# Prevalence of Confusing Code in Software Projects

Atoms of Confusion in the Wild

Dan Gopstein NYU

Hongwei Henry Zhou, Phyllis Frankl, Justin Cappos

AtomsOfConfusion.com

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if ((err = SSLHashSHA1.update(&hashCtx, &signedParams)) != 0)
  goto fail;
  goto fail;
```

# Apple's Goto Fail bug

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- Assignment as Value
- Omitted Curly Brace

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#### **Outline**

#### Atoms of Confusion are ...

- Confusing Both in the lab and in the wild
- Prevalent Occurring frequently in practice
- Buggy Causing or correlated with faults

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#### **Atoms of Confusion**

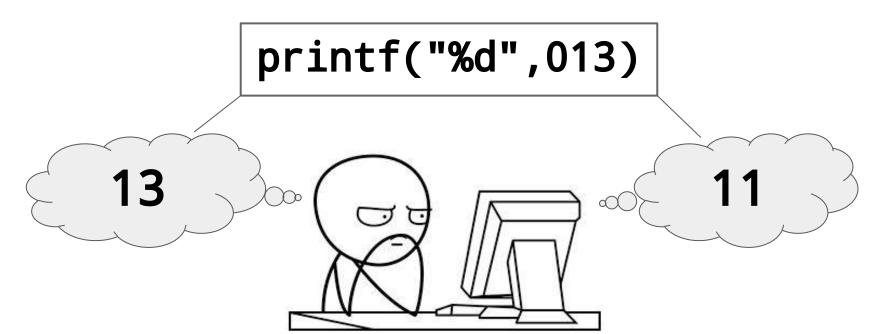
# Understanding Misunderstandings in Source Code

D. Gopstein, J. Iannacone, Y. Yan, L. DeLong, Y. Zhuang, M. Yeh, J. Cappos

ESEC/FSE 2017

#### Confusion

When a person and a machine read the same piece of code, yet come to different conclusions about its output.



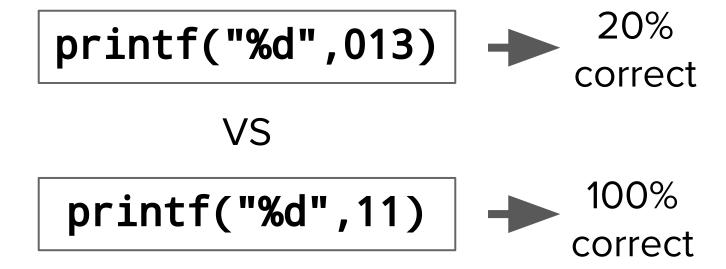
#### Measurable

```
printf("%d",013)
```

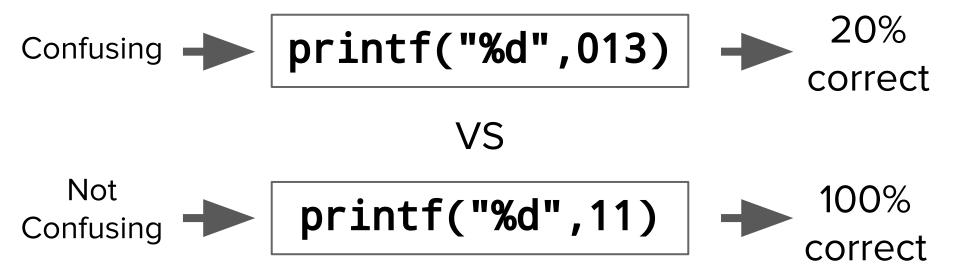
VS

printf("%d",11)

#### Measurable

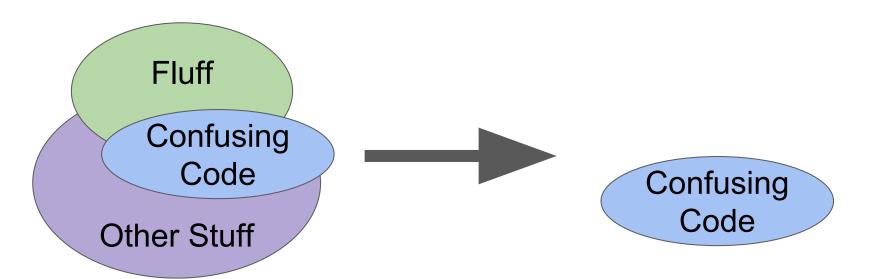


#### Measurable



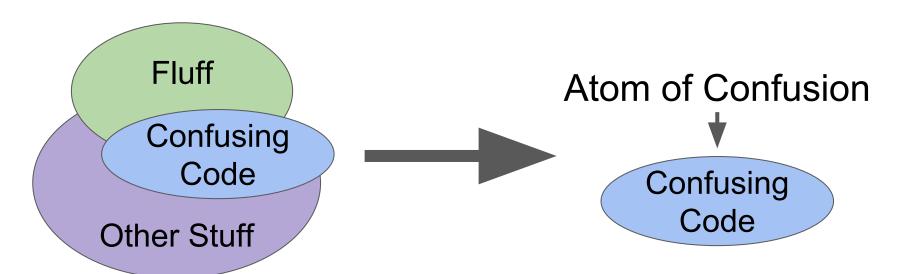
#### **Precise**

# The smallest piece of code that can cause confusion



#### **Precise**

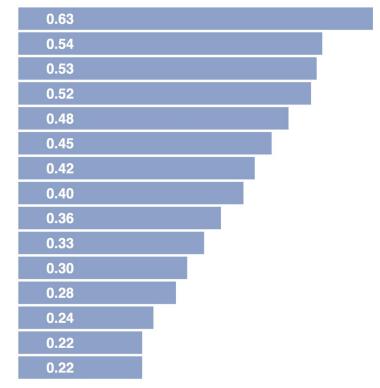
# The smallest piece of code that can cause confusion



#### **Identified Atoms**

Atom of Confusion

Literal Encoding Preprocessor in Statement Macro Operator Precedence Assignment as Value Logic as Control Flow Post-Increment Type Conversion Reversed Subscript **Conditional Operator** Operator Precedence Comma Operator Pre-Increment Implicit Predicate Repurposed Variable **Omitted Curly Brace** 



φ Effect Size (Confusingness)

#### **Atoms of Confusion**

Literal Encoding  $\varphi = .63$ printf("%d",013) Logic as Control Flow  $\varphi = .48$ V1 && F2()

Operator Precedence  $\varphi = .33$ 

0 && 1 || 2

Pre-Increment

 $\phi = .28$ 

V1 = ++V2;

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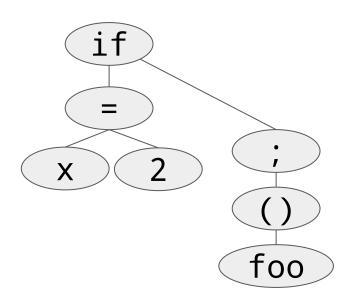
#### **Outline**

#### Atoms of Confusion are ...

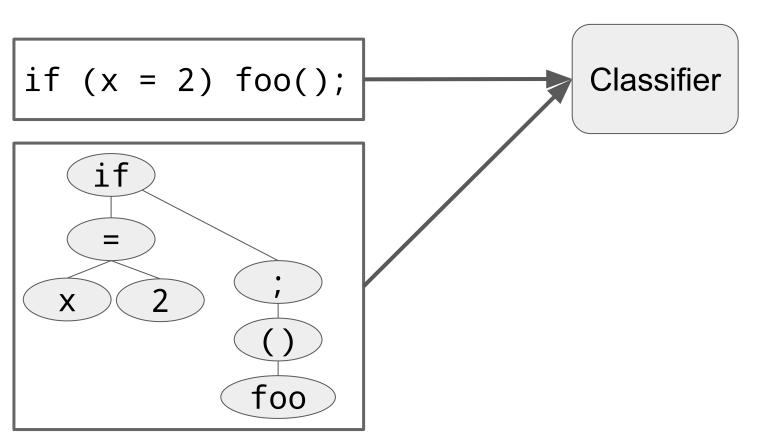
- Confusing Both in the lab and in the wild
- Prevalent Occurring frequently in practice
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#### Classifier

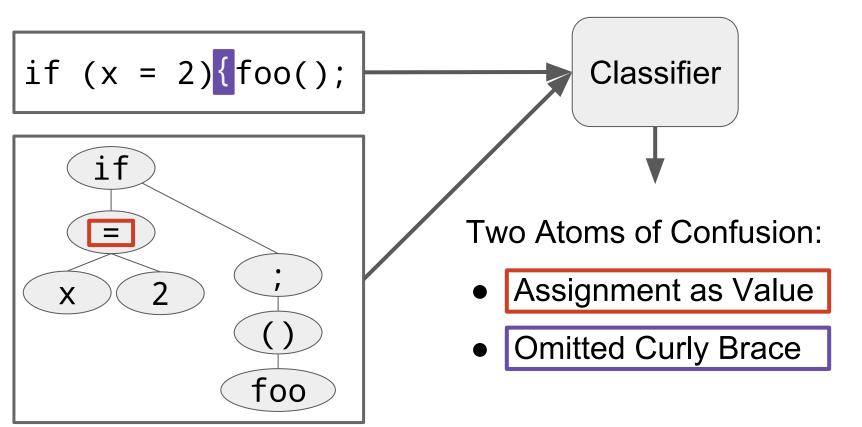
if 
$$(x = 2)$$
 foo();



#### Classifier



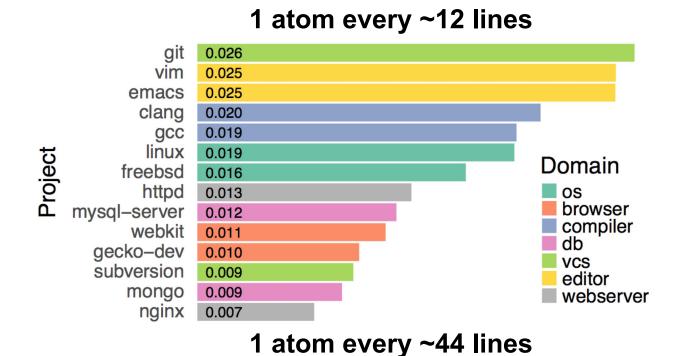
#### Classifier



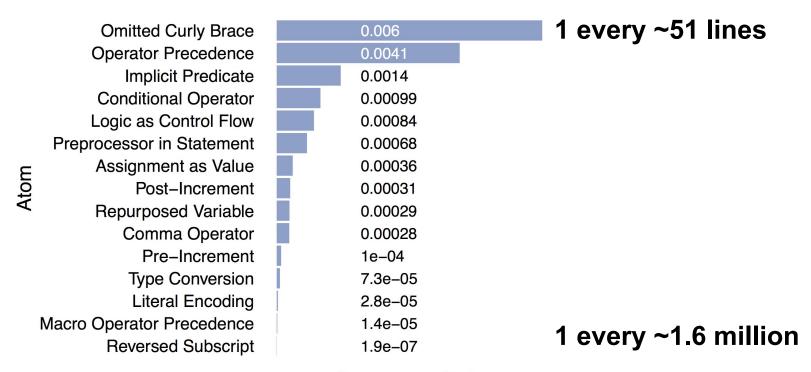
# Corpus

20000	Moore P.M.	1000	attraction branch transport
Project	Domain	Creation	KLOC
Linux	<b>Operating System</b>	1991	22641
FreeBSD	<b>Operating System</b>	1993	20496
Gecko	Browser Renderer	1998	15170
WebKit	Browser Renderer	2001	8216
GCC	Compiler Suite	1988	5488
Clang	Compiler Suite	2007	2001
MongoDB	Database	2007	3872
MySQL	Database	2000	2990
Subversion	Version Control	2000	720
Git	Version Control	2005	253
Emacs	Text Editor	1985	484
Vim	Text Editor	1991	459
Httpd	Webserver	1996	637
Nginx	Webserver	2002	187

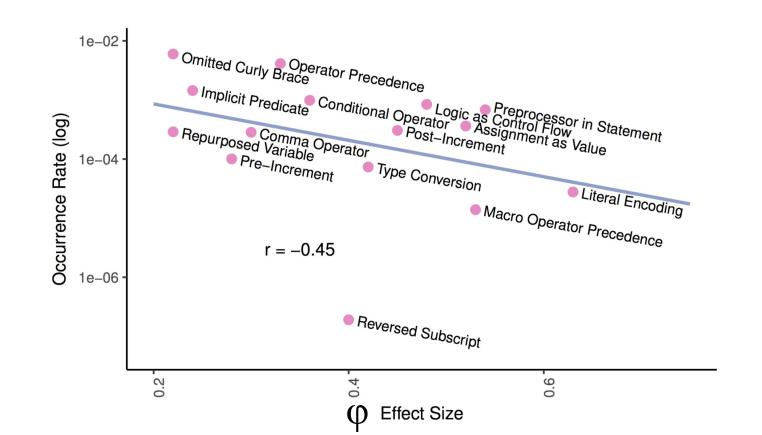
#### How Often do Atoms Occur?



### Which Atoms Occur Most Frequently?



# Are Confusing Patterns Less Common?



#### Prevalent

```
ulpmc->cmd = htobe32(V_ULPTX_CMD(ULP_TX_MEM_WRITE) |
   is_t4(sc) ? F_ULP_MEMIO_ORDER : F_T5_ULP_MEMIO_IMM);
```

#### Prevalent

```
ulpmc->cmd = htobe32(V_ULPTX_CMD(ULP_TX_MEM_WRITE) |
   is_t4(sc) ? F_ULP_MEMIO_ORDER : F_T5_ULP_MEMIO_IMM);
```

#### **Contains:**

- Operator Precedence
- Conditional Operator
- Implicit Predicate

#### Prevalent

```
ulpmc->cmd = htobe32(V_ULPTX_CMD(ULP_TX_MEM_WRITE) []
is_t4(sc) ? F_ULP_MEMIO_ORDER : F_T5_ULP_MEMIO_IMM);
```

#### Contains:

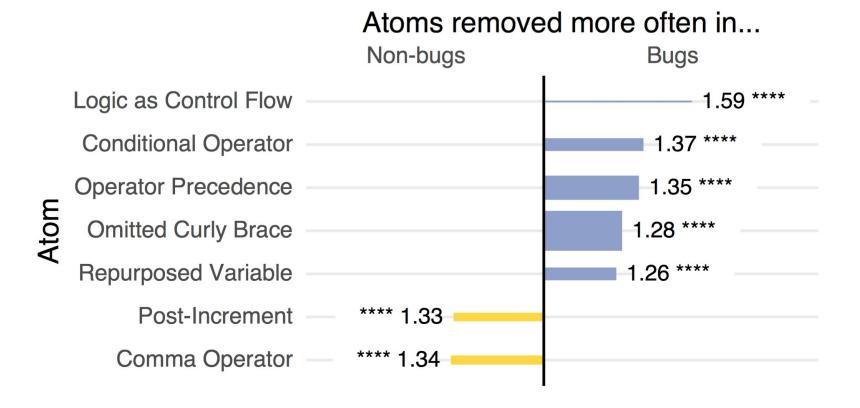
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#### **Outline**

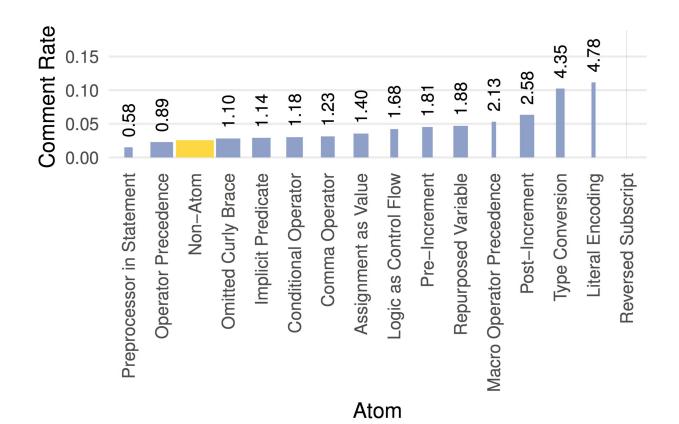
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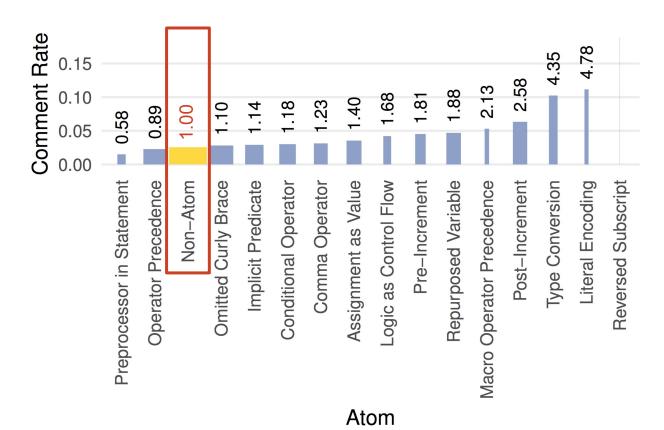
### Are Atoms Removed More In Bug Fix Commits?



#### Are Atoms Commented More Often?



#### Are Atoms Commented More Often?



```
#define ABS(x) ((x) < 0 ? (-x) : (x))
```

```
#define ABS(x) ((x) < 0 ? (-x) : (x))

ABS(1) => ???
```

#define ABS(x) ((x) < 0 ? 
$$(-x)$$
 : (x))

ABS(1) => 1

```
#define ABS(x) ((x) < 0 ? (-x) : (x))

ABS(1) => 1

ABS(-2) => ???
```

```
#define ABS(x) ((x) < 0 ? (-x) : (x))

ABS(1) => 1

ABS(-2) => 2
```

```
#define ABS(x) ((x) < 0 ? (-x) : (x))

ABS(1) => 1

ABS(-2) => 2

ABS(1-2) => ???
```

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ABS(1-2) => 
$$x$$
 -3

```
#define ABS(x) ((x) < 0 ? (-x) : (x))
ABS(1-2)
```

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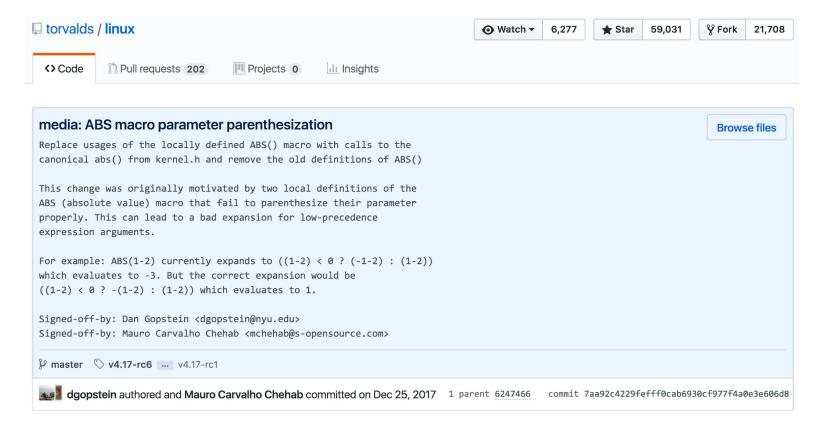
((1-2) < 0 ? (-1-2) : (1-2))

\downarrow
-3
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              ABS(1-2)
    ((1-2) < 0 ? (-1-2) : (1-2))
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```

## Macro Operator Precedence



#### Summary

#### Atoms of Confusion are ...

#### Confusing

- Atoms are statistically more confusing than other code in the lab
- Atoms are 13% more likely to be commented than other code

#### Prevalent

- We found millions of examples in our corpus
- 1 in ~23 lines of code has an atom

- Bug-fix commits are 25% more likely remove atoms
- We found and fixed a handful of bugs in Linux

## Thank You

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