# A Principled Approach to Injection-Attack Detection

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Cagri Cetin

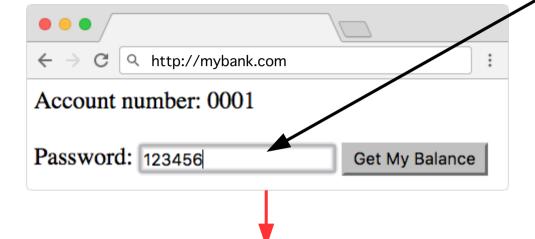
University of South Florida

Dept of Computer Science and Engineering

#### Ideas appeared in:

- Donald Ray and Jay Ligatti. Defining injection attacks. *International Conference on Information Security (ISC*), 2014.
- Donald Ray and Jay Ligatti. Defining code-injection attacks. Symposium on Principles of Programming Languages (POPL), 2012.

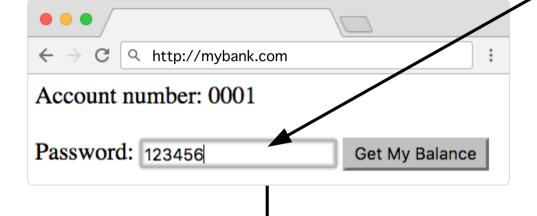




#### **Web Application**

```
sql = SELECT balance from accts
    WHERE num=0001 AND
    password=' + input() + '

result = executeQuery(sql)
    showResult(result)
```



#### **Web Application**

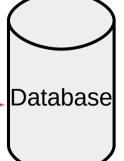
sq1 = SELECT balance from accts
 WHERE num=0001 AND
 password=' + input() + '

result = executeQuery(sq1)

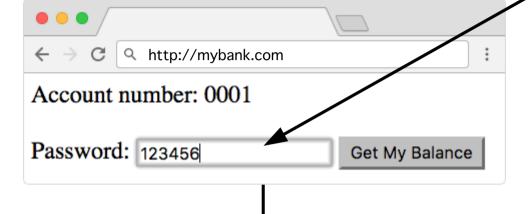
showResult(result)

#### **Output Program**

SELECT balance from accts WHERE num=0001 AND password='123456'









sq1 = SELECT balance from accts
 WHERE num=0001 AND
 password=' + input() + '

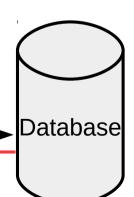
result = executeQuery(sq1)

showResult(result)

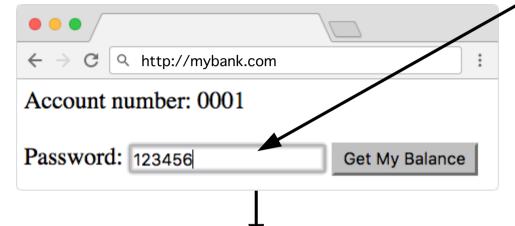
#### **Output Program**

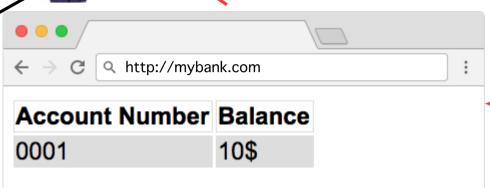
SELECT balance from accts WHERE num=0001 AND password='123456'

> Account Number Balance 0001 10\$









sq1 = SELECT balance from accts
 WHERE num=0001 AND
 password=' + input() + '

result = executeQuery(sql)

showResult(result)

#### **Output Program**

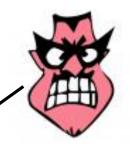
SELECT balance from accts WHERE num=0001 AND password='123456'

Account Number Balance 0001 10\$

Database







```
← → C  http://mybank.com :

Account number: 0001

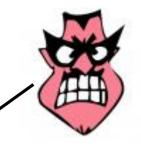
Password: OR 1=1 -- Get My Balance
```

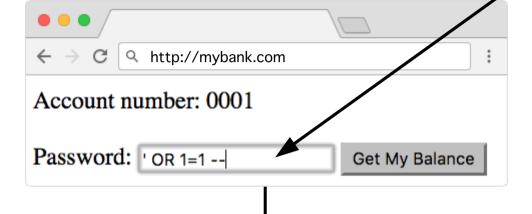
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sql = SELECT balance from accts
    WHERE num=0001 AND
    password=' + input() + '

result = executeQuery(sql)
    showResult(result)
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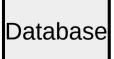
sql = SELECT balance from accts
 WHERE num=0001 AND
 password=' + input() + '

result = executeQuery(sql)

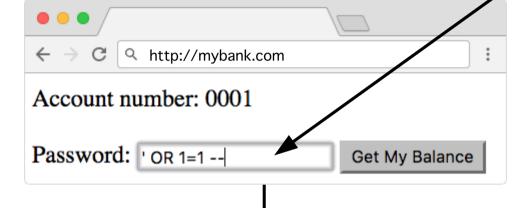
showResult(result)

#### **Output Program**

SELECT balance from accts WHERE num=0001 AND password='' OR 1=1 --'







sql = SELECT balance from accts
 WHERE num=0001 AND
 password=' + input() + '

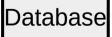
result = executeQuery(sq1)

showResult(result)

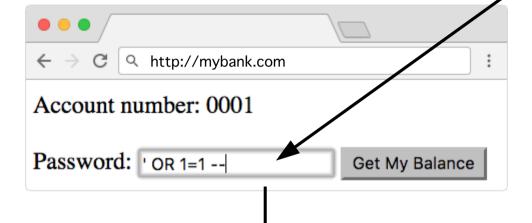
#### **Output Program**

SELECT balance from accts WHERE num=0001 AND password='' OR 1=1 --'

Account Number	balance
0001	10\$
0002	15\$
0003	5\$
0004	1000\$
0005	100\$



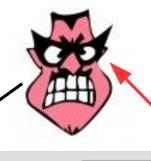


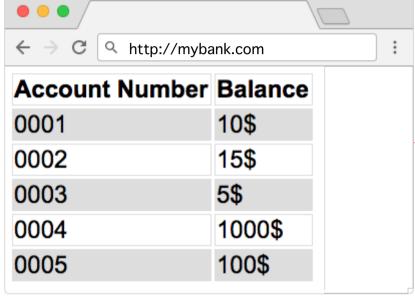


sql = SELECT balance from accts
 WHERE num=0001 AND
 password=' + input() + '

 $result = executeQuery(sql) \blacktriangleleft$ 

showResult(result)





#### **Output Program**

SELECT balance from accts WHERE num=0001 AND password='' OR 1=1 --

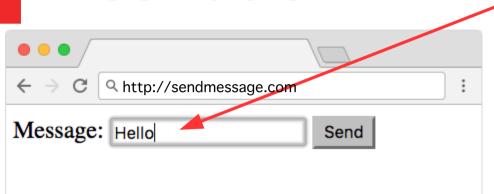
Account Number	Balance
0001	10\$
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0003	5\$
0004	1000\$

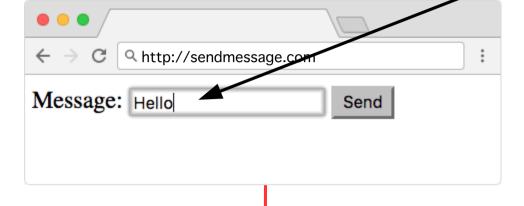
100\$

0005

Database

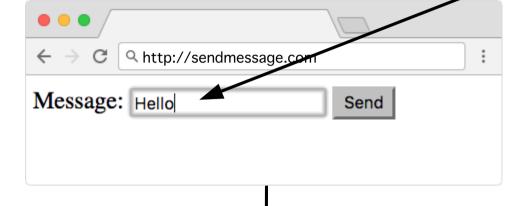
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#### **Web Application**





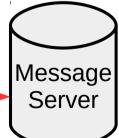
```
code = $data = ' + input() + ';
securityCheck(); $data .= '&f=exit#';
f()
```

result = sendMessage(code)

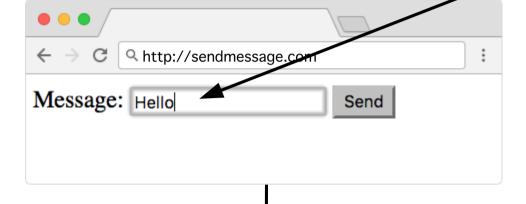
showResult(result)

#### **Output Program**

```
$data = 'Hello';
securityCheck();
$data .= '&f=exit#';
f()
```





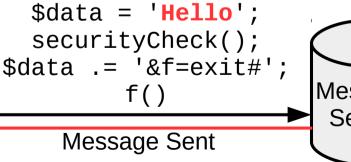


```
code = $data = ' + input() + ';
securityCheck(); $data .= '&f=exit#';
f()
```

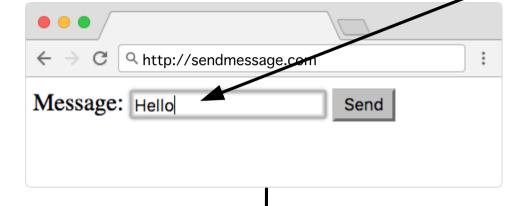
result = sendMessage(code)

showResult(result)

#### **Output Program**



Message Server





#### **Web Application**

```
code = $data = ' + input() + '
securityCheck(); $data .= '&f=exit#';
f()
```

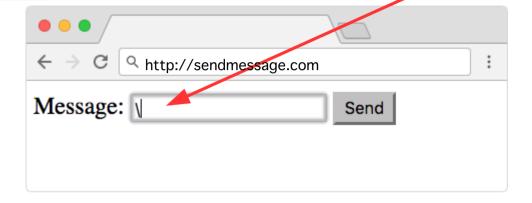
result = sendMessage(code)

showResult(result)

#### **Output Program**

Message Server









```
code = $data =' + input() + ';
securityCheck(); $data .= '&f=exit#';
    f()

result = sendMessage(code)

showResult(result)
```







```
code = $data =' + input() + ';
securityCheck(); $data .= '&f=exit#';
f()
```

result = sendMessage(code)

showResult(result)

#### **Output Program**

```
$data = '\';
securityCheck();
$data .= '&f=exit#';
f()

Message
Server
```







```
code = $data =' + input() + ';
securityCheck(); $data .= '&f=exit#';
f()
```

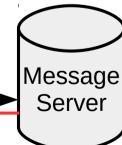
result = sendMessage(code)

showResult(result)

#### **Output Program**

```
$data = '\';
securityCheck();
$data .= '&f=exit#';
f()
```

Server is not responding



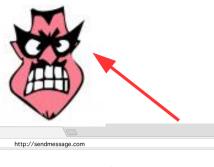




```
code = $data = ' + input() + ';
securityCheck(); $data .= '&f=exit#';
f()
```

result = sendMessage(code)

showResult(result)





Web server is down



#### What happened? What can I do?

The web server is not returning a connection. As a result, the web page is not displaying.

If you are a visitor of this website:
Please try again in a few minutes.

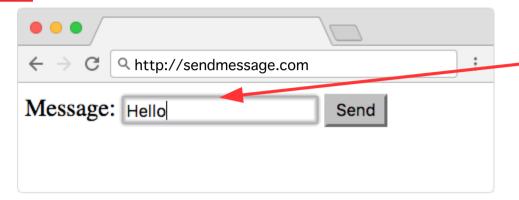
If you are a visitor of this website:
Contact your hostine provider letting them know your web server

CloudFlare Ray ID: 924758ca00903e8 • Help • Performance & Security by CloudF

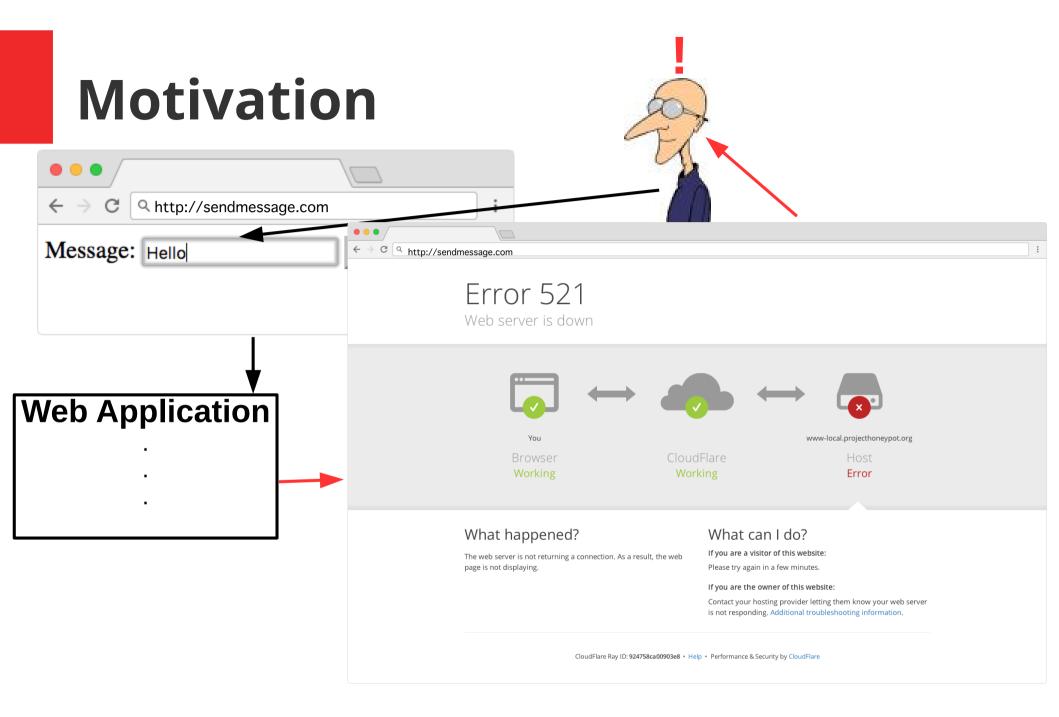
#### **Output Program**

Server is not responding









# 2013 OWASP Top 10 Most Critical Web Application Security Risks

- 1. Injection
- 2. Broken Authentication and Session
- 3. Cross-site Scripting
- 4. Insecure Direct Object References
- 5. Security Misconfiguration

#### 2011 MITRE CWE/SANS Top 8 Most Dangerous Software Errors

- 1.SQL Injection
- 2.OS Cmd Injection
- 3. Buffer Overflow
- 4. Cross-site Scripting
- 5. No Authentication

### **Outline**

- Motivation
- Related Work
- Defining Injection Attacks
  - Defining injection
  - Defining code
  - Defining NIEs
- Examples
- An Algorithm for Detecting and Preventing BroNIEs
- Conclusion

### **Related Work: Academic**

- Su, Z., Wassermann, G.: The essence of command injection attacks in web applications. In: Proceedings of the Symposium on Principles of Programming Languages (POPL). (2006) 372–382
- Bisht, P., Madhusudan, P., Venkatakrishnan, V.N.: CANDID: Dynamic candidate evaluations for automatic prevention of SQL injection attacks. Transactions on Information and System Security (TISSEC) 13(2) (2010) 1–39
- Halfond, W., Orso, A., Manolios, P.: Wasp: Protecting web applications using positive tainting and syntax-aware evaluation. Transactions on Software Engineering (TSE) 34(1) (2008) 65–81
- Nguyen-Tuong, A., Guarnieri, S., Greene, D., Shirley, J., Evans, D.: Automatically hardening web applications using precise tainting. In: Proceedings of the International Information Security Conference (SEC). (2005) 372–382
- Xu, W., Bhatkar, S., Sekar, R.: Taint-enhanced policy enforcement: A practical approach to defeat a wide range of attacks. In: Proceedings of the USENIX Security Symposium. (2006) 121–136

# All suffer from false positives and false negatives [POPL'12]

# Related Work: Parameterized Queries

 Applications output templates that have placeholders for where the untrusted inputs should be used.

SELECT balance from accts WHERE num=0001 AND password= .string

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 Applications output templates that have placeholders for where the untrusted inputs should be used.

SELECT balance from accts WHERE num=0001 AND password= .string

SELECT balance from accts WHERE num=0001 AND password= | \ 'OR 1=1--' | .string

# Related Work: Parameterized Queries

#### **Problems:**

- Requires significant, manual rewrites in the application
- Not mandatory to use
- Not implemented in many output languages
- Programmers are not using enough

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## **Defining Injection**

A symbol has been **injected** iff it propagates unmodified from an **untrusted input** into the **output** program.

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123456



#### **Application**

**Output Program** 



SELECT balance from accts WHERE num=0001 AND password='123456'

## Defining (Non)Code

Literals are noncode symbols in output programs\*

'Hello world'

• 3.14

true

• Jan 1 2005 1:29PM

false

• 1998/11/23

• 10

• 6.4E10

## **Defining NIEs**

**NIE** (Noncode Insertion or Expansion)

Property:

An output program satisfies the **NIE property** iff the **injected symbols** only **insert or expand** noncode (i.e., literals).

## **Defining NIEs**

An output program satisfies the **NIE property** iff the **injected symbols** only **insert or expand** noncode (i.e., literals).

Output program:

SELECT balance from accts WHERE num=001 password='123456'

Template program:

SELECT balance from accts WHERE num=0001 AND password=' '

## **Defining Injection Attacks**

A BroNIE (Broken NIE) occurs exactly when the output program **does not satisfy** the NIE property.



An output program satisfies the **NIE property** iff the **injected symbols** only **insert or expand** noncode (i.e., literals).

#### **Output program:**

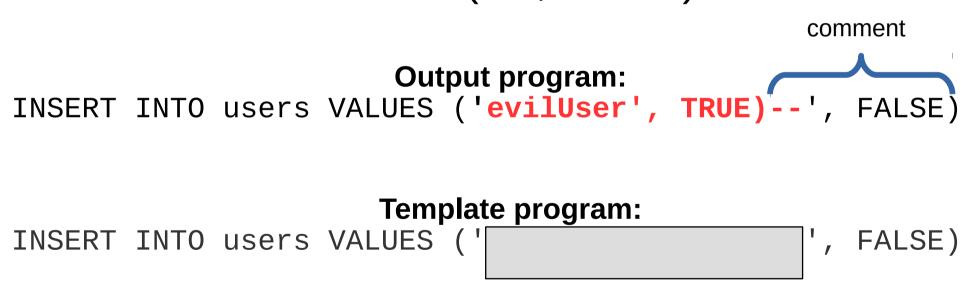
SELECT balance from accts WHERE num=001 AND password='' OR 1=1 --'

#### **Template program:**

SELECT balance from accts WHERE num=001 AND password=' '

An output program satisfies the **NIE property** iff the **injected symbols** only **insert or expand** noncode (i.e., literals).

# Output program: SELECT balance from accts WHERE num=001 AND password='' OR 1=1 --' code code Template program: SELECT balance from accts WHERE num=001 AND password=' '



```
Output program:
$data='\'; securityCheck(); $data .='&f=exit#'; \n f();

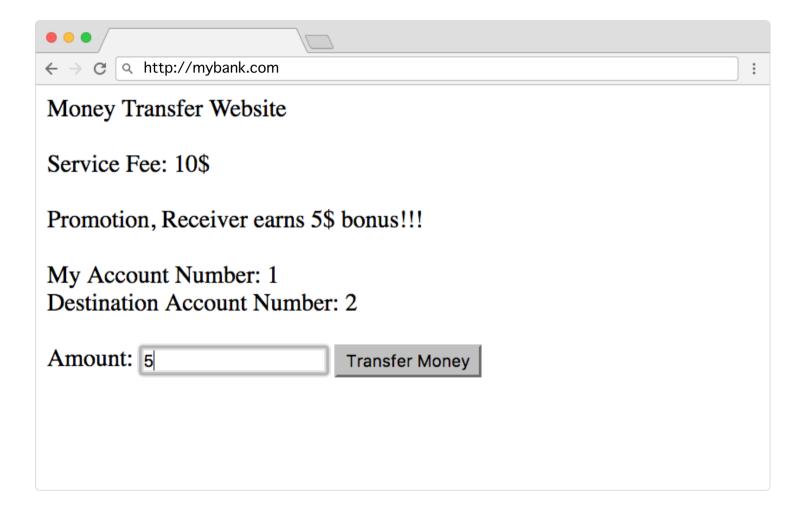
Template program:
$data='\'; securityCheck(); $data .='&f=exit#'; \n f();
```

```
Output program:
$data='\'; securityCheck(); $data .='&f=exit#'; \n f();

string literal

Template program:
$data='\'; securityCheck(); $data .='&f=exit#'; \n f();

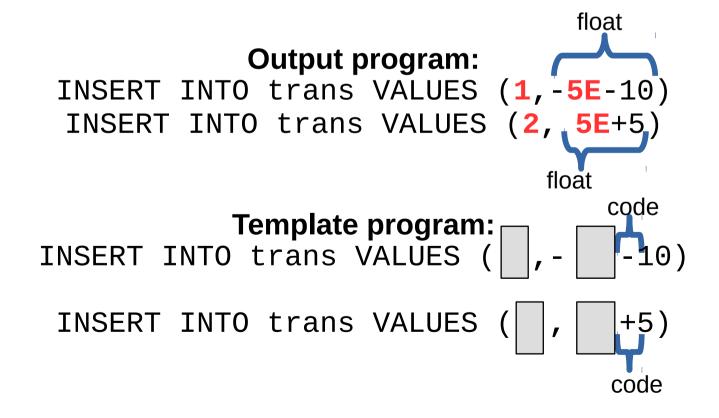
code code
```



An output program satisfies the **NIE property** iff the **injected symbols** only **insert or expand** noncode (i.e., literals).

#### **Output program:**

INSERT INTO trans VALUES (1,-5E-10)
INSERT INTO trans VALUES (2, 5E+5)



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BroNIEs can be **precisely** and **automatically** prevented by:

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BroNIEs can be **precisely** and **automatically** prevented by:

1. Finding **injected symbols** in an **output program** (e.g., with a taint-tracking mechanism),

2. Detecting whether the **output program** satisfies the **NIE property** (by comparing it with its template), and

3. Executing the output program iff it satisfies the NIE property.

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#### Conclusion

 A new kind of attack—noncode injection attack—has been demonstrated and defined precisely

 A new technique for detecting and preventing BroNIEs—including code and noncode injection attacks—has been provided

#### **Thanks**

# Questions?

cagricetin@mail.usf.edu

Papers are available at http://www.cse.usf.edu/~ligatti/projects/ciao/



# Related Work: Parameterized Queries

#### Regular query:

```
String sql = "SELECT balance from accts WHERE password=" + input();
```

#### Parameterized query:

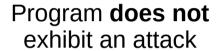
```
String sql = "SELECT balance from accts WHERE password= ?";
PreparedStatement prepStmt = conn.prepareStatement(sql);
prepStmt.setString(1, input());
ResultSet rs = prepStmt.executeQuery();
```

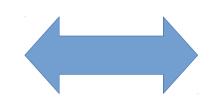
Program **does not** exhibit an attack



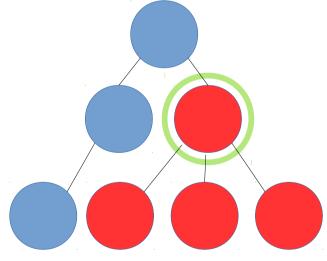
There is a node in the program's parse tree that is entirely injected and that contains all injected symbols

Su, Z., Wassermann, G.: The essence of command injection attacks in web applications. In: Proceedings of the Symposium on Principles of Programming Languages (POPL). (2006) 372–382

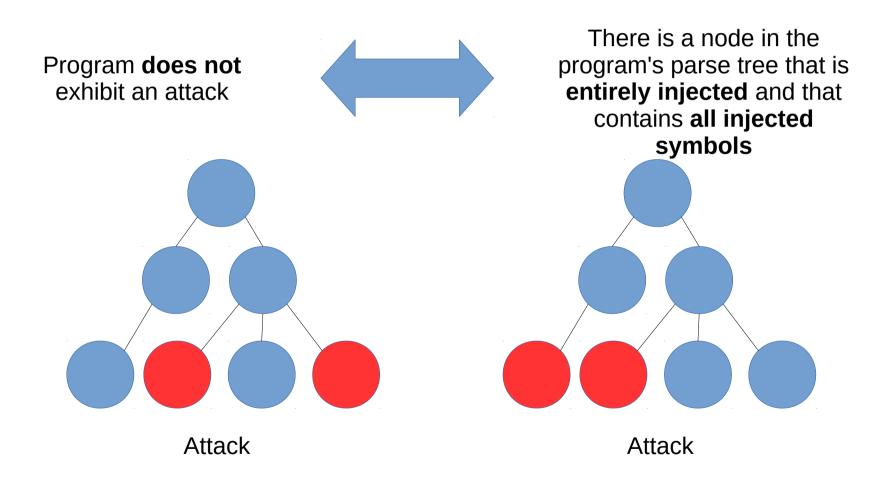




There is a node in the program's parse tree that is entirely injected and that contains all injected symbols



Not an attack



Program **does not** exhibit an attack

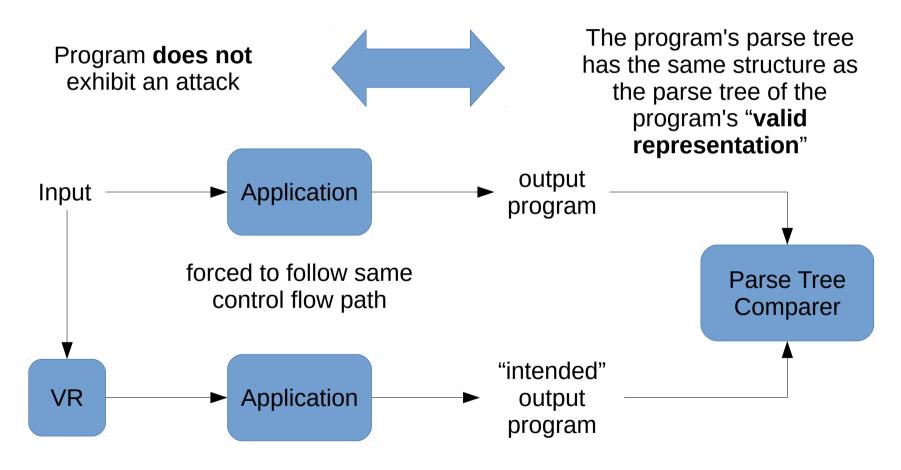


There is a node in the program's parse tree that is entirely injected and that contains all injected symbols

False Positive: SELECT \* FROM table WHERE 'filename.extension'

False Negative: SELECT \* FROM table WHERE pin=exit()

#### **Related Work: CANDID**



Bisht, P., Madhusudan, P., Venkatakrishnan, V.N.: CANDID: Dynamic candidate evaluations for automatic prevention of SQL injection attacks. Transactions on 58 / 52 Information and System Security (TISSEC) 13(2) (2010) 1–39

#### **Related Work: CANDID**

Program **does not** exhibit an attack



The program's parse tree has the same structure as the parse tree of the program's "valid representation"

False Positive: SELECT \* FROM table WHERE false

Valid Representation: SELECT \* FROM table WHERE aaaaa

False Negative: SELECT \* FROM table WHERE pin=exit()

Valid Representation: SELECT \* FROM table WHERE pin=aaaa()

Bisht, P., Madhusudan, P., Venkatakrishnan, V.N.: CANDID: Dynamic candidate evaluations for automatic prevention of SQL injection attacks. Transactions on 59/52 Information and System Security (TISSEC) 13(2) (2010) 1–39

# **Background: Program Tokenizing**

SELECT \* FROM orders WHERE username='cagri'

# **Background: Program Tokenizing**

SELECT \* FROM orders WHERE username='cagri'

**SELECT** 

\*

FROM

ORDERS

WHERE

username

=

'cagri'

# **Taint-Tracking Mechanisms**

- Halfond, W., Orso, A., Manolios, P.: Wasp: Protecting web applications using positive tainting and syntax-aware evaluation. Transactions on Software Engineering (TSE) 34(1) (2008) 65–81
- Nguyen-Tuong, A., Guarnieri, S., Greene, D., Shirley, J., Evans, D.: Automatically hardening web applications using precise tainting. In: Proceedings of the International Information Security Conference (SEC). (2005) 372–382
- Xu, W., Bhatkar, S., Sekar, R.: Taint-enhanced policy enforcement: A practical approach to defeat a wide range of attacks. In: Proceedings of the USENIX Security Symposium. (2006) 121–136
- Pietraszek, T., Berghe, C.V.: Defending against injection attacks through context- sensitive string evaluation. In: Proceedings of Recent Advances in Intrusion Detection (RAID). (2005) 124–145
- Son, S., McKinley, K.S., Shmatikov, V.: Diglossia: detecting code injection attacks with precision and efficiency. In: Proceedings of the Conference on Computer and Communications Security (CCS). (2013) 1181–1192
- Dalton, M., Kannan, H., Kozyrakis, C.: Raksha: A flexible information flow architecture for software security. In: Proceedings of the International Symposium on Computer Architecture (ISCA). (2007) 482–493
- Clause, J., Li, W., Orso, A.: Dytan: a generic dynamic taint analysis framework. In: Proceedings of the International Symposium on Software Testing and Analysis (ISSTA). (2007) 196–206

# Defining (Non)Code

 Free variables specify dynamic substitution operations, so values must be closed (i.e., contain no free variables) to be considered dynamically passive

 In languages were whitespace is significant (e.g., Python), indenting whitepsace cannot be considered lexically removed and is thus dynamically active.

# Defining (Non)Code

**Noncode symbols** in output programs are those that are **dynamically passive**:

Values

```
12000 [1,1,2,3,5,8,13] 'Hello world!'

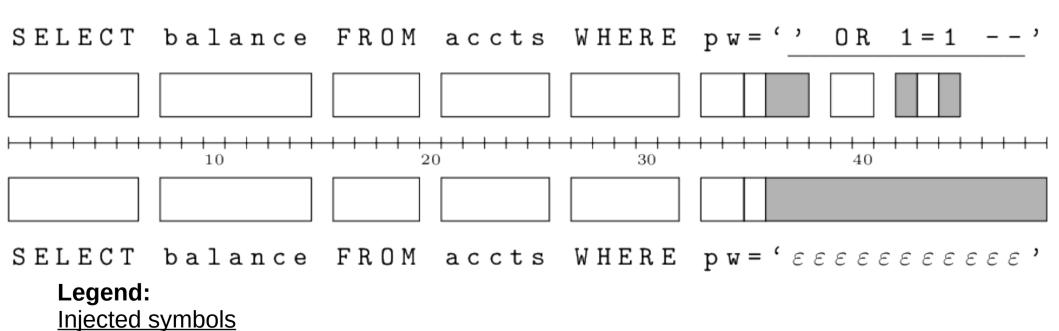
("John Doe", false, 25) 6.02E24 true

false 3.14 [("orange", 0.25), ("apple", 0.20)]
```

Lexically-removed symbols

```
/* typically, whitespace and comment symbols */
```

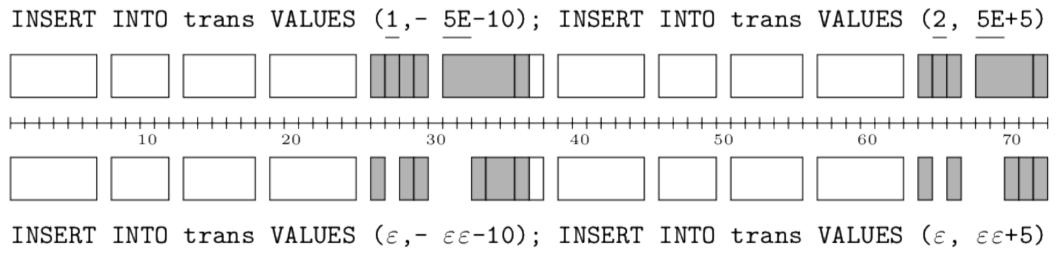
An output program satisfies the **NIE property** if and only if the **injected symbols** only **insert or expand** noncode.



Code tokens

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# Removing all injected symbols from an output program should only delete or contract noncode tokens.



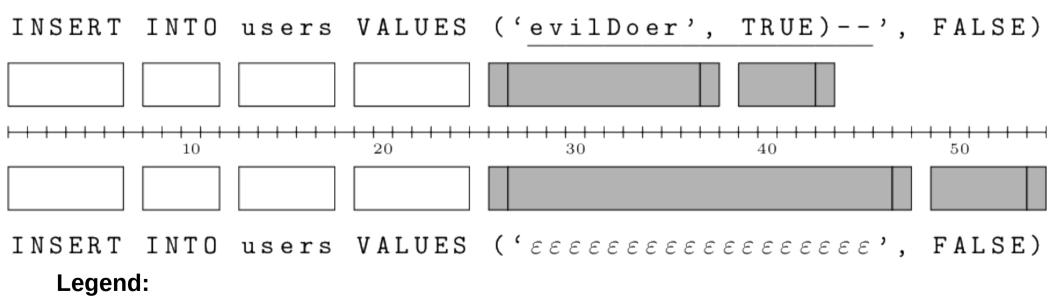
Legend:

**Injected symbols** 

Code tokens

Noncode tokens

An output program satisfies the **NIE property** if and only if the **injected symbols** only **insert or expand** noncode.

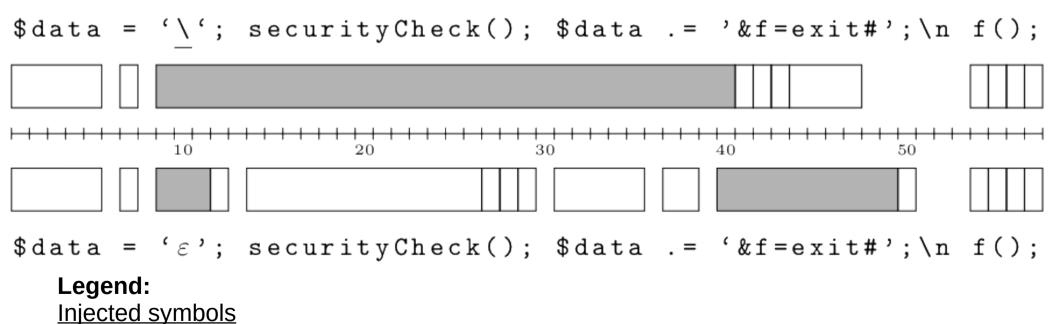


**Injected symbols** 

Code tokens

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An output program satisfies the **NIE property** if and only if the **injected symbols** only **insert or expand** noncode.



Noncode tokens

Code tokens

**Definition 1** ([4]). For all alphabets  $\Sigma$ , the tainted-symbol alphabet  $\underline{\Sigma}$  is  $\{\sigma \mid \sigma \in \Sigma \lor (\exists \sigma' \in \Sigma : \sigma = \underline{\sigma'})\}.$ 

Next, language L is augmented to allow programs to contain tainted symbols.

**Definition 2** ([4]). For all languages L with alphabet  $\Sigma$ , the tainted output language  $\underline{L}$  with alphabet  $\underline{\Sigma}$  is  $\{\sigma_1..\sigma_n \mid \exists \sigma'_1..\sigma'_n \in L : \forall i \in \{1..n\} : (\sigma_i = \sigma'_i \vee \sigma_i = \underline{\sigma'_i})\}$ .

Finally, an output-program symbol is injected if and only if it is tainted.

**Definition 3 ([4]).** For all alphabets  $\Sigma$  and symbols  $\sigma \in \underline{\Sigma}$ , the predicate  $injected(\sigma)$  is true iff  $\sigma \notin \Sigma$ .

**Definition 4.** For all L-programs  $p = \sigma_1...\sigma_n$  and position numbers  $i \in \{1..|p|\}$ , predicate Noncode(p, i) holds iff  $TR_L(p, i)$  or there exist low and high symbol-position numbers  $l \in \{1...i\}$ ,  $h \in \{i...|p|\}$  such that  $\sigma_l...\sigma_h$  is a closed value in p.

**Definition 5 ([4]).** A CIAO occurs exactly when a taint-tracking application outputs  $\underline{L}$ -program  $p = \sigma_1..\sigma_n$  such that  $\exists i \in \{1..n\} : (injected(\sigma_i) \land Code(p,i))$ .

**Definition 6.** The template of a program p, denoted  $[\varepsilon/\underline{\sigma}]p$ , is obtained by replacing each injected symbol in p with an  $\varepsilon$ .

**Definition 7.** A token  $t = \tau_i(v)_j$  can be expanded into token  $t' = {\tau'}_{i'}(v')_{j'}$ , denoted  $t \leq t'$ , iff:

- $-\tau = \tau'$
- $-i' \le i \le j \le j'$  and
- v is a subsequence of v'.

**Definition 8.** An L-program p satisfies the NIE property iff there exist:

- I⊆noncodeToks(p) (i.e., a set of p's inserted noncode tokens),
- $-n \in \mathbb{N}$  (i.e., a number of p's expanded noncode tokens),
- $\{t_1..t_n\}\subseteq tokenize([\varepsilon/\underline{\sigma}]p)$  (i.e., a set of template tokens to be expanded), and
- $-\{t'_1..t'_n\}\subseteq noncodeToks(p) \ (i.e.,\ a\ set\ of\ p\ s\ expanded\ noncode\ tokens)$

such that:

- $-t_1 \leq t'_1, \ldots, t_n \leq t'_n, and$
- −  $tokenize(p) = ([t'_1/t_1]..[t'_n/t_n]tokenize([ε/σ]p)) ∪ I.$

**Definition 9.** A BroNIE (Broken NIE) occurs exactly when a taint-tracking application outputs a program that violates the NIE property.

**Theorem 1.** If a program exhibits a CIAO, then it exhibits a BroNIE.

**Theorem 2.** For all n-ary functions A and (n-1)-ary functions A' and A'', if  $\forall i_1,...,i_n: A(i_1,...,i_n) = A'(i_1,...,i_{m-1},i_{m+1},...,i_n)\underline{i_m}A''(i_1,...,i_{m-1},i_{m+1},...,i_n),$  where  $1 \leq m \leq n$ , and  $\exists v_1,...,v_n: (v_m \in \Sigma_{SQL}^+ \land A(v_1,...,v_n) \in SQL)$ , then  $\exists a_1,...,a_n: A(a_1,...,a_n) \in SQL$  and  $A(a_1,...,a_n)$  exhibits a CIAO and a BroNIE.

**Theorem 3.** Algorithm 1 executes output-program p iff p does not exhibit a BroNIE.

**Theorem 4.** The BroNIE-detection part of Algorithm 1 (i.e., Lines 2–27) executes in O(n) time, where n is the length of the output program.

#### **BroNIE** in Practice

