



# Towards Better Semantics Exploration for Browser Fuzzing

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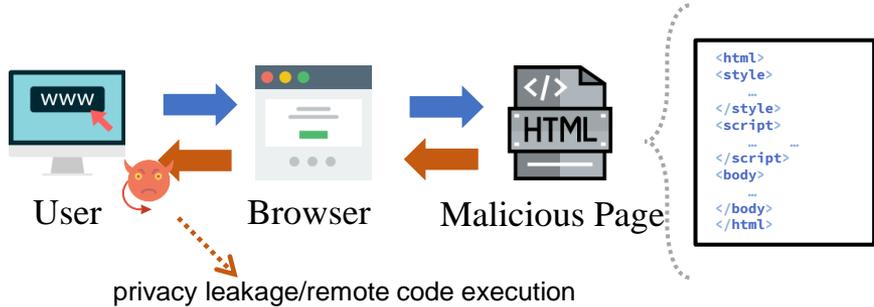
<sup>2</sup>Harbin Institute of Technology, China

<sup>3</sup>National University of Defense Technology, China

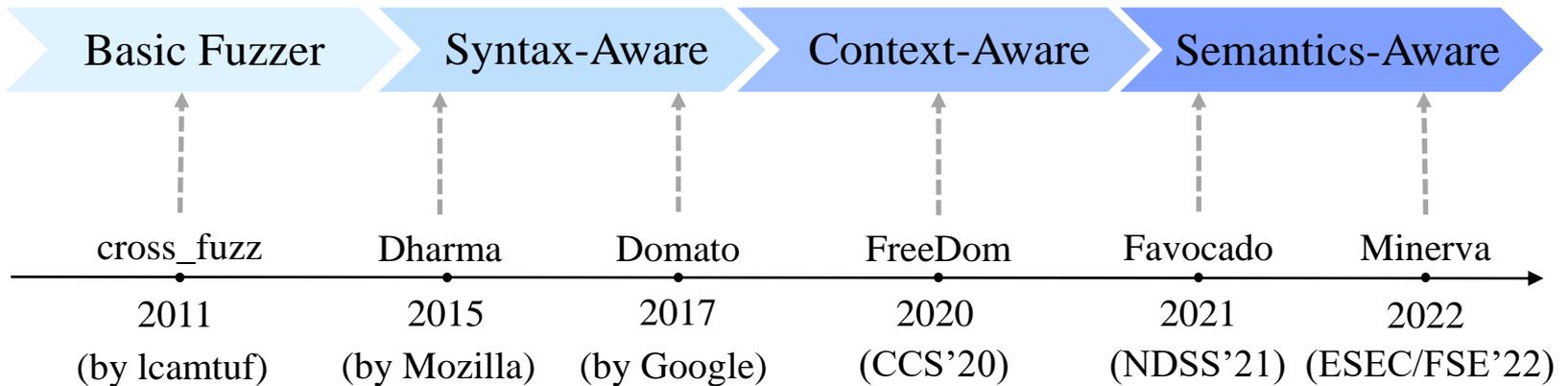
<sup>4</sup>Beijing Institute of Control Engineering, China

# Browser Fuzzing: A Decade of Research

If a browser is vulnerable ...



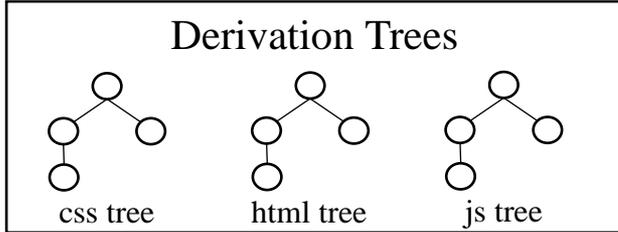
Goal of fuzzers: Generate html files that explore **browser states** and, with luck, trigger **bugs**.



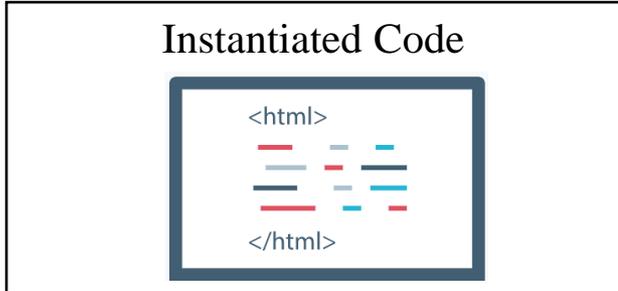
# How did browser fuzzers work?



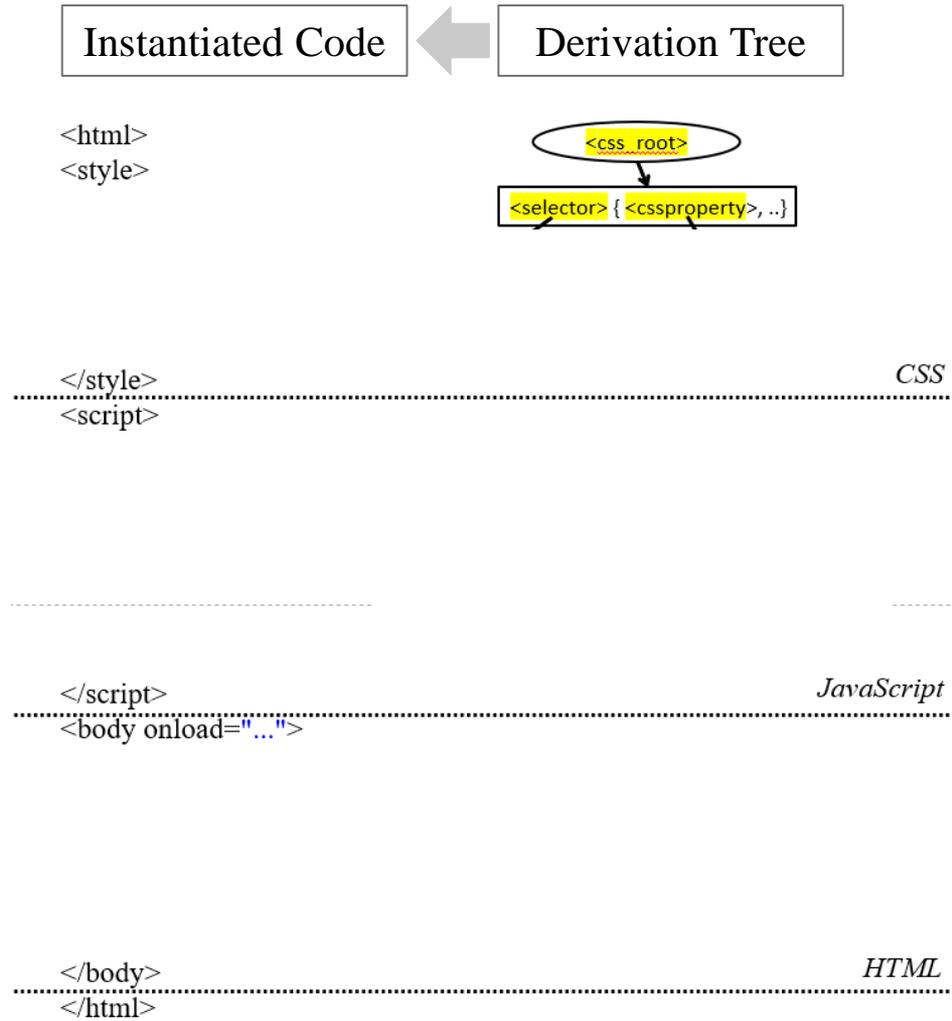
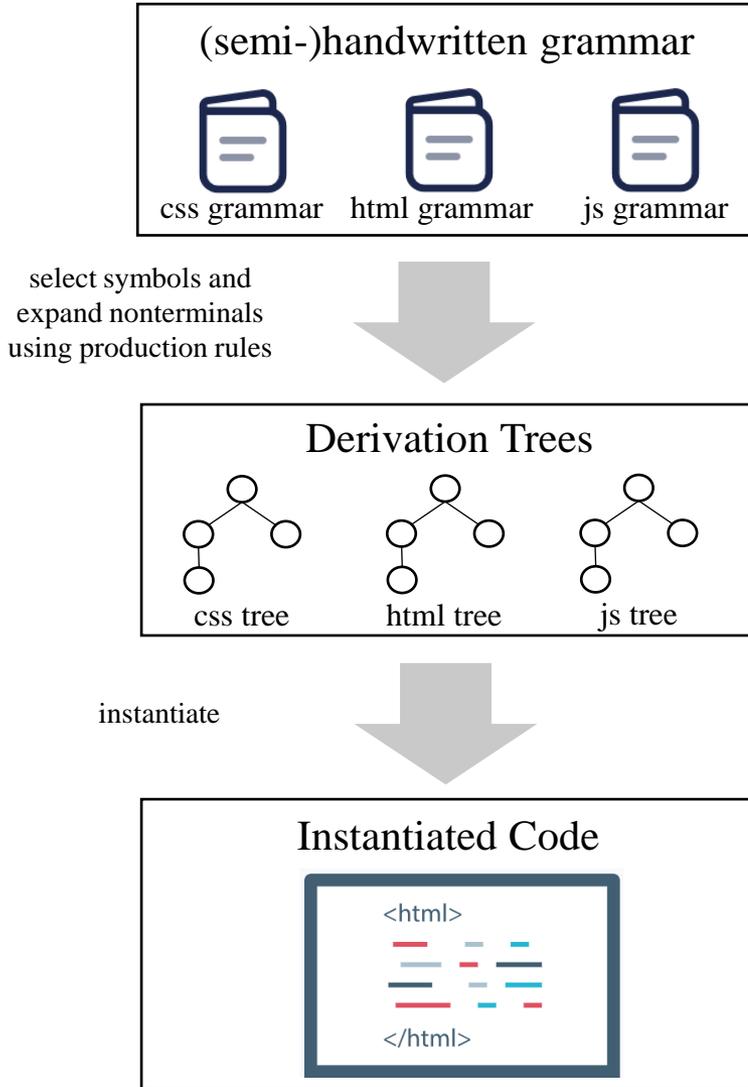
select symbols and  
expand nonterminals  
using production rules



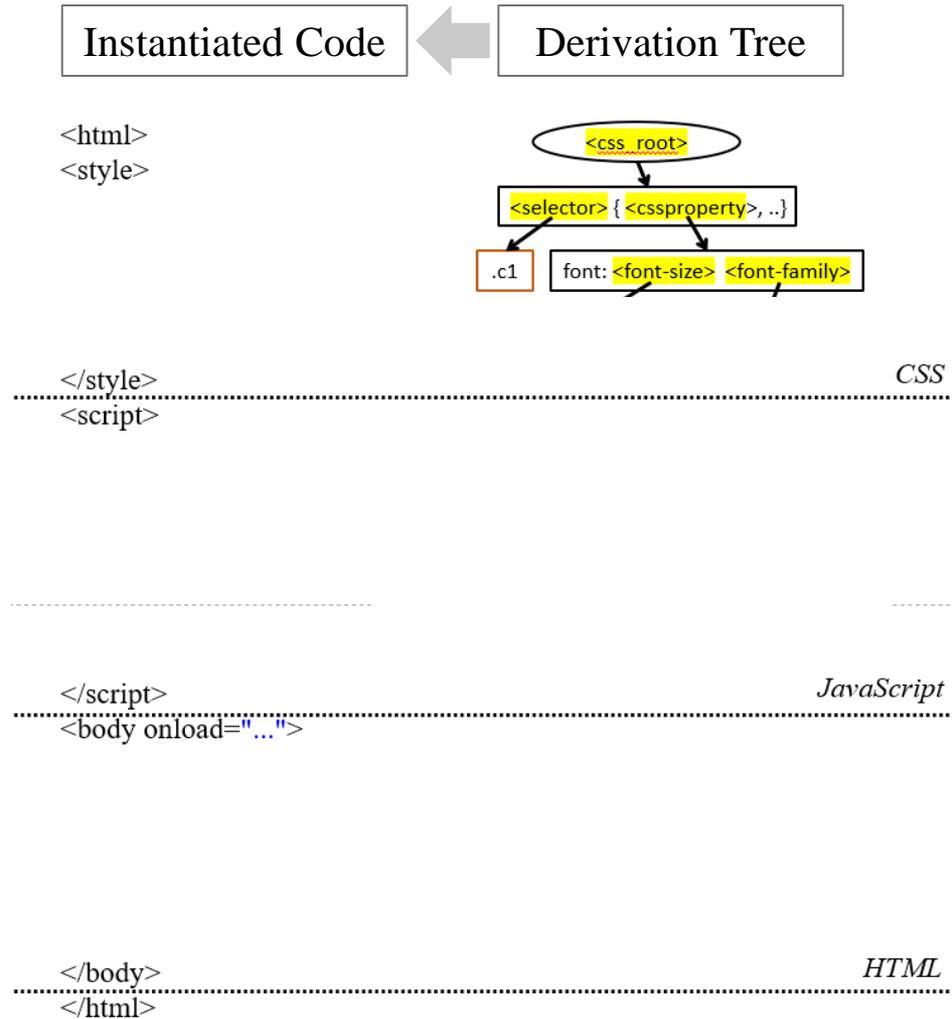
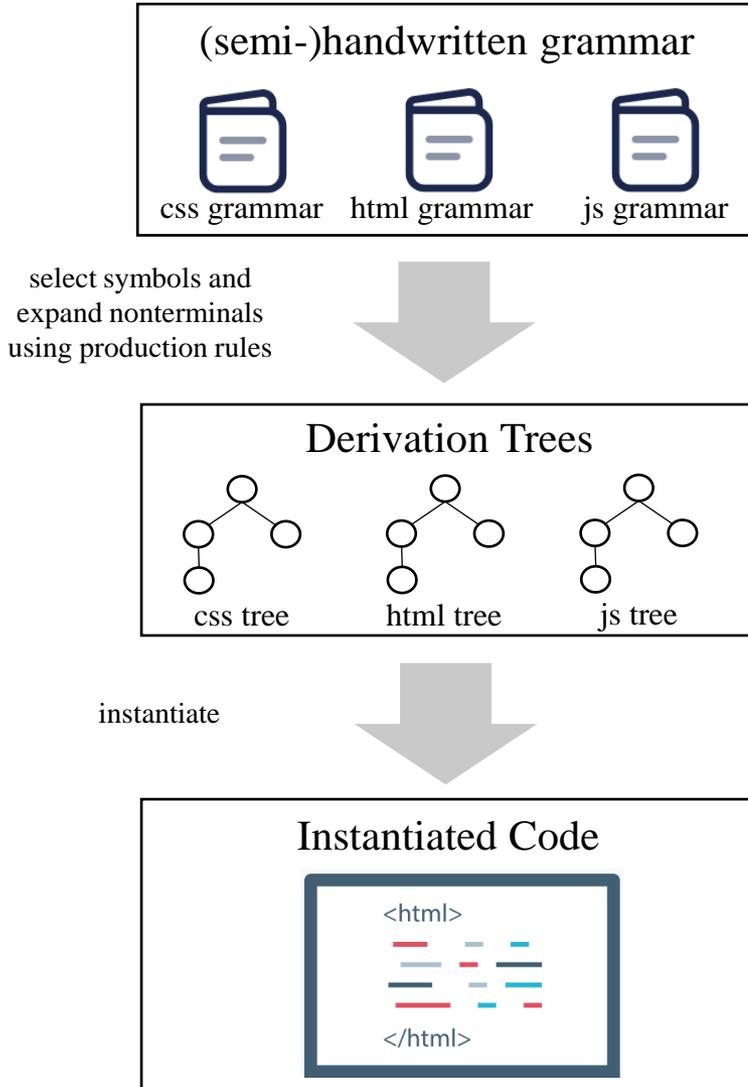
instantiate



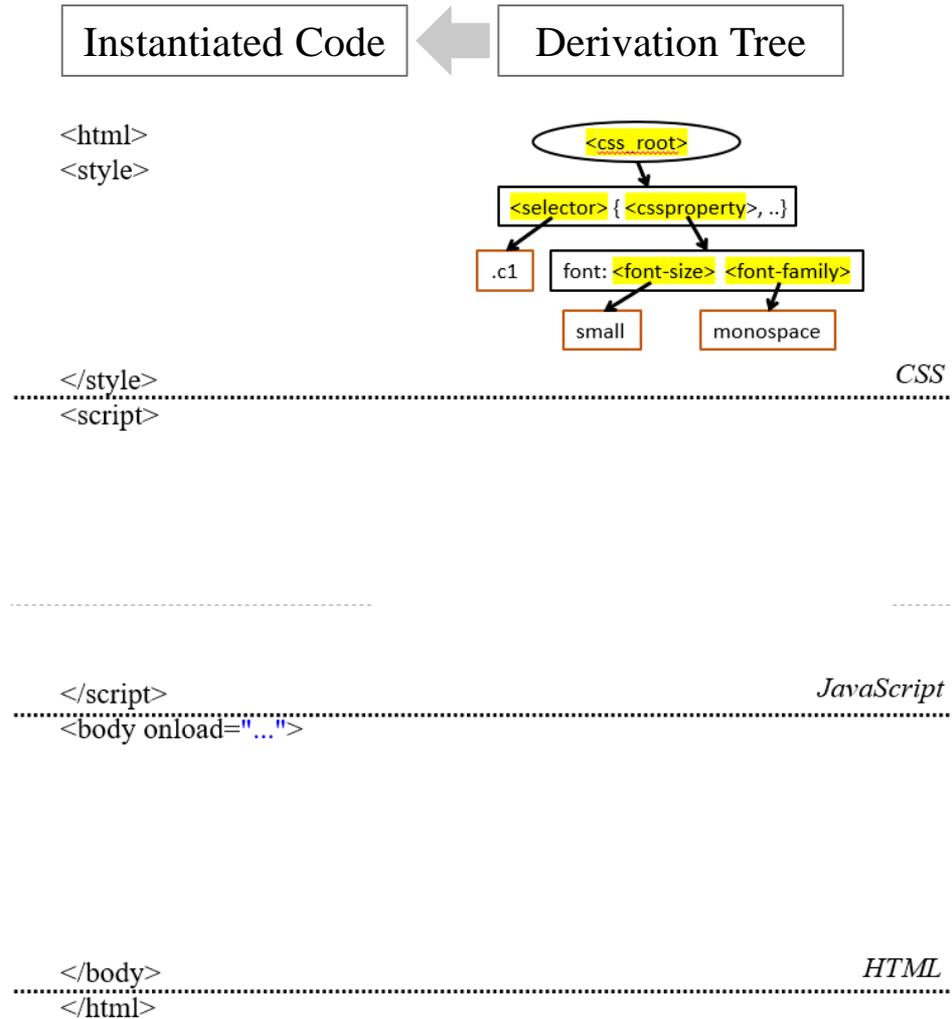
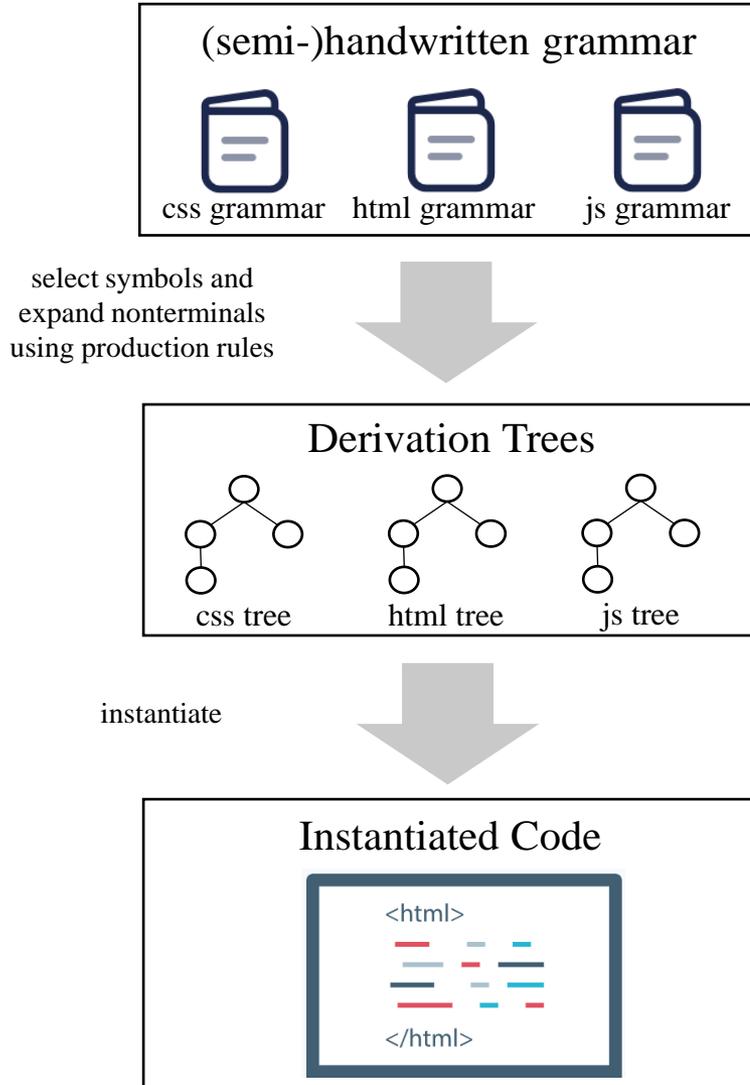
# How did browser fuzzers work?



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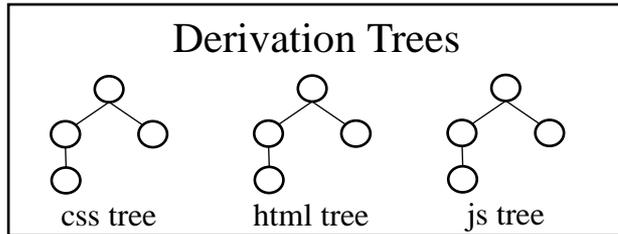
# How did browser fuzzers work?



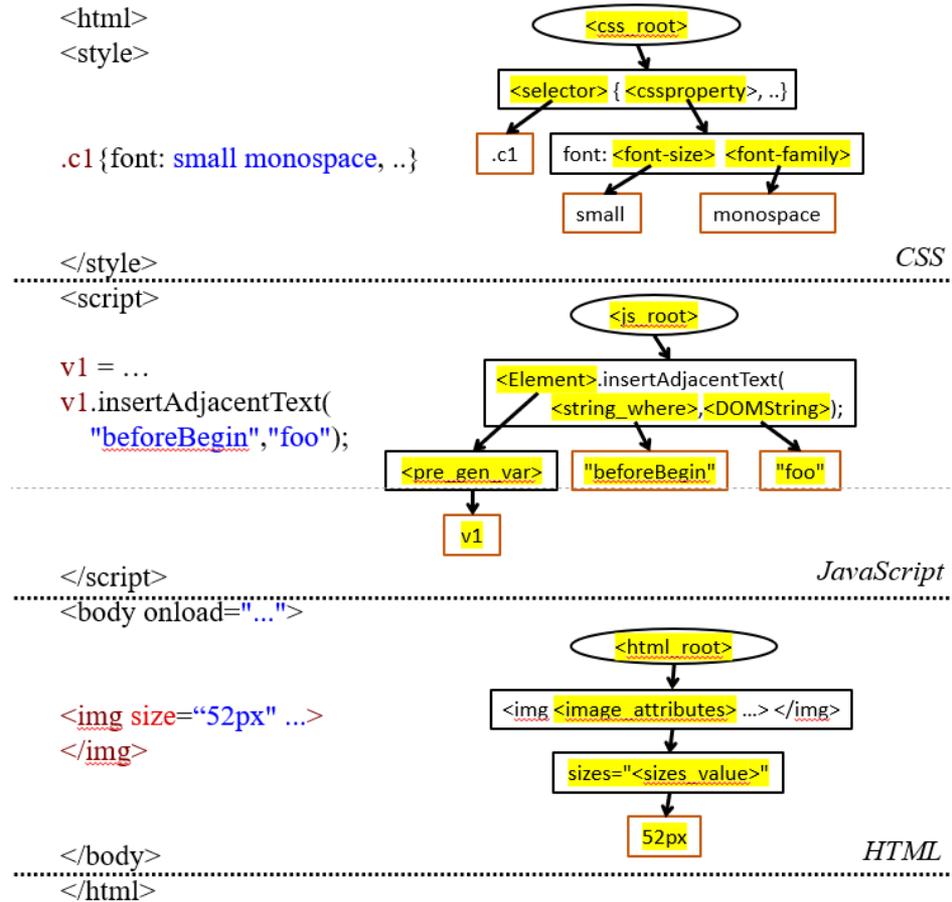
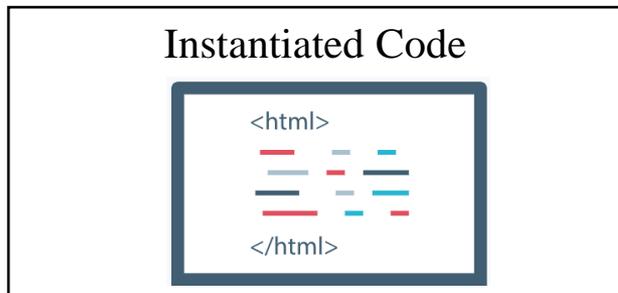
# How did browser fuzzers work?



select symbols and  
expand nonterminals  
using production rules



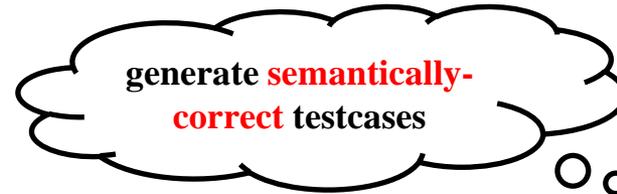
instantiate



A good browser fuzzer should be able to ...



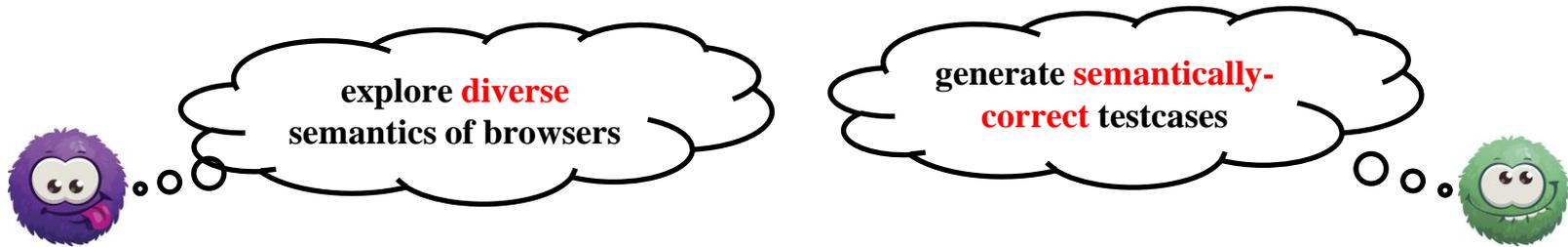
explore **diverse**  
semantics of browsers



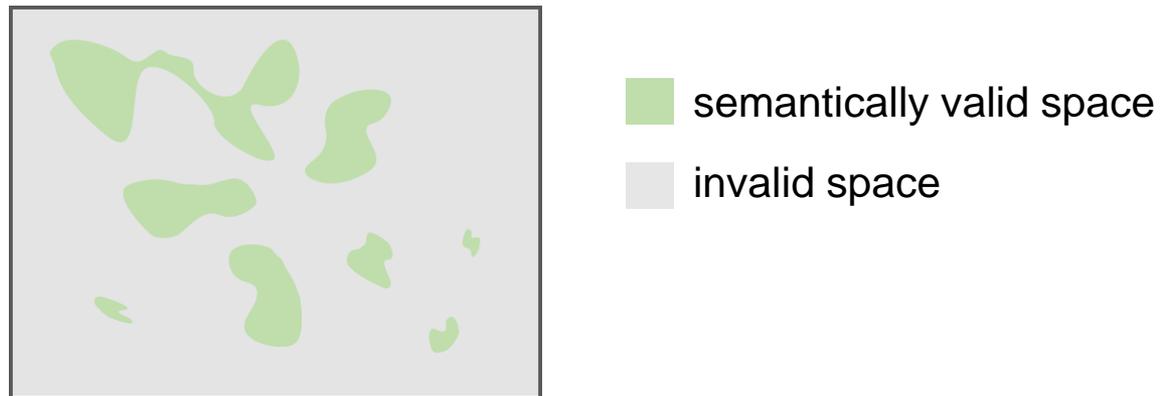
generate **semantically-**  
**correct** testcases



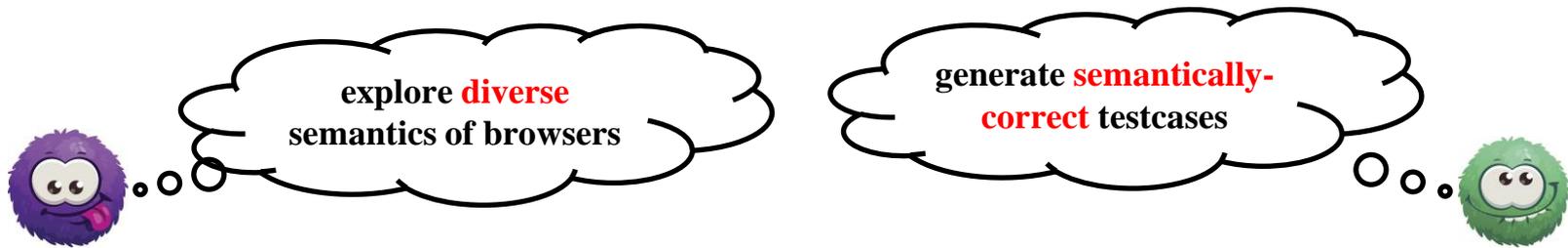
A good browser fuzzer should be able to ...



Suppose this area presents the input space of a browser ...



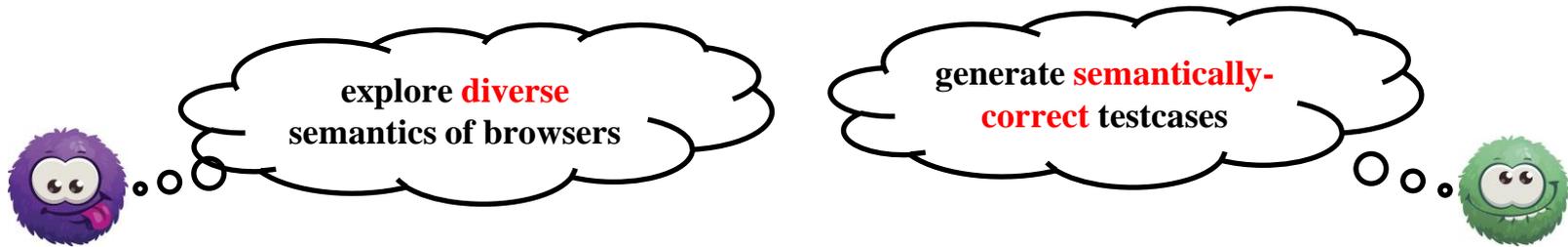
A good browser fuzzer should be able to ...



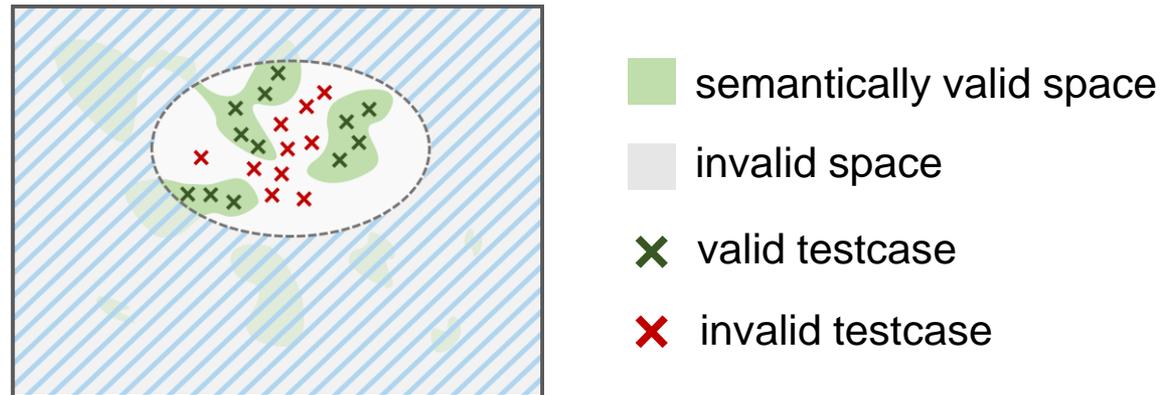
Ideally, a good fuzzer should generate testcases like ...



A good browser fuzzer should be able to ...



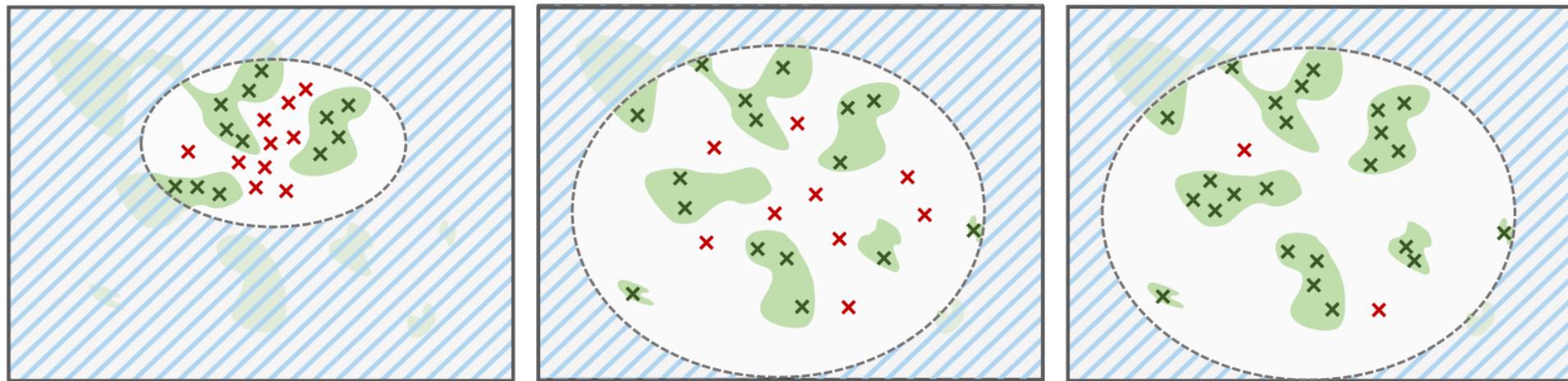
However, existing fuzzers generate testcases like ...



**Pitfalls:** handwritten grammars **limit the semantics exploration** of fuzzers, and still **cannot ensure semantic correctness**

# Towards Better Semantics Exploration for Browser Fuzzing

- Goal: automatically generate **quality grammars** to improve browser fuzzing
- workflow:
  - extract a preliminary grammar from **W3C standards**
  - refine the grammar based on the **semantic feedback** of browser executions

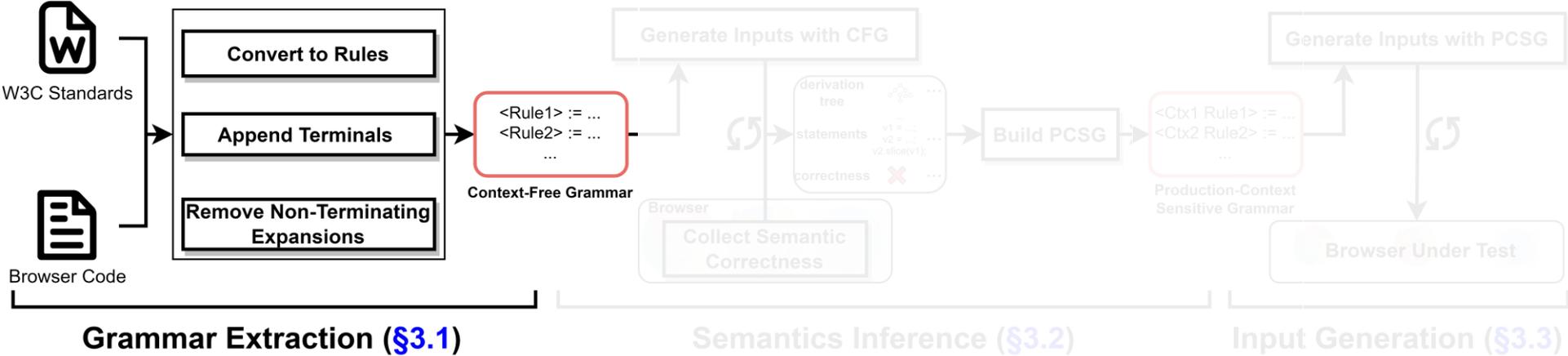


Fuzzing with handwritten grammar

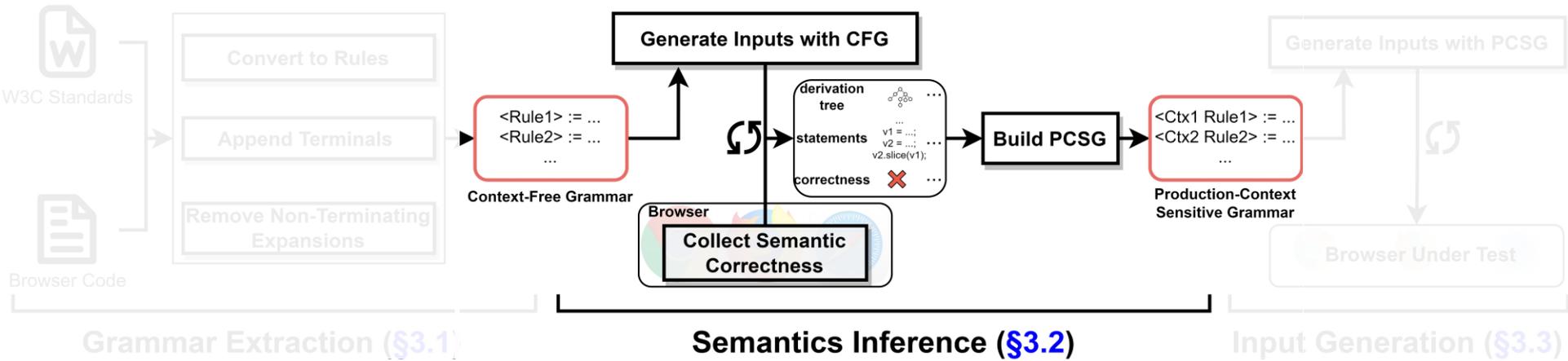
Fuzzing with W3C-augmented grammar

Fuzzing with refined grammar

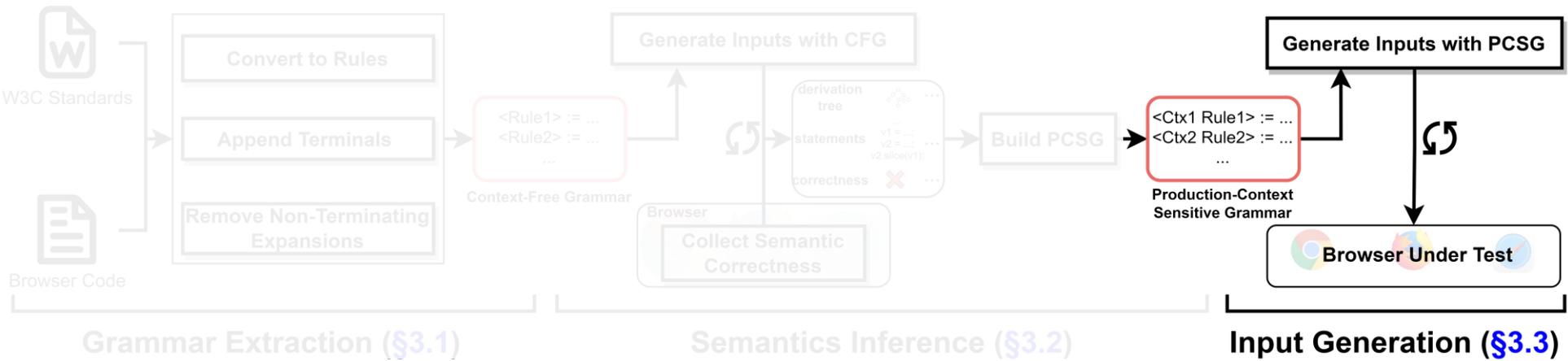
# Design Overview



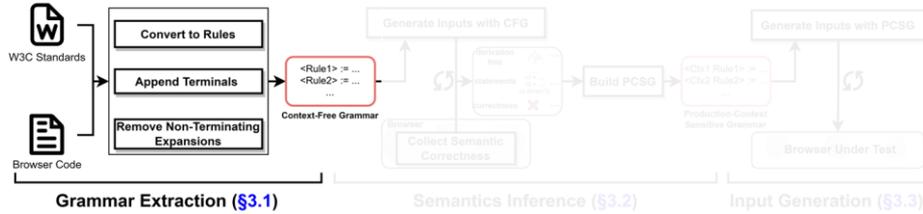
# Design Overview



# Design Overview



# Grammar Extraction



Context-Free Grammar  $G = (N, T, P, S)$

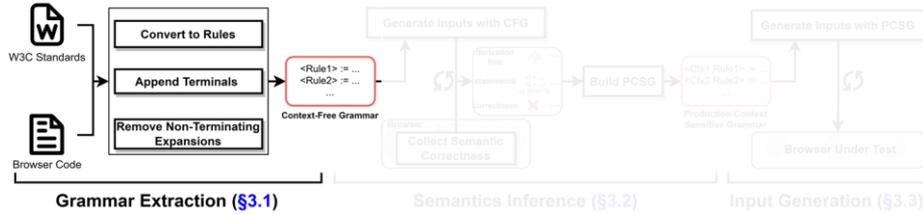
$N$ : a set of nonterminals

$T$ : a set of terminals disjoint from  $N$

$P$ : a finite relation in  $N \times (N \cup T)^k$ , each relation  $p$  in the form of  $\alpha \rightarrow \beta_1\beta_2 \cdots \beta_k$

$S$ : a designed start symbol

# Grammar Extraction



$\langle cssprop \rangle \rightarrow \langle fontprop \rangle$   
 $\rightarrow \langle alignprop \rangle$   
 $\rightarrow \dots$

**As many semantics as possible**

$\alpha \rightarrow \beta_1 \beta_2 \gamma \beta_3 \dots$   
 $\gamma \rightarrow \beta_4 \mu \beta_5 \dots$   
 $\mu \rightarrow \beta_6 \alpha \dots$

**No infinite loops in expansions**

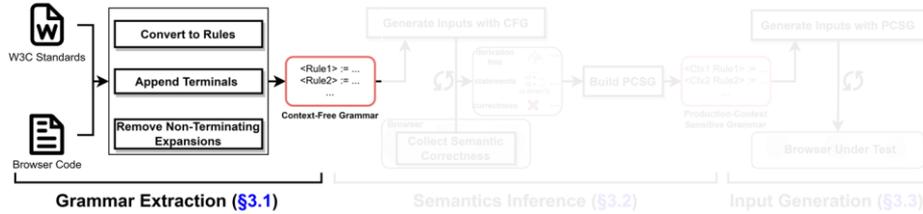
$\langle n\_term \rangle \rightarrow \langle n\_term \rangle \dots$   
 $\rightarrow \dots$   
 $\rightarrow term_1 term_2 \dots term_n$

**Expansions to terminal-only expressions**

Requirements of the extracted CFG ...

- production rules cover diverse semantics
- every expansion is not non-terminating
- every nonterminal can be expanded to a terminal-only expression

# Grammar Extraction



Heuristic strategies to convert W3C standards to production rules

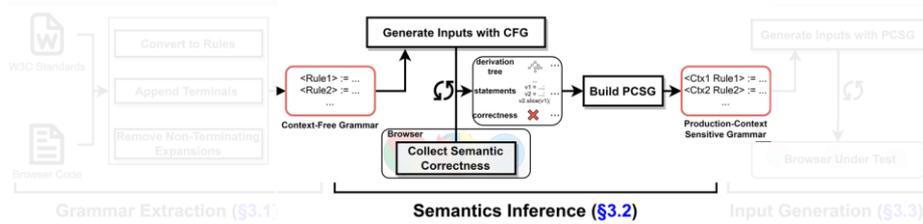
Recursively expanding all nonterminals to detect only-loop expansions

Static dataflow analysis on browser source code to find proper terminals

Requirements of the extracted CFG ...

- ✓ production rules cover diverse semantics
- ✓ every expansion is not non-terminating
- ✓ every nonterminal can be expanded to a terminal-only expression

# Semantics Inference



Context-Free Grammar  $G = (N, T, P, S)$



Production-Context Sensitive Grammar  $G' = (\bar{N}, \bar{T}, \bar{P}, \bar{S})$

$\bar{N}$ : identical to  $N$

$\bar{T}$ : identical to  $T$

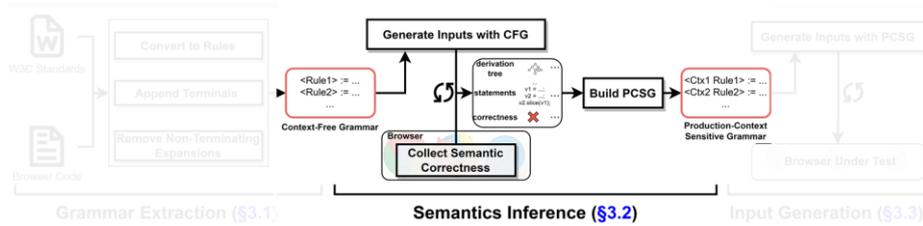
$\bar{P}$ : each relation  $p$  in the form of  $[\mathbb{C}_p]\alpha \rightarrow \beta_1\beta_2 \cdots \beta_k$

$\bar{S}$ : identical to  $S$

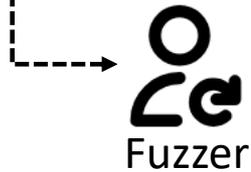
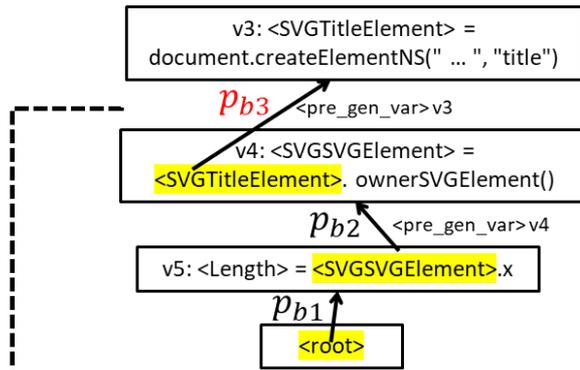
$\mathbb{C}_p$  is a context-checking function for  $p$ ,  $\mathbb{C}_p(ctx) = \begin{cases} \text{true} & \text{likely semantic correct} & \checkmark \\ \text{false} & \text{unlikely semantic correct} & \times \end{cases}$



# Semantics Inference



## Example

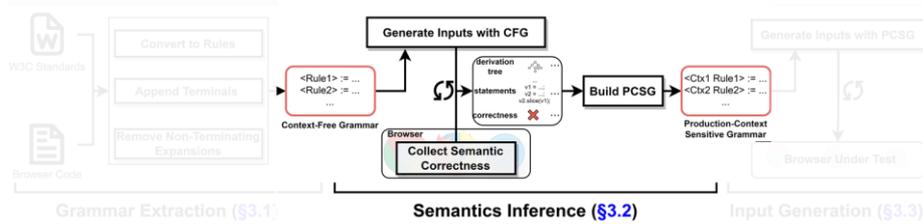


: I would like to know if  $p_{b3}$  is a right choice under this context

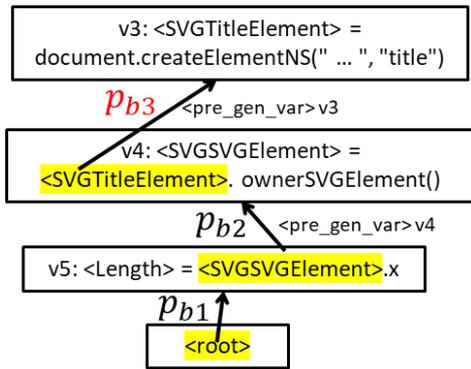


:  $\mathbb{C}_{p_{b3}}([p_{b1}, p_{b2}])$  returns false, so it is likely to cause a semantic error

# Semantics Inference



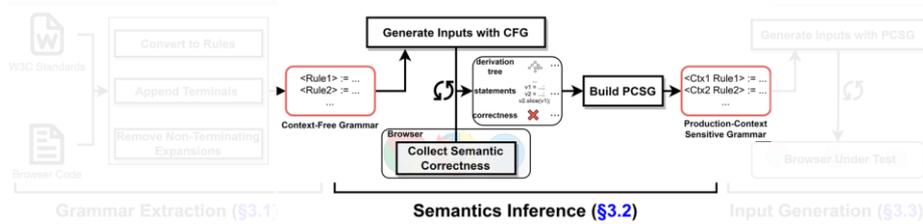
## Example



```
// v3 is a normal SVGTitleElement element
v3=doc.createElementNS("...", "title");
// v4 is null because v3 is the outermost
v4=v3.ownerSVGElement();
// misuse error because v4 is null
v5=v4.x; 💣
```

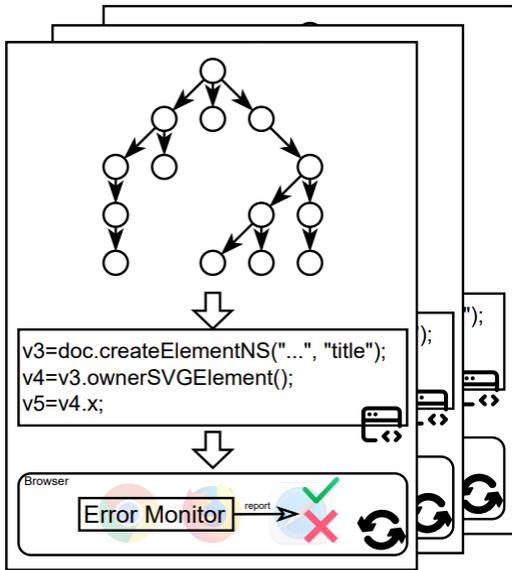
Fact: the generated testcase will triggers a semantic error if the fuzzer selects  $p_{b3}$

# Semantics Inference

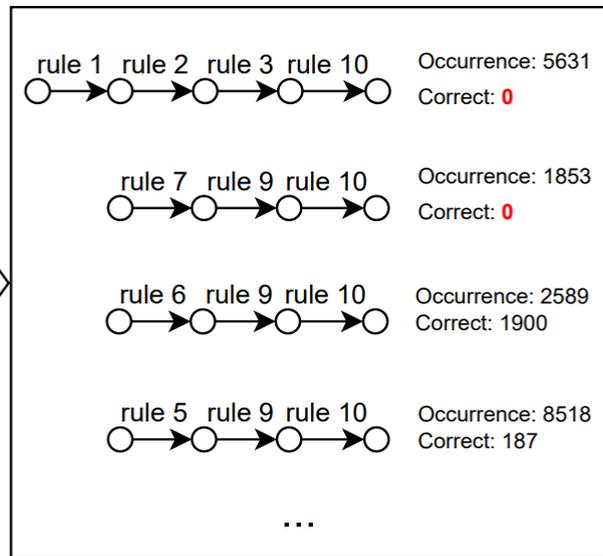


How can we know  $\mathbb{C}_p$  for each production rule  $p$ ?

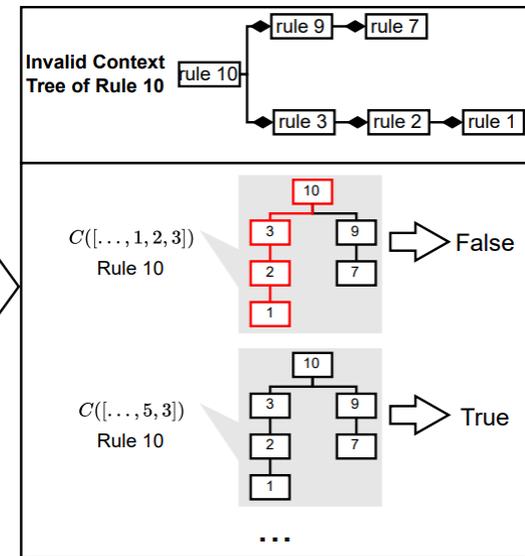
- construct a tree-based data structure based on **browsers' feedback**



Execution Results of generated statements

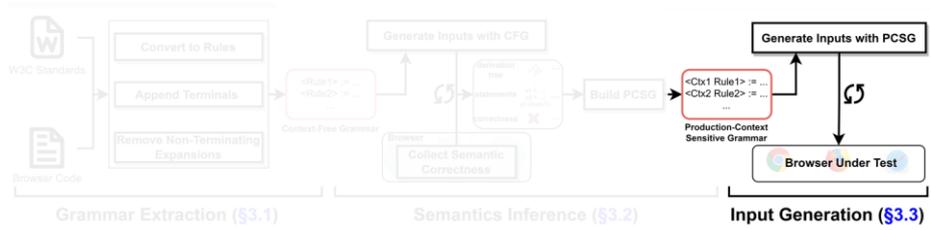


Occurrence statistics of parent-child rule chains

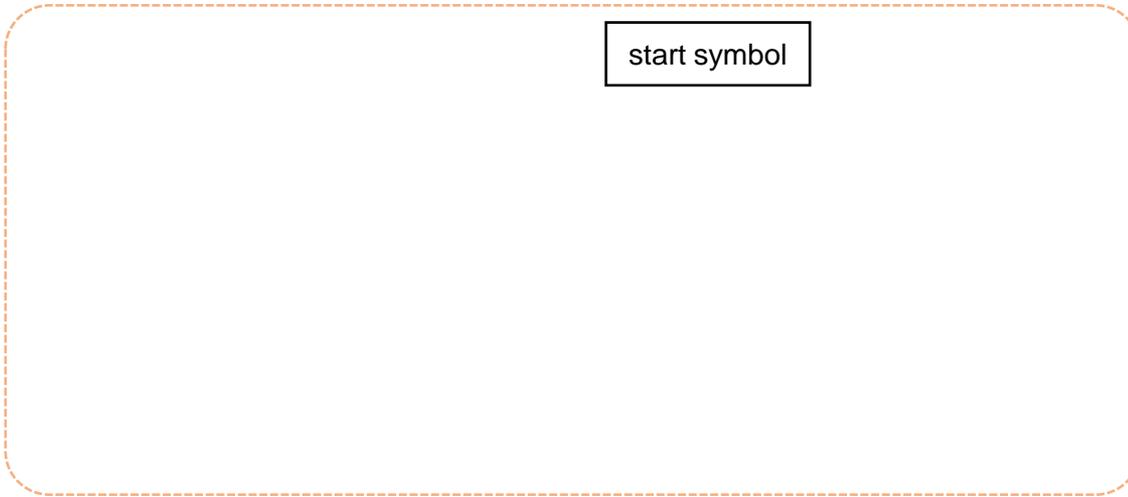


Construction of context-checking function

# Input Generation

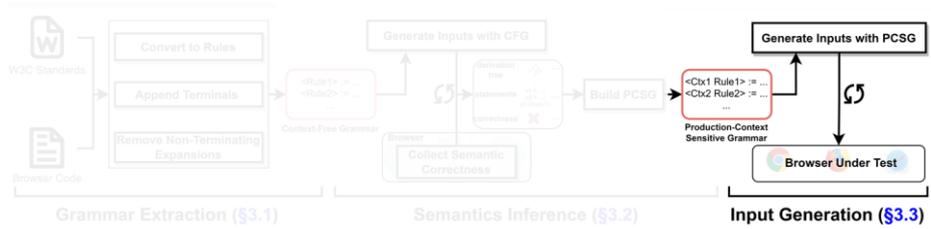


Derivation  
Tree

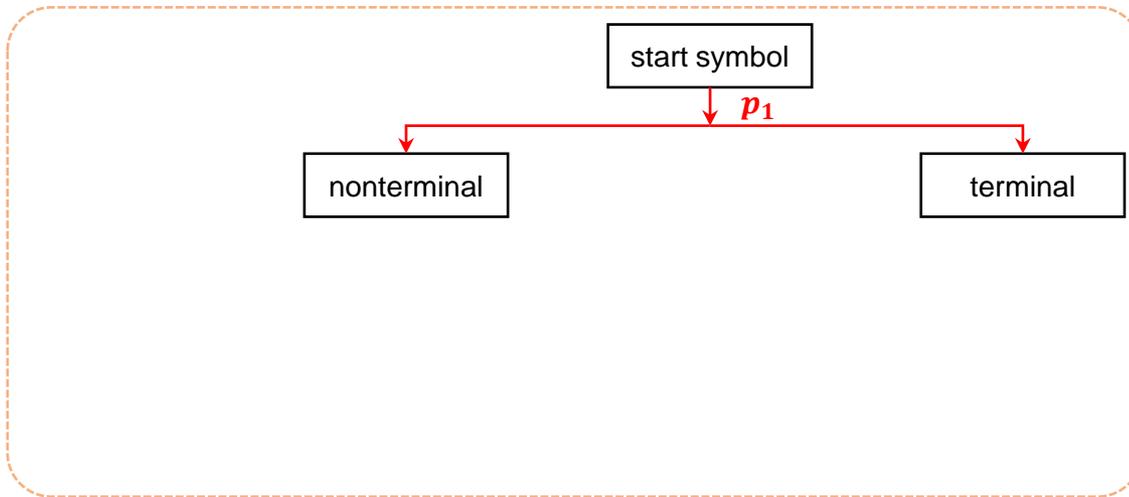


CTX =  
{ }

# Input Generation



Derivation  
Tree

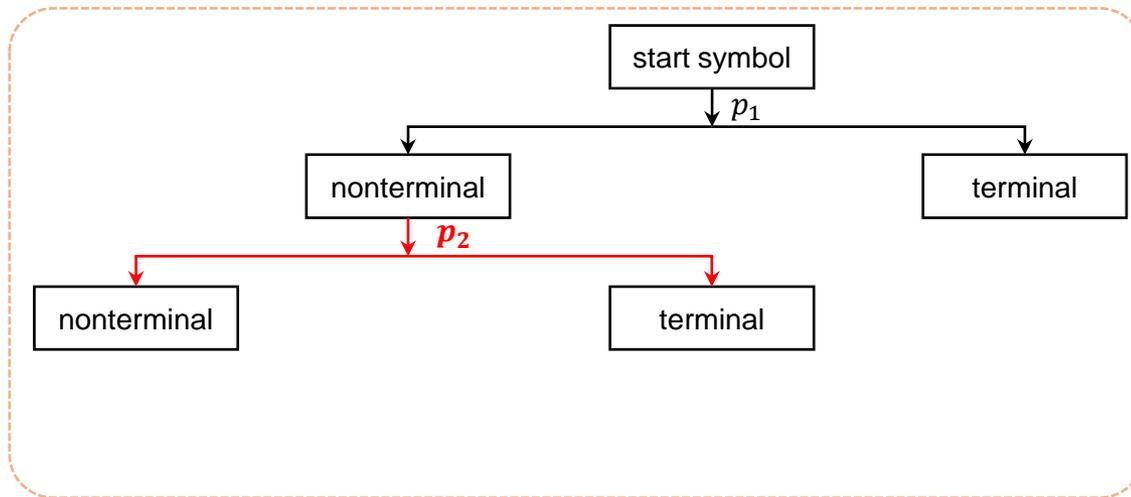
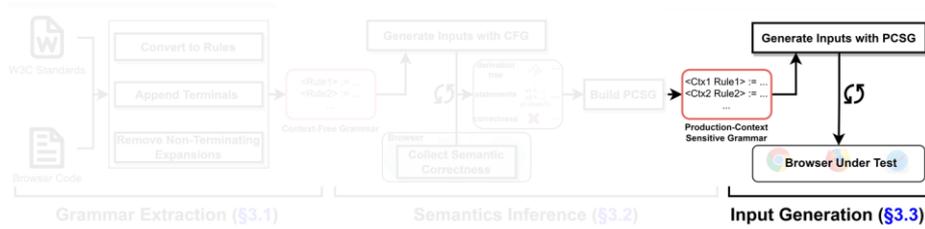


CTX =  
{ }

randomly select a rule

$\mathbb{C}_{p_1}([\ ] == true?$

# Input Generation



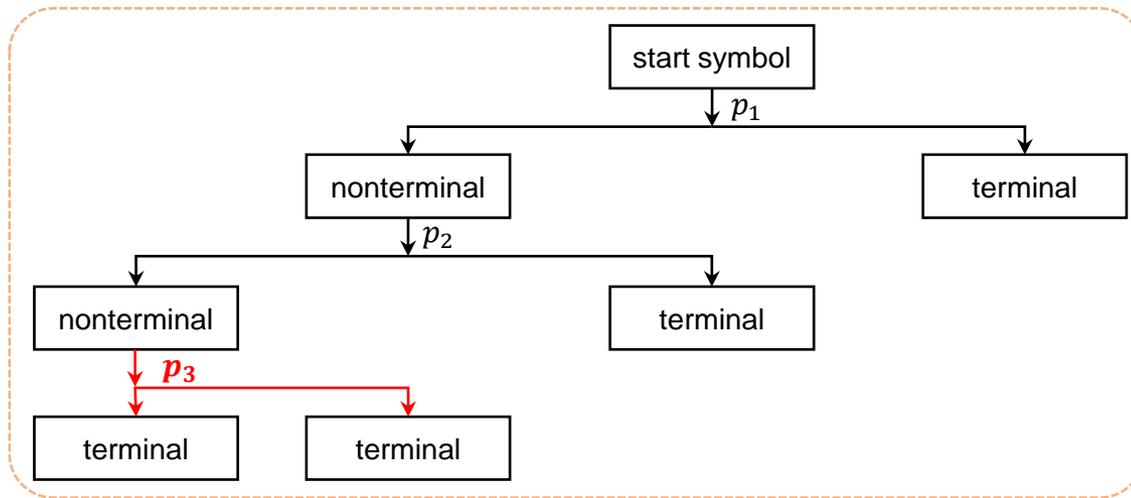
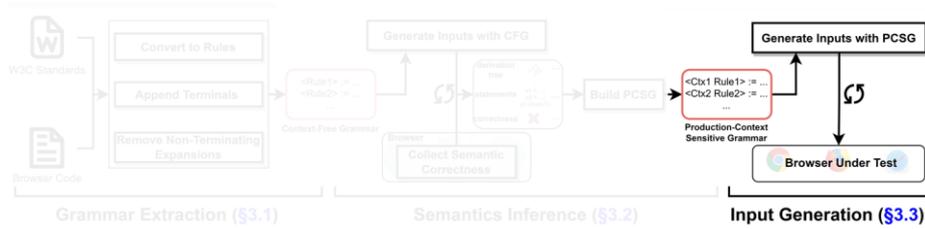
Derivation  
Tree

CTX =  
 $\{p_1\}$

randomly select a rule

$\mathbb{C}_{p_2}([p_1]) == true?$

# Input Generation



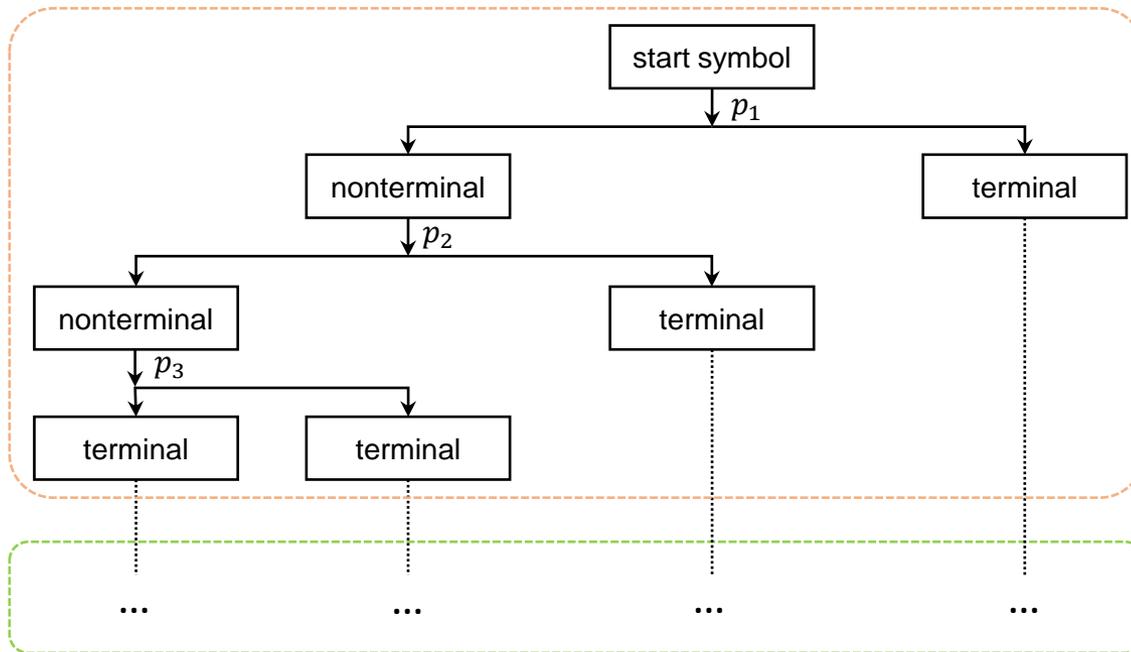
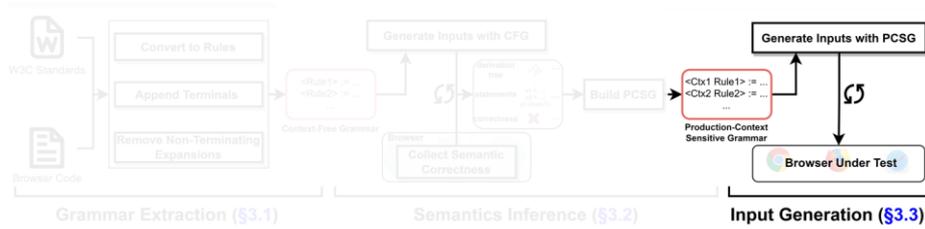
Derivation  
Tree

CTX =  
 $\{p_1, p_2\}$

randomly select a rule

$\mathbb{C}_{p_3}[p_1, p_2] == true?$

# Input Generation



Derivation  
Tree

Testcase

CTX =  
{ $p_1, p_2, p_3$ }

# Evaluation

## highlight

- found **62** real-world bugs in Safari, Chrome, and Firefox, out of which **40** were confirmed with **10** CVEs
- Compared to existing browser fuzzers
  - 6.03% - 277.80%** improvement in branch coverage
  - 3.56% - 160.71%** improvement in semantics correctness rate
- Introduced roughly **3.57% overhead** during code generation

ID	Browser	Bug Type	Bug Location	Status	
1	Safari (WebKit)	Use After Free (9 bugs)	WebCore::RenderLayer	CVE-2023-25361	
2			WebCore::RenderLayer	CVE-2023-25358	
3			WTF::TypeCastTraits	CVE-2023-25359	
4			WebCore::RenderLayer	CVE-2023-25362	
5			WebCore::RenderLayer	CVE-2023-25363	
6			WebCore::AXObjectCache	CVE-2022-26710	
7			WebCore::IDBServer::UniqueIDBDatabase	CVE-2022-26709	
8			WebCore::TextureMapperLayer	CVE-2022-30294	
9			WebCore::RenderLayer	CVE-2023-25360	
10		Buffer Overflow (1 bug)	WebCore::TextureMapperLayer	CVE-2022-30293	
11			WebCore::RenderLayerCompositor	Confirmed	
12			WebCore::RenderLayerCompositor	Confirmed	
13		Null Dereference (6 bugs)	WTF::Atomic	Fixed	
14			WebCore::WebGLRenderingContextBase	Fixed	
15			WebCore::RenderTreeBuilder	Fixed	
16			WebCore::Node	Fixed	
17		Abnormal Crash (1 bug)	WebCore::AccessibilityObject	Fixed	
18		Out Of Memory (1 bug)	gin::V8Initializer	Confirmed	
19		Null Dereference (2 bugs)	mojom::MojoAudioOutputIPC	Fixed	
20			blink::RendererAudioOutputStreamFactory	Fixed	
21	Chrome (Blink)	SIGILL_ILLLLOPN (1 bug)	blink::NGPhysicalLineBoxFragment	Fixed	
22		SEGV_MAPERR (1 bug)	blink::ViewTransitionStyleTracker	Duplicated	
23			blink::EventHandlerRegistry	Confirmed	
24			blink::ClampScrollbarToContentBox	Confirmed	
25		Assertion Failure (27 bugs)	blink::LayoutBox	Duplicated	
26			blink::ComputeContentSize	Reported	
..			..	..	
49				blink::LayoutFlowThread	Confirmed
50			Abnormal Crash (3 bug)	webrender::picture	Confirmed
51		nsCSSFrameConstructor		Confirmed	
52		mozilla::ipc		Reported	
53	Firefox (Gecko)	Null Dereference (1 bug)	mozilla::gfx	Confirmed	
54			mozilla::SVGUtils	Confirmed	
55			mozilla::dom	Duplicated	
56		Assertion Failure (9 bugs)	mozilla::nsLineLayout	Confirmed	
57			mozilla::nsDisplayItem	Reported	
..		..	..		
62			mozilla::nsFieldSetFrame	Confirmed	

Total 62 bugs; 13 were duplicated with others; 40 were confirmed, out of which 27 fixed with 10 CVE

Table 6. Coverage improvements of SAGE compared to other browser fuzzers in 24 hours over five runs.

Browser	v.s. Domato			v.s. FreeDom			v.s. Favocado			v.s. Minerva		
	max-impr	avg-impr	min-impr	max-impr	avg-impr	min-impr	max-impr	avg-impr	min-impr	max-impr	avg-impr	min-impr
WebKitGTK-2.36	14.37%	13.88%	13.13%	18.17%	17.88%	17.66%	523.33%	444.83%	264.68%	7.48%	6.72%	6.01%
WebKitGTK-2.37	14.51%	13.87%	12.89%	17.56%	16.84%	15.17%	502.90%	437.85%	277.01%	7.67%	6.96%	6.37%
WebKitGTK-2.38	14.50%	13.24%	11.18%	17.49%	16.67%	15.05%	497.68%	393.04%	258.80%	7.74%	6.88%	5.67%
Chrome-98	32.78%	31.12%	27.08%	34.75%	33.62%	31.17%	417.42%	406.18%	369.30%	6.74%	5.46%	3.24%
Chrome-105	35.32%	34.25%	33.71%	40.59%	39.17%	38.39%	172.22%	167.27%	163.65%	10.73%	9.76%	8.94%
Chrome-111	32.29%	31.56%	30.95%	44.77%	40.72%	36.94%	334.80%	332.37%	329.81%	7.43%	6.19%	5.16%
Firefox-101	15.83%	14.83%	13.44%	26.96%	21.23%	18.61%	105.94%	105.05%	102.55%	5.14%	4.68%	3.56%
Firefox-103	14.05%	13.72%	13.51%	18.10%	17.00%	15.59%	105.90%	105.90%	105.90%	2.45%	2.33%	2.19%
Firefox-105	17.20%	16.45%	14.16%	21.19%	19.80%	15.53%	110.72%	107.68%	103.33%	6.84%	5.25%	2.63%
Avg Impr		↑ 20.32%			↑ 24.77%			↑ 277.80%			↑ 6.03%	

# Summary

**Artifacts:** <https://zenodo.org/records/8328742>

**Prototype:** <https://github.com/ChijinZ/SaGe-Browser-Fuzzer>



Goal: better semantics exploration

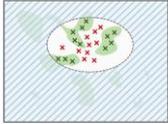
Method: learn grammars from specs and source code

A good browser fuzzer should be able to ...

explore diverse semantics of browsers

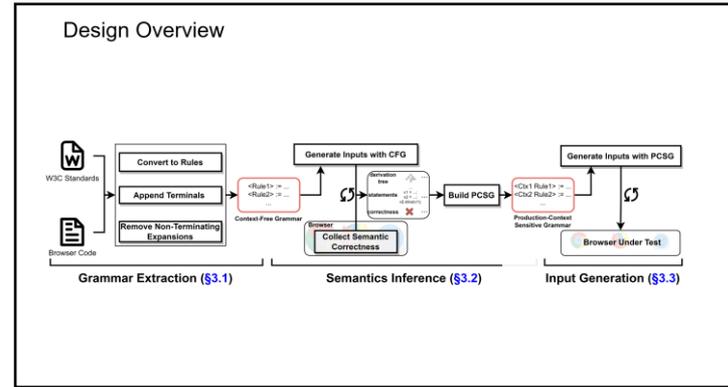
generate semantically-correct testcases

However, existing fuzzers generate testcases like ...



- semantically valid space
- invalid space
- x valid testcase
- x invalid testcase

**Pitfalls:** handwritten grammars **limit the semantics exploration** of fuzzers, and still **cannot ensure semantic correctness**



Insight: infer semantics for production rules

Evaluation: perform well and can find real-world bugs

### Semantics Inference

Example

```

    v3-<SVGTextElement>+
    document.createElementNS("...", "text");
    p_b3
    v4-<SVGTextElement>+
    document.createElementNS("...", "text");
    v4-<length>+
    v3-<length>+
    p_b1
  
```

*v3* is a normal SVGTextElement element  
*v3*.document.createElementNS("...", "text");  
*v4* is null because *v3* is the outmost  
*v4*=*v3*.ownerSVGElement;  
 misuse error because *v4* is null  
*v3*=*v4*;

If we know  $C_{p_{b3}}(p_{b1}, p_{b2}) = \text{false}$ , we will never select  $p_{b3}$  under this context

During testcase generation, under a given production context,  $C_p(ctx)$  help to know **if selecting  $p$  will cause a semantic incorrectness**.

### Evaluation

highlight

- found **62** real-world bugs in Safari, Chrome, and Firefox, out of which **40** were confirmed with **10** CVEs
- Compared to existing browser fuzzers
  - 6.03% - 277.80%** improvement in branch coverage
  - 3.56% - 160.71%** improvement in semantics correctness rate
- Introduced roughly **3.57% overhead** when generating code

Browser	Branch Coverage	Code Coverage	Code Coverage	Code Coverage
WebKitGTK-2.16	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.17	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.18	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.19	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.20	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.21	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.22	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.23	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.24	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.25	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.26	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.27	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.28	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.29	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.30	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.31	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.32	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.33	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.34	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.35	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.36	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.37	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.38	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.39	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.40	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.41	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.42	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.43	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.44	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.45	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.46	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.47	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.48	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.49	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.50	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.51	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.52	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.53	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.54	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.55	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.56	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.57	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.58	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.59	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.60	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.61	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.62	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.63	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.64	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.65	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.66	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.67	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.68	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.69	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.70	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.71	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.72	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.73	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.74	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.75	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.76	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.77	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.78	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.79	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.80	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.81	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.82	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.83	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.84	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.85	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.86	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.87	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.88	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.89	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.90	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.91	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.92	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.93	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.94	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.95	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.96	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.97	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.98	100.00%	100.00%	100.00%	100.00%
WebKitGTK-2.99	100.00%	100.00%	100.00%	100.00%
WebKitGTK-3.00	100.00%	100.00%	100.00%	100.00%