

# Testing Injection Flaws through Contract-driven Coevolutionary Algorithms

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## Highlights

**Penetration Testing** is crucial for web application development

**Effective test cases** are application-specific, and generating them is complex

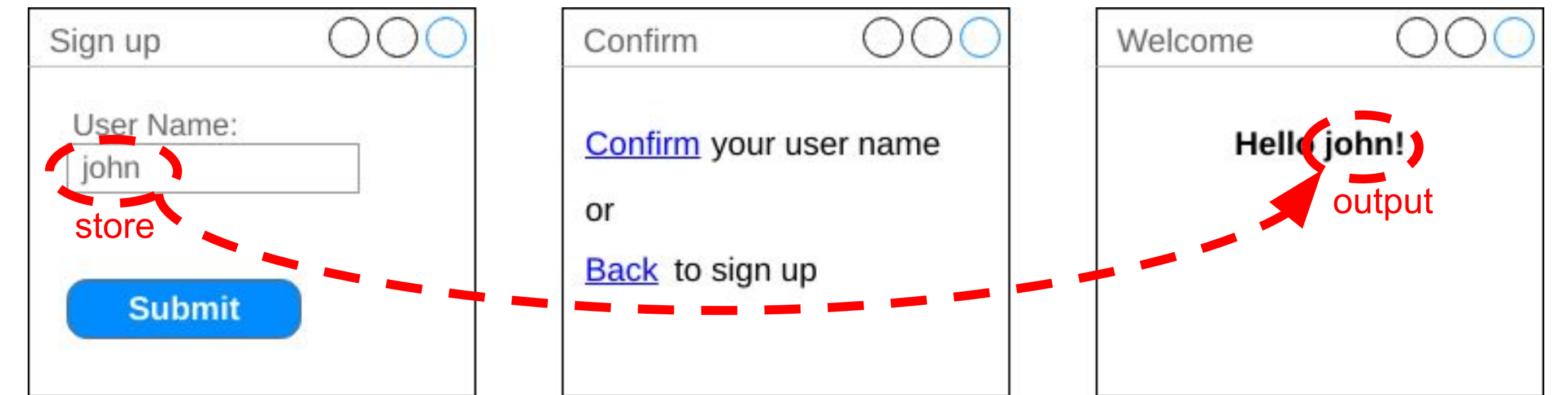
Test cases for **multi-step processes** are especially hard to find

**Automatic testing tools** cannot completely replace the human analysts

→ **We propose Beagle: a contract-driven, coevolutionary algorithm for automatic, application-specific test case generation**

## Motivating example

### Multi-step Stored XSS



→ **Traditional scanners (e.g., ZAP) cannot find it autonomously**

## Contracts and vulnerabilities

A **vulnerability specification** is a pair  $\{L, C\}$  where  $L$  is a list of instructions and  $C$  is a **contract** (i.e., a predicate) on the variables in  $L$ .

A vulnerability is **triggered** when  $L$  is executed while  $C$  is satisfied.

Example: XSS Vulnerability Specification

```
{echo x, x ∈ Σ* <script>alert(R)</script> Σ*}
```

Where  $R$  is either a string or a number.

Vulnerability trigger:

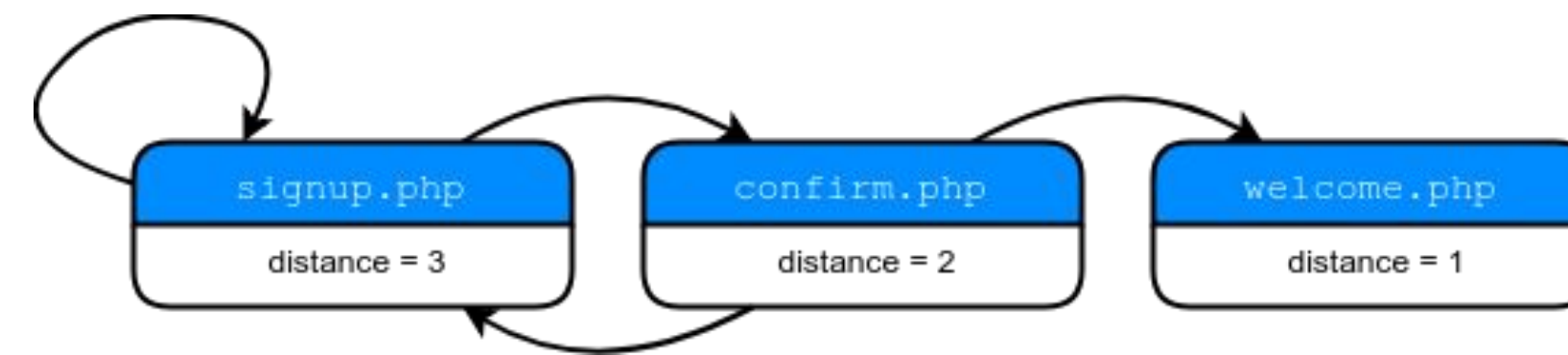
```
echo $_GET['usr'];
```

with  $\$_GET['usr'] = "<script>alert(1)</script>"$   
(or  $"<script>alert('xss')</script>"$ , ...)

→ A test  $T$  is **successful** when it triggers a vulnerability.

## Fitness evaluation

### Call (graph) distance



$CallDistance = 1 \Leftrightarrow$  The page contains  $L$ .

### Contract distance

The minimum distance between the image of a contract and the actual values generated by the test

### Fitness

$$Fitness(T) = CallDistance - \frac{1}{1 + ContractDistance}$$

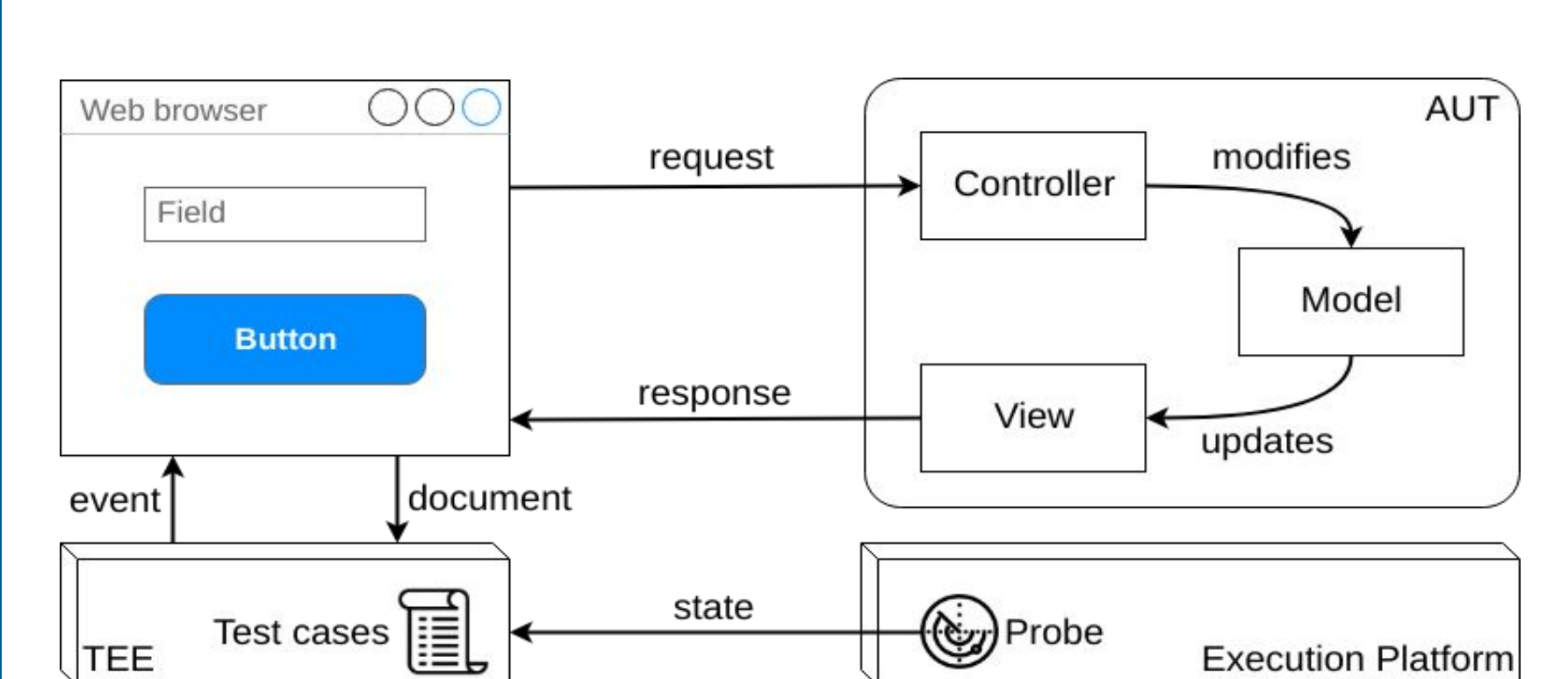
Example

$T_1 \rightarrow$  inject  $"<script>alert(1a)</script>"$   
 $T_2 \rightarrow$  inject  $"<script>alert(xss)</script>"$

$$Fitness(T_1) = 1/2 < 2/3 = Fitness(T_2)$$

→ **Fitness(T) = 0  $\Leftrightarrow$  T is a successful test.**  
→ **Note:** finding *ContractDistance* is hard

## Beagle



### Genetic Approach

Two coevolving species:

- **Test species**  
a population of unsuccessful tests
- **Contract species**  
for *ContractDistance* approximation

### Algorithm

1. Start from random populations
2. Evaluate and select the **fittest tests**
  - a. Coevolve Contract species
3. Mate and mutate tests
4. Repeat until a  $T$  is successful

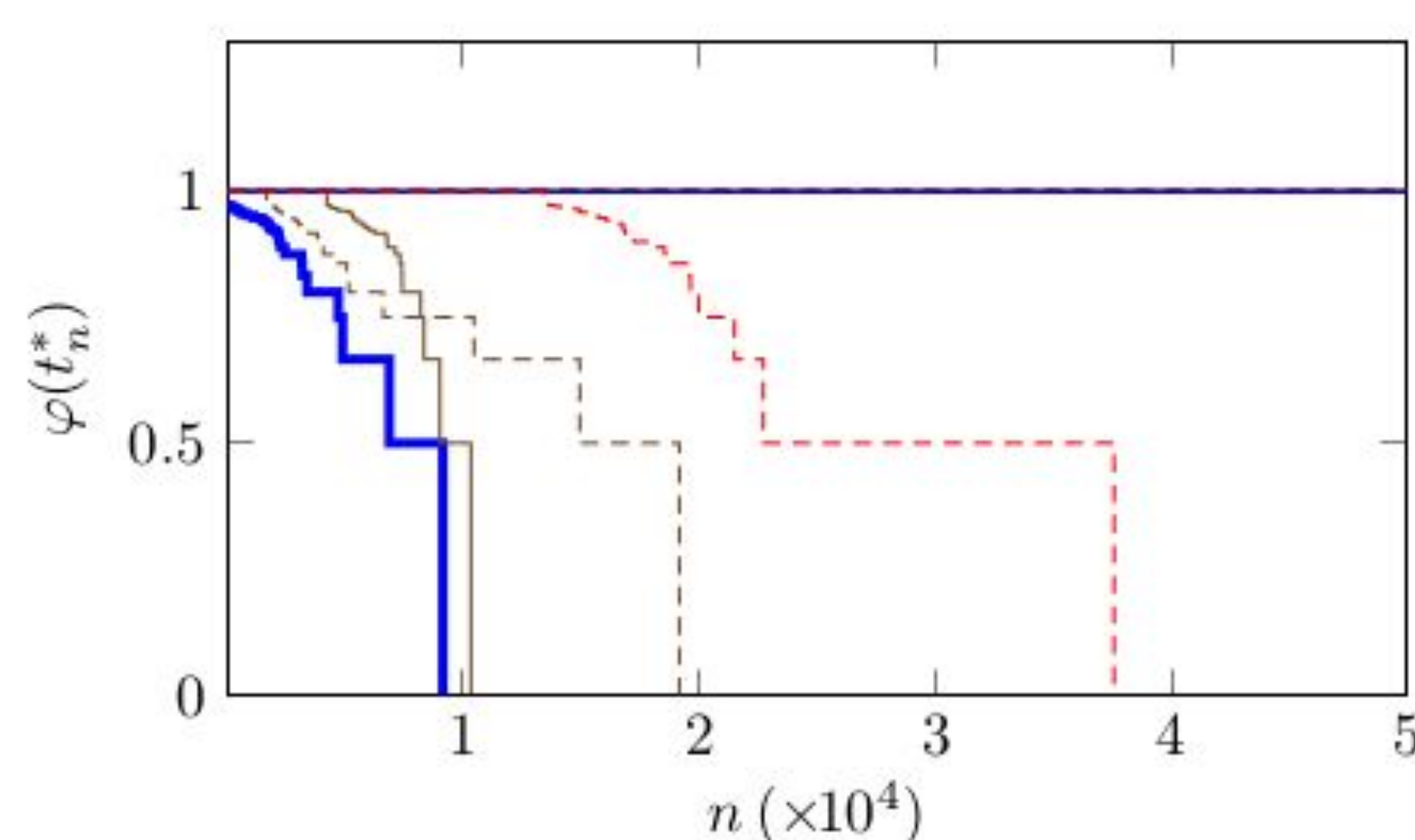
→ **T is an executable sequence**

## Benchmarks

### WackoPicko

Tests applied to Injection Flaw vulnerabilities in WackoPicko (Doupé et al. 2010)

#### 7. Multi-step stored XSS



Vulnerability	WSR	Gen.	Time	Injected Payload
Reflected XSS	6/10	7425	787s	<code>&lt;script&gt;alert(44)&lt;/script&gt;</code>
Stored XSS	4/10	9380	993s	<code>&lt;script&gt;alert('`s')&lt;/script&gt;</code>
Stored SQLi	0/10	50000	5132s	<code>AcuYq6*4M-PaE</code>
Reflected SQLi	6/10	6049	640s	<code>admin'-- IgeBGMbLO`MnGUU99#p</code>
<b>Multi-step XSS</b>	<b>4/10</b>	<b>9137</b>	<b>968s</b>	<b><code>n&lt;script&gt;alert(3)&lt;/script&gt;FO</code></b>
Command-line Injection	1/10	7969	844s	<code>q7d &amp;; ls #X&lt;'SI</code>
XSS behind JS	3/10	9970	1056s	<code>&lt;script&gt;alert(3)&lt;/script&gt;^JM</code>
XSS behind Flash	4/10	11683	1238s	<code>&lt;script&gt;alert(13)&lt;/sCRipt&gt;</code>

This poster is based on the following paper:

1. Costa G., Valenza A., Armando A.: „Why Charles Can Pen-test: an Evolutionary Approach to Vulnerability Testing“ Submitted at Network and Distributed System Security Symposium 2019 (**NDSS 2019**)



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