[ICSE12]

Active Code Completion



Cyrus Omar Computer Science



YoungSeok Yoon Software Engineering



Thomas D. LaToza Software Engineering



Brad A. Myers Human-Computer Interaction

School of Computer Science Carnegie Mellon University

Code Completion

import java.util.regex.Pattern;

```
public class Matcher {
```

}

}

```
public static boolean isTemperature(String s) {
```

| Pattern p 🚍 | | |
|-------------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| | Pattern - java.util.regex p : Pattern s : String s isTemperature(String s) : boolean - Match Matcher - edu.cmu.cs.comar | A compiled representation of a regular expression. A regular expression, specified as a string, must first be compiled into an instance of this class. The resulting pattern can then be used to create a <u>Matcher</u> object that can match arbitrary <u>character sequences</u> against the regular expression. All of the state involved in performing a match resides in the matcher, so many matchers can share the same pattern. |
| | | A typical invocation sequence is thus |
| | Press '^Space' to show Template Proposals | Press 'Tab' from proposal table or click for focus |



Code Completion is Commonly Used

|--|

Top 10 commands executed across all 41 developers

| | Command | Identifier | Use (%) |
|---|----------------------|--------------------------------------------------|---------|
| | Delete | org.eclipse.ui.edit.delete | 14.3 |
| | Save | org.eclipse.ui.file.save | 11.3 |
| | Next word | org.eclipse.ui.edit.text.goto.wordNext | 7.3 |
| | Paste | org.eclipse.ui.edit.paste | 6.8 |
| > | Content assist | org.eclipse.ui.edit.text.contentAssist.proposals | 6.7 |
| ĺ | Previous word | org.eclipse.ui.edit.text.goto.wordPrevious | 5.9 |
| | Сору | org.eclipse.ui.edit.copy | 4.6 |
| | Select previous word | org.eclipse.ui.edit.text.select.wordPrevious | 3.4 |
| | Step (debug) | org.eclipse.debug.ui.debugview.toolbar.stepOver | 3.2 |
| | | | |



Code Completion is Useful

- Helps developers explore relevant APIs
 - Avoids context switches to external API browsers



Code Completion is Useful

- Helps developers explore relevant APIs
 - Avoids context switches to external API browsers
- Helps developers avoid mistakes
 - Spelling and type errors are reduced



Code Completion is Useful

- Helps developers explore relevant APIs
 - Avoids context switches to external API browsers
- Helps developers avoid mistakes
 - Spelling and type errors are reduced
- Reduces required keystrokes
 - Increases the amount of information conveyed per keystroke



• Language & API specs (current editors)

Language & API specs

(current editors)

Usage history

[Robbes & Lanza, ASE08], [Hou & Pletcher, ICSM11]

Language & API specs

(current editors)

Usage history

[Robbes & Lanza, ASE08], [Hou & Pletcher, ICSM11]

Example repositories

[Bruch et al, FSE09], [Brandt et al, CHI10], [Mooty et al, VLHCC10], [Nguyen et al, ICSE12]

Language & API specs

(current editors)

Usage history

[Robbes & Lanza, ASE08], [Hou & Pletcher, ICSM11]

Example repositories

[Bruch et al, FSE09], [Brandt et al, CHI10], [Mooty et al, VLHCC10], [Nguyen et al, ICSE12]

Language & API specs

(current editors)

Usage history

[Robbes & Lanza, ASE08], [Hou & Pletcher, ICSM11]

Example repositories

[Bruch et al, FSE09], [Brandt et al, CHI10], [Mooty et al, VLHCC10], [Nguyen et al, ICSE12]

Direct user responses

Language & API specs

(current editors)

Usage history

[Robbes & Lanza, ASE08], [Hou & Pletcher, ICSM11]

• Example repositories

[Bruch et al, FSE09], [Brandt et al, CHI10], [Mooty et al, VLHCC10], [Nguyen et al, ICSE12]

Direct user responses -

...to which questions?

Language & API specs

(current editors)

Usage history

[Robbes & Lanza, ASE08], [Hou & Pletcher, ICSM11]

Example repositories

[Bruch et al, FSE09], [Brandt et al, CHI10], [Mooty et al, VLHCC10], [Nguyen et al, ICSE12]

Direct user responses to domain-specific queries

Language & API specs

(current editors)

Usage history

[Robbes & Lanza, ASE08], [Hou & Pletcher, ICSM11]

Example repositories

[Bruch et al, FSE09], [Brandt et al, CHI10], [Mooty et al, VLHCC10], [Nguyen et al, ICSE12]

Direct user responses to domain-specific queries

Let domain experts decide!

Language & API specs

(current editors)

Usage history

[Robbes & Lanza, ASE08], [Hou & Pletcher, ICSM11]

Example repositories

[Bruch et al, FSE09], [Brandt et al, CHI10], [Mooty et al, VLHCC10], [Nguyen et al, ICSE12]

Direct user responses to domain-specific queries [Omar et al, ICSE12]

= Active Code Completion



```
public class Matcher {
     public static boolean isTemperature(String s) {
          Pattern p =
                           G<sup>#</sup> Use the regular expression workbench...
                                                                       Displays a workbench that allows you to enter a regular
     }
                                                                       expression pattern and test it against positive and
}
                          G Pattern – java.util.regex
                                                                       negative examples. Automatically handles escape

    p : Pattern

                                                                       sequences!
                           Is : String
                           SisTemperature(String s) : boolean - Match
                          G Matcher - edu.cmu.cs.comar
                                                                                       Press 'Tab' from proposal table or click for focus
                                   Press '^Space' to show Template Proposals
```

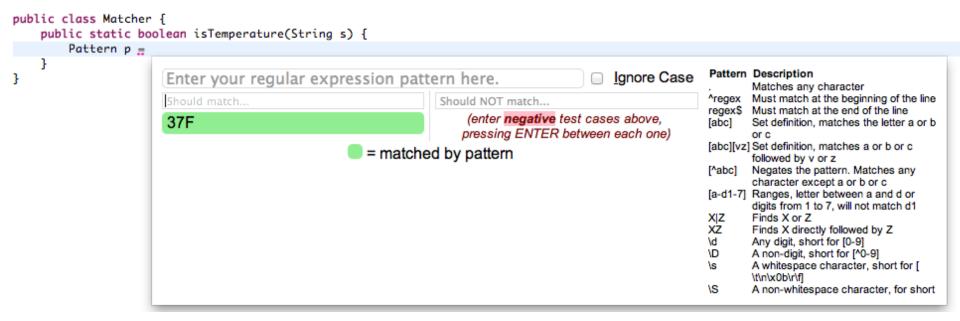
Carnegie Mellon University, School of Computer Science

er Science

```
public class Matcher {
     public static boolean isTemperature(String s) {
          Pattern p =
     }
                            Enter your regular expression pattern here.
                                                                                                                                 Pattern Description
                                                                                                               Ignore Case
                                                                                                           ł
                                                                                                                                         Matches any character
                                                                                                                                 *regex Must match at the beginning of the line
                           Should match..
                                                                               Should NOT match...
                                                                                                                                 regex$ Must match at the end of the line
                                 (enter positive test cases above,
                                                                                    (enter negative test cases above,
                                                                                                                                 [abc]
                                                                                                                                         Set definition, matches the letter a or b
                                pressing ENTER between each one)
                                                                                   pressing ENTER between each one)
                                                                                                                                         or c
                                                                                                                                 [abc][vz] Set definition, matches a or b or c
                                                                                                                                         followed by v or z
                                                                                                                                 [^abc]
                                                                                                                                         Negates the pattern. Matches any
                                                                                                                                         character except a or b or c
                                                                                                                                 [a-d1-7] Ranges, letter between a and d or
                                                                                                                                         digits from 1 to 7, will not match d1
                                                                                                                                 X|Z
XZ
                                                                                                                                         Finds X or Z
                                                                                                                                         Finds X directly followed by Z
                                                                                                                                 ١d
                                                                                                                                         Any digit, short for [0-9]
                                                                                                                                 \D
                                                                                                                                         A non-digit, short for [^0-9]
                                                                                                                                         A whitespace character, short for [
                                                                                                                                 \s
                                                                                                                                         \t\n\x0b\r\fl
                                                                                                                                 ۱s
                                                                                                                                         A non-whitespace character, for short
```

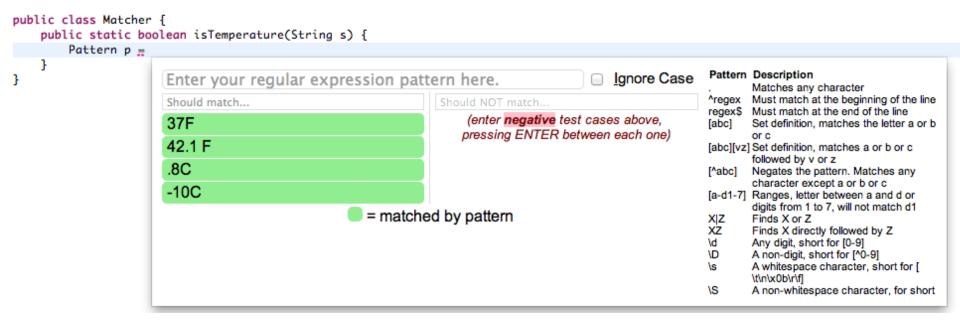
Carnegie Mellon University, School of Computer Science

er Science



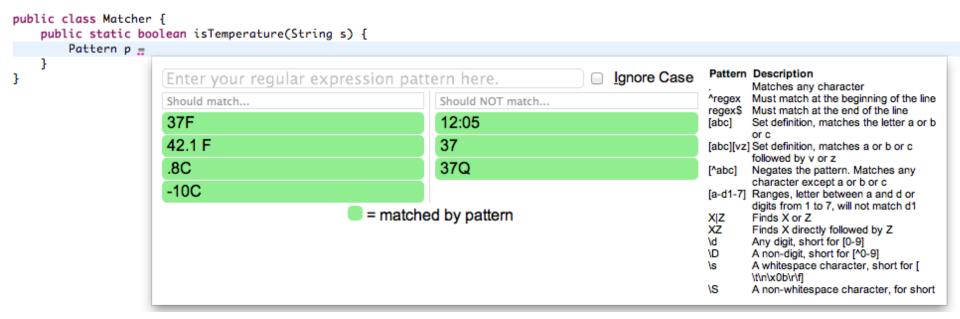
Carnegie Mellon University, School of Computer Science

er Science



Carnegie Mellon University, School of Computer Science

er Science



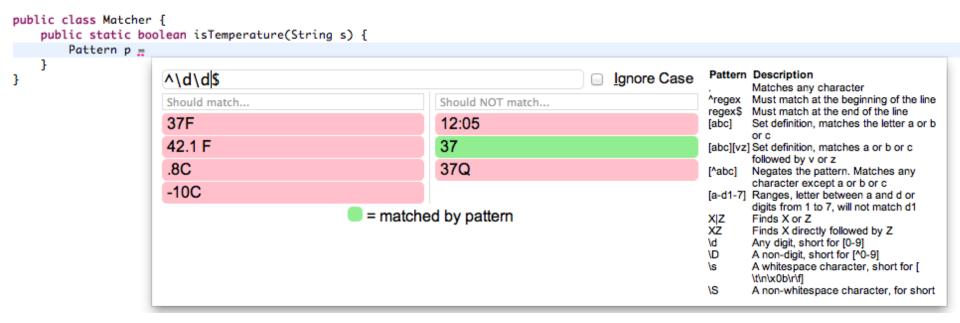
Carnegie Mellon University, School of Computer Science



| public class Matcher public static bo | { olean isTemperature(String s) { | | |
|------------------------------------------|--------------------------------------|------------------|------------------------------------------------------------------------------------------------------|
| Pattern p 📻 | | | |
| } | ^ \$ | □ Ignore Case | Pattern Description Matches any character |
| | Should match | Should NOT match | ^regex Must match at the beginning of the line |
| | 37F | 12:05 | regex\$ Must match at the end of the line [abc] Set definition, matches the letter a or b or c |
| | 42.1 F | 37 | [abc][vz] Set definition, matches a or b or c |
| | .8C | 37Q | followed by v or z [^abc] Negates the pattern. Matches any |
| | -10C | | character except a or b or c [a-d1-7] Ranges, letter between a and d or |
| | = matched by pattern | | digits from 1 to 7, will not match d1 X Z Finds X or Z XZ Finds X directly followed by Z |
| | | | \d Any digit, short for [0-9] |
| | | | \D A non-digit, short for [^0-9] |
| | | | \s A whitespace character, short for [\t/n\x0b\r\f] |
| | | | \S A non-whitespace character, for short |

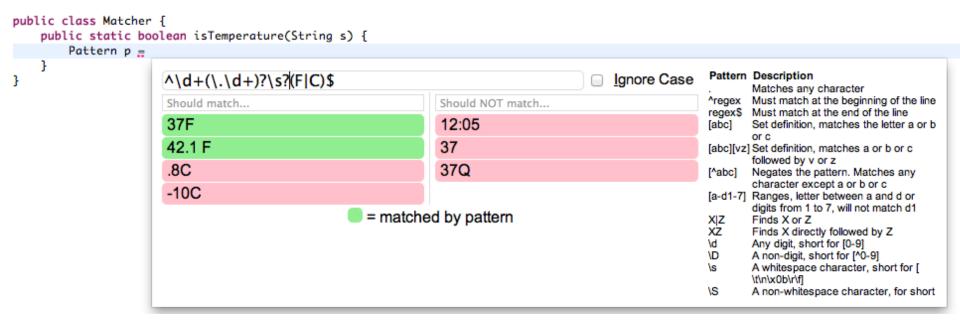
Carnegie Mellon University, School of Computer Science





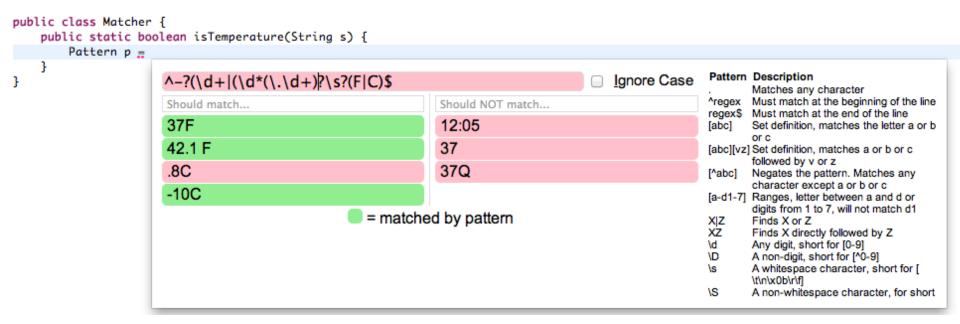
Carnegie Mellon University, School of Computer Science





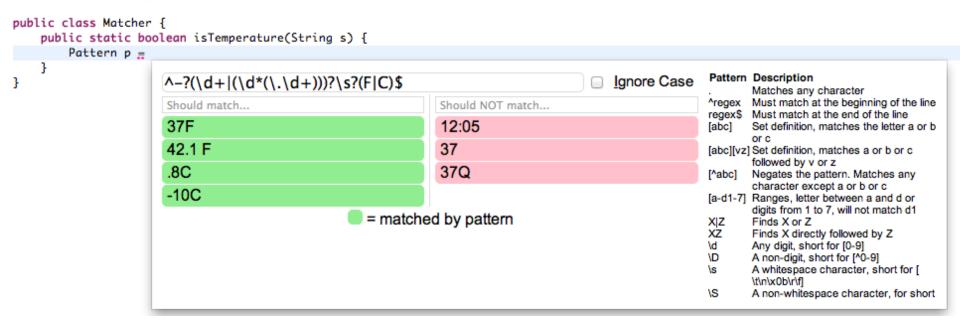
Carnegie Mellon University, School of Computer Science





Carnegie Mellon University, School of Computer Science





Carnegie Mellon University, School of Computer Science

import java.util.regex.Pattern;

}

}

```
public class Matcher {
    public static boolean isTemperature(String s) {
        Pattern p = Pattern.compile("^-?(\\d+l(\\d*(\\.\\d+)))?\\s?(FIC)$");
        /*
         * Should match:
             37F
         *
            42.1 F
         *
             .80
         *
         *
             -10C
         *
         * Should NOT match:
         *
             12:05
             37
         *
         *
             37Q
         *
         */
```

Our Design Methodology

- 1. Large developer survey to validate this idea and develop design criteria and use cases before implementation!
- 2. Tool design and implementation (GRAPHITE)
- 3. Controlled pilot study to justify usefulness claims



Survey Method

- Target: professional developers
- Participants recruited from
 - "reddit.com" programming forum
 - ~340,000 registered readers
 - Local CS graduate students mailing list (22)
- 696 people started the survey (~20 minutes long)
 - **475** people completed the survey, we only analyzed these responses

Participant Experience

 Participant's experience with regular expressions and SQL

| | Regular Expressions | SQL |
|------------------|----------------------------|-------|
| Never used | 4.8% | 0.0% |
| Use infrequently | 46.7% | 37.4% |
| Use frequently | 48.4% | 62.6% |

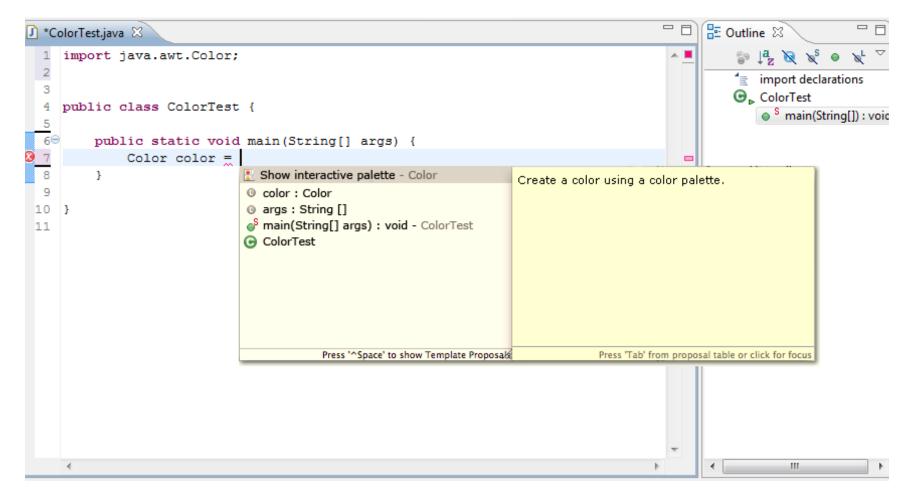
 Along with experience with programming languages, implies that most participants are professional programmers

I. Mockups

- For each of three classes
 (Color, Regular Expressions, SQL query)
 - Ask which strategy they would naturally use to instantiate the given class
 - Show them mockup screenshots of our tool
 - Ask how often they would use the tool if they wanted to instantiate the class
 - Ask them to qualify the answer or make suggestions (open-ended)

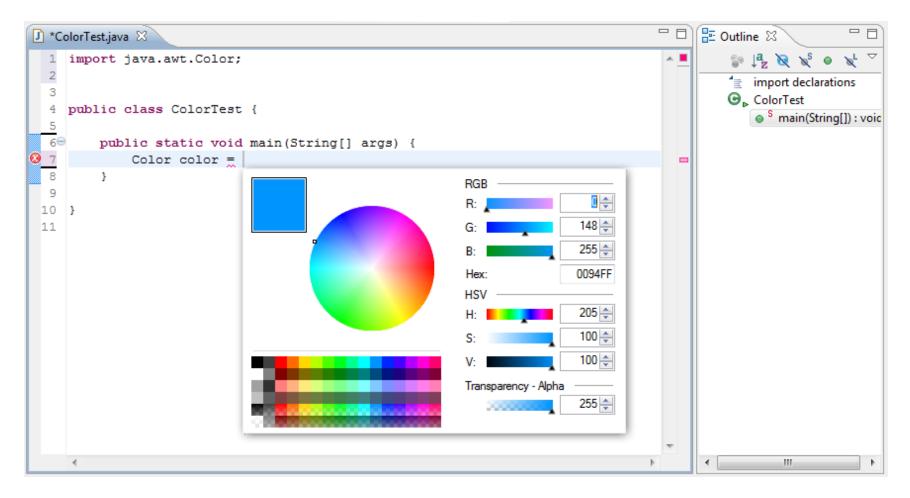


Mockup – Color





Mockup – Color





Mockup – Color

| J *Col | orTest.java 🕱 | - 8 | 🗄 Outline 🛛 📃 🗖 |
|-----------------|--------------------------------------------|-----|-----------------------------------------------------------------------------------------------------------|
| 1 i | mport java.awt.Color; | × 📃 | 🗊 📲 💘 🗙 🔍 🔍 🗸 |
| 5 | public class ColorTest { | | import declarations G_▶ ColorTest S main(String[]) : voic |
| 6⊖ 2010 - 60 | public static void main(String[] args) { | | |
| 8 | Color color = new Color(0, 148, 255, 255); | | |
| 9 | 1 | | |
| 10 } | | | |
| 11 | | | |
| | | | |
| | | | |
| | | | |
| | | | |
| | | | |
| | | | |
| | | | |
| | | | |
| | | | |
| | | | |
| | | _ | |
| | 6 | P. | () () () () () () () () () () |
| | | | |

Mockup – Regular Expressions

| 🚺 *EmailVerifier.java 🕱 🧮 | ' 🗆 | E Outline 🛛 🗖 🗖 |
|--------------------------------------------------------------------------------------------------------------------------------------------------|-----|---------------------------|
| <pre>package examples;</pre> | | 🎲 ↓ª 😿 🔌 🖋 Θ 🗙 ⊂ |
| <pre>import java.util.regex.*;</pre> | | examples |
| | | Import declarations |
| <pre>public class EmailVerifier {</pre> | | 4— java.util.regex.* |
| <pre>Description for the static boolean verify(String s) {</pre> | - | ▼ |
| Pattern emailPattern = | | Sverify(String) : boolean |
| <pre>} } \\w+@\w+\.[(edu) (org) (net) (com)] } add positive negative Flags: imsu + albert@princeton.edu + hawking@cam.ac.uk - jim@yahoo </pre> | | |
| Regex Reference | | |

Mockup – SQL queries

| 🚺 JdbcTest.java 🛛 🔀 | - 0 |
|-----------------------------------------------------|-----|
| <pre>import java.sql.*;</pre> | |
| class JdbcTest { | |
| <pre>public static void main(String[] args) {</pre> | |
| ResultSet custTowns = | |
| SELECT CustomerTown FROM Persons | |
| Connect to Send Query | |
| CustomerTown | |
| Lincoln | |
| Manchester | |
| Nottingham Nottingham | |
| Nottingham | |
| Swindon | |
| London | |
| London | |
| Wigan | |
| | |

I. Mockups

- For each of three classes
 (Color, Regular Expressions, SQL query)
 - Ask which strategy they would naturally use to instantiate the given class
 - Show them mockup screenshots of our tool
 - Ask how often they would use the tool if they wanted to instantiate the class
 - Ask them to qualify the answer or make suggestions (open-ended)

Default Strategy – Regex, SQL

| | Regular Expressions | SQL |
|----------------------|----------------------------|-------|
| Separate test script | 29.7% | 15.5% |
| Guess and check | 13.4% | 16.0% |
| External tool | 38.5% | 58.9% |
| Search for examples | 12.1% | 4.8% |
| Other | 6.2% | 4.8% |

I. Mockups

- For each of three classes
 (Color, Regular Expressions, SQL query)
 - Ask which strategy they would naturally use to instantiate the given class
 - Show them mockup screenshots of our tool
 - Ask how often they would use the tool if they wanted to instantiate the class
 - Ask them to qualify the answer or make suggestions (open-ended)

Usefulness of Mockups

• "Consider situations where you need to instantiate the [specified] class. What portion of the time, in these situations, do you think you would use this feature?"

| | Nearly every time the time of the time Most of Some of the time Never | | | | |
|--------|-----------------------------------------------------------------------|-------|-------|-------|-------------|
| CLASS | Near | Mosi | Some | Rare | Never Never |
| Color | 9.6% | 22.1% | 32.4% | 28.2% | 7.7% |
| RegExp | 36.6% | 29.5% | 21.8% | 7.3% | 4.8% |
| SQL | 18.2% | 19.3% | 30.9% | 20.4% | 11.4% |

I. Mockups

- For each of three classes
 (Color, Regular Expressions, SQL query)
 - Ask which strategy they would naturally use to instantiate the given class
 - Show them mockup screenshots of our tool
 - Ask how often they would use the tool if they wanted to instantiate the class
 - Ask them to qualify the answer or make suggestions (open-ended)

System Design Constraints

- Reversibility (**19** across classes)
 - Bring palette back up from data
- Palette settings and state
 - Wanted recent regexes + control over comments (12)
 - Persistent database connection information (9)
 - Recent colors (20)
- IDE/language independence
 - Several expressed a desire for IDE or even language independence of this feature

Active Code Completion with GRAPHITE

Carnegie Mellon University, School of Computer Science

r Science

import java.util.regex.Pattern;

}

```
public class Matcher {
    public static boolean isTemperature(String s) {
        Pattern p = Pattern.compile("^-?(\\d+1(\\d*(\\.\\d+)))?\\s?(FIC)$");
        /*
         * Should match:
             37F
         *
             42.1 F
         *
             .80
         *
             -10C
         * Should NOT match:
             12:05
         *
             37
         ske.
             37Q
         *
         */
    ł
```



import java.util.regex.Pattern;

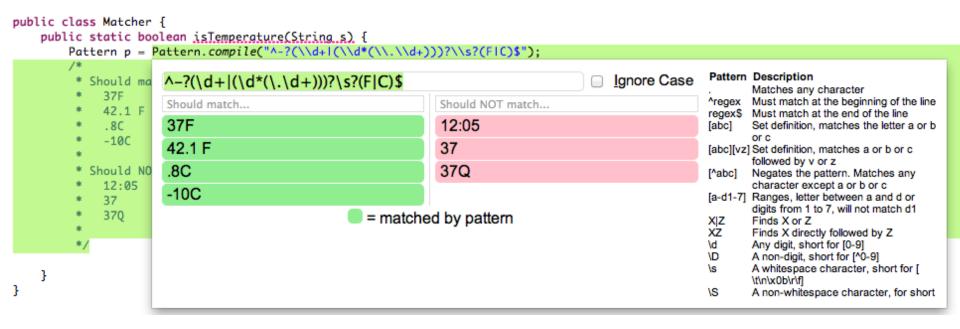
public class Matcher {

}

public static boolean isTemperature(String s) {

| Pattern p = | Pattern.compile("^-?(\\d+l(\\d*(\\ | .\\d+)))?\\s?(FIC) \$"); |
|-------------------------------------------|------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| * 37F * 42.1 F * .8C * -10C * | Use the regular expression workbench Pattern - java.util.regex p : Pattern s : String isTemperature(String s) : boolean - Matcher Matcher - edu.cmu.cs.comar runnable - runnable | Displays a workbench that allows you to enter a regular expression pattern and test it against positive and negative examples. Automatically handles escape sequences! |
| * 37Q | Press '^Space' to show Template Proposals | Press 'Tab' from proposal table or click for focus |
| * */ | | |

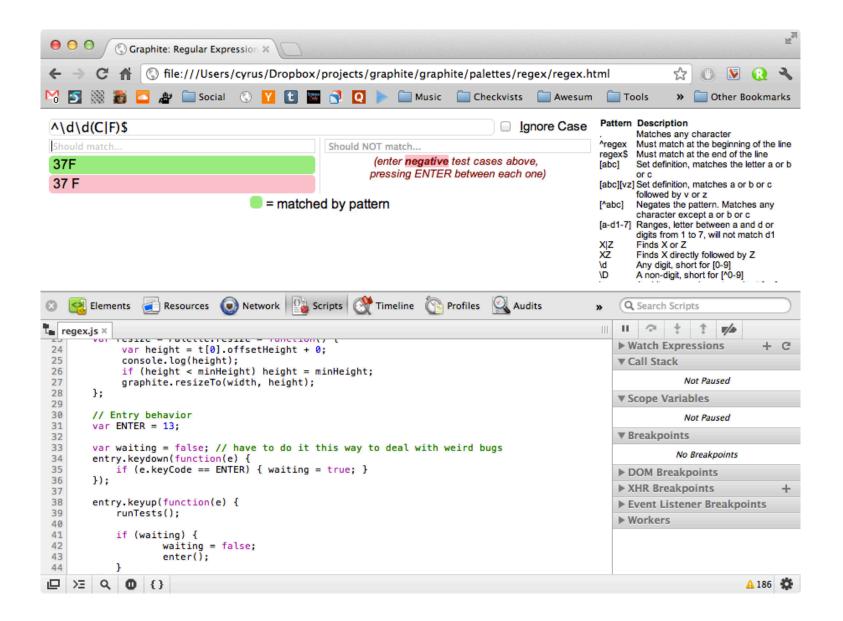
import java.util.regex.Pattern;



System Design Constraints

- Reversibility (19 across classes)
 - Bring palette back up from data
- Palette settings and state
 - Wanted recent regexes + control over comments (**12**)
 - Persistent database connection information (9)
 - Recent colors (20)
- IDE/language independence
 - Several expressed a desire for IDE or even language independence of this feature

Carnegie Mellon University, School of Computer Science



Carnegie Mellon University, School of Computer Science

Associating a Palette with a Class

import edu.cmu.cs.graphite.GraphitePalette;

@GraphitePalette(url="http://www.cs.cmu.edu/~comar/regex.html", description="Regular expression matcher!") public class Pattern { 11 ... } $\Theta \cap \Theta$ Preferences 0 type filter text Graphite ▶General ►Ant General PaletteAssociation Keywords Fully gualified name o Display stri Url of Palette Description ► Help Add Use the col file:///Users/cyrus/Dropbox/pro Displays a color chooser that a java.awt.Color Install/Update java.util.regex.Pattern Use the reg file:///Users/cyrus/Dropbox/pro Displays a workbench that allo ▶Java Remove ▶Mylyn ^ or -> ▶ Plug-in Development ▶Run/Debug ▶Team ▶Usage Data Collector Validation ► XML Restore Defaults Apply ? Cancel OK



II. Suggestions

 Ask what other classes could benefit from these kind of interactive palettes (open-ended)

• Alternatives / Tricky / Literal Syntax (16)

- Example classes
 - string, vector, dictionary, matrix
 - URLs, paths
 - embedded languages (e.g. HTML)

| Collection Class | Total | Literal | Percentage |
|------------------|-------|---------|------------|
| ArrayList | 464 | 44 | 9.5% |
| HashMap | 56 | 19 | 33.9% |
| HashSet | 122 | 62 | 50.8% |
| Hashtable | 86 | 10 | 11.6% |
| Vector | 729 | 31 | 4.2% |
| Total | 1457 | 166 | 11.4% |

Figure 4. Usage patterns for common Java collection classes in the java.util package in our code corpus. Uses that fit a pattern that can be captured by a literal make up a significant portion of all uses. Not all possible usage scenarios of this type were captured by our analysis, so these numbers are lower bounds.



• Unclear Parameter Implications (11)

- Example classes
 - audio tweaks
 - 3D transformation matrices
 - number/string/date formatting
- What people wanted
 - modify the parameters and see the results directly without running the application

• Query Languages (17)

- Example classes
 - regular expressions
 - SQL queries
 - XPath / XQuery
- What people wanted
 - testing the query result directly without running the application

• Graphical Elements (27)

- What people wanted
 - checking the graphical property directly
 - manipulating the layout of GUI elements
- Example classes
 - color, font, shape, thickness, etc.
 - JFrame, layouts, any swing components, etc.



• Describe by Example (2)

- Example classes
 - keyboard keys (e.g., shortcut keys)

Integrating with Documentation, Tutorials (7)

Pilot Study Overview

- Observe users doing regular expression tasks with and without Graphite.
- Hypotheses:
 - Control subjects (4) will have more trouble with:
 - Factory pattern initialization: Pattern.compile(...)
 [Ellis et al, ICSE07]
 - Escaping of strings: Pattern.compile("\\d")
 - Treatment subjects (3) will complete more tasks and test more examples



Protocol

- Pre-survey asking the familiarity with:
 - Programming languages
 - Integrated development environments
 - Regular expressions
- Give a demo of how to use Graphite plug-in with the Color palette
 - Only for the treatment group
- Instruct them how to complete the tasks and start the experiment

Pilot Study Results

• Hypotheses:

- Control subjects had trouble with:
 - Factory pattern initialization: Pattern.compile(...)
 [Ellis et al, ICSE07]
 - ✓ Escaping of strings: Pattern.compile("\\d")
- Treatment subjects completed more tasks and tested more examples

Pilot Study Results

• Hypotheses:

- Control subjects had trouble with:
 - Factory pattern initialization: Pattern.compile(...)
 [Ellis et al, ICSE07]
 - ✓ Escaping of strings: Pattern.compile("\\d")
- Treatment subjects completed more tasks and tested more examples
- Treatment subjects were uniformly positive.
 Control subjects later shown the palette were also positive.



DEFINITION. Active Code Completion

- A code completion system that **actively engages** both users and providers during code completion
 - 1. Providers equip types with specialized user interfaces (*palettes*)
 - 2. API clients interact with palettes to provide requested information about their intent
 - 3. API providers generate code based on this information



Benefits of Active Code Completion

- Domain-specific tools can be easily integrated directly into the editor (fewer context switches) and discovered more easily.
- Palettes can handle tricky aspects of an API (e.g. factory patterns, string escaping)

Our Design Methodology

- 1. Large developer survey to validate this idea and develop design criteria and use cases before implementation!
- 2. Tool design and implementation (GRAPHITE) http://www.cs.cmu.edu/~NatProg/graphite.html
- Controlled pilot study to justify usefulness claims



Broader Trends

Extensible languages require extensible development environments.

Active typing: directly equipping types with relevant compile-time and <u>design-time</u> logic.

More to come!



Thanks!

- Jonathan Aldrich and the CMU PLAID group
- Students in 05-899D: Human Aspects of Software Development (co-taught by Thomas LaToza and Brad Myers)
- UIUC Software Engineering Seminar
- All our participants and subjects!