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Jan. 11 – 15, 2021

Python for Data Analytics

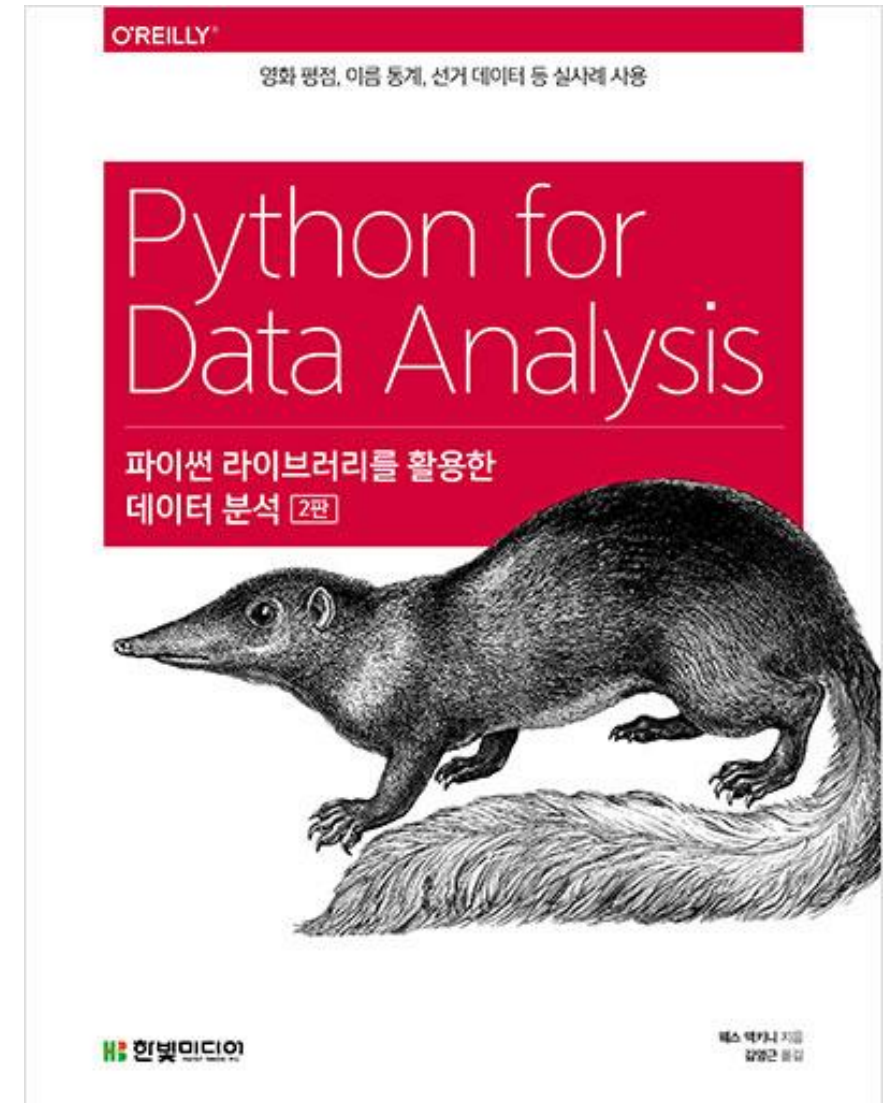
Python Basics



교재

- 파이썬 라이브러리를 활용한 데이터 분석 (2판)
- 김영근 옮김
- 한빛미디어, 2019.

- Python for Data Analysis: Data Wrangling with Pandas, NumPy, and IPython (2nd Ed.)
- By Wes McKinney
- O'Reilly Media, 2017



일정

| | | 1/11 (Mon) | 1/12 (Tue) | 1/13 (Wed) | 1/14 (Thu) | 1/15 (Fri) |
|----|-------|----------------------|------------|--------------|---------------|--------------------|
| 오전 | 8:30 | Python Basics | NumPy | Pandas I | Pandas II | Data Preprocessing |
| | 9:30 | | | | Matplotlib II | |
| | 10:30 | | | Matplotlib I | | |
| | 11:30 | | | | | |
| | 12:30 | 점심 시간 (12:30 ~ 1:30) | | | | |
| 오후 | 1:30 | [실습] | [실습] | [실습] | [실습] | [실습] |
| | 2:30 | | | | | |
| | 3:30 | | | | | |
| | 4:30 | | | | | |

About Us

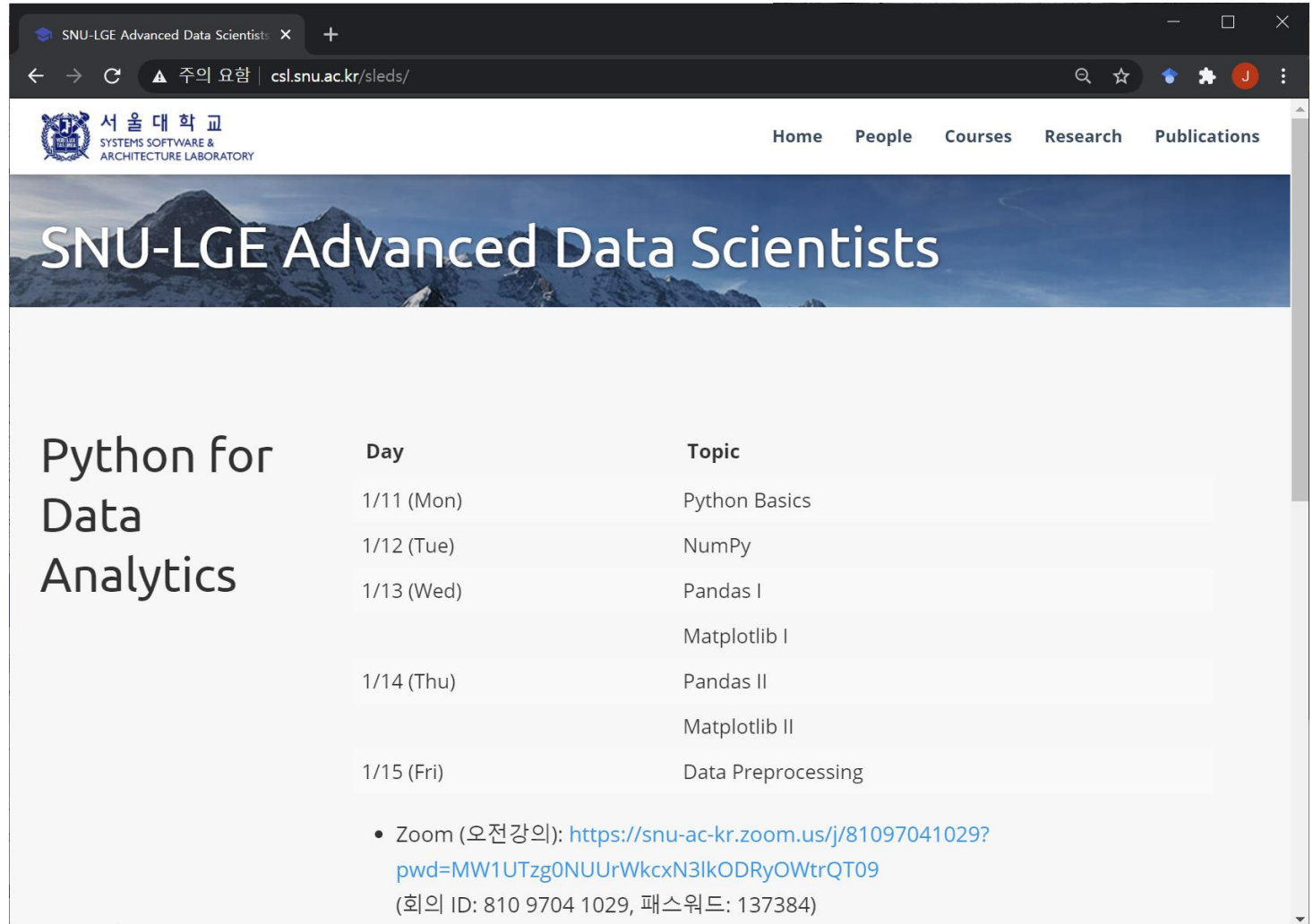
- 김진수 (Jin-Soo Kim)
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Course Homepage

■ <http://csl.snu.ac.kr/sleds>

- Lecture slides
- Lab. materials

- ID: lge
- PW: 6060



The screenshot shows a web browser window with the URL csl.snu.ac.kr/sleds/. The page header includes the SNU logo and the text "서울대학교 SYSTEMS SOFTWARE & ARCHITECTURE LABORATORY". Navigation links for "Home", "People", "Courses", "Research", and "Publications" are visible. The main heading is "SNU-LGE Advanced Data Scientists". Below this, a table lists the course schedule for "Python for Data Analytics".

| | Day | Topic |
|---------------------------|--|--------------------|
| Python for Data Analytics | 1/11 (Mon) | Python Basics |
| | 1/12 (Tue) | NumPy |
| | 1/13 (Wed) | Pandas I |
| | | Matplotlib I |
| | 1/14 (Thu) | Pandas II |
| | | Matplotlib II |
| | 1/15 (Fri) | Data Preprocessing |
| | • Zoom (오전강의): https://snu-ac-kr.zoom.us/j/81097041029?pwd=MW1UTzg0NUUrWkcxN3lkODRyOWtrQT09 | |
| | (회의 ID: 810 9704 1029, 패스워드: 137384) | |

Outline

- Introduction to Python
- Basic data types
- Input/Output
- Conditionals
- Loops
- Functions

Introduction to Python

Why Python?

- 1st place among the “Top Programming Languages” (IEEE Spectrum, 2019)
- “Fastest growing major programming language” (stackoverflow.com, 2019)
- The 2nd most popular programming language in GitHub (Nov. 2019)
- “The language of AI”

| Rank | Language | Type | Score |
|------|------------|---|-------|
| 1 | Python |    | 100.0 |
| 2 | Java |    | 96.3 |
| 3 | C |    | 94.4 |
| 4 | C++ |    | 87.5 |
| 5 | R |  | 81.5 |
| 6 | JavaScript |  | 79.4 |
| 7 | C# |     | 74.5 |
| 8 | Matlab |  | 70.6 |
| 9 | Swift |   | 69.1 |
| 10 | Go |   | 68.0 |

The Birth of Python

- Developed by Guido van Rossum in 1990

Over six years ago, in December 1989, I was looking for a “hobby” programming project that would keep me occupied during the week around Christmas. My office ... would be closed, but I had a home computer, and not much else on my hands. I decided to write an interpreter for the new scripting language I had been thinking about lately: a descendant of ABC that would appeal to Unix/C hackers. I chose Python as a working title for the project, being in a slightly irreverent mood (and a big fan of Monty Python’s Flying Circus).



Python Goals

- “Computer programming for Everybody”
 - DARPA funding proposal
- An easy and intuitive language just as powerful as major competitors
- Open source, so anyone can contribute to its development
- Code that is as understandable as plain English
- Suitability for everyday tasks, allowing for short development times

Program like Plain English?

```
filename = input('Enter file: ')
f = open(filename)

counts = dict()
for line in f:
    words = line.strip().lower().split()
    for word in words:
        counts[word] = counts.get(word, 0) + 1

lst = sorted([(v,k) for k,v in counts.items()], reverse=True)

for v, k in lst[:10]:
    print(v, k)
```

Compare with this:

```
#include <stdio.h>
#include <string.h>
#include <ctype.h>

#define MAX_CHARS 26
#define MAX_WORD_SIZE 30

struct TrieNode
{
    bool isEnd;
    unsigned frequency;
    int indexMinHeap;
    TrieNode* child[MAX_CHARS];
};

struct MinHeapNode
{
    TrieNode* root;
    unsigned frequency;
    char* word;
};

struct MinHeap
{
    unsigned capacity;
    int count;
    MinHeapNode* array;
};

TrieNode* newTrieNode()
{
    TrieNode* trieNode = new TrieNode;

    trieNode->isEnd = 0;
    trieNode->frequency = 0;
    trieNode->indexMinHeap = -1;
    for( int i = 0; i < MAX_CHARS; ++i )
        trieNode->child[i] = NULL;

    return trieNode;
}

MinHeap* createMinHeap( int capacity )
{
    MinHeap* minHeap = new MinHeap;

    minHeap->capacity = capacity;
    minHeap->count = 0;

    minHeap->array = new MinHeapNode [ minHeap->capacity ];

    return minHeap;
}

void swapMinHeapNodes ( MinHeapNode* a, MinHeapNode* b )
{
    MinHeapNode temp = *a;
    *a = *b;
    *b = temp;
}

void minHeapify( MinHeap* minHeap, int idx )
{
    int left, right, smallest;

    left = 2 * idx + 1;
    right = 2 * idx + 2;
    smallest = idx;
```

```
if ( left < minHeap->count &&
    minHeap->array[ left ]. frequency <
    minHeap->array[ smallest ]. frequency
    )
    smallest = left;

if ( right < minHeap->count &&
    minHeap->array[ right ]. frequency <
    minHeap->array[ smallest ]. frequency
    )
    smallest = right;

if( smallest != idx )
{
    minHeap->array[ smallest ]. root->indexMinHeap = idx;
    minHeap->array[ idx ]. root->indexMinHeap = smallest;

    swapMinHeapNodes ( &minHeap->array[ smallest ], &minHeap->array[ idx ] );

    minHeapify( minHeap, smallest );
}
}

void buildMinHeap( MinHeap* minHeap )
{
    int n, i;
    n = minHeap->count - 1;

    for( i = ( n - 1 ) / 2; i >= 0; --i )
        minHeapify( minHeap, i );
}

void insertInMinHeap( MinHeap* minHeap, TrieNode** root, const char* word )
{
    if ( (*root)->indexMinHeap != -1 )
    {
        ++( minHeap->array[ (*root)->indexMinHeap ]. frequency );

        minHeapify( minHeap, (*root)->indexMinHeap );
    }

    else if( minHeap->count < minHeap->capacity )
    {
        int count = minHeap->count;
        minHeap->array[ count ]. frequency = (*root)->frequency;
        minHeap->array[ count ]. word = new char [strlen( word ) + 1];
        strcpy( minHeap->array[ count ]. word, word );

        minHeap->array[ count ]. root = *root;
        (*root)->indexMinHeap = minHeap->count;

        ++( minHeap->count );
        buildMinHeap( minHeap );
    }

    else if ( (*root)->frequency > minHeap->array[0]. frequency )
    {
        minHeap->array[ 0 ]. root->indexMinHeap = -1;
        minHeap->array[ 0 ]. root = *root;
        minHeap->array[ 0 ]. root->indexMinHeap = 0;
        minHeap->array[ 0 ]. frequency = (*root)->frequency;

        delete [] minHeap->array[ 0 ]. word;
        minHeap->array[ 0 ]. word = new char [strlen( word ) + 1];
        strcpy( minHeap->array[ 0 ]. word, word );

        minHeapify ( minHeap, 0 );
    }
}
```

```
}

void insertUtil ( TrieNode** root, MinHeap* minHeap,
                const char* word, const char* dupWord )
{
    if ( *root == NULL )
        *root = newTrieNode();

    if ( *word != '\0' )
        insertUtil ( &((*root)->child[ tolower( *word ) - 97 ]),
                    minHeap, word + 1, dupWord );
    else
    {
        if ( (*root)->isEnd )
            ++( (*root)->frequency );
        else
        {
            (*root)->isEnd = 1;
            (*root)->frequency = 1;
        }

        insertInMinHeap( minHeap, root, dupWord );
    }
}

void insertTrieAndHeap(const char *word, TrieNode** root, MinHeap* minHeap)
{
    insertUtil( root, minHeap, word, word );
}

void displayMinHeap( MinHeap* minHeap )
{
    int i;

    for( i = 0; i < minHeap->count; ++i )
    {
        printf( "%s : %d\n", minHeap->array[i].word,
                minHeap->array[i].frequency );
    }
}

void printKMostFreq( FILE* fp, int k )
{
    MinHeap* minHeap = createMinHeap( k );

    TrieNode* root = NULL;

    char buffer[MAX_WORD_SIZE];

    while( fscanf( fp, "%s", buffer ) != EOF )
        insertTrieAndHeap(buffer, &root, minHeap);

    displayMinHeap( minHeap );
}

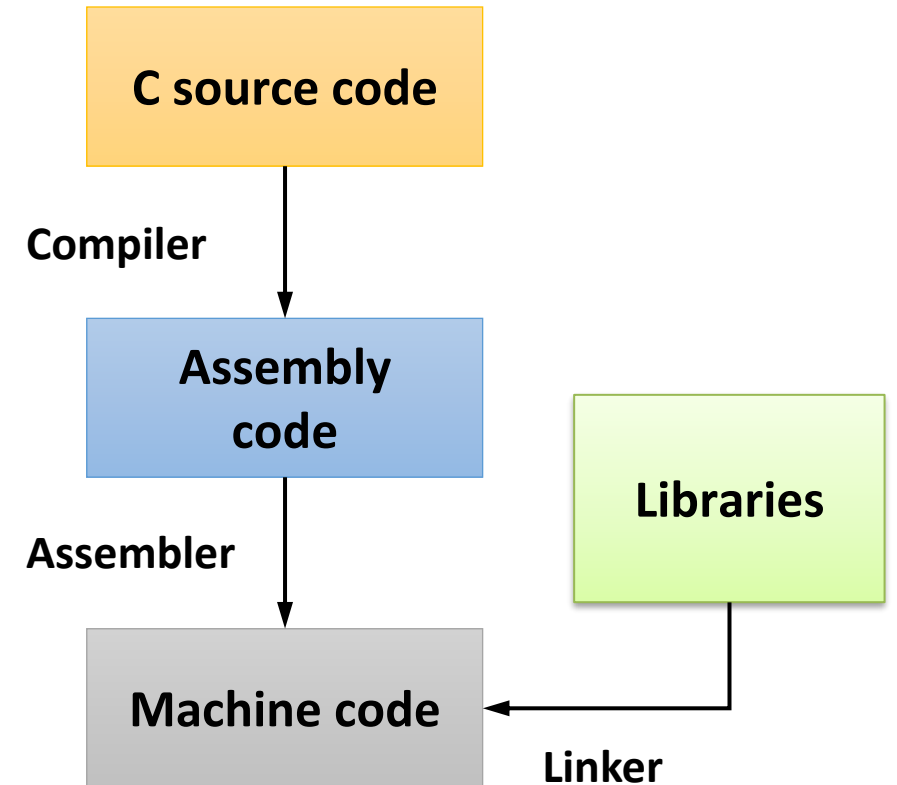
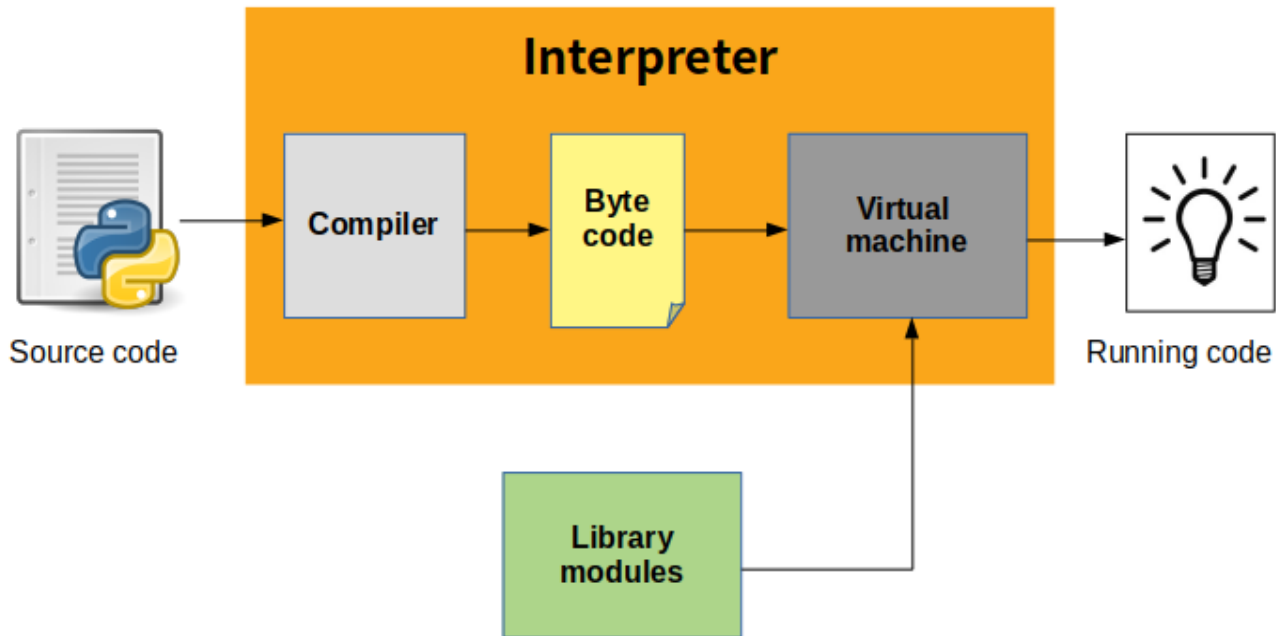
int main()
{
    int k = 5;
    FILE *fp = fopen ( "test.txt", "r" );
    if ( fp == NULL )
        printf ( "File doesn't exist " );
    else
        printKMostFreq ( fp, k );

    return 0;
}
```

Python Features

- Multi-paradigm platform-independent programming language
 - Structured
 - Object-oriented
 - Functional
 - ...
- Interpreted
- Dynamically typed
- Highly extensible
 - Modules can be written in other languages such as C, C++, ...
- “Pythonic”

Interpreted vs. Compiled



Python Versions

- Python 1.0 (1990)
- Python 2.0 (2000)
- Python 3.0 (2008) – Not backward compatible to 2.0

- The latest version: 3.9.1

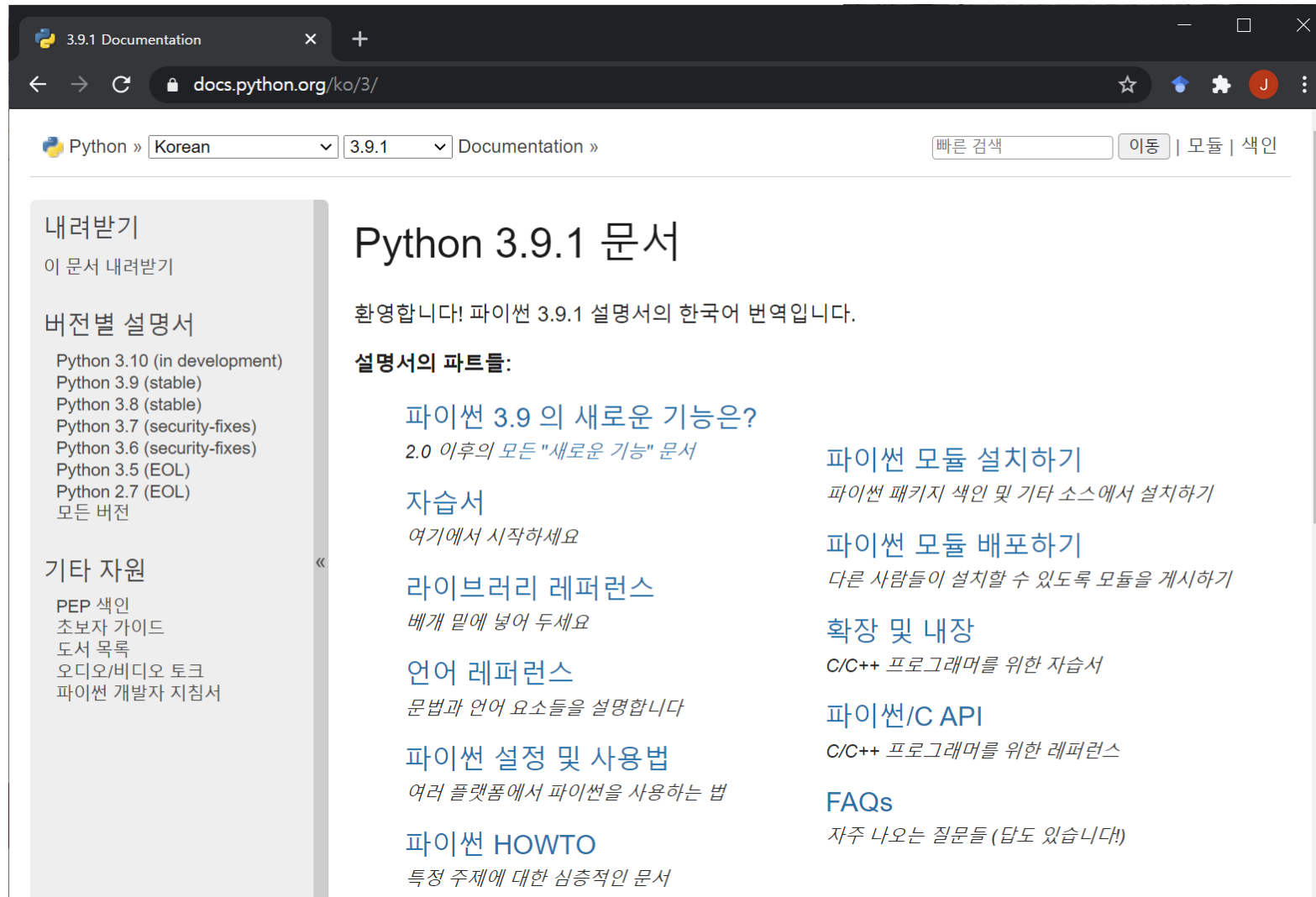
- Official homepage: <https://www.python.org>
- Tutorial: <https://docs.python.org/ko/3/tutorial>

Python Applications

- Machine Learning (TensorFlow, PyTorch, etc.)
- GUI Applications (Kivy, Tkinter, PyQt, etc.)
- Web frameworks (Django used by YouTube, Instagram, Dropbox)
- Image processing (OpenCV, Pillow, etc.)
- Web scraping (Scrapy, BeautifulSoup, etc.)
- Text processing (NLTK, KoNLPy, Word2vec, etc.)
- Test frameworks
- Multimedia
- Scientific computing and many more ...



https://docs.python.org



https://stackoverflow.com

A screenshot of a Google search result for the query "how to copy list in python". The search results show a snippet from Stack Overflow titled "How to clone or copy a list?". The snippet includes the text: "To actually copy the list, you have various possibilities:" followed by a list of three methods: 1. Using the builtin `list.copy()` method (available since Python 3.3): `new_list = old_list. ...`, 2. Slicing: `new_list = old_list[:]`, and 3. Using the builtin `list()` function: `new_list = list(old_list)`. Below the snippet, there are links to "Python List copy() - Programiz" and "How to clone or copy a list? - Stack Overflow".

A screenshot of a Stack Overflow question titled "How to clone or copy a list?". The question is asked 9 years, 8 months ago and has 16 answers. The question text is: "What are the options to clone or copy a list in Python? While using `new_list = my_list`, any modifications to `new_list` changes `my_list` everytime. Why is this?". The question has 2301 votes and 558 views. The top answer, by user 'Satya', has 513 votes and 2 answers. The answer text is: "With `new_list = my_list`, you don't actually have two lists. The assignment just copies the reference to the list, not the actual list, so both `new_list` and `my_list` refer to the same list after the assignment. To actually copy the list, you have various possibilities:". The page also features a Stack Overflow Talent advertisement with the text "Build your career on Stack Overflow".

Welcome to the World of Spam!



Basic Data Types

Data Types

- Basic data types

- Boolean
- Integer
- Floating point
- String

- Container data types

- List
- Dictionary
- Tuple
- Set

- Libraries

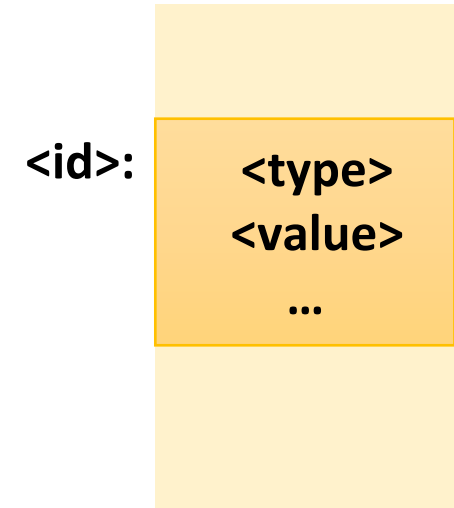
- array
- math
- random
- urllib
- ...

- User-defined data types (classes)

- Automobile
- Monster
- Pixel
- ...

Object-oriented Data Model

- Objects are Python's abstraction for data
- Each object has:
 - An identity (e.g., memory address) – `id(x)`
 - A type (or class) – `type(x)`
 - A value
 - A reference count – `sys.getrefcount(x)`
- The '`is`' operator compares the identity of two objects
- Objects can be **immutable** (e.g., numbers, strings, tuples, ...)
- Different variables can refer to the same object



Constants and Variables

■ Constant

- An immutable object with a fixed value (its value cannot be changed)
- Boolean constants: `True`, `False`
- Numeric constants: `0`, `12`, `3.14159`
- String constants: `'this is a string'`, `"hello"`

■ Variable

- A "name" for an object
- A variable refers to an object (mutable/immutable)

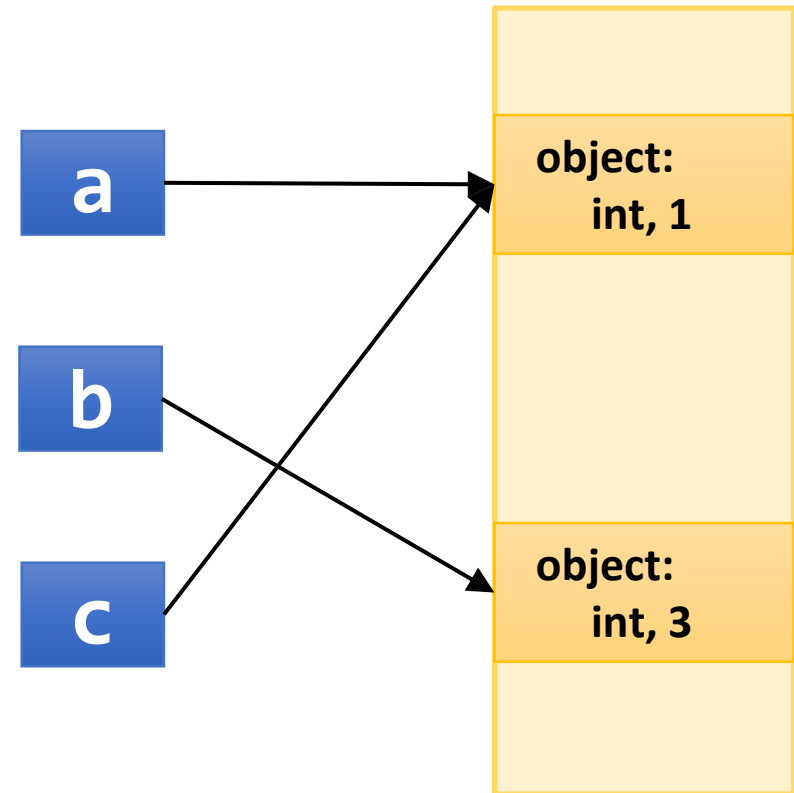
■ Python is a dynamically-typed language

- Variable names can be bound to different values, possibly of varying types (or classes)

Assignments

- Assignment operator (=) assigns a value (or an object) to a variable

```
>>> a = 1  
  
>>> b = 3  
  
>>> c = a  
  
>>> print(id(a), id(b), id(c))
```



Assignments: Examples

- Variables are used to store temporary values
- In python, a variable actually points to an object
- The same variable can point objects with different types

```
>>> x = 1           # x points to an integer (constant) object
>>> y = 2           # y also points to an integer (constant) object
>>> x + 1           # read the value x and add 1
>>> a = x + 1       # a points to an integer object that has 2
>>> x = x + 1       # x points to an integer object that has 2
>>> b = y           # a points to the same integer object 2
>>> y = "2"         # y now points to a string object
>>> z = x + y        # throws a type mismatch exception (TypeError)
>>> z = x + b        # z now points to an integer object 4
>>> a, b = b, a      # ???
```

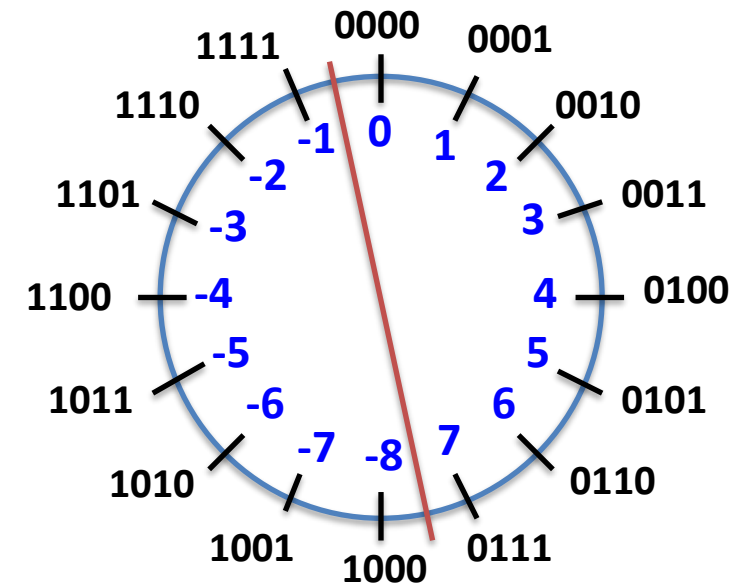
Integer

■ int

- Integer numbers in an unlimited range
- Negative numbers are represented in two's complement format



$$O(B) = -b_{w-1} \cdot 2^{w-1} + \left(\sum_{i=0}^{w-2} b_i \cdot 2^i \right)$$



- Some small integers are shared (implementation-specific)

Representing Integer Constants

- An integer constant should start with a non-zero digit (except zero)
- Use prefixes (0b, 0o, 0x) to denote binary/octal/hexadecimal values
- A single underscore('_') can be placed between digits

```
>>> print(1011)
>>> print(0b1011)
>>> print(0o1011)
>>> print(0x1011)
>>> print(10_11)
>>> print(0100)
>>> print(10__11)
```

```
>>> print(2_7_8_9_0)
>>> print(27_890)
>>> print(2_7890)
>>> print(0b0110_1100_1111_0010)
>>> print(0x6cf2)
>>> print(0o66362)
```

Integer: Arithmetic Operations

- Addition: $a + b$
- Subtraction: $a - b$
- Multiplication: $a * b$
- Division: a / b → floating-point
- Floor division: $a // b$ → integer
- Modulo: $a \% b$
- Power: $a ** b$

Integer: Bitwise Operations

- Invert: $\sim a$
- Shift left: $a \ll b$
- Shift right: $a \gg b$
- Bitwise AND: $a \& b$
- Bitwise OR: $a \mid b$
- Bitwise XOR: $a \wedge b$

Boolean

■ bool

- False or True
- A subtype of the integer type
- Boolean values behave like the values 0 and 1, respectively
- When converted to a string, 'False' or 'True' are returned, respectively

```
>>> t = False
>>> print(t)

>>> a = 100
>>> b = bool(a)
>>> print(a, b)
```

```
>>> t = True
>>> f = False
>>> x = 10
>>> print(x + t)
>>> print(t * f)
>>> print(True == 1)
```

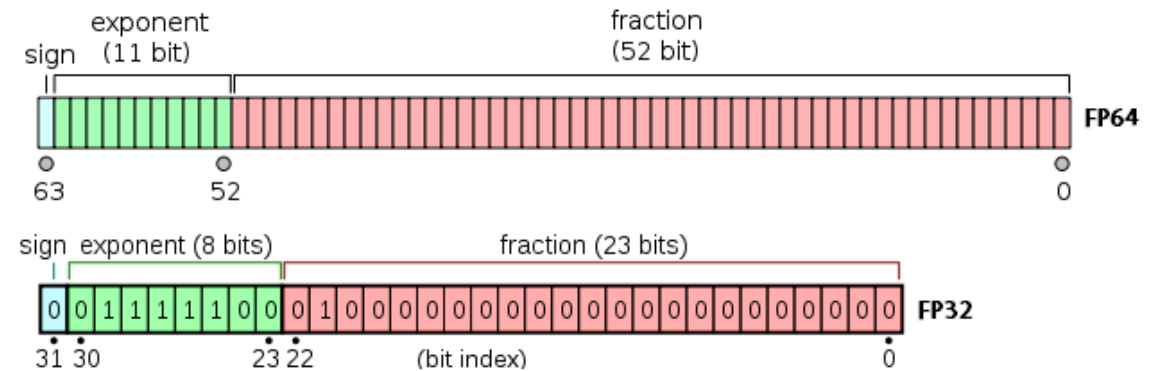
Floating Point

■ float

- Python only supports double-precision floating point numbers
- The benefit of supporting single-precision is not that great due to the overhead of using objects in Python

■ IEEE754 floating point representation standard

- Double precision: 64-bit
($4.9 \times 10^{-324} \sim 1.8 \times 10^{308}$)
- Single precision: 32-bit
($1.4 \times 10^{-45} \sim 3.4 \times 10^{38}$)



Representing FP Constants

- Represented with or without exponent
- Integer and exponent parts are always interpreted using radix 10
- A single underscore ('_') can be placed between digits

```
>>> print(3.14)
>>> print(10.)
>>> print(0.001)
>>> print(1e100)
>>> print(3.14e-10)
>>> print(0e0)
```

```
>>> print(3.14_15_92)
>>> print(1_234.005_694)
>>> print(e100)
>>> print(0b1000.0011)
>>> print(0o1234.56)
>>> print(0xdead.beef)
```


Floating Point Operations

- Addition: $a + b$
- Subtraction: $a - b$
- Multiplication: $a * b$
- Division: a / b

Floating Point Example

```
>>> pi = 3.14159
>>> print(pi)
>>> print(2*pi)

>>> d = 0.1
>>> print(d+d+d+d+d+d+d+d+d+d)

>>> VeryLarge = 1e20
>>> x = (pi + VeryLarge) - VeryLarge
>>> y = pi + (VeryLarge - VeryLarge)
>>> print(x, y)
```

math: Mathematical Functions

- `import math`
- `math.exp(x):` e^x
- `math.log(x):` $\log_e x$
- `math.log10(x):` $\log_{10} x$
- `math.log(x, b):` $\log_b x$
- `math.pow(x, y):` x^y
- `math.sqrt(x):` \sqrt{x}
- `math.sin(x):` $\sin x$
- `math.pi:` π
- ...

random: Random Number Generators

- `import random`
- `random.random()`: generate a number between [0, 1)
- `random.randint(a, b)`: generate a number (integer) between [a, b]
- `random.seed(a=None)`: seed the random number generator
- `random.choice(seq)`: choose an element from the sequence

```
>>> import random
>>> random.random()
0.6145831050305076
>>> random.randint(0, 10)
4
>>> random.choice(['가위', '바위', '보'])
'보'
```

String

■ str

- A sequence of characters
- Python 3 natively supports Unicode characters (even in identifiers)
- No difference in single (e.g., 'hello') or double-quoted strings (e.g., "hello")
- You can use raw strings by adding an **r** before the first quote

```
>>> print('I\'m your father')
>>> print("Where is 'spam'?")
>>> s1 = "What is the"
>>> s2 = 'spam'
>>> print(s1 + s2)
>>> print(len(s1))
```

```
>>> 이름 = '홍길동'
>>> print("안녕" , 이름)
>>> print("안녕" + 이름)
>>> print("안녕\n"+이름)

>>> print(r'C:\abc\name')
```

Concatenating/Replicating Strings

- `str1 + str2` : create a new string by adding two existing strings together
- Two or more string literals are automatically concatenated
- `str * n` : create a new string by replicating the original string n times

```
>>> s1 = 'hello'
>>> s2 = 'world'
>>> s = s1 + s2
>>> print(s)
helloworld
>>> print('hello' 'world' '!')
helloworld!
```

```
>>> s1 = 'hello'
>>> s2 = 'world'
helloworld
>>> print(s1*3 + s2)
hellohellohelloworld
>>> print('-'*30)
-----
```

Type Conversion

- `int()`, `float()`, `str()`
- `hex()`, `oct()`, `bin()`
- `ord()`, `chr()`

```
>>> int(3.14)
>>> int('3.14')
>>> int(True)
>>> int('0xcafe')
>>> int('cafe', 16)
>>> int('0xcafe', 0)
```

```
>>> float(3)
>>> float('-3.14\n')
>>> float('1e10')

>>> str(2020)
>>> str(0xcafe)
>>> str(3.141592)

>>> hex(2020)
>>> oct(2020)
>>> bin(2020)
>>> ord('a')
>>> chr(100)
```

Input/Output

Printing Output

■ String formatting

- **%d**: integer
- **%f**: floating-point
- **%s**: string

```
>>> m = 10; g = 3.14; t = 'hello'
>>> print('m = ', m, ', g = ', g)
m = 10 , g = 3.14
```

```
>>> print('%d: this is an integer' % m)
10: this is an integer
```

```
>>> print('m = %d, g = %f' % (m, g))
m = 10, g = 3.140000
```

```
>>> print('%s\t\tm: %d\n\t\tg: %f' % (t, m, g))
hello                m: 10
                     g: 3.140000
```

Getting User Input

- `input(prompt)`
 - If a prompt argument is present, it is written to standard output
 - Then, reads a line from input, converting it to a **string** (stripping a trailing newline)

```
>>> name = input('Your name: ')
Your name: Spam
>>> age = input('Your age: ')
Your age: 20
>>> print('Hello,', name)
Hello, Spam
>>> print('You will be', int(age)+1, 'next year!')
You will be 21 next year!
```

Comments

- Single-line comments

```
# This is a comment
```

- Multi-line comments

```
# These  
# are all  
# comments
```

```
"""  
These are  
all  
comments  
"""
```

```
'''  
These are  
all  
comments  
'''
```

- A newline terminates each statement. However, you can use a semicolon to separate statements on the same line.

```
a = 3; print(a)
```

Getting Help

- `help()`
 - `help(class)`
 - `help(class.func)`
 - `help(object.func)`
 - ...
-
- `dir(class)`
 - `dir(object)`

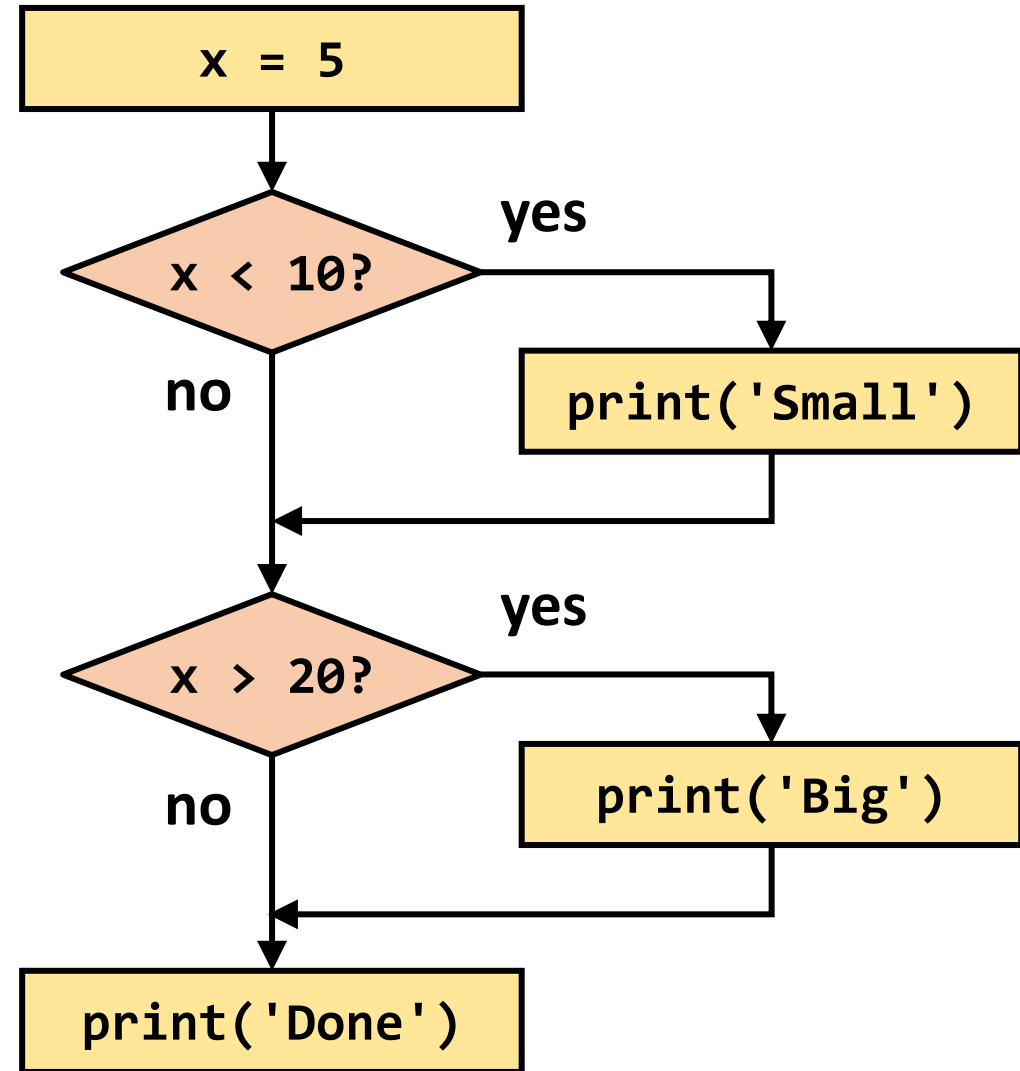
Help on class int in module builtins:

```
class int(object)
|   int(x=0) -> integer
|   int(x, base=10) -> integer
|
|   Convert a number or string to an integer, or return 0 if no arguments
|   are given. If x is a number, return x.__int__(). For floating point
|   numbers, this truncates towards zero.
|
|   If x is not a number or if base is given, then x must be a string,
|   bytes, or bytearray instance representing an integer literal in the
|   given base. The literal can be preceded by '+' or '-' and be surrounded
|   by whitespace. The base defaults to 10. Valid bases are 0 and 2-36.
|   Base 0 means to interpret the base from the string as an integer literal.
|   >>> int('0b100', base=0)
|   4
|
|   Methods defined here:
|
|   __abs__(self, /)
|       abs(self)
|
|   __add__(self, value, /)
|       Return self+value.
|
|   __and__(self, value, /)
|       Return self&value.
```

Conditionals

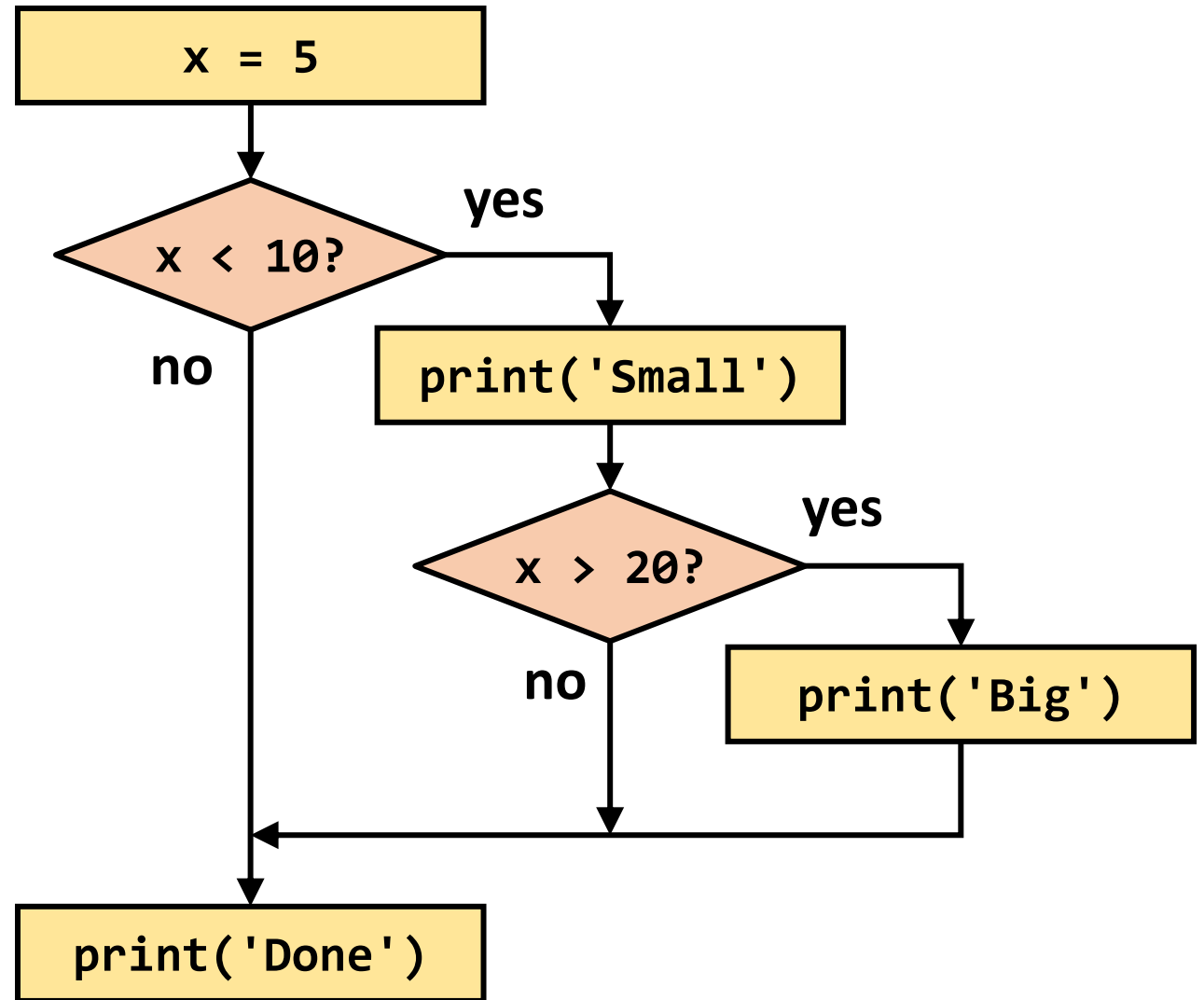
Conditional Steps

```
x = 5
if x < 10:
    print('Small')
if x > 20:
    print('Big')
print('Done')
```



Indentation Matters!

```
x = 5
if x < 10:
    print('Small')
    if x > 20:
        print('Big')
    print('Done')
```



Indentation

- Python does not use curly braces { } to indicate a block of statements
- Increase indent after an `if`, `elif`, `else`, `for`, `while` etc. statement
- Maintain indent to indicate the scope of the block
- Reduce indent back to indicate the end of the block
- Blank / comment lines are ignored
- Turn off tabs! (turn tabs into spaces)

```
if a < b:  
    a = a + b  
    print('here')  
else:  
    a = a - b  
    print('there')  
print('done')
```

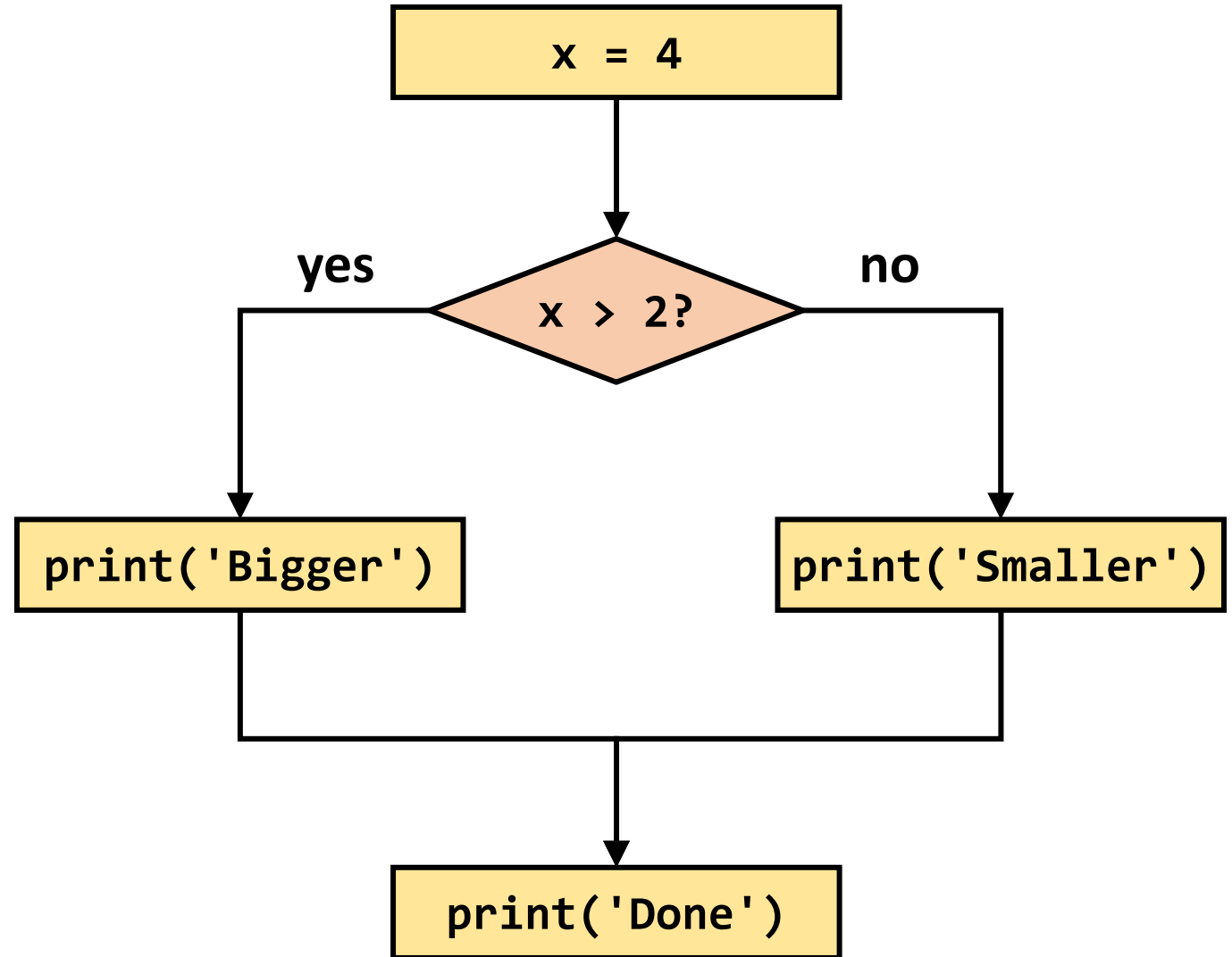

Evaluating Conditions

- Boolean expressions using comparison operators evaluate to **True** or **False**
- Several Boolean expressions can be combined using logical **and** / **or** / **not** operators
- Comparison operators do not change the variables

| Notation | Meaning |
|-------------------|---|
| a < b | True if a is less than b |
| a <= b | True if a is less than or equal to b |
| a == b | True if a is equal to b |
| a != b | True if a is not equal to b |
| a >= b | True if a is greater than or equal to b |
| a > b | True if a is greater than b |
| A and B | True if both A and B are True |
| A or B | True if either A or B (or both) is True |
| not A | True if A is False |
| a is b | True if a and b point to the same object |
| a is not b | True if a and b point to the different object |
| a in b | True if a is in the sequence b |
| a not in b | True if a is not in the sequence b |

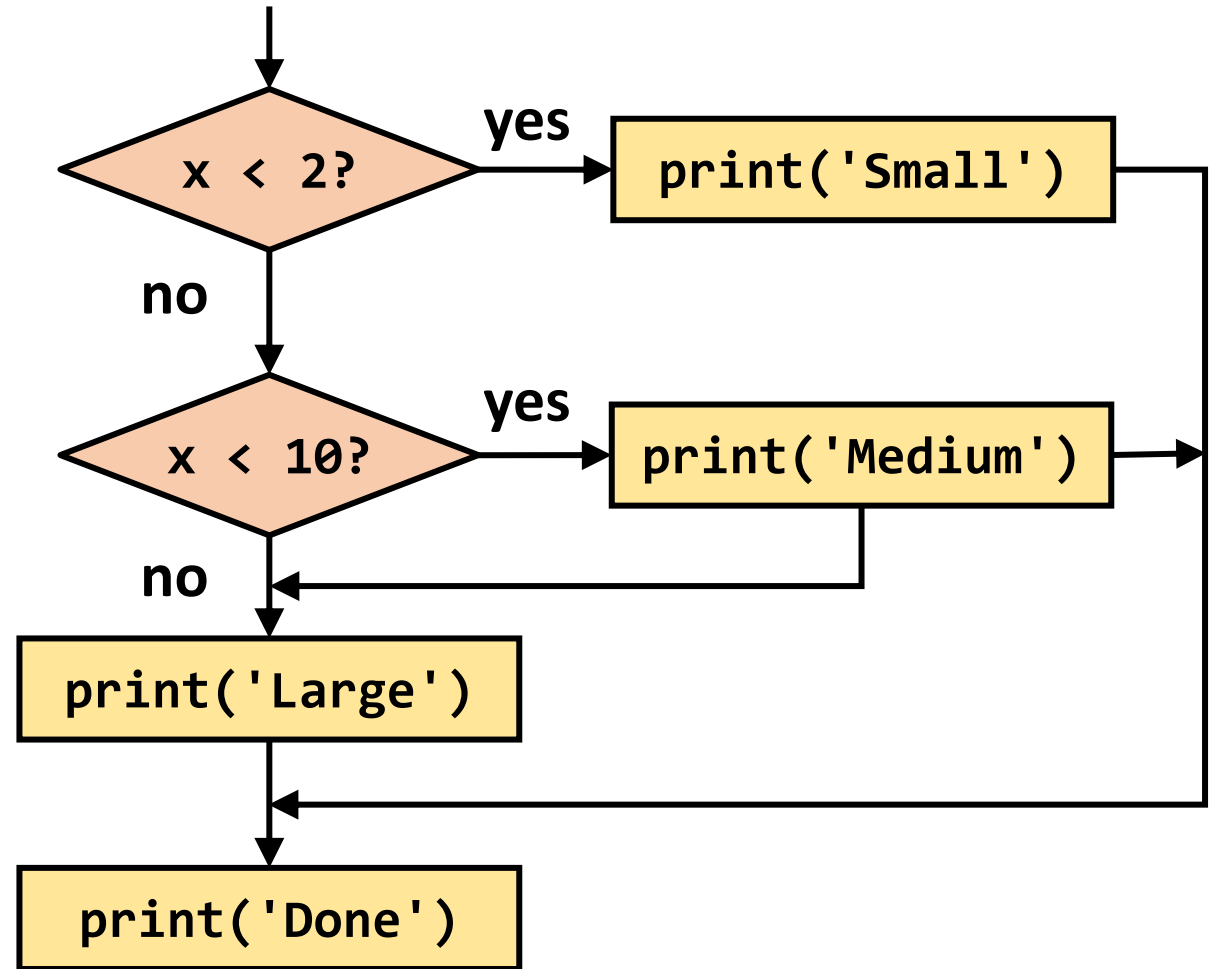
Two-way Decisions

```
x = 4
if x > 2:
    print('Bigger')
else:
    print('Smaller')
print('Done')
```



Multi-way Decisions

```
if x < 2:  
    print('Small')  
elif x < 10:  
    print('Medium')  
else:  
    print('Large')  
print('Done')
```



Multi-way Puzzles

- What's wrong with these programs?

```
if x < 2:
    print('Below 2')
elif x >= 2:
    print('Two or more')
else:
    print('Something else')
```

```
if x < 2:
    print('Below 2')
elif x < 20:
    print('Below 20')
elif x < 10:
    print('Below 10')
else:
    print('Something else')
```

Conditional Expression

```
if score >= 90:
    grade = 'A'
elif score >= 80:
    grade = 'B'
elif score >= 70:
    grade = 'C'
elif score >= 60:
    grade = 'D'
else:
    grade = 'F'
```

```
grade = 'A' if score >= 90 else \
        'B' if score >= 80 else \
        'C' if score >= 70 else \
        'D' if score >= 60 else \
        'F'
```

Exceptions

- Errors detected during execution even if a statement or expression is syntactically correct
 - `ZeroDivisionError`
 - `NameError`
 - `TypeError`
 - `ValueError`
 - `IndexError...`

```
>>> 1/0
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
ZeroDivisionError: division by zero
>>> 4 + spam*3
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
NameError: name 'spam' is not defined
>>> '2' + 1
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
TypeError: must be str, not int
>>> int('what')
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
ValueError: invalid literal for int() with
base 10: 'what'
```

Handling Exceptions

- Surround a dangerous section of code with `try` and `except`
- If the code in the `try` works – the `except` is skipped
- If the code in the `try` fails – it jumps to the `except` code block

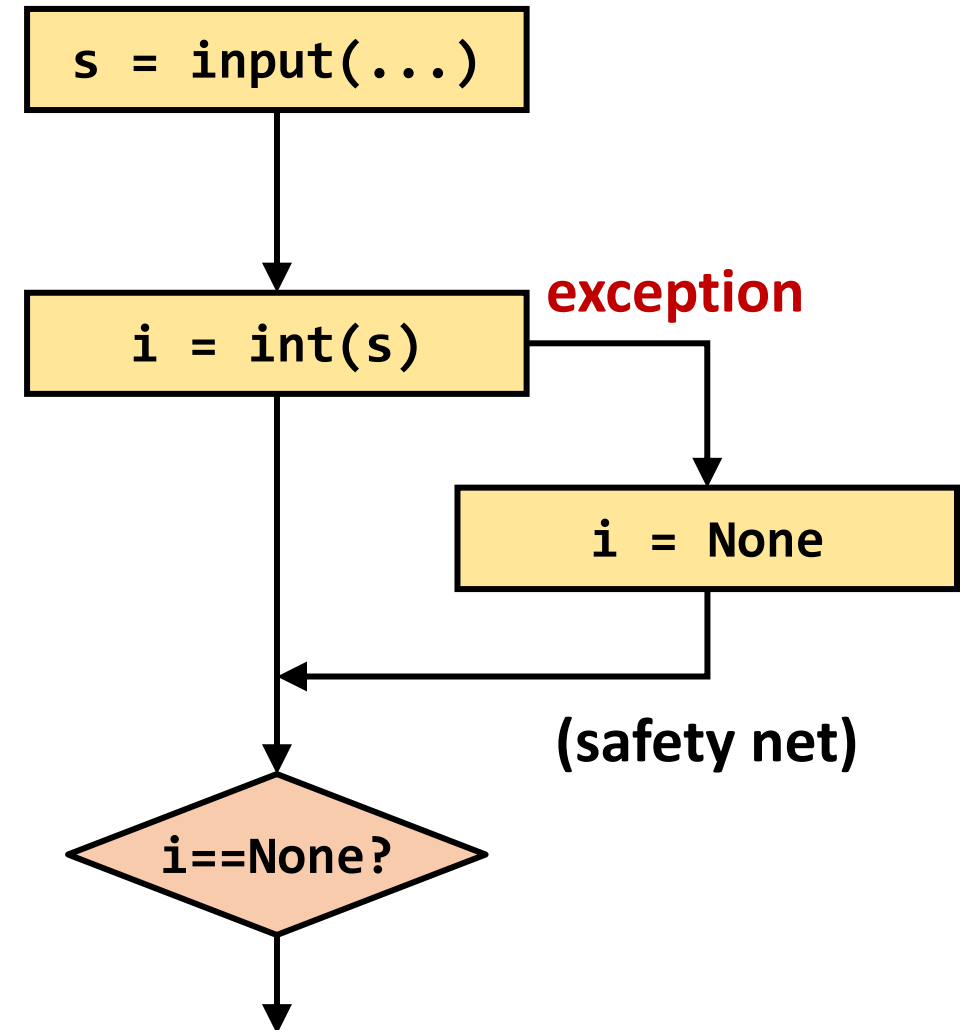
```
x = int(input('Enter a number: '))
x1 = x + 1
print(x, '+ 1 =', x1)
```

```
while True:
    try:
        x = int(input('Enter a number: '))
        break
    except:      # catch all exceptions
        print('Oops, try again...')
x1 = x + 1
print(x, '+ 1 =', x1)
```

Example

```
s = input('Enter a number: ')
try:
    i = int(s)
except:
    i = None

if i is None:
    print('Not a number')
else:
    print('Nice work')
```



Loops

Loops

▪ while loop

- Keep running the loop body while expression is **True**

```
while (expression):  
    <statement_1>  
    <statement_2>  
    ...  
    <statement_n>
```

▪ for loop

- Run the loop body for the specified range

```
for <element> in <object>:  
    <statement_1>  
    <statement_2>  
    ...  
    <statement_n>
```

Loops Example

▪ `while` loop

- Keep running the loop body while expression is `True`

```
i = 0
while i < 5:
    print(i)
    i += 1
```

▪ `for` loop

- Run the loop body for the specified range

```
for i in range(5):
    print(i)
```

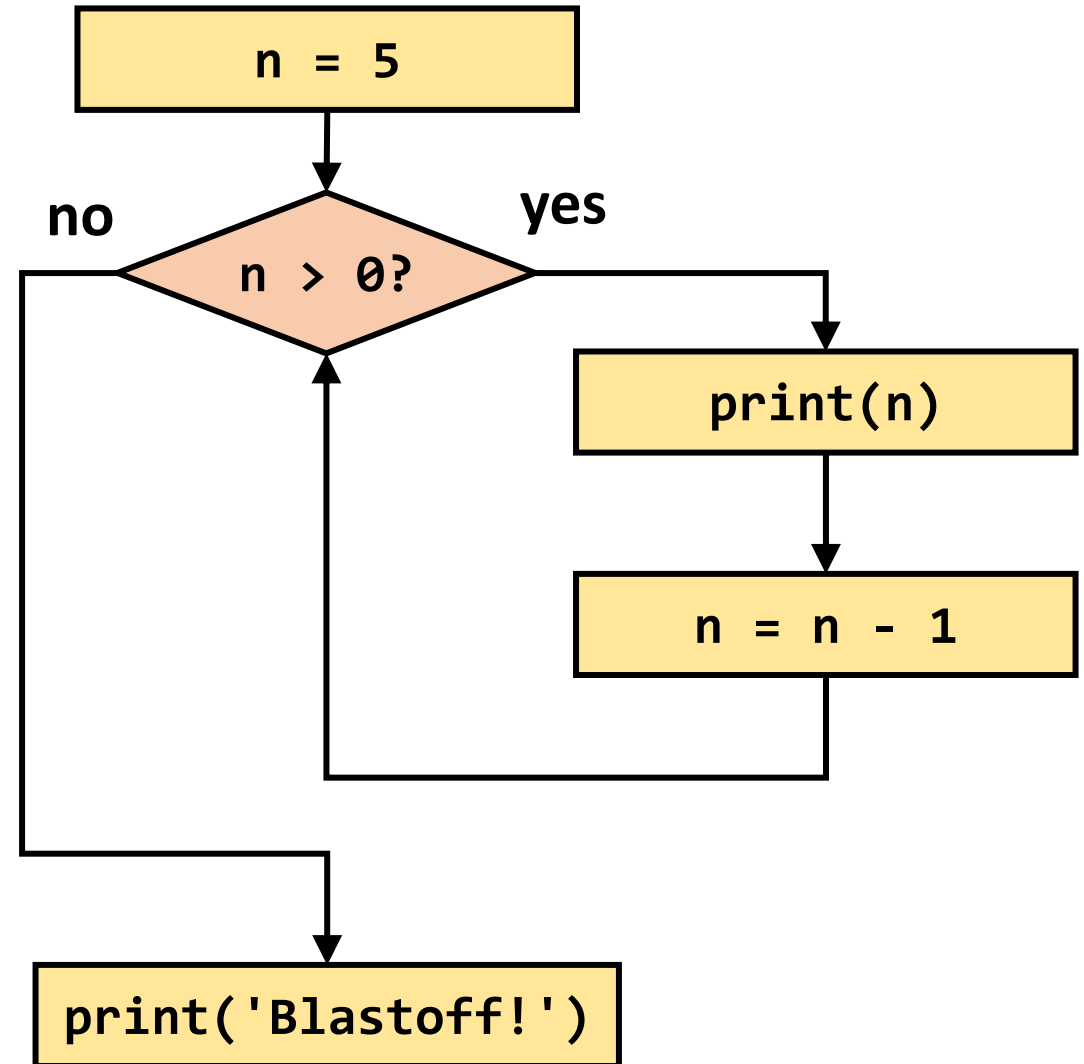
While vs. For

- Indefinite loop – **while**
 - **while** is natural to loop an indeterminate number of times until a logical condition becomes **False**
- Definite loop – **for**
 - **for** is natural to loop through a list, characters in a string, etc. (anything of determinate size)
 - Run the loop once for each of the items

Indefinite Loop with while

- Indefinite loops have **iteration variables** that change each time through a loop

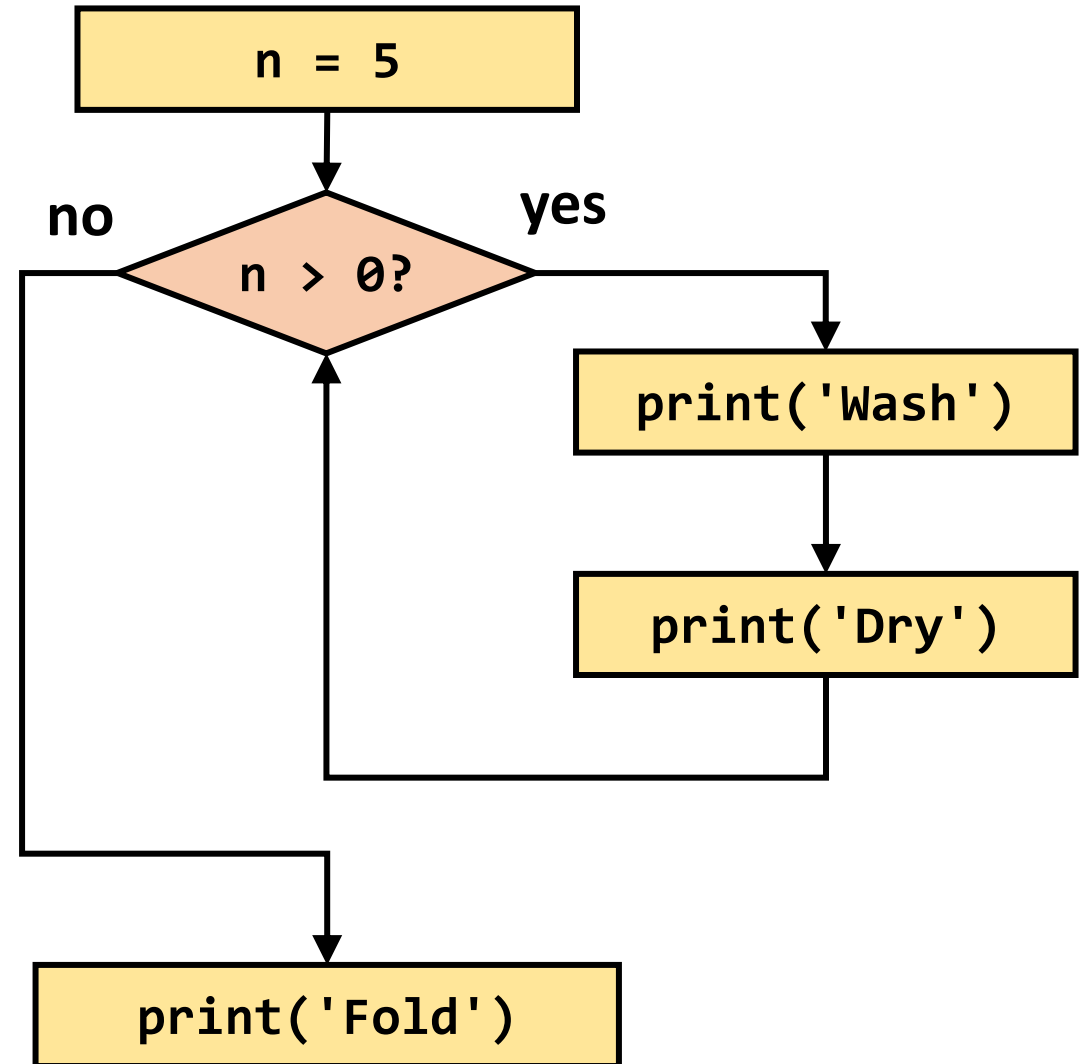
```
n = 5
while n > 0:
    print(n)
    n = n - 1
print('Blastoff!')
```



An Infinite Loop

- What's wrong with this loop?

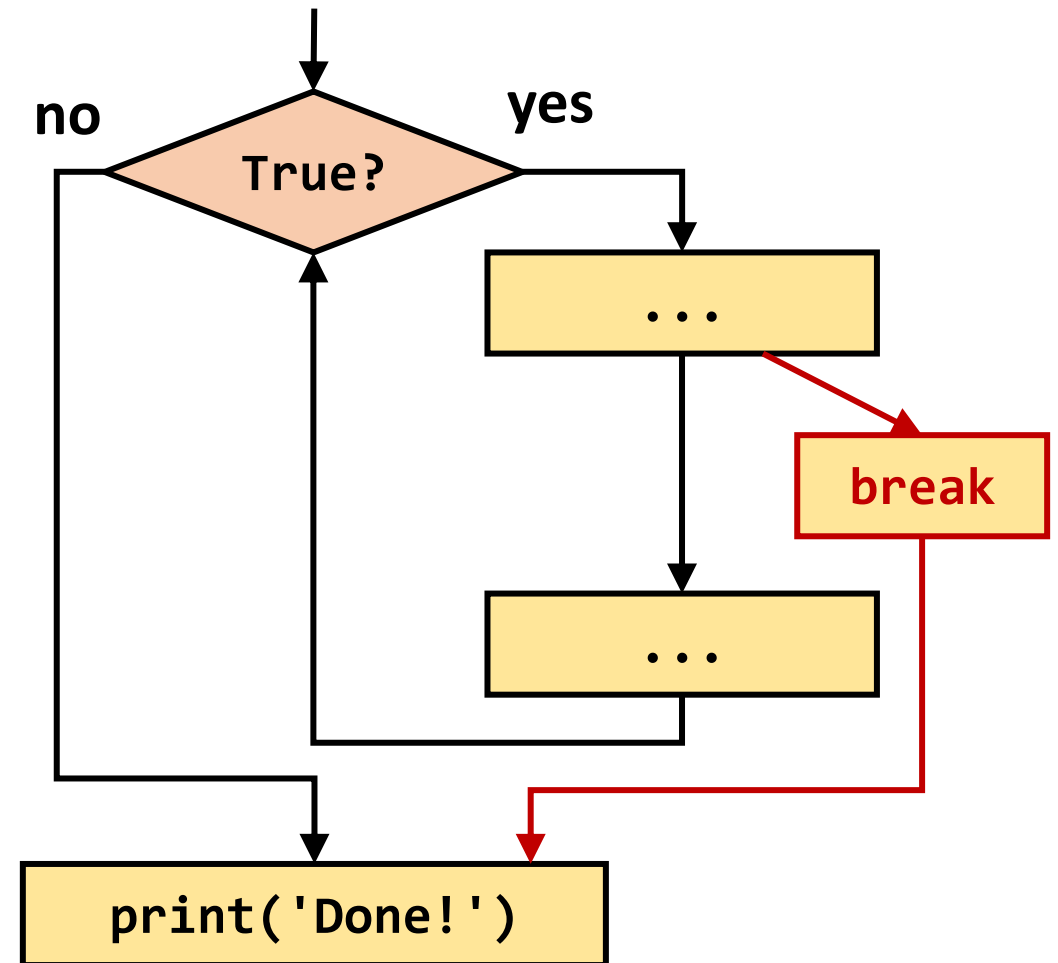
```
n = 5
while n > 0:
    print('Wash')
    print('Dry')
    print('Fold')
```



break: Breaking Out of a Loop

- The `break` statement ends the current loop and jumps to the statement immediately following the loop

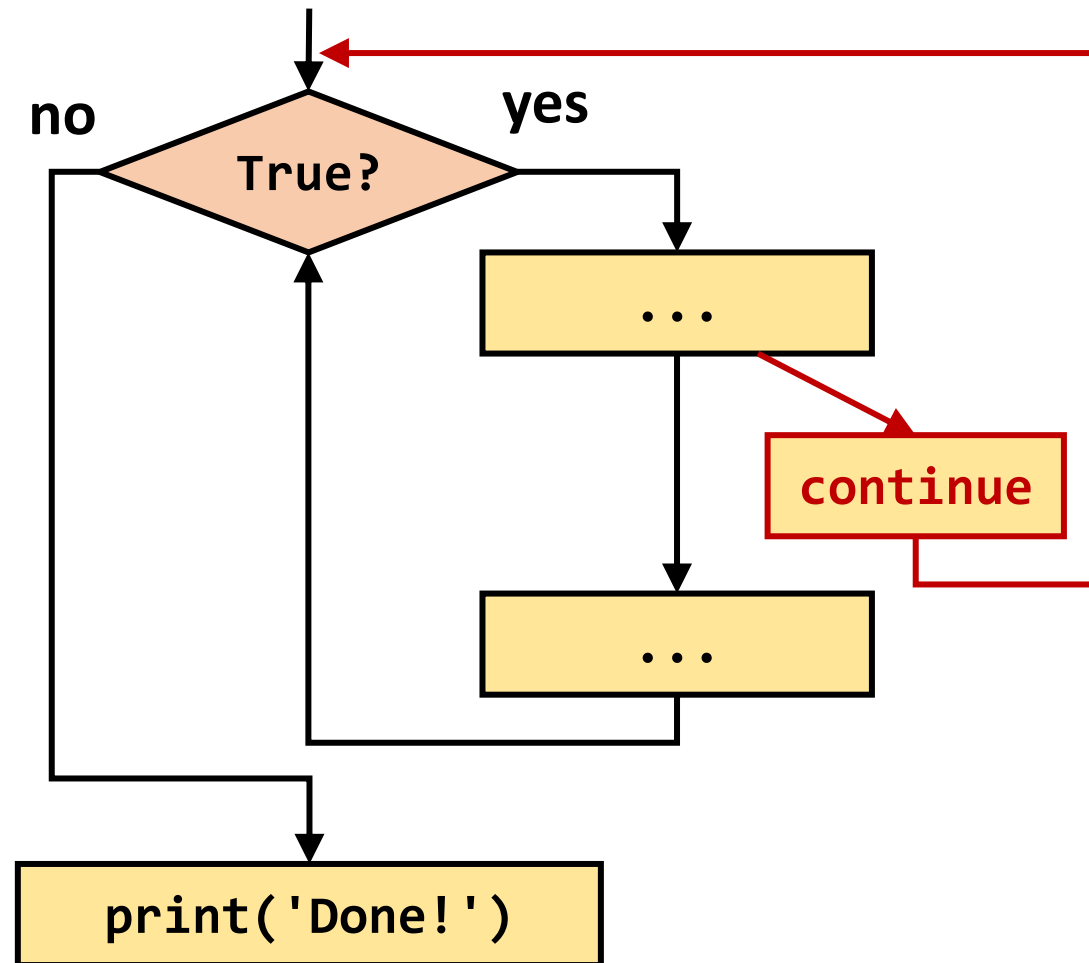
```
while True:
    line = input('> ')
    if line == 'done':
        break
    print(line)
print('Done!')
```



continue: Finishing an Iteration

- The `continue` statement ends the current iteration and jumps to the top of the loop and starts the next iteration

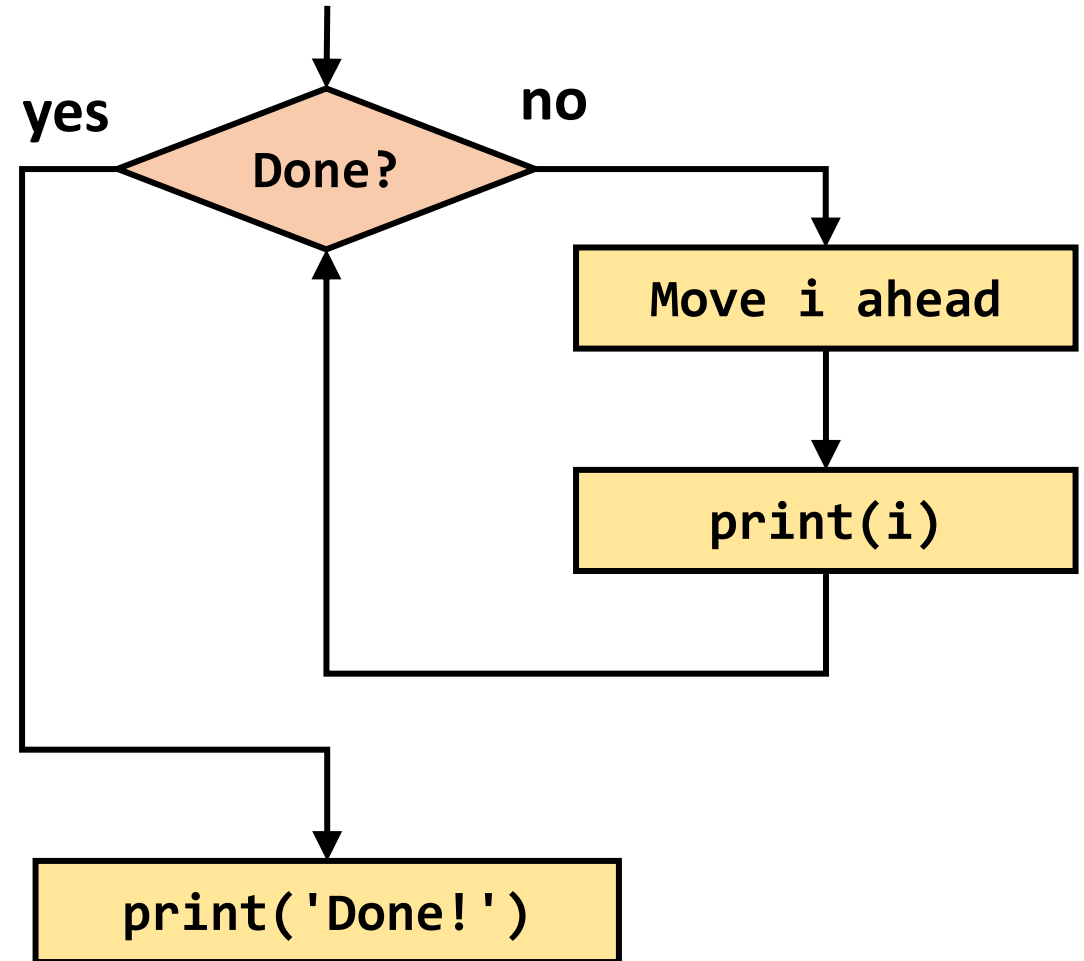
```
while True:
    line = input('> ')
    if line[0] == '#':
        continue
    if line == 'done':
        break
    print(line)
print('Done!')
```



Definite Loop with for

- Definite loops have **explicit iteration variables** that change each time through a loop

```
for i in range(5):  
    print(i)  
    print('Done!')
```



Specifying an Integer Range

- `range([start,] stop[, step])`
 - Represents an immutable sequence of numbers
 - If the `step` argument is omitted, it defaults to 1 (`step` should not be zero)
 - If the `start` argument is omitted, it defaults to 0

```
range(5)           # 0, 1, 2, 3, 4
range(-1, 4)       # -1, 0, 1, 2, 3
range(0,10,2)       # 0, 2, 4, 6, 8
range(5,0,-1)       # 5, 4, 3, 2, 1
range(10,2)         # ???
```

- `list(range(100))` → `[0, 1, 2, ..., 99]`

Looping Through a List (I)

```
print('Prime numbers')  
for p in [2, 3, 5, 7, 11, 13, 17, 19]:  
    print(p)
```

```
for name in ['Liam', 'Noah', 'William', 'James']:  
    print('Hi,', name)
```

Looping Through a List (2)

```
friends = ['Harry', 'Sally', 'Tom', 'Jerry']  
  
for friend in friends:  
    print('Merry Christmas,', friend)  
  
for i in range(len(friends)):  
    print('Merry Christmas,', friends[i])
```

Summing in a Loop

```
sum = 0
print('Before', sum)
for n in [24, 12, 4, 19, 31, 27]:
    sum = sum + n
    print(n, sum)
print('After', sum)
```

Before 0

24 24

12 36

4 40

19 59

31 90

27 117

After 117

Finding the Largest Value?

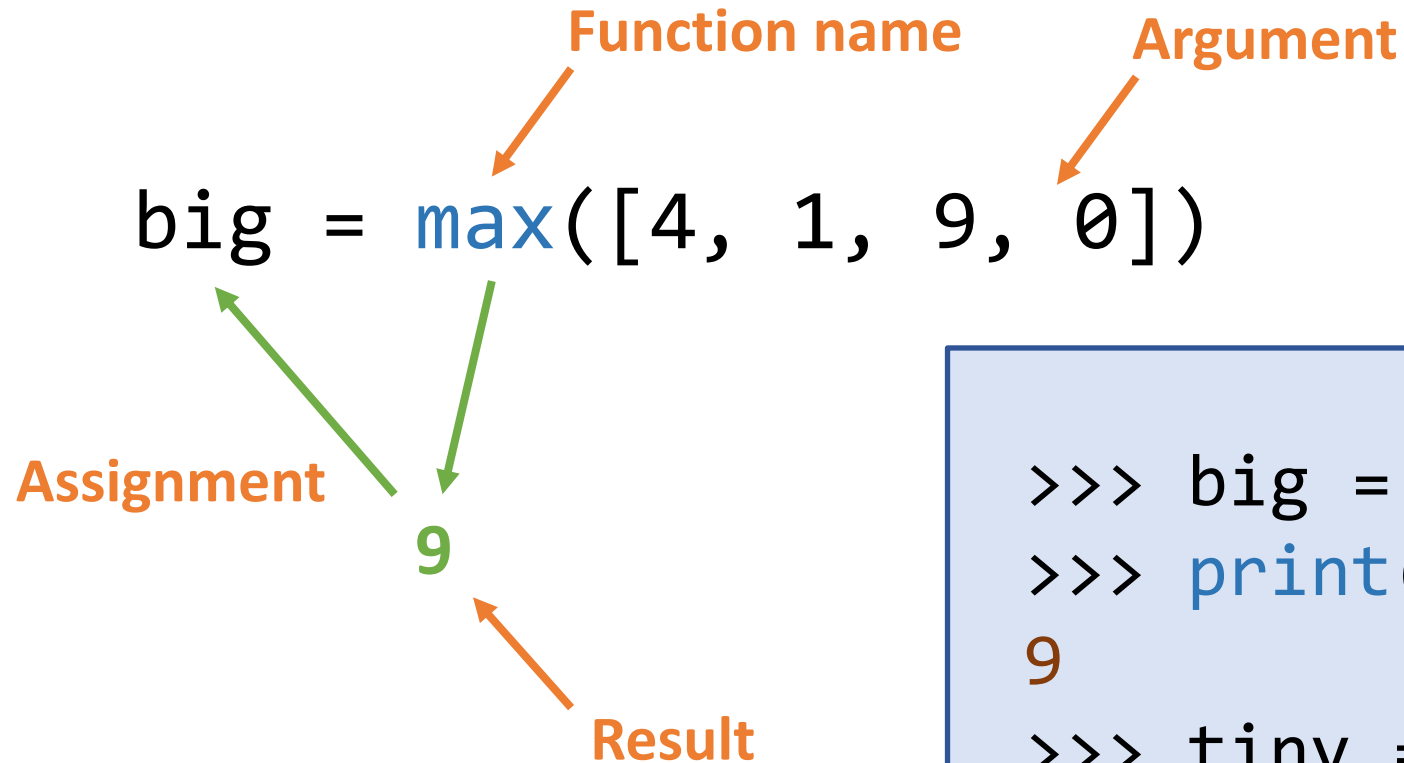


Functions

Python Functions

- A **function** is some reusable code that takes argument(s) as input, does some computation, and then returns a result or results.
- Built-in functions
 - Provided as part of Python
 - `print()`, `input()`, `type()`, `float()`, `int()`, `max()`, ...
- User-defined functions
 - Functions that we define ourselves and then use
 - A function can be defined using the **def** reserved word
 - A function is called (or invoked) by using the function name, parentheses, and arguments in an expression

Function Example



```
>>> big = max([4, 1, 9, 0])
>>> print(big)
9
>>> tiny = min([4, 1, 9, 0])
>>> print(tiny)
0
```

max()

- A function is some stored code that we use
- A function takes some input and produces an output

```
>>> big = max([4, 1, 9, 0])  
>>> print(big)  
9
```

[4, 1, 9, 0]
(a list)



```
def max(inp):  
    blah  
    blah  
    for x in inp:  
        blah  
        blah  
    return z
```



9
(an integer)

Building Our Own Functions

- We create a new function using the `def` keyword followed by optional parameters in parentheses
- We indent the body of the function
- This **defines** the function but **does not** execute the body of the function

```
def print_lyrics():  
    print('I bless the day I found you')  
    print('I want to stay around you')
```

Parameters

- A **parameter** is a variable which we use in the function **definition**.
- It is a "handle" that allows the code in the function to access the **arguments** for a particular function invocation.

```
>>> def greet(lang):  
...     if lang == 'kr':  
...         print('안녕하세요')  
...     elif lang == 'fr':  
...         print('Bonjour')  
...     elif lang == 'es':  
...         print('Hola')  
...     else:  
...         print('Hello')  
  
>>> greet('en')  
Hello  
>>> greet('es')  
Hola  
>>> greet('kr')  
안녕하세요  
>>>
```

Return Value

- A "fruitful" function is one that produces a **result** (or **return value**)
- The **return** statement ends the function execution and "sends back" the **result** of the function

```
>>> def greet(lang):  
...     if lang == 'kr':  
...         return '안녕하세요'  
...     elif lang == 'fr':  
...         return 'Bonjour'  
...     elif lang == 'es':  
...         return 'Hola'  
...     else:  
...         return 'Hello'  
  
>>> print(greet('en'), 'Jack')  
Hello Jack  
>>> print(greet('es'), 'Sally')  
Hola Sally  
>>> print(greet('kr'), '홍길동')  
안녕하세요 홍길동  
>>>
```

Multiple Parameters / Arguments

- We can define more than one **parameter** in the function definition
- We simply add more **arguments** when we call the function
- We match the number and order of arguments and parameters

```
def mymax(a, b):  
    if a > b:  
        return a  
    else:  
        return b
```

```
x = mymax(3, 5)  
print(x)  
5
```

Default and Keyword Arguments

- Default arguments
 - You can specify default values for arguments that aren't passed
- Keyword arguments
 - Callers can specify which argument in the function to receive a value by using the argument's name in the call

```
def student(name, id='00000', dept='CSE'):  
    print(name, id, dept)  
  
student('John')  
student('John', '00001')  
student(name='John')  
student(id='20191', dept='EE', name='Jack')
```

Arbitrary Arguments

- For functions that take any number of arguments
- Zero or more normal arguments may appear before the variable number of arguments,
- All the arbitrary arguments are collected and transferred using a tuple

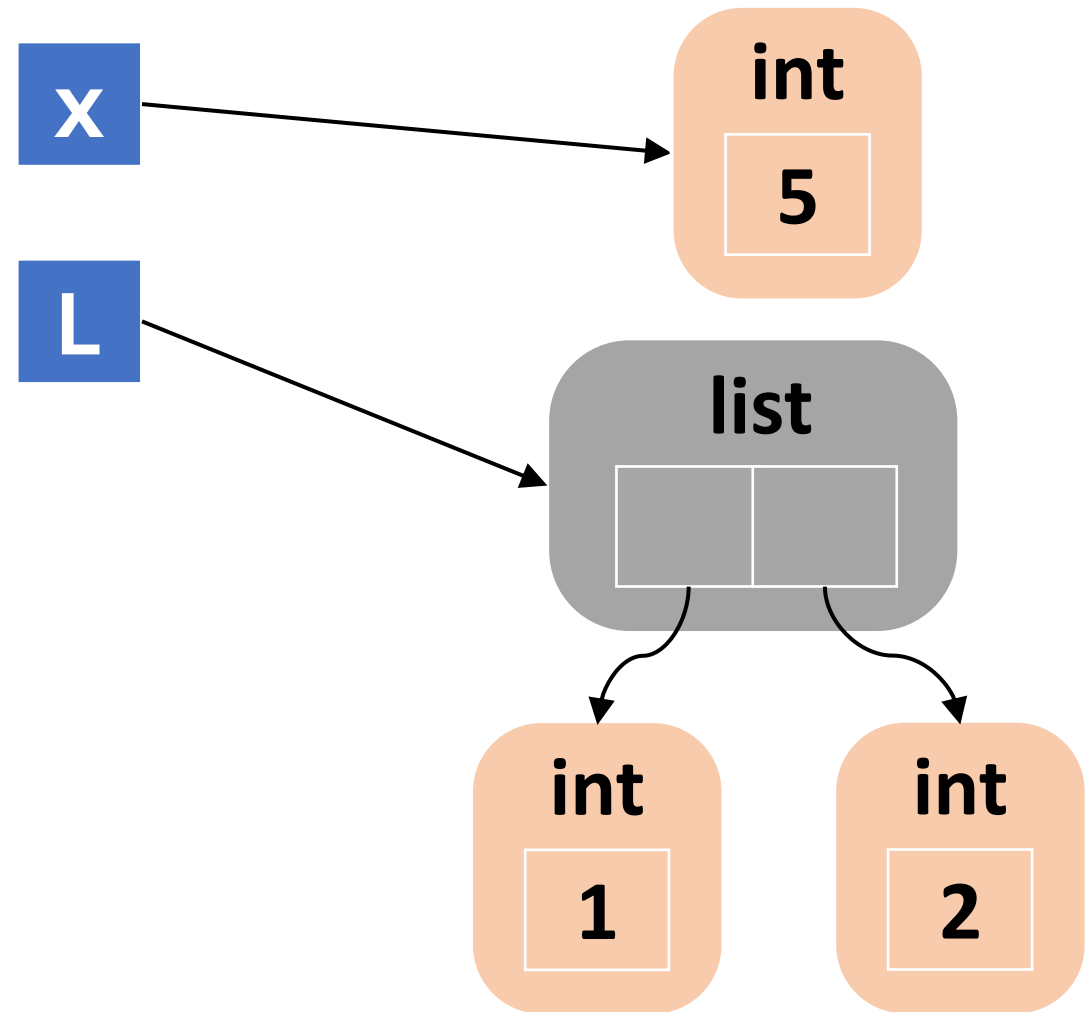
```
def food(name, *likes):  
    print(name, 'likes ', end='')  
    for d in likes:  
        print(d, end=' ')  
    print()  
  
food('John', 'spam', 'egg', 'bacon')
```


Passing Arguments

```
>>> def f(a, b):  
...     a = 9  
...     b[0] = 'spam'  
  
>>> x = 5  
>>> L = [1, 2]  
>>> f(x, L)  
>>> print(x)  
5  
>>> print(L)  
['spam', 2]
```

Passing Arguments

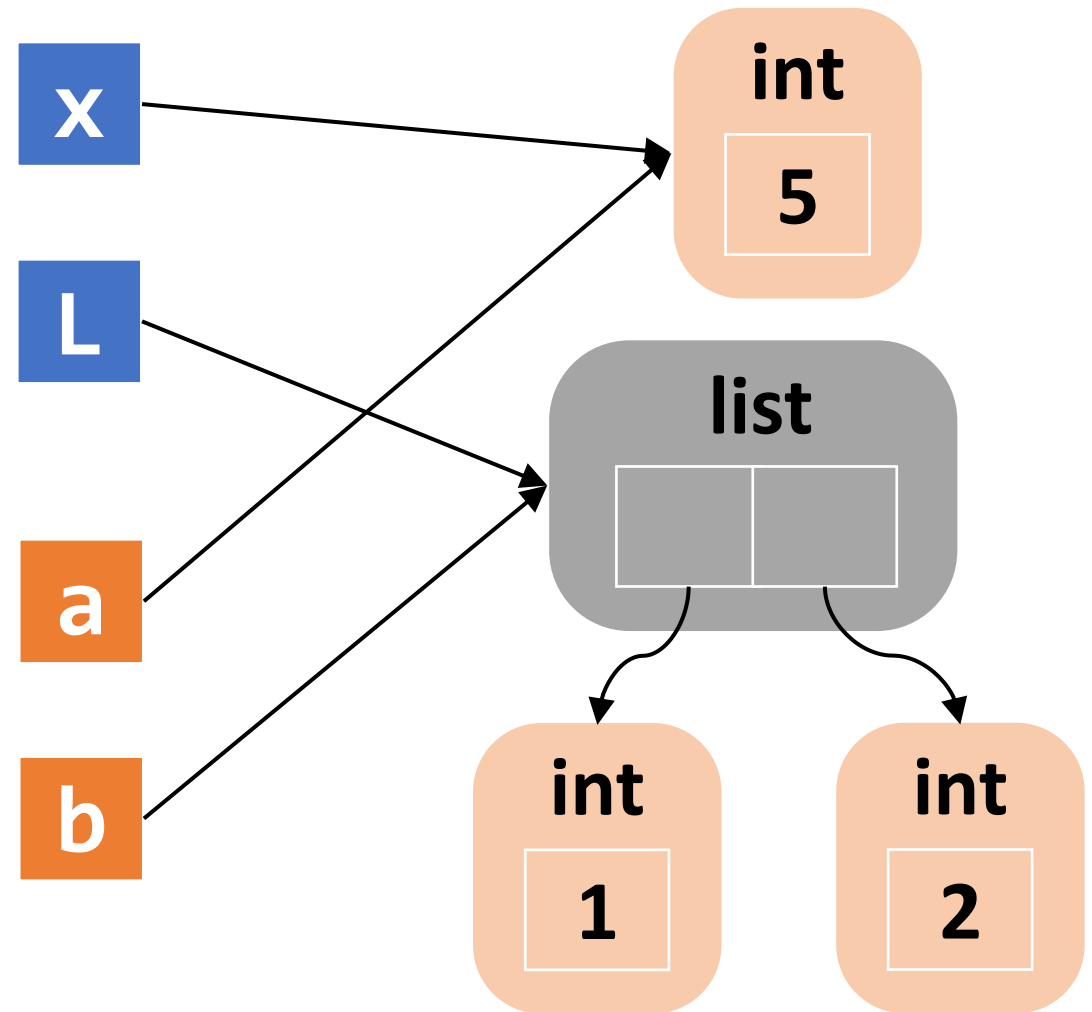
```
>>> def f(a, b):  
...     a = 9  
...     b[0] = 'spam'  
  
>>> x = 5  
>>> L = [1, 2]
```



Passing Arguments

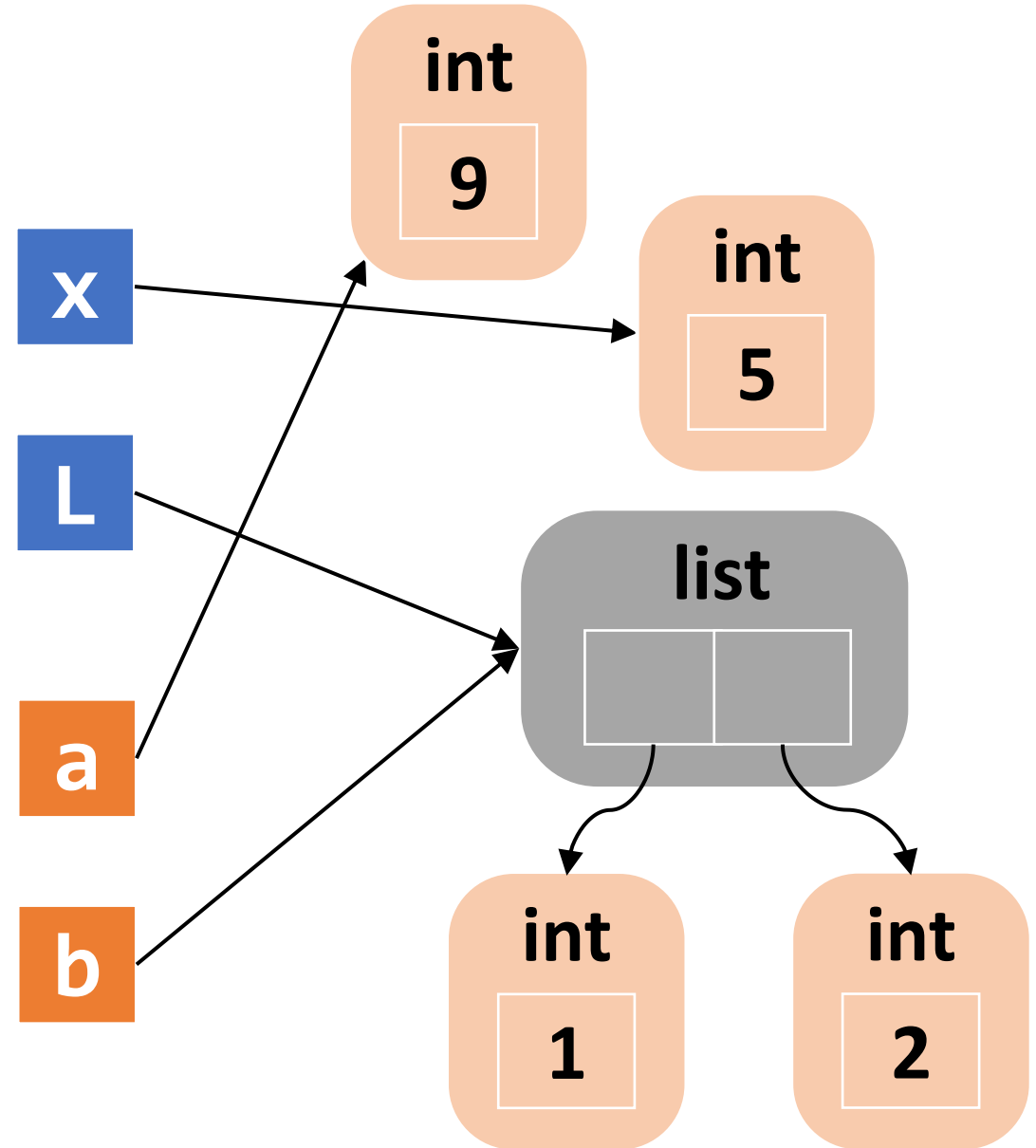
```
>>> def f(a, b):  
...     a = 9  
...     b[0] = 'spam'  
  
>>> x = 5  
>>> L = [1, 2]  
>>> f(x, L)
```

a = x **b = L**



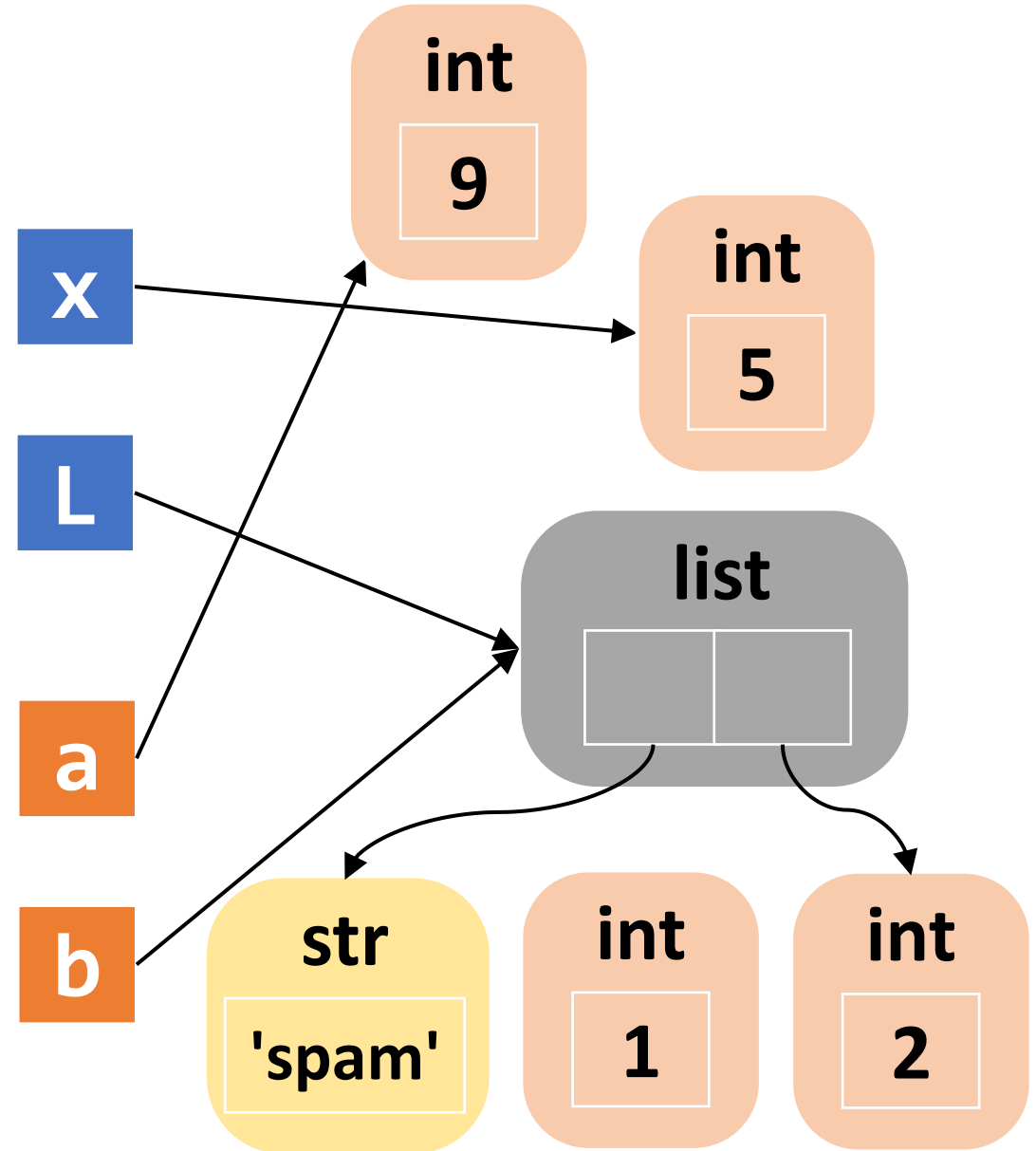
Passing Arguments

```
>>> def f(a, b):  
...     a = 9  
...     b[0] = 'spam'  
  
>>> x = 5  
>>> L = [1, 2]  
>>> f(x, L)
```



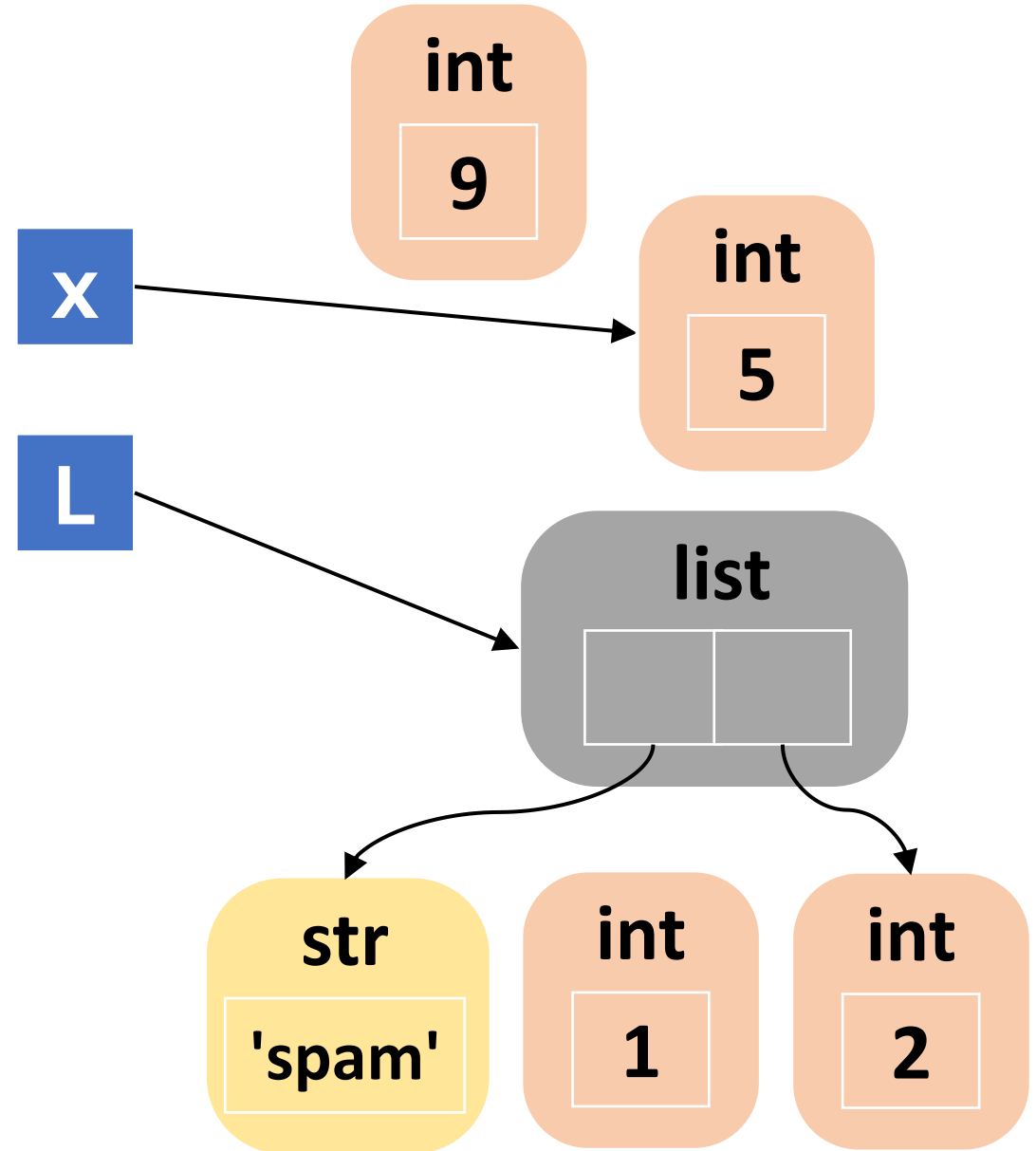
Passing Arguments

```
>>> def f(a, b):  
...     a = 9  
...     b[0] = 'spam'  
  
>>> x = 5  
>>> L = [1, 2]  
>>> f(x, L)
```



Passing Arguments

```
>>> def f(a, b):  
...     a = 9  
...     b[0] = 'spam'  
  
>>> x = 5  
>>> L = [1, 2]  
>>> f(x, L)  
>>> print(x)  
5  
>>> print(L)  
['spam', 2]
```



Recursive Function

- Functions that call themselves either directly or indirectly

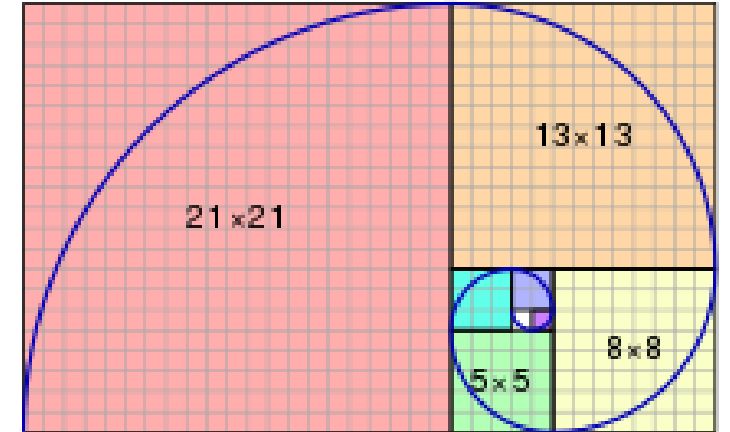
$$f(n) = \begin{cases} n \times f(n-1) & n > 1 \\ 1 & n \leq 1 \end{cases}$$

```
def f(n):  
    if n <= 1:  
        return 1  
    else:  
        return n * f(n-1)
```

Fibonacci Numbers

$$f(n) = f(n - 1) + f(n - 2) \quad n \geq 2$$

$$f(0) = 0, f(1) = 1$$



```
def fib(n):
```


Lambda Expressions

- A lambda expression is an anonymous function
- Allow us to define a function much more easily

```
>>> f = lambda x: x * x
>>> print(f(4))

>>> L = ['hello', 'World', 'hi', 'Bye']
>>> sorted(L)
>>> sorted(L, key=str.lower)
>>> sorted(L, key=len)
>>> sorted(L, key=lambda x: x[-1])
```

Why Functions?

- Make the program modular and readable
- Can be reused later
- You can even package them as a library (or a module)