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Test Data Generation for JavaScript Functions that Interact with the DOM

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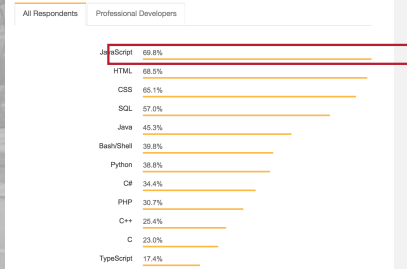
1. Introduction



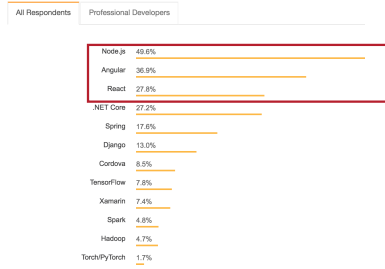
StackOverflow Developer Survey

- ▶ For the sixth year in a row, **JavaScript** is the most commonly used programming language
- ▶ **Node.js** and **AngularJS** continue to be the most commonly used technologies, with **React** also important to many developers

Programming, Scripting, and Markup Languages

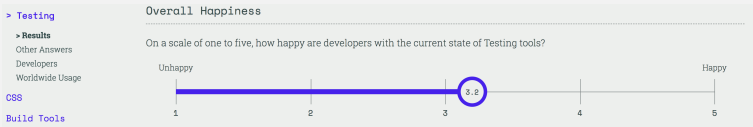


Frameworks, Libraries, and Tools



The State of JavaScript Testing

- ▶ There exist numerous JS frameworks on the market:
 - ▶ structure: Mocha, Jasmine
 - ▶ assertions: Chai
 - ▶ mocks and spies: Sinon
 - ▶ coverage: Istanbul
 - ▶ reporting: Karma
- ▶ Developers report a relatively low happiness score with the state of testing tools



Goal



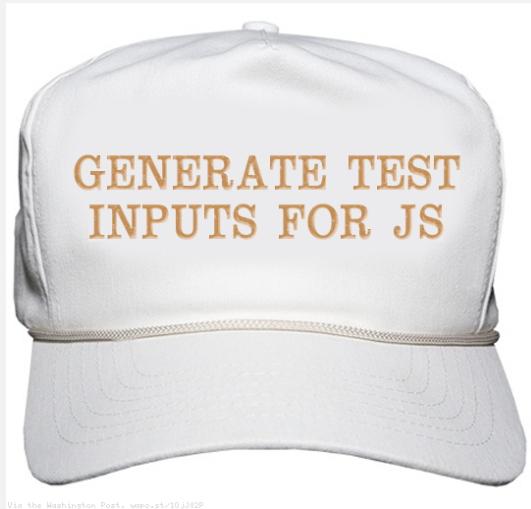
Via the Washington Post, [wpo.st/10jJ82P](https://www.washingtonpost.com/archive/local/2018/05/10/js-tests-great-again/)



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Eureka!



Via the Washington Post, wapo.st/10JJ82P



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Test Input Generation

Available techniques

- ▶ concolic execution: **Jalangi** and **Confix**
- ▶ random generation: **JSContest**
- ▶ static and dynamic analysis: **Artemis**
- ▶ crawling: **Crawljax**

Input types

- ▶ primitive types: numbers and strings
- ▶ collections: arrays
- ▶ objects
- ▶ DOM (focus of this paper)
- ▶ functions



JEDI: Javascript **E**volutionary testing framework with **DOM** as an **I**nput

Contributions

- ▶ implemented JEDI
- ▶ test generation algorithm
- ▶ evaluation



2. Motivation Example



Sudoku

6		2	9	5	8			7
8		1	4		7	5	2	3
			3	1	2	9		
2	1		7	9			8	5
9				3				6
7	5			8	1		9	2
		8	5	2	9			
3	2	5	1		6	8		9
1			8	7	3	2		4



isGameFinished

```
1  /*t dom */
2  function isGameFinished() {
3      var obj = document.getElementById('sudoku');
4      var subDivs = obj.getElementsByTagName('DIV');
5      var allOk = true;
6      for (var no = 0; no < subDivs.length; no++) {
7          if (subDivs[no].className.indexOf('square') >= 0
8              && !subDivs[no].style.backgroundColor) {
9              var spans=subDivs[no].getElementsByTagName('SPAN');
10             if (spans[0].innerHTML != spans[1].innerHTML) {
11                 allOk = false; //target
12                 break;
13             }
14         }
15     }
16     return allOk;
17 }
```



DOM Tests

```
1  <!-- T1: (5,5) -->
2  <html>
3  <body>
4    <div id='sudoku'>
5
6    </div>
7  </body>
8  </html>
9
10 <!-- T3: (7,8), (10,14) -->
11 <html>
12 <body>
13   <div id='sudoku'>
14     <div class='square'>
15       <span></span>
16       <span></span>
17     </div>
18   </div>
19 </body>
20 </html>
```

```
<!-- T2: (5,6), (7,15) -->
<html>
<body>
  <div id='sudoku'>
    <div></div>
  </div>
</body>
</html>

<!-- T4: (7,8), (10,11) -->
<html>
<body>
  <div id='sudoku'>
    <div class='square'>
      <span></span>
      <span>TEST</span>
    </div>
  </div>
</body>
</html>
```



DOM Tests

```
1  <!-- T1: (5,5) -->
2  <html>
3  <body>
4    <div id='sudoku'>
5
6    </div>
7  </body>
8  </html>
9
10 <!-- T3: (7,8), (10,14) -->
11 <html>
12 <body>
13   <div id='sudoku'>
14     <div class='square'>
15       <span></span>
16       <span></span>
17     </div>
18   </div>
19 </body>
20 </html>
```

```
<!-- T2: (5,6), (7,15) -->
<html>
<body>
  <div id='sudoku'>
    <div></div>
  </div>
</body>
</html>

<!-- T4: (7,8), (10,11) -->
<html>
<body>
  <div id='sudoku'>
    <div class='square'>
      <span></span>
      <span>TEST</span>
    </div>
  </div>
</body>
</html>
```



T4 Explained

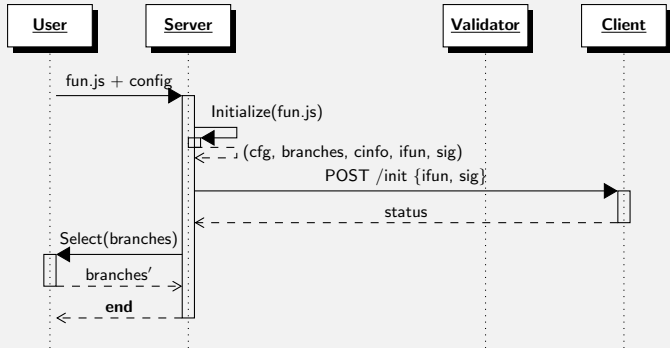
```
1  /*t dom */
2  function isGameFinished() {
3      var obj = document.getElementById('sudoku'); // [?] <div id='sudoku'>
4      var subDivs = obj.getElementsByTagName('DIV'); // [?] <div class='square'>
5      var allOk = true;
6      for (var no = 0; no < subDivs.length; no++) {
7          if (subDivs[no].className.indexOf('square') >= 0 // [?] class='square'
8              && !subDivs[no].style.backgroundColor) {
9              var spans=subDivs[no].getElementsByTagName('SPAN');//[?] <span></span>
10             // [?] <span>TEST</span>
11             if (spans[0].innerHTML != spans[1].innerHTML) {
12                 allOk = false; //target
13                 break;
14             }
15         }
16     }
17     return allOk;
18 }
```



3. Test Generation Framework



Initialization Phase



Algorithm I: Initialization Phase

Input : JS file *fun.js* with FUT and type annotation

Output : Tuple (*cfg*, *branches*, *cinfo*, *ifun*, *sig*)

```
1 Function Initialize(fun.js)
2   (ast, sig)  $\leftarrow$  ParseFuncAndSig(fun.js)
3   cinfo  $\leftarrow$  GetConstantInfo(ast)
4   nast  $\leftarrow$  NormalizeAST(ast)
5   ifun  $\leftarrow$  Instrument(nast)
6   cfg  $\leftarrow$  BuildCFG(nast)
7   branches  $\leftarrow$  GetBranches(cfg)
8   return (cfg, branches, cinfo, ifun, sig)
```



Supported Types

Type Annotation

```
/*t dom : bool : int : float : string : [int] */
```

- ▶ primitive types: bool, int, float, sting
- ▶ arrays
- ▶ DOM
- ▶ could be extended to objects

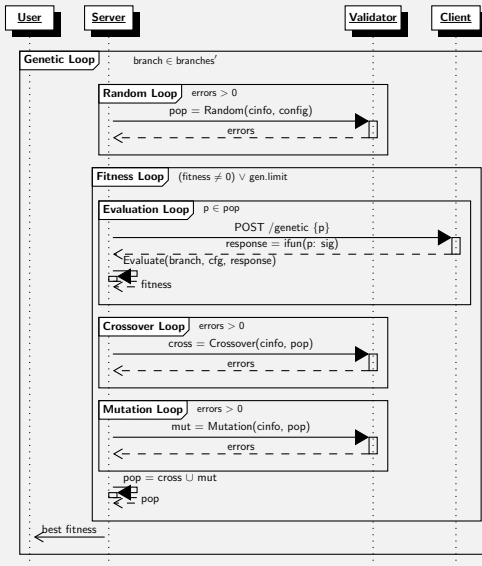


Instrumentation

- ▶ **trace** records the sequence of executed statements of the FUT
- ▶ **branchDistance** contains the distance from the target branch
- ▶ **loopMap** captures the upper bound for the number for-loop iterations



Genetic Phase



HTML Generation

Random

- ▶ DSL for the generation of syntactically valid HTML documents composed of arbitrary **tags** and **attributes**
- ▶ multiple options for the parameterization: tree width and depth, tags frequency, etc.

GA operations

- ▶ **crossover** two HTML trees at a randomly chosen node
- ▶ HTML tree **mutations**: *NewTree*, *DropTree* and *ShuffleAttributes* (e.g. 'id' and 'class')



Fitness Function (FF)

FF for a node

$$F(n) = approach_level + \begin{cases} 1/2 * (\frac{branch_distance}{1+branch_distance}) & \text{if no exception} \\ 1 & \text{otherwise} \end{cases}$$

- ▶ **approach_level** is the number of decision nodes between the target and the problem node (in JS every node can be exceptional)
- ▶ **branch_distance** measures the deviation explicitly in the problem node

FF for a node sequence

$$F^*(n_b, n_x) = (F(n_b), F(n_x))$$

- ▶ n_b is a target branch node
- ▶ n_x is a terminal exit node
- ▶ Can be generalized to: $F^*(n_1, n_2, \dots, n_k) = (F(n_1), F(n_2), \dots, F(n_k))$



GA with Restart

Problem

GA sometimes reaches a local minimum and stagnates due to flag variables, nested predicates, or unstructured control flow.

- ▶ Common solution is to incorporate data dependency into the search, e.g. **chaining approach** [FK96]
- ▶ Our approach is CFG-based because JS is a dynamic language which is hard to analyze for data dependency
- ▶ We suggest to restart GA with a new target when the fitness progress stops during a configured **history window**
- ▶ The **new target** consists of the original target prefixed by a dominating CFG node



4. Empirical Evaluation



Genetic Algorithm Configurations

Variations of Generation Algorithms

- ▶ \mathbb{R} random
- ▶ \mathbb{G} pure genetic
- ▶ \mathbb{G}_{10} genetic with restart

Parameter Name	\mathbb{R}	\mathbb{G}	\mathbb{G}_{10}
Population size	50	50	50
Archive size	1	25	25
Maximum number of generations	200	200	200
Crossover rate	0	0.5	0.5
Mutation rate	0	0.5	0.5
History window size	-	-	10



Case Studies

case-study	function	loc	c	d	cc	dom	id	tag	class
sudoku	helpMe(int,int)	14	2	3	3	+	+	+	-
sudoku	isGameFinished()	10	3	3	4	+	+	+	+
sudoku	newGame()	9	1	2	2	+	+	+	+
sudoku	revealAll()	8	0	2	1	+	+	+	-
sudoku	shuffleBoard(int,int)	23	2	3	3	+	-	+	-
phormer	toggleInfo(string)	16	3	1	4	+	+	-	-
hotel RS	isValidCard([int])	17	2	2	5	-	-	-	-
hotel RS	isValidVISA([int])	6	3	1	6	-	-	-	-
apophis	initShields([int],int,int)	6	0	1	1	+	+	-	-
bingbong	brickJiggler(int,int,[int],[int],[int],[int])	7	1	1	2	+	+	-	-
bingbong	doPaddlePower(int,int)	15	2	1	3	+	+	-	-
bingbong	initBricks(int,[int],[int],[int],[int],int,[string])	70	12	4	13	+	+	-	-
burncanvas	do_draw(int,int,int,int,int,int,int)	40	12	2	14	-	-	-	-
mathjs	prob_gamma(float)	57	8	2	16	-	-	-	-

► if $CC < 10$ then the function is **easy to test** else **difficult**



Research Questions

- RQ1 What is the branch coverage?
- RQ2 What is the coverage time per branch?
- RQ3 Are the results statistically significant?
- RQ4 What is the branch coverage of **Confix**?



5. Results



RQ1: What is the branch coverage?

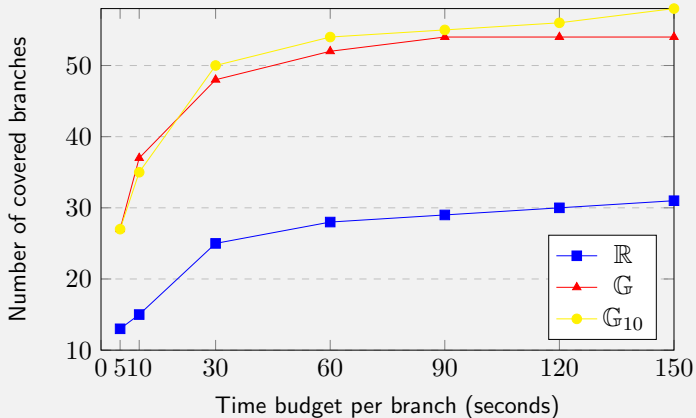
Table: Branch coverage (%)

TYPE	\mathbb{R}	\mathbb{G}	\mathbb{G}_{10}
simple (23)	79	97	100
difficult (33)	58	94	100
global (56)	63	95	100

Across all subjects, the \mathbb{G}_{10} algorithm achieved 100% branch coverage, with \mathbb{G} in the second place with 95% coverage, and, finally, \mathbb{R} with 63% coverage.



RQ1: Branch Coverage Progress



G could be more suitable for rapid testing during development, whereas G_{10} for integration



RQ2: What is the coverage time per branch?

Table: Average execution time per brunch (sec.)

TYPE	\mathbb{R}	\mathbb{G}	\mathbb{G}_{10}
simple (23)	37	9	7
difficult (33)	112	56	25
global (56)	88	39	19

\mathbb{G}_{10} outperformed both \mathbb{G} and \mathbb{R} with an average execution time per branch of 19, 39 and 88 seconds, respectively.

On average, one algorithm iteration took one second for \mathbb{R} and \mathbb{G}_{10} , \mathbb{G} performed somewhat worse at 1.4 seconds.



RQ3: Are the results statistically significant?

TYPE	R/G			R/G ₁₀			G/G ₁₀		
	L	M	S	L	M	S	L	M	S
simple (23)	11	12	13	11	13	13	1	1	1
difficult (33)	22	24	26	22	23	26	2	2	4
global (56)	33	36	39	33	36	39	3	3	5

- ▶ Use the non-parametric Mann-Whitney U-test and the Vargha-Delaney \hat{A}_{12} statistics for measuring statistical significance ($\alpha = 0.05$) and effect size [AB11]
- ▶ L - large (0.71), M - medium (0.64), S - small (0.56)

Both G and G_{10} largely outperform R in 50% cases generally across the board and 67% on the difficult functions.



RQ4: What is the branch coverage of Confix?

case-study	function	#BR	#C (weak)	#C (strong)	#tests	time (sec.)
sudoku	helpMe	5	4 (80%)	4 (80%)	2	5
sudoku	isGameFinished	5	2 (40%)	2 (40%)	2	5
sudoku	newGame	3	3 (100%)	3 (100%)	4	6
sudoku	revealAll	2	2 (100%)	0 (0%)	6	11
sudoku	shuffleBoard	7	5 (71%)	0 (0%)	2	5
phormer	toogleInfo	4	2 (50%)	2 (50%)	3	5
apophis	initShields	1	0 (0%)	0 (0%)	1	6
bingbong	brickJiggler	2	0 (0%)	0 (0%)	1	3
bingbong	doPaddlePower	4	2 (50%)	2 (50%)	1	4
bingbong	initBricks	18	3 (17%)	0 (0%)	1	3

The choice between a concolic and search-based approach is a trade-off between a labour-intensive modelling and execution time, respectively, where both can reinforce each other.



Threats to Validity

- ▶ **construct validity**: measured only branch coverage and execution time
 - ▶ it doesn't indicate fault finding capability
 - ▶ use only “natural” oracles such as exception
 - ▶ ignore test case size
- ▶ **internal validity**: choice of the initial GA configuration
- ▶ **conclusion validity**: stochastic nature of the experiment
- ▶ **external validity**: limited set of experimental subjects



6. Future Work and Conclusions



Future Work

- ▶ the whole test suite generation based on multi-objective optimization to balance coverage and test suite size [PKT17]
- ▶ mutation driven test generation [FZ12]; should allow us to evaluate fault finding capability
- ▶ combine search-based with concolic test generation for JavaScript, e.g. integrate Jalangi [SKBG13] and Confix [FMW15]
- ▶ conduct large evaluation of JEDI; it requires the extension of arbitrary input objects and functional arguments [CH11, SPRT18]



Conclusions

- ▶ introduced a novel search-based JS unit testing framework, called **JEDI**, which is able to generate arbitrary DOM inputs
- ▶ presented a test generation algorithm — “genetic with restart”; it is capable of escaping plateaus by concretizing the search target
- ▶ conducted an empirical validation followed by the significance study, which has confirmed the effectiveness and efficiency of our framework in branch coverage testing



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The End

Thanks for attention!

Questions?



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