

CSCI 334:  
Principles of Programming Languages

Lecture 7: PL Fundamentals III

Instructor: Dan Barowy  
**Williams**

Announcements

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Resubmission procedure

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Wednesday Office Hours now  
3pm-5pm  
(originally: 10am-noon)

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3pm-5pm  
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(If these hours still don't work  
for you, make an appointment)

## Mental Technique #3

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Confusion is not necessarily a bad thing.



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### **Sometimes Confusion is a Good Thing**

Tania Lombrozo  
NPR, December 14, 2015

<https://www.npr.org/sections/13.7/2015/12/14/459651340/sometimes-confusion-is-a-good-thing>

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### **Sometimes Confusion is a Good Thing**

Tania Lombrozo  
NPR, December 14, 2015

“Students who were confused ... as reflected in inconsistent responses on subsequent questions ... ultimately did better on a final test assessing whether they learned the key points from the lessons.”

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### **Sometimes Confusion is a Good Thing**

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NPR, December 14, 2015

“One possibility is that confusion is ... a marker that an important cognitive process has taken place: The learner has appreciated some inconsistency or deficit in her prior beliefs. ... [A]nother possibility is that confusion is itself a step toward learning — an experience that motivates the learner to reconcile an inconsistency or remedy some deficit. In this view, confusion isn't just a side effect of beneficial cognitive processes, but a beneficial process itself. Supporting this stronger view, there's evidence that experiencing difficulties in learning can sometimes be desirable, leading to deeper processing and better long-term memory.”

<https://www.npr.org/sections/13.7/2015/12/14/459651340/sometimes-confusion-is-a-good-thing>

## Mental Technique #3

### **The importance of stupidity in scientific research**

Martin A. Schwartz  
Journal of Cell Science 2008 121: 1771 doi: 10.1242/jcs.033340



“Focusing on important questions puts us in the awkward position of being ignorant. One of the beautiful things about science is that it allows us to bumble along, getting it wrong time after time, and feel perfectly fine as long as we learn something each time. No doubt, this can be difficult for students who are accustomed to getting the answers right.”

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Use this signal to guide your study.

## Parse Trees

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There are at least two forms of trees that we might refer to "parse trees"

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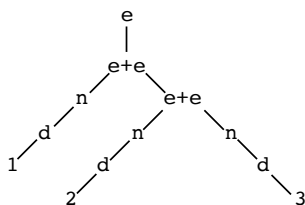
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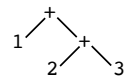
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## Solution to reduction in reading prompt

$(\lambda a. \lambda b. (- a b)) 2 1$

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Anyone want to give this a try on the board?

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$$(\lambda f. \lambda x. f (f x)) (\lambda z. (+ x z)) 2$$

Activity

Normal order reduction:

$$(\lambda f. \lambda x. f (f x)) (\lambda z. (+ x z)) 2$$



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$$(\lambda f. \lambda x. f (f \ x)) (\lambda z. (+ \ x \ z)) 2$$

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Applicative order reduction:

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## Computability



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def: a function  $f$  is **computable** if there  
is a program  $P$  that computes  $f$ .

In other words, for **any** (valid) input  $x$ , the  
computation  $P(x)$  **halts** with output  $f(x)$ .

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computable?  
yes, *partially*.

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Activity

The Halting Problem



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How might this work?

Fact: it is provably impossible to write `Halt`

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Finally, derive a fact that contradicts another fact.

Therefore, the presupposition must be false.

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The proof is hard to "understand" because the facts it derives don't actually make sense. Don't read too deeply.

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Foo is **true** if Foo is **false**.

Foo is **false** if Foo is **true**.

Therefore, the `HalT` function cannot exist.

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How we can use the Halting Problem to show that other problems cannot be solved (in general) by "reduction" to the Halting Problem.

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... if a program eventually produces an error.

... if a program will re-read an item in memory.