

# Introduction to Programming for Public Policy

## Week 2 (Iteration and Algorithms)

Eric Potash

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# Iteration

# Multiple Assignment

```
a = 1  
b = a # a and b are now equal  
a = 2 # not anymore
```

# Updating a variable

```
i = 1      # initialization  
i = i + 1  # update
```

# What is iteration?

- Computers are good at automating repetitive tasks
- There are two basic commands in python for iteration: `while` and `for`

# while

```
# blastoff.py
# count down from 3
n = 3
while n > 0:
    print(n)
    n = n - 1
print('Blastoff!')
```

```
$ python blastoff.py
3
2
1
Blastoff
```

Think Python, p. 77

# While anatomy

```
while condition:  
    # body
```

1. Evaluate the condition, yielding True or False
2. If the condition is False, exit the while loop
3. If the condition is True, execute *body* and return to 1.

This flow is called a *loop* because step 3 goes back to step 1.

# While in a function

```
def sequence(n):  
    while n > 0:  
        print(n)  
        n = n - 1  
    print('Blastoff!')
```



# Modules

```
# blastoff.py
# print a countdown sequence from n
def sequence(n):
    while n > 0:
        print(n)
        n = n - 1
    print('Blastoff!')
```

```
$ python
>>> import blastoff
>>> blastoff.sequence(3)
```

# Infinite loop

If a loop runs forever without terminating it is called an *infinite loop*.  
For example:

```
while True:  
    print('Hello, World')
```

Use the keyboard shortcut Ctrl+C to terminate the program.

# Another infinite loop

```
i = 1
while i > 0:
    print(i)
    i = i + 1
```

# break

To exit a loop while from the body use the break keyword:

```
# echo.py
while True:
    line = input('> ') # ask user for input
    if line == 'done': # if user inputs 'done'
        break # exit the loop
    print(line) # otherwise echo the input

print('Done!')
```

## echo.py

```
$ python echo.py  
> a  
a  
> Hello, World  
Hello, World  
> not done  
not done  
> done  
Done!
```

# Algorithms

# Numerical approximation

Loops are useful for calculations where we start with an approximate answer and iteratively improve it.

# Bisection search

Bisection search is an iterative algorithm for finding the solution to an equation  $F(x) = 0$ .

Intuitively:

- Start with an interval that we know contains a solution



# Bisection search

Bisection search is an iterative algorithm for finding the solution to an equation  $F(x) = 0$ .

Intuitively:

- Start with an interval that we know contains a solution
- Keep shrinking the interval until we've isolated a solution

# Bisection method illustrated

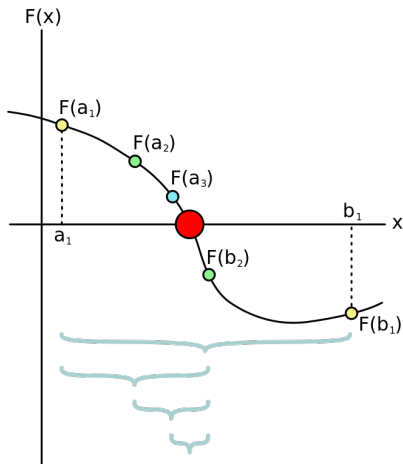


Figure 1: [https://en.wikipedia.org/wiki/Bisection\\_method](https://en.wikipedia.org/wiki/Bisection_method)

# Bisection search in detail

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3. Three possibilities:
  - If  $F(c) = 0$  we're done
  - if  $F(c) < 0$ , continue looking in  $[a, c]$
  - Otherwise  $F(c) > 0$ , continue looking in  $[c, b]$



# Bisection search pseudo-code

Assuming  $F$  is increasing on the initial interval:

```
while True:
    c = (a + b)/2

    if F(c) == 0:
        break
    elif F(c) < 0:
        b = c # replace interval with left half
    else:
        a = c # replace interval with right half
```

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  - $a = 0$

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- Then our function is  $F(x) = x^2 - 2$
- Start by setting  $a$  and  $b$ :
  - $a = 0$
  - $b = 2$

# Python square root

```
a = 0
b = 2

while True:
    c = (a + b)/2
    Fc = c**2 - 2

    if Fc == 0:
        break
    elif Fc < 0:
        a = c
    else:
        b = c

print(c)
```



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- The reason is that  $F_c \neq 0$ , i.e.  $F_c$  never equals *exactly* zero
- This is an issue of floating point (decimal) arithmetic on a computer

# Debugging: Add a print statement

```
a = 0
b = 2

while True:
    c = (a + b)/2
    Fc = c**2 - 2
    print(c, Fc)

    if Fc == 0:
        break
    elif Fc < 0:
        b = c
    else:
        a = c

print(c)
```

# Debugging output (c, Fc)

```
1.414213562373095 -4.440892098500626e-16
1.414213562373095 -4.440892098500626e-16
1.414213562373095 -4.440892098500626e-16
1.414213562373095 -4.440892098500626e-16
1.414213562373095 -4.440892098500626e-16
1.414213562373095 -4.440892098500626e-16
1.414213562373095 -4.440892098500626e-16
1.414213562373095 -4.440892098500626e-16
1.414213562373095 -4.440892098500626e-16
```

# Floating point approximate equality

The solution is to test for  $F_c$  being small:

```
if abs(Fc) < .00001:  
    break
```

# Python square root

```
a = 0
b = 2

while True:
    c = (a + b)/2
    Fc = c**2 - 2

    if abs(Fc) < .00001:
        break
    elif Fc < 0:
        a = c
    else:
        b = c

print(c)
```

# Square root function

```
# mymath.py
def sqrt(x):
    a = 0
    b = x

    while True:
        c = (a + b)/2
        Fc = c**2 - x

        if abs(Fc) < .00001:
            return c
        elif Fc < 0:
            a = c
        else:
            b = c
```



# Square root function call

```
$ python  
>>> import mymath  
>>> mymath.sqrt(2)
```

for

# string len

You can find the length of a string using the `len` function:

```
message = 'Hello, World'  
len(message)
```

## while over string

We can use `while` to loop over characters in a string:

```
message = 'Hello, World'
i = 0
while i < len('Hello, World'):
    letter = message[i]
    print(letter)
    i = i + 1
```

# for example

This is cleaner with for loops:

```
message = 'Hello, World':  
for letter in message:  
    print(letter)
```

# Counting

This example counts the number of times the letter a appears in a string:

```
word = 'banana'
count = 0
for letter in word:
    if letter == 'a':
        count = count + 1
print(count)
```

# Lists

Strings are sequences of words but what about sequences of numbers? For that we use lists:

```
>>> a = [1,2,3,4]
>>> a[1]
2
>>> a[2]
3
>>> a[-1]
4
```

# Mixed-type lists

Lists can contain any types:

```
[1, 2, 'a', 'b']  
[1.0, 'apple', 'banana']
```



# Iterating over a list

We can iterate over a list just like over a string, using a for loop:

```
numbers = [1, 2, 3, 4, 5, 6]
for x in numbers:
    print(x, 'squared is', x**2)
```

## range function

To iterate over sequences of numbers without explicitly defining a list use the range function:

```
>>> for x in range(5):  
...     print(x)  
...  
0  
1  
2  
3  
4
```

Range iterates from 0 to 4.

## range second argument

With two arguments you can set the start and stop of range:

```
>>> for x in range(5,10):  
...     print(x)  
...  
5  
6  
7  
8  
9
```

## range third argument

With a third argument you can also specify the step:

```
>>> for x in range(10,55,10):  
...     print(x)  
...  
10  
20  
30  
40  
50
```