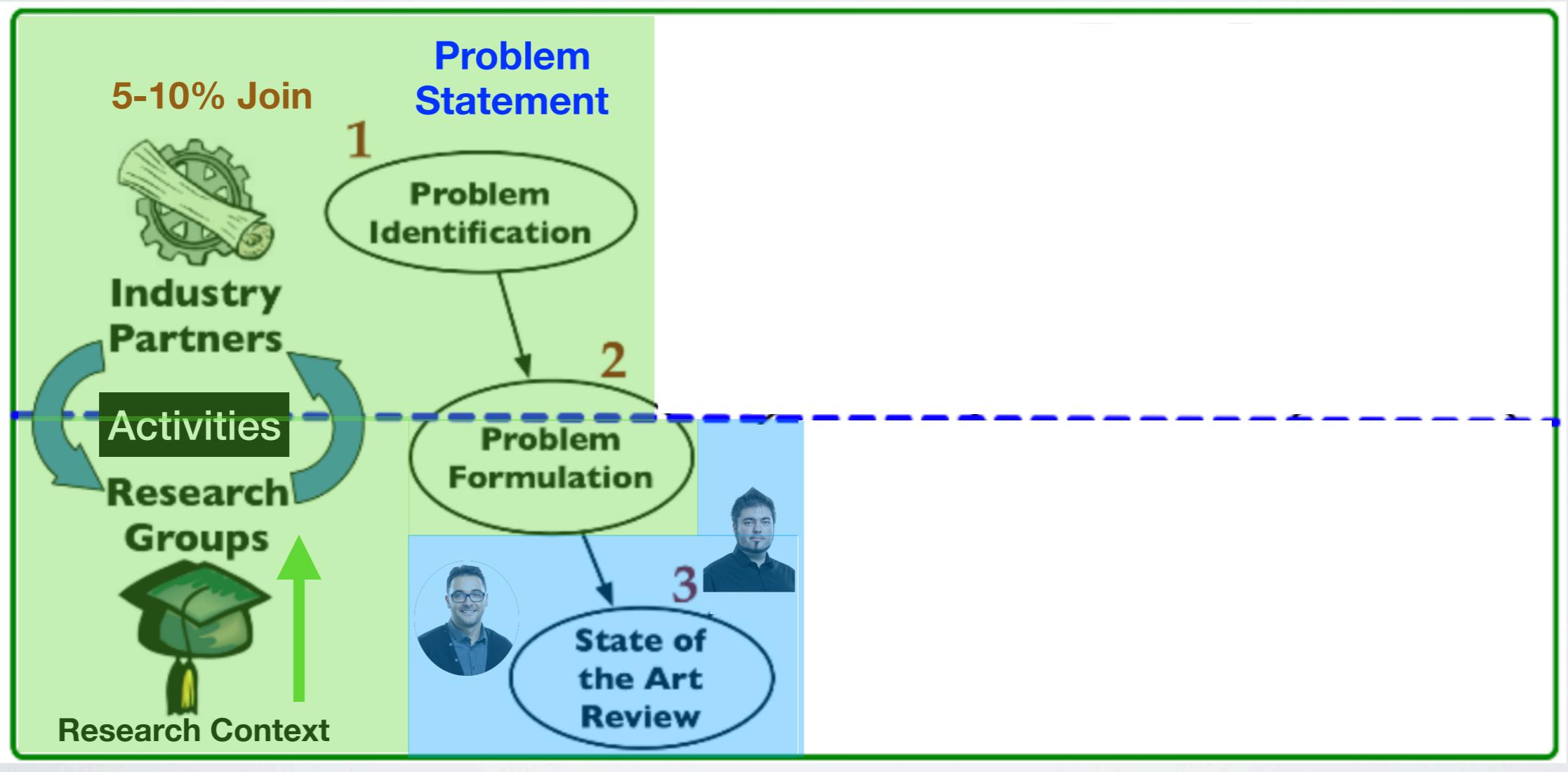
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Literature Review on Testing for the Cloud

The Cloudification Perspectives of Search-based Software Testing

Diego Martin
Zurich University of Applied Science (ZHAW)
Winterthur, Switzerland
marg@zhaw.ch

Sebastiano Panichella
Zurich University of Applied Science (ZHAW)
Winterthur, Switzerland
panc@zhaw.ch

Abstract—To promote and sustain the future of our society, the most critical challenge of contemporary software engineering and cloud computing experts are related to the efficient integration of emerging cloudification and DevOps practices in the development and testing processes of modern systems. In this context, we argue that SBST can play a critical role in improving testing practices and automating the verification and validation (V&V) of cloudification properties of Cloud Native Applications (CNA). Hence, in this paper, we focus on the untouched side of SBST in the cloud field, by discussing (1) the testing challenges in the cloud research field and (2) summarizing the recent contributions of SBST in supporting development practices of CNA. Finally, we discuss the emerging research topics characterizing the cloudification perspectives of SBST in the cloud field.

Keywords-Cloud Native Applications, Search-based Software Testing, Test Suite Generation

I. INTRODUCTION

The first work on Search-Based Software Testing (SBST) appeared in 1976 [1] and in the last decade the SBST research field reached a high maturity, with several research work and tools [2]–[5] aimed at supporting test data generation and test suite quality assessment [6]–[9].

The most critical challenge of software engineering and cloud computing experts is related to the efficient integration of emerging cloudification [10] and DevOps practices in the development and testing processes of modern systems. This put in place the need of solutions ensuring, quantifying, and verifying the elastic scalability (i.e., adjusting their capacity by adding or removing resources) and resiliency (i.e., anticipating failures and fluctuation) [11] of the software/hardware (micro)services composing the systems.

In the cloud field, SBST strategies have been recently experimented for task scheduling [12] and service composition [13]. We argue that SBST can play a critical role in the supporting the verification and validation (V&V) of cloud native applications. Hence, in this paper, we summarize the main challenges and opportunities on the untouched side of the SBST in the cloud field.

II. ANALYSIS AND DISCUSSION

A. Cloud Testing Literature Insights

Cloud-native applications (CNAs) are “distributed, elastic and horizontal-scalable systems composed of (micro)services which isolates states in a minimum of stateful components” [14]. Each self-contained deployment unit

of CNAs is designed according to cloud-focused design patterns and operated on a self-service elastic platform. This means that CNAs are supposed to be *composable, decoupled, elastic* and *resilient* [14].

Even though most of these *properties* have been investigated/analyzed in the literature [15], [16], there are still open problems/challenges where SBST could contribute:

1) **V&V of CNA properties:** Provide automated solutions for V&V of CNA properties like *composition, decoupling, elasticity and resilience*.

2) **CNAs Adaptations:** Provide tools for V&V of cloud migrations or migration between cloud providers.

3) **Microservices Evolution:** Support developers with tools providing an architectural view of microservices evolution, with V&V on the side-effects of specific changes in microservices composition and orchestration.

4) **Local v.s. Global V&V:** Provide automated V&V of microservices evolutions that verify the behaviour of each microservice in isolation (local level) as well as the global microservices *behaviour* and *interactions* in the system.

5) **Execution Time:** Execution of test suites should be efficient and effective, and should encapsulate advanced coverage criteria for microservices based architecture.

B. Literature review of SBST for the cloud

SBST literature in the cloud field focused on the optimization of testing frameworks [17], [18] and the stress of basic CNA properties (elasticity [19] and resilience [20]), with some work analyzing the challenges of cloud migrations [21], and the possibilities of using combinatorial testing [22]. However, some of the challenges previously identified are completely untouched.

We conducted a literature review on SBST papers published in the last 5 years (period 2014–2019), focusing on the works that contributed to the cloud research field.

The literature review has been performed by using DBLP as main source of information. Specifically, in the period analyzed, the selection of papers in DBLP was performed by using specific sets of search keywords, according to the following logic formula: CLOUD \wedge (GENETIC \vee COMBINATORIAL \vee SIMULATED ANNEALING \vee TABU SEARCH \vee PROFILING \vee SLICING \vee COVERAGE \vee COEVOLUTION \vee MUTATION \vee MORPH \vee HEALING \vee SELF REPAIR \vee HILL CLIMBING \vee SEARCH BASED).

The aforementioned filter resulted in only 6 papers relevant to SBST applications in the cloud field from the 396



“...we discuss how automated testing is a potential solution to the challenges identified in the cloud testing field”

Test Suite Generation



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A. Cloud Testing Literature Insights

Cloud-native applications (CNAs) are “distributed, elastic and horizontal-scalable systems composed of (micro)services which isolates states in a minimum of stateful components” [14]. Each self-contained deployment unit

of CNAs is designed according to cloud-focused design patterns and operated on a self-service elastic platform. This means that CNAs are supposed to be *composable, decoupled, elastic* and *resilient* [14].

Even though most of these *properties* have been investigated/analyzed in the literature [15], [16], there are still open problems/challenges where SBST could contribute:

1) **V&V of CNA properties:** Provide automated solutions for V&V of CNA properties like *composition, decoupling, elasticity and resilience*.

2) **CNAs Adaptations:** Provide tools for V&V of cloud migrations or migration between cloud providers.

3) **Microservices Evolution:** Support developers with tools providing an architectural view of microservices evolution, with V&V on the side-effects of specific changes in microservices composition and orchestration.

4) **Local v.s. Global V&V:** Provide automated V&V of microservices evolutions that verify the behaviour of each microservice in isolation (local level) as well as the global microservices *behaviour* and *interactions* in the system.

5) **Execution Time:** Execution of test suites should be efficient and effective, and should encapsulate advanced coverage criteria for microservices based architecture.

B. Literature review of SBST for the cloud

SBST literature in the cloud field focused on the optimization of testing frameworks [17], [18] and the stress of basic CNA properties (elasticity [19] and resilience [20]), with some work analyzing the challenges of cloud migrations [21], and the possibilities of using combinatorial testing [22]. However, some of the challenges previously identified are completely untouched.

We conducted a literature review on SBST papers published in the last 5 years (period 2014–2019), focusing on the works that contributed to the cloud research field.

The literature review has been performed by using DBLP as main source of information. Specifically, in the period analyzed, the selection of papers in DBLP was performed by using specific sets of search keywords, according to the following logic formula: CLOUD \wedge (GENETIC \vee COMBINATORIAL \vee SIMULATED ANNEALING \vee TABU SEARCH \vee PROFILING \vee SLICING \vee COVERAGE \vee COEVOLUTION \vee MUTATION \vee MORPH \vee HEALING \vee SELF REPAIR \vee HILL CLIMBING \vee SEARCH BASED).

The aforementioned filter resulted in only 6 papers relevant to SBST applications in the cloud field from the 396



1) Cloud Testing Challenges

2) Literature review Automated Testing

3) Cloud future perspectives

Cloud Testing Challenges

ACM SIGSOFT Software Engineering Notes Page 1

May 2012 Volume 37 Number 3

Empirical Evaluation of Cloud-based Testing Techniques: A Systematic Review

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Annals of Telecommunications manuscript No.
(will be inserted by the editor)

A survey on formal active and passive testing with applications to the cloud

Ana R. Cavalli · Teruo Higashino · Manuel Núñez



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journal homepage: www.elsevier.com/locate/jss

Received:

1 Introduction

Understanding cloud-native applications after 10 years of cloud computing - A systematic mapping study



CrossMark

Nane Kratzke*, Peter-Christian Quint

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ABSTRACT

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Keywords:
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Systematic mapping study
Elastic platform
Microservice
Self service
Pattern
Softwareization

It is common sense that cloud-native applications (CNA) are intentionally designed for the cloud. Although this understanding can be broadly used it does not guide and explain what a cloud-native application exactly is. The term "cloud-native" was used quite frequently in birthday times of cloud computing (2006) which seems somehow obvious nowadays. But the term disappeared almost completely. Suddenly and in the last years the term is used again more and more frequently and shows increasing momentum. This paper summarizes the outcomes of a systematic mapping study analyzing research papers covering "cloud-native" topics, research questions and engineering methodologies. We summarize research focuses and trends dealing with cloud-native application engineering approaches. Furthermore, we provide a definition for the term "cloud-native application" which takes all findings, insights of analyzed publications and already existing and well-defined terminology into account.

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native applications (CNA). This contribution investigates a more precise understanding of the term "cloud-native".

According to [Fig. 1](#) and Google trends the term "cloud-native" has an unusual diffusion rate over time. In birthday times of cloud computing – so about 10 years ago – it was used quite frequently. To label something as cloud-native at the starting days of cloud computing seems somehow obvious today. However, the usage of the term "cloud-native" decreased over following years according to Google. But since 2015, the term is more and more frequently used again and gained momentum (see [Fig. 1](#)). We have to admit that Google trends is not a very reliable source for research – it is known to be prone for "industrial buzzwords". But, our literature review will show a very similar usage of the term "cloud-native" in research studies (the reader might want to compare [Figs. 1](#) and [5a](#)). Furthermore, our data indicates that the current understanding of the term "cloud-native" seems to have its origin in research and not in industry. It was used and characterized since 2012 in research. And yes, it gets suddenly popular in industry, but not before 2015 (according to Google trends, see [Fig. 1](#)). We assume this sudden rise in industry has to do with the current popularity of microservice and container-based approaches. Cloud-native applications may be a logical continuation of microservice



1) Cloud Testing Challenges

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Cloud Testing Challenges

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Cloud Challenges

Verification and Validation (V&V) of Cloud-native (CNA) properties (e.g., composition, elastic scalability)

CNAs Adaptations (e.g., migration)

Microservices Evolution (e.g., providing an architectural view of microservices evolution)

Local v.s. Global Verification and Validation (e.g., V&V local microservices v.s. all microservices)

Execution Time (Efficient and Effective)

Cloud Testing Challenges

ACM SIGSOFT Software Engineering Notes Page 1 May 2012 Volume 37 Number 3

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Cloud Challenges

Verification and Validation (V&V) of Cloud-native (CNA) properties (e.g., composition, elastic scalability)

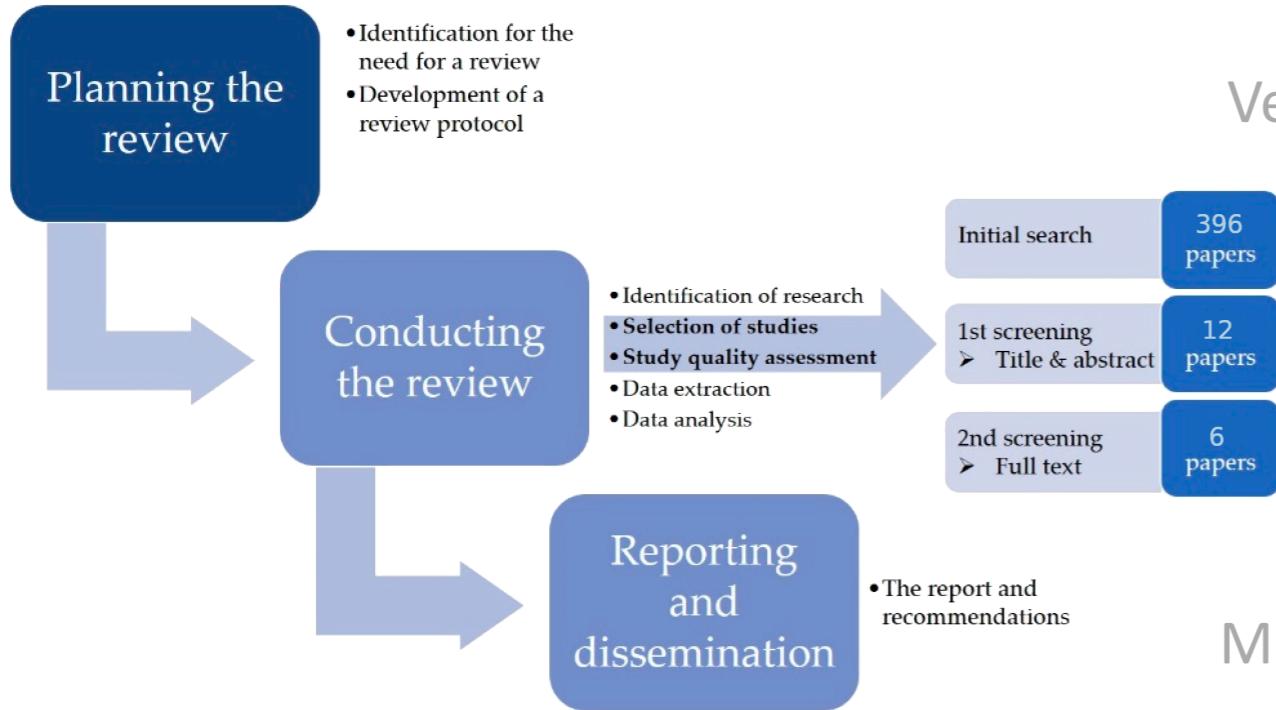
CNAs Adaptations (e.g., migration)

Microservices Evolution (e.g., providing an architectural view of microservices evolution)

Local v.s. Global Verification and Validation (e.g., V&V local microservices v.s. all microservices)

Execution Time (Efficient and Effective)

Literature Review on Testing for the Cloud



**Search keywords formula
(DBLP & Google Scholar):**

CLOUD \wedge
(GENETIC \vee COMBINATORIAL \vee SIMULATED
ANNEALING \vee TABU SEARCH \vee PROFILING \vee
SLICING \vee COVERAGE \vee COEVOLUTION \vee
MUTATION \vee MORPH \vee HEALING \vee SELF REPAIR
 \vee HILL CLIMBING \vee SEARCH BASED)

Cloud Challenges

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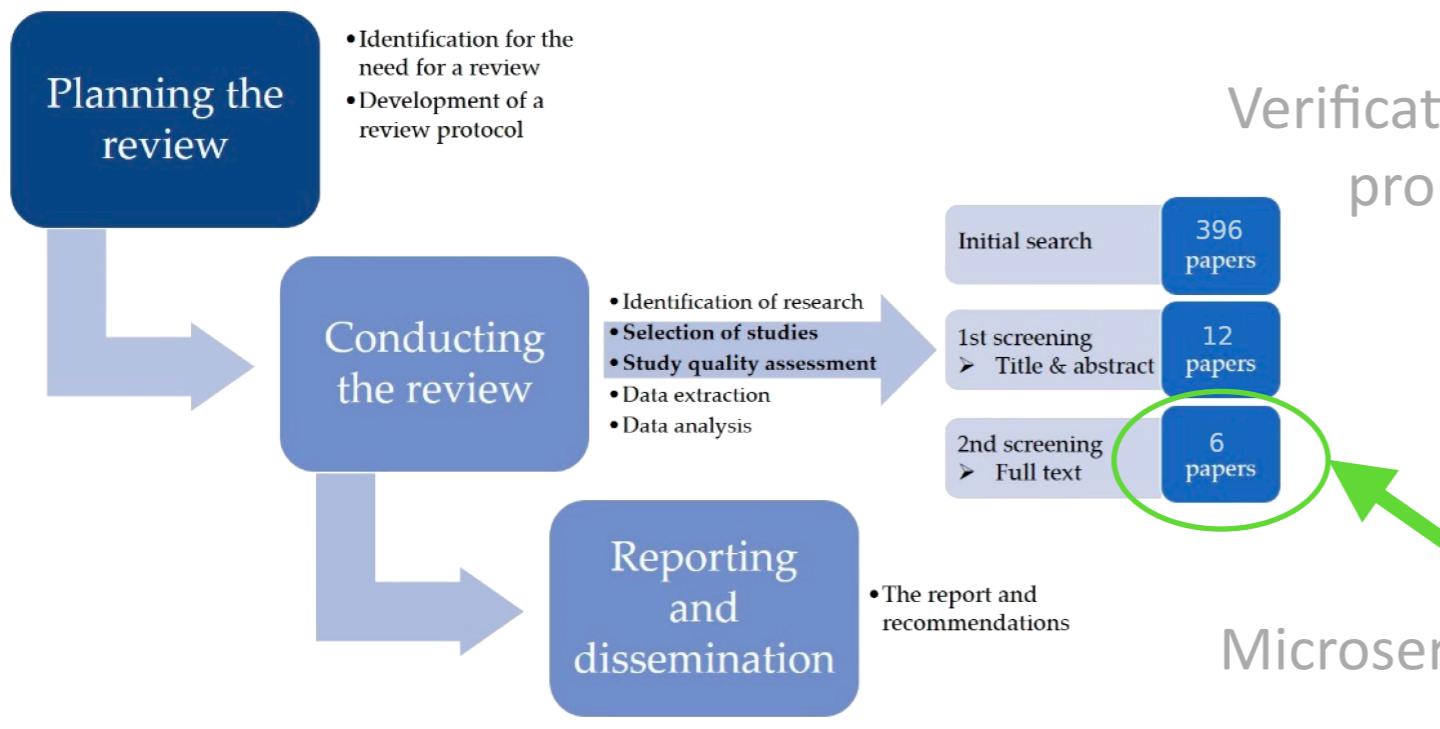
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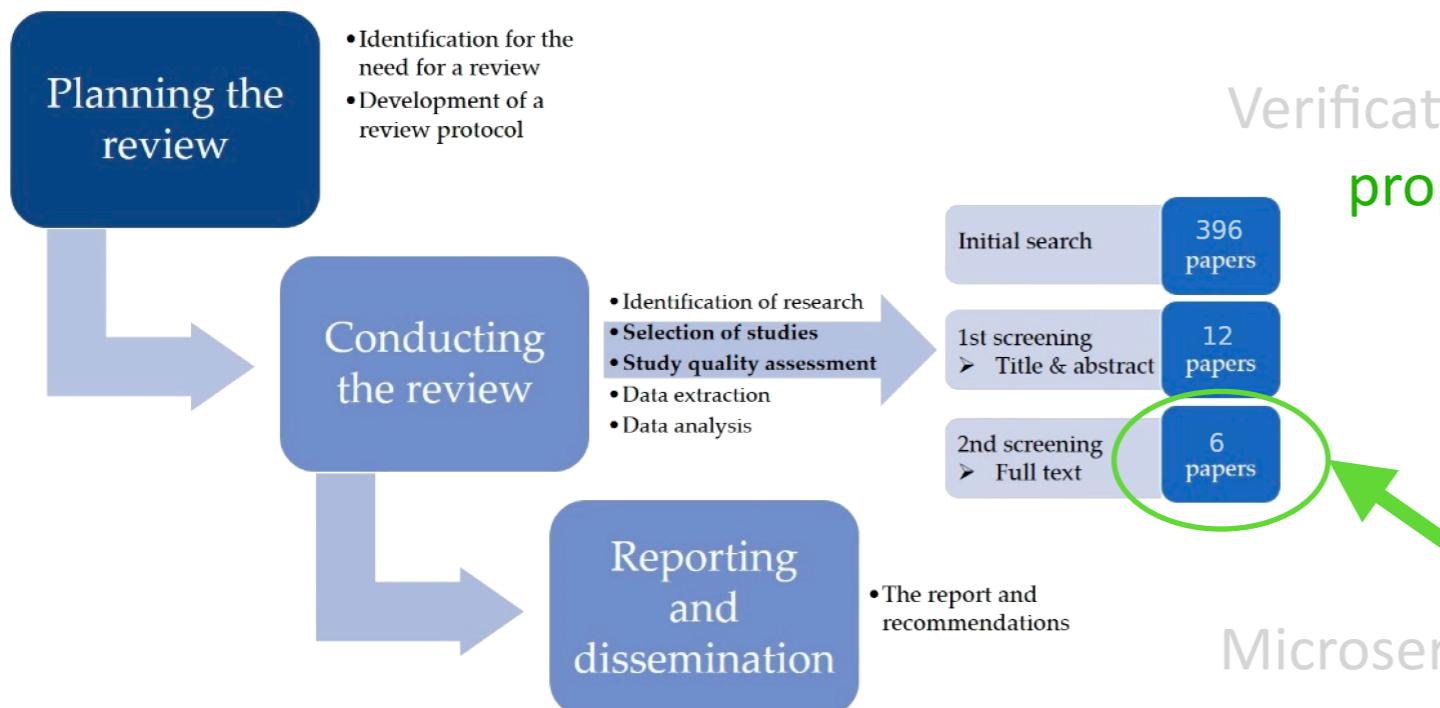
Only 6 papers addressing Cloud Challenges

Local v.s. Global Verification and Validation (e.g., V&V local microservices v.s. all microservices)

Execution Time (Efficient and Effective)

Literature Review on Testing for the Cloud

Cloud Challenges



Verification and Validation (V&V) of Cloud-native (CNA) properties (e.g., composition, elastic scalability)

CNAs Adaptations (e.g., migration)

Microservices Evolution (e.g., providing an architectural view of microservices evolution)

Only 6 papers addressing Cloud Challenges

SBST literature in the cloud field focused on the optimization of testing frameworks and the stress of **basic CNA properties** (elasticity and resilience)

Local v.s. Global Verification and Validation (e.g., V&V local microservices v.s. all microservices)

Execution Time (Efficient and Effective)

Future Directions

Cloud Challenges

Verification and Validation (V&V) of Cloud-native (CNA) properties (e.g., composition, elastic scalability)

CNAs Adaptations (e.g., migration)

Microservices Evolution (e.g., providing an architectural view of microservices evolution)

Local v.s. Global Verification and Validation (e.g., V&V local microservices v.s. all microservices)

Execution Time (Efficient and Effective)

Future Directions

Test case generation for the V&V of CNA properties is still a widely unexplored field

Metrics and tools should be designed in order to guide the generation and the quality assessment of corresponding tests.

SBST strategies, encapsulating smart mechanisms able to assess the inputs that most impact, affect, interacts with the coordination and evolution of the microservices architecture.

Cloud Challenges

Verification and Validation (V&V) of Cloud-native (CNA) properties (e.g., composition, elastic scalability)

CNAs Adaptations (e.g., migration)

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Local v.s. Global Verification and Validation (e.g., V&V local microservices v.s. all microservices)

Execution Time (Efficient and Effective)

Future Directions

SBST techniques have a perfect match
the **assessment/verification** of CNA
adaptation and **migration challenges**

Profiling and current **monitoring**
techniques can be combined **with**
SBST strategies to better verify/monitor
flow bottlenecks in the execution time

... helping developers achieve the typical
execution-time requirements of CNA.

Cloud Challenges

Verification and Validation (V&V) of Cloud-native (CNA)
properties (e.g., composition, elastic scalability)

CNAs Adaptations (e.g., migration)

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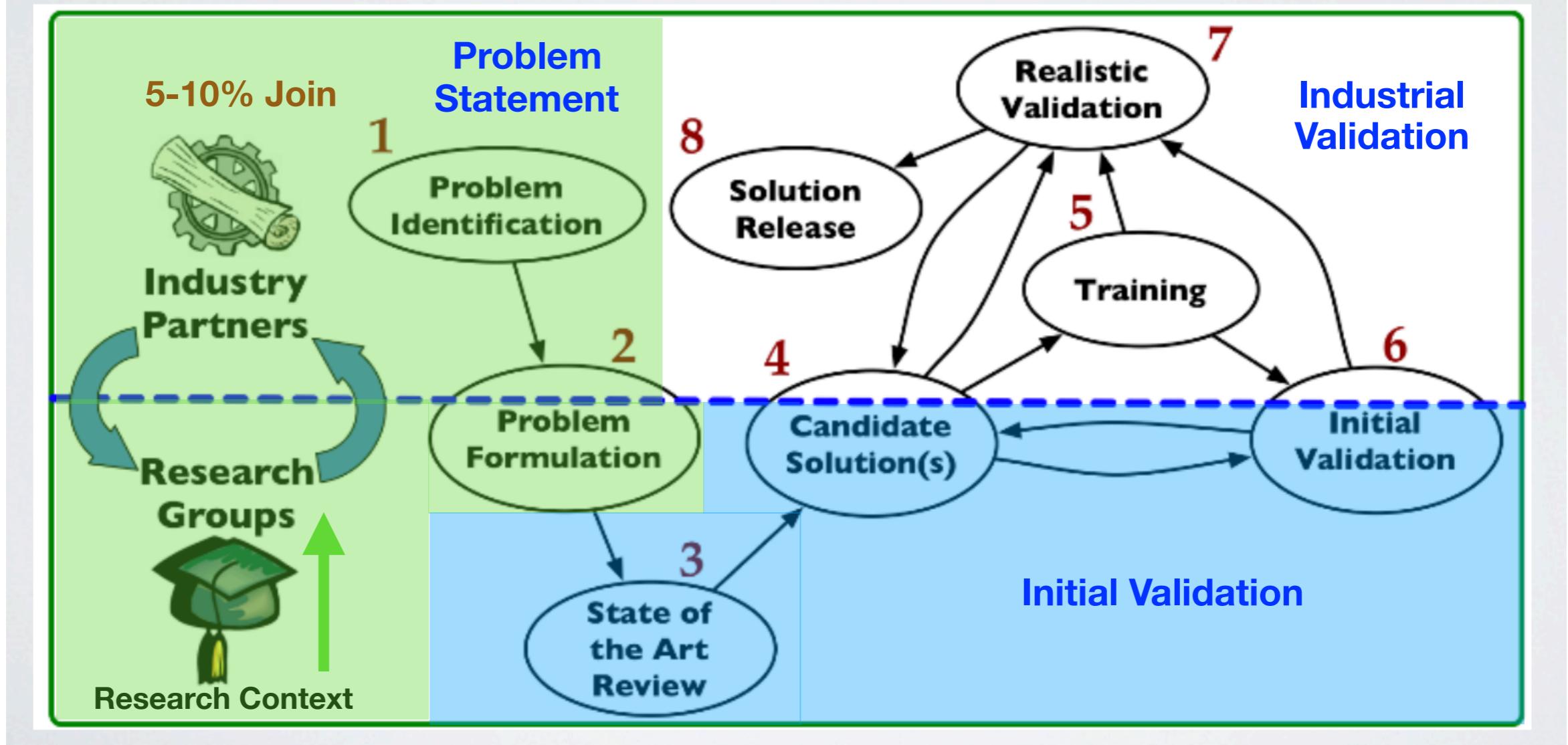
Local v.s. Global Verification and Validation (e.g., V&V
local microservices v.s. all microservices)

Execution Time (Efficient and Effective)

How to come up with a Vision?

“..there are guidelines...”

- Strong emphasis on applied research, driven by needs
- Tight, long-term industrial collaborations



“Why and How to Get a PhD?” Lionel Briand

<https://bit.ly/2LGg7nI>

Outline

PART I

1) Research Context and Motivation

PART II

2) Literature review on:

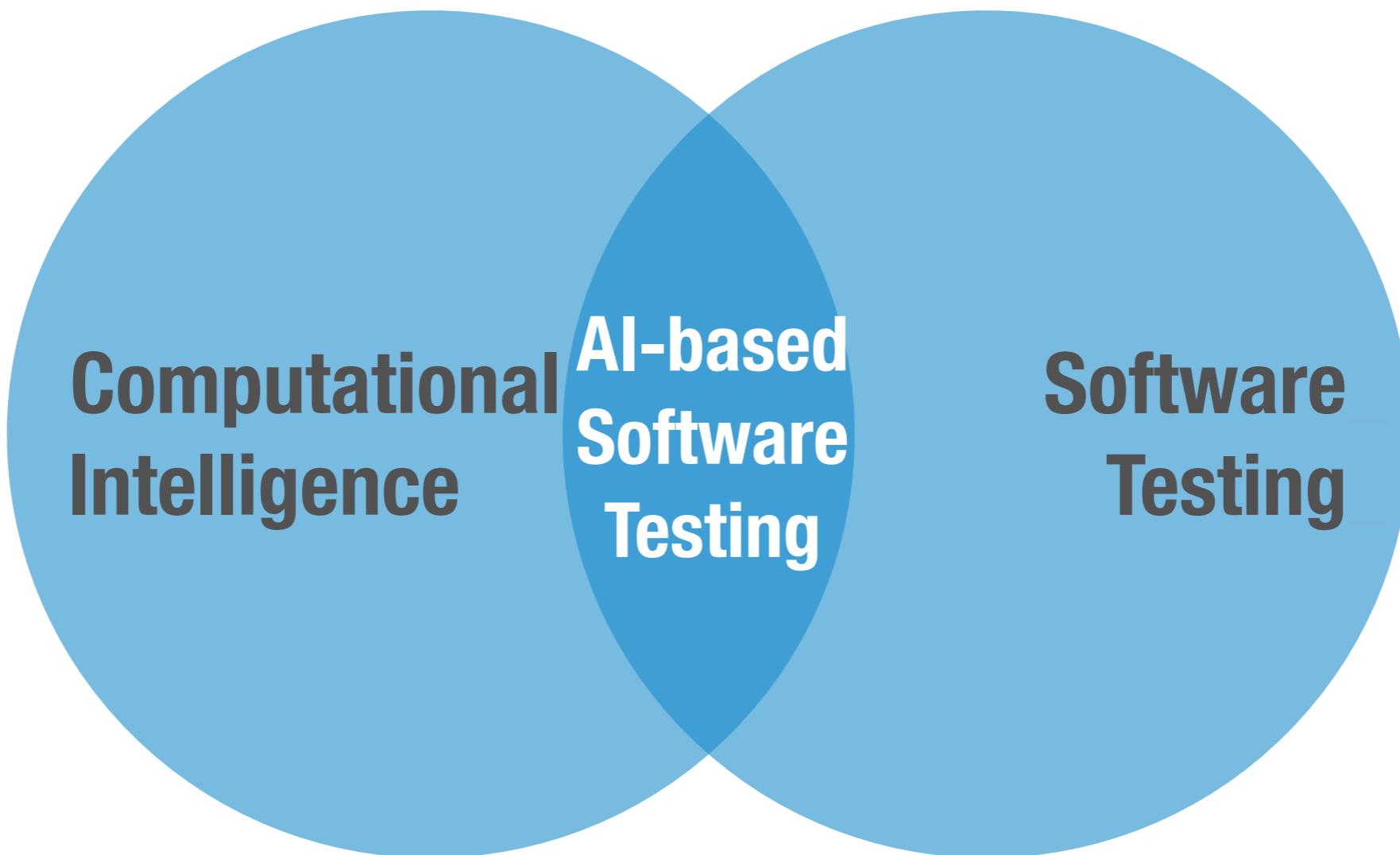
- Testing Challenges in the Cloud
- Automated Testing (**SBST**)
- Cloud-based testing demonstration

3) Future Work

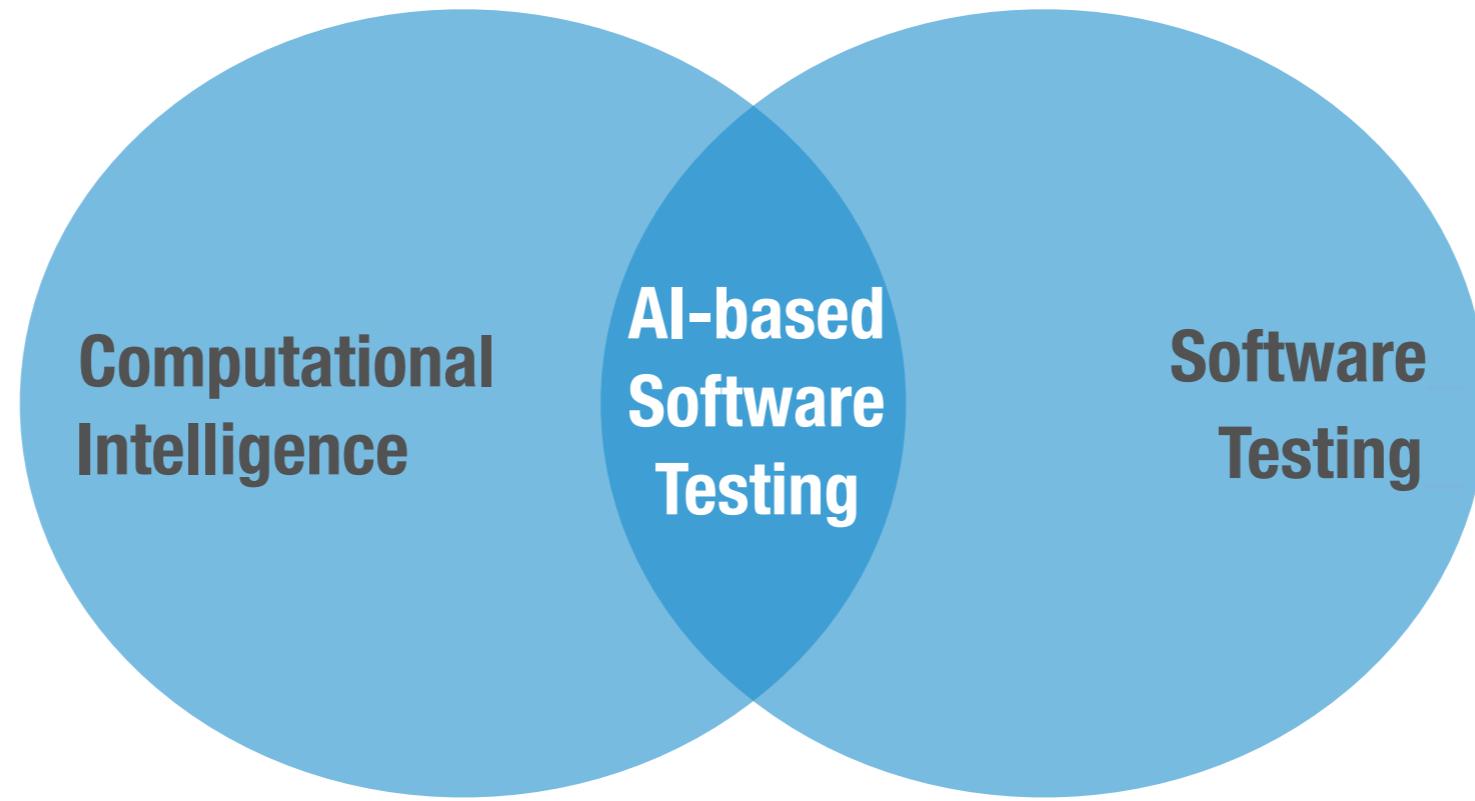
Search-Based Software Testing

=

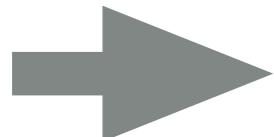
Automated Testing



Search-Based Software Testing



[Domingos2015 “The Master Algorithm”]



Tribe	Origin	Master Algorithm
Symbolists	Logic, philosophy	Inverse deduction
Connectionists	Neuroscience	Back-Propagation
Evolutionaries	Evolutionary biology	Evolutionary Algorithms
Bayesian	Statistics	Probabilistic inference
Analogizers	Psychology	Kernel machines

Genetic
Algorithms

Why SBST?

Project = Apache commons BCEL
Class = Pass2Verifier.java

```
1  /*
2   * Licensed to the Apache Software Foundation (ASF) under one or more
3   * contributor license agreements. See the NOTICE file distributed with
4   * this work for additional information regarding copyright ownership.
5   * The ASF licenses this file to You under the Apache License, Version 2.0
6   * (the "License"); you may not use this file except in compliance with
7   * the License. You may obtain a copy of the License at
8   *
9   *      http://www.apache.org/licenses/LICENSE-2.0
10  *
11  * Unless required by applicable law or agreed to in writing, software
12  * distributed under the License is distributed on an "AS IS" BASIS,
13  * WITHOUT WARRANTIES OR CONDITIONS OF ANY KIND, either express or implied.
14  * See the License for the specific language governing permissions and
15  * limitations under the License.
16  *
17  */
18 package org.apache.bcel.verifier.statics;
19
20
21 import java.util.HashMap;
22 import java.util.HashSet;
23 import java.util.Locale;
24 import java.util.Map;
25 import java.util.Set;
26
27 import org.apache.bcel.Const;
28 import org.apache.bcel.Constants;
29 import org.apache.bcel.Repository;
30 import org.apache.bcel.classfile.Attribute;
31 import org.apache.bcel.classfile.ClassFormatException;
32 import org.apache.bcel.classfile.Code;
33 import org.apache.bcel.classfile.CodeException;
34 import org.apache.bcel.classfile.Constant;
35 import org.apache.bcel.classfile.ConstantClass;
36 import org.apache.bcel.classfile.ConstantDouble;
```

IMPACT: The Sapienz Project at Facebook

<https://arstechnica.com/information-technology/2017/08/facebook-dynamic-analysis-software-sapienz/>

The screenshot shows the Ars Technica website. At the top, there is a navigation bar with categories: BIZ & IT (highlighted in orange), TECH, SCIENCE, POLICY, CARS, GAMING & CULTURE, FORUMS, SUBSCRIPTIONS, a search icon, a menu icon, and a SIGN IN link. Below the navigation bar, the main headline reads "Facebook's evolutionary search for crashing software bugs". A sub-headline below it says "Ars gets the first look at Facebook's fancy new dynamic analysis tool." The author is listed as SEBASTIAN ANTHONY - 8/22/2017, 4:26 PM. The article preview features a blue-toned image of server racks and contains the following text:
Engineering manager
Mark Harman
wins 2019 IEEE Harlan D. Mills
award <https://code.fb.com/developer-tools/mark-harman-harlan-d-mills-award/>

On the right side of the article, there are several social media sharing icons: Instagram, Facebook, WhatsApp, Dropbox, Twitter, Pokémon Go, and Clash of Clans.

What You Can Do?

Class Under Test (CUT)

```
class Triangle {  
    int a, b, c; //sides  
    String type = "NOT_TRIANGLE";  
  
    Triangle (int a, int b, int c){...}  
  
    void computeTriangleType() {  
        1. if (a == b) {  
        2.     if (b == c)  
        3.         type = "EQUILATERAL";  
        4.     else  
        5.         type = "ISOSCELES";  
        } else {  
        5.     if (a == c) {  
        6.         type = "ISOSCELES";  
        } else {  
        7.             if (b == c)  
        8.                 type = "ISOSCELES";  
        9.             else  
        10.                type = "SCALENE";  
        }  
    }  
}
```

Test Case

```
@Test  
public void test(){  
    // Constructor (init)  
    // Method Calls  
    // Assertions (check)  
}
```



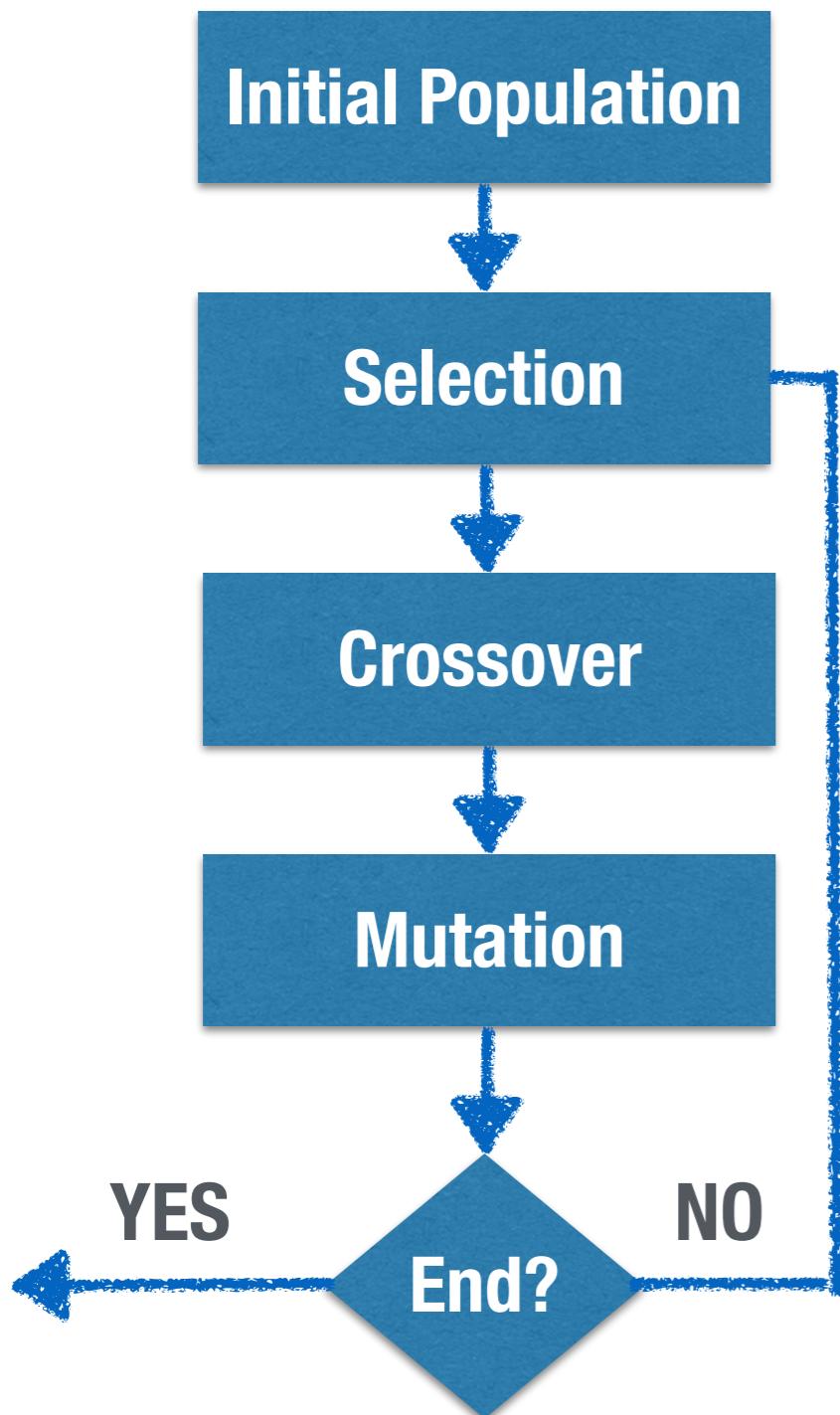
```
@Test  
public void test(){  
    Triangle t = new Triangle (1,2,3);  
    t.computeTriangleType();  
    String type = t.getType();  
    assertTrue(type.equals("SCALENE"));  
}
```

How Does It Works?

Infinite Test Space



How Does It Works?



Genetic Algorithms

Natural selection: Individuals that best fit the natural environment survive (worst die)

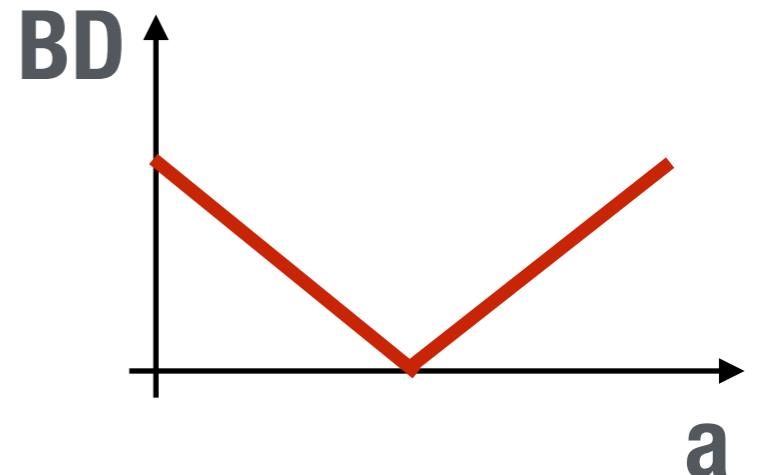
Reproduction: survived individuals generate offspring (next generation)

Mutation: offspring inherits properties of the parents (with some mutations)

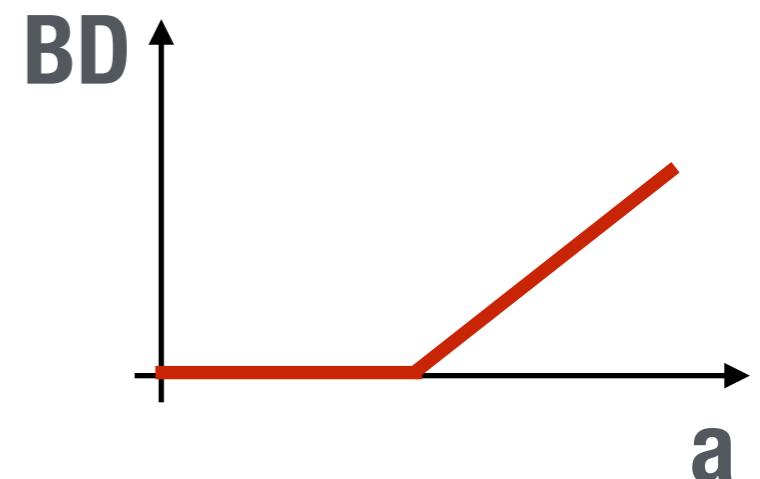
Iteration: generation by generation, the new offspring fits better the environment than their parents

Branch Distance

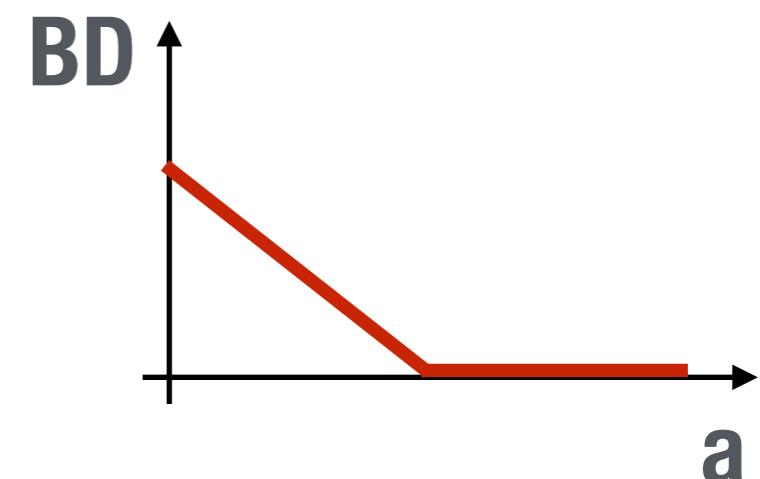
If ($a == b$) \rightarrow $\text{abs}(a-b)$



If ($a \leq b$) \rightarrow $0 \quad \text{if } a \leq b$
 $\text{abs}(a-b) \text{ otherwise}$



If ($a \geq b$) \rightarrow $0 \quad \text{if } a \geq b$
 $\text{abs}(a-b) \text{ otherwise}$

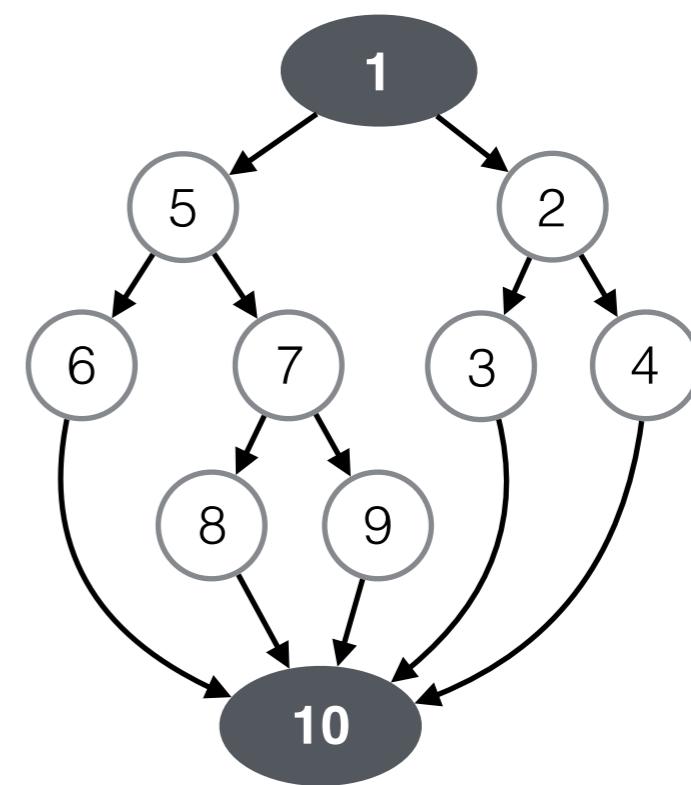


SBST

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    int a, b, c; //sides  
    String type = "NOT_TRIANGLE";  
  
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    void computeTriangleType() {  
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        2.     if (b == c)  
            3.         type = "EQUILATERAL";  
        else  
            4.             type = "ISOSCELES";  
        } else {  
            5. if (a == c) {  
            6.             type = "ISOSCELES";  
            } else {  
                7. if (b == c)  
                    8.                 type = "ISOSCELES";  
                else  
                    9.                     type = "SCALENE";  
            }  
        }  
    }  
}
```

Control Flow Graph

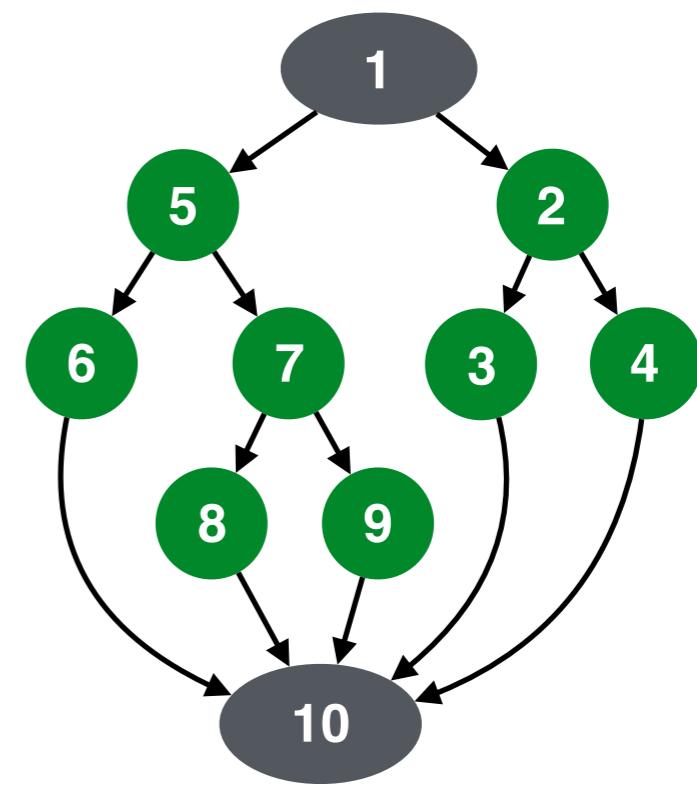


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```
class Triangle {  
    int a, b, c; //sides  
    String type = "NOT_TRIANGLE";  
  
    Triangle (int a, int b, int c){...}  
  
    void computeTriangleType() {  
        1. if (a == b) {  
        2.     if (b == c)  
            type = "EQUILATERAL";  
        else  
            type = "ISOSCELES";  
        } else {  
            if (a == c) {  
                type = "ISOSCELES";  
            } else {  
                if (b == c)  
                    type = "ISOSCELES";  
                else  
                    type = "SCALENE";  
            }  
        }  
    }  
}
```

Control Flow Graph



Goal: Covering as many code elements as possible

How Much to Test?

Statement coverage

Targets = {1, 2, 3, 4, 5, 6, 7, 8, 9, 10}

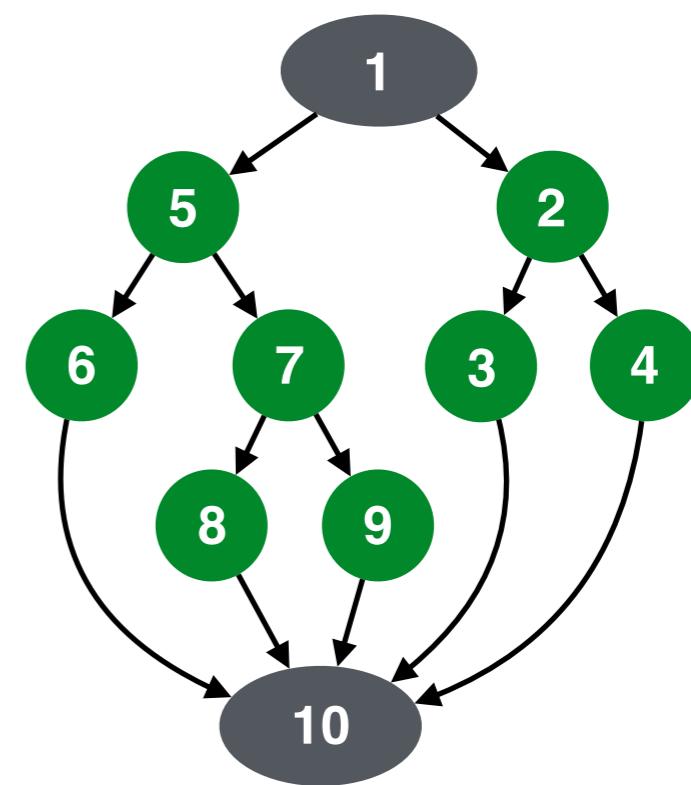
Branch coverage

Targets = {<1,5>, <1,2>, <5,6>, <5,7>, <2,3>, <2,4>, <6,10>, <7,8>, <7,9>, <3,10>, <4,10>, <8,10>, <9,10>}

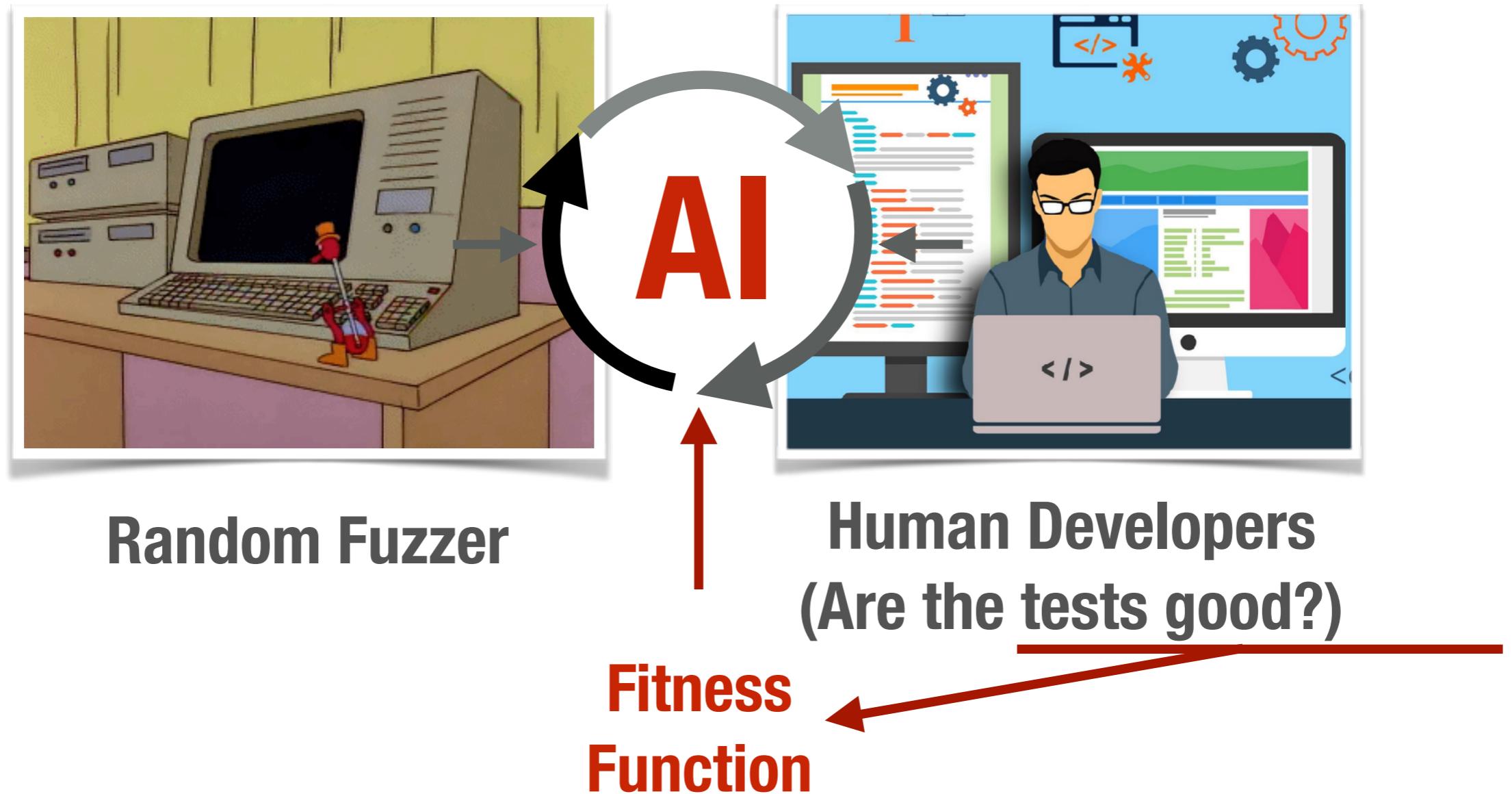
Path coverage

Targets = {<1,5,6,10>, <1,5,7,8,10>, <1,5,7,9,10>, <1,2,3,10>, <1,2,4,10>}

Control Flow Graph



Automated Test Design and Execution



Running Example

```
class Triangle {  
    private double side1, side2, side3;  
    private String type = "NOT_A_TRIANGLE";  
  
    public Triangle (double a, double b, double c){...}  
    private void checkRightAngle() {...}  
    public void computeTriangleType() {...}  
    private boolean isTriangle() {...}  
}
```

Running Example

```
class Triangle {  
    int a, b, c; //sides  
    int type = NOT_A_TRIANGLE;  
  
    Triangle (int a, int b, int c){...}  
    void checkRightAngle() {...}  
    void computeTriangleType() {...}  
    boolean isTriangle() {...}  
    public static void main (String args[ ]) {...}  
}
```



Class under test

Initial Test Cases

```
@Test  
public void test(){  
    Triangle c = new Triangle(8.0, 2.1, 5.0);  
    c.computeTriangleType();  
    assertTrue(c.isTriangle());  
}
```

```
@Test  
public void test(){  
    Triangle c = new Triangle(1.0, 2.1, 4.2);  
    c.computeTriangleType();  
    assertTrue(c.getTriangleType() == ...);  
}
```

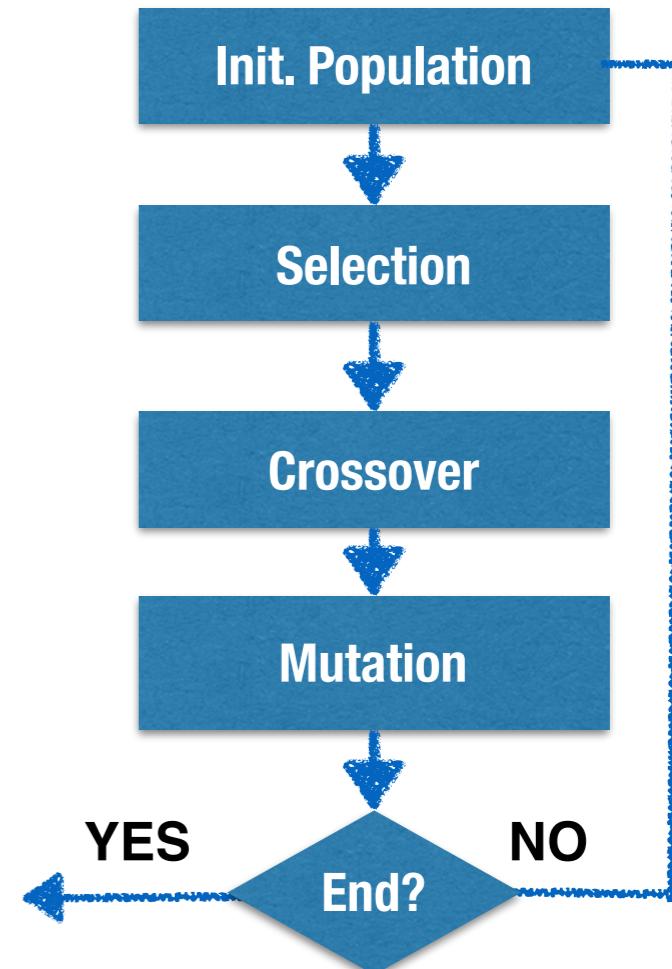
```
@Test  
public void test(){  
    Triangle c = new Triangle(1.0, -2.1, 4.2);  
    c.computeTriangleType();  
    assertTrue(c.getTriangleType() == ...);  
}
```

```
@Test  
public void test(){  
    Triangle c = new Triangle(-2.0, 12.0, 0);  
    c.computeTriangleType();  
    assertTrue(c.getTriangleType() == ...);  
}
```

Iterating (generations)

```
class Triangle {  
  
    void computeTriangleType() {  
1.        if (isTriangle()) {  
2.            if (side1 == side2) {  
3.                if (side2 == side3)  
4.                    type = "EQUILATERAL";  
5.                else  
6.                    type = "ISOSCELES";  
7.            } else {  
8.                if (side1 == side3) {  
9.                    type = "ISOSCELES";  
10.                } else {  
11.                    if (side2 == side3)  
12.                        type = "ISOSCELES";  
13.                    else  
14.                        checkRightAngle();  
15.                }  
16.            }  
17.        } // if isTriangle()  
18.    }  
19.}
```

Target



Branch Distance

Branch distance($P(x)$, t)

Given the first control node where the execution diverges from the target t, the predicate at such node is converted to a distance (from taking the desired branch), normalised between 0 and 1.

Such a distance measures how fare the test case is from taking the desired branch. For boolean and numerical variables a, b:

Condition $c = \text{atomic predicate}$	Distance $BD(c) = d / (d + 1)$
a	$d = \{0 \text{ if } a == \text{true}; K \text{ otherwise}\}$
!a	$d = \{K \text{ if } a == \text{true}; 0 \text{ otherwise}\}$
$a == b$	$d = \{0 \text{ if } a == b; \text{abs}(a - b) + K \text{ otherwise}\}$
$a != b$	$d = \{0 \text{ if } a != b; K \text{ otherwise}\}$
$a < b$	$d = \{0 \text{ if } a < b; a - b + K \text{ otherwise}\}$
$a \leq b$	$d = \{0 \text{ if } a \leq b; a - b + K \text{ otherwise}\}$
$a > b$	$d = \{0 \text{ if } a > b; b - a + K \text{ otherwise}\}$
$a \geq b$	$d = \{0 \text{ if } a \geq b; b - a + K \text{ otherwise}\}$

Branch Distance for Strings

Branch distance($P(x)$, t)

For string variables a and b , the branch distance is computed using the following rules:

Condition $c = \text{atomic predicate}$	Distance $BD(c) = d / (d + 1)$
$a == b$	$d = \{0 \text{ if } a == b; \text{edit_dist}(a, b) + K \text{ otherwise}\}$
$a != b$	$d = \{0 \text{ if } a != b; K \text{ otherwise}\}$
$a < b$	$d = \{0 \text{ if } a < b; a[j] - b[j] + K \text{ otherwise}\}$
$a <= b$	$d = \{0 \text{ if } a <= b; a[j] - b[j] + K \text{ otherwise}\}$
$a > b$	$d = \{0 \text{ if } a > b; b[j] - a[j] + K \text{ otherwise}\}$
$a >= b$	$d = \{0 \text{ if } a >= b; b[j] - a[j] + K \text{ otherwise}\}$

Example of edit distance: **edit_dist("abcd", "abbb**

Branch Distance

Branch distance rules for composite predicate

Condition $c = \text{composite predicate}$	Distance $BD(c) = d / (d + 1)$
$\neg p$	Negation is propagated inside p
$p \wedge q$	$d = d(p) + d(q)$
$p \vee q$	$d = \min(d(p), d(q))$
$p \oplus q = p \wedge \neg q \vee \neg p \wedge q$	$d = \min(d(p)+d(\neg q), d(\neg p)+d(q))$

How to normalise the branch distance?

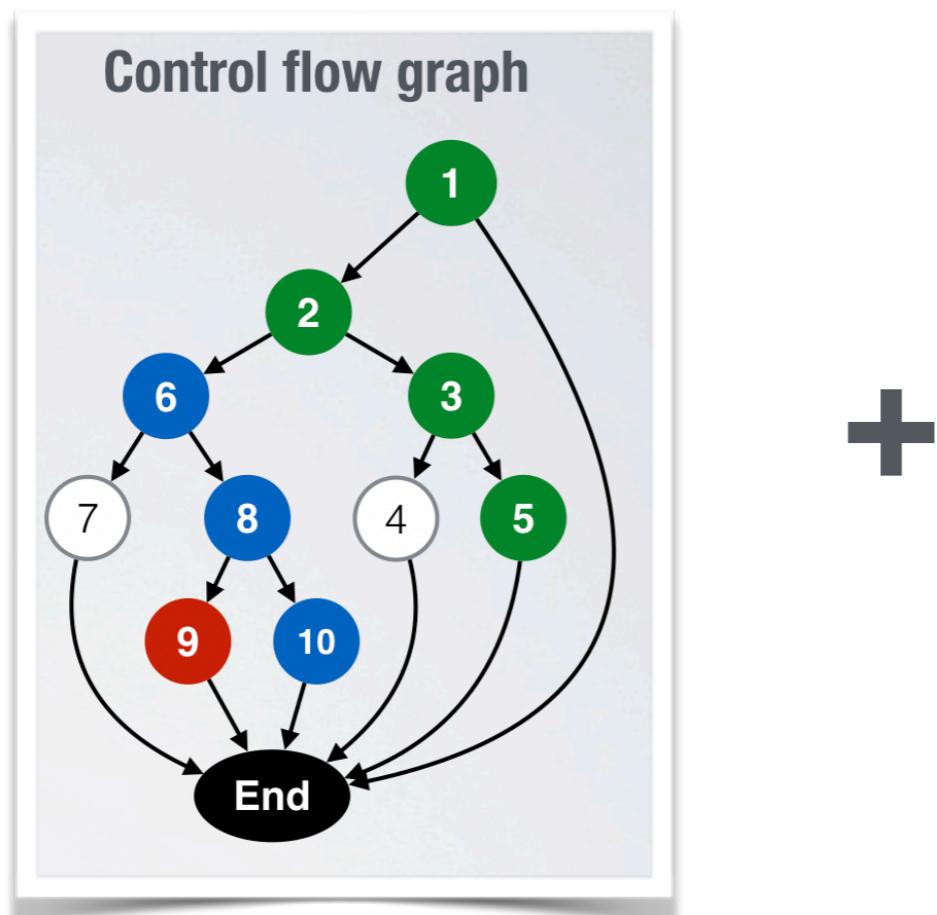
$$\text{branch_distance}(t) = \mathbf{d}/(d+1)$$

where **d** is computed according to the distance rules reported in the previous tables

Fitness Function

For statement (or branch) coverage, given a specific coverage target t , a widely used fitness function (to be minimised) is:

$$f(x) = \text{approach_level}(P(x), t) + \text{branch_distance}(P(x), t)$$



+

Fitness Function

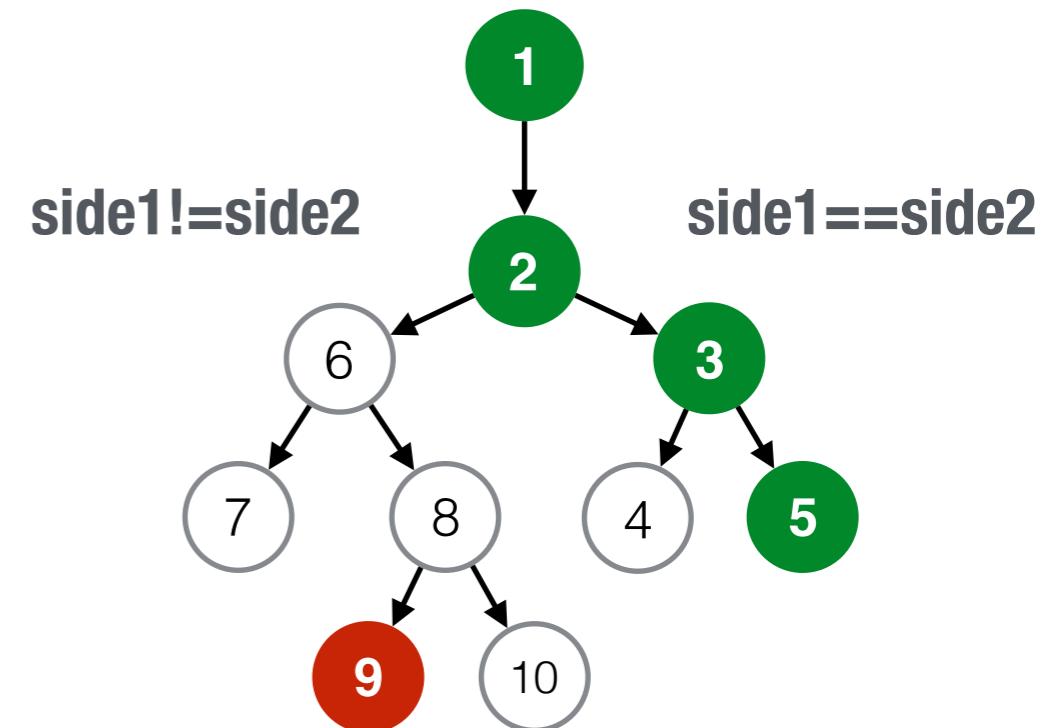
```

class Triangle {

    void computeTriangleType() {
1. if (isTriangle()){
2.     if (side1 == side2) {
3.         if (side2 == side3)
4.             type = "EQUILATERAL";
5.         else
6.             type = "ISOSCELES";
7.     } else {
8.         if (side1 == side3) {
9.             type = "ISOSCELES";
10.        } else
11.            if (side2 == side3)
12.                type = "ISOSCELES";
13.            else
14.                checkRightAngle();
15.        }
16.    }
17. } // if isTriangle()
}

```

Target



$$d(2 \neq 2) = 1$$

$$BD(2 \neq 2) = 1 / (1+1) = 0.5$$

$$f(x_1) = 2 + 0.5 = 2.5$$

$$x_1 = (2, 2, 3)$$

$$\text{Path}(x_1) = <1, 2, 3, 5>$$

$$AL=2 \quad f = 2.5$$

$$x_2 = (2, 3, 5)$$

$$\text{Path}(x_2) = <1, 2, 6, 8, 10>$$

$$AL=0$$

$$x_3 = (1, 2, 10)$$

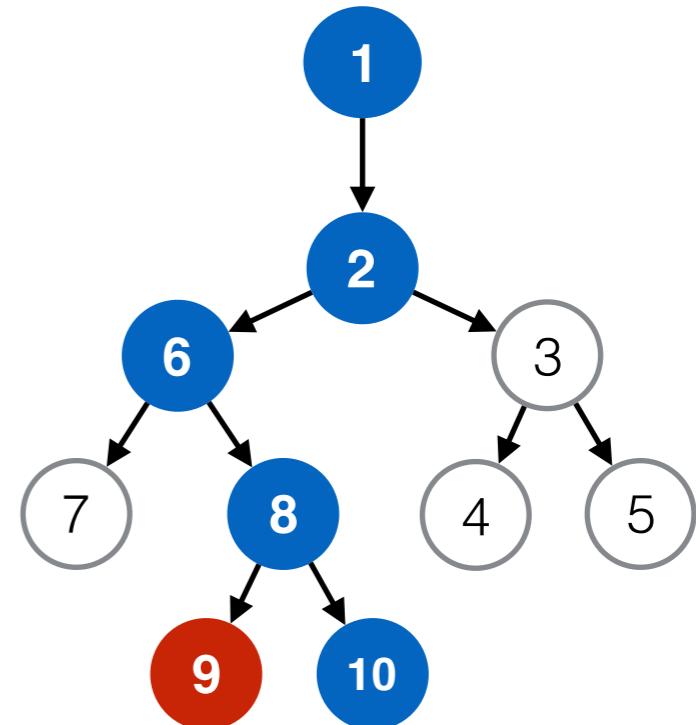
$$\text{Path}(x_3) = <1, 2, 6, 8, 10>$$

$$AL=0$$

Fitness Function

```
class Triangle {  
  
    void computeTriangleType() {  
1.        if (isTriangle()) {  
2.            if (side1 == side2) {  
3.                if (side2 == side3)  
4.                    type = "EQUILATERAL";  
5.                else  
6.                    type = "ISOSCELES";  
7.            } else {  
8.                if (side1 == side3) {  
9.                    type = "ISOSCELES";  
10.                } else {  
11.                    if (side2 == side3)  
12.                        type = "ISOSCELES";  
13.                    else  
14.                        checkRightAngle();  
15.                }  
16.            } // if isTriangle()  
17.        }  
18.    } // if isTriangle()  
19.}
```

Target



$$d(3 == 5) = \text{abs}(3-5) = 2$$

$$BD(3 == 5) = 2 / (2+1) = 0.66$$

$$f(\text{Ch1}) = 0 + 0.66 = 0.66$$

$$x_1 = (2, 2, 3)$$

$$\text{Path}(x_1) = <1, 2, 3, 5>$$

$$\text{AL}=2 \quad f = 2.5$$

$$x_2 = (2, 3, 5)$$

$$\text{Path}(x_2) = <1, 2, 6, 8, 10>$$

$$\text{AL}=0 \quad f = 0.66$$

$$x_3 = (1, 2, 10)$$

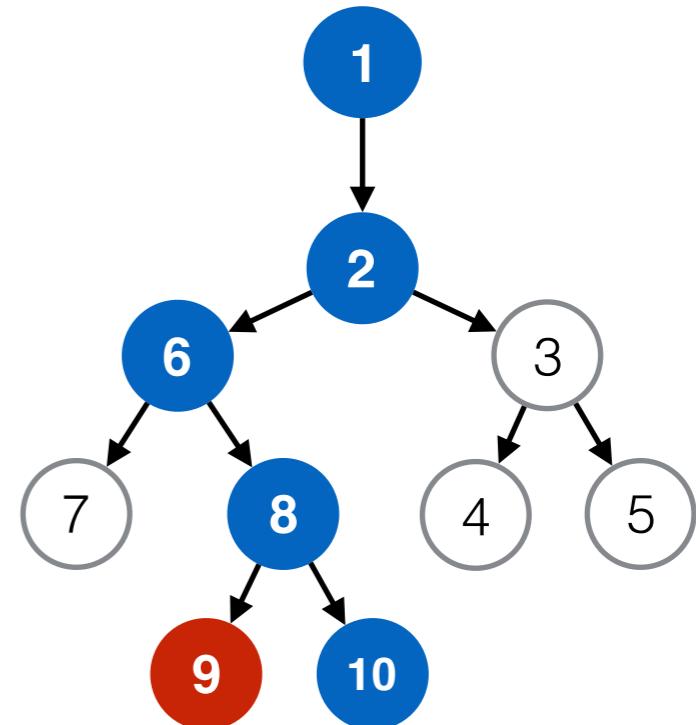
$$\text{Path}(x_3) = <1, 2, 6, 8, 10>$$

$$\text{AL}=0$$

Fitness Function

```
class Triangle {  
  
    void computeTriangleType() {  
1.        if (isTriangle()) {  
2.            if (side1 == side2) {  
3.                if (side2 == side3)  
4.                    type = "EQUILATERAL";  
5.                else  
6.                    type = "ISOSCELES";  
7.            } else {  
8.                if (side1 == side3) {  
9.                    type = "ISOSCELES";  
10.                } else {  
11.                    if (side2 == side3)  
12.                        type = "ISOSCELES";  
13.                    else  
14.                        checkRightAngle();  
15.                }  
16.            } // if isTriangle()  
17.        }  
18.    } // computeTriangleType()  
19.}
```

Target



$$d(3 == 5) = \text{abs}(3-5) = 2$$

$$BD(3 == 5) = 2 / (2+1) = 0.66$$

$$f(\text{Ch1}) = 0 + 0.66 = 0.66$$

$$x_1 = (2, 2, 3)$$

$$\text{Path}(x_1) = <1, 2, 3, 5>$$

$$\text{AL}=2 \quad f = 2.5$$

$$x_2 = (2, 3, 5)$$

$$\text{Path}(x_2) = <1, 2, 6, 8, 10>$$

$$\text{AL}=0 \quad f = 0.66$$

$$x_3 = (1, 2, 10)$$

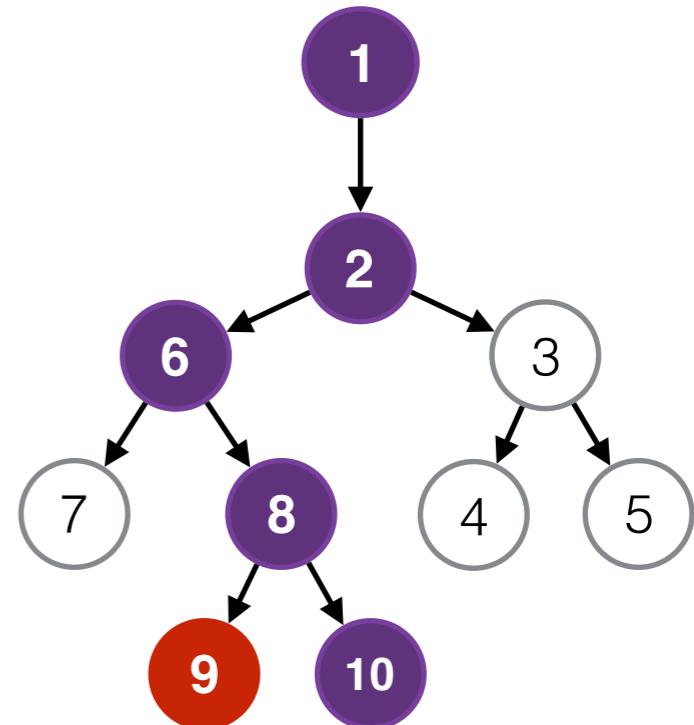
$$\text{Path}(x_3) = <1, 2, 6, 8, 10>$$

$$\text{AL}=0 \quad f = ?$$

Fitness Function

```
class Triangle {  
  
    void computeTriangleType() {  
1.        if (isTriangle()) {  
2.            if (side1 == side2) {  
3.                if (side2 == side3)  
4.                    type = "EQUILATERAL";  
5.                else  
6.                    type = "ISOSCELES";  
7.            } else {  
8.                if (side1 == side3) {  
9.                    type = "ISOSCELES";  
10.                } else {  
11.                    if (side2 == side3)  
12.                        type = "ISOSCELES";  
13.                    else  
14.                        checkRightAngle();  
15.                }  
16.            } // if isTriangle()  
17.        }  
18.    } // computeTriangleType()  
19.}
```

Target



$$d(2 == 10) = \text{abs}(2-10) = 8$$

$$BD(2 == 10) = 8 / (8+1) = 0.89$$

$$f(x_3) = 0 + 0.89 = 0.89$$

$$x_1 = (2, 2, 3)$$

$$\text{Path}(x_1) = <1, 2, 3, 5>$$

$$AL=2 \quad f = 2.5$$

$$x_2 = (2, 3, 5)$$

$$\text{Path}(x_2) = <1, 2, 6, 8, 10>$$

$$AL=0 \quad f = 0.66$$

$$x_3 = (1, 2, 10)$$

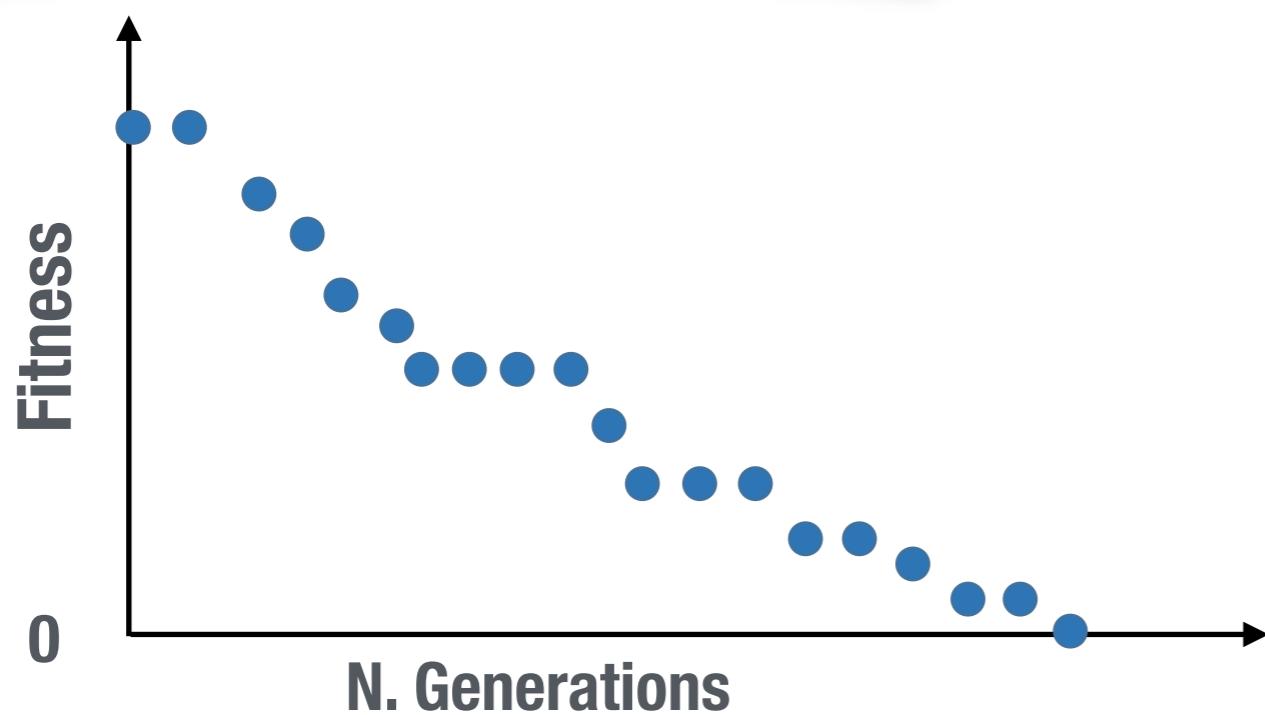
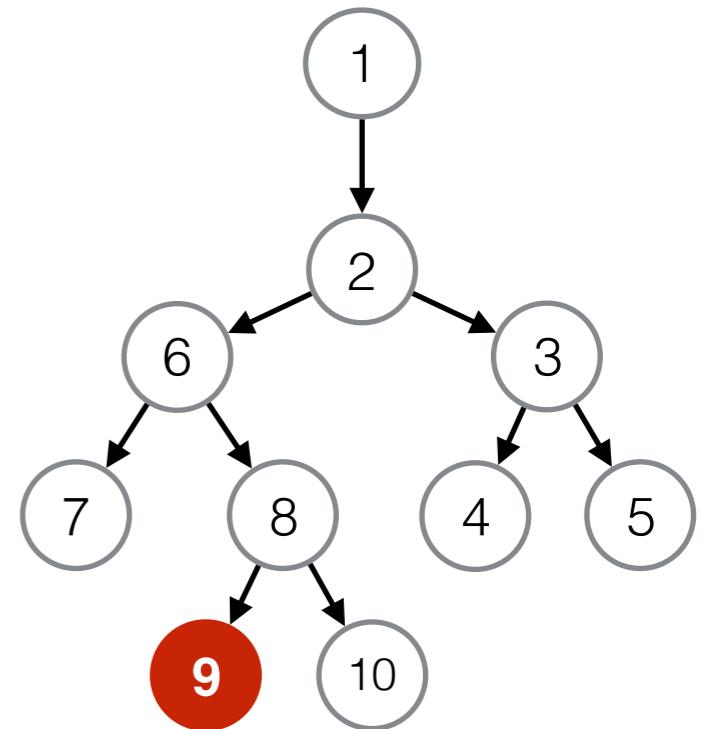
$$\text{Path}(x_3) = <1, 2, 6, 8, 10>$$

$$AL=0 \quad f = 0.89$$

Running Example

```
class Triangle {  
  
void computeTriangleType() {  
    if (isTriangle()) {  
        if (side1 == side2) {  
            if (side2 == side3)  
                type = "EQUILATERAL";  
            else  
                type = "ISOSCELES";  
        } else {  
            if (side1 == side3) {  
                type = "ISOSCELES";  
            } else {  
                if (side2 == side3)  
                    type = "ISOSCELES";  
                else  
                    checkRightAngle();  
            }  
        }  
    } // if isTriangle()  
}
```

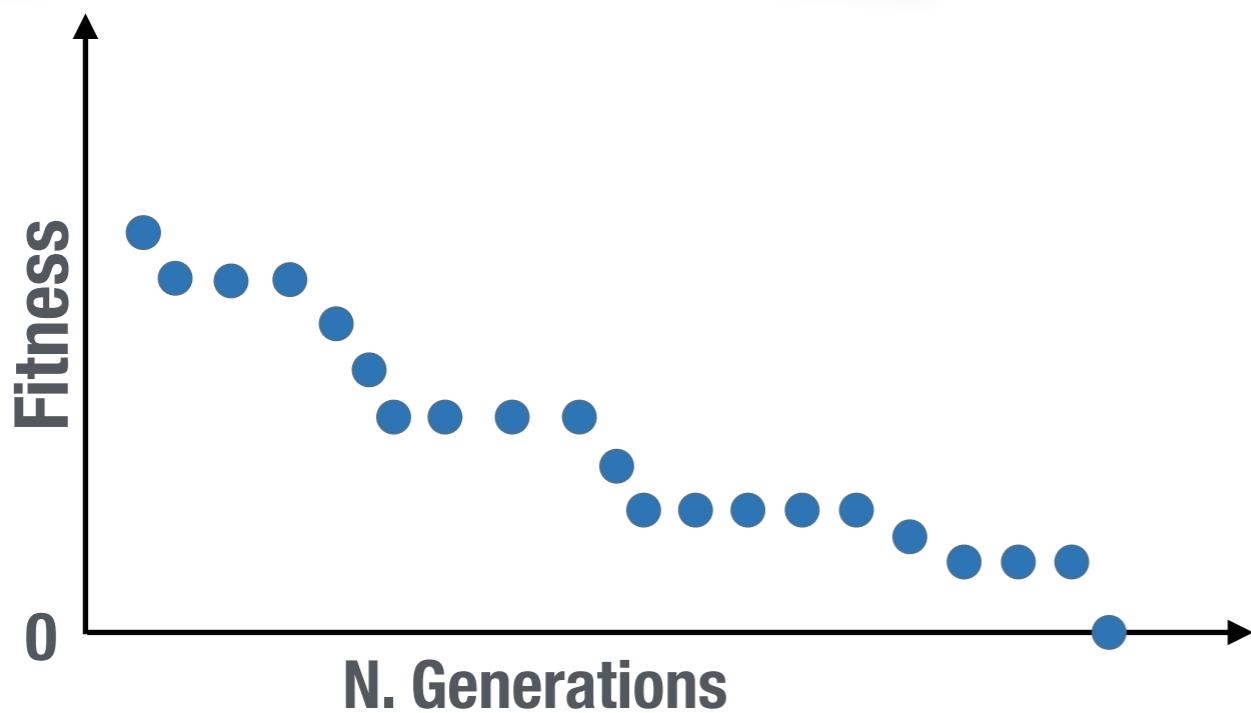
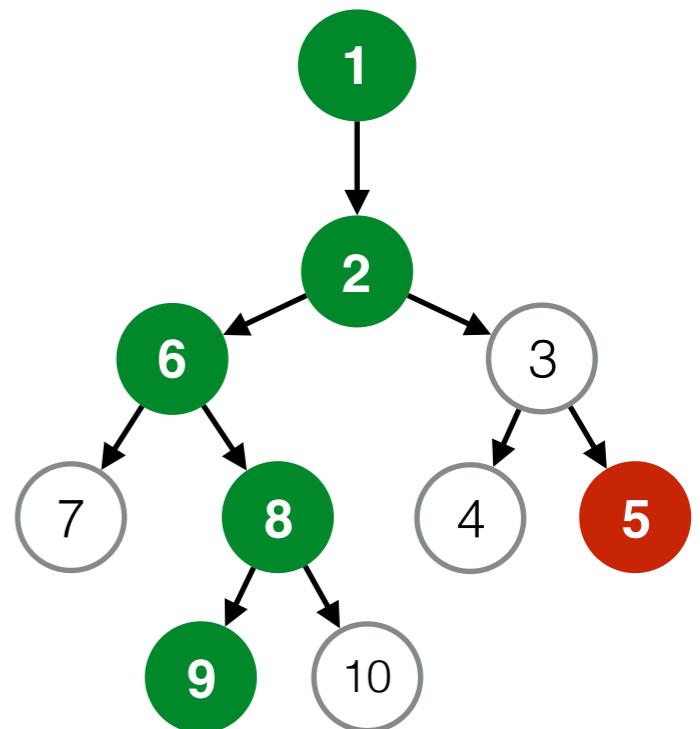
Target



Running Example

```
class Triangle {  
  
    void computeTriangleType() {  
        if (isTriangle()) {  
            if (side1 == side2) {  
                if (side2 == side3)  
                    type = "EQUILATERAL";  
                else  
                    type = "ISOSCELES";  
            } else {  
                if (side1 == side3) {  
                    type = "ISOSCELES";  
                } else {  
                    if (side2 == side3)  
                        type = "ISOSCELES";  
                    else  
                        checkRightAngle();  
                }  
            }  
        } // if isTriangle()  
    }  
}
```

Target

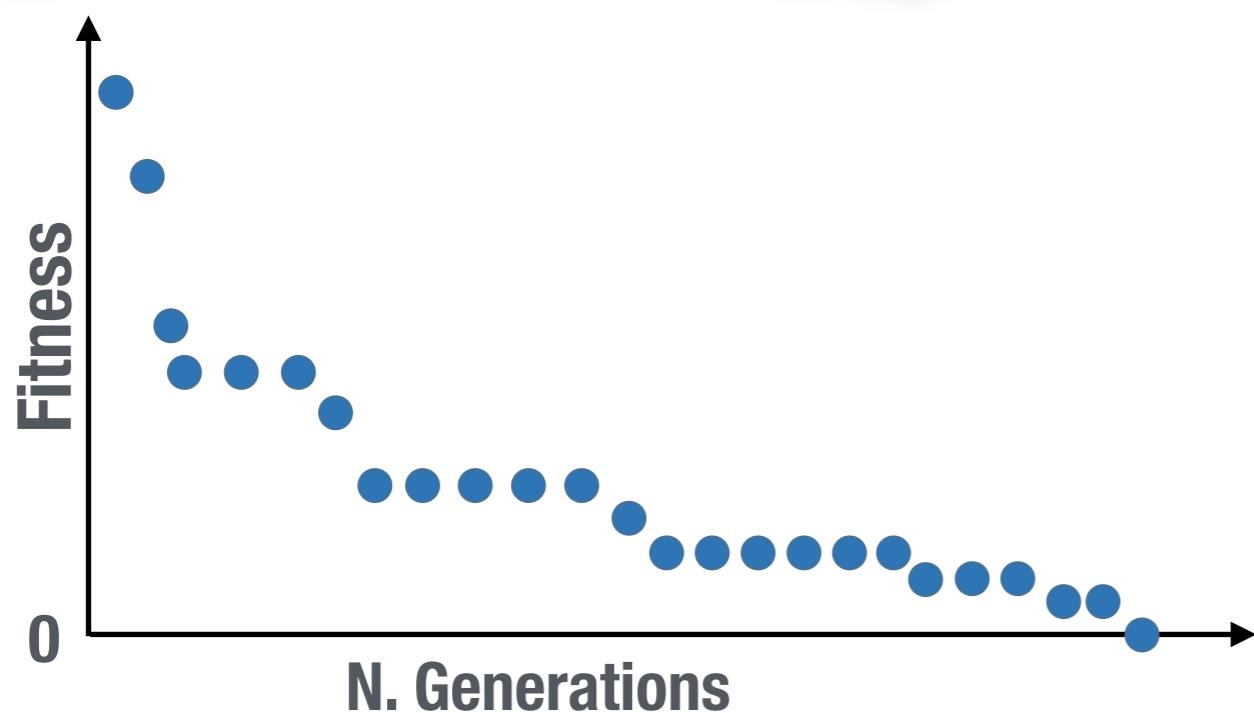
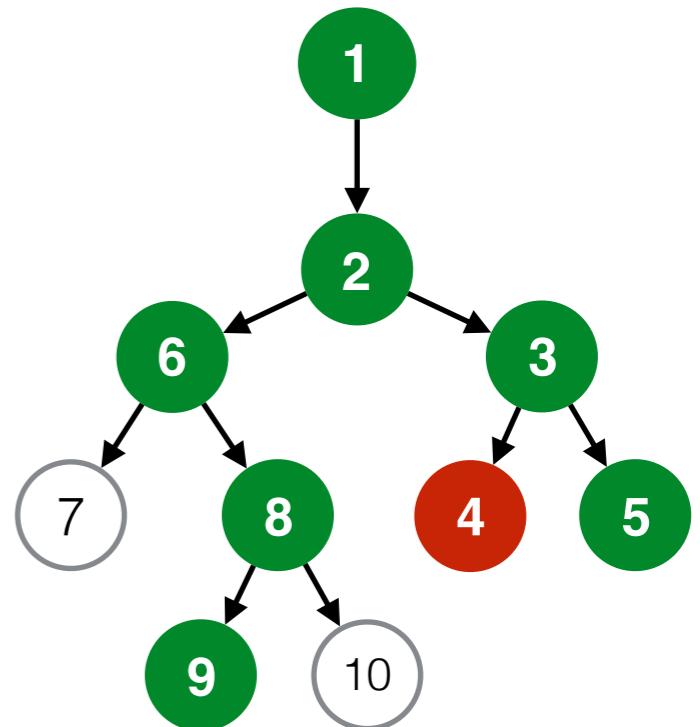


$$\text{TC1} = (4,3,3)$$

Running Example

```
class Triangle {  
  
void computeTriangleType() {  
    if (isTriangle()) {  
        if (side1 == side2) {  
            if (side2 == side3)  
                type = "EQUILATERAL";  
            else  
                type = "ISOSCELES";  
        } else {  
            if (side1 == side3) {  
                type = "ISOSCELES";  
            } else {  
                if (side2 == side3)  
                    type = "ISOSCELES";  
                else  
                    checkRightAngle();  
            }  
        }  
    } // if isTriangle()  
}  
}
```

Target

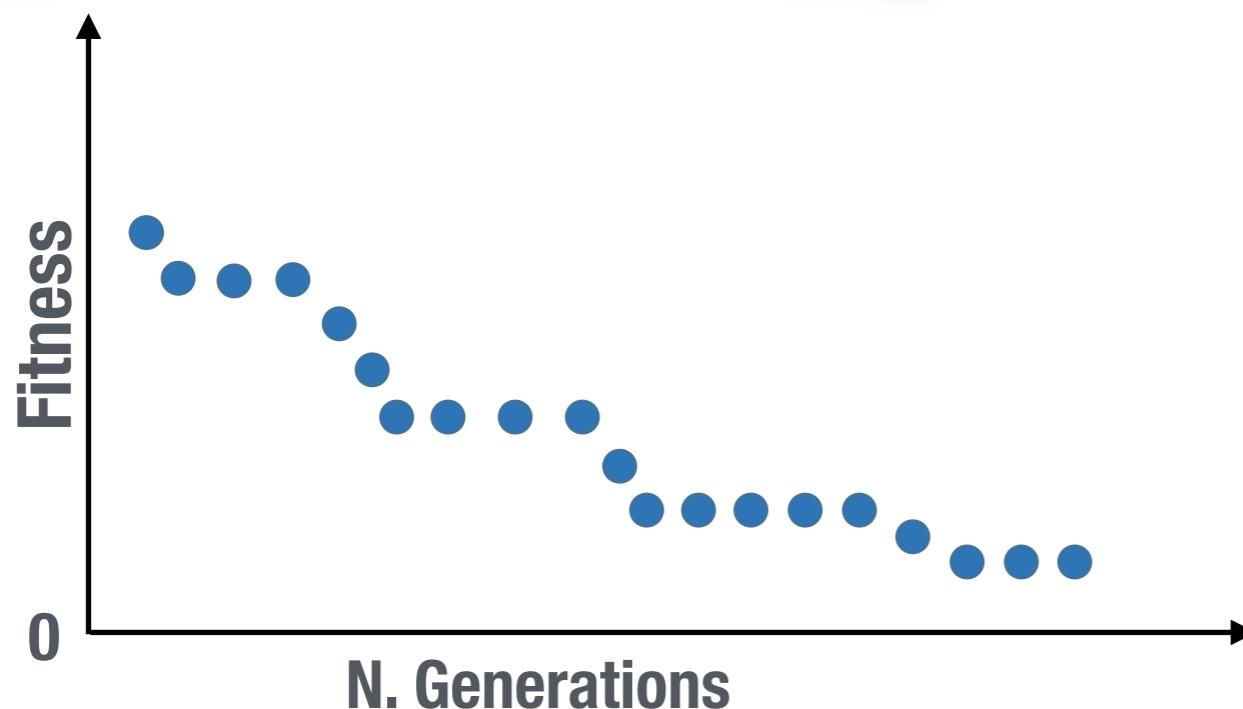
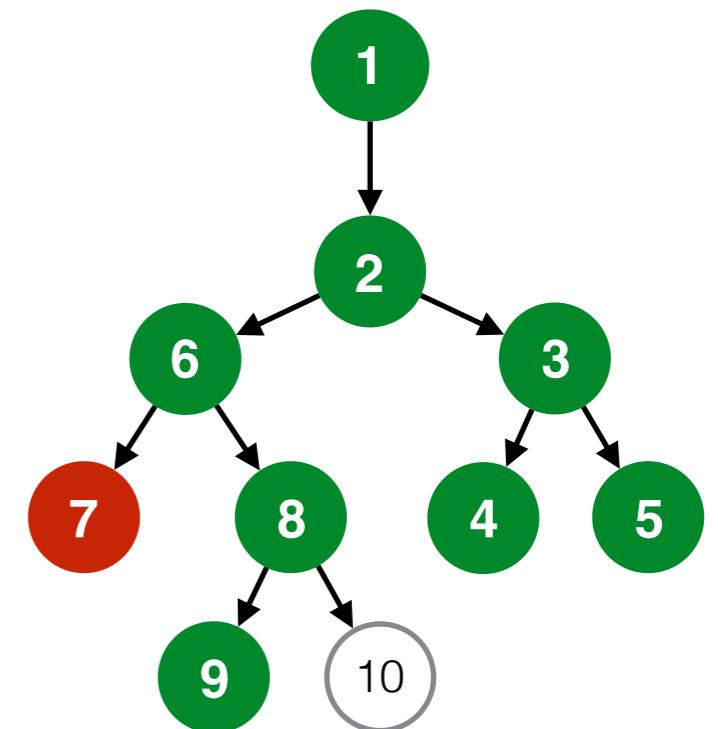


$$\begin{aligned} \mathbf{TC1} &= (4, 3, 3) \\ \mathbf{TC2} &= (2, 2, 4) \end{aligned}$$

Running example

```
class Triangle {  
  
void computeTriangleType() {  
    if (isTriangle()) {  
        if (side1 == side2) {  
            if (side2 == side3)  
                type = "EQUILATERAL";  
            else  
                type = "ISOSCELES";  
        } else {  
            if (side1 == side3) {  
                type = "ISOSCELES";  
            } else {  
                if (side2 == side3)  
                    type = "ISOSCELES";  
                else  
                    checkRightAngle();  
            }  
        }  
    } // if isTriangle()  
}
```

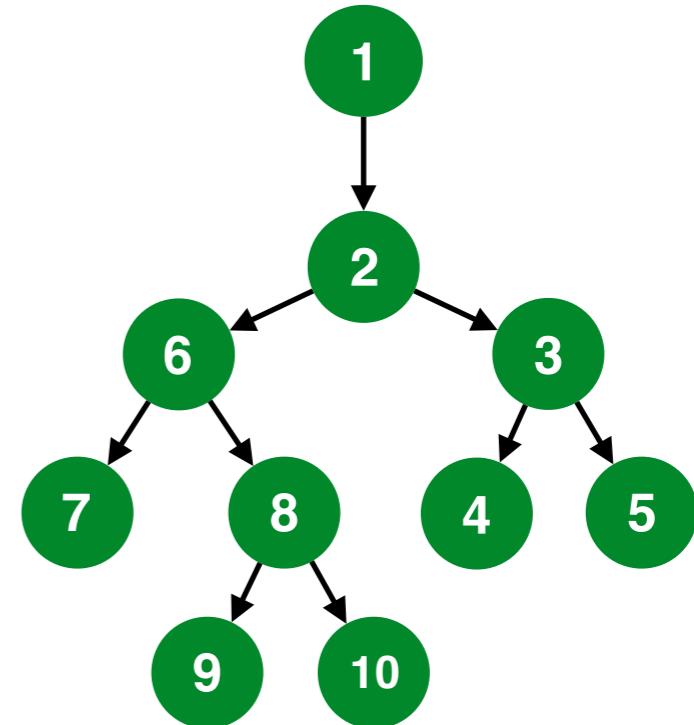
Target



$$\begin{aligned} \text{TC1} &= (4, 3, 3) \\ \text{TC2} &= (2, 2, 4) \\ \text{TC2} &= (5, 5, 5) \end{aligned}$$

Running example

```
class Triangle {  
  
    void computeTriangleType() {  
        if (isTriangle()) {  
            if (side1 == side2) {  
                if (side2 == side3)  
                    type = "EQUILATERAL";  
                else  
                    type = "ISOSCELES";  
            } else {  
                if (side1 == side3) {  
                    type = "ISOSCELES";  
                } else {  
                    if (side2 == side3)  
                        type = "ISOSCELES";  
                    else  
                        checkRightAngle();  
                }  
            }  
        } // if isTriangle()  
    }  
}
```



TC1 = (4, 3, 3)
TC2 = (2, 2, 4)
TC3 = (5, 5, 5)
TC4 = (4, 3, 4)
TC5 = (1, 2, 3)

The final test suite consists of all chromosome that have been found to cover (even accidentally) one or more yet to cover statements.

EvoSuite (Unit Testing)

<http://www.evosuite.org>



Automatic Test Suite Generation for Java

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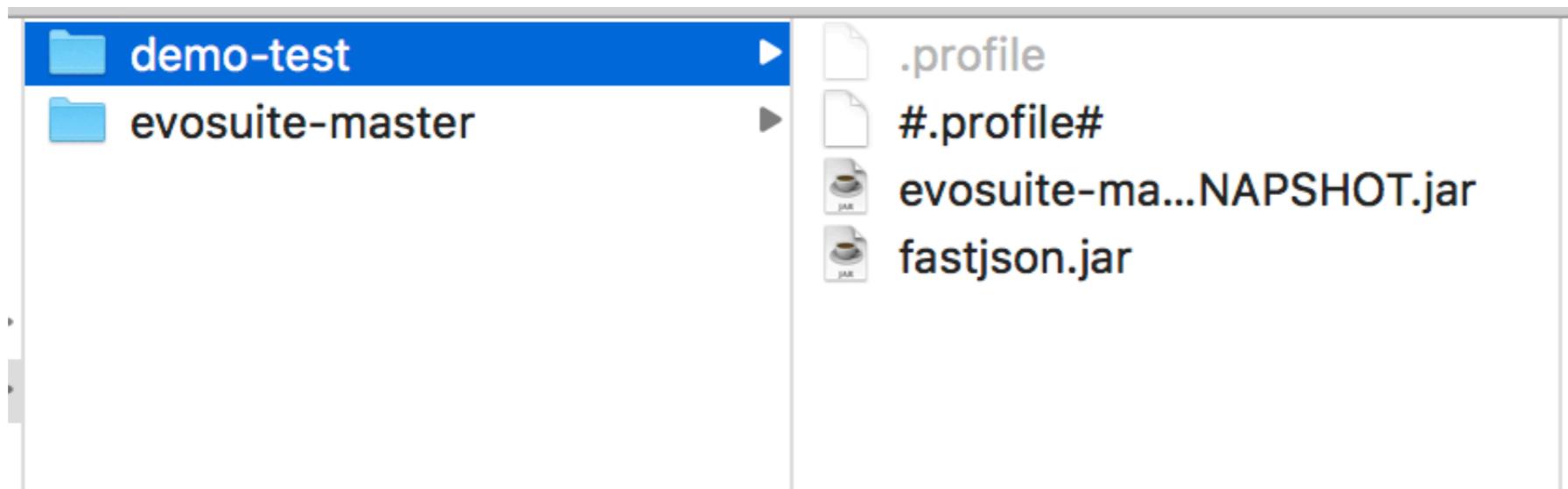


[EvoSuite wins the SBST 2017 tool competition](#)

EvoSuite achieved the overall highest score of all competing tools at the [SBST 2017](#) Unit Testing Tool Competition. For more details read the following paper:

RECENT POSTS

EvoSuite Approach



```
# The execute pDynaMOSA the following command
java -jar evosuite-master-1.0.7-SNAPSHOT.jar -
  generateMSuite -projectCP fastjson.jar -class
    com.alibaba.fastjson.parser.JSONLexerBase -
  Dminimize=FALSE -Dassertions=FALSE -Dsearch_budget=40
  -Dconfiguration_id=Evosuite -Dtest_dir=slow-test
```

Random Testing?



Random Testing

How to generate random tests:

- 1) Pick one of the available constructors
(with random input)**

- 2) Pick one or more public methods
(with random input)**

- 3) Generate the assertions by checking
the final state of the object using get
methods**



Random Testing

Class Under Test API

public ClassUT(...)

...

public ClassUT(...)

public method1(...)

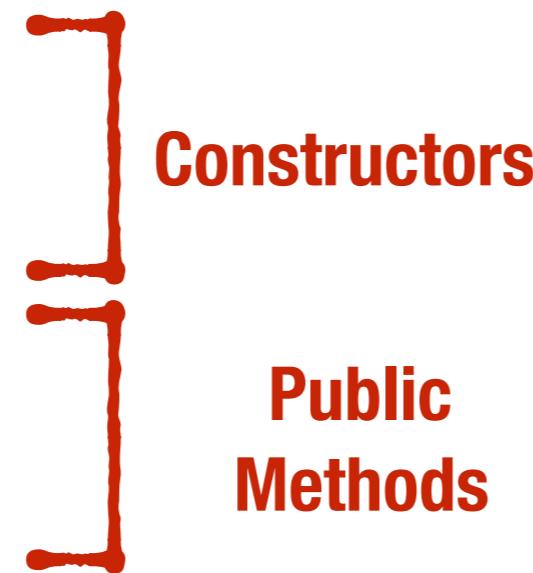
...

public methodK(...)

Random Testing

Class Under Test API

```
public ClassUT(...)  
...  
public ClassUT(...)  
  
public method1(...)  
...  
public methodK(...)
```



Random Test

```
@Test  
public void test(){  
    // constructor  
    // method calls  
    // assertions  
}
```

Random Testing

Class Under Test API

```
public ClassUT(...)  
...  
public ClassUT(...)  
  
public method1(...)  
...  
public methodK(...)
```



**Pick one of
the available
constructors**

**With random
parameters
input**

Random Test

```
@Test  
public void test(){  
    ClassUT c = new ClassUT(.);  
    // method calls  
    // assertions  
}
```

Random Testing

Class Under Test API

```
public ClassUT(...)  
...  
public ClassUT(...)  
  
public method1(...)  
...  
public methodK(...)
```

Pick one or
more public
methods

With random
parameters
input

Random Test

```
@Test  
public void test(){  
    ClassUT c = new ClassUT(.);  
    c.method1(...);  
    c.method3(...);  
    // assertions  
}
```

Random Testing

Class Under Test API

```
public ClassUT(...)  
...  
public ClassUT(...)  
  
public method1(...)  
...  
public methodK(...)
```

**Use get methods
to check the state
of the objects
after execution**

Random Test

```
@Test  
public void test(){  
    ClassUT c = new ClassUT();  
    c.method1(...);  
    c.method3(...);  
    assertTrue(me.method2());  
}
```

Running Example

```
class PeakFunction {  
    private double x, y;  
  
    public PeakFunction (double px, double py){  
        x = px; y = py;  
    }  
  
    public double computeZeta() {  
        double z = 3*Math.pow(1-x,2);  
        z *= Math.exp(- Math.pow(x,2) - Math.pow(y+1,2));  
        z -= 10*(x/5 - Math.pow(x,3));  
        z -= Math.pow(y,5)*Math.exp(-Math.pow(x,2)-Math.pow(x,2));  
        z -= 1/3* Math.exp(-Math.pow(x+1,2) - Math.pow(y,2));  
        return z;  
    }  
  
    public boolean isZero() {  
        if (computeZeta() <= 0.05)  
            return true;  
    }  
}
```



We want to cover
this method

Running Example

PeakFunction API

```
// Public constructors  
PeakFunction(double, double)  
  
// Public methods  
public double computeZeta()  
public boolean isZero()
```

Random Test

```
@Test  
public void test(){  
    // constructor  
    // method calls  
    // assertions  
}
```

Running Example

PeakFunction API

```
// Public constructors  
PeakFunction(double, double)  
  
// Public methods  
public double computeZeta()  
public boolean isZero()
```

Random Test

```
@Test  
public void test(){  
    PeakFunction pf = new PeakFunction(?,?);  
    boolean b = isZero();  
    assertTrue(b); or assertFalse(b);  
}
```

To generate random double in [0;1], we can use the method **Math.random()**

To generate random double in [a;b], we can use the following code:
Math.random() * (a+b) - a

Running Example

PeakFunction API

```
// Public constructors  
PeakFunction(double, double)  
  
// Public methods  
public double computeZeta()  
public boolean isZero()
```

x = 0.8147 , y = 0.9058, z = 2.2346
x = 0.1270 , y = 0.9134, z = 2.6334
x = 0.6324 , y = 0.0975, z = 0.8979
x = 0.2785 , y = 0.5469, z = 0.1855

Random Test1

```
@Test  
public void test(){  
    PeakFunction pf = new PeakFunction(1.4, 2.3);  
    boolean b = isZero(); // zeta = 0.4746  
    assertFalse(b);  
}
```

Random Test2

```
@Test  
public void test(){  
    PeakFunction pf = new PeakFunction(-0.2, 1.5);  
    boolean b = isZero(); // zeta =7.7118  
    assertFalse(b);  
}
```

Running Example

```
class PeakFunction {  
    ...  
    public boolean isZero() {  
        if (computeZeta() <= 0.05)  
            return true;  
    }  
}
```



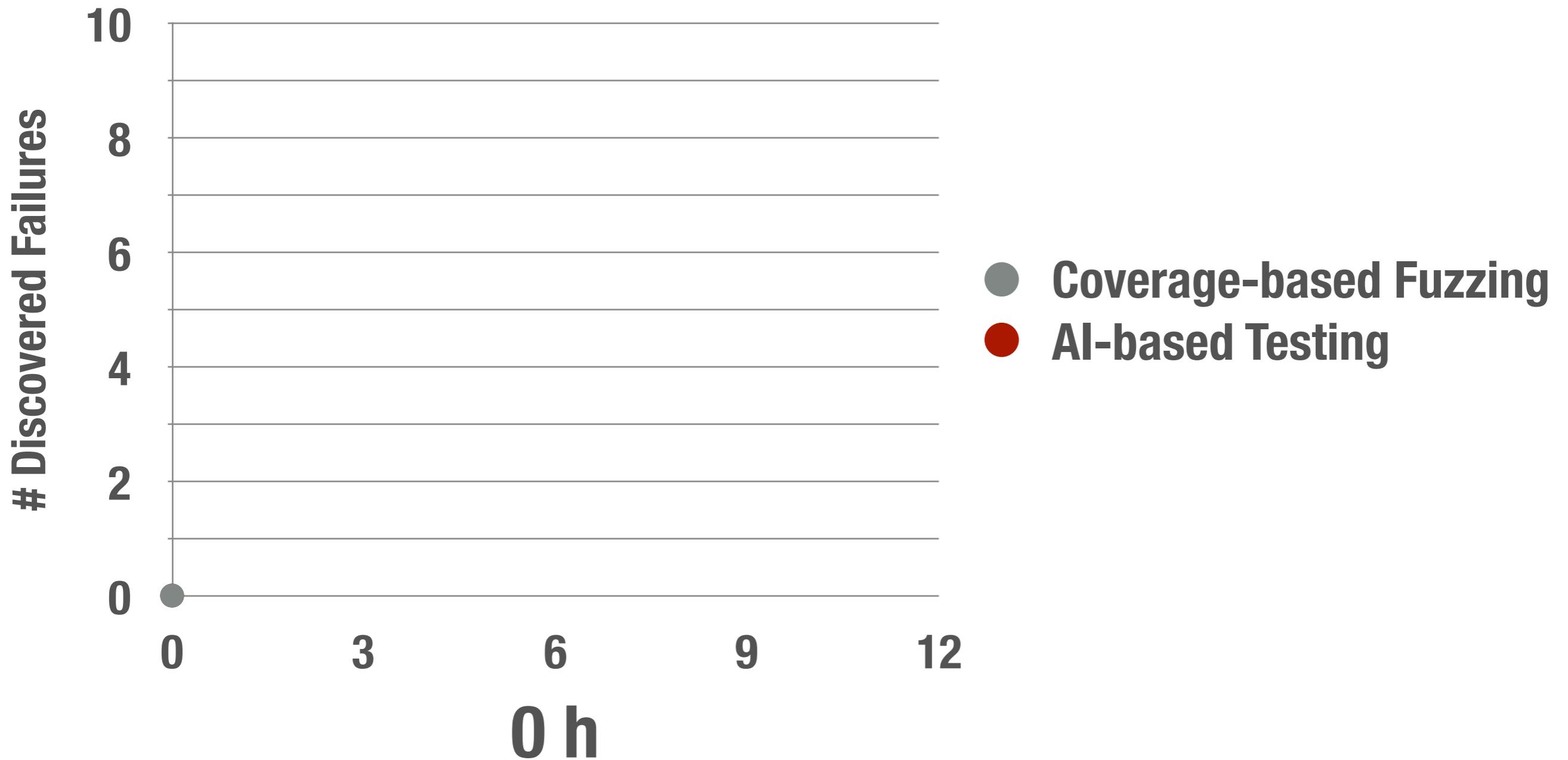
We want to cover
this method

The false branch is very easy to cover with random testing

The true branch is very difficult as it require to satisfy the equation `computeZeta()=0`

What is the probability that a random pair of number X and Y satisfy that condition?

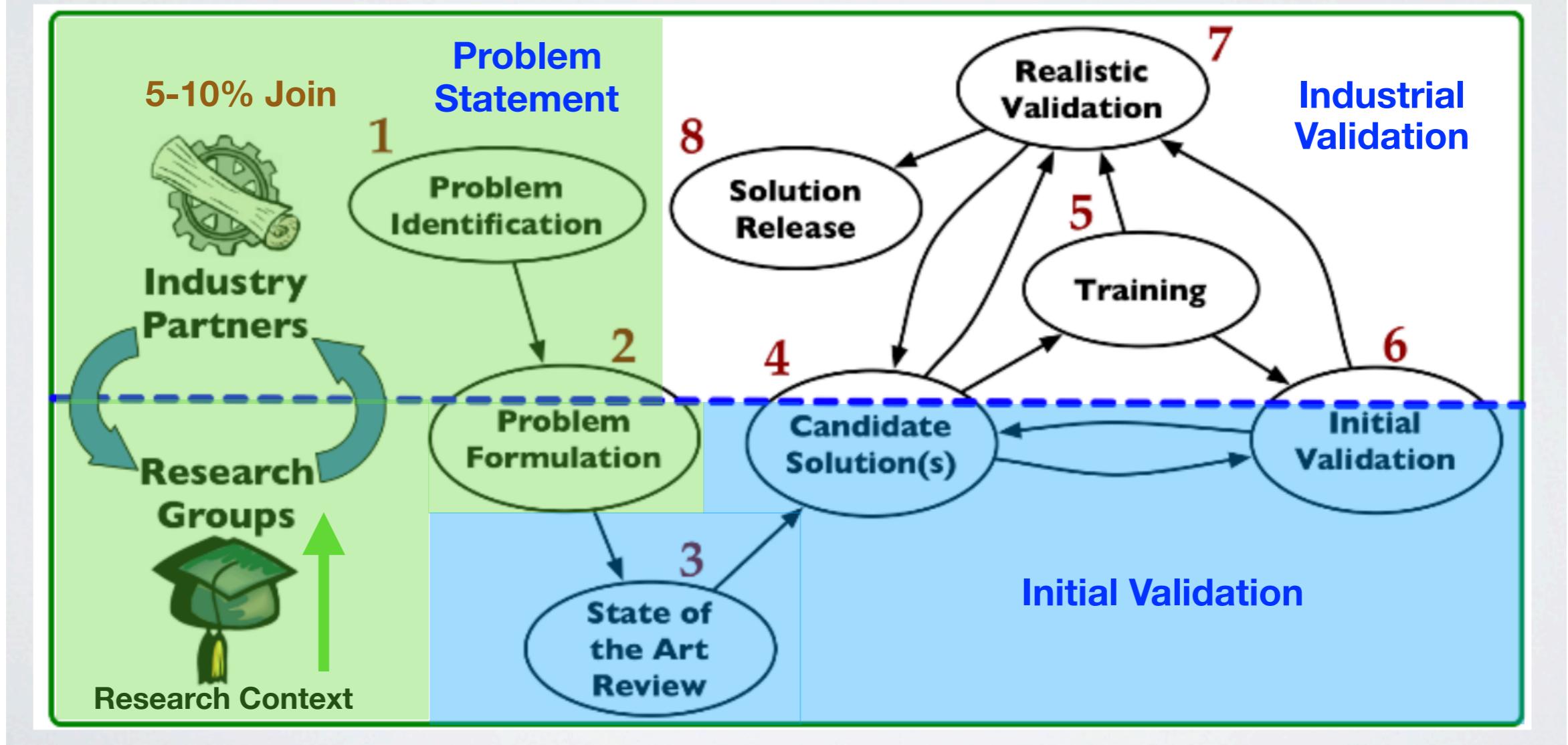
Evosuite Results



How to come up with a Vision?

“..there are guidelines...”

- Strong emphasis on applied research, driven by needs
- Tight, long-term industrial collaborations



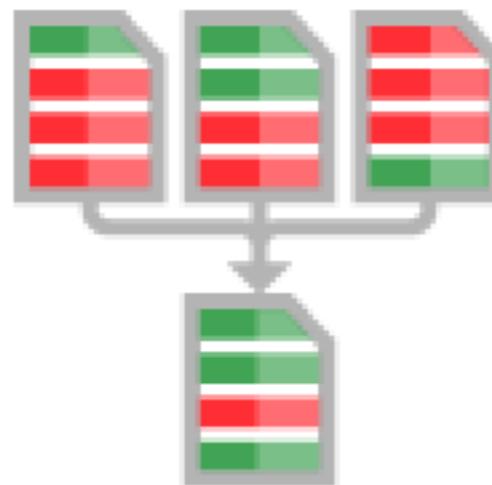
“Why and How to Get a PhD?” Lionel Briand

<https://bit.ly/2LGg7nI>

Research goal

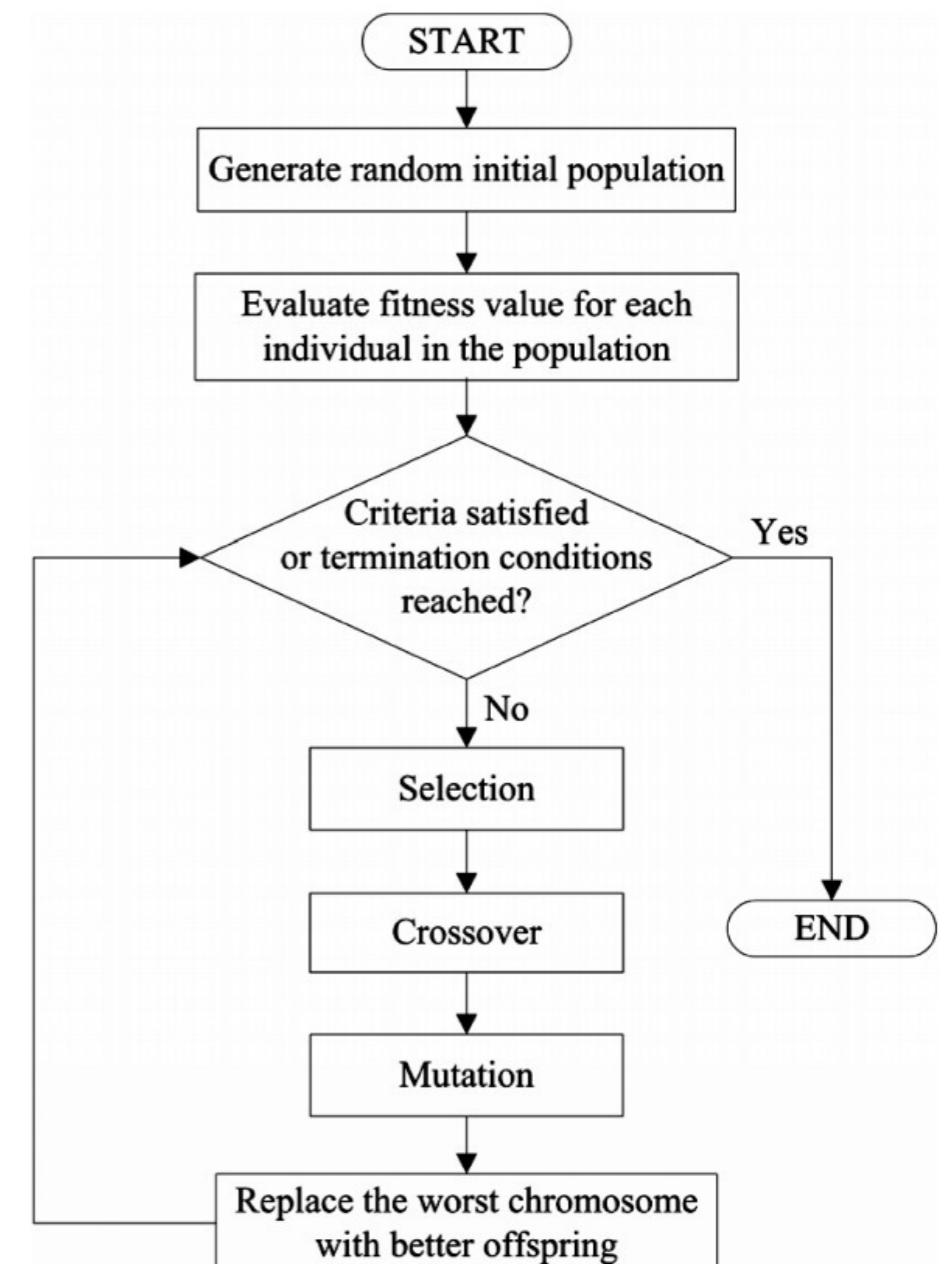
- **Automatically generating tests** with appropriate performance (CPU, memory, etc.) when deployed in different environments

It uses indicators of Test Coverage...



```
1| public class TestOption {  
2|  
3| @Test  
4| public void test0() throws Throwable {  
5|     Option option0 = new Option("", "1W|");  
6|     assertEquals("1W|", option0.getDescription());  
7|     assertEquals("", option0.getKey());  
8| }  
9| }
```

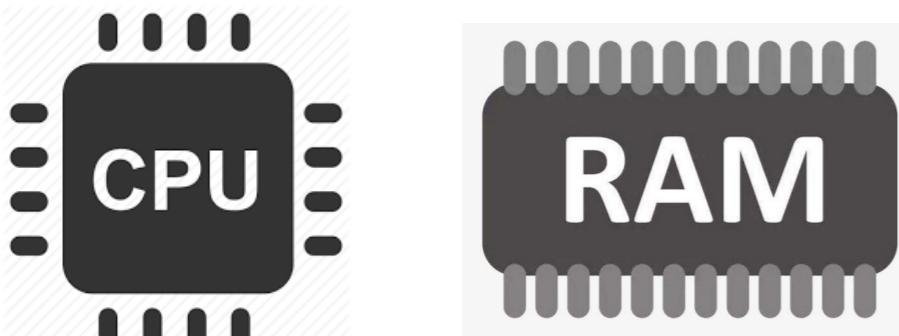
Test Case Automatically Generated by Evosuite
(for the class apache.commons.Option.Java)



Technical solutions

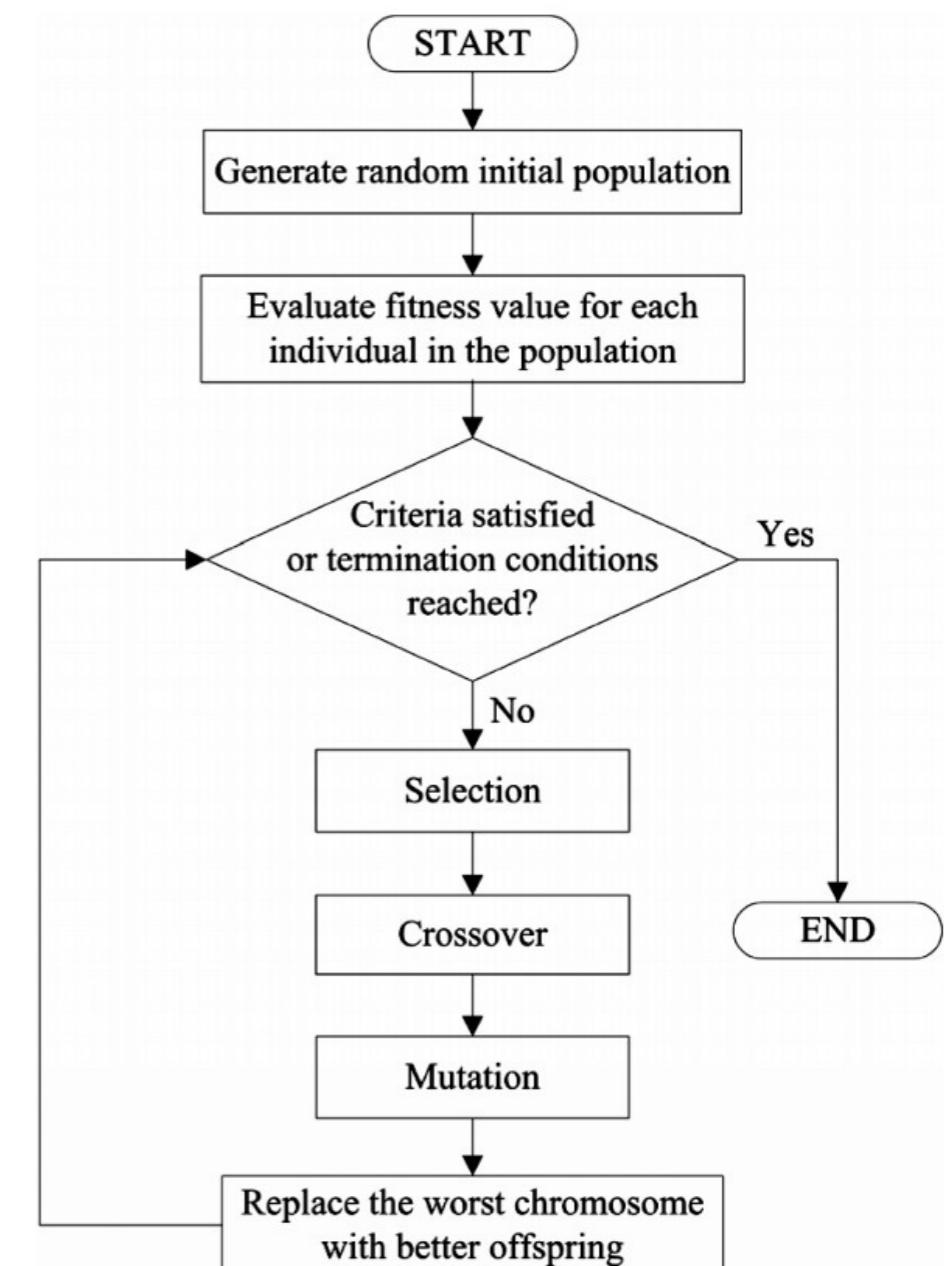
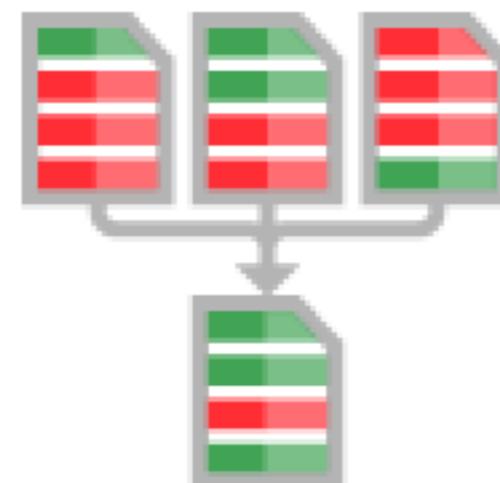
- **Automatically generating tests** with appropriate performance (CPU, memory, etc.) when deployed in different environments

Further Indicators...

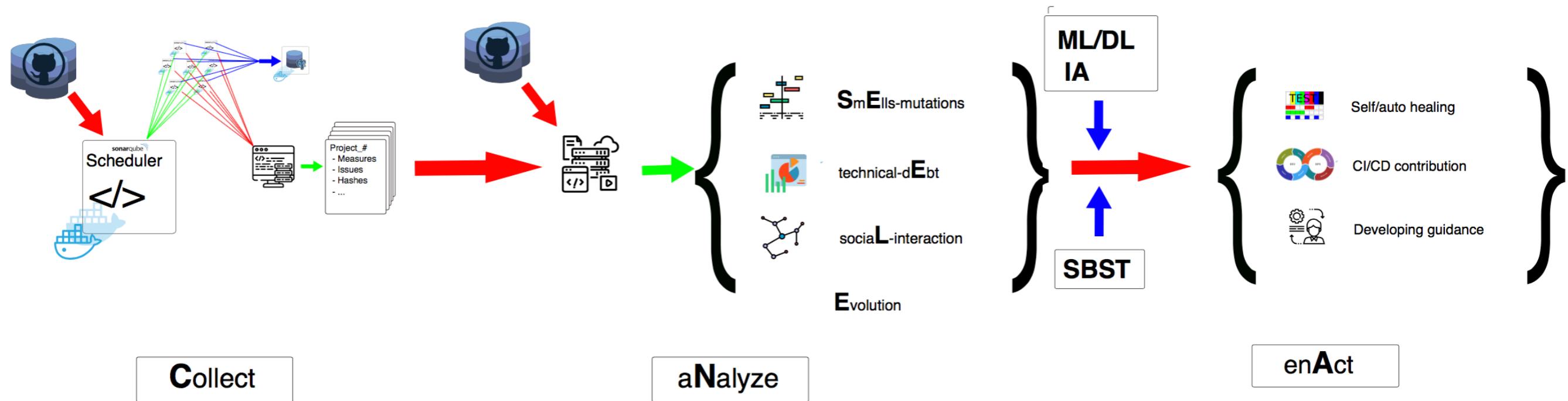


```
1| public class TestOption {  
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3| @Test  
4| public void test0() throws Throwable {  
5|     Option option0 = new Option("", "1W|");  
6|     assertEquals("1W|", option0.getDescription());  
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8| }  
9| }
```

Test Case Automatically
Generated by **Evosuite**
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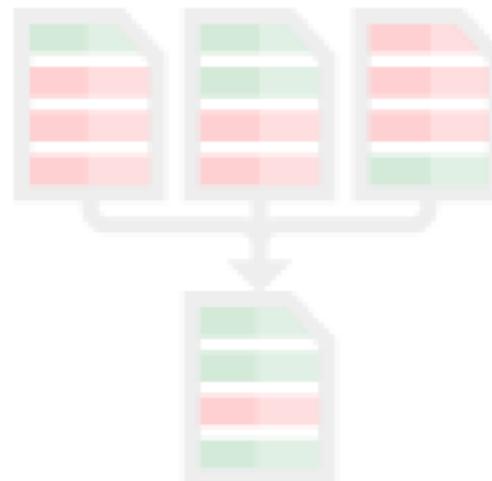
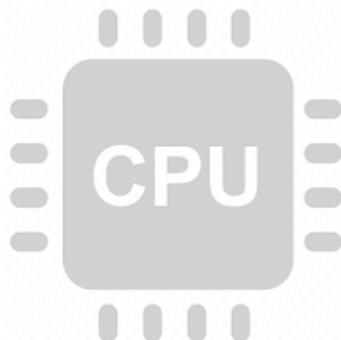
CNA Research Approach



pDynaMOSA: DEMO

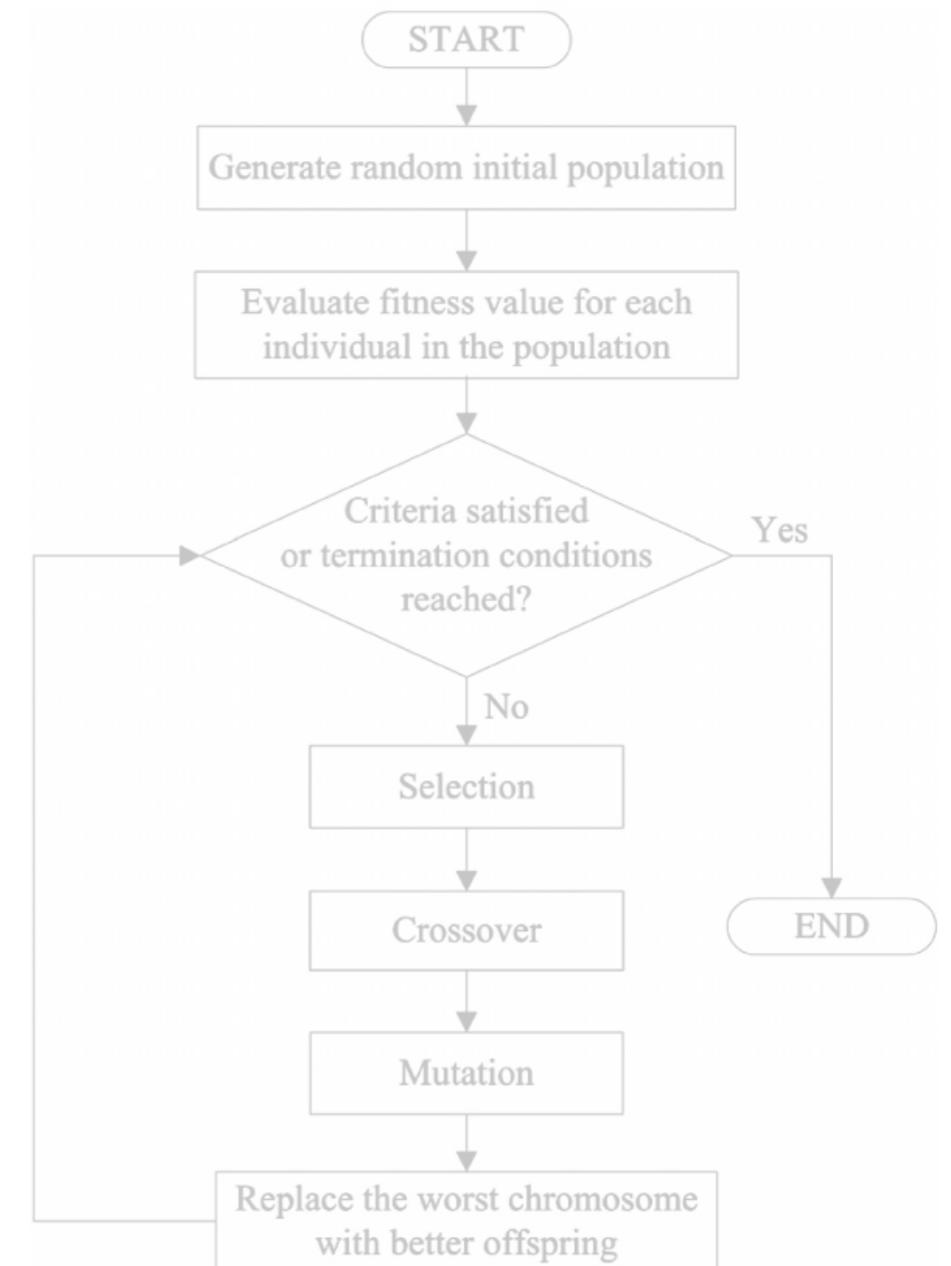
- Automatically generating tests with appropriate performance (CPU, memory, etc.) when deployed in different environments

Further Indicators...



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1| public class TestOption {  
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8| }  
9| }
```

Test Case Automatically
Generated by **Evosuite**
(for the class apache.commons.Option.Java)



Technical Challenges

- 1) A set of **performance proxies** that provide an approximation of the test execution costs (i.e., runtime and memory usage).



G. Grano S. Panichella

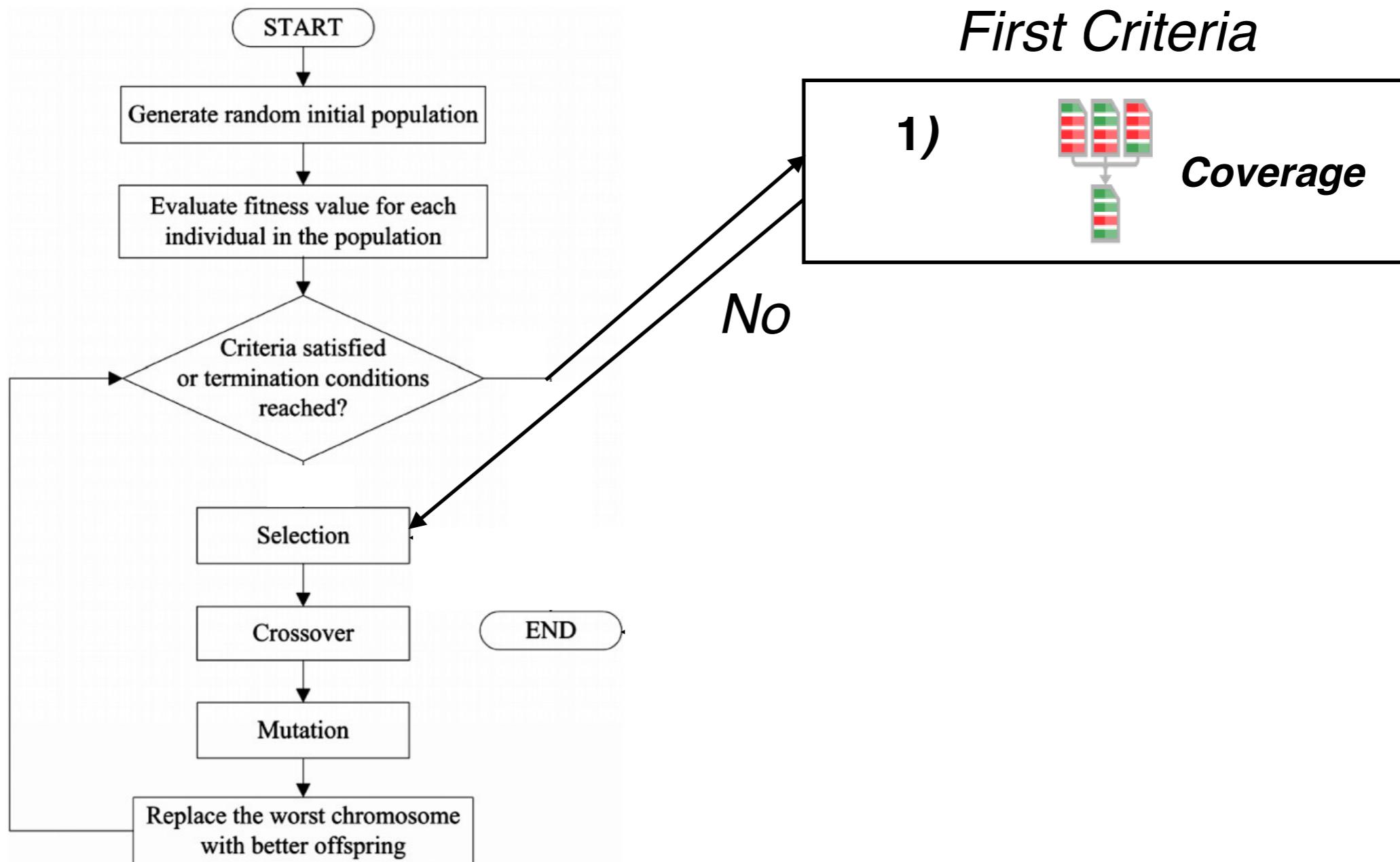
- 2) Leverages these proxies to **extend Evosuite**, a state-of-the-art evolutionary algorithm in unit testing.



A. Panichella G. Grano S. Panichella

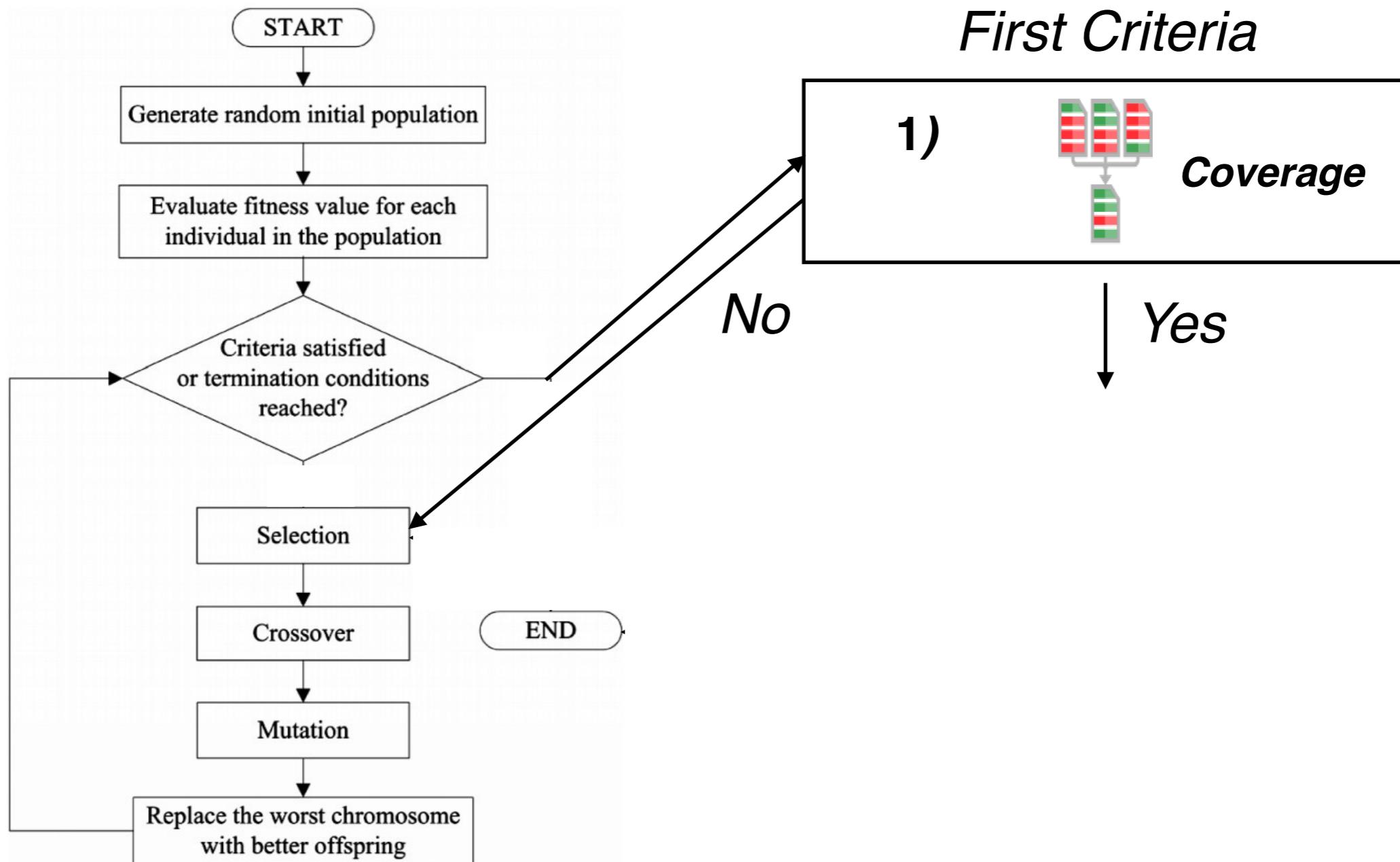
pDynaMOSA Approach

pDynaMOSA (Adaptive Performance-Aware DynaMOSA),



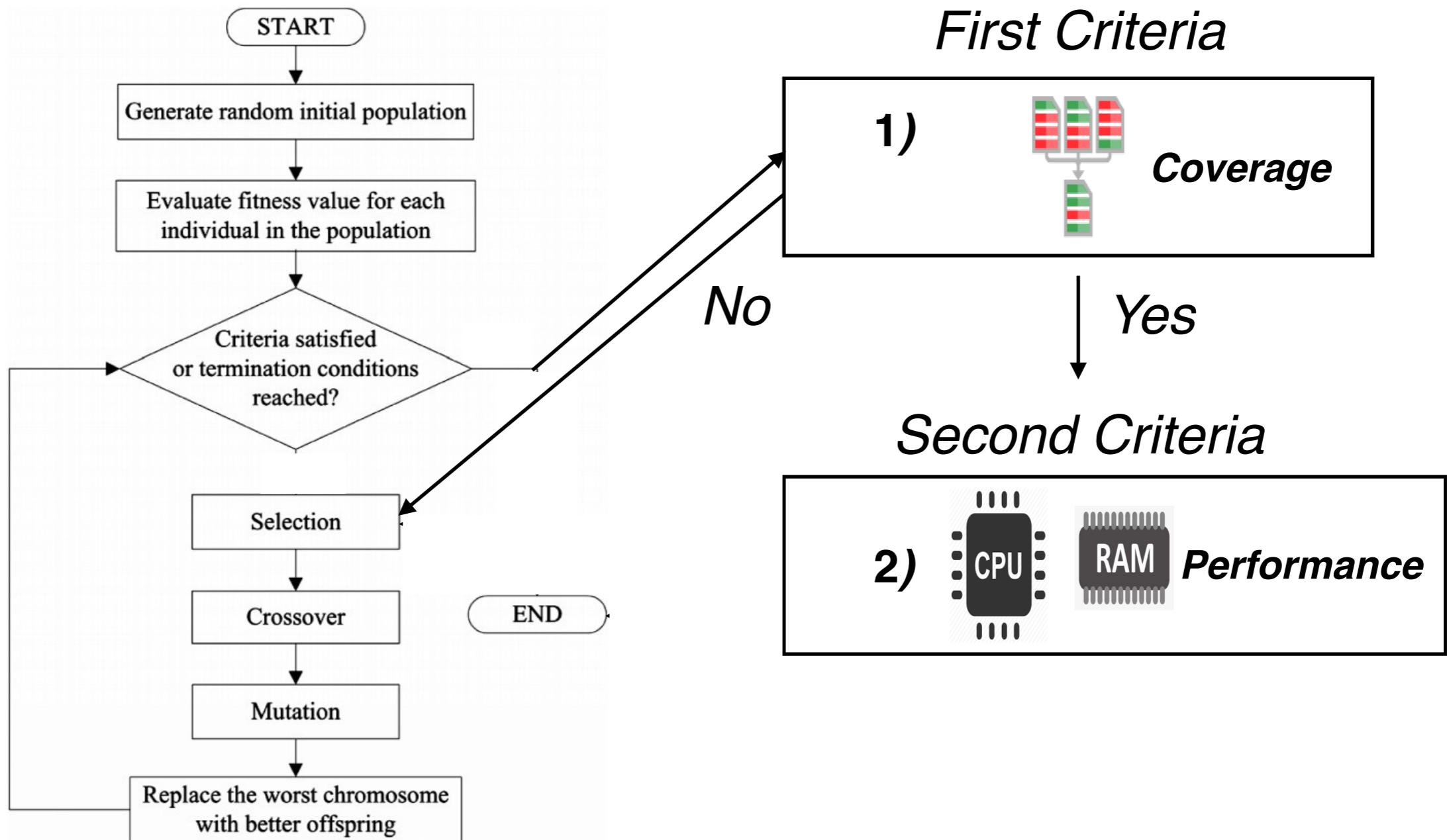
pDynaMOSA Approach

pDynaMOSA (Adaptive Performance-Aware DynaMOSA),



pDynaMOSA Approach

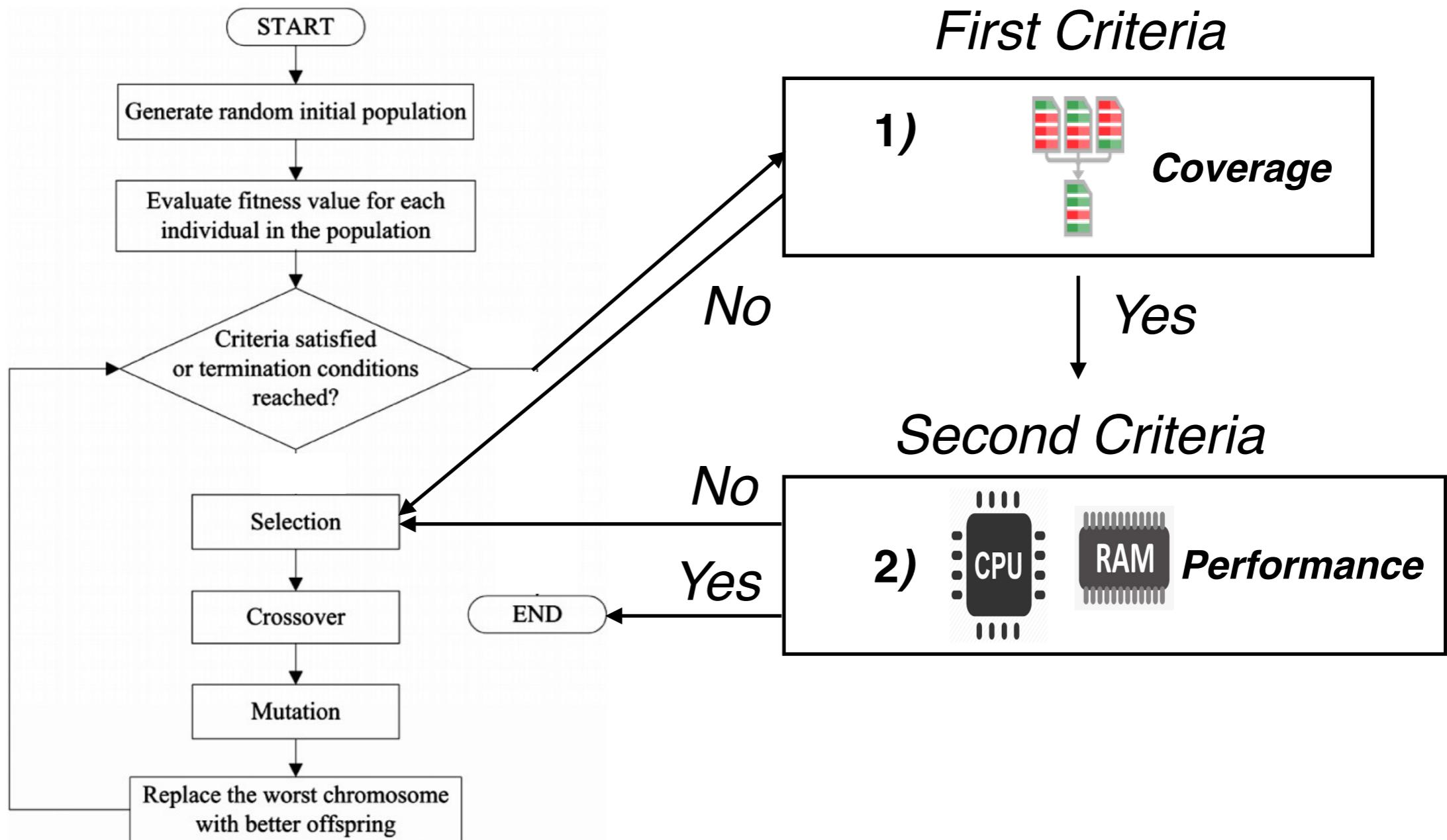
pDynaMOSA (Adaptive Performance-Aware DynaMOSA),



pDynaMOSA Pipeline

pDynaMOSA Approach

pDynaMOSA (Adaptive Performance-Aware DynaMOSA),



pDynaMOSA Pipeline

pDynaMOSA Approach

pDynaMOSA (Adaptive Performance-Aware DynaMOSA),

```
# To execute pDynaMOSA the following command
java -jar evosuite-master-1.0.7-SNAPSHOT.jar -
generateM0Suite -projectCP fastjson.jar -class
com.alibaba.fastjson.parser.JSONLexerBase -
Dperformance_indicators=STATEMENTS_COVERED:TEST_LENGTH:COV
ERED_METHOD_CALL:OBJECTS_INSTANTIATIONS:LOOP_COUNTER:METHO
D_CALL -Dsecondary_objectives=PERFORMANCE -
Dalgorithm=DynaMOSA -
Dperformance_strategy=CROWDING_DISTANCE -Dminimize=FALSE -
Dassertions=FALSE -Dsearch_budget=40 -
Dconfiguration_id=DMOSA -Dtest_dir=fast-test
```

pDynaMOSA Approach

pDynaMOSA (Adaptive Performance-Aware DynaMOSA),

```
# Execute pDynaMOSA with the following command
java -jar evosuite-master-1.0.7-SNAPSHOT.jar -
generateMOSuite -projectCP fastjson.jar -class
com.alibaba.fastjson.parser.JSONLexerBase -
Dperformance_indicators=STATEMENTS_COVERED:TEST_LENGTH:COV
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Dconfiguration_id=DMOSA -Dtest_dir=fast-test
```

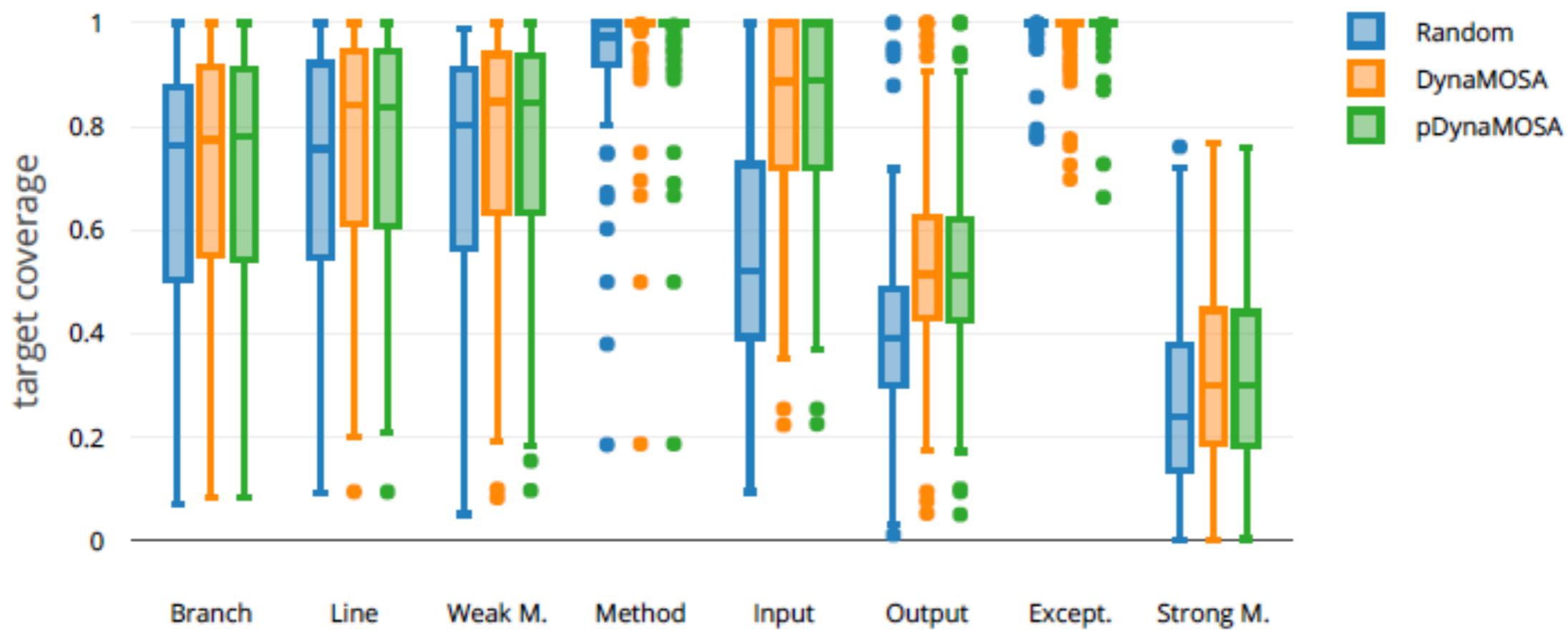
Evaluation

Dataset from SBST Community

Project	#	Branches			Mutants		
		Min	Max	Mean	Min	Max	Mean
a4j	2	30	124	77	15	911	463
bcel	4	52	890	475	408	1,523	1,043
byuic	1	722	722	722	2,173	2,173	2,173
fastjson	10	20	2,880	564	36	13,152	2,078
firebird	3	90	194	131	347	441	392
fixsuite	1	32	32	32	110	110	110
freehep	6	48	160	92	112	807	297
freemind	1	170	170	170	2,427	2,427	2,427
gson	4	60	660	285	126	2,870	1,212
image	7	34	274	140	214	1,676	589
javathena	1	230	230	230	752	752	752
javaviewcontrol	2	212	2,360	1,286	2,058	4,972	3,515
jdbacl	2	170	174	172	595	700	648
jiprof	1	816	816	816	6,420	6,420	6,420
jmca	2	198	1,696	947	2,436	9,669	6,052
jsecurity	1	52	52	52	165	165	165
jxpath	3	98	102	100	204	449	312
la4j	7	20	280	135	196	3,217	1,122
math	4	14	238	92	135	1,274	443
okhttp	5	64	542	194	200	2,571	846
okio	9	24	562	126	34	4,271	1,009
re2j	8	68	646	178	148	2,096	1,129
saxpath	1	458	458	458	659	659	659
shop	4	38	182	102	175	465	302
webmagic	4	10	142	84	29	337	201
weka	10	212	778	359	255	13,263	2,220
wheelwebtool	7	24	804	331	75	3,898	1,637
Total		110					

Research Questions

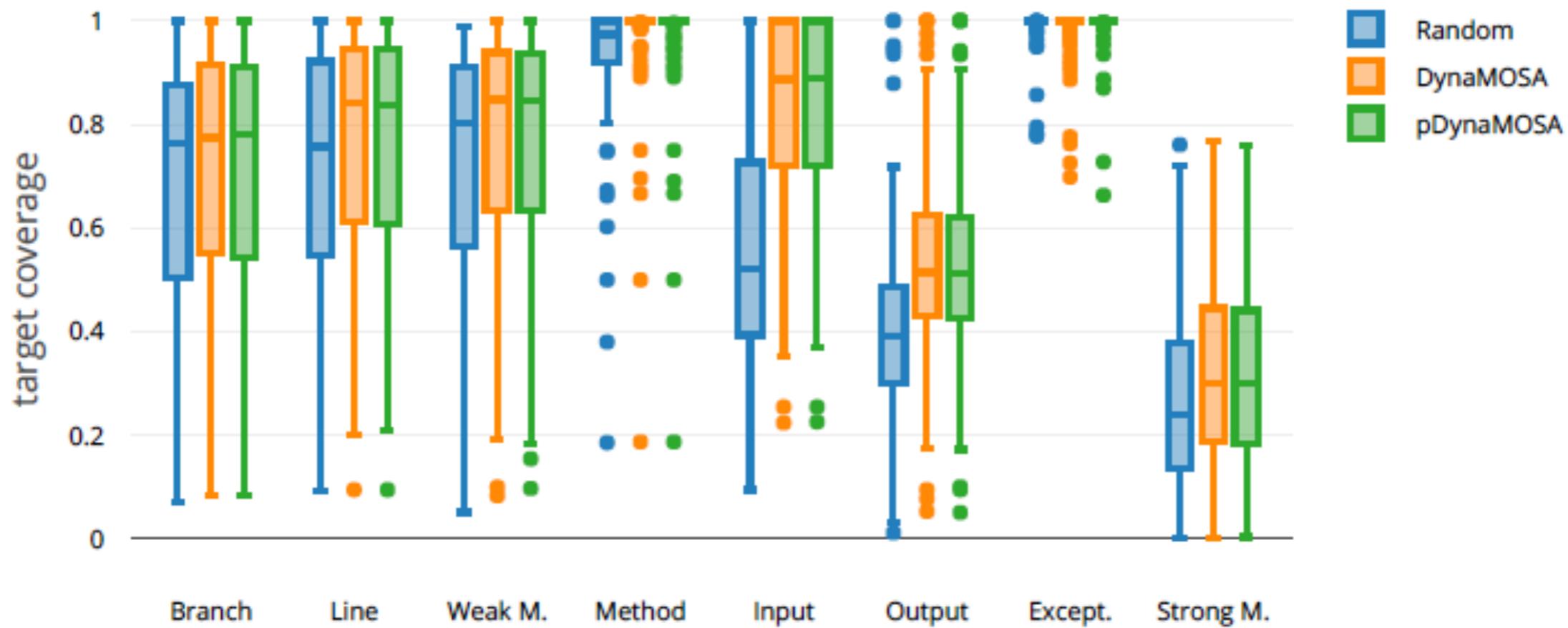
RQ1. (Effectiveness) What is the target coverage achieved by pDynaMOSA compared to DynaMOSA?



Comparison of coverage achieved by Random Search, DynaMOSA, and pDynaMOSA over 50 independent runs for the 110 studied subjects

Research Questions

RQ2. (Fault Detection) What is the mutation score achieved by pDynaMOSA compared to DynaMOSA?

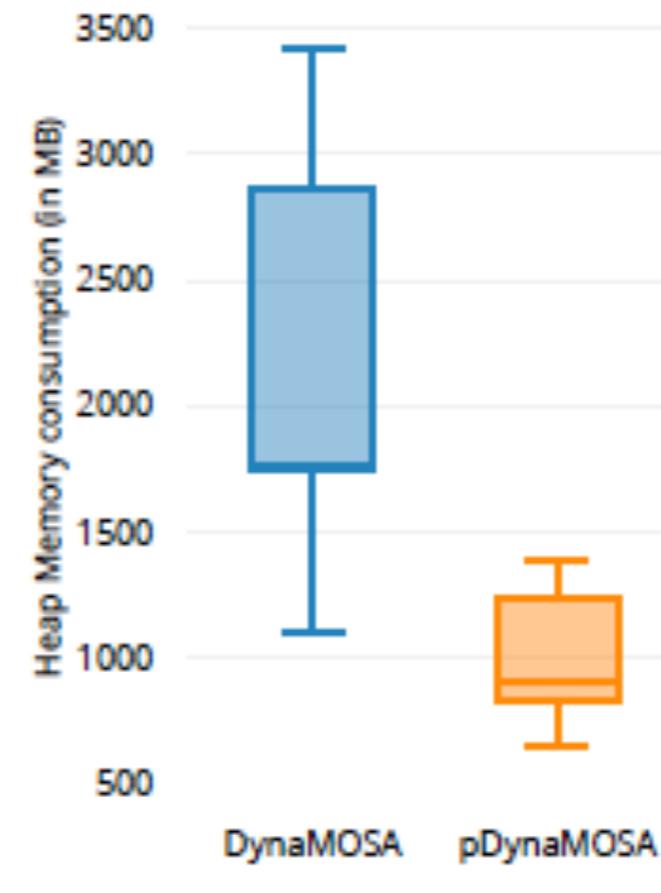
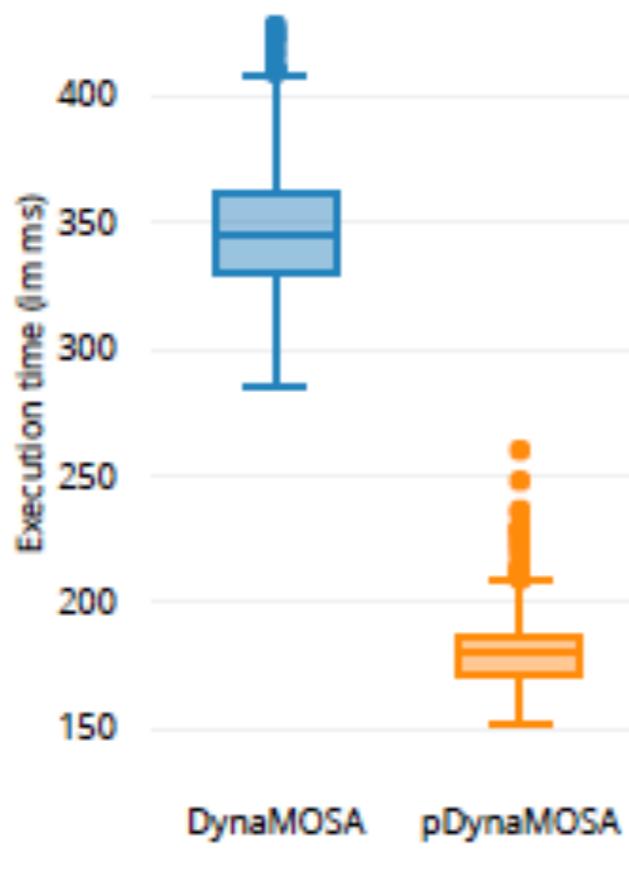


Comparison of coverage achieved by Random Search, DynaMOSA, and pDynaMOSA over 50 independent runs for the 110 studied subjects

No. cases pDynaMOSA is better than Random	88 (96.8%)
No. cases pDynaMOSA is worse than Random	1 (1.1%)
No. cases pDynaMOSA is better than DynaMOSA	5 (5.5%)
No. cases pDynaMOSA is worse than DynaMOSA	16 (17.6%)

Research Questions

RQ3. (Performance) Does the adoption of performance proxies lead to shorter runtime and lower heap memory consumption?



Christoph Laaber (UZH)

"Statistically rigorous java performance evaluation,"

OOPSLA '07.

Outline

PART I

1) Research Context and Motivation

PART II

2) Literature review on:

- Cloud Testing Challenges
- Automated Testing

3) Future Directions

Future work

LOCAL DEVELOPMENT

1

Forget about **local development**:
Emulation is not **comprehensive** and **brittle**

2

Write **more** tests
and run them to
shorten the
Feedback Loop

3

Tests closer to
production tell
more

4

Tests in cloud
enforces better
observability

 homegate.ch

Future work

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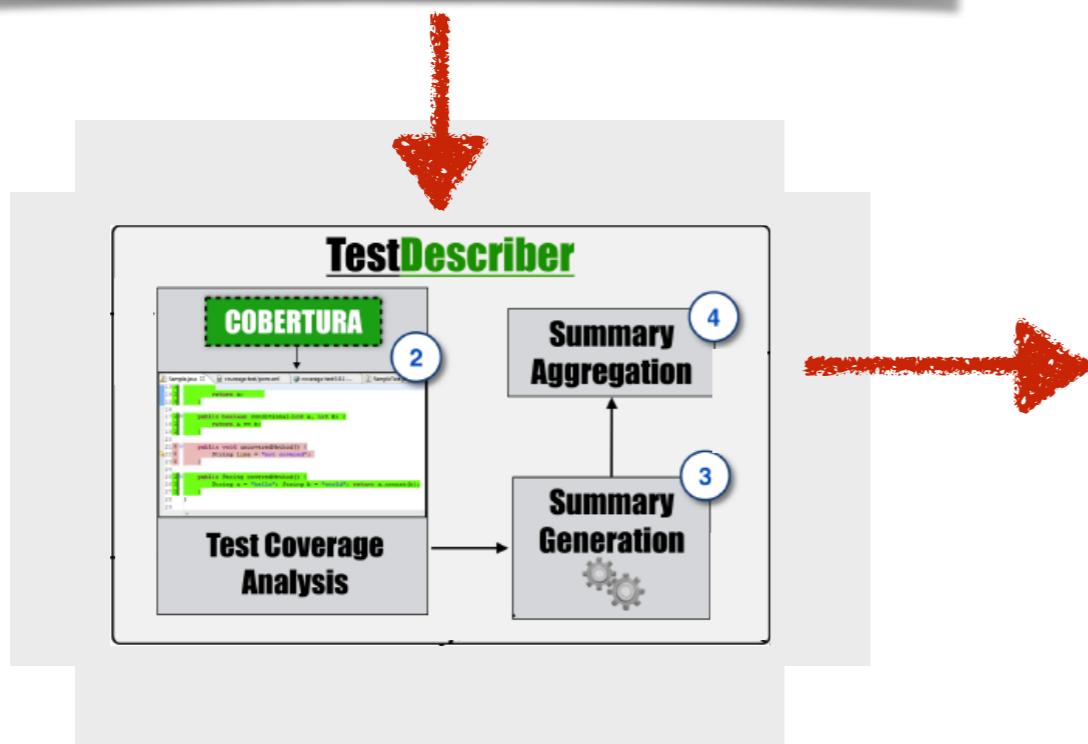
“Unit Testing Comments Generation?”

Combining Test Case Generation with NLP

Generated Unit Test

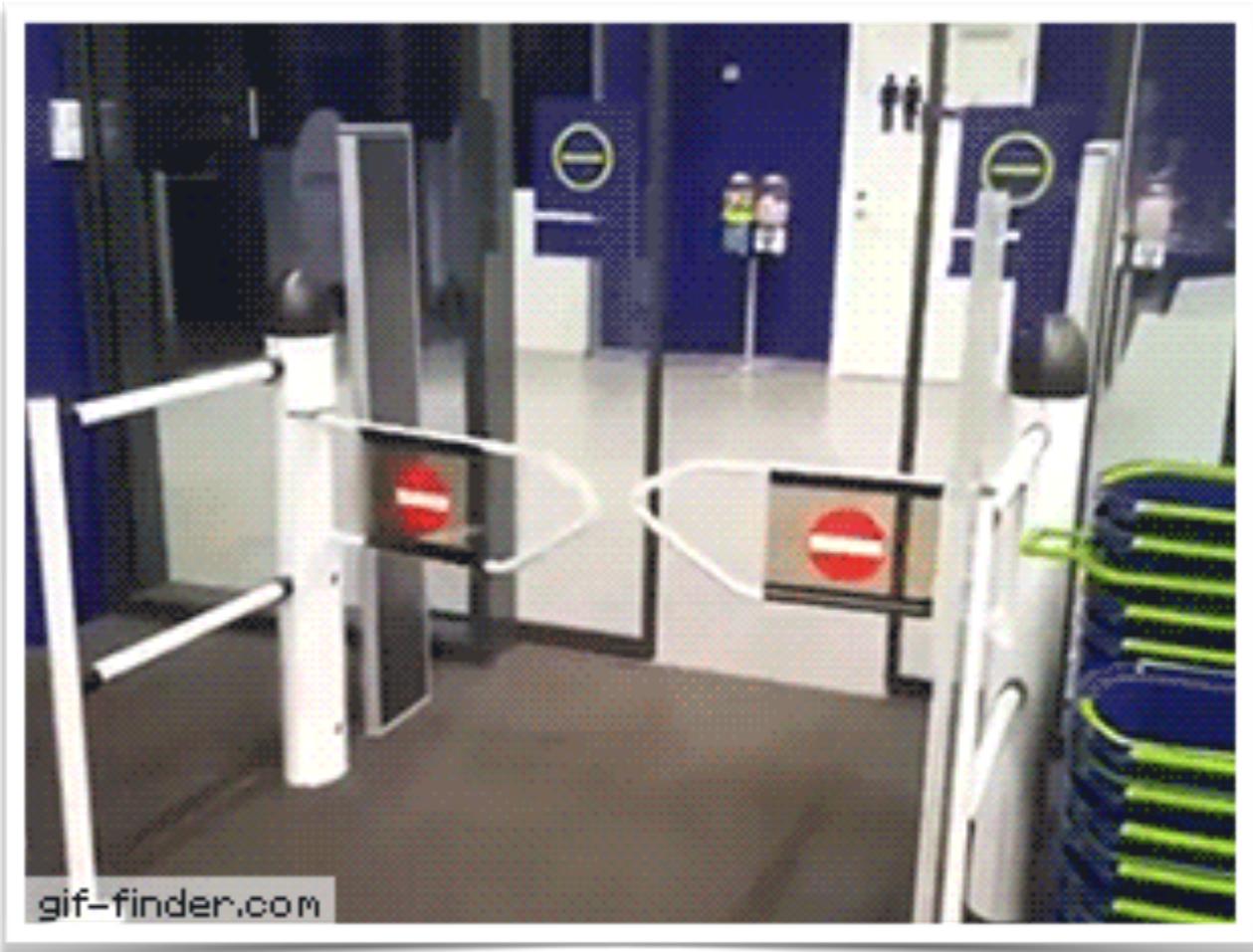
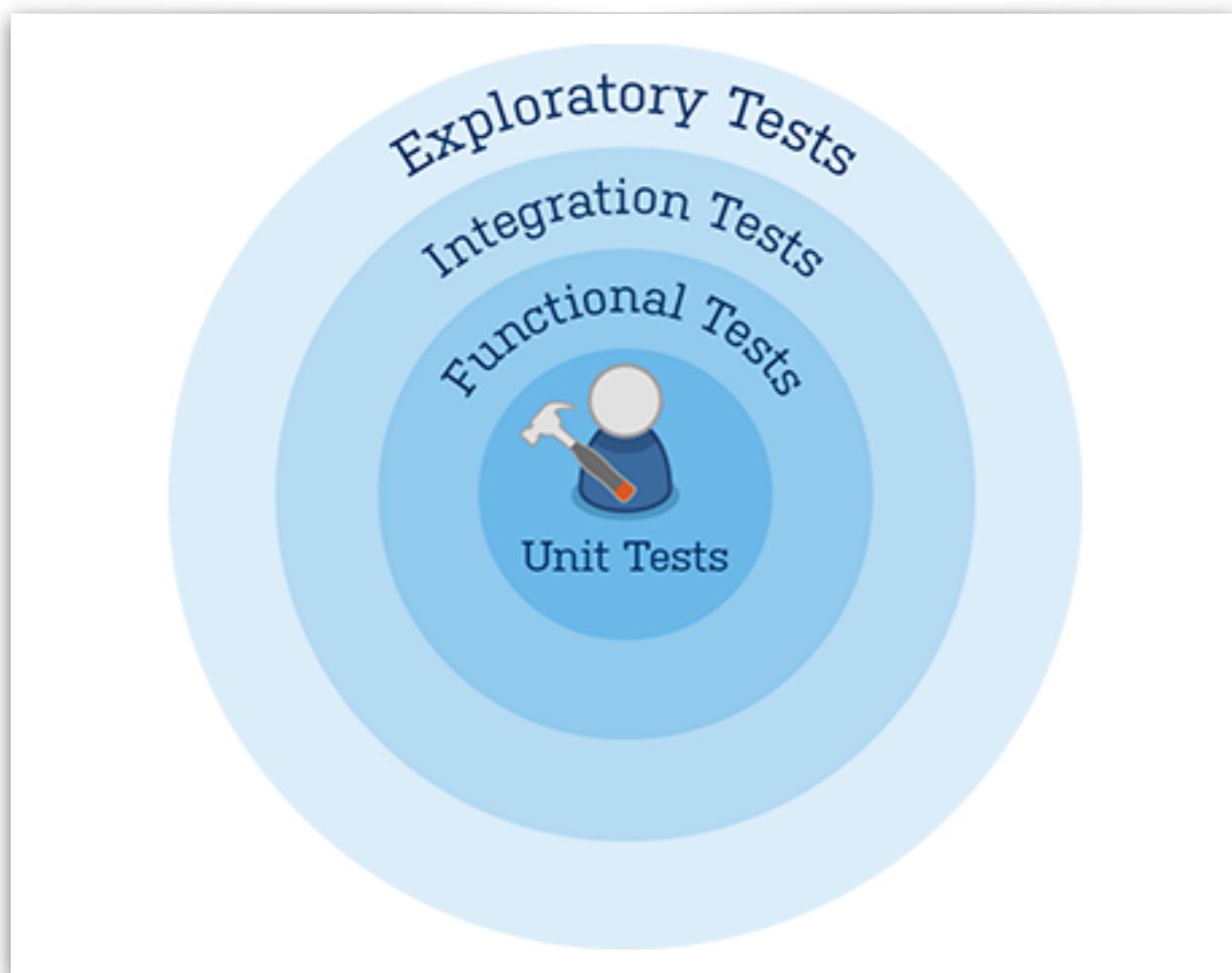
```
public class TestOption {  
  
    @Test  
    public void test0() throws Throwable {  
        Option option0 = new Option("", "1W|~");  
        assertEquals("1W|~", option0.getDescription());  
        assertEquals("", option0.getKey());  
    }  
}
```

... with Descriptions



```
public class TestOption {  
    /** OVERVIEW: The test case "test0" covers around 3.0% 3.b  
     * (low percentage) of statements in "Option" **/  
    @Test  
    public void test0() throws Throwable {  
        // The test case instantiates an "Option" with option 3.c  
        // equal to "", and description equal to "1W|~".  
        Option option0 = new Option("", "1W|~");  
        // Then, it tests:  
        // 1) whether the description of option0 is equal to 3.c  
        // "1W|~";  
        assertEquals("1W|~", option0.getDescription());  
        // 2) whether the key of option0 is equal to ""; 3.c  
        // The execution of the method call used in the assertion 3.d  
        // implicitly covers the following 1 conditions:  
        // - the condition "option equal to null" is FALSE;  
        assertEquals("", option0.getKey());  
    }  
}
```

“Beyond Unit Testing?”



Thanks for the Attention!



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<https://spanichella.github.io/>

- Any Questions?

Zürcher Hochschule
für Angewandte Wissenschaften

