



CS61A Lecture 7

Amir Kamil
UC Berkeley
February 6, 2013

Announcements



- HW3 out, due Tuesday at 7pm
- Midterm next Wednesday at 7pm
 - Keep an eye out for your assigned location
 - Old exams posted soon
 - Review sessions
 - Saturday 2-4pm in TBA
 - Extend office hours Sunday 11-3pm in TBA
 - HKN review session Sunday 3-6pm in 145 Dwinelle
- Environment diagram handout on website
- Code review system online
 - See Piazza post for details

How to Draw an Environment Diagram



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When defining a function:

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Create a function value with signature

<name>(<formal parameters>)

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For nested definitions, label the parent as the first frame of the current environment

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2. If the function has a parent label, copy it to this frame

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Bind `<name>` to the function value in the first frame of the current environment

When calling a function:

1. Add a local frame labeled with the `<name>` of the function
2. If the function has a parent label, copy it to this frame
3. Bind the `<formal parameters>` to the arguments in this frame
4. Execute the body of the function in the environment that starts with this frame

Environment for Function Composition



Example: <http://goo.gl/5zcug>

Environment for Function Composition



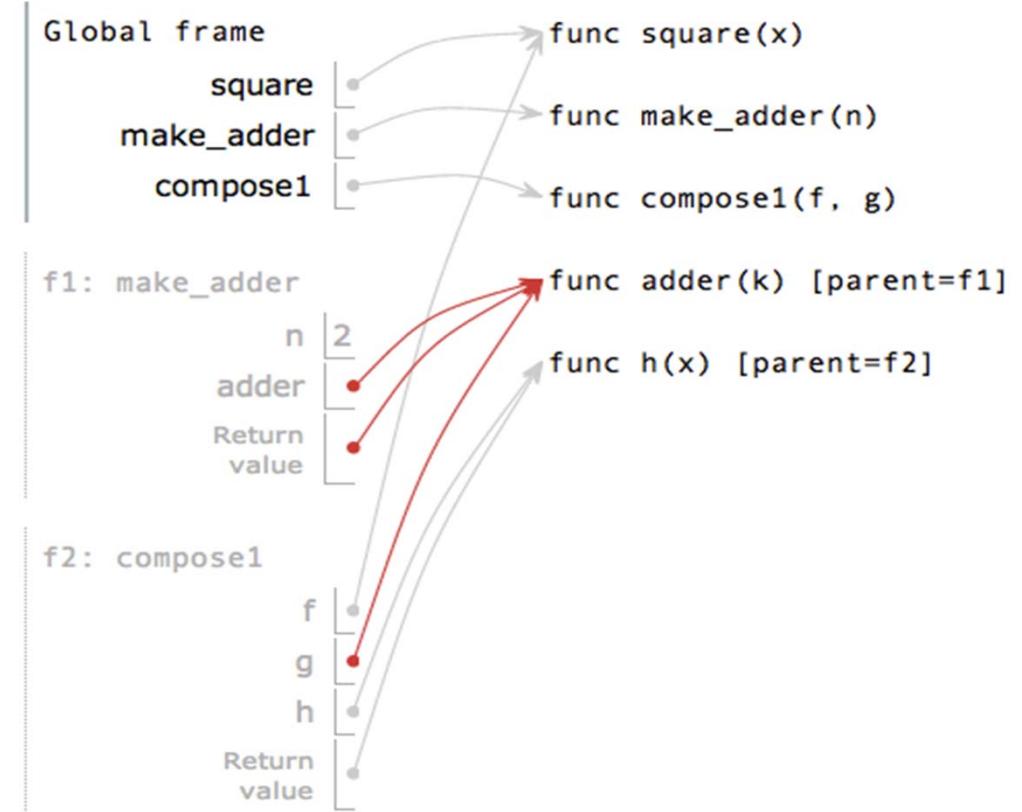
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2     return x * x
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5     def adder(k):
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9 def compose1(f, g):
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14 compose1(square, make_adder(2))(3)
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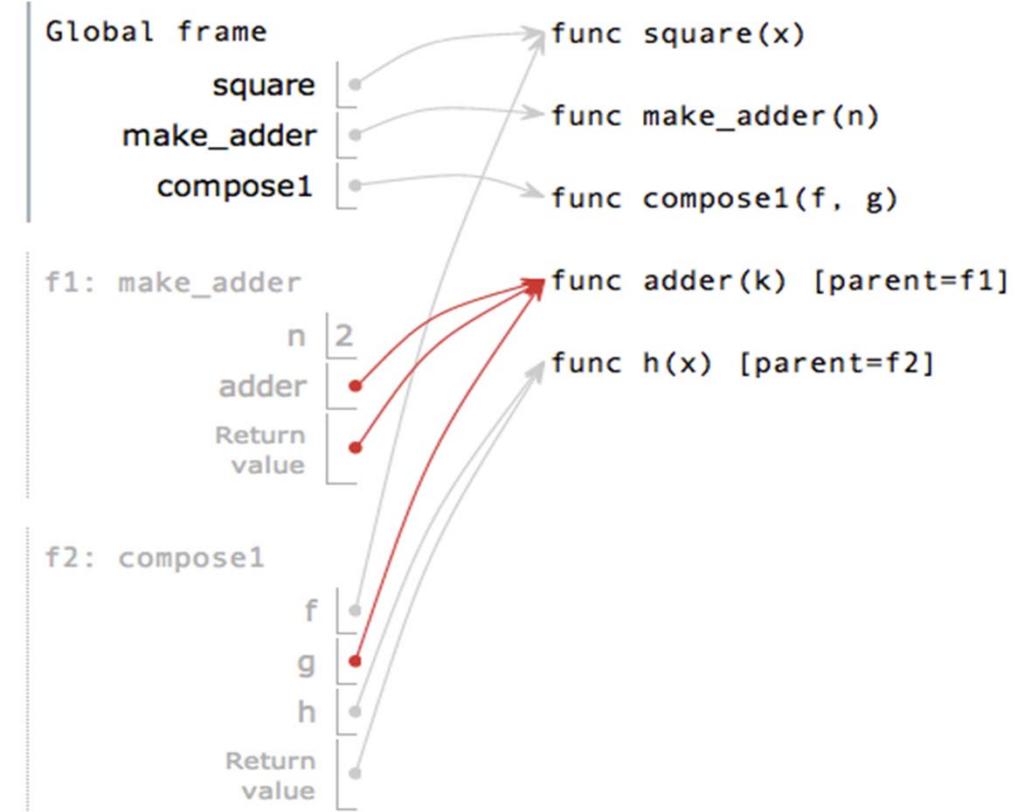
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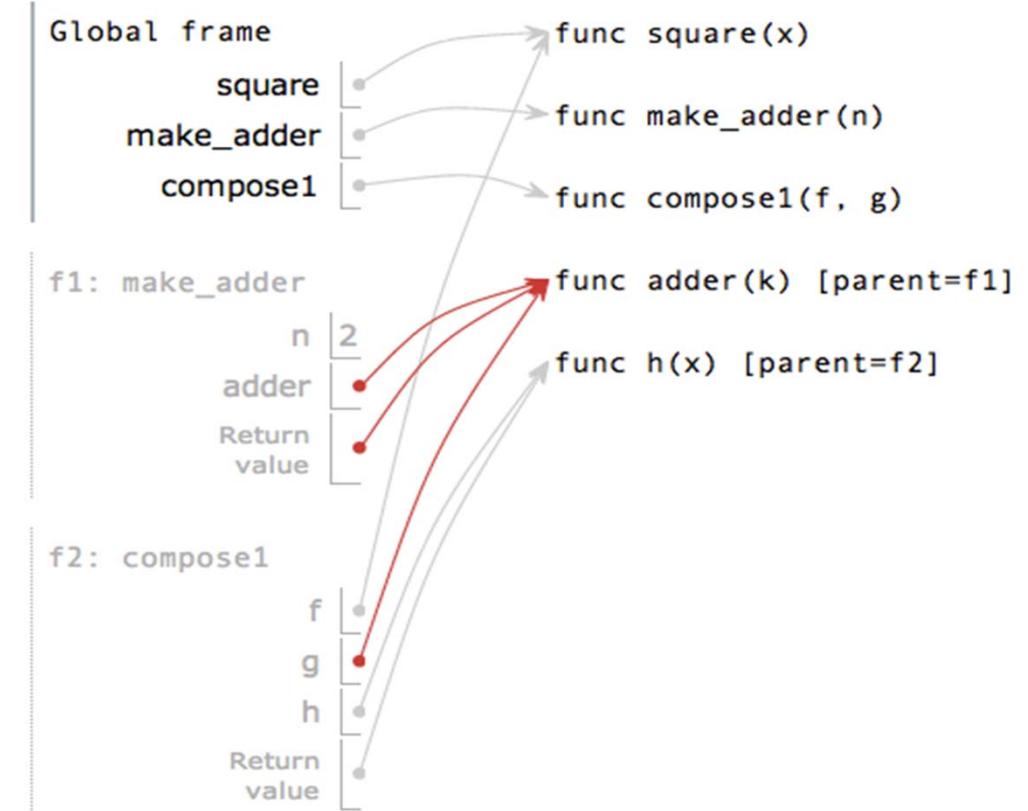


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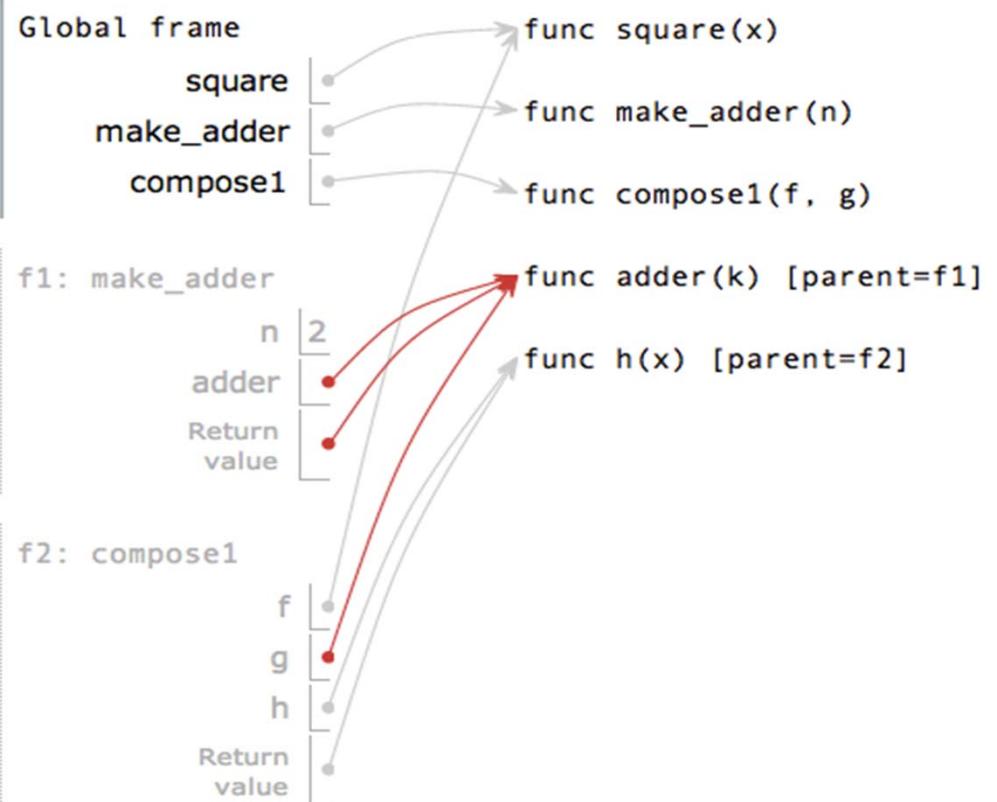
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Return value of
make_adder is an
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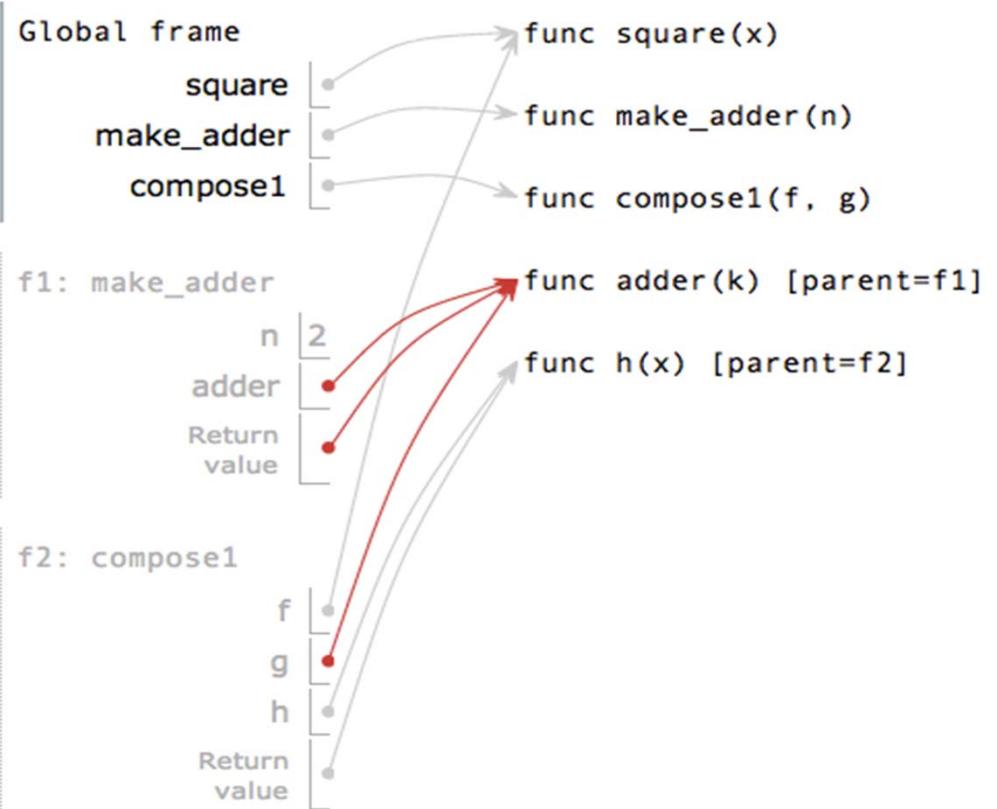
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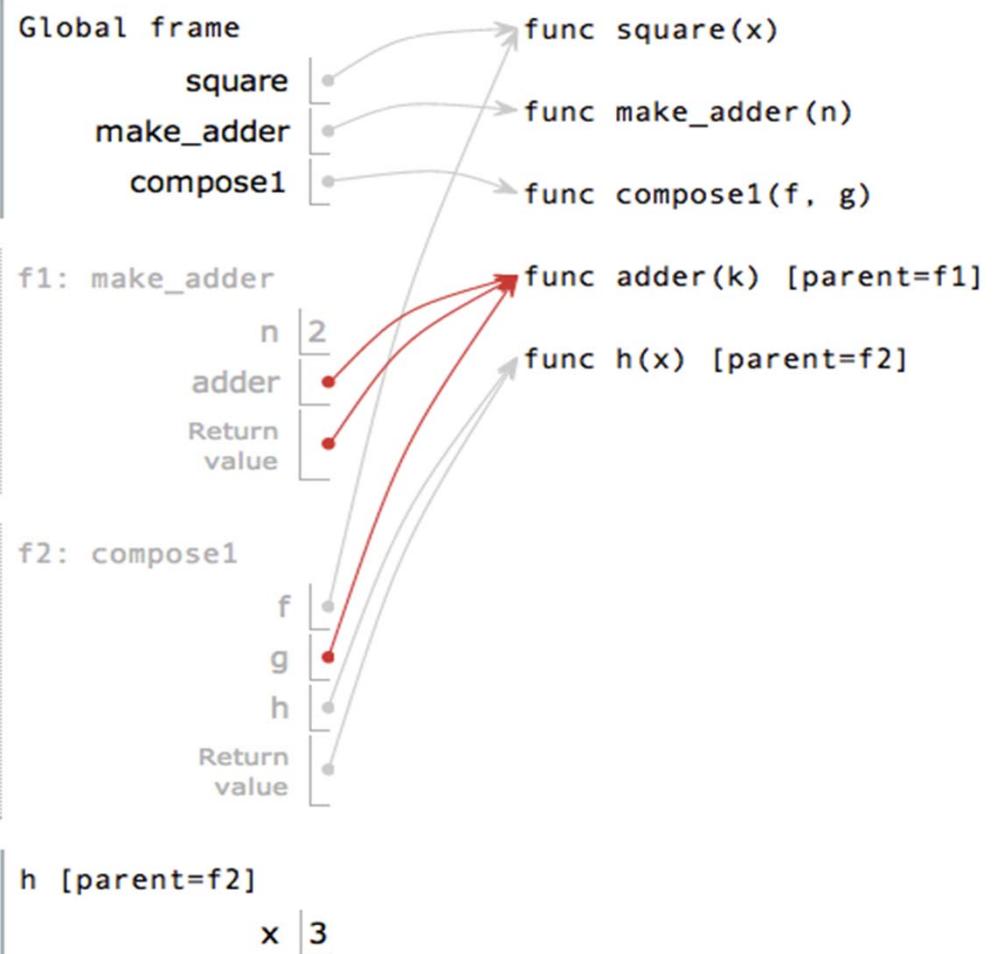


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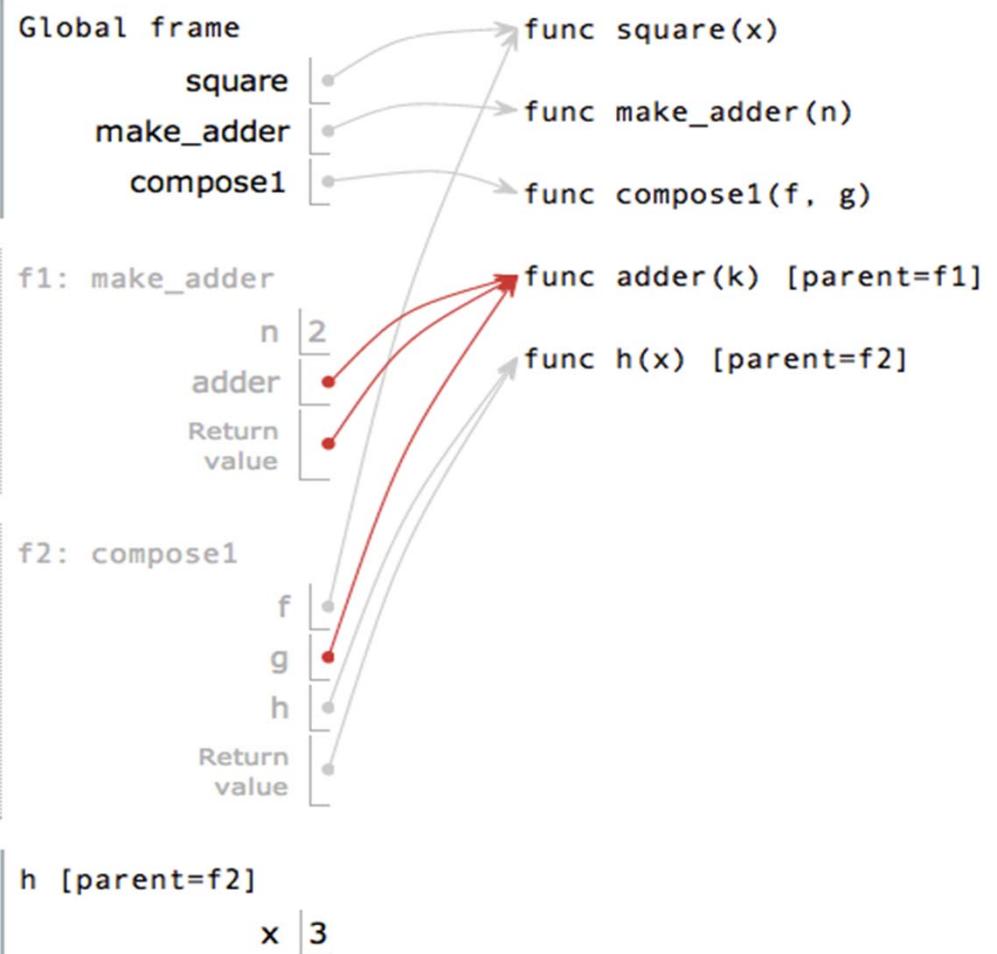


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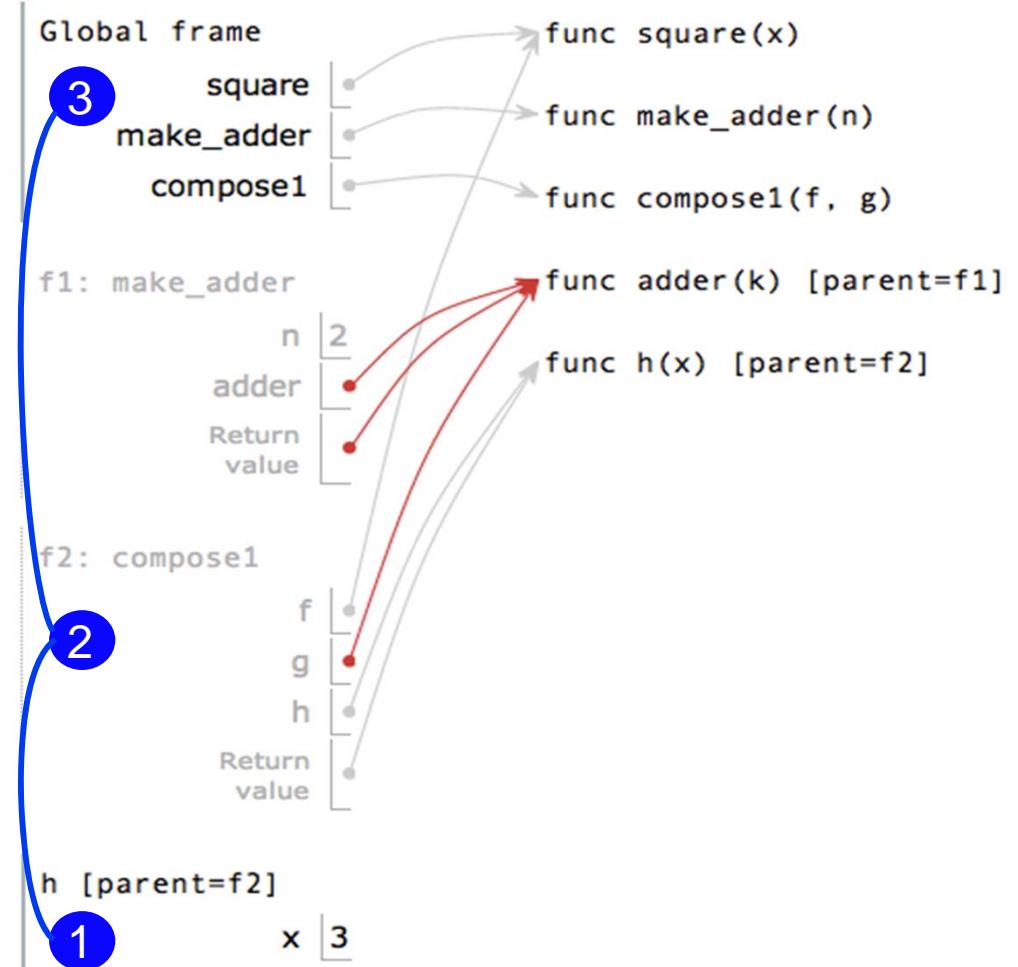


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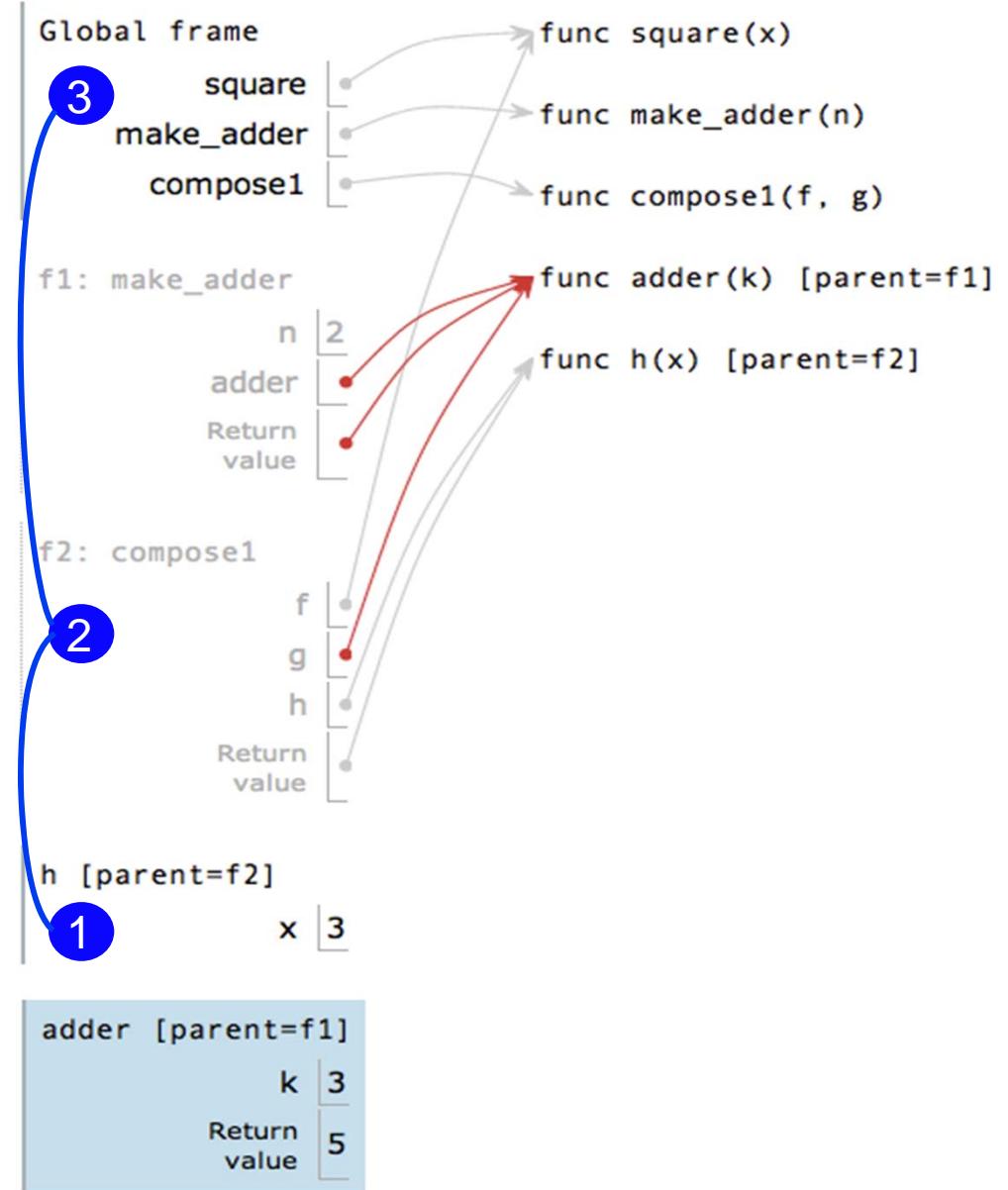


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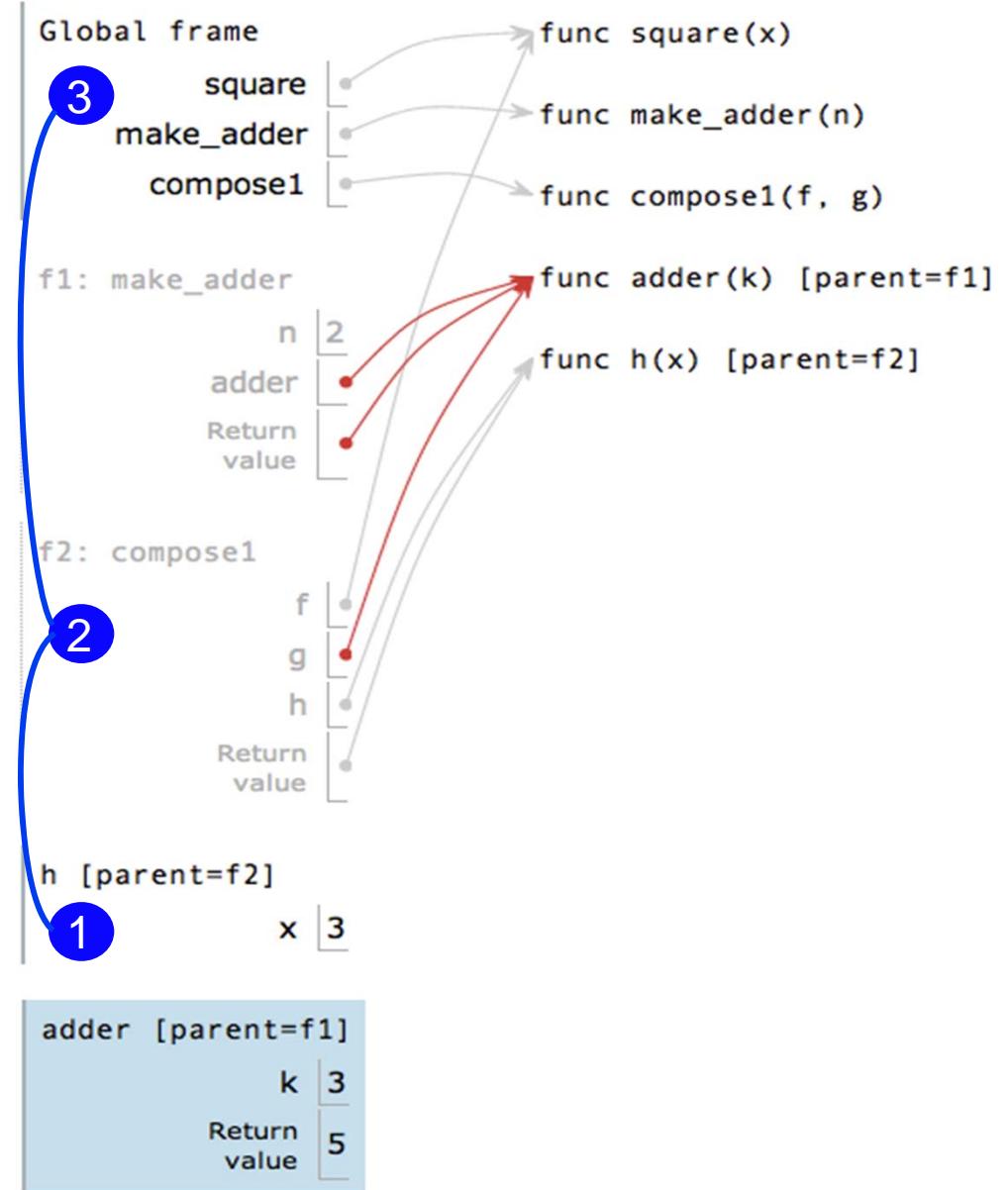
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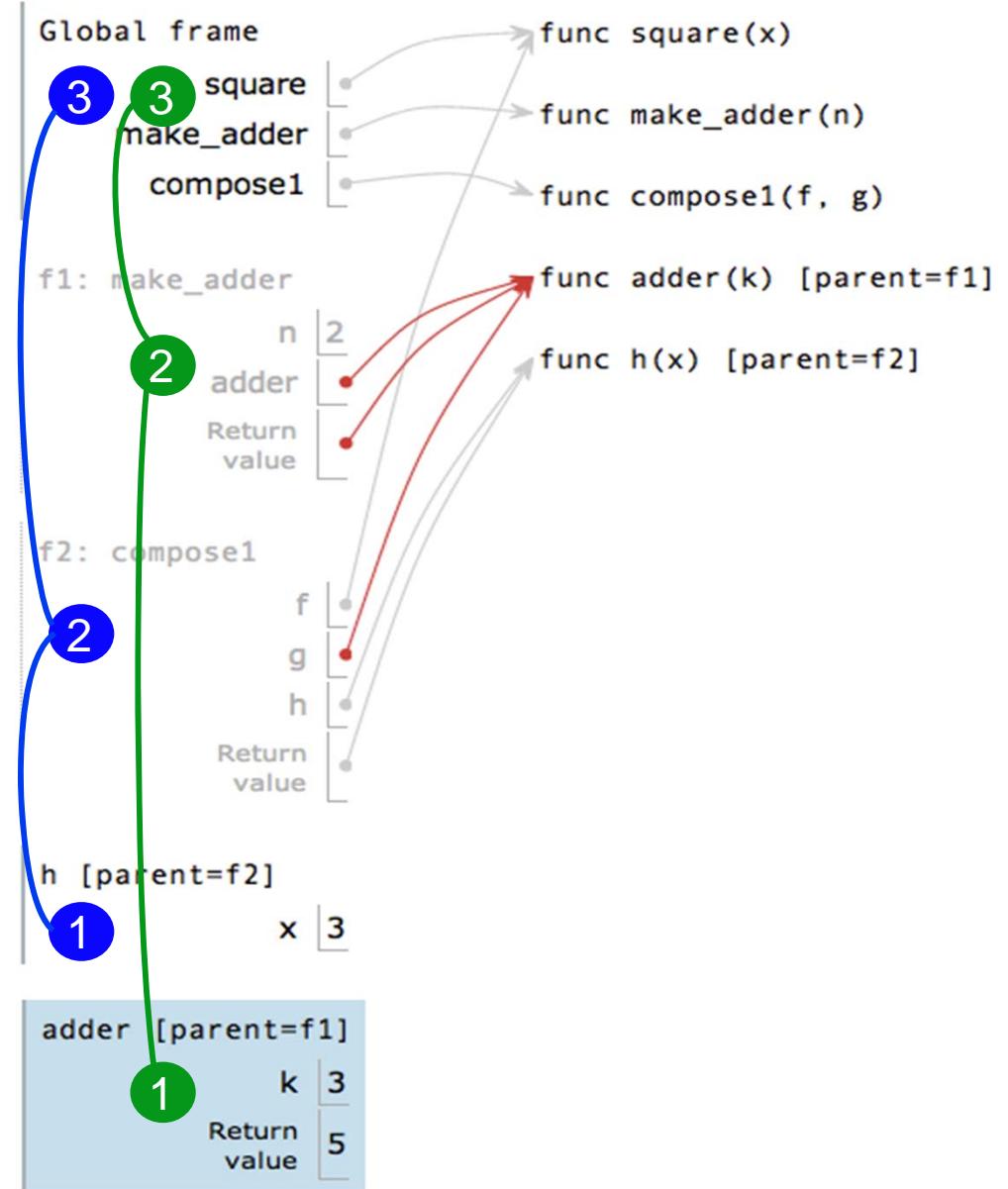
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Lambda Expressions



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>>> ten = 10
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A function
with formal parameter x
and body "return x * x"

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Must be a single expression

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16

Must be a single expression

Lambda expressions are rare in Python, but important in general

Evaluation of Lambda vs. Def



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```
lambda x: x * x
```

Evaluation of Lambda vs. Def



lambda x: x * x

VS

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def square(x):  
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Execution procedure for def statements:

Evaluation of Lambda vs. Def



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1. Create a function value with signature
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Lambda vs. Def Statements



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```
square = lambda x: x * x
```

Lambda vs. Def Statements



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square = lambda x: x * x    VS
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Lambda vs. Def Statements



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def square(x):  
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Both create a function with the same arguments & behavior

Lambda vs. Def Statements



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square = lambda x: x * x      VS      def square(x):  
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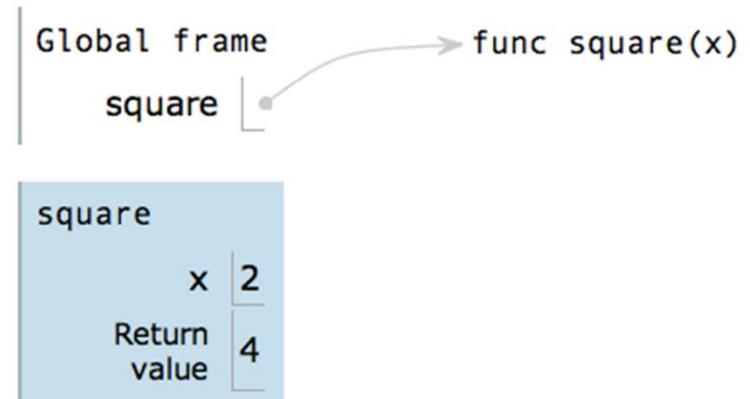
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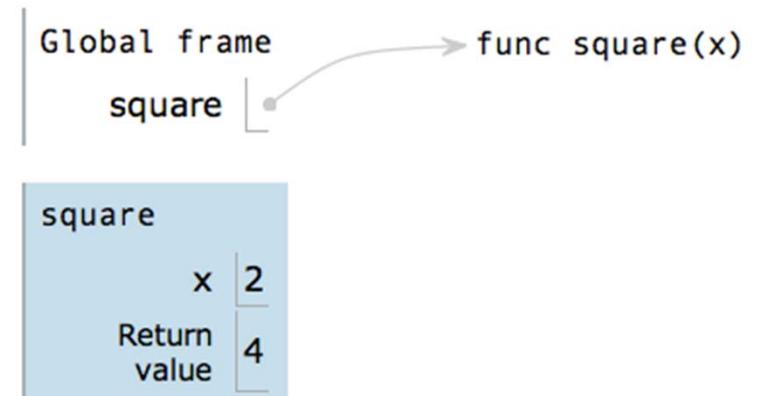
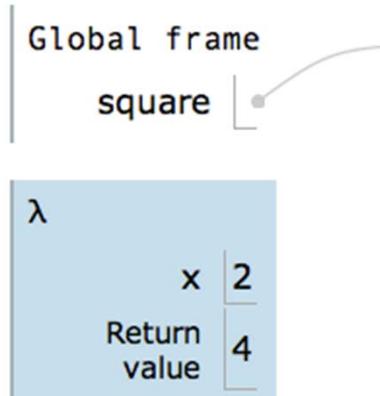
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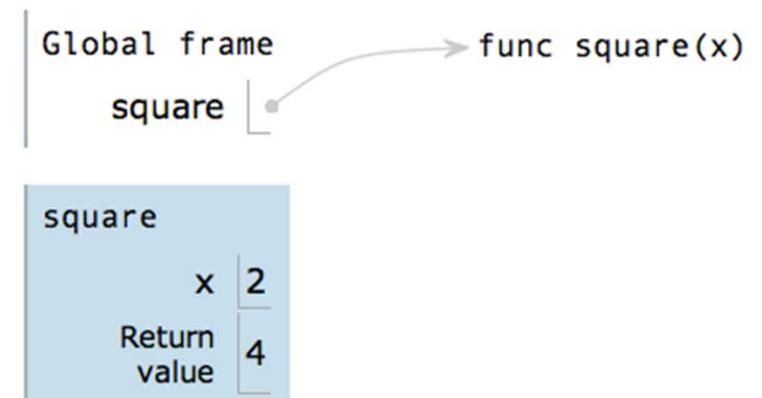
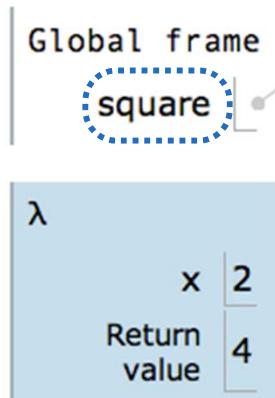
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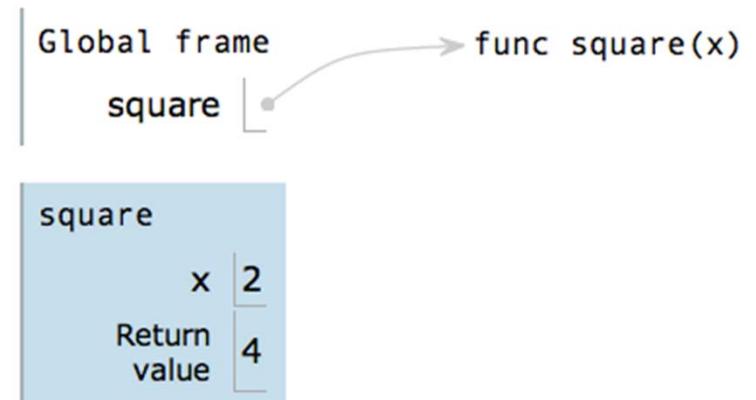
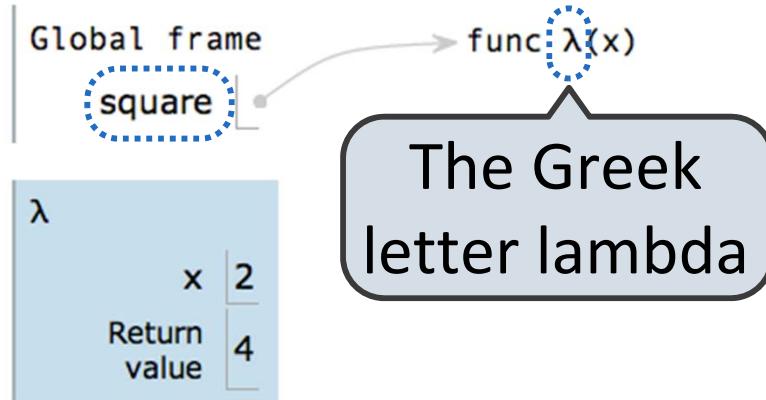
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Newton's Method Background



Finds approximations to zeroes of differentiable functions

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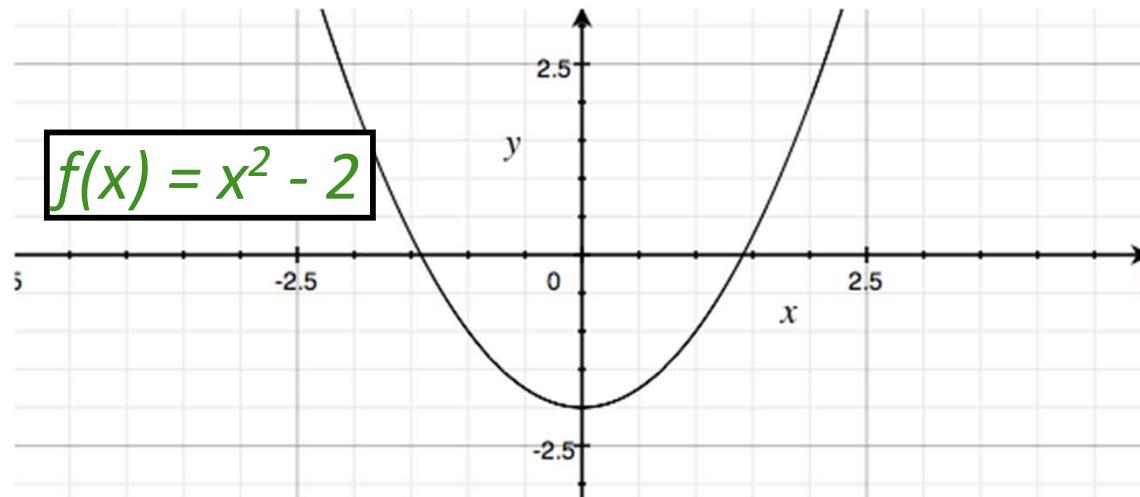
Finds approximations to zeroes of differentiable functions

$$f(x) = x^2 - 2$$

Newton's Method Background



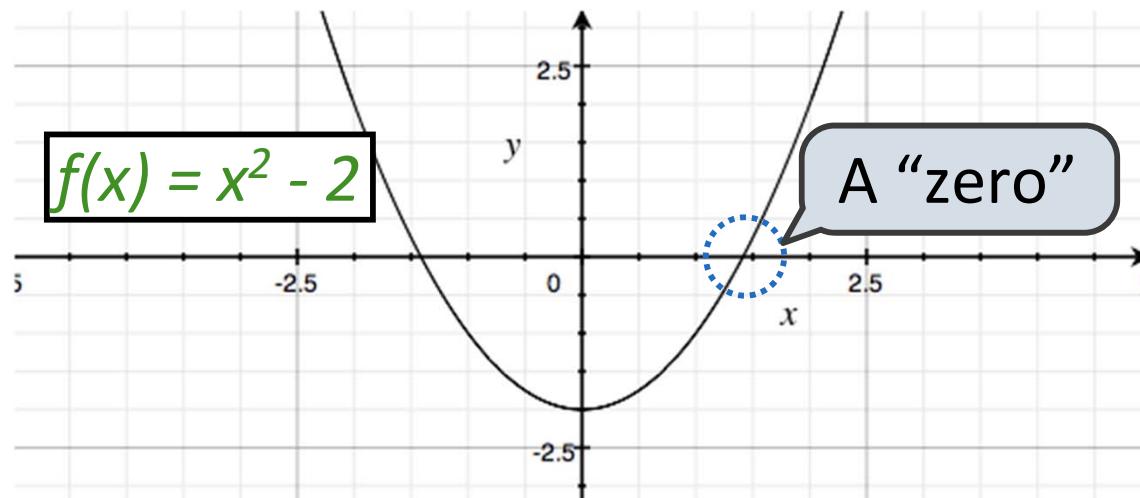
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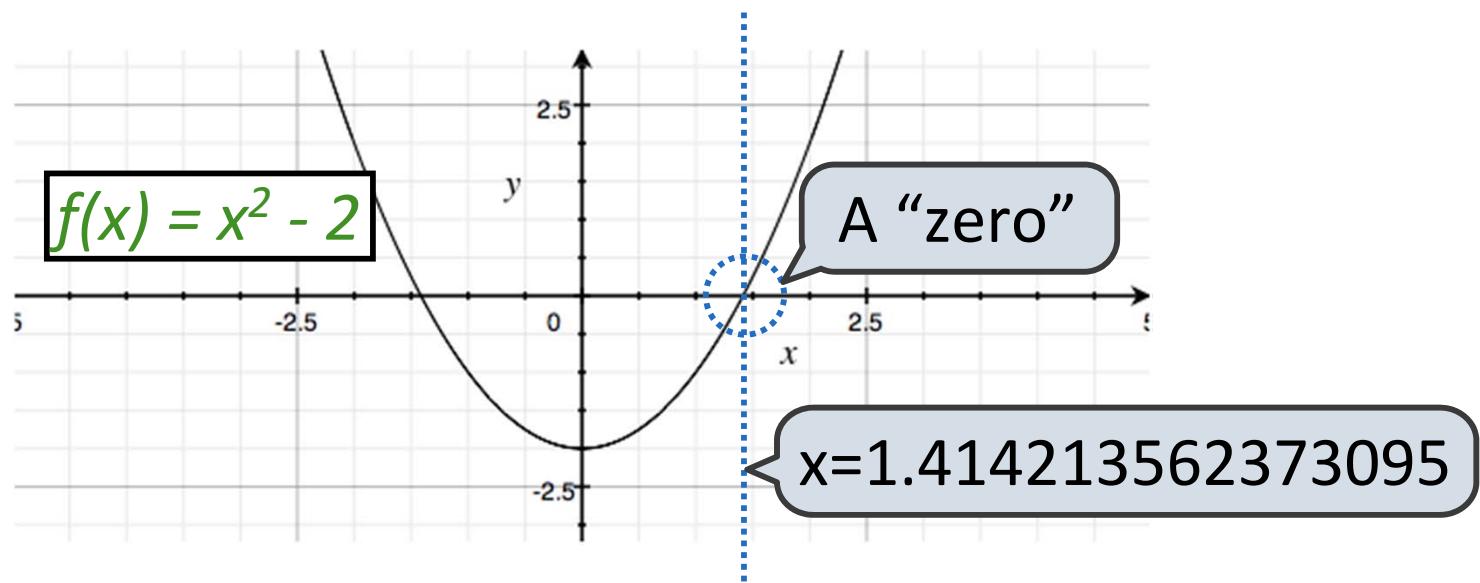
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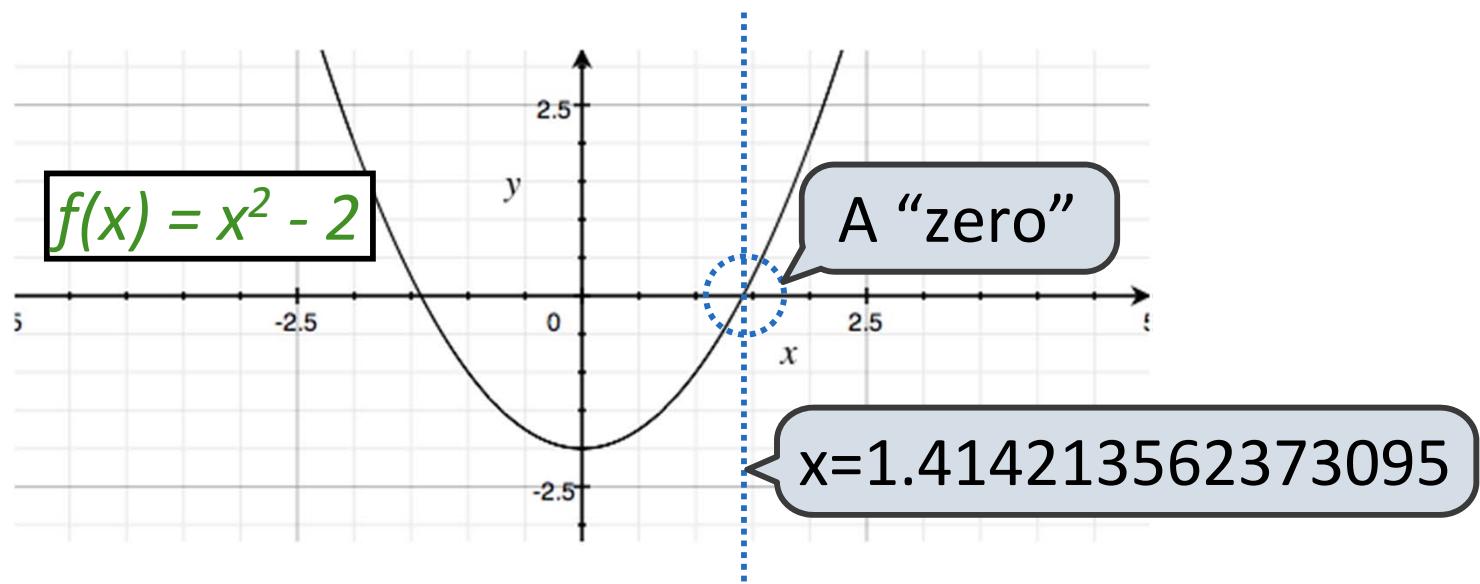
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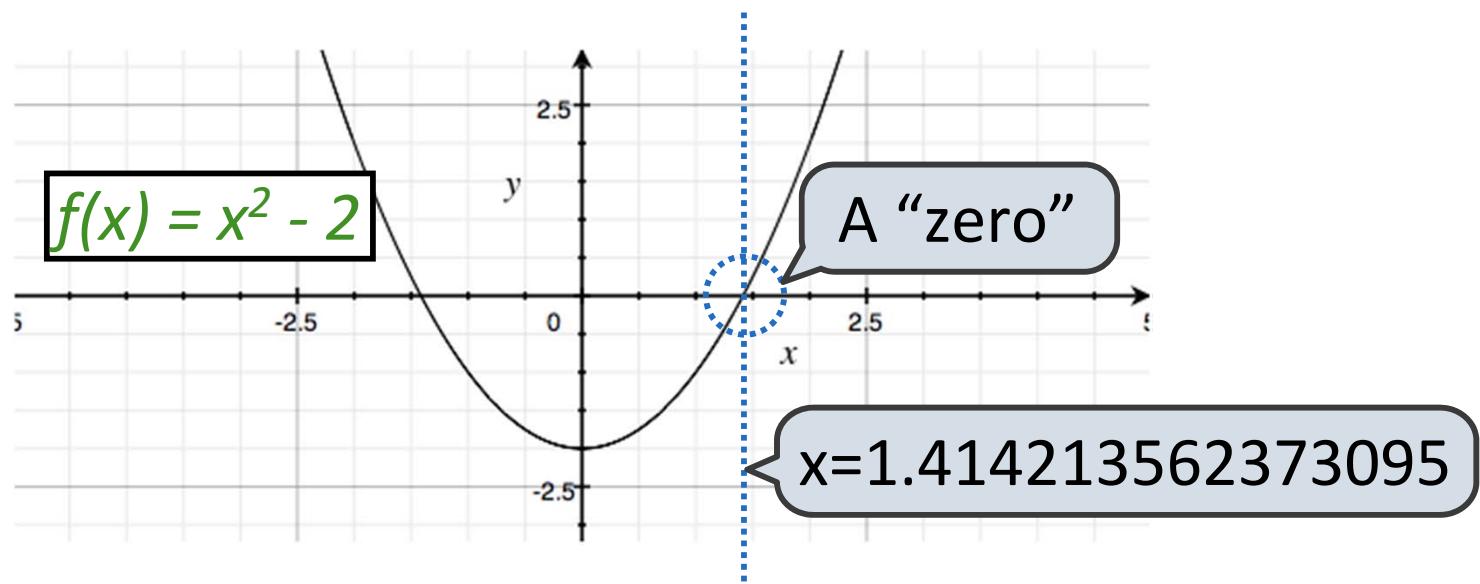


Application: a method for (approximately) computing square roots, using only basic arithmetic.

Newton's Method Background



Finds approximations to zeroes of differentiable functions



Application: a method for (approximately) computing square roots, using only basic arithmetic.

The positive zero of $f(x) = x^2 - a$ is \sqrt{a}

Newton's Method

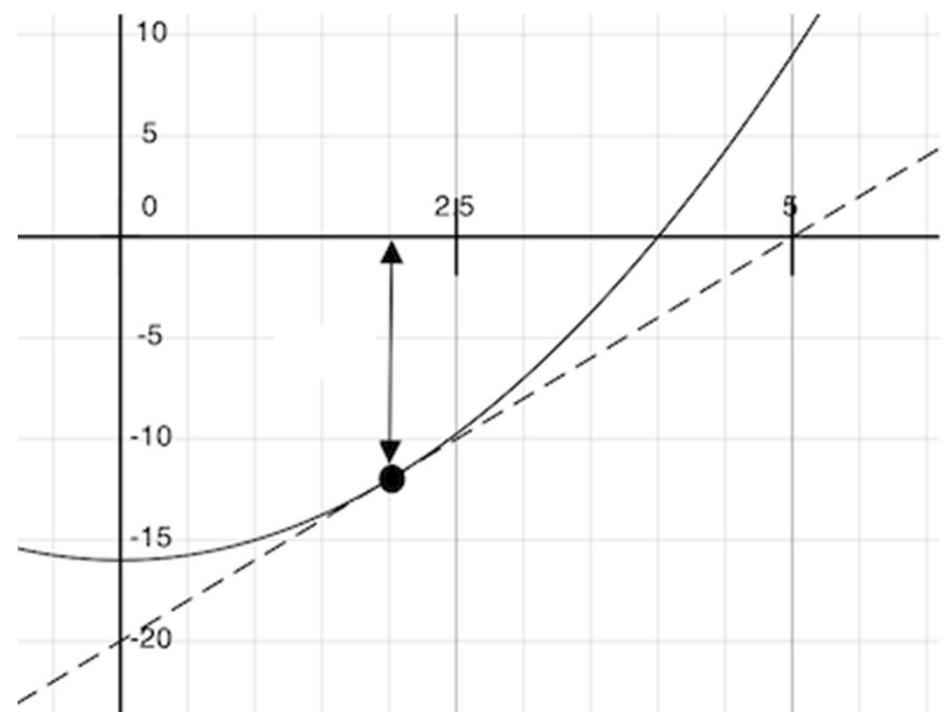


Begin with a function f and
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Newton's Method



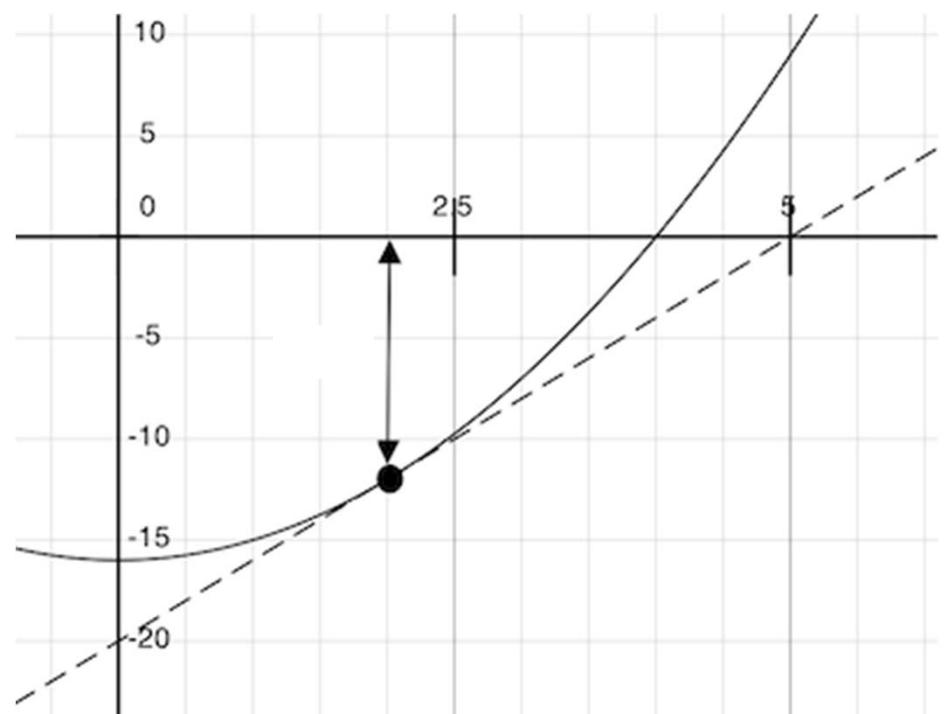
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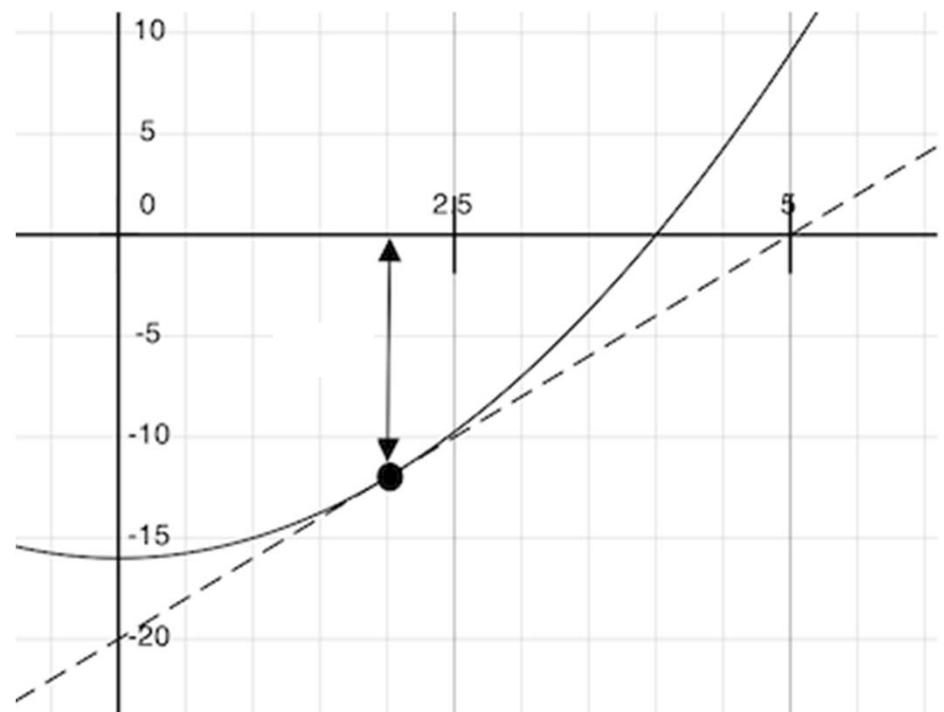


Compute the value of f at the guess: $f(x)$

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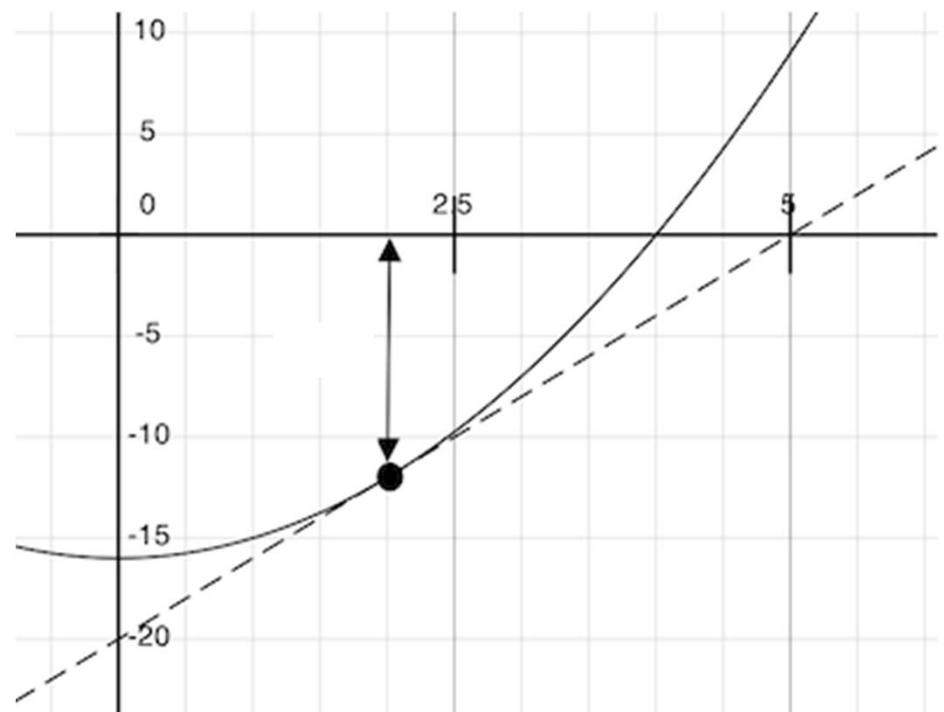
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Compute the derivative of f at the guess: $f'(x)$

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Compute the value of f at the guess: $f(x)$

Compute the derivative of f at the guess: $f'(x)$

Update guess to be:

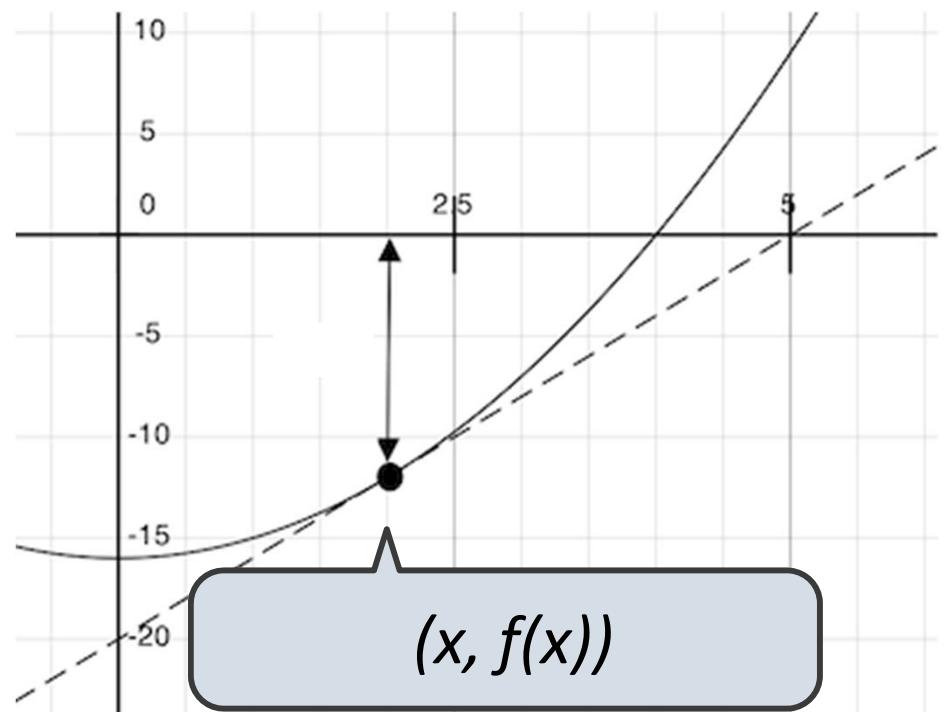
$$x - \frac{f(x)}{f'(x)}$$

Visualization: http://en.wikipedia.org/wiki/File:NewtonIteration_Ani.gif

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Compute the value of f at the guess: $f(x)$

Compute the derivative of f at the guess: $f'(x)$

Update guess to be:

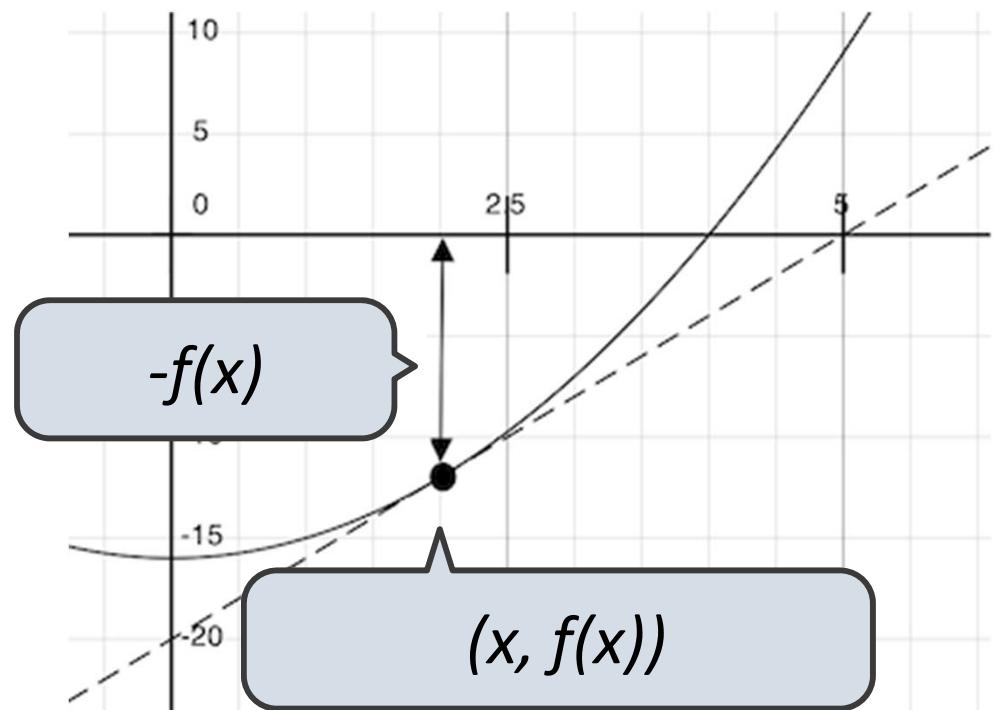
$$x - \frac{f(x)}{f'(x)}$$

Visualization: http://en.wikipedia.org/wiki/File:NewtonIteration_Ani.gif

Newton's Method



Begin with a function f and an initial guess x



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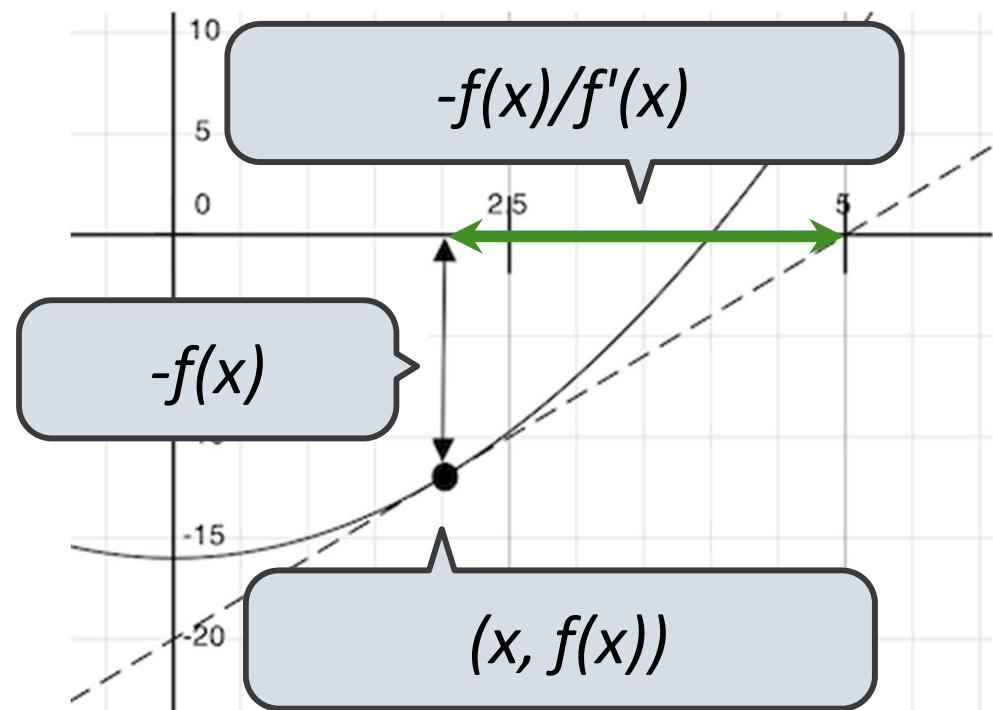
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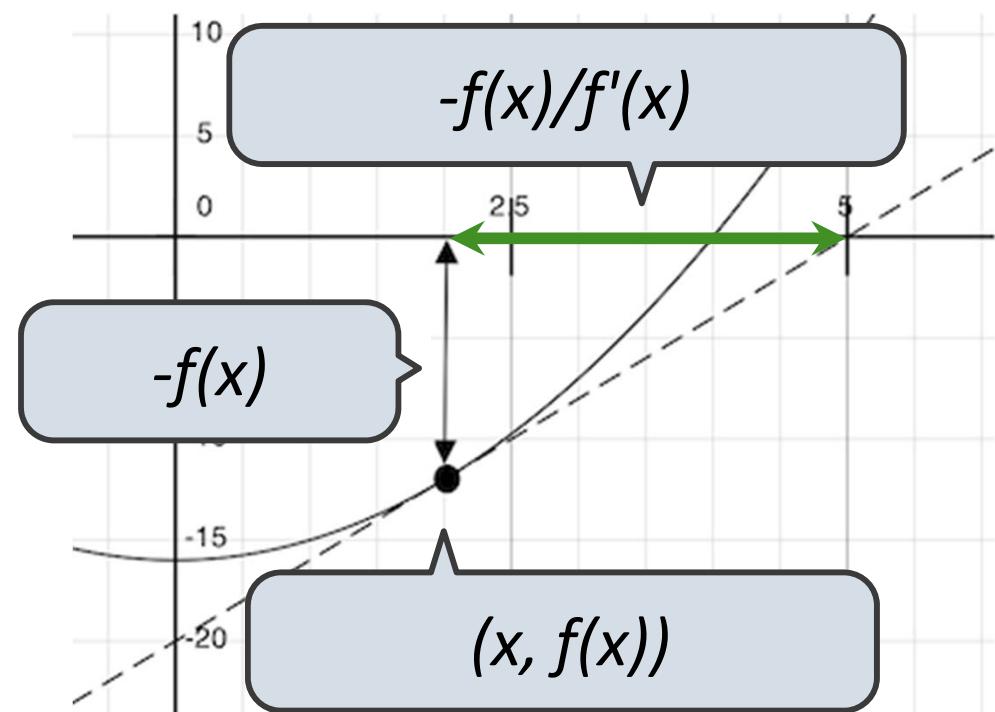
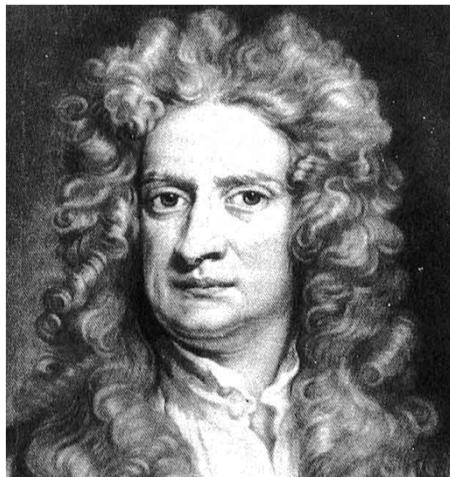
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Using Newton's Method



Using Newton's Method



How to find the **square root** of 2?

Using Newton's Method



How to find the **square root** of 2?

```
>>> f = lambda x: x*x - 2  
>>> find_zero(f)  
1.4142135623730951
```

Using Newton's Method



How to find the **square root** of 2?

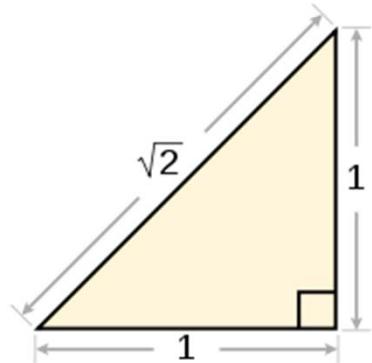
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$$f(x) = x^2 - 2$$

Using Newton's Method



How to find the **square root** of 2?



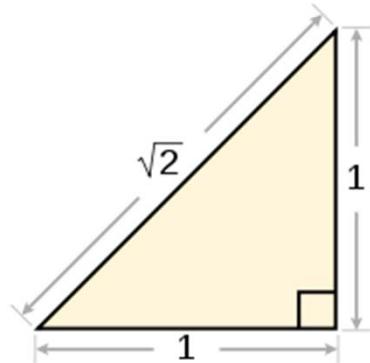
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Using Newton's Method



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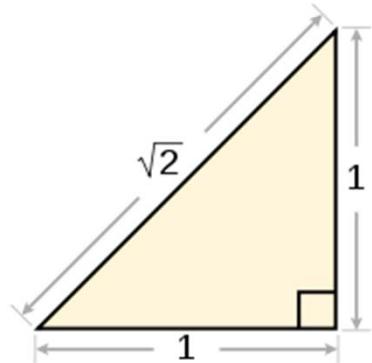
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How to find the **log base 2** of 1024?

Using Newton's Method



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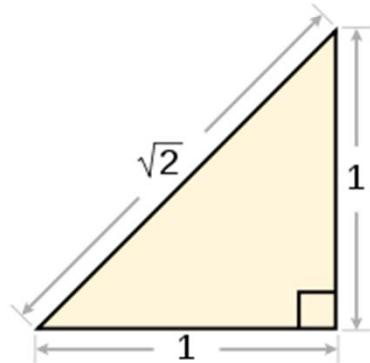
How to find the **log base 2** of 1024?

```
>>> g = lambda x: pow(2, x) - 1024  
>>> find_zero(g)  
10.0
```

Using Newton's Method



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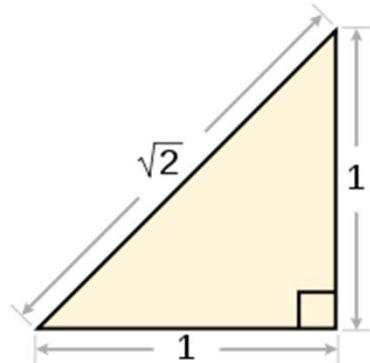
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Using Newton's Method



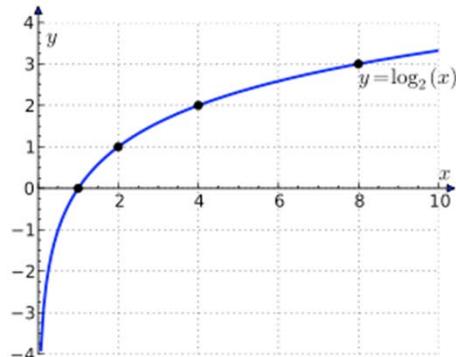
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Special Case: Square Roots



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How to compute `square_root(a)`

Idea: Iteratively refine a guess x about the square root of a

Special Case: Square Roots



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Special Case: Square Roots



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$$x = \frac{x + \frac{a}{x}}{2}$$

Special Case: Square Roots



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A dotted circle highlights the term $x + \frac{a}{x}$. A callout bubble points to this term with the text $x - f(x)/f'(x)$.

Special Case: Square Roots



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Implementation questions:

Special Case: Square Roots



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Implementation questions:

What guess should start the computation?

Special Case: Square Roots



How to compute `square_root(a)`

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Update:

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A blue dotted circle highlights the term $x + \frac{a}{x}$. A speech bubble above it contains the expression $x - f(x)/f'(x)$. A larger speech bubble below it contains the text "Babylonian Method".

Implementation questions:

What guess should start the computation?

How do we know when we are finished?

Special Case: Cube Roots



Special Case: Cube Roots



How to compute `cube_root(a)`

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Special Case: Cube Roots



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Special Case: Cube Roots



How to compute `cube_root(a)`

Idea: Iteratively refine a guess x about the cube root of a

Update:
$$x = \frac{2x + \frac{a}{x^2}}{3}$$

Special Case: Cube Roots



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Iterative Improvement



Iterative Improvement



First, identify common structure.

Iterative Improvement



First, identify common structure.

Then define a function that generalizes the procedure.

Iterative Improvement



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Then define a function that generalizes the procedure.

```
def iter_improve(update, done, guess=1, max_updates=1000):
    """Iteratively improve guess with update until done
    returns a true value.

    >>> iter_improve(golden_update, golden_test)
    1.618033988749895
    """
    k = 0
    while not done(guess) and k < max_updates:
        guess = update(guess)
        k = k + 1
    return guess
```

Newton's Method for nth Roots



Newton's Method for nth Roots



```
def nth_root_func_and_derivative(n, a):
    def root_func(x):
        return pow(x, n) - a
    def derivative(x):
        return n * pow(x, n-1)
    return root_func, derivative

def nth_root_newton(a, n):
    """Return the nth root of a.

    >>> nth_root_newton(8, 3)
    2.0
    """
    root_func, deriv = nth_root_func_and_derivative(n, a)
    def update(x):
        return x - root_func(x) / deriv(x)
    def done(x):
        return root_func(x) == 0
    return iter_improve(update, done)
```

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Exact derivative

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$x - f(x)/f'(x)$

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    return x - root_func(x) / deriv(x)
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$x - f(x)/f'(x)$

Definition of a function zero