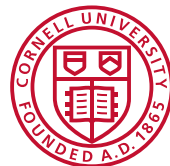


# Inline Tests

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October 12, 2022  
ASE, Michigan, USA



Cornell University

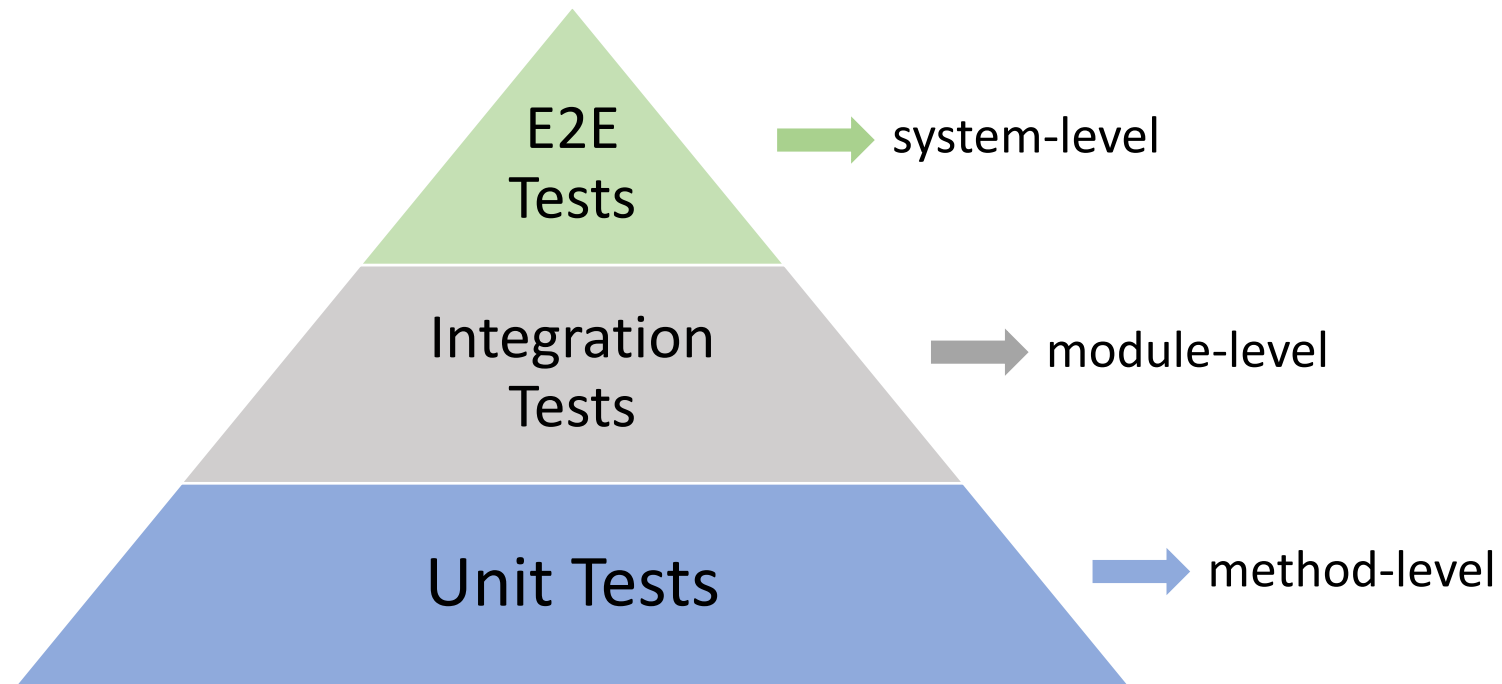


652517, 2019277,  
2045596, 2107291,  
2217696

# Current Levels of Test Granularity



What if we want to test a **single statement** in a method?



# Value of Testing Individual Statements

[https://github.com/noDRM/DeDRM\\_tools/blob/master/DeDRM\\_plugin/k4mobidedrm.py](https://github.com/noDRM/DeDRM_tools/blob/master/DeDRM_plugin/k4mobidedrm.py)

```
1  def decryptBook(infile, outdir, kDatabaseFiles, androidFiles, serials, pids):  
    ...  
51     return 0
```



# Developers Want to Test Code Within Methods

- Single-statement bugs occur frequently [1, 2]
  - Hard-to-understand
  - Complex program logic
- Unit tests rarely fail single-statement bugs [3]
  - Statements buried deeply inside complicated program logic

[1] Arthur V Kamienski, Luisa Palechor, Cor-Paul Bezemer, and Abram Hindle. 2021. PySStuBs: Characterizing single-statement bugs in popular open-source Python projects. In MSR. 520–524.

[2] Rafael-Michael Karampatsis and Charles Sutton. 2020. How often do single-statement bugs occur? The ManySStuBs4J dataset. In MSR. 573–577.

[3] Jasmine Latendresse, Rabe Abdalkareem, Diego Elias Costa, and Emad Shihab. 2021. How effective is continuous integration in indicating single-statement bugs?. In MSR. 500–504.

# Existing Approaches

- Developers use printf debugging, website, in-IDE popups, etc.

```
boolean subFieldIsTagField = ((subField
    .isAnnotationPresent(Indexed.class)
    && ((CharSequence.class.isAssignableFrom(subField.getType()) || (subField.getType() == Boolean.class)
        || (maybeCollectionType.isPresent() && (CharSequence.class.isAssignableFrom(maybeCollectionType.get())
            || (maybeCollectionType.get() == Boolean.class))))));
System.out.println(">>> subFieldIsTagField ==> " + subFieldIsTagField);
```

REGULAR EXPRESSION: `^{0-9A-F-}{36}$` (1 match (12 steps, 0.0ms))

EXPLANATION:

- ^ asserts position at start of a line
- {0-9A-F-} matches the characters {0-9A-F-} literally (case sensitive)
- {36} matches the character } with index 125 (7D<sub>16</sub> or 175<sub>8</sub>) literally (case sensitive)
- \$ asserts position at end of a line

- Copy source code
- Leave development environment
- Cannot store results

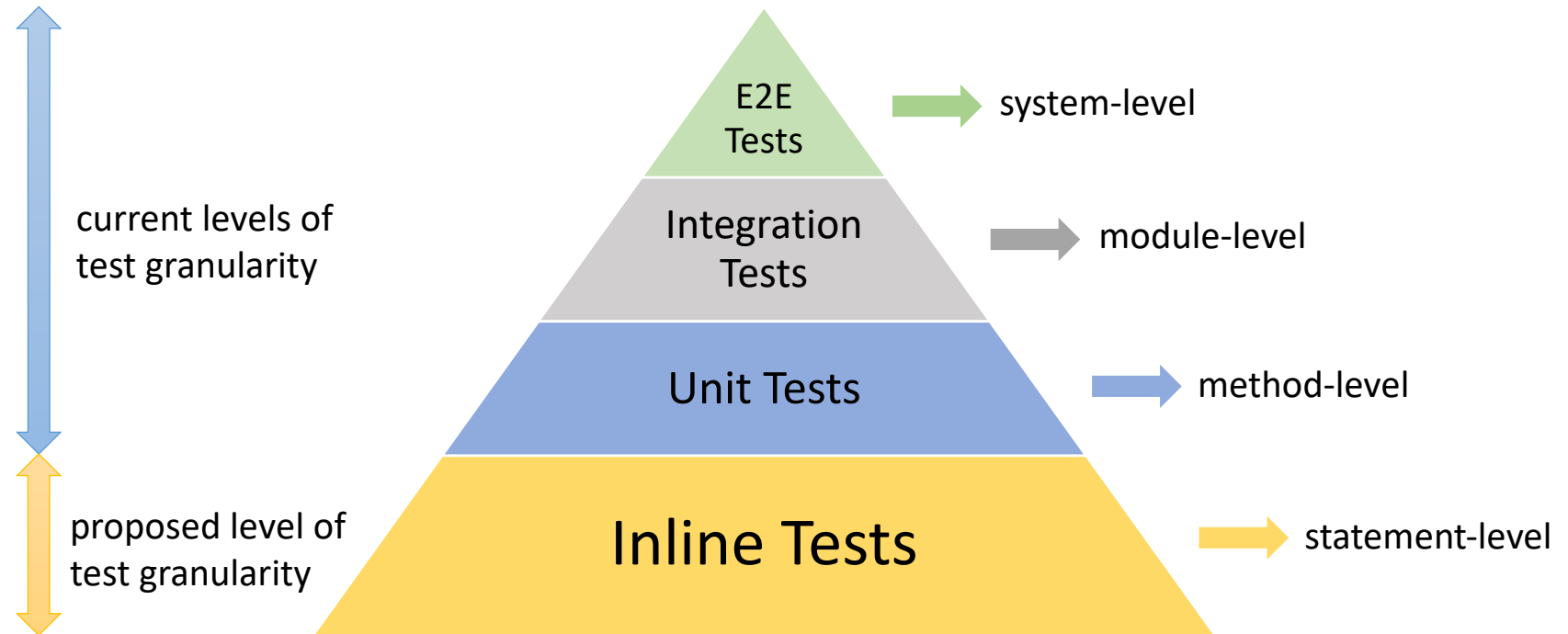
```
if (
    re.match('^B[A-Z0-9]{9}(_EBOK|_EBSP|_sample)?$', orig_fn_root) or
    re.match('^([0-9A-F-]{36})$', orig_fn_root)
): # Kindle for PC / Mac / Android / Fire / iOS
    ...
    kTitle()
    root, clean_title)
    a reasonable name
```

RegExp: `^[0-9A-F-]{36}$`

Sample: `1234-5678-9012-3456-7890-1234` ✓



# Inline Tests



# Our Contributions

- Idea: introduce a new type of tests, **inline tests**
- Framework: implement **I-Test**, the first inline testing framework
- Performance evaluation: measure runtime costs of I-Test
- User study: evaluate programmer perceptions about inline testing



# Inline Test Example

[https://github.com/noDRM/DeDRM\\_tools/blob/master/DeDRM\\_plugin/k4mobidedrm.py](https://github.com/noDRM/DeDRM_tools/blob/master/DeDRM_plugin/k4mobidedrm.py)

```
1  def decryptBook(infile, outdir, kDatabaseFiles, androidFiles, serials, pids):
...
25  if (
26      re.match('^B[A-Z0-9]{9}(_EBOOK|_EBSP|_sample)?$', orig_fn_root) or
27      re.match('^{\0-9A-F-}{36}$', orig_fn_root)
28      ): # Kindle for PC / Mac / Android / Fire / iOS
29  Declare Here().given(orig_fn_root, 'ec69ba8e-0bfe-4f4b-a8cf-bfc313a97e55').check_true(Group(1))
30      clean_title = cleanup_name(book.getBookTitle())           Assign      Assert
31      outfilename = "{}_{}".format(orig_fn_root, clean_title)
...
52  return 0
```

# Inline Test Example

[https://github.com/noDRM/DeDRM\\_tools/blob/master/DeDRM\\_plugin/k4mobidedrm.py](https://github.com/noDRM/DeDRM_tools/blob/master/DeDRM_plugin/k4mobidedrm.py)

```
1  def decryptBook(infile, outdir, kDatabaseFiles, androidFiles, serials, pids):
    ...
25     if (
26         re.match('^B[A-Z0-9]{9}(_EBOK|_EBSP|_sample)?$', orig_fn_root) or
27 -       re.match('^{\0-9A-F-}{36}$', orig_fn_root)
27 +       re.match('^[\0-9A-F-]{36}$', orig_fn_root)
28         ): # Kindle for PC / Mac / Android / Fire / iOS
29     Here().given(orig_fn_root, 'ec69ba8e-0bfe-4f4b-a8cf-bfc313a97e55').check_true(Group(1))
30     clean_title = cleanup_name(book.getBookTitle())
31     outfilename = "{}_{}".format(orig_fn_root, clean_title)
    ...
52     return 0
```

# I-Test API (Subset)

- Declaration
  - Here()
- Assignment
  - given(variable, value)
- Assertion
  - check\_eq(actual, expected)
  - check\_true(actual)
  - check\_false(actual)

# Design of I-Test

- Write **code** instead of comments
- Write inline tests **below the target statement** instead of a separate file
- Check only **one target statement** instead of multiple statements
- **Enable during testing** and **disable in production**
- More requirements see paper Section 3

# I-Test Implementation

k4mobidedrm.py

- Given a source file

```
from inline import Here
...
def decryptBook(infile, outdir, kDatabaseFiles, androidFiles, serials, pids):
...
    if (
        re.match('^B[A-Z0-9]{9}(_EBOOK|_EBSP|_sample)?$', orig_fn_root) or
        re.match('^{\0-9A-F-}{36}$', orig_fn_root)
        ): # Kindle for PC / Mac / Android / Fire / iOS
        Here().given(orig_fn_root, 'ec69ba8e-0bfe-4f4b-a8cf-bfc313a97e55').check_true(Group(1))
        clean_title = cleanup_name(book.getBookTitle())
        outfilename = "{}_{}".format(orig_fn_root, clean_title)
...
return 0
```

# I-Test Implementation

- Finder searches for
  - import statement of Here
  - statements that start with Here

```
from inline import Here
```

```
...
```

```
def decryptBook(infile, outdir, kDatabaseFiles, androidFiles, serials, pids):
```

```
...
```

```
if (
```

```
    re.match('^B[A-Z0-9]{9}(_EBOOK|_EBSP|_sample)?$', orig_fn_root) or
```

```
    re.match('^{\0-9A-F-}{36}$', orig_fn_root)
```

```
    ): # Kindle for PC / Mac / Android / Fire / iOS
```

```
    Here().given(orig_fn_root, 'ec69ba8e-0bfe-4f4b-a8cf-bfc313a97e55').check_true(Group(1))
```

```
    clean_title = cleanup_name(book.getBookTitle())
```

```
    outfilename = "{}_{}".format(orig_fn_root, clean_title)
```

```
...
```

```
return 0
```

k4mobidedrm.py

Finder

Here... stmt

Here... stmt

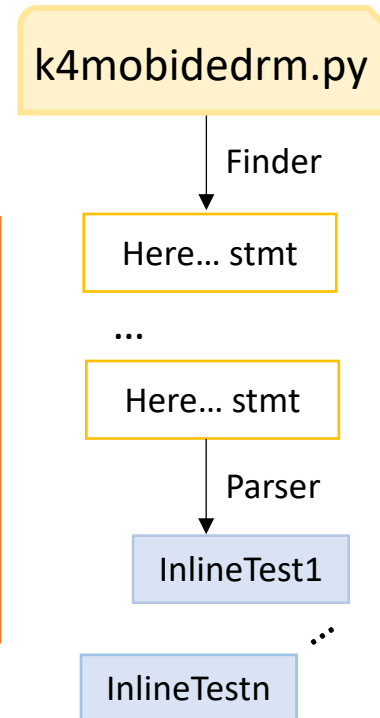
# I-Test Implementation

- Parser parses inline test statement to an executable test

```
if (  
    re.match('^B[A-Z0-9]{9}(_EBOK|_EBSP|_sample)?$', orig_fn_root) or  
    re.match('^{\0-9A-F-}{36}$', orig_fn_root)  
): # Kindle for PC / Mac / Android / Fire / iOS  
    Here().given(orig_fn_root, 'ec69ba8e-0bfe-4f4b-a8cf-bfc313a97e55')  
        .check_true(Group(1))
```

```
orig_fn_root = 'ec69ba8e-0bfe-4f4b-a8cf-bfc313a97e55'  
assert re.match('^{\0-9A-F-}{36}$', orig_fn_root) == True
```

parsed test



# I-Test Implementation

- Runner executes the parsed test

```
orig_fn_root = 'ec69ba8e-0bfe-4f4b-a8cf-bfc313a97e55'  
assert re.match('^{\0-9A-F-}{36}$', orig_fn_root) == True
```

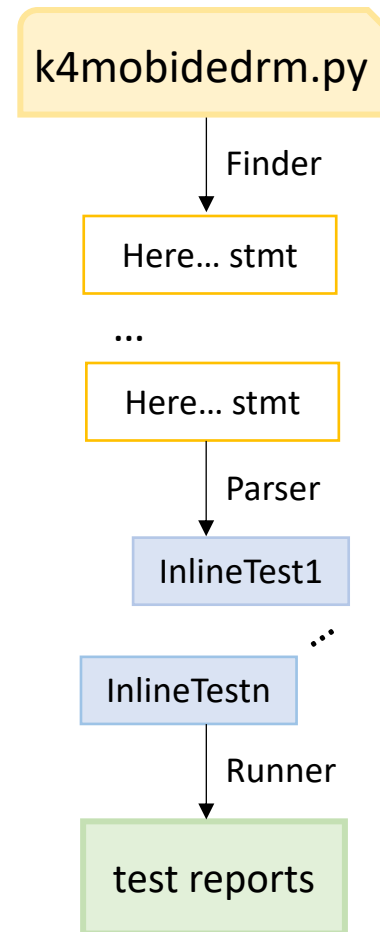
parsed  
test

compile and execute

```
tree = ast.parse(test.str())  
codeobj = compile(tree, filename="<ast>", mode="exec")  
exec(codeobj, test.globs)
```

integrate with pytest

```
===== test session starts =====  
platform linux -- Python 3.9.13, pytest-7.1.3, pluggy-1.0.0  
collected 1 item  
k4mobidedrm.py . [100%]  
===== 1 passed in 0.02s =====
```





# Sets of Target Statements

- Regular expression
- String manipulation
- Bit manipulation
- Collection handling (Python only)
- Stream (Java only)

# Sets of Target Statements

- Regular expression
  - Python re package, Java java.util.regex package
- String manipulation
- Bit manipulation
- Collection handling (Python only)
- Stream (Java only)

# Sets of Target Statements

- Regular expression
- **String manipulation**
  - string concatenation, string split, string formatting, etc.
- Bit manipulation
- Collection handling (Python only)
- Stream (Java only)

# Sets of Target Statements

- Regular expression
- String manipulation
- **Bit manipulation**
  - left shift(<<), right shift(>>), bitwise and(&), bitwise or(|), bitwise not(~), bitwise XOR(^)
- Collection handling (Python only)
- Stream (Java only)

# Sets of Target Statements

- Regular expression
- String manipulation
- Bit manipulation
- **Collection handling (Python only)**
  - list, set, dict, tuple, etc.
- Stream (Java only)

# Sets of Target Statements

- Regular expression
- String manipulation
- Bit manipulation
- Collection handling (Python only)
- **Stream (Java only)**
  - `stream()`, `filter()`, `collect()`, `count()`, `findFirst()`, etc.

# Evaluation Setup

- Search 100 top-starred Python and Java projects on GitHub
- Write 87 Python and 65 Java inline tests

Breakdown of 50 Python Examples

| Type         | # Projects | # Target Statements | # Inline Tests |
|--------------|------------|---------------------|----------------|
| Regex        | 15         | 19                  | 22             |
| String       | 13         | 30                  | 32             |
| Bit          | 15         | 26                  | 27             |
| Collection   | 4          | 5                   | 6              |
| <b>Total</b> | <b>31</b>  | <b>80</b>           | <b>87</b>      |

Breakdown of 50 Java Examples

| Type         | # Projects | # Target Statements | # Inline Tests |
|--------------|------------|---------------------|----------------|
| Regex        | 15         | 17                  | 17             |
| String       | 15         | 20                  | 20             |
| Bit          | 16         | 25                  | 26             |
| Stream       | 2          | 2                   | 2              |
| <b>Total</b> | <b>37</b>  | <b>64</b>           | <b>65</b>      |

# Evaluation Setup

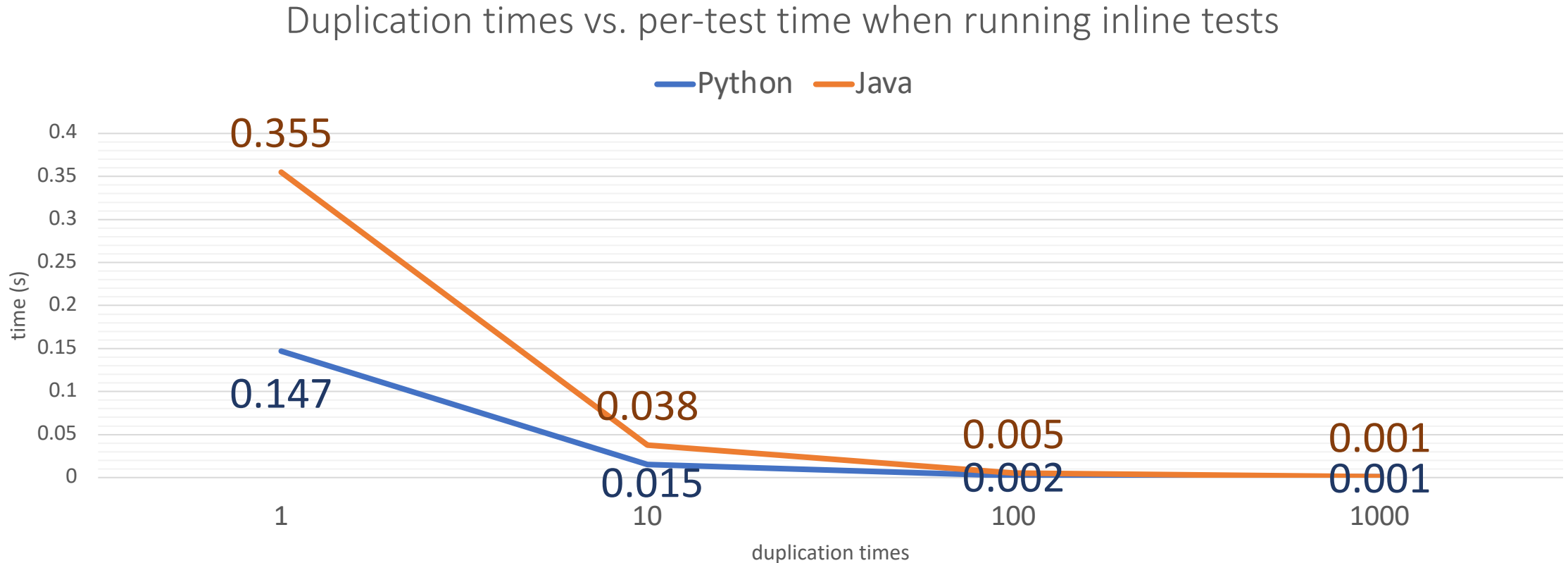
- RQ1: How long does it take to run inline tests?
- RQ2: What is the runtime overhead when inline tests are enabled during the execution of existing unit tests?
- RQ3: What is the runtime overhead when inline tests are disabled during the execution of existing unit tests?



# Experiment Setup

- Standalone experiments
  - Run inline tests alone
- Integrated experiments
  - Run inline tests and unit tests together
- Duplicating inline tests
  - Duplicate each inline test 10, 100 and 1000 times to simulate the costs as the number of inline tests grows

# RQ1: How Long Does It Take to Run Inline Tests?

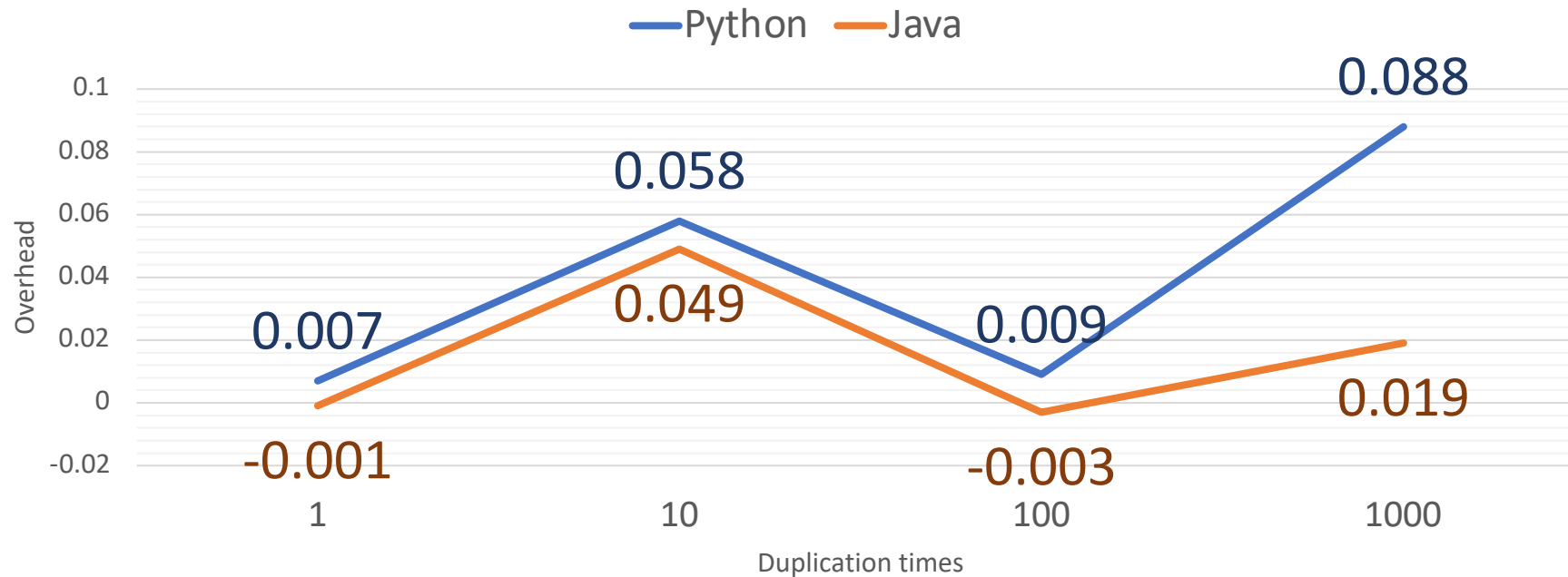


We run experiments on a machine with Intel Core i7-11700K @ 3.60GHz (8 cores, 16 threads) CPU, 64 GB RAM, and Ubuntu 20.04.

# RQ2: What Is the Runtime Overhead When Inline Tests are Enabled During the Execution of Existing Unit Tests?


$$\frac{\text{time of running unit tests with inline tests enabled} - \text{time of running vanilla unit tests}}{\text{time of running vanilla unit tests}}$$

Duplication times vs. overhead when inline tests enabled



We run experiments on a machine with Intel Core i7-11700K @ 3.60GHz (8 cores, 16 threads) CPU, 64 GB RAM, and Ubuntu 20.04.

# User Study

- 1 tutorial with 3 examples
- 4 tasks of each type in Python
  - record time of understanding code and time of writing inline tests
- 1 survey with 4 questions
  - rate the difficulty of learning and writing inline tests
  - report their number of years of programming experience
  - say whether they think writing inline tests is beneficial
  - comment on how to improve I-Test
- 13 participants: 2 pilot studies, 9 valid responses 
  - 6 graduate students, 2 undergraduate students and 1 professional software engineer

# User Study Result

task 1: regular expression

task 2: string manipulation

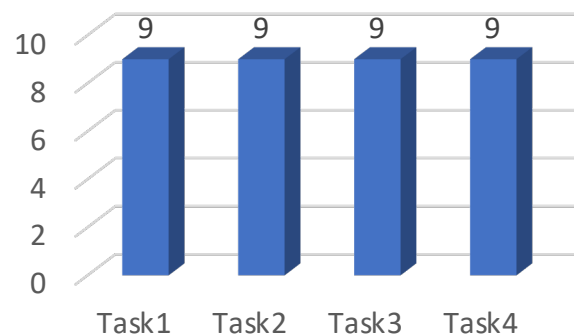
task 3: collection handling

task 4: bit manipulation



All participants can write passing inline tests

Number of participants who write passing inline tests



2.7 min on average

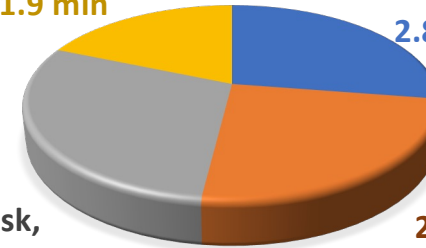
Time to write each inline test

4th Task,  
1.9 min

1st Task,  
2.8 min

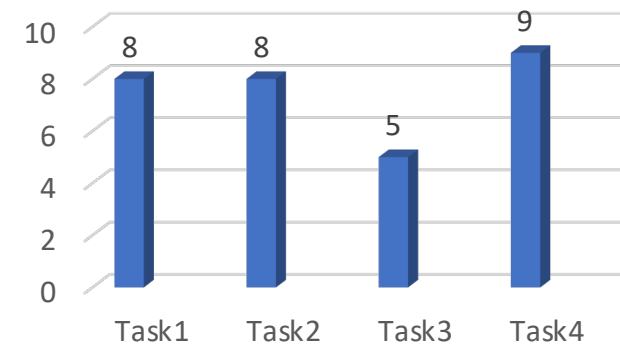
3rd Task,  
3.0 min

2nd Task,  
2.5 min



Participants usually find inline tests beneficial

Number of participants who find inline tests beneficial



# Conclusion



- Introduce a new kind of tests, inline tests, perform statement-level testing
- Implement the first inline testing framework, I-Test
- Additional cost of inline testing is tiny
- Participants find it easy to learn and use inline testing

<https://github.com/EngineeringSoftware/inlinetest> 

Yu Liu (Yuki): [yuki.liu@utexas.edu](mailto:yuki.liu@utexas.edu)