Exploring Novice Programmer Example Use

Michelle Ichinco and Caitlin Kelleher Washington University in St. Louis

Programming as Assembly of Example Code

Programmers spend ~19% of their time programming on the web.

Stack Overflow

```
Use a sequential for loop:

1713    var myStringArray = ["Hello", "World"];
    var arrayLength = myStringArray.length;
    for (var i = 0; i < arrayLength; i++) {
        alert(myStringArray[i]);
        //Do something
}</pre>
```

Java Doc Tutorials

```
printPersonsWithPredicate(
    roster,
    p -> p.getGender() == Person.Sex.MALE
    && p.getAge() >= 18
    && p.getAge() <= 25
);</pre>
```

Existing Example Support

J. Brandt, M. Dontcheva, M. Weskamp, and S. R. Klemmer, "Example-centric programming: integrating web search into the development environment," in Proceedings of the SIGCHI Conference on Human Factors in Computing Systems, 2010, pp. 513–522.

Novice Programmers Struggle Using Examples

Non-expert programmers have trouble reusing code found online without support

- Messing up working code
- Code not accomplishing goal

Example Use Studies Focus on Adult Programmers

Increasing number of programming applications and resources for children







J

- 1. "Anybody Can Learn | Code.org" [Online]. Available: http://code.org
- 2. "Looking Glass Community." [Online]. Available: https://lookingglass.wustl.edu/.
- "Scratch | Home | imagine, program, share." [Online]. Available: http://scratch.mit.edu/

Research Questions

- 1. What **hurdles** do novice programmers encounter using examples?
- 2. What **strategies** do novice programmers use while attempting to use examples?

- Exploratory study
- > Labelled transcript data to understand behavior
- Hurdles & Strategies

User Study

What does novice example use look like?

"I don't like to copy because I like to learn how to do it myself."

Novice Example Use



Do together task

Task



```
Pig say I I'm here!! I'm here!! add detail

Pig getRightShoulder turn BACKWARD, 50.25 rotations add detail

Pig getRightShoulder turn BACKWARD, 50.25 rotations add detail

Pig getLeftShoulder turn BACKWARD, 50.25 rotations add detail

Pig getLeftShoulder turn BACKWARD, 50.25 rotations add detail
```

Example

```
Dolphin move UP , 2.5 meters add detail

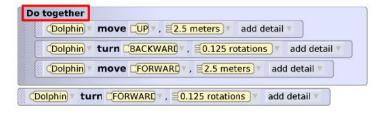
Dolphin turn BACKWARD , 0.125 rotations add detail

Dolphin move FORWARD , 2.5 meters add detail

Dolphin turn FORWARD , 0.125 rotations add detail
```

Do together task





```
Completed
Task
```

```
Pig say "I'm here!! I'm here!!" add detail

Do together

Pig getRightShoulder turn BACKWARD , 50.25 rotations add detail

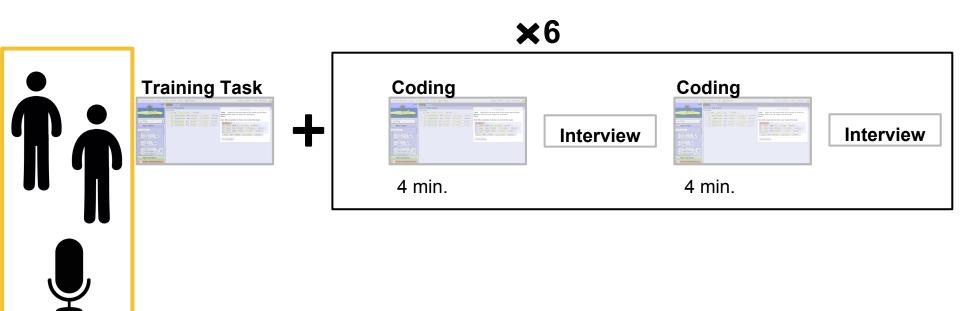
Pig getLeftShoulder turn BACKWARD , 50.25 rotations add detail

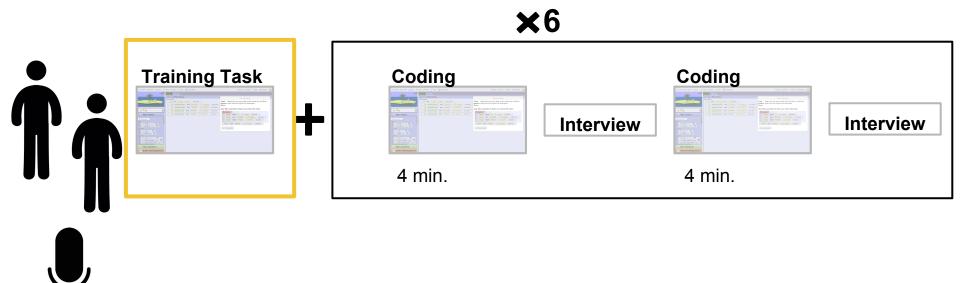
Do together

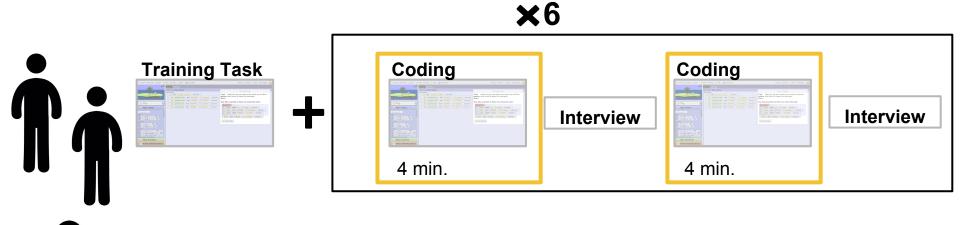
Pig getLeftShoulder turn FORWARD , 50.25 rotations add detail

Pig getRightShoulder turn FORWARD , 50.25 rotations add detail
```

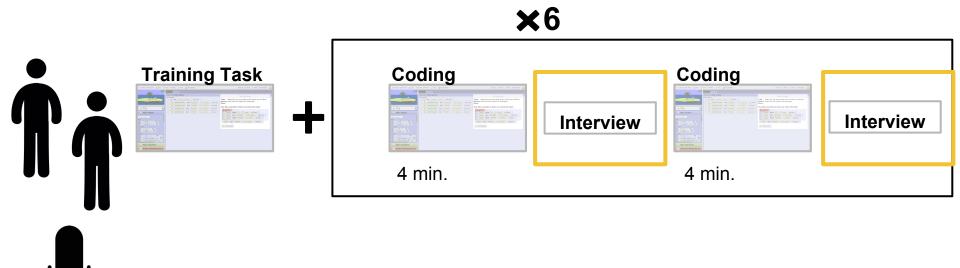
What are novices thinking while completing tasks with examples?







- 6 concepts: simple parallel execution, for loop, API method, function, while loop condition, for each iterator
- Based on formative and pilot studies



Study Participants

9 pairs of participants

Participant screening criteria:

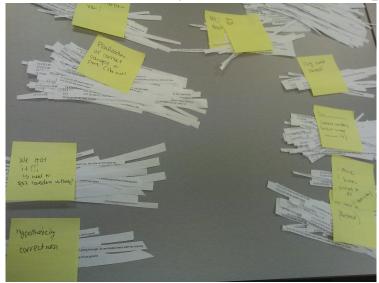
aged 10-15

<= 3 hours of programming experience

Research Questions

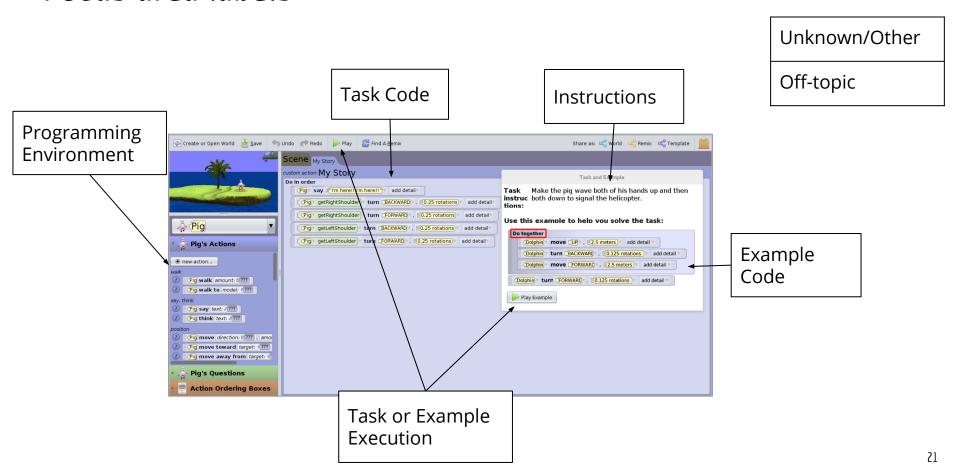
- 1. What **hurdles** do novice programmers encounter using examples?
- 2. What **strategies** do novice programmers use while attempting to use examples?

Qualitative Analysis: Transcription Labeling



- Inter-rater agreement: 20% of transcripts, **83% agreement**
- Two groups:
 - Focus Area: which part of the task/environment
 - Process: what they're doing

Focus area labels



Focus area labels

Programming Environment:

"Pig actions Place da da da da . Turn. Appear disappear, resize. Hmm"



Focus area labels

Task Code:

"There's get right shoulder, hmmm.Get right shoulder hmm"

```
Pig say for here!! I'm here!!" add detail

Pig getRightShoulder turn BACKWARD , = 0.25 rotations add detail

Pig getRightShoulder turn FORWARD , = 0.25 rotations add detail

Pig getLeftShoulder turn BACKWARD , = 0.25 rotations add detail

Pig getLeftShoulder turn FORWARD , = 0.25 rotations add detail
```

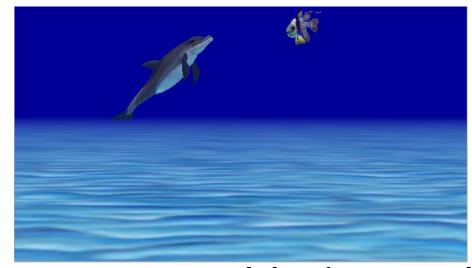
- Description
- Idea
- Evaluation
- Unknown/Other

- Description
- Description-realization
- Description-don't understand



"Play the example again cause. It goes up and then it stops and turns a bit"

Example execution: description



"Play the example again cause. It goes up and then it stops and turns a bit"

- . Idea
- Idea-realization
- Idea-don't know how

```
Pig v say J"I'm here!! I'm here!! "
                                  add detail
Do together
           getRightShoulder
                             turn BACKWARD , 50.25 rotations
                                                                 add detail▼
     Pig getLeftShoulder
                           turn BACKWARD , 50.25 rotations
                                                                add detail▼
Do together
           getLeftShoulder
                            turn FORWARD , 50.25 rotations
                                                               add detail
           getRightShoulder
                             turn FORWARD , 50.25 rotations
                                                                add detail
```

"Maybe I could try using two of them [do togethers] instead."

Task code: idea

```
Pig v say J"I'm here!! I'm here!! "
                                  add detail™
Do together
           getRightShoulder
                             turn BACKWARD , 50.25 rotations
                                                                 add detail▼
     Pig getLeftShoulder
                           turn BACKWARD , 50.25 rotations
                                                                add detail▼
Do together
          getLeftShoulder
                                                               add detail
                            turn FORWARD , 50.25 rotations
          getRightShoulder
                             turn FORWARD , 50.25 rotations
                                                                add detail
```

"Maybe I could try using two of them [do togethers] instead."

- Evaluation-working
- Evaluation-possibly working
- Evaluation-not working

"I'm just gonna see if this works.YESS! We did it!!! awesome!!!"

Realization labels

"OHHHHH! So I don't know where we'd get this whole repeat 4 times thing, but I think I kind of understand it."

Realization labels

"OHHHHH! So I don't know where we'd get this whole repeat 4 times thing, but I think I kind of understand it."

"Ohh, so jump. Jumping jack. Then you do repeat two times"

"Wait a minute. wait can I see that again? STOP! OHH cause it's like. here, give me the mouse."

Realization Point: the "first" realization

Definition: the point in time when one participant first talks about the concept in the example needed to complete the task

```
Do together

Dolphin move UP , 2.5 meters add detail

Dolphin turn BACKWARD , 0.125 rotations add detail

Dolphin move FORWARD , 2.5 meters add detail

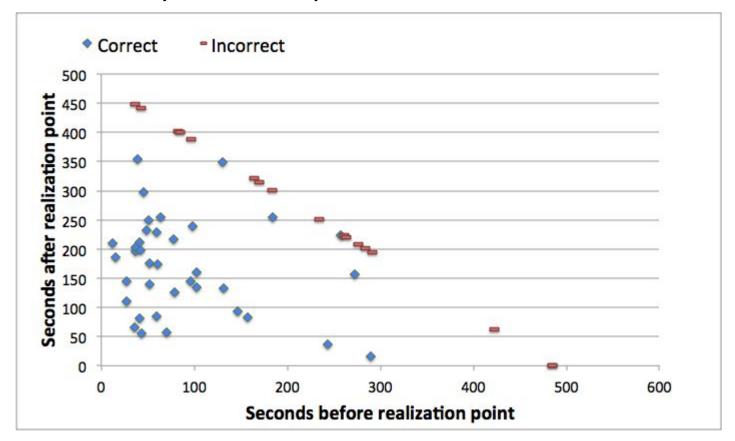
Dolphin turn FORWARD , 0.125 rotations add detail
```

Results

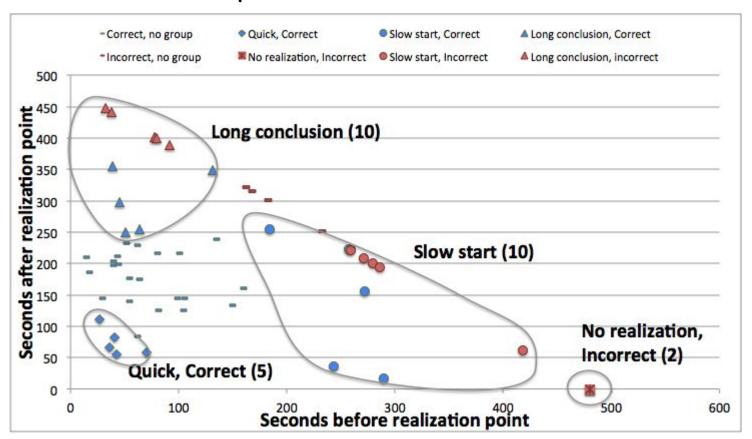
- What **hurdles** do novice programmers encounter using examples?
- 2. What **strategies** do novice programmers use while attempting to use examples?

How can we identify strategies and hurdles?

Task Times Before and After Realization Point



Task Behavior Groups



Hurdles & Strategies

Hurdles:

- Example Comprehension
- Programming Environment
- Code Comprehension
- Context Distraction
- Code Misconception

Strategies:

- Idea Generation
- Code-Example Comparison
- Example Emphasis

Hurdles

Example Comprehension Hurdle

"Play example. I don't get how that's supposed to help us. Yeah, I have no idea."

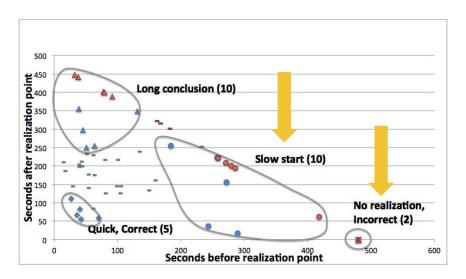
Example Comprehension Hurdle

"Play example. I don't get how that's supposed to help us. Yeah, I have no idea."



Example Comprehension Hurdle

Label	No realization	Slow start, incorrect	
Execution Example Code	.8 x average (BR)	1.6 x average (BR)	
Example Code	0 ≭ average (BR)	1.6 x average (BR)	

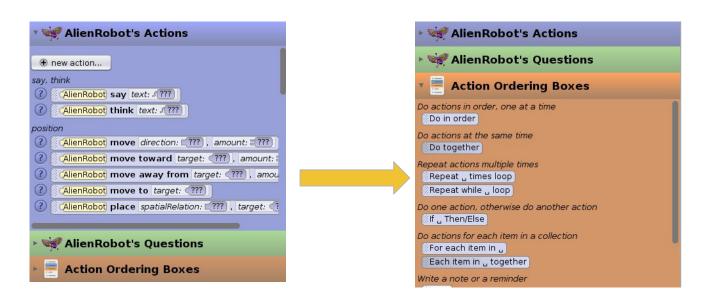


Programming Environment Hurdle

"Then you do repeat two times. How? But it says that you can repeat. Where is the times thing? I don't see that."

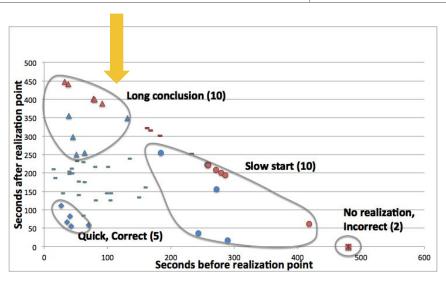
Programming Environment Hurdle

"Then you do repeat two times. How? But it says that you can repeat. Where is the times thing? I don't see that."



Programming Environment Hurdle

Label	Long Conclusion, incorrect
Programming Environment: description- don't understand Programming Environment: idea- don't know how	3.6 ≭ average (AR)



Code Comprehension Hurdle

"Why is he not on the ground?"

Code Comprehension Hurdle

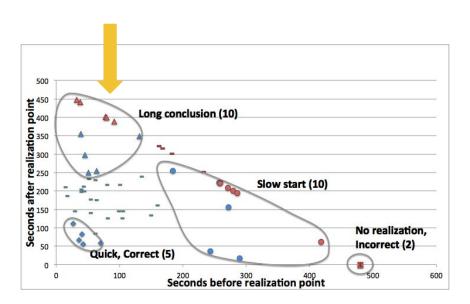
"Why is he not on the ground?"





Code Comprehension Hurdle

Label	Long Conclusion, incorrect	
Task execution: description- don't understand	3.7 ≭ average (AR)	



Strategies

Idea Generation Strategy

"Do we have to put that up there or what? Do we move them in there or something? For it to work? Do we move this?"

Idea Generation Strategy

"Do we have to put that up there or what? Do we move them in there or something? For it to work? Do we move this?"

```
alien say filthink it is time we all take a little trip off of this planet..." add detail

ScottyDog think final solutions add detail

ScottyDog move FORWARD, $0.5 rotations add detail

ScottyDog move FORWARD, $10.0 meters add detail

Girl move CUP, $5.0 meters, duration $2.0 seconds add detail

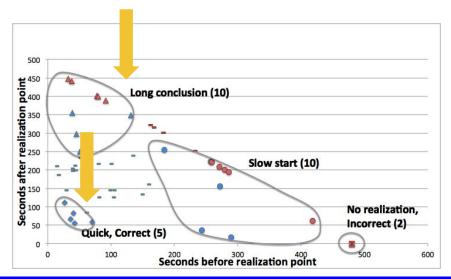
For each (item to beam up in collection: { girl, mom, boy, calien, suitcase }

Drop action here.

loop
```

Idea Generation Strategy

Label	Long Conclusion,correct	Quick, correct
Task Code: idea	1.25 ≭ average (AR)	.4 x average (AR)
Task Code Execution	1.1 ≭ average (AR)	.8 x average (AR)
Task Code: Description- don't understand	.5 x of average (AR)	.5 x of average (AR)



Code-Example Comparison Strategy

"Not is true. But here it's just is true ... That looks like the example [...] but it's got this not thing."

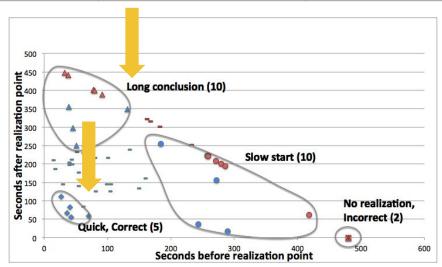
Code-Example Comparison Strategy

"Not is true. But here it's just is true ... That looks like the example [...] but it's got this not thing."



Code-Example Comparison Strategy

Label	Long Conclusion, correct	Quick, correct	
Example Code	1.4 x average (AR)	.75 x average (AR)	



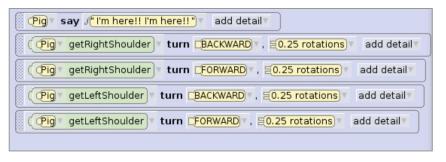
What can we do with these hurdles and strategies?

Educational Systems • Visual Programing Systems • General Example Use

For Educational Systems

Certain behavior can indicate good times for novices to return to examples.

Task Code



Correct Solution



For Educational Systems

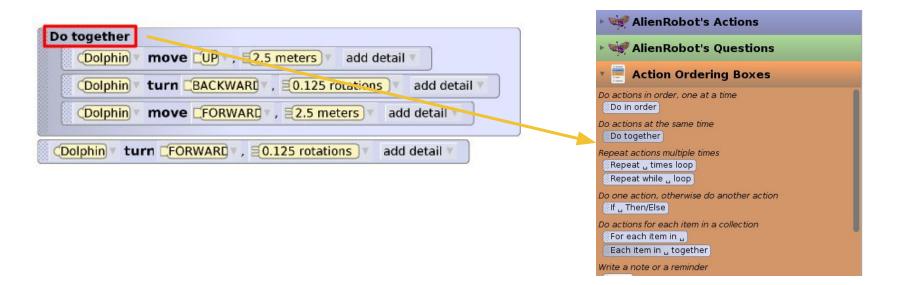
Certain behavior can indicate good times for novices to return to examples.

Examples of such behaviors include:

- many interface interactions that do not lead to solution (BR)
- many incorrect attempts or repeated attempts with minor modifications (AR)

For visual programming environments

It is important to enable novices to easily access code elements in examples.



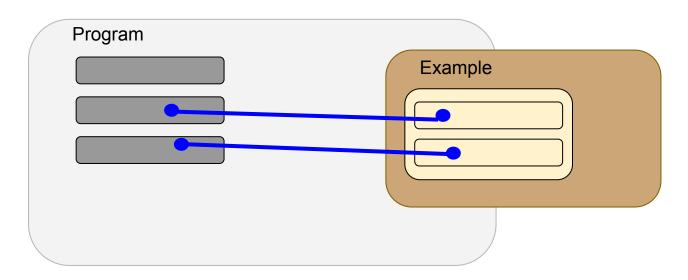
For visual programming environments

It is important to enable novices to easily access code elements in examples.

- visual cues
- functionality to improve and expedite access

General Example Use

How can we help novices better **understand and utilize** the **relationships between examples and program code**?



Thank You

michelle.ichinco@wustl.edu









Context Distraction Hurdle

"Wait, can you, wait click 'as seen by' just out of curiosity"

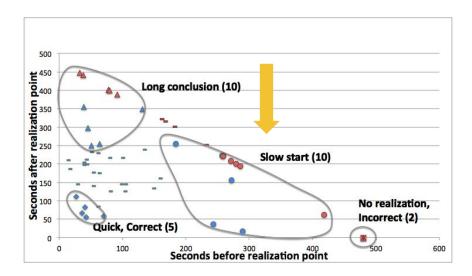
Context Distraction Hurdle

"Wait, can you, wait click 'as seen by' just out of curiosity"



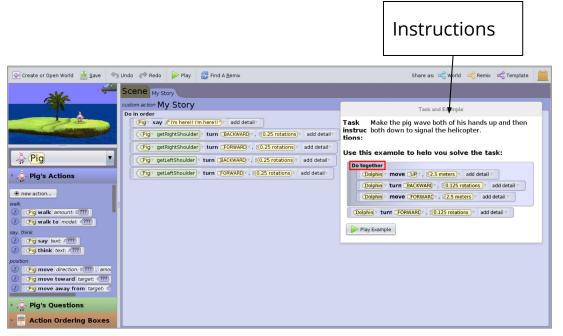
Context Distraction Hurdle

Label	Slow start, correct	
Programming Environment: idea	3.75 ≭ average (BR)	
Instructions: description don't understand	4.3 ≭ average (BR)	

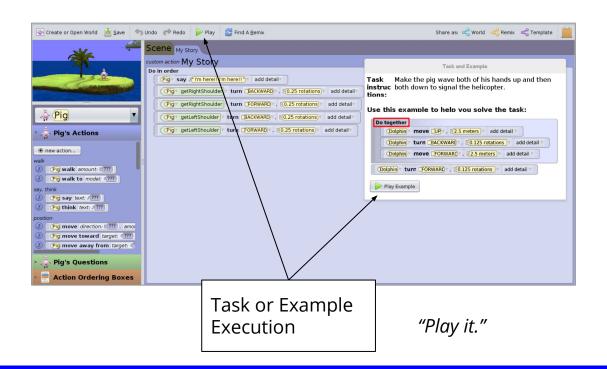


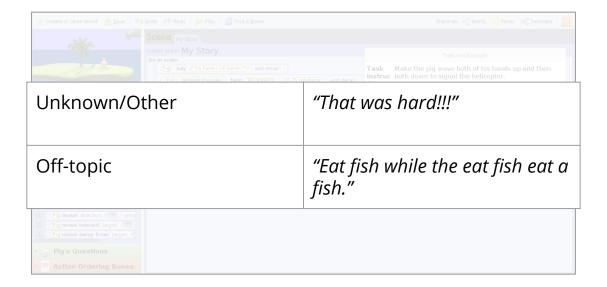
Summary

- Novice programmers may need time to get familiar with task, example, environment before example is useful to them
- Example is often used as a starting point
 - use idea generation to try out new plans
 - returning to the example can help
 - programming environment and lack of further assistance can slow down or impede process

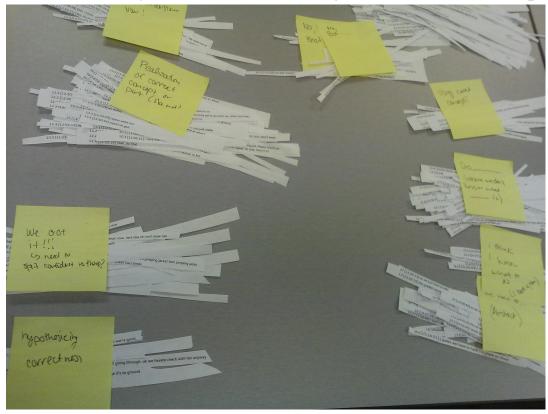


"Okay, make the pig wave both hands up and both hands down to signal the helicopter."





Qualitative Analysis: Transcription Labeling



7.6 hours of audio

Example Code: "It says do together, so we should try to find a way to do that."

```
Dolphin move UP , 2.5 meters add detail

Dolphin turn BACKWARD , 0.125 rotations add detail

Dolphin move FORWARD , 2.5 meters add detail

Dolphin turn FORWARD , 0.125 rotations add detail
```

Existing Example Support

```
Sample Code in the Inline CSS
                                         Sample Code in the separate CSS : format:
                             format:
        Save this code for later use
                                                 Save this code for later use
 <A href='your url'
                                          /*css*/
style='color: rgb(53, 159, 0);
                                           .your class {
 font-family:
                                          color: rgb(53, 159, 0);
 Arial, Helvetica, sans-serif;
                                          font-family:
 font-size: 13px; text-align:
                                          Arial, Helvetica, sans-serif;
 justify; '>Your text.</A>
                                          font-size: 13px;
                                          text-align: justify;
                                           /*html*/
                                           <A href='your url'
                                          class='your class'>Your
                                          text.</a>
```

K. S.-P. Chang and B. A. Myers, "WebCrystal: understanding and reusing examples in web authoring," in Proceedings of the SIGCHI Conference on Human Factors in Computing Systems, 2012, pp. 3205–3214.

Process labels

Unknown/other

"What a beautiful pig."

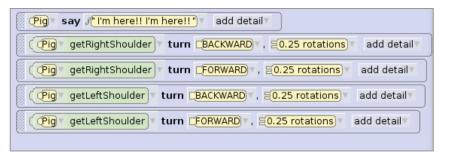
Code Misconception Hurdle

"Maybe you put the right shoulder, maybe you switch those around. [...] Cause then it would go in sync."

Code Misconception Hurdle

"Maybe you put the right shoulder, maybe you switch those around. [...] Cause then it would go in sync."

Task Code

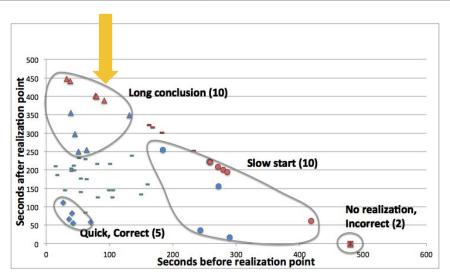


Correct Solution



Code Misconception Hurdle

Label	Long Conclusion, incorrect	
Task Code: idea	3 x average (A)	
Task Code Execution	2.5 x average (A)	



Example Emphasis Strategy

"We just saw the outline."

Example Emphasis Strategy

"We just saw the outline."

```
Dolphin move UP , 2.5 meters add detail

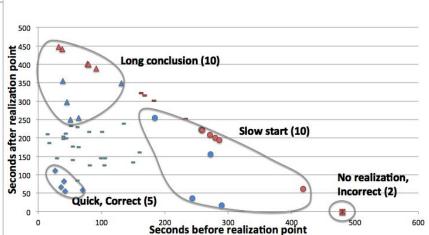
Dolphin turn BACKWARD , 0.125 rotations add detail

Dolphin move FORWARD , 2.5 meters add detail

Dolphin turn FORWARD , 0.125 rotations add detail
```

Example Emphasis Strategy

Label	Slow Start, correct	Slow Start, correct	Quick, correct	Long Conclusion, correct	Long Conclusion, incorrect
Example Code	1.7 x avg. (B)	1.7 x avg. (B)	0.3 ≭ avg. (B)	1.3 x avg. (B)	1 ≭ avg. (B)



Example use as part of non-expert programming behavior

- Code Reuse¹
- Debugging²
- Programming behaviors³
- [Programming with examples] 🛨



^{1.} P. Gross and C. Kelleher, "Non-programmers identifying functionality in unfamiliar code: strategies and barriers," J. Vis. Lang. Comput., vol. 21, no. 5, pp. 263–276, 2010. 2.3, 1996. C. Kissinger, M. Burnett, S. Stumpf, N. Subrahmaniyan, L. Beckwith, S. Yang, and M. B. Rosson, "Supporting end-user debugging: what do users want to know?," in Proceedings of the working conference on Advanced visual interfaces, 2006, pp. 135–142. 3.A. J. Ko, B. A. Myers, and H. H. Aung, "Six learning barriers in end-user programming systems," in Visual Languages and Human Centric Computing, 2004 IEEE