

CSCI 334:  
Principles of Programming Languages

Lecture 9: Computability

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**Williams**

## Topics

Desugaring code  
Function graphs  
Decidability

## Your to-dos

1. Lab 4, **due Sunday 10/8** (partner lab)
2. Read *Proof by Reduction* **for Thur, 10/12**

## Announcements

- **Midterm exam**, in class, Thursday, Oct 19.
- **Field trip to WCMA**, Thursday, Nov 2.
- Colloquium: **Leveraging ML Predictions for Beyond-Worst-Case Algorithm Design**, 2:35pm in Wege Auditorium.

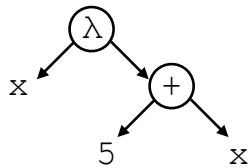


Traditionally, we measure the performance of algorithms in the worst-case model. That is, the algorithms are designed to perform well against an adversarial input sequence. While the worst-case paradigm provides extremely strong guarantees, it can often be too pessimistic compared to the empirical performance on typical datasets. This talk is about a growing line of work that incorporates machine learned predictions to break through worst-case running time barriers.

## Translating real code to lambda expressions

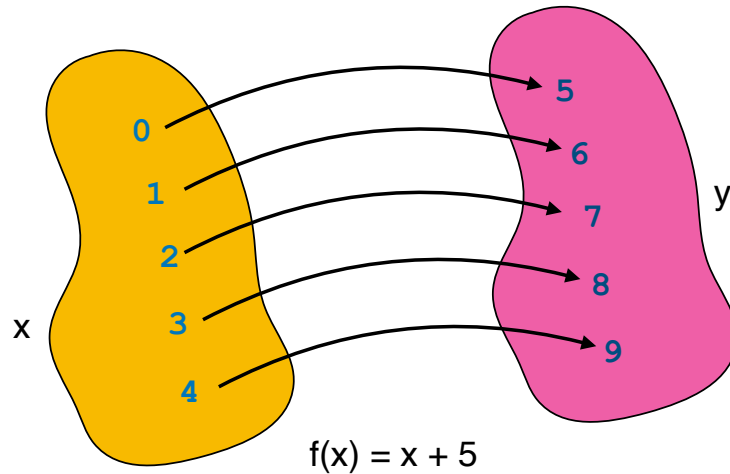
```
def f(x):  
    return 5 + x
```

$f = \lambda x. (+ 5 x)$



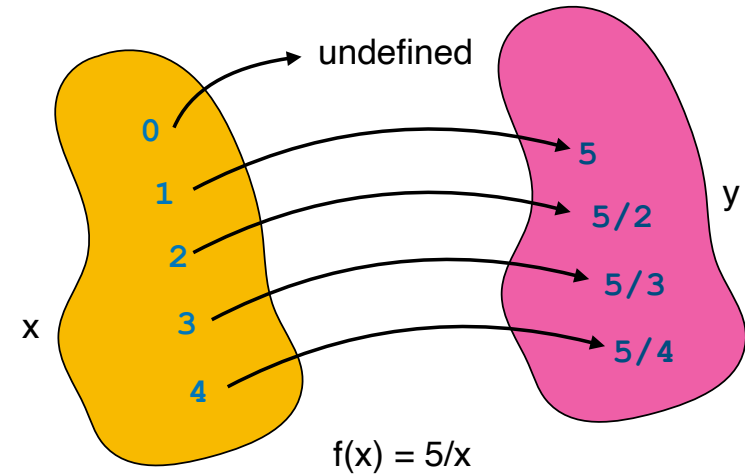
## Computability

### Intuition: total function



For every element in  $x$ , there is a corresponding element in  $y$ .  $x$  maps to at most one element in  $y$ .

### Intuition: partial function



$x$  still maps to at most one element in  $y$ , however, there is not a  $y$  for every  $x$ .

The **graph** of a function

$$f(x) = x + 5$$

$$\{\langle x, x+5 \rangle \mid x \in \mathbb{Z}\}$$

$$\{\langle x, x+5 \rangle \mid x \text{ is an integer}\}$$

The graph is **not a picture!**

The **graph** of a function

$$f(x) = 5/x$$

$$\{\langle x, 5/x \rangle \mid x \in \mathbb{Z} \wedge x \neq 0\}$$

The graph is **not a picture!**

Undefinedness

$$x/0$$

Activity

## Decidability Problems

A **decidability problem** is a question with a **yes** or **no** answer about a **particular input**.

“Is  $x$  prime?”

In CS, we care about whether there is an **algorithm** for solving decidability problems.

If there is **no algorithm**, then the problem is **undecidable**.

## The Halting Problem

**Decide** whether program **P** halts on input **x**.

Given program  $P$  and input  $x$ ,

$$\text{Halt}(P, x) = \begin{cases} \text{returns true if } P(x) \text{ halts} \\ \text{returns false otherwise} \end{cases}$$

How might this work?

Clarifications:

$P(x)$  is the output of program  $P$  run on input  $x$ .

The type of  $x$  does not matter; assume string.

## The Halting Problem

**Decide** whether program **P** halts on input **x**.

Given program  $P$  and input  $x$ ,

$$\text{Halt}(P, x) = \begin{cases} \text{returns true if } P(x) \text{ halts} \\ \text{returns false otherwise} \end{cases}$$

How might this work?

Fact: it is provably impossible to write  $\text{Halt}$

## Notes on the proof

We use two key ideas:

- Function **evaluation by substitution**
- **Reductio ad absurdum** (proof form)

## Notes on the proof

The *form* of the proof is **reductio ad absurdum**.

Literally: “reduction to absurdity”.

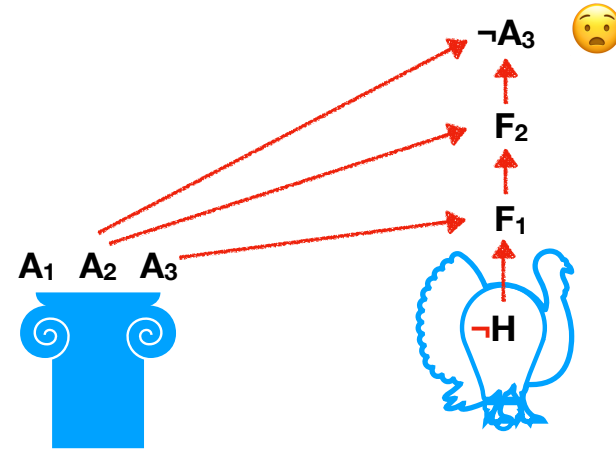
Start with **axioms** and **presuppose the outcome** we want to show.

Then, following strict rules of logic, **derive new facts**.

Finally, derive a fact that **contradicts** another fact.

Conclusion: the **presupposition must be false**.

## Reductio ad Absurdum



## Function Evaluation by Substitution

```
def addone(x):  
    return x + 1
```

$\text{addone}(1)$                        $\lambda x. (+ \ x \ 1) \ 1$

$[1/x]x + 1$                        $[1/x](+ \ x \ 1)$

$1 + 1$                                $(+ \ 1 \ 1)$

$2$                                        $2$

## The Halting Problem

Notes on the proof:

The proof relies on the kind of **substitution** that we’ve been using to “compute” functions in the lambda calculus.

Remember: **we are looking to produce a contradiction**.

The proof is hard to “understand” because the facts it derives **don’t actually make sense**. Don’t read too deeply.

## The Halting Problem: Proof

Suppose:

$\text{Halt}(P, x) = \begin{cases} \text{returns true if } P(x) \text{ halts} \\ \text{returns false otherwise} \end{cases}$  } Halt always halts!

DNH  
does not  
always halt!

Construct:

{  $\text{DNH}(P) = \begin{cases} \text{if } \text{Halt}(P, P) \text{ is true, while}(1)\{\} \\ \text{returns false otherwise} \end{cases}$

## The Halting Problem: Proof

Observations so far:

$\text{DNH}(P)$  will run forever if  $\text{Halt}(P, P)$  is true.  
 $\text{DNH}(P)$  will halt if  $\text{Halt}(P, P)$  is false.

Rewrite:

$\text{DNH}(P) = \begin{cases} \text{if } \text{Halt}(P, P) \text{ is true, while}(1)\{\} \\ \text{returns false otherwise} \end{cases}$

## The Halting Problem: Proof

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Rewrite:

$\text{DNH}(P) = \begin{cases} \text{if } P(P) \text{ halts, run forever} \\ \text{returns false otherwise} \end{cases}$

## The Halting Problem: Proof

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## The Halting Problem: Proof

Observations so far:

$\text{DNH}(P)$  will run forever if  $P(P)$  halts.

$\text{DNH}(P)$  will halt if  $P(P)$  runs forever.

Rewrite:

$$\text{DNH}(P) = \begin{cases} \text{if } P(P) \text{ halts, run forever} \\ \text{halt} \end{cases}$$

## The Halting Problem

Isn't  $\text{DNH}$  itself a program?

What happens if we call  $\text{DNH}(\text{DNH})$  ?

$$P = \text{DNH}$$

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## The Halting Problem

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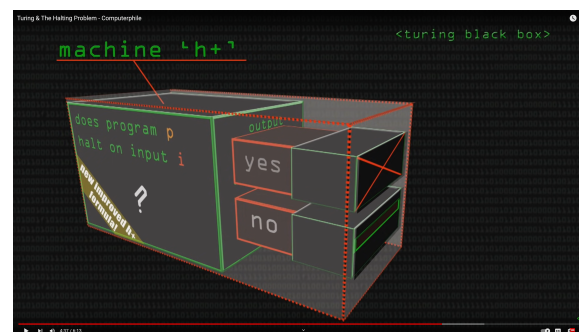
This literally makes no sense. **Contradiction!**

What was our one assumption? **Halt exists.**

Therefore, the **Halt** function **cannot exist.**

## Need more explanation?

Watch this!



[https://youtu.be/macM\\_MtS\\_w4](https://youtu.be/macM_MtS_w4)

## Reductions

A **reduction** is an **algorithm** that transforms an instance of one problem into an instance of another. Reductions are often **employed to prove something** about a problem given a similar problem.



## Reductions

Reductions are often used in a **counterintuitive** way.

For example, if we **want to know whether problem Foo is impossible**, we assume Foo is possible, and then use that fact to show that problem Bar (which **we already know** to be impossible) **appears to be possible**.



The above is a **contradiction**, meaning that **Foo is not possible**.

## Reductions

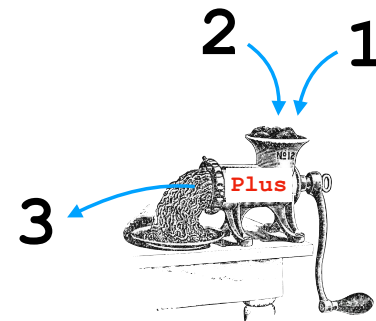
An important part of a reduction is that the reducer be an **ordinary algorithm**.

The reducer **should not solve the problem**. A reducer just converts problems from one form to another.



You will get **a lot** more exposure to reductions in CSCI 361.

## Reductions

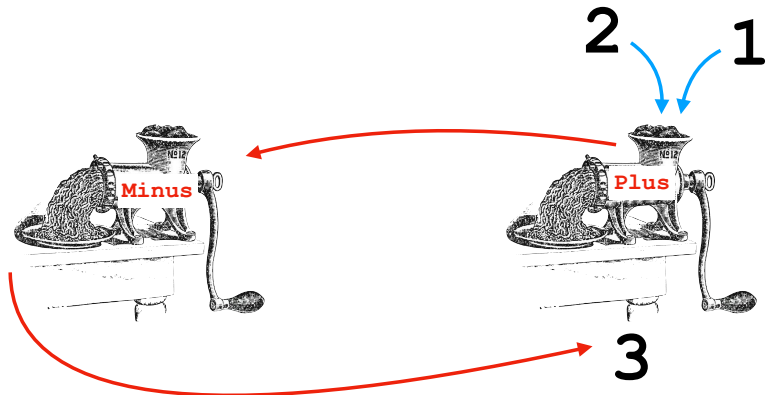


The humble algorithm.

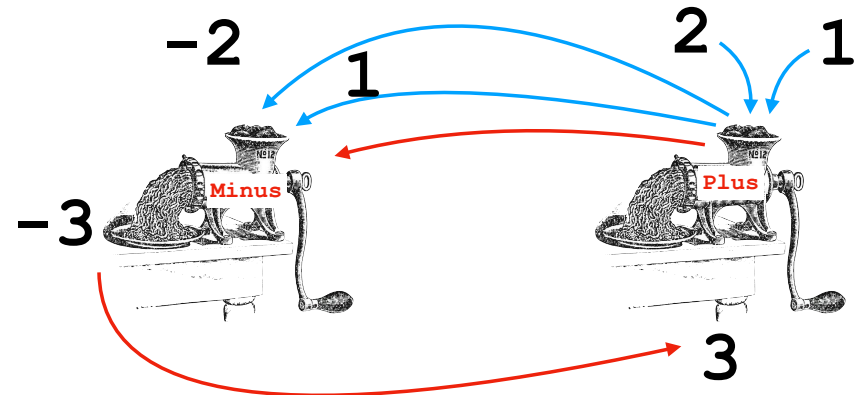
(sorry, vegetarians)



## Reductions



## Reductions



```
let reducer(x: int)(y: int) = -(-x-y)
```

## Recap & Next Class

### Today:

- More lambda reductions
- Function graphs
- Decidability

### Next class:

- Consequences of computability for PL design