

# Comprehensions

Thursday, February 16, 2017 1:31 AM

# comprehensions!

1. Comprehensions are a concise and expressive way to write a data transformation.
2. They are quick to write, easy to parse, and surprisingly powerful.

## GENERATING LISTS

```
squares = [i**2 for i in range(10)]  
  
squares  
[0, 1, 4, 9, 16, 25, 36, 49, 64, 81]  
  
squares3 = [i**2 for i in range(30) if i % 3 == 0]  
squares3  
[0, 9, 36, 81, 144, 225, 324, 441, 576, 729]
```

## GENERATING DICTIONARIES

```
squares3_dict = {i: i**2 for i in range(30) if i % 3 == 0}  
squares3_dict  
{0: 0,  
 3: 9,  
 6: 36,  
 9: 81,  
 12: 144,  
 15: 225,  
 18: 324,  
 21: 441,  
 24: 576,  
 27: 729}
```

## Transforming Dictionaries

```
capitals = {'United States': 'Washington, DC', 'France': 'Paris', 'Italy': 'Rome'}  
  
capitals_bycapital = {capitals[key]: key for key in capitals}
```

- Some times we just need to use list for one time, in this case we do not need to assign it to a variable.

```
sum([i**2 for i in range(10)])
```

285

```
sum(i**2 for i in range(10))
```

285

**NOTE - if we are passing generated value by comprehensions to a function then we can omit brackets or braces.**

# Python Idioms

Monday, February 20, 2017 8:33 PM

## Python Idioms

### Learn Idioms Now; Use Them Forever

1. They encapsulate expedient, "Pythonic" solutions.
2. Familiarity deters bugs and helps understanding.
3. There is still room for personal taste!
  - Python idioms are small expressions which can be used for some common problem.
  - They may feel little off the syntax but can be used very frequently.

## File Reading Idiom

```
wordlist = [transform(word) for word in open(filename,'r')  
           if condition(word)]
```

Example - this will get all lines from file(like readlines())

```
words=[x for x in open('words','r') ]
```

```
words[0:20]
```

```
['A\n',
 'a\n',
 'aa\n',
 'aal\n',
 'aalii\n',
 'aam\n',
 'Aani\n',
 'aardvark\n',
 'aardwolf\n',
 'Aaron\n',
 'Aaronic\n',
 'Aaronical\n',
 'Aaronite\n',
 'Aaronitic\n',
 'Aaru\n',
 'Ab\n',
 'aba\n',
 'Ababdeh\n',
 'Ababua\n',
 'abac\n']
```

Example 2- this will get all lines from file, do following operations to each line

- 1- Strip data
- 2- Make lowercase
- 3- Remove duplicates(using set())
- 4- Again make list ( because set do not give sorted and we have to apply sorting)
- 5- Sort the list

```
wc=sorted(list(set(x.strip().lower() for x in open('words','r'))))
```

```
wc[:10]
```

```
['a',
 'aa',
 'aal',
 'aalii',
 'aam',
 'aani',
 'aardvark',
 'aardwolf',
 'aaron',
 'aaronic']
```

# Printout

Saturday, February 4, 2017 1:15 AM

## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python »](#)
- [3.4.2 Documentation »](#)

# The Python Tutorial

Python is an easy to learn, powerful programming language. It has efficient high-level data structures and a simple but effective approach to object-oriented programming. Python's elegant syntax and dynamic typing, together with its interpreted nature, make it an ideal language for scripting and rapid application development in many areas on most platforms.

The Python interpreter and the extensive standard library are freely available in source or binary form for all major platforms from the Python Web site, <http://www.python.org/>, and may be freely distributed. The same site also contains distributions of and pointers to many free third party Python modules, programs and tools, and additional documentation.

The Python interpreter is easily extended with new functions and data types implemented in C or C++ (or other languages callable from C). Python is also suitable as an extension language for customizable applications.

This tutorial introduces the reader informally to the basic concepts and features of the Python language and system. It helps to have a Python interpreter handy for hands-on experience, but all examples are self-contained, so the tutorial can be read off-line as well.

For a description of standard objects and modules, see [The Python Standard Library](#). [The Python Language Reference](#) gives a more formal definition of the language. To write extensions in C or C++, read [Extending and Embedding the Python Interpreter](#) and [Python/C API Reference Manual](#). There are also several books covering Python in depth.

This tutorial does not attempt to be comprehensive and cover every single feature, or even every commonly used feature. Instead, it introduces many of Python's most noteworthy features, and will give you a good idea of the language's flavor and style. After reading it, you will be able to read and write Python modules and programs, and you will be ready to learn more about the various Python library modules described in [The Python Standard Library](#).

The [Glossary](#) is also worth going through.

- [1. Whetting Your Appetite](#)
- [2. Using the Python Interpreter](#)
  - [2.1. Invoking the Interpreter](#)
    - [2.1.1. Argument Passing](#)
    - [2.1.2. Interactive Mode](#)
  - [2.2. The Interpreter and Its Environment](#)
    - [2.2.1. Source Code Encoding](#)
- [3. An Informal Introduction to Python](#)
  - [3.1. Using Python as a Calculator](#)
    - [3.1.1. Numbers](#)
    - [3.1.2. Strings](#)
    - [3.1.3. Lists](#)
  - [3.2. First Steps Towards Programming](#)

# Page 2

Saturday, February 4, 2017 1:15 AM

- [4. More Control Flow Tools](#)
  - [4.1. if Statements](#)
  - [4.2. for Statements](#)
  - [4.3. The range\(\) Function](#)
  - [4.4. break and continue Statements, and else Clauses on Loops](#)
  - [4.5. pass Statements](#)
  - [4.6. Defining Functions](#)
  - [4.7. More on Defining Functions](#)
    - [4.7.1. Default Argument Values](#)
    - [4.7.2. Keyword Arguments](#)
    - [4.7.3. Arbitrary Argument Lists](#)
    - [4.7.4. Unpacking Argument Lists](#)
    - [4.7.5. Lambda Expressions](#)
    - [4.7.6. Documentation Strings](#)
    - [4.7.7. Function Annotations](#)
  - [4.8. Intermezzo: Coding Style](#)
- [5. Data Structures](#)
  - [5.1. More on Lists](#)
    - [5.1.1. Using Lists as Stacks](#)
    - [5.1.2. Using Lists as Queues](#)
    - [5.1.3. List Comprehensions](#)
    - [5.1.4. Nested List Comprehensions](#)
  - [5.2. The del statement](#)
  - [5.3. Tuples and Sequences](#)
  - [5.4. Sets](#)
  - [5.5. Dictionaries](#)
  - [5.6. Looping Techniques](#)
  - [5.7. More on Conditions](#)
  - [5.8. Comparing Sequences and Other Types](#)
- [6. Modules](#)
  - [6.1. More on Modules](#)
    - [6.1.1. Executing modules as scripts](#)
    - [6.1.2. The Module Search Path](#)
    - [6.1.3. “Compiled” Python files](#)
  - [6.2. Standard Modules](#)
  - [6.3. The dir\(\) Function](#)
  - [6.4. Packages](#)
    - [6.4.1. Importing \\* From a Package](#)
    - [6.4.2. Intra-package References](#)
    - [6.4.3. Packages in Multiple Directories](#)
- [7. Input and Output](#)
  - [7.1. Fancier Output Formatting](#)
    - [7.1.1. Old string formatting](#)
  - [7.2. Reading and Writing Files](#)
    - [7.2.1. Methods of File Objects](#)
    - [7.2.2. Saving structured data with json](#)
- [8. Errors and Exceptions](#)
  - [8.1. Syntax Errors](#)
  - [8.2. Exceptions](#)
  - [8.3. Handling Exceptions](#)
  - [8.4. Raising Exceptions](#)
  - [8.5. User-defined Exceptions](#)
  - [8.6. Defining Clean-up Actions](#)
  - [8.7. Predefined Clean-up Actions](#)
- [9. Classes](#)
  - [9.1. A Word About Names and Objects](#)

# Page 3

Saturday, February 4, 2017 1:15 AM

- o [9.2. Python Scopes and Namespaces](#)
  - [9.2.1. Scopes and Namespaces Example](#)
- o [9.3. A First Look at Classes](#)
  - [9.3.1. Class Definition Syntax](#)
  - [9.3.2. Class Objects](#)
  - [9.3.3. Instance Objects](#)
  - [9.3.4. Method Objects](#)
  - [9.3.5. Class and Instance Variables](#)
- o [9.4. Random Remarks](#)
- o [9.5. Inheritance](#)
  - [9.5.1. Multiple Inheritance](#)
- o [9.6. Private Variables](#)
- o [9.7. Odds and Ends](#)
- o [9.8. Exceptions Are Classes Too](#)
- o [9.9. Iterators](#)
- o [9.10. Generators](#)
- o [9.11. Generator Expressions](#)
- [10. Brief Tour of the Standard Library](#)
  - o [10.1. Operating System Interface](#)
  - o [10.2. File Wildcards](#)
  - o [10.3. Command Line Arguments](#)
  - o [10.4. Error Output Redirection and Program Termination](#)
  - o [10.5. String Pattern Matching](#)
  - o [10.6. Mathematics](#)
  - o [10.7. Internet Access](#)
  - o [10.8. Dates and Times](#)
  - o [10.9. Data Compression](#)
  - o [10.10. Performance Measurement](#)
  - o [10.11. Quality Control](#)
  - o [10.12. Batteries Included](#)
- [11. Brief Tour of the Standard Library – Part II](#)
  - o [11.1. Output Formatting](#)
  - o [11.2. Templating](#)
  - o [11.3. Working with Binary Data Record Layouts](#)
  - o [11.4. Multi-threading](#)
  - o [11.5. Logging](#)
  - o [11.6. Weak References](#)
  - o [11.7. Tools for Working with Lists](#)
  - o [11.8. Decimal Floating Point Arithmetic](#)
- [12. What Now?](#)
- [13. Interactive Input Editing and History Substitution](#)
  - o [13.1. Tab Completion and History Editing](#)
  - o [13.2. Alternatives to the Interactive Interpreter](#)
- [14. Floating Point Arithmetic: Issues and Limitations](#)
  - o [14.1. Representation Error](#)
- [15. Appendix](#)
  - o [15.1. Interactive Mode](#)
    - [15.1.1. Error Handling](#)
    - [15.1.2. Executable Python Scripts](#)
    - [15.1.3. The Interactive Startup File](#)
    - [15.1.4. The Customization Modules](#)

## Navigation

- [index](#)
- [modules](#) |

Page 4

Saturday, February 4, 2017 1:15 AM

- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »

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## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

# 1. Whetting Your Appetite

If you do much work on computers, eventually you find that there's some task you'd like to automate. For example, you may wish to perform a search-and-replace over a large number of text files, or rename and rearrange a bunch of photo files in a complicated way. Perhaps you'd like to write a small custom database, or a specialized GUI application, or a simple game.

If you're a professional software developer, you may have to work with several C/C++/Java libraries but find the usual write/compile/test/re-compile cycle is too slow. Perhaps you're writing a test suite for such a library and find writing the testing code a tedious task. Or maybe you've written a program that could use an extension language, and you don't want to design and implement a whole new language for your application.

Python is just the language for you.

You could write a Unix shell script or Windows batch files for some of these tasks, but shell scripts are best at moving around files and changing text data, not well-suited for GUI applications or games. You could write a C/C++/Java program, but it can take a lot of development time to get even a first-draft program. Python is simpler to use, available on Windows, Mac OS X, and Unix operating systems, and will help you get the job done more quickly.

Python is simple to use, but it is a real programming language, offering much more structure and support for large programs than shell scripts or batch files can offer. On the other hand, Python also offers much more error checking than C, and, being a *very-high-level language*, it has high-level data types built in, such as flexible arrays and dictionaries. Because of its more general data types Python is applicable to a much larger problem domain than Awk or even Perl, yet many things are at least as easy in Python as in those languages.

Python allows you to split your program into modules that can be reused in other Python programs. It comes with a large collection of standard modules that you can use as the basis of your programs — or as examples to start learning to program in Python. Some of these modules provide things like file I/O, system calls, sockets, and even interfaces to graphical user interface toolkits like Tk.

Python is an interpreted language, which can save you considerable time during program development because no compilation and linking is necessary. The interpreter can be used interactively, which makes it easy to experiment

# Page 5

Saturday, February 4, 2017 1:15 AM

with features of the language, to write throw-away programs, or to test functions during bottom-up program development. It is also a handy desk calculator.

Python enables programs to be written compactly and readably. Programs written in Python are typically much shorter than equivalent C, C++, or Java programs, for several reasons:

- the high-level data types allow you to express complex operations in a single statement;
- statement grouping is done by indentation instead of beginning and ending brackets;
- no variable or argument declarations are necessary.

Python is *extensible*: if you know how to program in C it is easy to add a new built-in function or module to the interpreter, either to perform critical operations at maximum speed, or to link Python programs to libraries that may only be available in binary form (such as a vendor-specific graphics library). Once you are really hooked, you can link the Python interpreter into an application written in C and use it as an extension or command language for that application.

By the way, the language is named after the BBC show “Monty Python’s Flying Circus” and has nothing to do with reptiles. Making references to Monty Python skits in documentation is not only allowed, it is encouraged!

Now that you are all excited about Python, you’ll want to examine it in some more detail. Since the best way to learn a language is to use it, the tutorial invites you to play with the Python interpreter as you read.

In the next chapter, the mechanics of using the interpreter are explained. This is rather mundane information, but essential for trying out the examples shown later.

The rest of the tutorial introduces various features of the Python language and system through examples, beginning with simple expressions, statements and data types, through functions and modules, and finally touching upon advanced concepts like exceptions and user-defined classes.

## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

# Page 6

Saturday, February 4, 2017 1:15 AM

## 2. Using the Python Interpreter

### 2.1. Invoking the Interpreter

The Python interpreter is usually installed as `/usr/local/bin/python3.4` on those machines where it is available; putting `/usr/local/bin` in your Unix shell's search path makes it possible to start it by typing the command:

```
python3.4
```

to the shell. [1] Since the choice of the directory where the interpreter lives is an installation option, other places are possible; check with your local Python guru or system administrator. (E.g., `/usr/local/python` is a popular alternative location.)

On Windows machines, the Python installation is usually placed in `C:\Python34`, though you can change this when you're running the installer. To add this directory to your path, you can type the following command into the command prompt in a DOS box:

```
set path=%path%;C:\python34
```

Typing an end-of-file character (`Control-D` on Unix, `Control-Z` on Windows) at the primary prompt causes the interpreter to exit with a zero exit status. If that doesn't work, you can exit the interpreter by typing the following command: `quit()`.

The interpreter's line-editing features include interactive editing, history substitution and code completion on systems that support readline. Perhaps the quickest check to see whether command line editing is supported is typing `Control-P` to the first Python prompt you get. If it beeps, you have command line editing; see Appendix [Interactive Input Editing and History Substitution](#) for an introduction to the keys. If nothing appears to happen, or if `^P` is echoed, command line editing isn't available; you'll only be able to use backspace to remove characters from the current line.

The interpreter operates somewhat like the Unix shell: when called with standard input connected to a tty device, it reads and executes commands interactively; when called with a file name argument or with a file as standard input, it reads and executes a *script* from that file.

A second way of starting the interpreter is `python -c command [arg] ...`, which executes the statement(s) in *command*, analogous to the shell's `-c` option. Since Python statements often contain spaces or other characters that are special to the shell, it is usually advised to quote *command* in its entirety with single quotes.

Some Python modules are also useful as scripts. These can be invoked using `python -m module [arg] ...`, which executes the source file for *module* as if you had spelled out its full name on the command line.

When a script file is used, it is sometimes useful to be able to run the script and enter interactive mode afterwards. This can be done by passing `-i` before the script.

#### 2.1.1. Argument Passing

When known to the interpreter, the script name and additional arguments thereafter are turned into a list of strings and assigned to the `argv` variable in the `sys` module. You can access this list by executing `import sys`. The length of the list is at least one; when no script and no arguments are given, `sys.argv[0]` is an empty string. When the script name is given as `'-'` (meaning standard input), `sys.argv[0]` is set to `'-'`. When `-c command` is used, `sys.argv[0]` is set to `'-c'`. When `-m module` is used, `sys.argv[0]` is set to the full name of the located module. Options found after `-c command` or `-m module` are not consumed by the Python interpreter's option processing but left in `sys.argv` for the command or module to handle.

# Page 7

Saturday, February 4, 2017 1:15 AM

### 2.1.2. Interactive Mode

When commands are read from a tty, the interpreter is said to be in *interactive mode*. In this mode it prompts for the next command with the *primary prompt*, usually three greater-than signs (>>>); for continuation lines it prompts with the *secondary prompt*, by default three dots (...). The interpreter prints a welcome message stating its version number and a copyright notice before printing the first prompt:

```
$ python3.4
Python 3.4 (default, Mar 16 2014, 09:25:04)
[GCC 4.8.2] on linux
Type "help", "copyright", "credits" or "license" for more information.
>>>
```

Continuation lines are needed when entering a multi-line construct. As an example, take a look at this [if](#) statement:

```
>>> the_world_is_flat = True
>>> if the_world_is_flat:
...     print("Be careful not to fall off!")
...
Be careful not to fall off!
```

For more on interactive mode, see [Interactive Mode](#).

## 2.2. The Interpreter and Its Environment

### 2.2.1. Source Code Encoding

By default, Python source files are treated as encoded in UTF-8. In that encoding, characters of most languages in the world can be used simultaneously in string literals, identifiers and comments — although the standard library only uses ASCII characters for identifiers, a convention that any portable code should follow. To display all these characters properly, your editor must recognize that the file is UTF-8, and it must use a font that supports all the characters in the file.

It is also possible to specify a different encoding for source files. In order to do this, put one more special comment line right after the #! line to define the source file encoding:

```
# -*- coding: encoding -*-
```

With that declaration, everything in the source file will be treated as having the encoding *encoding* instead of UTF-8. The list of possible encodings can be found in the Python Library Reference, in the section on [codecs](#).

For example, if your editor of choice does not support UTF-8 encoded files and insists on using some other encoding, say Windows-1252, you can write:

```
# -*- coding: cp-1252 -*-
```

and still use all characters in the Windows-1252 character set in the source files. The special encoding comment must be in the *first or second* line within the file.

Footnotes

[\[1\]](#) On Unix, the Python 3.x interpreter is by default not installed with the executable named `python`, so that it does not conflict with a simultaneously installed Python 2.x executable.

### Navigation

Page 8

Saturday, February 4, 2017 1:15 AM

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

# 3. An Informal Introduction to Python

In the following examples, input and output are distinguished by the presence or absence of prompts (`>>>` and `...`): to repeat the example, you must type everything after the prompt, when the prompt appears; lines that do not begin with a prompt are output from the interpreter. Note that a secondary prompt on a line by itself in an example means you must type a blank line; this is used to end a multi-line command.

Many of the examples in this manual, even those entered at the interactive prompt, include comments. Comments in Python start with the hash character, `#`, and extend to the end of the physical line. A comment may appear at the start of a line or following whitespace or code, but not within a string literal. A hash character within a string literal is just a hash character. Since comments are to clarify code and are not interpreted by Python, they may be omitted when typing in examples.

Some examples:

```
# this is the first comment
spam = 1 # and this is the second comment
          # ... and now a third!
text = "# This is not a comment because it's inside quotes."
```

## 3.1. Using Python as a Calculator

Let's try some simple Python commands. Start the interpreter and wait for the primary prompt, `>>>`. (It shouldn't take long.)

### 3.1.1. Numbers

The interpreter acts as a simple calculator: you can type an expression at it and it will write the value. Expression syntax is straightforward: the operators `+`, `-`, `*` and `/` work just like in most other languages (for example, Pascal or C); parentheses `( )` can be used for grouping. For example:

# Page 9

Saturday, February 4, 2017 1:15 AM

```
>>> 2 + 2
4
>>> 50 - 5*6
20
>>> (50 - 5*6) / 4
5.0
>>> 8 / 5 # division always returns a floating point number
1.6
```

The integer numbers (e.g. 2, 4, 20) have type [int](#), the ones with a fractional part (e.g. 5.0, 1.6) have type [float](#). We will see more about numeric types later in the tutorial.

Division (/) always returns a float. To do [floor division](#) and get an integer result (discarding any fractional result) you can use the // operator; to calculate the remainder you can use %:

```
>>> 17 / 3 # classic division returns a float
5.666666666666667
>>>
>>> 17 // 3 # floor division discards the fractional part
5
>>> 17 % 3 # the % operator returns the remainder of the division
2
>>> 5 * 3 + 2 # result * divisor + remainder
17
```

With Python, it is possible to use the \*\* operator to calculate powers [\[1\]](#):

```
>>> 5 ** 2 # 5 squared
25
>>> 2 ** 7 # 2 to the power of 7
128
```

The equal sign (=) is used to assign a value to a variable. Afterwards, no result is displayed before the next interactive prompt:

```
>>> width = 20
>>> height = 5 * 9
>>> width * height
900
```

If a variable is not “defined” (assigned a value), trying to use it will give you an error:

```
>>> n # try to access an undefined variable
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
NameError: name 'n' is not defined
```

There is full support for floating point; operators with mixed type operands convert the integer operand to floating point:

```
>>> 3 * 3.75 / 1.5
7.5
>>> 7.0 / 2
3.5
```

In interactive mode, the last printed expression is assigned to the variable `_`. This means that when you are using Python as a desk calculator, it is somewhat easier to continue calculations, for example:

```
>>> tax = 12.5 / 100
>>> price = 100.50
>>> price * tax
```

# Page 10

Saturday, February 4, 2017 1:15 AM

```

12.5625
>>> price + -
113.0625
>>> round(_, 2)
113.06

```

This variable should be treated as read-only by the user. Don't explicitly assign a value to it — you would create an independent local variable with the same name masking the built-in variable with its magic behavior.

In addition to [int](#) and [float](#), Python supports other types of numbers, such as [Decimal](#) and [Fraction](#). Python also has built-in support for [complex numbers](#), and uses the `j` or `J` suffix to indicate the imaginary part (e.g. `3+5j`).

### 3.1.2. Strings

Besides numbers, Python can also manipulate strings, which can be expressed in several ways. They can be enclosed in single quotes ('...') or double quotes ("...") with the same result [2]. \ can be used to escape quotes:

```

>>> 'spam eggs' # single quotes
'spam eggs'
>>> "doesn't" # use \' to escape the single quote...
"doesn't"
>>> "doesn't" # ...or use double quotes instead
"doesn't"
>>> '"Yes," he said.'
'"Yes," he said.
>>> '\"Yes,\" he said.'
'"Yes," he said.
>>> '"Isn\'t," she said.'
'"Isn\'t," she said.

```

In the interactive interpreter, the output string is enclosed in quotes and special characters are escaped with backslashes. While this might sometimes look different from the input (the enclosing quotes could change), the two strings are equivalent. The string is enclosed in double quotes if the string contains a single quote and no double quotes, otherwise it is enclosed in single quotes. The [print\(\)](#) function produces a more readable output, by omitting the enclosing quotes and by printing escaped and special characters:

```

>>> '"Isn\'t," she said.'
'"Isn\'t," she said.
>>> print('"Isn\'t," she said.')
"Isn't," she said.
>>> s = 'First line.\nSecond line.' # \n means newline
>>> s # without print(), \n is included in the output
'First line.\nSecond line.'
>>> print(s) # with print(), \n produces a new line
First line.
Second line.

```

If you don't want characters prefaced by \ to be interpreted as special characters, you can use *raw strings* by adding an `r` before the first quote:

```

>>> print('C:\some\name') # here \n means newline!
C:\some
ame
>>> print(r'C:\some\name') # note the r before the quote
C:\some\name

```

String literals can span multiple lines. One way is using triple-quotes: """...""" or ''''''. End of lines are automatically included in the string, but it's possible to prevent this by adding a \ at the end of the line. The following example:

```
print("""\
```

# Page 11

Saturday, February 4, 2017 1:15 AM

```
Usage: thingy [OPTIONS]
      -h                               Display this usage message
      -H hostname                      Hostname to connect to
      """)

produces the following output (note that the initial newline is not included):
```

```
Usage: thingy [OPTIONS]
      -h                               Display this usage message
      -H hostname                      Hostname to connect to
```

Strings can be concatenated (glued together) with the `+` operator, and repeated with `*`:

```
>>> # 3 times 'un', followed by 'ium'
>>> 3 * 'un' + 'ium'
'unununium'
```

Two or more *string literals* (i.e. the ones enclosed between quotes) next to each other are automatically concatenated.

```
>>> 'Py' 'thon'
'Python'
```

This only works with two literals though, not with variables or expressions:

```
>>> prefix = 'Py'
>>> prefix 'thon' # can't concatenate a variable and a string literal
...
SyntaxError: invalid syntax
>>> ('un' * 3) 'ium'
...
SyntaxError: invalid syntax
```

If you want to concatenate variables or a variable and a literal, use `+`:

```
>>> prefix + 'thon'
'Python'
```

This feature is particularly useful when you want to break long strings:

```
>>> text = ('Put several strings within parentheses '
           'to have them joined together.')
>>> text
'Put several strings within parentheses to have them joined together.'
```

Strings can be *indexed* (subscripted), with the first character having index 0. There is no separate character type; a character is simply a string of size one:

```
>>> word = 'Python'
>>> word[0] # character in position 0
'P'
>>> word[5] # character in position 5
'n'
```

Indices may also be negative numbers, to start counting from the right:

```
>>> word[-1] # last character
'n'
>>> word[-2] # second-last character
'o'
>>> word[-6]
```

# Page 12

Saturday, February 4, 2017 1:15 AM

```
'P'
```

Note that since `-0` is the same as `0`, negative indices start from `-1`.

In addition to indexing, *slicing* is also supported. While indexing is used to obtain individual characters, *slicing* allows you to obtain substring:

```
>>> word[0:2] # characters from position 0 (included) to 2 (excluded)
'Py'
>>> word[2:5] # characters from position 2 (included) to 5 (excluded)
'tho'
```

Note how the start is always included, and the end always excluded. This makes sure that `s[:i] + s[i:]` is always equal to `s`:

```
>>> word[:2] + word[2:]
'Python'
>>> word[:4] + word[4:]
'Python'
```

Slice indices have useful defaults; an omitted first index defaults to zero, an omitted second index defaults to the size of the string being sliced.

```
>>> word[:2] # character from the beginning to position 2 (excluded)
'Py'
>>> word[4:] # characters from position 4 (included) to the end
'on'
>>> word[-2:] # characters from the second-last (included) to the end
'on'
```

One way to remember how slices work is to think of the indices as pointing *between* characters, with the left edge of the first character numbered `0`. Then the right edge of the last character of a string of  $n$  characters has index  $n$ , for example:

+---+---+---+---+---+---+
P   y   t   h   o   n
+---+---+---+---+---+---+
0    1    2    3    4    5    6
-6   -5   -4   -3   -2   -1

The first row of numbers gives the position of the indices `0...6` in the string; the second row gives the corresponding negative indices. The slice from  $i$  to  $j$  consists of all characters between the edges labeled  $i$  and  $j$ , respectively.

For non-negative indices, the length of a slice is the difference of the indices, if both are within bounds. For example, the length of `word[1:3]` is `2`.

Attempting to use a index that is too large will result in an error:

```
>>> word[42] # the word only has 7 characters
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
IndexError: string index out of range
```

However, out of range slice indexes are handled gracefully when used for slicing:

```
>>> word[4:42]
'on'
>>> word[42:]
''
```

# Page 13

Saturday, February 4, 2017 1:15 AM

Python strings cannot be changed — they are [immutable](#). Therefore, assigning to an indexed position in the string results in an error:

```
>>> word[0] = 'J'  
...  
TypeError: 'str' object does not support item assignment  
>>> word[2:] = 'py'  
...  
TypeError: 'str' object does not support item assignment
```

If you need a different string, you should create a new one:

```
>>> 'J' + word[1:]  
'Jython'  
>>> word[:2] + 'py'  
'Pypy'
```

The built-in function [len\(\)](#) returns the length of a string:

```
>>> s = 'supercalifragilisticexpialidocious'  
>>> len(s)  
34
```

See also

#### [Text Sequence Type — str](#)

Strings are examples of *sequence types*, and support the common operations supported by such types.

#### [String Methods](#)

Strings support a large number of methods for basic transformations and searching.

#### [String Formatting](#)

Information about string formatting with [str.format\(\)](#) is described here.

#### [printf-style String Formatting](#)

The old formatting operations invoked when strings and Unicode strings are the left operand of the % operator are described in more detail here.

### 3.1.3. Lists

Python knows a number of *compound* data types, used to group together other values. The most versatile is the *list*, which can be written as a list of comma-separated values (items) between square brackets. Lists might contain items of different types, but usually the items all have the same type.

```
>>> squares = [1, 4, 9, 16, 25]  
>>> squares  
[1, 4, 9, 16, 25]
```

Like strings (and all other built-in [sequence](#) type), lists can be indexed and sliced:

```
>>> squares[0] # indexing returns the item  
1  
>>> squares[-1]  
25  
>>> squares[-3:] # slicing returns a new list  
[9, 16, 25]
```

All slice operations return a new list containing the requested elements. This means that the following slice returns a new (shallow) copy of the list:

```
>>> squares[:]  
[1, 4, 9, 16, 25]
```

# Page 14

Saturday, February 4, 2017 1:15 AM

Lists also supports operations like concatenation:

```
>>> squares + [36, 49, 64, 81, 100]
[1, 4, 9, 16, 25, 36, 49, 64, 81, 100]
```

Unlike strings, which are *immutable*, lists are a *mutable* type, i.e. it is possible to change their content:

```
>>> cubes = [1, 8, 27, 65, 125] # something's wrong here
>>> 4 ** 3 # the cube of 4 is 64, not 65!
64
>>> cubes[3] = 64 # replace the wrong value
>>> cubes
[1, 8, 27, 64, 125]
```

You can also add new items at the end of the list, by using the `append()` method (we will see more about methods later):

```
>>> cubes.append(216) # add the cube of 6
>>> cubes.append(7 ** 3) # and the cube of 7
>>> cubes
[1, 8, 27, 64, 125, 216, 343]
```

Assignment to slices is also possible, and this can even change the size of the list or clear it entirely:

```
>>> letters = ['a', 'b', 'c', 'd', 'e', 'f', 'g']
>>> letters
['a', 'b', 'c', 'd', 'e', 'f', 'g']
>>> # replace some values
>>> letters[2:5] = ['C', 'D', 'E']
>>> letters
['a', 'b', 'C', 'D', 'E', 'f', 'g']
>>> # now remove them
>>> letters[2:5] = []
>>> letters
['a', 'b', 'f', 'g']
>>> # clear the list by replacing all the elements with an empty list
>>> letters[:] = []
>>> letters
[]
```

The built-in function `len()` also applies to lists:

```
>>> letters = ['a', 'b', 'c', 'd']
>>> len(letters)
4
```

It is possible to nest lists (create lists containing other lists), for example:

```
>>> a = ['a', 'b', 'c']
>>> n = [1, 2, 3]
>>> x = [a, n]
>>> x
[[['a', 'b', 'c'], [1, 2, 3]]]
>>> x[0]
['a', 'b', 'c']
>>> x[0][1]
'b'
```

## 3.2. First Steps Towards Programming

Of course, we can use Python for more complicated tasks than adding two and two together. For instance, we can

# Page 15

Saturday, February 4, 2017 1:15 AM

write an initial sub-sequence of the *Fibonacci* series as follows:

```
>>> # Fibonacci series:  
... # the sum of two elements defines the next  
... a, b = 0, 1  
>>> while b < 10:  
...     print(b)  
...     a, b = b, a+b  
...  
1  
1  
2  
3  
5  
8
```

This example introduces several new features.

- The first line contains a *multiple assignment*: the variables `a` and `b` simultaneously get the new values 0 and 1. On the last line this is used again, demonstrating that the expressions on the right-hand side are all evaluated first before any of the assignments take place. The right-hand side expressions are evaluated from the left to the right.
- The `while` loop executes as long as the condition (here: `b < 10`) remains true. In Python, like in C, any non-zero integer value is true; zero is false. The condition may also be a string or list value, in fact any sequence; anything with a non-zero length is true, empty sequences are false. The test used in the example is a simple comparison. The standard comparison operators are written the same as in C: `<` (less than), `>` (greater than), `==` (equal to), `<=` (less than or equal to), `>=` (greater than or equal to) and `!=` (not equal to).
- The *body* of the loop is *indented*: indentation is Python's way of grouping statements. At the interactive prompt, you have to type a tab or space(s) for each indented line. In practice you will prepare more complicated input for Python with a text editor; all decent text editors have an auto-indent facility. When a compound statement is entered interactively, it must be followed by a blank line to indicate completion (since the parser cannot guess when you have typed the last line). Note that each line within a basic block must be indented by the same amount.
- The `print()` function writes the value of the argument(s) it is given. It differs from just writing the expression you want to write (as we did earlier in the calculator examples) in the way it handles multiple arguments, floating point quantities, and strings. Strings are printed without quotes, and a space is inserted between items, so you can format things nicely, like this:

```
>>> i = 256*256  
>>> print('The value of i is', i)  
The value of i is 65536
```

The keyword argument `end` can be used to avoid the newline after the output, or end the output with a different string:

```
>>> a, b = 0, 1  
>>> while b < 1000:  
...     print(b, end=',')  
...     a, b = b, a+b  
...  
1,1,2,3,5,8,13,21,34,55,89,144,233,377,610,987,
```

## Footnotes

[1] Since `**` has higher precedence than `-`, `-3**2` will be interpreted as `-(3**2)` and thus result in `-9`. To avoid this and get `9`, you can use `(-3)**2`.

# Page 16

Saturday, February 4, 2017 1:15 AM

[2] Unlike other languages, special characters such as \n have the same meaning with both single ('...') and double ("...") quotes. The only difference between the two is that within single quotes you don't need to escape " (but you have to escape \') and vice versa.

## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

# 4. More Control Flow Tools

Besides the `while` statement just introduced, Python knows the usual control flow statements known from other languages, with some twists.

## 4.1. `if` Statements

Perhaps the most well-known statement type is the `if` statement. For example:

```
>>> x = int(input("Please enter an integer: "))
Please enter an integer: 42
>>> if x < 0:
...     x = 0
...     print('Negative changed to zero')
... elif x == 0:
...     print('Zero')
... elif x == 1:
...     print('Single')
... else:
...     print('More')
...
More
```

There can be zero or more `elif` parts, and the `else` part is optional. The keyword '`elif`' is short for 'else if', and is useful to avoid excessive indentation. An `if` ... `elif` ... `else` ... sequence is a substitute for the `switch` or `case`

# Page 17

Saturday, February 4, 2017 1:15 AM

statements found in other languages.

## 4.2. for Statements

The for statement in Python differs a bit from what you may be used to in C or Pascal. Rather than always iterating over an arithmetic progression of numbers (like in Pascal), or giving the user the ability to define both the iteration step and halting condition (as C), Python's for statement iterates over the items of any sequence (a list or a string), in the order that they appear in the sequence. For example (no pun intended):

```
>>> # Measure some strings:  
... words = ['cat', 'window', 'defenestrate']  
>>> for w in words:  
...     print(w, len(w))  
...  
cat 3  
window 6  
defenestrate 12
```

If you need to modify the sequence you are iterating over while inside the loop (for example to duplicate selected items), it is recommended that you first make a copy. Iterating over a sequence does not implicitly make a copy. The slice notation makes this especially convenient:

```
>>> for w in words[:]: # Loop over a slice copy of the entire list.  
...     if len(w) > 6:  
...         words.insert(0, w)  
...  
>>> words  
['defenestrate', 'cat', 'window', 'defenestrate']
```

## 4.3. The range() Function

If you do need to iterate over a sequence of numbers, the built-in function range() comes in handy. It generates arithmetic progressions:

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

The given end point is never part of the generated sequence; `range(10)` generates 10 values, the legal indices for items of a sequence of length 10. It is possible to let the range start at another number, or to specify a different increment (even negative; sometimes this is called the ‘step’):

```
range(5, 10)  
5 through 9  
  
range(0, 10, 3)  
0, 3, 6, 9  
  
range(-10, -100, -30)  
-10, -40, -70
```

To iterate over the indices of a sequence, you can combine range() and len() as follows:

```
>>> a = ['Mary', 'had', 'a', 'little', 'lamb']  
>>> for i in range(len(a)):
```

# Page 18

Saturday, February 4, 2017 1:15 AM

```
...     print(i, a[i])
...
0 Mary
1 had
2 a
3 little
4 lamb
```

In most such cases, however, it is convenient to use the [enumerate\(\)](#) function, see [Looping Techniques](#).

A strange thing happens if you just print a range:

```
>>> print(range(10))
range(0, 10)
```

In many ways the object returned by [range\(\)](#) behaves as if it is a list, but in fact it isn't. It is an object which returns the successive items of the desired sequence when you iterate over it, but it doesn't really make the list, thus saving space.

We say such an object is *iterable*, that is, suitable as a target for functions and constructs that expect something from which they can obtain successive items until the supply is exhausted. We have seen that the [for](#) statement is such an *iterator*. The function [list\(\)](#) is another; it creates lists from iterables:

```
>>> list(range(5))
[0, 1, 2, 3, 4]
```

Later we will see more functions that return iterables and take iterables as argument.

## 4.4. [break](#) and [continue](#) Statements, and [else](#) Clauses on Loops

The [break](#) statement, like in C, breaks out of the smallest enclosing [for](#) or [while](#) loop.

Loop statements may have an [else](#) clause; it is executed when the loop terminates through exhaustion of the list (with [for](#)) or when the condition becomes false (with [while](#)), but not when the loop is terminated by a [break](#) statement. This is exemplified by the following loop, which searches for prime numbers:

```
>>> for n in range(2, 10):
...     for x in range(2, n):
...         if n % x == 0:
...             print(n, 'equals', x, '*', n//x)
...             break
...     else:
...         # loop fell through without finding a factor
...         print(n, 'is a prime number')
...
2 is a prime number
3 is a prime number
4 equals 2 * 2
5 is a prime number
6 equals 2 * 3
7 is a prime number
8 equals 2 * 4
9 equals 3 * 3
```

(Yes, this is the correct code. Look closely: the [else](#) clause belongs to the [for](#) loop, **not** the [if](#) statement.)

When used with a loop, the [else](#) clause has more in common with the [else](#) clause of a [try](#) statement than it does that of [if](#) statements: a [try](#) statement's [else](#) clause runs when no exception occurs, and a loop's [else](#) clause runs when no [break](#) occurs. For more on the [try](#) statement and exceptions, see [Handling Exceptions](#).

# Page 19

Saturday, February 4, 2017 1:15 AM

The `continue` statement, also borrowed from C, continues with the next iteration of the loop:

```
>>> for num in range(2, 10):
...     if num % 2 == 0:
...         print("Found an even number", num)
...     continue
...     print("Found a number", num)
Found an even number 2
Found a number 3
Found an even number 4
Found a number 5
Found an even number 6
Found a number 7
Found an even number 8
Found a number 9
```

## 4.5. `pass` Statements

The `pass` statement does nothing. It can be used when a statement is required syntactically but the program requires no action. For example:

```
>>> while True:
...     pass  # Busy-wait for keyboard interrupt (Ctrl+C)
... 
```

This is commonly used for creating minimal classes:

```
>>> class MyEmptyClass:
...     pass
... 
```

Another place `pass` can be used is as a place-holder for a function or conditional body when you are working on new code, allowing you to keep thinking at a more abstract level. The `pass` is silently ignored:

```
>>> def initlog(*args):
...     pass  # Remember to implement this!
... 
```

## 4.6. Defining Functions

We can create a function that writes the Fibonacci series to an arbitrary boundary:

```
>>> def fib(n):      # write Fibonacci series up to n
...     """Print a Fibonacci series up to n."""
...     a, b = 0, 1
...     while a < n:
...         print(a, end=' ')
...         a, b = b, a+b
...     print()
...
>>> # Now call the function we just defined:
... fib(2000)
0 1 1 2 3 5 8 13 21 34 55 89 144 233 377 610 987 1597
```

The keyword `def` introduces a function *definition*. It must be followed by the function name and the parenthesized list of formal parameters. The statements that form the body of the function start at the next line, and must be indented.

The first statement of the function body can optionally be a string literal; this string literal is the function's documentation string, or *docstring*. (More about docstrings can be found in the section [Documentation Strings](#).)

# Page 20

Saturday, February 4, 2017 1:15 AM

There are tools which use docstrings to automatically produce online or printed documentation, or to let the user interactively browse through code; it's good practice to include docstrings in code that you write, so make a habit of it.

The *execution* of a function introduces a new symbol table used for the local variables of the function. More precisely, all variable assignments in a function store the value in the local symbol table; whereas variable references first look in the local symbol table, then in the local symbol tables of enclosing functions, then in the global symbol table, and finally in the table of built-in names. Thus, global variables cannot be directly assigned a value within a function (unless named in a [global](#) statement), although they may be referenced.

The actual parameters (arguments) to a function call are introduced in the local symbol table of the called function when it is called; thus, arguments are passed using *call by value* (where the *value* is always an object *reference*, not the value of the object). [\[1\]](#) When a function calls another function, a new local symbol table is created for that call.

A function definition introduces the function name in the current symbol table. The value of the function name has a type that is recognized by the interpreter as a user-defined function. This value can be assigned to another name which can then also be used as a function. This serves as a general renaming mechanism:

```
>>> fib
<function fib at 10042ed0>
>>> f = fib
>>> f(100)
0 1 1 2 3 5 8 13 21 34 55 89
```

Coming from other languages, you might object that `fib` is not a function but a procedure since it doesn't return a value. In fact, even functions without a [return](#) statement do return a value, albeit a rather boring one. This value is called `None` (it's a built-in name). Writing the value `None` is normally suppressed by the interpreter if it would be the only value written. You can see it if you really want to using [print\(\)](#):

```
>>> fib(0)
>>> print(fib(0))
None
```

It is simple to write a function that returns a list of the numbers of the Fibonacci series, instead of printing it:

```
>>> def fib2(n): # return Fibonacci series up to n
...     """Return a list containing the Fibonacci series up to n."""
...     result = []
...     a, b = 0, 1
...     while a < n:
...         result.append(a)      # see below
...         a, b = b, a+b
...     return result
...
>>> f100 = fib2(100)      # call it
>>> f100                  # write the result
[0, 1, 1, 2, 3, 5, 8, 13, 21, 34, 55, 89]
```

This example, as usual, demonstrates some new Python features:

- The [return](#) statement returns with a value from a function. [return](#) without an expression argument returns `None`. Falling off the end of a function also returns `None`.
- The statement `result.append(a)` calls a *method* of the list object `result`. A method is a function that 'belongs' to an object and is named `obj.methodname`, where `obj` is some object (this may be an expression), and `methodname` is the name of a method that is defined by the object's type. Different types define different methods. Methods of different types may have the same name without causing ambiguity. (It is possible to define your own object types and methods, using *classes*, see [Classes](#)) The method `append()` shown in the example is defined for list objects; it adds a new element at the end of the list. In this example it is equivalent to `result = result + [a]`, but more efficient.

Page 21

Saturday, February 4, 2017 1:15 AM

## 4.7. More on Defining Functions

It is also possible to define functions with a variable number of arguments. There are three forms, which can be combined.

### 4.7.1. Default Argument Values

The most useful form is to specify a default value for one or more arguments. This creates a function that can be called with fewer arguments than it is defined to allow. For example:

```
def ask_ok(prompt, retries=4, complaint='Yes or no, please!'):
    while True:
        ok = input(prompt)
        if ok in ('y', 'ye', 'yes'):
            return True
        if ok in ('n', 'no', 'nop', 'nope'):
            return False
        retries = retries - 1
        if retries < 0:
            raise OSError('uncooperative user')
    print(complaint)
```

This function can be called in several ways:

- giving only the mandatory argument: `ask_ok('Do you really want to quit?')`
- giving one of the optional arguments: `ask_ok('OK to overwrite the file?', 2)`
- or even giving all arguments: `ask_ok('OK to overwrite the file?', 2, 'Come on, only yes or no!')`

This example also introduces the `in` keyword. This tests whether or not a sequence contains a certain value.

The default values are evaluated at the point of function definition in the *defining* scope, so that

```
i = 5

def f(arg=i):
    print(arg)

i = 6
f()
```

will print 5.

**Important warning:** The default value is evaluated only once. This makes a difference when the default is a mutable object such as a list, dictionary, or instances of most classes. For example, the following function accumulates the arguments passed to it on subsequent calls:

```
def f(a, L=[]):
    L.append(a)
    return L

print(f(1))
print(f(2))
print(f(3))
```

This will print

```
[1]
[1, 2]
```

# Page 22

Saturday, February 4, 2017 1:15 AM

```
[1, 2, 3]
```

If you don't want the default to be shared between subsequent calls, you can write the function like this instead:

```
def f(a, L=None):
    if L is None:
        L = []
    L.append(a)
    return L
```

## 4.7.2. Keyword Arguments

Functions can also be called using [keyword arguments](#) of the form `kwarg=value`. For instance, the following function:

```
def parrot(voltage, state='a stiff', action='voom', type='Norwegian Blue'):
    print("-- This parrot wouldn't", action, end=' ')
    print("if you put", voltage, "volts through it.")
    print("-- Lovely plumage, the", type)
    print("-- It's", state, "!"")
```

accepts one required argument (`voltage`) and three optional arguments (`state`, `action`, and `type`). This function can be called in any of the following ways:

<code>parrot(1000)</code>	# 1 positional argument
<code>parrot(voltage=1000)</code>	# 1 keyword argument
<code>parrot(voltage=1000000, action='V00000M')</code>	# 2 keyword arguments
<code>parrot(action='V00000M', voltage=1000000)</code>	# 2 keyword arguments
<code>parrot('a million', 'bereft of life', 'jump')</code>	# 3 positional arguments
<code>parrot('a thousand', state='pushing up the daisies')</code>	# 1 positional, 1 keyword

but all the following calls would be invalid:

```
parrot()                      # required argument missing
parrot(voltage=5.0, 'dead')   # non-keyword argument after a keyword argument
parrot(110, voltage=220)      # duplicate value for the same argument
parrot(actor='John Cleese')   # unknown keyword argument
```

In a function call, keyword arguments must follow positional arguments. All the keyword arguments passed must match one of the arguments accepted by the function (e.g. `actor` is not a valid argument for the `parrot` function), and their order is not important. This also includes non-optional arguments (e.g. `parrot(voltage=1000)` is valid too). No argument may receive a value more than once. Here's an example that fails due to this restriction:

```
>>> def function(a):
...     pass
...
>>> function(0, a=0)
Traceback (most recent call last):
  File "<stdin>", line 1, in ?
TypeError: function() got multiple values for keyword argument 'a'
```

When a final formal parameter of the form `**name` is present, it receives a dictionary (see [Mapping Types — dict](#)) containing all keyword arguments except for those corresponding to a formal parameter. This may be combined with a formal parameter of the form `*name` (described in the next subsection) which receives a tuple containing the positional arguments beyond the formal parameter list. (`*name` must occur before `**name`.) For example, if we define a function like this:

```
def cheeseshop(kind, *arguments, **keywords):
    print("-- Do you have any", kind, "?")
    print("-- I'm sorry, we're all out of", kind)
```

# Page 23

Saturday, February 4, 2017 1:15 AM

```

for arg in arguments:
    print(arg)
print("-" * 40)
keys = sorted(keywords.keys())
for kw in keys:
    print(kw, ":", keywords[kw])

```

It could be called like this:

```

cheeseshop("Limburger", "It's very runny, sir.",
           "It's really very, VERY runny, sir.",
           shopkeeper="Michael Palin",
           client="John Cleese",
           sketch="Cheese Shop Sketch")

```

and of course it would print:

```

-- Do you have any Limburger ?
-- I'm sorry, we're all out of Limburger
It's very runny, sir.
It's really very, VERY runny, sir.
-----
client : John Cleese
shopkeeper : Michael Palin
sketch : Cheese Shop Sketch

```

Note that the list of keyword argument names is created by sorting the result of the `keywords` dictionary's `keys()` method before printing its contents; if this is not done, the order in which the arguments are printed is undefined.

### 4.7.3. Arbitrary Argument Lists

Finally, the least frequently used option is to specify that a function can be called with an arbitrary number of arguments. These arguments will be wrapped up in a tuple (see [Tuples and Sequences](#)). Before the variable number of arguments, zero or more normal arguments may occur.

```
def write_multiple_items(file, separator, *args):
    file.write(separator.join(args))
```

Normally, these `variadic` arguments will be last in the list of formal parameters, because they scoop up all remaining input arguments that are passed to the function. Any formal parameters which occur after the `*args` parameter are ‘keyword-only’ arguments, meaning that they can only be used as keywords rather than positional arguments.

```

>>> def concat(*args, sep="/"):
...     return sep.join(args)
...
>>> concat("earth", "mars", "venus")
'earth/mars/venus'
>>> concat("earth", "mars", "venus", sep=".")
'earth.mars.venus'

```

### 4.7.4. Unpacking Argument Lists

The reverse situation occurs when the arguments are already in a list or tuple but need to be unpacked for a function call requiring separate positional arguments. For instance, the built-in `range()` function expects separate `start` and `stop` arguments. If they are not available separately, write the function call with the `*`-operator to unpack the arguments out of a list or tuple:

```
>>> list(range(3, 6))          # normal call with separate arguments
[3, 4, 5]
```

# Page 24

Saturday, February 4, 2017 1:15 AM

```
>>> args = [3, 6]
>>> list(range(*args))           # call with arguments unpacked from a list
[3, 4, 5]
```

In the same fashion, dictionaries can deliver keyword arguments with the `**`-operator:

```
>>> def parrot(voltage, state='a stiff', action='voom'):
...     print("-- This parrot wouldn't", action, end=' ')
...     print("if you put", voltage, "volts through it.", end=' ')
...     print("E's", state, "!")
...
>>> d = {"voltage": "four million", "state": "bleedin' demised", "action": "VOOM"}
>>> parrot(**d)
-- This parrot wouldn't VOOM if you put four million volts through it. E's bleedin' demised !
```

#### 4.7.5. Lambda Expressions

Small anonymous functions can be created with the `lambda` keyword. This function returns the sum of its two arguments: `lambda a, b: a+b`. Lambda functions can be used wherever function objects are required. They are syntactically restricted to a single expression. Semantically, they are just syntactic sugar for a normal function definition. Like nested function definitions, lambda functions can reference variables from the containing scope:

```
>>> def make_incremator(n):
...     return lambda x: x + n
...
>>> f = make_incremator(42)
>>> f(0)
42
>>> f(1)
43
```

The above example uses a lambda expression to return a function. Another use is to pass a small function as an argument:

```
>>> pairs = [(1, 'one'), (2, 'two'), (3, 'three'), (4, 'four')]
>>> pairs.sort(key=lambda pair: pair[1])
>>> pairs
[(4, 'four'), (1, 'one'), (3, 'three'), (2, 'two')]
```

#### 4.7.6. Documentation Strings

Here are some conventions about the content and formatting of documentation strings.

The first line should always be a short, concise summary of the object’s purpose. For brevity, it should not explicitly state the object’s name or type, since these are available by other means (except if the name happens to be a verb describing a function’s operation). This line should begin with a capital letter and end with a period.

If there are more lines in the documentation string, the second line should be blank, visually separating the summary from the rest of the description. The following lines should be one or more paragraphs describing the object’s calling conventions, its side effects, etc.

The Python parser does not strip indentation from multi-line string literals in Python, so tools that process documentation have to strip indentation if desired. This is done using the following convention. The first non-blank line *after* the first line of the string determines the amount of indentation for the entire documentation string. (We can’t use the first line since it is generally adjacent to the string’s opening quotes so its indentation is not apparent in the string literal.) Whitespace “equivalent” to this indentation is then stripped from the start of all lines of the string. Lines that are indented less should not occur, but if they occur all their leading whitespace should be stripped. Equivalence of whitespace should be tested after expansion of tabs (to 8 spaces, normally).

# Page 25

Saturday, February 4, 2017 1:15 AM

Here is an example of a multi-line docstring:

```
>>> def my_function():
...     """Do nothing, but document it.
...
...     No, really, it doesn't do anything.
...
...     pass
...
>>> print(my_function.__doc__)
Do nothing, but document it.

    No, really, it doesn't do anything.
```

#### 4.7.7. Function Annotations

[Function annotations](#) are completely optional, arbitrary metadata information about user-defined functions. Neither Python itself nor the standard library use function annotations in any way; this section just shows the syntax. Third-party projects are free to use function annotations for documentation, type checking, and other uses.

Annotations are stored in the `__annotations__` attribute of the function as a dictionary and have no effect on any other part of the function. Parameter annotations are defined by a colon after the parameter name, followed by an expression evaluating to the value of the annotation. Return annotations are defined by a literal `->`, followed by an expression, between the parameter list and the colon denoting the end of the `def` statement. The following example has a positional argument, a keyword argument, and the return value annotated with nonsense:

```
>>> def f(ham: 42, eggs: int = 'spam') -> "Nothing to see here":
...     print("Annotations:", f.__annotations__)
...     print("Arguments:", ham, eggs)
...
>>> f('wonderful')
Annotations: {'eggs': <class 'int'>, 'return': 'Nothing to see here', 'ham': 42}
Arguments: wonderful spam
```

## 4.8. Intermezzo: Coding Style

Now that you are about to write longer, more complex pieces of Python, it is a good time to talk about *coding style*. Most languages can be written (or more concise, *formatted*) in different styles; some are more readable than others. Making it easy for others to read your code is always a good idea, and adopting a nice coding style helps tremendously for that.

For Python, [PEP 8](#) has emerged as the style guide that most projects adhere to; it promotes a very readable and eye-pleasing coding style. Every Python developer should read it at some point; here are the most important points extracted for you:

- Use 4-space indentation, and no tabs.

4 spaces are a good compromise between small indentation (allows greater nesting depth) and large indentation (easier to read). Tabs introduce confusion, and are best left out.

- Wrap lines so that they don't exceed 79 characters.

This helps users with small displays and makes it possible to have several code files side-by-side on larger displays.

- Use blank lines to separate functions and classes, and larger blocks of code inside functions.
- When possible, put comments on a line of their own.

# Page 26

Saturday, February 4, 2017 1:15 AM

- Use docstrings.
- Use spaces around operators and after commas, but not directly inside bracketing constructs: `a = f(1, 2) + g(3, 4)`.
- Name your classes and functions consistently; the convention is to use `CamelCase` for classes and `lower_case_with_underscores` for functions and methods. Always use `self` as the name for the first method argument (see [A First Look at Classes](#) for more on classes and methods).
- Don't use fancy encodings if your code is meant to be used in international environments. Python's default, UTF-8, or even plain ASCII work best in any case.
- Likewise, don't use non-ASCII characters in identifiers if there is only the slightest chance people speaking a different language will read or maintain the code.

#### Footnotes

[1] Actually, *call by object reference* would be a better description, since if a mutable object is passed, the caller will see any changes the callee makes to it (items inserted into a list).

## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

## 5. Data Structures

This chapter describes some things you've learned about already in more detail, and adds some new things as well.

### 5.1. More on Lists

The list data type has some more methods. Here are all of the methods of list objects:

Page 27

Saturday, February 4, 2017 1:15 AM

```
list.append(x)
```

Add an item to the end of the list. Equivalent to `a[len(a):] = [x]`.

```
list.extend(L)
```

Extend the list by appending all the items in the given list. Equivalent to `a[len(a):] = L`.

```
list.insert(i, x)
```

Insert an item at a given position. The first argument is the index of the element before which to insert, so `a.insert(0, x)` inserts at the front of the list, and `a.insert(len(a), x)` is equivalent to `a.append(x)`.

```
list.remove(x)
```

Remove the first item from the list whose value is `x`. It is an error if there is no such item.

```
list.pop([i])
```

Remove the item at the given position in the list, and return it. If no index is specified, `a.pop()` removes and returns the last item in the list. (The square brackets around the `i` in the method signature denote that the parameter is optional, not that you should type square brackets at that position. You will see this notation frequently in the Python Library Reference.)

```
list.clear()
```

Remove all items from the list. Equivalent to `del a[:]`.

```
list.index(x)
```

Return the index in the list of the first item whose value is `x`. It is an error if there is no such item.

```
list.count(x)
```

Return the number of times `x` appears in the list.

```
list.sort()
```

Sort the items of the list in place.

```
list.reverse()
```

Reverse the elements of the list in place.

```
list.copy()
```

Return a shallow copy of the list. Equivalent to `a[:]`.

An example that uses most of the list methods:

```
>>> a = [66.25, 333, 333, 1, 1234.5]
>>> print(a.count(333), a.count(66.25), a.count('x'))
2 1 0
>>> a.insert(2, -1)
>>> a.append(333)
```

# Page 28

Saturday, February 4, 2017 1:15 AM

```
>>> a
[66.25, 333, -1, 333, 1, 1234.5, 333]
>>> a.index(333)
1
>>> a.remove(333)
>>> a
[66.25, -1, 333, 1, 1234.5, 333]
>>> a.reverse()
>>> a
[333, 1234.5, 1, 333, -1, 66.25]
>>> a.sort()
>>> a
[-1, 1, 66.25, 333, 333, 1234.5]
>>> a.pop()
1234.5
>>> a
[-1, 1, 66.25, 333, 333]
```

You might have noticed that methods like `insert`, `remove` or `sort` that only modify the list have no return value printed – they return the default `None`. [1] This is a design principle for all mutable data structures in Python.

### 5.1.1. Using Lists as Stacks

The list methods make it very easy to use a list as a stack, where the last element added is the first element retrieved (“last-in, first-out”). To add an item to the top of the stack, use `append()`. To retrieve an item from the top of the stack, use `pop()` without an explicit index. For example:

```
>>> stack = [3, 4, 5]
>>> stack.append(6)
>>> stack.append(7)
>>> stack
[3, 4, 5, 6, 7]
>>> stack.pop()
7
>>> stack
[3, 4, 5, 6]
>>> stack.pop()
6
>>> stack.pop()
5
>>> stack
[3, 4]
```

### 5.1.2. Using Lists as Queues

It is also possible to use a list as a queue, where the first element added is the first element retrieved (“first-in, first-out”); however, lists are not efficient for this purpose. While appends and pops from the end of list are fast, doing inserts or pops from the beginning of a list is slow (because all of the other elements have to be shifted by one).

To implement a queue, use `collections.deque` which was designed to have fast appends and pops from both ends. For example:

```
>>> from collections import deque
>>> queue = deque(["Eric", "John", "Michael"])
>>> queue.append("Terry")           # Terry arrives
>>> queue.append("Graham")         # Graham arrives
>>> queue.popleft()              # The first to arrive now leaves
'Eric'
>>> queue.popleft()              # The second to arrive now leaves
'John'
>>> queue                      # Remaining queue in order of arrival
deque(['Michael', 'Terry', 'Graham'])
```

Page 29

Saturday, February 4, 2017 1:16 AM

### 5.1.3. List Comprehensions

List comprehensions provide a concise way to create lists. Common applications are to make new lists where each element is the result of some operations applied to each member of another sequence or iterable, or to create a subsequence of those elements that satisfy a certain condition.

For example, assume we want to create a list of squares, like:

```
>>> squares = []
>>> for x in range(10):
...     squares.append(x**2)
...
>>> squares
[0, 1, 4, 9, 16, 25, 36, 49, 64, 81]
```

We can obtain the same result with:

```
squares = [x**2 for x in range(10)]
```

This is also equivalent to `squares = list(map(lambda x: x**2, range(10)))`, but it's more concise and readable.

A list comprehension consists of brackets containing an expression followed by a `for` clause, then zero or more `for` or `if` clauses. The result will be a new list resulting from evaluating the expression in the context of the `for` and `if` clauses which follow it. For example, this listcomp combines the elements of two lists if they are not equal:

```
>>> [(x, y) for x in [1,2,3] for y in [3,1,4] if x != y]
[(1, 3), (1, 4), (2, 3), (2, 1), (2, 4), (3, 1), (3, 4)]
```

and it's equivalent to:

```
>>> combs = []
>>> for x in [1,2,3]:
...     for y in [3,1,4]:
...         if x != y:
...             combs.append((x, y))
...
>>> combs
[(1, 3), (1, 4), (2, 3), (2, 1), (2, 4), (3, 1), (3, 4)]
```

Note how the order of the `for` and `if` statements is the same in both these snippets.

If the expression is a tuple (e.g. the `(x, y)` in the previous example), it must be parenthesized.

```
>>> vec = [-4, -2, 0, 2, 4]
>>> # create a new list with the values doubled
>>> [x*2 for x in vec]
[-8, -4, 0, 4, 8]
>>> # filter the list to exclude negative numbers
>>> [x for x in vec if x >= 0]
[0, 2, 4]
>>> # apply a function to all the elements
>>> [abs(x) for x in vec]
[4, 2, 0, 2, 4]
>>> # call a method on each element
>>> freshfruit = [' banana', ' loganberry ', 'passion fruit  ']
>>> [weapon.strip() for weapon in freshfruit]
['banana', 'loganberry', 'passion fruit']
>>> # create a list of 2-tuples like (number, square)
>>> [(x, x**2) for x in range(6)]
[(0, 0), (1, 1), (2, 4), (3, 9), (4, 16), (5, 25)]
```

Page 30

Saturday, February 4, 2017 1:16 AM

```
>>> # the tuple must be parenthesized, otherwise an error is raised
>>> [x, x**2 for x in range(6)]
  File "<stdin>", line 1, in ?
    [x, x**2 for x in range(6)]
               ^
SyntaxError: invalid syntax
>>> # flatten a list using a listcomp with two 'for'
>>> vec = [[1,2,3], [4,5,6], [7,8,9]]
>>> [num for elem in vec for num in elem]
[1, 2, 3, 4, 5, 6, 7, 8, 9]
```

List comprehensions can contain complex expressions and nested functions:

```
>>> from math import pi
>>> [str(round(pi, i)) for i in range(1, 6)]
['3.1', '3.14', '3.142', '3.1416', '3.14159']
```

#### 5.1.4. Nested List Comprehensions

The initial expression in a list comprehension can be any arbitrary expression, including another list comprehension.

Consider the following example of a 3x4 matrix implemented as a list of 3 lists of length 4:

```
>>> matrix = [
...     [1, 2, 3, 4],
...     [5, 6, 7, 8],
...     [9, 10, 11, 12],
... ]
```

The following list comprehension will transpose rows and columns:

```
>>> [[row[i] for row in matrix] for i in range(4)]
[[1, 5, 9], [2, 6, 10], [3, 7, 11], [4, 8, 12]]
```

As we saw in the previous section, the nested listcomp is evaluated in the context of the [for](#) that follows it, so this example is equivalent to:

```
>>> transposed = []
>>> for i in range(4):
...     transposed.append([row[i] for row in matrix])
...
>>> transposed
[[1, 5, 9], [2, 6, 10], [3, 7, 11], [4, 8, 12]]
```

which, in turn, is the same as:

```
>>> transposed = []
>>> for i in range(4):
...     # the following 3 lines implement the nested listcomp
...     transposed_row = []
...     for row in matrix:
...         transposed_row.append(row[i])
...     transposed.append(transposed_row)
...
>>> transposed
[[1, 5, 9], [2, 6, 10], [3, 7, 11], [4, 8, 12]]
```

In the real world, you should prefer built-in functions to complex flow statements. The [zip\(\)](#) function would do a great job for this use case:

```
>>> list(zip(*matrix))
```

# Page 31

Saturday, February 4, 2017 1:16 AM

```
[1, 5, 9], [2, 6, 10], [3, 7, 11], [4, 8, 12]]
```

See [Unpacking Argument Lists](#) for details on the asterisk in this line.

## 5.2. The `del` statement

There is a way to remove an item from a list given its index instead of its value: the `del` statement. This differs from the `pop()` method which returns a value. The `del` statement can also be used to remove slices from a list or clear the entire list (which we did earlier by assignment of an empty list to the slice). For example:

```
>>> a = [-1, 1, 66.25, 333, 333, 1234.5]
>>> del a[0]
>>> a
[1, 66.25, 333, 333, 1234.5]
>>> del a[2:4]
>>> a
[1, 66.25, 1234.5]
>>> del a[:]
>>> a
[]
```

`del` can also be used to delete entire variables:

```
>>> del a
```

Referencing the name `a` hereafter is an error (at least until another value is assigned to it). We'll find other uses for `del` later.

## 5.3. Tuples and Sequences

We saw that lists and strings have many common properties, such as indexing and slicing operations. They are two examples of *sequence* data types (see [Sequence Types — list, tuple, range](#)). Since Python is an evolving language, other sequence data types may be added. There is also another standard sequence data type: the *tuple*.

A tuple consists of a number of values separated by commas, for instance:

```
>>> t = 12345, 54321, 'hello!'
>>> t[0]
12345
>>> t
(12345, 54321, 'hello!')
>>> # Tuples may be nested:
... u = t, (1, 2, 3, 4, 5)
>>> u
((12345, 54321, 'hello!'), (1, 2, 3, 4, 5))
>>> # Tuples are immutable:
... t[0] = 88888
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
TypeError: 'tuple' object does not support item assignment
>>> # but they can contain mutable objects:
... v = ([1, 2, 3], [3, 2, 1])
>>> v
([1, 2, 3], [3, 2, 1])
```

As you see, on output tuples are always enclosed in parentheses, so that nested tuples are interpreted correctly; they may be input with or without surrounding parentheses, although often parentheses are necessary anyway (if the tuple is part of a larger expression). It is not possible to assign to the individual items of a tuple, however it is possible to create tuples which contain mutable objects, such as lists.

Page 32

Saturday, February 4, 2017 1:16 AM

Though tuples may seem similar to lists, they are often used in different situations and for different purposes. Tuples are [immutable](#), and usually contain an heterogeneous sequence of elements that are accessed via unpacking (see later in this section) or indexing (or even by attribute in the case of [namedtuples](#)). Lists are [mutable](#), and their elements are usually homogeneous and are accessed by iterating over the list.

A special problem is the construction of tuples containing 0 or 1 items: the syntax has some extra quirks to accommodate these. Empty tuples are constructed by an empty pair of parentheses; a tuple with one item is constructed by following a value with a comma (it is not sufficient to enclose a single value in parentheses). Ugly, but effective. For example:

```
>>> empty = ()
>>> singleton = 'hello',      # <-- note trailing comma
>>> len(empty)
0
>>> len(singleton)
1
>>> singleton
('hello',)
```

The statement `t = 12345, 54321, 'hello!'` is an example of *tuple packing*: the values 12345, 54321 and 'hello!' are packed together in a tuple. The reverse operation is also possible:

```
>>> x, y, z = t
```

This is called, appropriately enough, *sequence unpacking* and works for any sequence on the right-hand side. Sequence unpacking requires that there are as many variables on the left side of the equals sign as there are elements in the sequence. Note that multiple assignment is really just a combination of tuple packing and sequence unpacking.

## 5.4. Sets

Python also includes a data type for *sets*. A set is an unordered collection with no duplicate elements. Basic uses include membership testing and eliminating duplicate entries. Set objects also support mathematical operations like union, intersection, difference, and symmetric difference.

Curly braces or the [set\(\)](#) function can be used to create sets. Note: to create an empty set you have to use `set()`, not `{}`; the latter creates an empty dictionary, a data structure that we discuss in the next section.

Here is a brief demonstration:

```
>>> basket = {'apple', 'orange', 'apple', 'pear', 'orange', 'banana'}
>>> print(basket)                      # show that duplicates have been removed
{'orange', 'banana', 'pear', 'apple'}
>>> 'orange' in basket                # fast membership testing
True
>>> 'crabgrass' in basket
False

>>> # Demonstrate set operations on unique letters from two words
...
>>> a = set('abracadabra')
>>> b = set('alacazam')
>>> a                                # unique letters in a
{'a', 'r', 'b', 'c', 'd'}
>>> a - b                            # letters in a but not in b
{'r', 'd', 'b'}
>>> a | b                            # letters in either a or b
{'a', 'c', 'r', 'd', 'b', 'm', 'z', 'l'}
>>> a & b                            # letters in both a and b
{'a', 'c'}
```

# Page 33

Saturday, February 4, 2017 1:16 AM

```
>>> a ^ b                                # letters in a or b but not both
{'r', 'd', 'b', 'm', 'z', 'l'}
```

Similarly to [list comprehensions](#), set comprehensions are also supported:

```
>>> a = {x for x in 'abracadabra' if x not in 'abc'}
>>> a
{'r', 'd'}
```

## 5.5. Dictionaries

Another useful data type built into Python is the *dictionary* (see [Mapping Types — dict](#)). Dictionaries are sometimes found in other languages as “associative memories” or “associative arrays”. Unlike sequences, which are indexed by a range of numbers, dictionaries are indexed by *keys*, which can be any immutable type; strings and numbers can always be keys. Tuples can be used as keys if they contain only strings, numbers, or tuples; if a tuple contains any mutable object either directly or indirectly, it cannot be used as a key. You can’t use lists as keys, since lists can be modified in place using index assignments, slice assignments, or methods like `append()` and `extend()`.

It is best to think of a dictionary as an unordered set of *key*:*value* pairs, with the requirement that the keys are unique (within one dictionary). A pair of braces creates an empty dictionary: `{}`. Placing a comma-separated list of *key*:*value* pairs within the braces adds initial *key*:*value* pairs to the dictionary; this is also the way dictionaries are written on output.

The main operations on a dictionary are storing a value with some key and extracting the value given the key. It is also possible to delete a *key*:*value* pair with `del`. If you store using a key that is already in use, the old value associated with that key is forgotten. It is an error to extract a value using a non-existent key.

Performing `list(d.keys())` on a dictionary returns a list of all the keys used in the dictionary, in arbitrary order (if you want it sorted, just use `sorted(d.keys())` instead). [\[2\]](#) To check whether a single key is in the dictionary, use the `in` keyword.

Here is a small example using a dictionary:

```
>>> tel = {'jack': 4098, 'sape': 4139}
>>> tel['guido'] = 4127
>>> tel
{'sape': 4139, 'guido': 4127, 'jack': 4098}
>>> tel['jack']
4098
>>> del tel['sape']
>>> tel['irv'] = 4127
>>> tel
{'guido': 4127, 'irv': 4127, 'jack': 4098}
>>> list(tel.keys())
['irv', 'guido', 'jack']
>>> sorted(tel.keys())
['guido', 'irv', 'jack']
>>> 'guido' in tel
True
>>> 'jack' not in tel
False
```

The [dict\(\)](#) constructor builds dictionaries directly from sequences of key-value pairs:

```
>>> dict([('sape', 4139), ('guido', 4127), ('jack', 4098)])
{'sape': 4139, 'jack': 4098, 'guido': 4127}
```

In addition, dict comprehensions can be used to create dictionaries from arbitrary key and value expressions:

# Page 34

Saturday, February 4, 2017 1:16 AM

```
>>> {x: x**2 for x in (2, 4, 6)}
{2: 4, 4: 16, 6: 36}
```

When the keys are simple strings, it is sometimes easier to specify pairs using keyword arguments:

```
>>> dict(sape=4139, guido=4127, jack=4098)
{'sape': 4139, 'jack': 4098, 'guido': 4127}
```

## 5.6. Looping Techniques

When looping through dictionaries, the key and corresponding value can be retrieved at the same time using the `items()` method.

```
>>> knights = {'gallahad': 'the pure', 'robin': 'the brave'}
>>> for k, v in knights.items():
...     print(k, v)
...
gallahad the pure
robin the brave
```

When looping through a sequence, the position index and corresponding value can be retrieved at the same time using the `enumerate()` function.

```
>>> for i, v in enumerate(['tic', 'tac', 'toe']):
...     print(i, v)
...
0 tic
1 tac
2 toe
```

To loop over two or more sequences at the same time, the entries can be paired with the `zip()` function.

```
>>> questions = ['name', 'quest', 'favorite color']
>>> answers = ['lancelot', 'the holy grail', 'blue']
>>> for q, a in zip(questions, answers):
...     print('What is your {}? It is {}'.format(q, a))
...
What is your name? It is lancelot.
What is your quest? It is the holy grail.
What is your favorite color? It is blue.
```

To loop over a sequence in reverse, first specify the sequence in a forward direction and then call the `reversed()` function.

```
>>> for i in reversed(range(1, 10, 2)):
...     print(i)
...
9
7
5
3
1
```

To loop over a sequence in sorted order, use the `sorted()` function which returns a new sorted list while leaving the source unaltered.

```
>>> basket = ['apple', 'orange', 'apple', 'pear', 'orange', 'banana']
>>> for f in sorted(set(basket)):
...     print(f)
...
apple
```

# Page 35

Saturday, February 4, 2017 1:16 AM

```
banana
orange
pear
```

To change a sequence you are iterating over while inside the loop (for example to duplicate certain items), it is recommended that you first make a copy. Looping over a sequence does not implicitly make a copy. The slice notation makes this especially convenient:

```
>>> words = ['cat', 'window', 'defenestrat']
>>> for w in words[:]: # Loop over a slice copy of the entire list.
...     if len(w) > 6:
...         words.insert(0, w)
...
>>> words
['defenestrat', 'cat', 'window', 'defenestrat']
```

## 5.7. More on Conditions

The conditions used in `while` and `if` statements can contain any operators, not just comparisons.

The comparison operators `in` and `not in` check whether a value occurs (does not occur) in a sequence. The operators `is` and `is not` compare whether two objects are really the same object; this only matters for mutable objects like lists. All comparison operators have the same priority, which is lower than that of all numerical operators.

Comparisons can be chained. For example, `a < b == c` tests whether `a` is less than `b` and moreover `b` equals `c`.

Comparisons may be combined using the Boolean operators `and` and `or`, and the outcome of a comparison (or of any other Boolean expression) may be negated with `not`. These have lower priorities than comparison operators; between them, `not` has the highest priority and `or` the lowest, so that `A and not B or C` is equivalent to `(A and (not B)) or C`. As always, parentheses can be used to express the desired composition.

The Boolean operators `and` and `or` are so-called *short-circuit* operators: their arguments are evaluated from left to right, and evaluation stops as soon as the outcome is determined. For example, if `A` and `C` are true but `B` is false, `A and B and C` does not evaluate the expression `C`. When used as a general value and not as a Boolean, the return value of a short-circuit operator is the last evaluated argument.

It is possible to assign the result of a comparison or other Boolean expression to a variable. For example,

```
>>> string1, string2, string3 = '', 'Trondheim', 'Hammer Dance'
>>> non_null = string1 or string2 or string3
>>> non_null
'Trondheim'
```

Note that in Python, unlike C, assignment cannot occur inside expressions. C programmers may grumble about this, but it avoids a common class of problems encountered in C programs: typing `=` in an expression when `==` was intended.

## 5.8. Comparing Sequences and Other Types

Sequence objects may be compared to other objects with the same sequence type. The comparison uses *lexicographical ordering*: first the first two items are compared, and if they differ this determines the outcome of the comparison; if they are equal, the next two items are compared, and so on, until either sequence is exhausted. If two items to be compared are themselves sequences of the same type, the lexicographical comparison is carried out recursively. If all items of two sequences compare equal, the sequences are considered equal. If one sequence is an initial sub-sequence of the other, the shorter sequence is the smaller (lesser) one. Lexicographical ordering for strings uses the Unicode codepoint number to order individual characters. Some examples of comparisons between

# Page 36

Saturday, February 4, 2017 1:16 AM

sequences of the same type:

```
(1, 2, 3)           < (1, 2, 4)
[1, 2, 3]          < [1, 2, 4]
'ABC' < 'C' < 'Pascal' < 'Python'
(1, 2, 3, 4)       < (1, 2, 4)
(1, 2)             < (1, 2, -1)
(1, 2, 3)          == (1.0, 2.0, 3.0)
(1, 2, ('aa', 'ab')) < (1, 2, ('abc', 'a'), 4)
```

Note that comparing objects of different types with `<` or `>` is legal provided that the objects have appropriate comparison methods. For example, mixed numeric types are compared according to their numeric value, so `0` equals `0.0`, etc. Otherwise, rather than providing an arbitrary ordering, the interpreter will raise a [TypeError](#) exception.

#### Footnotes

- [1] Other languages may return the mutated object, which allows method chaining, such as `d->insert("a")->remove("b")->sort();`.
- [2] Calling `d.keys()` will return a *dictionary view* object. It supports operations like membership test and iteration, but its contents are not independent of the original dictionary – it is only a *view*.

## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

## 6. Modules

If you quit from the Python interpreter and enter it again, the definitions you have made (functions and variables) are lost. Therefore, if you want to write a somewhat longer program, you are better off using a text editor to prepare the input for the interpreter and running it with that file as input instead. This is known as creating a *script*. As your program gets longer, you may want to split it into several files for easier maintenance. You may also want to use a handy function that you've written in several programs without copying its definition into each program.

Page 37

Saturday, February 4, 2017 1:16 AM

To support this, Python has a way to put definitions in a file and use them in a script or in an interactive instance of the interpreter. Such a file is called a *module*; definitions from a module can be *imported* into other modules or into the *main* module (the collection of variables that you have access to in a script executed at the top level and in calculator mode).

A module is a file containing Python definitions and statements. The file name is the module name with the suffix `.py` appended. Within a module, the module's name (as a string) is available as the value of the global variable `__name__`. For instance, use your favorite text editor to create a file called `fibo.py` in the current directory with the following contents:

```
# Fibonacci numbers module

def fib(n):      # write Fibonacci series up to n
    a, b = 0, 1
    while b < n:
        print(b, end=' ')
        a, b = b, a+b
    print()

def fib2(n): # return Fibonacci series up to n
    result = []
    a, b = 0, 1
    while b < n:
        result.append(b)
        a, b = b, a+b
    return result
```

Now enter the Python interpreter and import this module with the following command:

```
>>> import fibo
```

This does not enter the names of the functions defined in `fibo` directly in the current symbol table; it only enters the module name `fibo` there. Using the module name you can access the functions:

```
>>> fibo.fib(1000)
1 1 2 3 5 8 13 21 34 55 89 144 233 377 610 987
>>> fibo.fib(100)
[1, 1, 2, 3, 5, 8, 13, 21, 34, 55, 89]
>>> fibo.__name__
'fibo'
```

If you intend to use a function often you can assign it to a local name:

```
>>> fib = fibo.fib
>>> fib(500)
1 1 2 3 5 8 13 21 34 55 89 144 233 377
```

## 6.1. More on Modules

A module can contain executable statements as well as function definitions. These statements are intended to initialize the module. They are executed only the *first* time the module name is encountered in an import statement. [\[1\]](#) (They are also run if the file is executed as a script.)

Each module has its own private symbol table, which is used as the global symbol table by all functions defined in the module. Thus, the author of a module can use global variables in the module without worrying about accidental clashes with a user's global variables. On the other hand, if you know what you are doing you can touch a module's global variables with the same notation used to refer to its functions, `modname.itemname`.

Modules can import other modules. It is customary but not required to place all `import` statements at the beginning

# Page 38

Saturday, February 4, 2017 1:16 AM

of a module (or script, for that matter). The imported module names are placed in the importing module's global symbol table.

There is a variant of the `import` statement that imports names from a module directly into the importing module's symbol table. For example:

```
>>> from fibo import fib, fib2  
>>> fib(500)  
1 1 2 3 5 8 13 21 34 55 89 144 233 377
```

This does not introduce the module name from which the imports are taken in the local symbol table (so in the example, `fibo` is not defined).

There is even a variant to import all names that a module defines:

```
>>> from fibo import *  
>>> fib(500)  
1 1 2 3 5 8 13 21 34 55 89 144 233 377
```

This imports all names except those beginning with an underscore (`_`). In most cases Python programmers do not use this facility since it introduces an unknown set of names into the interpreter, possibly hiding some things you have already defined.

Note that in general the practice of importing `*` from a module or package is frowned upon, since it often causes poorly readable code. However, it is okay to use it to save typing in interactive sessions.

#### Note

For efficiency reasons, each module is only imported once per interpreter session. Therefore, if you change your modules, you must restart the interpreter – or, if it's just one module you want to test interactively, use `imp.reload` ([Q](#)), e.g. `import imp; imp.reload(modulename)`.

### 6.1.1. Executing modules as scripts

When you run a Python module with

```
python fibo.py <arguments>
```

the code in the module will be executed, just as if you imported it, but with the `__name__` set to "`__main__`". That means that by adding this code at the end of your module:

```
if __name__ == "__main__":  
    import sys  
    fib(int(sys.argv[1]))
```

you can make the file usable as a script as well as an importable module, because the code that parses the command line only runs if the module is executed as the "main" file:

```
$ python fibo.py 50  
1 1 2 3 5 8 13 21 34
```

If the module is imported, the code is not run:

```
>>> import fibo  
>>>
```

This is often used either to provide a convenient user interface to a module, or for testing purposes (running the

Page 39

Saturday, February 4, 2017 1:16 AM

module as a script executes a test suite).

### 6.1.2. The Module Search Path

When a module named `spam` is imported, the interpreter first searches for a built-in module with that name. If not found, it then searches for a file named `spam.py` in a list of directories given by the variable `sys.path`. `sys.path` is initialized from these locations:

- The directory containing the input script (or the current directory when no file is specified).
- `PYTHONPATH` (a list of directory names, with the same syntax as the shell variable `PATH`).
- The installation-dependent default.

Note

On file systems which support symlinks, the directory containing the input script is calculated after the symlink is followed. In other words the directory containing the symlink is **not** added to the module search path.

After initialization, Python programs can modify `sys.path`. The directory containing the script being run is placed at the beginning of the search path, ahead of the standard library path. This means that scripts in that directory will be loaded instead of modules of the same name in the library directory. This is an error unless the replacement is intended. See section [Standard Modules](#) for more information.

### 6.1.3. “Compiled” Python files

To speed up loading modules, Python caches the compiled version of each module in the `__pycache__` directory under the name `module.version.pyc`, where the version encodes the format of the compiled file; it generally contains the Python version number. For example, in CPython release 3.3 the compiled version of `spam.py` would be cached as `__pycache__/spam.cpython-33.pyc`. This naming convention allows compiled modules from different releases and different versions of Python to coexist.

Python checks the modification date of the source against the compiled version to see if it's out of date and needs to be recompiled. This is a completely automatic process. Also, the compiled modules are platform-independent, so the same library can be shared among systems with different architectures.

Python does not check the cache in two circumstances. First, it always recompiles and does not store the result for the module that's loaded directly from the command line. Second, it does not check the cache if there is no source module. To support a non-source (compiled only) distribution, the compiled module must be in the source directory, and there must not be a source module.

Some tips for experts:

- You can use the `-O` or `-OO` switches on the Python command to reduce the size of a compiled module. The `-O` switch removes assert statements, the `-OO` switch removes both assert statements and `__doc__` strings. Since some programs may rely on having these available, you should only use this option if you know what you're doing. “Optimized” modules have a `.pyo` rather than a `.pyc` suffix and are usually smaller. Future releases may change the effects of optimization.
- A program doesn't run any faster when it is read from a `.pyc` or `.pyo` file than when it is read from a `.py` file; the only thing that's faster about `.pyc` or `.pyo` files is the speed with which they are loaded.
- The module `compileall` can create `.pyc` files (or `.pyo` files when `-O` is used) for all modules in a directory.
- There is more detail on this process, including a flow chart of the decisions, in PEP 3147.

## 6.2. Standard Modules

Python comes with a library of standard modules, described in a separate document, the Python Library Reference (“Library Reference” hereafter). Some modules are built into the interpreter; these provide access to operations that

# Page 40

Saturday, February 4, 2017 1:16 AM

are not part of the core of the language but are nevertheless built in, either for efficiency or to provide access to operating system primitives such as system calls. The set of such modules is a configuration option which also depends on the underlying platform. For example, the [winreg](#) module is only provided on Windows systems. One particular module deserves some attention: [sys](#), which is built into every Python interpreter. The variables `sys.ps1` and `sys.ps2` define the strings used as primary and secondary prompts:

```
>>> import sys
>>> sys.ps1
'>>> '
>>> sys.ps2
'... '
>>> sys.ps1 = 'C> '
C> print('Yuck!')
Yuck!
C>
```

These two variables are only defined if the interpreter is in interactive mode.

The variable `sys.path` is a list of strings that determines the interpreter's search path for modules. It is initialized to a default path taken from the environment variable [PYTHONPATH](#), or from a built-in default if [PYTHONPATH](#) is not set. You can modify it using standard list operations:

```
>>> import sys
>>> sys.path.append('/ufs/guido/lib/python')
```

## 6.3. The [dir\(\)](#) Function

The built-in function [dir\(\)](#) is used to find out which names a module defines. It returns a sorted list of strings:

```
>>> import fibo, sys
>>> dir(fibo)
['__name__', 'fib', 'fib2']
>>> dir(sys)
['__displayhook__', '__doc__', '__excepthook__', '__loader__', '__name__',
 '__package__', '__stderr__', '__stdin__', '__stdout__',
 '__clear_type_cache__', '__current_frames__', '__debugmallocstats__', '__getframe__',
 '__home__', '__mercurial__', '__xoptions__', 'abiflags', 'api_version', 'argv',
 'base_exec_prefix', 'base_prefix', 'builtins_module_names', 'byteorder',
 'call_tracing', 'callstats', 'copyright', 'displayhook',
 'dont_write bytecode', 'exc_info', 'excepthook', 'exec_prefix',
 'executable', 'exit', 'flags', 'float_info', 'float_repr_style',
 'getcheckinterval', 'getdefaultencoding', 'getdlopenflags',
 'getfilesystemencoding', 'getobjects', 'getprofile', 'getrecursionlimit',
 'getrefcount', 'getsizeof', 'getswitchinterval', 'getttotalrefcount',
 'gettrace', 'hash_info', 'hexversion', 'implementation', 'int_info',
 'intern', 'maxsize', 'maxunicode', 'meta_path', 'modules', 'path',
 'path_hooks', 'path_importer_cache', 'platform', 'prefix', 'ps1',
 'setcheckinterval', 'setdlopenflags', 'setprofile', 'setrecursionlimit',
 'setswitchinterval', 'settrace', 'stderr', 'stdin', 'stdout',
 'thread_info', 'version', 'version_info', 'warnoptions']
```

Without arguments, [dir\(\)](#) lists the names you have defined currently:

```
>>> a = [1, 2, 3, 4, 5]
>>> import fibo
>>> fib = fibo.fib
>>> dir()
['__builtins__', '__name__', 'a', 'fib', 'fibo', 'sys']
```

Note that it lists all types of names: variables, modules, functions, etc.

# Page 41

Saturday, February 4, 2017 1:16 AM

`dir()` does not list the names of built-in functions and variables. If you want a list of those, they are defined in the standard module `builtins`:

```
>>> import builtins
>>> dir(builtins)
['ArithError', 'AssertionError', 'AttributeError', 'BaseException',
 'BlockingIOError', 'BrokenPipeError', 'BufferError', 'BytesWarning',
 'ChildProcessError', 'ConnectionAbortedError', 'ConnectionError',
 'ConnectionRefusedError', 'ConnectionResetError', 'DeprecationWarning',
 'EOFError', 'Ellipsis', 'EnvironmentError', 'Exception', 'False',
 'FileExistsError', 'FileNotFoundException', 'FloatingPointError',
 'FutureWarning', 'GeneratorExit', 'IOError', 'ImportError',
 'ImportWarning', 'IndentationError', 'IndexError', 'InterruptedError',
 'IsADirectoryError', 'KeyError', 'KeyboardInterrupt', 'LookupError',
 'MemoryError', 'NameError', 'None', 'NotADirectoryError', 'NotImplemented',
 'NotImplementedError', 'OSError', 'OverflowError',
 'PendingDeprecationWarning', 'PermissionError', 'ProcessLookupError',
 'ReferenceError', 'ResourceWarning', 'RuntimeError', 'RuntimeWarning',
 'StopIteration', 'SyntaxError', 'SyntaxWarning', 'SystemError',
 'SystemExit', 'TabError', 'TimeoutError', 'True', 'TypeError',
 'UnboundLocalError', 'UnicodeDecodeError', 'UnicodeEncodeError',
 'UnicodeError', 'UnicodeTranslateError', 'UnicodeWarning', 'UserWarning',
 'ValueError', 'Warning', 'ZeroDivisionError', '__', '_build_class_',
 '_debug__', '_doc__', '_import__', '_name__', '_package__', 'abs',
 'all', 'any', 'ascii', 'bin', 'bool', 'bytearray', 'bytes', 'callable',
 'chr', 'classmethod', 'compile', 'complex', 'copyright', 'credits',
 'delattr', 'dict', 'dir', 'divmod', 'enumerate', 'eval', 'exec', 'exit',
 'filter', 'float', 'format', 'frozenset', 'getattr', 'globals', 'hasattr',
 'hash', 'help', 'hex', 'id', 'input', 'int', 'isinstance', 'issubclass',
 'iter', 'len', 'license', 'list', 'locals', 'map', 'max', 'memoryview',
 'min', 'next', 'object', 'oct', 'open', 'ord', 'pow', 'print', 'property',
 'quit', 'range', 'repr', 'reversed', 'round', 'set', 'setattr', 'slice',
 'sorted', 'staticmethod', 'str', 'sum', 'super', 'tuple', 'type', 'vars',
 'zip']
```

## 6.4. Packages

Packages are a way of structuring Python's module namespace by using "dotted module names". For example, the module name `A.B` designates a submodule named `B` in a package named `A`. Just like the use of modules saves the authors of different modules from having to worry about each other's global variable names, the use of dotted module names saves the authors of multi-module packages like NumPy or the Python Imaging Library from having to worry about each other's module names.

Suppose you want to design a collection of modules (a "package") for the uniform handling of sound files and sound data. There are many different sound file formats (usually recognized by their extension, for example: `.wav`, `.aiff`, `.au`), so you may need to create and maintain a growing collection of modules for the conversion between the various file formats. There are also many different operations you might want to perform on sound data (such as mixing, adding echo, applying an equalizer function, creating an artificial stereo effect), so in addition you will be writing a never-ending stream of modules to perform these operations. Here's a possible structure for your package (expressed in terms of a hierarchical filesystem):

<pre>sound/     __init__.py     formats/         __init__.py         wavread.py         wavwrite.py         aifhread.py         aiffwrite.py         auread.py         auwrite.py         ... </pre>	Top-level package Initialize the sound package Subpackage for file format conversions
--	---

Page 42

Saturday, February 4, 2017 1:16 AM

```
effects/           Subpackage for sound effects
    __init__.py
    echo.py
    surround.py
    reverse.py
    ...
filters/          Subpackage for filters
    __init__.py
    equalizer.py
    vocoder.py
    karaoke.py
    ...
```

When importing the package, Python searches through the directories on `sys.path` looking for the package subdirectory.

The `__init__.py` files are required to make Python treat the directories as containing packages; this is done to prevent directories with a common name, such as `string`, from unintentionally hiding valid modules that occur later on the module search path. In the simplest case, `__init__.py` can just be an empty file, but it can also execute initialization code for the package or set the `__all__` variable, described later.

Users of the package can import individual modules from the package, for example:

```
import sound.effects.echo
```

This loads the submodule `sound.effects.echo`. It must be referenced with its full name.

```
sound.effects.echo.echofilter(input, output, delay=0.7, atten=4)
```

An alternative way of importing the submodule is:

```
from sound.effects import echo
```

This also loads the submodule `echo`, and makes it available without its package prefix, so it can be used as follows:

```
echo.echofilter(input, output, delay=0.7, atten=4)
```

Yet another variation is to import the desired function or variable directly:

```
from sound.effects.echo import echofilter
```

Again, this loads the submodule `echo`, but this makes its function `echofilter()` directly available:

```
echofilter(input, output, delay=0.7, atten=4)
```

Note that when using `from package import item`, the item can be either a submodule (or subpackage) of the package, or some other name defined in the package, like a function, class or variable. The `import` statement first tests whether the item is defined in the package; if not, it assumes it is a module and attempts to load it. If it fails to find it, an [ImportError](#) exception is raised.

Contrarily, when using syntax like `import item.subitem.subsubitem`, each item except for the last must be a package; the last item can be a module or a package but can't be a class or function or variable defined in the previous item.

#### 6.4.1. Importing \* From a Package

Now what happens when the user writes `from sound.effects import *`? Ideally, one would hope that this somehow goes out to the filesystem, finds which submodules are present in the package, and imports them all. This

Page 43

Saturday, February 4, 2017 1:16 AM

could take a long time and importing sub-modules might have unwanted side-effects that should only happen when the sub-module is explicitly imported.

The only solution is for the package author to provide an explicit index of the package. The `import` statement uses the following convention: if a package's `__init__.py` code defines a list named `_all_`, it is taken to be the list of module names that should be imported when `from package import *` is encountered. It is up to the package author to keep this list up-to-date when a new version of the package is released. Package authors may also decide not to support it, if they don't see a use for importing `*` from their package. For example, the file `sound/effects/__init__.py` could contain the following code:

```
_all_ = ["echo", "surround", "reverse"]
```

This would mean that `from sound.effects import *` would import the three named submodules of the `sound` package.

If `_all_` is not defined, the statement `from sound.effects import *` does *not* import all submodules from the package `sound.effects` into the current namespace; it only ensures that the package `sound.effects` has been imported (possibly running any initialization code in `__init__.py`) and then imports whatever names are defined in the package. This includes any names defined (and submodules explicitly loaded) by `__init__.py`. It also includes any submodules of the package that were explicitly loaded by previous `import` statements. Consider this code:

```
import sound.effects.echo
import sound.effects.surround
from sound.effects import *
```

In this example, the `echo` and `surround` modules are imported in the current namespace because they are defined in the `sound.effects` package when the `from...import` statement is executed. (This also works when `_all_` is defined.)

Although certain modules are designed to export only names that follow certain patterns when you use `import *`, it is still considered bad practise in production code.

Remember, there is nothing wrong with using `from Package import specific_submodule!` In fact, this is the recommended notation unless the importing module needs to use submodules with the same name from different packages.

#### 6.4.2. Intra-package References

When packages are structured into subpackages (as with the `sound` package in the example), you can use absolute imports to refer to submodules of siblings packages. For example, if the module `sound.filters.vocoder` needs to use the `echo` module in the `sound.effects` package, it can use `from sound.effects import echo`.

You can also write relative imports, with the `from module import name` form of import statement. These imports use leading dots to indicate the current and parent packages involved in the relative import. From the `surround` module for example, you might use:

```
from . import echo
from .. import formats
from ..filters import equalizer
```

Note that relative imports are based on the name of the current module. Since the name of the main module is always "`__main__`", modules intended for use as the main module of a Python application must always use absolute imports.

#### 6.4.3. Packages in Multiple Directories

Page 44

Saturday, February 4, 2017 1:16 AM

Packages support one more special attribute, `__path__`. This is initialized to be a list containing the name of the directory holding the package's `__init__.py` before the code in that file is executed. This variable can be modified; doing so affects future searches for modules and subpackages contained in the package.

While this feature is not often needed, it can be used to extend the set of modules found in a package.

#### Footnotes

[1] In fact function definitions are also ‘statements’ that are ‘executed’; the execution of a module-level function definition enters the function name in the module’s global symbol table.

### Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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### Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

## 7. Input and Output

There are several ways to present the output of a program; data can be printed in a human-readable form, or written to a file for future use. This chapter will discuss some of the possibilities.

### 7.1. Fancier Output Formatting

So far we’ve encountered two ways of writing values: *expression statements* and the `print()` function. (A third way is using the `write()` method of file objects; the standard output file can be referenced as `sys.stdout`. See the Library Reference for more information on this.)

Often you’ll want more control over the formatting of your output than simply printing space-separated values. There are two ways to format your output; the first way is to do all the string handling yourself; using string slicing and concatenation operations you can create any layout you can imagine. The string type has some methods that perform useful operations for padding strings to a given column width; these will be discussed shortly. The second way is to use the `str.format()` method.

Page 45

Saturday, February 4, 2017 1:16 AM

The [string](#) module contains a [Template](#) class which offers yet another way to substitute values into strings.

One question remains, of course: how do you convert values to strings? Luckily, Python has ways to convert any value to a string: pass it to the [repr\(\)](#) or [str\(\)](#) functions.

The [str\(\)](#) function is meant to return representations of values which are fairly human-readable, while [repr\(\)](#) is meant to generate representations which can be read by the interpreter (or will force a [SyntaxError](#) if there is no equivalent syntax). For objects which don't have a particular representation for human consumption, [str\(\)](#) will return the same value as [repr\(\)](#). Many values, such as numbers or structures like lists and dictionaries, have the same representation using either function. Strings, in particular, have two distinct representations.

Some examples:

```
>>> s = 'Hello, world.'
>>> str(s)
'Hello, world.'
>>> repr(s)
"'Hello, world.'"
>>> str(1/7)
'0.14285714285714285'
>>> x = 10 * 3.25
>>> y = 200 * 200
>>> s = 'The value of x is ' + repr(x) + ', and y is ' + repr(y) + '...'
>>> print(s)
The value of x is 32.5, and y is 40000...
>>> # The repr() of a string adds string quotes and backslashes:
... hello = 'hello, world\n'
>>> hellos = repr(hello)
>>> print(hellos)
'hello, world\n'
>>> # The argument to repr() may be any Python object:
... repr((x, y, ('spam', 'eggs')))
"(32.5, 40000, ('spam', 'eggs'))"
```

Here are two ways to write a table of squares and cubes:

```
>>> for x in range(1, 11):
...     print(repr(x).rjust(2), repr(x*x).rjust(3), end=' ')
...     # Note use of 'end' on previous line
...     print(repr(x*x*x).rjust(4))
...
1   1    1
2   4    8
3   9   27
4  16   64
5  25  125
6  36  216
7  49  343
8  64  512
9  81  729
10 100 1000

>>> for x in range(1, 11):
...     print('{0:2d} {1:3d} {2:4d}'.format(x, x*x, x*x*x))
...
1   1    1
2   4    8
3   9   27
4  16   64
5  25  125
6  36  216
7  49  343
8  64  512
```

# Page 46

Saturday, February 4, 2017 1:16 AM

```
9 81 729
10 100 1000
```

(Note that in the first example, one space between each column was added by the way `print()` works: it always adds spaces between its arguments.)

This example demonstrates the `str.rjust()` method of string objects, which right-justifies a string in a field of a given width by padding it with spaces on the left. There are similar methods `str.ljust()` and `str.center()`. These methods do not write anything, they just return a new string. If the input string is too long, they don't truncate it, but return it unchanged; this will mess up your column lay-out but that's usually better than the alternative, which would be lying about a value. (If you really want truncation you can always add a slice operation, as in `x.ljust(n)[::n]`.)

There is another method, `str.zfill()`, which pads a numeric string on the left with zeros. It understands about plus and minus signs:

```
>>> '12'.zfill(5)
'00012'
>>> '-3.14'.zfill(7)
'-003.14'
>>> '3.14159265359'.zfill(5)
'3.14159265359'
```

Basic usage of the `str.format()` method looks like this:

```
>>> print('We are the {} who say "{}!"'.format('knights', 'Ni'))
We are the knights who say "Ni!"
```

The brackets and characters within them (called format fields) are replaced with the objects passed into the `str.format()` method. A number in the brackets can be used to refer to the position of the object passed into the `str.format()` method.

```
>>> print('{0} and {1}'.format('spam', 'eggs'))
spam and eggs
>>> print('{1} and {0}'.format('spam', 'eggs'))
eggs and spam
```

If keyword arguments are used in the `str.format()` method, their values are referred to by using the name of the argument.

```
>>> print('This {food} is {adjective}'.format(
...     food='spam', adjective='absolutely horrible'))
This spam is absolutely horrible.
```

Positional and keyword arguments can be arbitrarily combined:

```
>>> print('The story of {0}, {1}, and {other}'.format('Bill', 'Manfred',
...                                                 other='Georg'))
The story of Bill, Manfred, and Georg.
```

'!a' (apply `ascii()`), '!s' (apply `str()`) and '!r' (apply `repr()`) can be used to convert the value before it is formatted:

```
>>> import math
>>> print('The value of PI is approximately {}'.format(math.pi))
The value of PI is approximately 3.14159265359.
>>> print('The value of PI is approximately {!r}'.format(math.pi))
The value of PI is approximately 3.141592653589793.
```

Page 47

Saturday, February 4, 2017 1:16 AM

An optional ':' and format specifier can follow the field name. This allows greater control over how the value is formatted. The following example rounds Pi to three places after the decimal.

```
>>> import math
>>> print('The value of PI is approximately {:.3f}'.format(math.pi))
The value of PI is approximately 3.142.
```

Passing an integer after the ':' will cause that field to be a minimum number of characters wide. This is useful for making tables pretty.

```
>>> table = {'Sjoerd': 4127, 'Jack': 4098, 'Dcab': 7678}
>>> for name, phone in table.items():
...     print('{0:10} ==> {1:10d}'.format(name, phone))
...
Jack      ==>      4098
Dcab      ==>      7678
Sjoerd    ==>      4127
```

If you have a really long format string that you don't want to split up, it would be nice if you could reference the variables to be formatted by name instead of by position. This can be done by simply passing the dict and using square brackets '[]' to access the keys

```
>>> table = {'Sjoerd': 4127, 'Jack': 4098, 'Dcab': 8637678}
>>> print('Jack: {0[Jack]:d}; Sjoerd: {0[Sjoerd]:d}; '
...       'Dcab: {0[Dcab]:d}'.format(table))
Jack: 4098; Sjoerd: 4127; Dcab: 8637678
```

This could also be done by passing the table as keyword arguments with the '\*\*' notation.

```
>>> table = {'Sjoerd': 4127, 'Jack': 4098, 'Dcab': 8637678}
>>> print('Jack: {Jack:d}; Sjoerd: {Sjoerd:d}; Dcab: {Dcab:d}'.format(**table))
Jack: 4098; Sjoerd: 4127; Dcab: 8637678
```

This is particularly useful in combination with the built-in function [vars\(\)](#), which returns a dictionary containing all local variables.

For a complete overview of string formatting with [str.format\(\)](#), see [Format String Syntax](#).

### 7.1.1. Old string formatting

The % operator can also be used for string formatting. It interprets the left argument much like a `sprintf()`-style format string to be applied to the right argument, and returns the string resulting from this formatting operation. For example:

```
>>> import math
>>> print('The value of PI is approximately %5.3f.' % math.pi)
The value of PI is approximately 3.142.
```

More information can be found in the [printf-style String Formatting](#) section.

## 7.2. Reading and Writing Files

[open\(\)](#) returns a [file object](#), and is most commonly used with two arguments: `open(filename, mode)`.

```
>>> f = open('workfile', 'w')
```

The first argument is a string containing the filename. The second argument is another string containing a few characters describing the way in which the file will be used. *mode* can be '*r*' when the file will only be read, '*w*'

# Page 48

Saturday, February 4, 2017 1:16 AM

for only writing (an existing file with the same name will be erased), and '`a`' opens the file for appending; any data written to the file is automatically added to the end. '`r+`' opens the file for both reading and writing. The `mode` argument is optional; '`r`' will be assumed if it's omitted.

Normally, files are opened in *text mode*, that means, you read and write strings from and to the file, which are encoded in a specific encoding (the default being UTF-8). '`b`' appended to the mode opens the file in *binary mode*: now the data is read and written in the form of bytes objects. This mode should be used for all files that don't contain text.

In text mode, the default when reading is to convert platform-specific line endings (`\n` on Unix, `\r\n` on Windows) to just `\n`. When writing in text mode, the default is to convert occurrences of `\n` back to platform-specific line endings. This behind-the-scenes modification to file data is fine for text files, but will corrupt binary data like that in JPEG or EXE files. Be very careful to use binary mode when reading and writing such files.

### 7.2.1. Methods of File Objects

The rest of the examples in this section will assume that a file object called `f` has already been created.

To read a file's contents, call `f.read(size)`, which reads some quantity of data and returns it as a string or bytes object. `size` is an optional numeric argument. When `size` is omitted or negative, the entire contents of the file will be read and returned; it's your problem if the file is twice as large as your machine's memory. Otherwise, at most `size` bytes are read and returned. If the end of the file has been reached, `f.read()` will return an empty string ('').

```
>>> f.read()
'This is the entire file.\n'
>>> f.read()
''
```

`f.readline()` reads a single line from the file; a newline character (`\n`) is left at the end of the string, and is only omitted on the last line of the file if the file doesn't end in a newline. This makes the return value unambiguous; if `f.readline()` returns an empty string, the end of the file has been reached, while a blank line is represented by '`\n`', a string containing only a single newline.

```
>>> f.readline()
'This is the first line of the file.\n'
>>> f.readline()
'Second line of the file\n'
>>> f.readline()
''
```

For reading lines from a file, you can loop over the file object. This is memory efficient, fast, and leads to simple code:

```
>>> for line in f:
...     print(line, end='')
...
This is the first line of the file.
Second line of the file
```

If you want to read all the lines of a file in a list you can also use `list(f)` or `f.readlines()`.

`f.write(string)` writes the contents of `string` to the file, returning the number of characters written.

```
>>> f.write('This is a test\n')
15
```

To write something other than a string, it needs to be converted to a string first:

Page 49

Saturday, February 4, 2017 1:16 AM

```
>>> value = ('the answer', 42)
>>> s = str(value)
>>> f.write(s)
18
```

`f.tell()` returns an integer giving the file object's current position in the file represented as number of bytes from the beginning of the file when in *binary mode* and an opaque number when in *text mode*.

To change the file object's position, use `f.seek(offset, from what)`. The position is computed from adding `offset` to a reference point; the reference point is selected by the `from what` argument. A `from what` value of 0 measures from the beginning of the file, 1 uses the current file position, and 2 uses the end of the file as the reference point. `from what` can be omitted and defaults to 0, using the beginning of the file as the reference point.

```
>>> f = open('workfile', 'rb+')
>>> f.write(b'0123456789abcdef')
16
>>> f.seek(5)      # Go to the 6th byte in the file
5
>>> f.read(1)
b'5'
>>> f.seek(-3, 2) # Go to the 3rd byte before the end
13
>>> f.read(1)
b'd'
```

In text files (those opened without a `b` in the mode string), only seeks relative to the beginning of the file are allowed (the exception being seeking to the very file end with `seek(0, 2)`) and the only valid `offset` values are those returned from the `f.tell()`, or zero. Any other `offset` value produces undefined behaviour.

When you're done with a file, call `f.close()` to close it and free up any system resources taken up by the open file. After calling `f.close()`, attempts to use the file object will automatically fail.

```
>>> f.close()
>>> f.read()
Traceback (most recent call last):
  File "<stdin>", line 1, in ?
ValueError: I/O operation on closed file
```

It is good practice to use the `with` keyword when dealing with file objects. This has the advantage that the file is properly closed after its suite finishes, even if an exception is raised on the way. It is also much shorter than writing equivalent `try-finally` blocks:

```
>>> with open('workfile', 'r') as f:
...     read_data = f.read()
>>> f.closed
True
```

File objects have some additional methods, such as `isatty()` and `truncate()` which are less frequently used; consult the Library Reference for a complete guide to file objects.

### 7.2.2. Saving structured data with [json](#)

Strings can easily be written to and read from a file. Numbers take a bit more effort, since the `read()` method only returns strings, which will have to be passed to a function like `int()`, which takes a string like '`123`' and returns its numeric value 123. When you want to save more complex data types like nested lists and dictionaries, parsing and serializing by hand becomes complicated.

Rather than having users constantly writing and debugging code to save complicated data types to files, Python allows you to use the popular data interchange format called [JSON \(JavaScript Object Notation\)](#). The standard

# Page 50

Saturday, February 4, 2017 1:16 AM

module called [`json`](#) can take Python data hierarchies, and convert them to string representations; this process is called *serializing*. Reconstructing the data from the string representation is called *deserializing*. Between serializing and deserializing, the string representing the object may have been stored in a file or data, or sent over a network connection to some distant machine.

#### Note

The JSON format is commonly used by modern applications to allow for data exchange. Many programmers are already familiar with it, which makes it a good choice for interoperability.

If you have an object `x`, you can view its JSON string representation with a simple line of code:

```
>>> json.dumps([1, 'simple', 'list'])
'[1, "simple", "list"]'
```

Another variant of the [`dumps\(\)`](#) function, called [`dump\(\)`](#), simply serializes the object to a [text file](#). So if `f` is a [text file](#) object opened for writing, we can do this:

```
json.dump(x, f)
```

To decode the object again, if `f` is a [text file](#) object which has been opened for reading:

```
x = json.load(f)
```

This simple serialization technique can handle lists and dictionaries, but serializing arbitrary class instances in JSON requires a bit of extra effort. The reference for the [`json`](#) module contains an explanation of this.

#### See also

[pickle](#) - the pickle module

Contrary to [JSON](#), *pickle* is a protocol which allows the serialization of arbitrarily complex Python objects. As such, it is specific to Python and cannot be used to communicate with applications written in other languages. It is also insecure by default: deserializing pickle data coming from an untrusted source can execute arbitrary code, if the data was crafted by a skilled attacker.

## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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## Navigation

- [index](#)
- [modules](#) |

# Page 51

Saturday, February 4, 2017 1:16 AM

- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

## 8. Errors and Exceptions

Until now error messages haven't been more than mentioned, but if you have tried out the examples you have probably seen some. There are (at least) two distinguishable kinds of errors: *syntax errors* and *exceptions*.

### 8.1. Syntax Errors

Syntax errors, also known as parsing errors, are perhaps the most common kind of complaint you get while you are still learning Python:

```
>>> while True print('Hello world')
      File "<stdin>", line 1, in ?
          while True print('Hello world')
                  ^
SyntaxError: invalid syntax
```

The parser repeats the offending line and displays a little ‘arrow’ pointing at the earliest point in the line where the error was detected. The error is caused by (or at least detected at) the token *preceding* the arrow: in the example, the error is detected at the function [print\(\)](#), since a colon (‘:’) is missing before it. File name and line number are printed so you know where to look in case the input came from a script.

### 8.2. Exceptions

Even if a statement or expression is syntactically correct, it may cause an error when an attempt is made to execute it. Errors detected during execution are called *exceptions* and are not unconditionally fatal: you will soon learn how to handle them in Python programs. Most exceptions are not handled by programs, however, and result in error messages as shown here:

```
>>> 10 * (1/0)
Traceback (most recent call last):
  File "<stdin>", line 1, in ?
ZeroDivisionError: division by zero
>>> 4 + spam*3
Traceback (most recent call last):
  File "<stdin>", line 1, in ?
NameError: name 'spam' is not defined
>>> '2' + 2
Traceback (most recent call last):
  File "<stdin>", line 1, in ?
TypeError: Can't convert 'int' object to str implicitly
```

The last line of the error message indicates what happened. Exceptions come in different types, and the type is printed as part of the message: the types in the example are [ZeroDivisionError](#), [NameError](#) and [TypeError](#). The string printed as the exception type is the name of the built-in exception that occurred. This is true for all built-in exceptions, but need not be true for user-defined exceptions (although it is a useful convention). Standard exception names are built-in identifiers (not reserved keywords).

The rest of the line provides detail based on the type of exception and what caused it.

The preceding part of the error message shows the context where the exception happened, in the form of a stack

Page 52

Saturday, February 4, 2017 1:16 AM

traceback. In general it contains a stack traceback listing source lines; however, it will not display lines read from standard input.

[Built-in Exceptions](#) lists the built-in exceptions and their meanings.

## 8.3. Handling Exceptions

It is possible to write programs that handle selected exceptions. Look at the following example, which asks the user for input until a valid integer has been entered, but allows the user to interrupt the program (using `Control-C` or whatever the operating system supports); note that a user-generated interruption is signalled by raising the [KeyboardInterrupt](#) exception.

```
>>> while True:
...     try:
...         x = int(input("Please enter a number: "))
...         break
...     except ValueError:
...         print("Oops! That was no valid number. Try again...")
```

The `try` statement works as follows.

- First, the *try clause* (the statement(s) between the `try` and `except` keywords) is executed.
- If no exception occurs, the *except clause* is skipped and execution of the `try` statement is finished.
- If an exception occurs during execution of the *try clause*, the rest of the clause is skipped. Then if its type matches the exception named after the `except` keyword, the *except clause* is executed, and then execution continues after the `try` statement.
- If an exception occurs which does not match the exception named in the *except clause*, it is passed on to outer `try` statements; if no handler is found, it is an *unhandled exception* and execution stops with a message as shown above.

A `try` statement may have more than one *except clause*, to specify handlers for different exceptions. At most one handler will be executed. Handlers only handle exceptions that occur in the corresponding *try clause*, not in other handlers of the same `try` statement. An *except clause* may name multiple exceptions as a parenthesized tuple, for example:

```
... except (RuntimeError, TypeError, NameError):
...     pass
```

The last *except clause* may omit the exception name(s), to serve as a wildcard. Use this with extreme caution, since it is easy to mask a real programming error in this way! It can also be used to print an error message and then re-raise the exception (allowing a caller to handle the exception as well):

```
import sys

try:
    f = open('myfile.txt')
    s = f.readline()
    i = int(s.strip())
except OSError as err:
    print("OS error: {0}".format(err))
except ValueError:
    print("Could not convert data to an integer.")
except:
    print("Unexpected error:", sys.exc_info()[0])
    raise
```

The `try ... except` statement has an optional *else clause*, which, when present, must follow all *except clauses*. It is useful for code that must be executed if the *try clause* does not raise an exception. For example:

# Page 53

Saturday, February 4, 2017 1:16 AM

```

for arg in sys.argv[1:]:
    try:
        f = open(arg, 'r')
    except IOError:
        print('cannot open', arg)
    else:
        print(arg, 'has', len(f.readlines()), 'lines')
        f.close()

```

The use of the `else` clause is better than adding additional code to the `try` clause because it avoids accidentally catching an exception that wasn't raised by the code being protected by the `try ... except` statement.

When an exception occurs, it may have an associated value, also known as the exception's *argument*. The presence and type of the argument depend on the exception type.

The `except` clause may specify a variable after the exception name. The variable is bound to an exception instance with the arguments stored in `instance.args`. For convenience, the exception instance defines `__str__()` so the arguments can be printed directly without having to reference `.args`. One may also instantiate an exception first before raising it and add any attributes to it as desired.

```

>>> try:
...     raise Exception('spam', 'eggs')
... except Exception as inst:
...     print(type(inst))      # the exception instance
...     print(inst.args)       # arguments stored in .args
...     print(inst)            # __str__ allows args to be printed directly,
...                         # but may be overridden in exception subclasses
...     x, y = inst.args      # unpack args
...     print('x =', x)
...     print('y =', y)
...
<class 'Exception'>
('spam', 'eggs')
('spam', 'eggs')
x = spam
y = eggs

```

If an exception has arguments, they are printed as the last part ('detail') of the message for unhandled exceptions.

Exception handlers don't just handle exceptions if they occur immediately in the `try` clause, but also if they occur inside functions that are called (even indirectly) in the `try` clause. For example:

```

>>> def this_fails():
...     x = 1/0
...
>>> try:
...     this_fails()
... except ZeroDivisionError as err:
...     print('Handling run-time error:', err)
...
Handling run-time error: int division or modulo by zero

```

## 8.4. Raising Exceptions

The `raise` statement allows the programmer to force a specified exception to occur. For example:

```

>>> raise NameError('HiThere')
Traceback (most recent call last):
  File "<stdin>", line 1, in ?
NameError: HiThere

```

# Page 54

Saturday, February 4, 2017 1:16 AM

The sole argument to `raise` indicates the exception to be raised. This must be either an exception instance or an exception class (a class that derives from `Exception`).

If you need to determine whether an exception was raised but don't intend to handle it, a simpler form of the `raise` statement allows you to re-raise the exception:

```
>>> try:  
...     raise NameError('HiThere')  
... except NameError:  
...     print('An exception flew by!')  
...     raise  
...  
An exception flew by!  
Traceback (most recent call last):  
  File "<stdin>", line 2, in ?  
NameError: HiThere
```

## 8.5. User-defined Exceptions

Programs may name their own exceptions by creating a new exception class (see [Classes](#) for more about Python classes). Exceptions should typically be derived from the `Exception` class, either directly or indirectly. For example:

```
>>> class MyError(Exception):  
...     def __init__(self, value):  
...         self.value = value  
...     def __str__(self):  
...         return repr(self.value)  
...  
>>> try:  
...     raise MyError(2*2)  
... except MyError as e:  
...     print('My exception occurred, value:', e.value)  
...  
My exception occurred, value: 4  
>>> raise MyError('oops!')  
Traceback (most recent call last):  
  File "<stdin>", line 1, in ?  
    main__.MyError: 'oops!'
```

In this example, the default `__init__()` of `Exception` has been overridden. The new behavior simply creates the `value` attribute. This replaces the default behavior of creating the `args` attribute.

Exception classes can be defined which do anything any other class can do, but are usually kept simple, often only offering a number of attributes that allow information about the error to be extracted by handlers for the exception. When creating a module that can raise several distinct errors, a common practice is to create a base class for exceptions defined by that module, and subclass that to create specific exception classes for different error conditions:

```
class Error(Exception):  
    """Base class for exceptions in this module."""  
    pass  
  
class InputError(Error):  
    """Exception raised for errors in the input.  
  
    Attributes:  
        expression -- input expression in which the error occurred  
        message -- explanation of the error  
    """  
  
    file:///C:/Users/ashish_patel/AppData/Local/Temp/~hhA0A0.htm 2/4/2017
```

# Page 55

Saturday, February 4, 2017 1:16 AM

```
def __init__(self, expression, message):
    self.expression = expression
    self.message = message

class TransitionError(Error):
    """Raised when an operation attempts a state transition that's not
    allowed.

    Attributes:
        previous -- state at beginning of transition
        next -- attempted new state
        message -- explanation of why the specific transition is not allowed
    """

    def __init__(self, previous, next, message):
        self.previous = previous
        self.next = next
        self.message = message
```

Most exceptions are defined with names that end in “Error,” similar to the naming of the standard exceptions.

Many standard modules define their own exceptions to report errors that may occur in functions they define. More information on classes is presented in chapter [Classes](#).

## 8.6. Defining Clean-up Actions

The `try` statement has another optional clause which is intended to define clean-up actions that must be executed under all circumstances. For example:

```
>>> try:
...     raise KeyboardInterrupt
... finally:
...     print('Goodbye, world!')
...
Goodbye, world!
KeyboardInterrupt
```

A *finally clause* is always executed before leaving the `try` statement, whether an exception has occurred or not. When an exception has occurred in the `try` clause and has not been handled by an `except` clause (or it has occurred in a `except` or `else` clause), it is re-raised after the `finally` clause has been executed. The `finally` clause is also executed “on the way out” when any other clause of the `try` statement is left via a `break`, `continue` or `return` statement. A more complicated example:

```
>>> def divide(x, y):
...     try:
...         result = x / y
...     except ZeroDivisionError:
...         print("division by zero!")
...     else:
...         print("result is", result)
...     finally:
...         print("executing finally clause")
...
>>> divide(2, 1)
result is 2.0
executing finally clause
>>> divide(2, 0)
division by zero!
executing finally clause
>>> divide("2", "1")
executing finally clause
Traceback (most recent call last):
```

# Page 56

Saturday, February 4, 2017 1:16 AM

```
File "<stdin>", line 1, in ?
  File "<stdin>", line 3, in divide
TypeError: unsupported operand type(s) for /: 'str' and 'str'
```

As you can see, the `finally` clause is executed in any event. The `TypeError` raised by dividing two strings is not handled by the `except` clause and therefore re-raised after the `finally` clause has been executed.

In real world applications, the `finally` clause is useful for releasing external resources (such as files or network connections), regardless of whether the use of the resource was successful.

## 8.7. Predefined Clean-up Actions

Some objects define standard clean-up actions to be undertaken when the object is no longer needed, regardless of whether or not the operation using the object succeeded or failed. Look at the following example, which tries to open a file and print its contents to the screen.

```
for line in open("myfile.txt"):
    print(line, end="")
```

The problem with this code is that it leaves the file open for an indeterminate amount of time after this part of the code has finished executing. This is not an issue in simple scripts, but can be a problem for larger applications. The `with` statement allows objects like files to be used in a way that ensures they are always cleaned up promptly and correctly.

```
with open("myfile.txt") as f:
    for line in f:
        print(line, end="")
```

After the statement is executed, the file `f` is always closed, even if a problem was encountered while processing the lines. Objects which, like files, provide predefined clean-up actions will indicate this in their documentation.

### Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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### Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »

Page 57

Saturday, February 4, 2017 1:16 AM

- [The Python Tutorial](#) »

## 9. Classes

Compared with other programming languages, Python's class mechanism adds classes with a minimum of new syntax and semantics. It is a mixture of the class mechanisms found in C++ and Modula-3. Python classes provide all the standard features of Object Oriented Programming: the class inheritance mechanism allows multiple base classes, a derived class can override any methods of its base class or classes, and a method can call the method of a base class with the same name. Objects can contain arbitrary amounts and kinds of data. As is true for modules, classes partake of the dynamic nature of Python: they are created at runtime, and can be modified further after creation.

In C++ terminology, normally class members (including the data members) are *public* (except see below [Private Variables](#)), and all member functions are *virtual*. As in Modula-3, there are no shorthands for referencing the object's members from its methods: the method function is declared with an explicit first argument representing the object, which is provided implicitly by the call. As in Smalltalk, classes themselves are objects. This provides semantics for importing and renaming. Unlike C++ and Modula-3, built-in types can be used as base classes for extension by the user. Also, like in C++, most built-in operators with special syntax (arithmetic operators, subscripting etc.) can be redefined for class instances.

(Lacking universally accepted terminology to talk about classes, I will make occasional use of Smalltalk and C++ terms. I would use Modula-3 terms, since its object-oriented semantics are closer to those of Python than C++, but I expect that few readers have heard of it.)

### 9.1. A Word About Names and Objects

Objects have individuality, and multiple names (in multiple scopes) can be bound to the same object. This is known as aliasing in other languages. This is usually not appreciated on a first glance at Python, and can be safely ignored when dealing with immutable basic types (numbers, strings, tuples). However, aliasing has a possibly surprising effect on the semantics of Python code involving mutable objects such as lists, dictionaries, and most other types. This is usually used to the benefit of the program, since aliases behave like pointers in some respects. For example, passing an object is cheap since only a pointer is passed by the implementation; and if a function modifies an object passed as an argument, the caller will see the change — this eliminates the need for two different argument passing mechanisms as in Pascal.

### 9.2. Python Scopes and Namespaces

Before introducing classes, I first have to tell you something about Python's scope rules. Class definitions play some neat tricks with namespaces, and you need to know how scopes and namespaces work to fully understand what's going on. Incidentally, knowledge about this subject is useful for any advanced Python programmer.

Let's begin with some definitions.

A *namespace* is a mapping from names to objects. Most namespaces are currently implemented as Python dictionaries, but that's normally not noticeable in any way (except for performance), and it may change in the future. Examples of namespaces are: the set of built-in names (containing functions such as `abs()`, and built-in exception names); the global names in a module; and the local names in a function invocation. In a sense the set of attributes of an object also form a namespace. The important thing to know about namespaces is that there is absolutely no relation between names in different namespaces; for instance, two different modules may both define a function `maximize` without confusion — users of the modules must prefix it with the module name.

By the way, I use the word *attribute* for any name following a dot — for example, in the expression `z.real`, `real` is an attribute of the object `z`. Strictly speaking, references to names in modules are attribute references: in the expression `modname.funcname`, `modname` is a module object and `funcname` is an attribute of it. In this case there

# Page 58

Saturday, February 4, 2017 1:16 AM

happens to be a straightforward mapping between the module's attributes and the global names defined in the module: they share the same namespace! [1]

Attributes may be read-only or writable. In the latter case, assignment to attributes is possible. Module attributes are writable: you can write `modname.the_answer = 42`. Writable attributes may also be deleted with the `del` statement. For example, `del modname.the_answer` will remove the attribute `the_answer` from the object named by `modname`.

Namespaces are created at different moments and have different lifetimes. The namespace containing the built-in names is created when the Python interpreter starts up, and is never deleted. The global namespace for a module is created when the module definition is read in; normally, module namespaces also last until the interpreter quits. The statements executed by the top-level invocation of the interpreter, either read from a script file or interactively, are considered part of a module called `main`, so they have their own global namespace. (The built-in names actually also live in a module; this is called `builtins`.)

The local namespace for a function is created when the function is called, and deleted when the function returns or raises an exception that is not handled within the function. (Actually, forgetting would be a better way to describe what actually happens.) Of course, recursive invocations each have their own local namespace.

A *scope* is a textual region of a Python program where a namespace is directly accessible. “Directly accessible” here means that an unqualified reference to a name attempts to find the name in the namespace.

Although scopes are determined statically, they are used dynamically. At any time during execution, there are at least three nested scopes whose namespaces are directly accessible:

- the innermost scope, which is searched first, contains the local names
- the scopes of any enclosing functions, which are searched starting with the nearest enclosing scope, contains non-local, but also non-global names
- the next-to-last scope contains the current module's global names
- the outermost scope (searched last) is the namespace containing built-in names

If a name is declared global, then all references and assignments go directly to the middle scope containing the module's global names. To rebind variables found outside of the innermost scope, the `nonlocal` statement can be used; if not declared nonlocal, those variable are read-only (an attempt to write to such a variable will simply create a *new* local variable in the innermost scope, leaving the identically named outer variable unchanged).

Usually, the local scope references the local names of the (textually) current function. Outside functions, the local scope references the same namespace as the global scope: the module's namespace. Class definitions place yet another namespace in the local scope.

It is important to realize that scopes are determined textually: the global scope of a function defined in a module is that module's namespace, no matter from where or by what alias the function is called. On the other hand, the actual search for names is done dynamically, at run time — however, the language definition is evolving towards static name resolution, at “compile” time, so don't rely on dynamic name resolution! (In fact, local variables are already determined statically.)

A special quirk of Python is that – if no `global` statement is in effect – assignments to names always go into the innermost scope. Assignments do not copy data — they just bind names to objects. The same is true for deletions: the statement `del x` removes the binding of `x` from the namespace referenced by the local scope. In fact, all operations that introduce new names use the local scope: in particular, `import` statements and function definitions bind the module or function name in the local scope.

The `global` statement can be used to indicate that particular variables live in the global scope and should be rebound there; the `nonlocal` statement indicates that particular variables live in an enclosing scope and should be rebound there.

Page 59

Saturday, February 4, 2017 1:16 AM

### 9.2.1. Scopes and Namespaces Example

This is an example demonstrating how to reference the different scopes and namespaces, and how [global](#) and [nonlocal](#) affect variable binding:

```
def scope_test():
    def do_local():
        spam = "local spam"
    def do_nonlocal():
        nonlocal spam
        spam = "nonlocal spam"
    def do_global():
        global spam
        spam = "global spam"
    spam = "test spam"
    do_local()
    print("After local assignment:", spam)
    do_nonlocal()
    print("After nonlocal assignment:", spam)
    do_global()
    print("After global assignment:", spam)

scope_test()
print("In global scope:", spam)
```

The output of the example code is:

```
After local assignment: test spam
After nonlocal assignment: nonlocal spam
After global assignment: nonlocal spam
In global scope: global spam
```

Note how the *local* assignment (which is default) didn't change *scope\_test*'s binding of *spam*. The [nonlocal](#) assignment changed *scope\_test*'s binding of *spam*, and the [global](#) assignment changed the module-level binding.

You can also see that there was no previous binding for *spam* before the [global](#) assignment.

## 9.3. A First Look at Classes

Classes introduce a little bit of new syntax, three new object types, and some new semantics.

### 9.3.1. Class Definition Syntax

The simplest form of class definition looks like this:

```
class ClassName:
    <statement-1>
    .
    .
    .
    <statement-N>
```

Class definitions, like function definitions ([def](#) statements) must be executed before they have any effect. (You could conceivably place a class definition in a branch of an [if](#) statement, or inside a function.)

In practice, the statements inside a class definition will usually be function definitions, but other statements are allowed, and sometimes useful — we'll come back to this later. The function definitions inside a class normally have a peculiar form of argument list, dictated by the calling conventions for methods — again, this is explained later.

# Page 60

Saturday, February 4, 2017 1:16 AM

When a class definition is entered, a new namespace is created, and used as the local scope — thus, all assignments to local variables go into this new namespace. In particular, function definitions bind the name of the new function here.

When a class definition is left normally (via the end), a *class object* is created. This is basically a wrapper around the contents of the namespace created by the class definition; we'll learn more about class objects in the next section. The original local scope (the one in effect just before the class definition was entered) is reinstated, and the class object is bound here to the class name given in the class definition header (`ClassName` in the example).

### 9.3.2. Class Objects

Class objects support two kinds of operations: attribute references and instantiation.

*Attribute references* use the standard syntax used for all attribute references in Python: `obj.name`. Valid attribute names are all the names that were in the class's namespace when the class object was created. So, if the class definition looked like this:

```
class MyClass:  
    """A simple example class"""  
    i = 12345  
    def f(self):  
        return 'hello world'
```

then `MyClass.i` and `MyClass.f` are valid attribute references, returning an integer and a function object, respectively. Class attributes can also be assigned to, so you can change the value of `MyClass.i` by assignment. `__doc__` is also a valid attribute, returning the docstring belonging to the class: "A simple example class".

Class *instantiation* uses function notation. Just pretend that the class object is a parameterless function that returns a new instance of the class. For example (assuming the above class):

```
x = MyClass()
```

creates a new *instance* of the class and assigns this object to the local variable `x`.

The instantiation operation ("calling" a class object) creates an empty object. Many classes like to create objects with instances customized to a specific initial state. Therefore a class may define a special method named `__init__()`, like this:

```
def __init__(self):  
    self.data = []
```

When a class defines an `__init__()` method, class instantiation automatically invokes `__init__()` for the newly-created class instance. So in this example, a new, initialized instance can be obtained by:

```
x = MyClass()
```

Of course, the `__init__()` method may have arguments for greater flexibility. In that case, arguments given to the class instantiation operator are passed on to `__init__()`. For example,

```
>>> class Complex:  
...     def __init__(self, realpart, imagpart):  
...         self.r = realpart  
...         self.i = imagpart  
...  
>>> x = Complex(3.0, -4.5)  
>>> x.r, x.i  
(3.0, -4.5)
```

# Page 61

Saturday, February 4, 2017 1:16 AM

### 9.3.3. Instance Objects

Now what can we do with instance objects? The only operations understood by instance objects are attribute references. There are two kinds of valid attribute names, data attributes and methods.

*data attributes* correspond to “instance variables” in Smalltalk, and to “data members” in C++. Data attributes need not be declared; like local variables, they spring into existence when they are first assigned to. For example, if `x` is the instance of `MyClass` created above, the following piece of code will print the value 16, without leaving a trace:

```
x.counter = 1
while x.counter < 10:
    x.counter = x.counter * 2
print(x.counter)
del x.counter
```

The other kind of instance attribute reference is a *method*. A method is a function that “belongs to” an object. (In Python, the term method is not unique to class instances: other object types can have methods as well. For example, list objects have methods called `append`, `insert`, `remove`, `sort`, and so on. However, in the following discussion, we’ll use the term method exclusively to mean methods of class instance objects, unless explicitly stated otherwise.)

Valid method names of an instance object depend on its class. By definition, all attributes of a class that are function objects define corresponding methods of its instances. So in our example, `x.f` is a valid method reference, since `MyClass.f` is a function, but `x.i` is not, since `MyClass.i` is not. But `x.f` is not the same thing as `MyClass.f` — it is a *method object*, not a function object.

### 9.3.4. Method Objects

Usually, a method is called right after it is bound:

```
x.f()
```

In the `MyClass` example, this will return the string ‘hello world’. However, it is not necessary to call a method right away: `x.f` is a method object, and can be stored away and called at a later time. For example:

```
xf = x.f
while True:
    print(xf())
```

will continue to print `hello world` until the end of time.

What exactly happens when a method is called? You may have noticed that `x.f()` was called without an argument above, even though the function definition for `f()` specified an argument. What happened to the argument? Surely Python raises an exception when a function that requires an argument is called without any — even if the argument isn’t actually used...

Actually, you may have guessed the answer: the special thing about methods is that the object is passed as the first argument of the function. In our example, the call `x.f()` is exactly equivalent to `MyClass.f(x)`. In general, calling a method with a list of  $n$  arguments is equivalent to calling the corresponding function with an argument list that is created by inserting the method’s object before the first argument.

If you still don’t understand how methods work, a look at the implementation can perhaps clarify matters. When an instance attribute is referenced that isn’t a data attribute, its class is searched. If the name denotes a valid class attribute that is a function object, a method object is created by packing (pointers to) the instance object and the function object just found together in an abstract object: this is the method object. When the method object is called with an argument list, a new argument list is constructed from the instance object and the argument list, and the function object is called with this new argument list.

Page 62

Saturday, February 4, 2017 1:16 AM

### 9.3.5. Class and Instance Variables

Generally speaking, instance variables are for data unique to each instance and class variables are for attributes and methods shared by all instances of the class:

```
class Dog:

    kind = 'canine'          # class variable shared by all instances

    def __init__(self, name):
        self.name = name      # instance variable unique to each instance

>>> d = Dog('Fido')
>>> e = Dog('Buddy')
>>> d.kind                # shared by all dogs
'canine'
>>> e.kind                # shared by all dogs
'canine'
>>> d.name                # unique to d
'Fido'
>>> e.name                # unique to e
'Buddy'
```

As discussed in [A Word About Names and Objects](#), shared data can have possibly surprising effects with involving *mutable* objects such as lists and dictionaries. For example, the *tricks* list in the following code should not be used as a class variable because just a single list would be shared by all *Dog* instances:

```
class Dog:

    tricks = []             # mistaken use of a class variable

    def __init__(self, name):
        self.name = name

    def add_trick(self, trick):
        self.tricks.append(trick)

>>> d = Dog('Fido')
>>> e = Dog('Buddy')
>>> d.add_trick('roll over')
>>> e.add_trick('play dead')
>>> d.tricks            # unexpectedly shared by all dogs
['roll over', 'play dead']
```

Correct design of the class should use an instance variable instead:

```
class Dog:

    def __init__(self, name):
        self.name = name
        self.tricks = []      # creates a new empty list for each dog

    def add_trick(self, trick):
        self.tricks.append(trick)

>>> d = Dog('Fido')
>>> e = Dog('Buddy')
>>> d.add_trick('roll over')
>>> e.add_trick('play dead')
>>> d.tricks
['roll over']
>>> e.tricks
['play dead']
```

Page 63

Saturday, February 4, 2017 1:16 AM

## 9.4. Random Remarks

Data attributes override method attributes with the same name; to avoid accidental name conflicts, which may cause hard-to-find bugs in large programs, it is wise to use some kind of convention that minimizes the chance of conflicts. Possible conventions include capitalizing method names, prefixing data attribute names with a small unique string (perhaps just an underscore), or using verbs for methods and nouns for data attributes.

Data attributes may be referenced by methods as well as by ordinary users (“clients”) of an object. In other words, classes are not usable to implement pure abstract data types. In fact, nothing in Python makes it possible to enforce data hiding — it is all based upon convention. (On the other hand, the Python implementation, written in C, can completely hide implementation details and control access to an object if necessary; this can be used by extensions to Python written in C.)

Clients should use data attributes with care — clients may mess up invariants maintained by the methods by stamping on their data attributes. Note that clients may add data attributes of their own to an instance object without affecting the validity of the methods, as long as name conflicts are avoided — again, a naming convention can save a lot of headaches here.

There is no shorthand for referencing data attributes (or other methods!) from within methods. I find that this actually increases the readability of methods: there is no chance of confusing local variables and instance variables when glancing through a method.

Often, the first argument of a method is called `self`. This is nothing more than a convention: the name `self` has absolutely no special meaning to Python. Note, however, that by not following the convention your code may be less readable to other Python programmers, and it is also conceivable that a *class browser* program might be written that relies upon such a convention.

Any function object that is a class attribute defines a method for instances of that class. It is not necessary that the function definition is textually enclosed in the class definition: assigning a function object to a local variable in the class is also ok. For example:

```
# Function defined outside the class
def f1(self, x, y):
    return min(x, x+y)

class C:
    f = f1
    def g(self):
        return 'hello world'
    h = g
```

Now `f`, `g` and `h` are all attributes of class `C` that refer to function objects, and consequently they are all methods of instances of `C` — `h` being exactly equivalent to `g`. Note that this practice usually only serves to confuse the reader of a program.

Methods may call other methods by using method attributes of the `self` argument:

```
class Bag:
    def __init__(self):
        self.data = []
    def add(self, x):
        self.data.append(x)
    def addtwice(self, x):
        self.add(x)
        self.add(x)
```

Methods may reference global names in the same way as ordinary functions. The global scope associated with a method is the module containing its definition. (A class is never used as a global scope.) While one rarely

Page 64

Saturday, February 4, 2017 1:16 AM

encounters a good reason for using global data in a method, there are many legitimate uses of the global scope: for one thing, functions and modules imported into the global scope can be used by methods, as well as functions and classes defined in it. Usually, the class containing the method is itself defined in this global scope, and in the next section we'll find some good reasons why a method would want to reference its own class.

Each value is an object, and therefore has a *class* (also called its *type*). It is stored as `object.__class__`.

## 9.5. Inheritance

Of course, a language feature would not be worthy of the name “class” without supporting inheritance. The syntax for a derived class definition looks like this:

```
class DerivedClassName(BaseClassName):
    <statement-1>
    .
    .
    .
    <statement-N>
```

The name `BaseClassName` must be defined in a scope containing the derived class definition. In place of a base class name, other arbitrary expressions are also allowed. This can be useful, for example, when the base class is defined in another module:

```
class DerivedClassName(modname.BaseClassName):
```

Execution of a derived class definition proceeds the same as for a base class. When the class object is constructed, the base class is remembered. This is used for resolving attribute references: if a requested attribute is not found in the class, the search proceeds to look in the base class. This rule is applied recursively if the base class itself is derived from some other class.

There's nothing special about instantiation of derived classes: `DerivedClassName()` creates a new instance of the class. Method references are resolved as follows: the corresponding class attribute is searched, descending down the chain of base classes if necessary, and the method reference is valid if this yields a function object.

Derived classes may override methods of their base classes. Because methods have no special privileges when calling other methods of the same object, a method of a base class that calls another method defined in the same base class may end up calling a method of a derived class that overrides it. (For C++ programmers: all methods in Python are effectively `virtual`.)

An overriding method in a derived class may in fact want to extend rather than simply replace the base class method of the same name. There is a simple way to call the base class method directly: just call `BaseClassName.methodname(self, arguments)`. This is occasionally useful to clients as well. (Note that this only works if the base class is accessible as `BaseClassName` in the global scope.)

Python has two built-in functions that work with inheritance:

- Use `isinstance()` to check an instance's type: `isinstance(obj, int)` will be `True` only if `obj.__class__` is `int` or some class derived from `int`.
- Use `issubclass()` to check class inheritance: `issubclass(bool, int)` is `True` since `bool` is a subclass of `int`. However, `issubclass(float, int)` is `False` since `float` is not a subclass of `int`.

### 9.5.1. Multiple Inheritance

Python supports a form of multiple inheritance as well. A class definition with multiple base classes looks like this:

```
class DerivedClassName(Base1, Base2, Base3):
```

Page 65

Saturday, February 4, 2017 1:16 AM

```
<statement-1>
.
.
.
<statement-N>
```

For most purposes, in the simplest cases, you can think of the search for attributes inherited from a parent class as depth-first, left-to-right, not searching twice in the same class where there is an overlap in the hierarchy. Thus, if an attribute is not found in `DerivedClassName`, it is searched for in `Base1`, then (recursively) in the base classes of `Base1`, and if it was not found there, it was searched for in `Base2`, and so on.

In fact, it is slightly more complex than that; the method resolution order changes dynamically to support cooperative calls to `super()`. This approach is known in some other multiple-inheritance languages as call-next-method and is more powerful than the super call found in single-inheritance languages.

Dynamic ordering is necessary because all cases of multiple inheritance exhibit one or more diamond relationships (where at least one of the parent classes can be accessed through multiple paths from the bottommost class). For example, all classes inherit from `object`, so any case of multiple inheritance provides more than one path to reach `object`. To keep the base classes from being accessed more than once, the dynamic algorithm linearizes the search order in a way that preserves the left-to-right ordering specified in each class, that calls each parent only once, and that is monotonic (meaning that a class can be subclassed without affecting the precedence order of its parents). Taken together, these properties make it possible to design reliable and extensible classes with multiple inheritance. For more detail, see <http://www.python.org/download/releases/2.3/mro/>.

## 9.6. Private Variables

“Private” instance variables that cannot be accessed except from inside an object don’t exist in Python. However, there is a convention that is followed by most Python code: a name prefixed with an underscore (e.g. `_spam`) should be treated as a non-public part of the API (whether it is a function, a method or a data member). It should be considered an implementation detail and subject to change without notice.

Since there is a valid use-case for class-private members (namely to avoid name clashes of names with names defined by subclasses), there is limited support for such a mechanism, called *name mangling*. Any identifier of the form `_spam` (at least two leading underscores, at most one trailing underscore) is textually replaced with `_classname_spam`, where `classname` is the current class name with leading underscore(s) stripped. This mangling is done without regard to the syntactic position of the identifier, as long as it occurs within the definition of a class.

Name mangling is helpful for letting subclasses override methods without breaking intraclass method calls. For example:

```
class Mapping:
    def __init__(self, iterable):
        self.items_list = []
        self.__update(iterable)

    def update(self, iterable):
        for item in iterable:
            self.items_list.append(item)

    __update = update      # private copy of original update() method

class MappingSubclass(Mapping):

    def update(self, keys, values):
        # provides new signature for update()
        # but does not break __init__()
        for item in zip(keys, values):
            self.items_list.append(item)
```

# Page 66

Saturday, February 4, 2017 1:16 AM

Note that the mangling rules are designed mostly to avoid accidents; it still is possible to access or modify a variable that is considered private. This can even be useful in special circumstances, such as in the debugger.

Notice that code passed to `exec()` or `eval()` does not consider the classname of the invoking class to be the current class; this is similar to the effect of the `global` statement, the effect of which is likewise restricted to code that is byte-compiled together. The same restriction applies to `getattr()`, `setattr()` and `delattr()`, as well as when referencing `__dict__` directly.

## 9.7. Odds and Ends

Sometimes it is useful to have a data type similar to the Pascal “record” or C “struct”, bundling together a few named data items. An empty class definition will do nicely:

```
class Employee:  
    pass  
  
john = Employee() # Create an empty employee record  
  
# Fill the fields of the record  
john.name = 'John Doe'  
john.dept = 'computer lab'  
john.salary = 1000
```

A piece of Python code that expects a particular abstract data type can often be passed a class that emulates the methods of that data type instead. For instance, if you have a function that formats some data from a file object, you can define a class with methods `read()` and `readline()` that get the data from a string buffer instead, and pass it as an argument.

Instance method objects have attributes, too: `m.__self__` is the instance object with the method `m()`, and `m.__func__` is the function object corresponding to the method.

## 9.8. Exceptions Are Classes Too

User-defined exceptions are identified by classes as well. Using this mechanism it is possible to create extensible hierarchies of exceptions.

There are two new valid (semantic) forms for the `raise` statement:

```
raise Class  
  
raise Instance
```

In the first form, `Class` must be an instance of `type` or of a class derived from it. The first form is a shorthand for:

```
raise Class()
```

A class in an `except` clause is compatible with an exception if it is the same class or a base class thereof (but not the other way around — an except clause listing a derived class is not compatible with a base class). For example, the following code will print B, C, D in that order:

```
class B(Exception):  
    pass  
class C(B):  
    pass  
class D(C):  
    pass  
  
for cls in [B, C, D]:
```

Page 67

Saturday, February 4, 2017 1:16 AM

```

try:
    raise cls()
except D:
    print("D")
except C:
    print("C")
except B:
    print("B")

```

Note that if the except clauses were reversed (with `except B` first), it would have printed B, B, B — the first matching except clause is triggered.

When an error message is printed for an unhandled exception, the exception's class name is printed, then a colon and a space, and finally the instance converted to a string using the built-in function `str\(\)`.

## 9.9. Iterators

By now you have probably noticed that most container objects can be looped over using a `for` statement:

```

for element in [1, 2, 3]:
    print(element)
for element in (1, 2, 3):
    print(element)
for key in {'one':1, 'two':2}:
    print(key)
for char in "123":
    print(char)
for line in open("myfile.txt"):
    print(line, end='')

```

This style of access is clear, concise, and convenient. The use of iterators pervades and unifies Python. Behind the scenes, the `for` statement calls `iter\(\)` on the container object. The function returns an iterator object that defines the method `next\(\)` which accesses elements in the container one at a time. When there are no more elements, `next\(\)` raises a `StopIteration` exception which tells the `for` loop to terminate. You can call the `next\(\)` method using the `next\(\)` built-in function; this example shows how it all works:

```

>>> s = 'abc'
>>> it = iter(s)
>>> it
<iterator object at 0x00A1DB50>
>>> next(it)
'a'
>>> next(it)
'b'
>>> next(it)
'c'
>>> next(it)
Traceback (most recent call last):
  File "<stdin>", line 1, in ?
    next(it)
StopIteration

```

Having seen the mechanics behind the iterator protocol, it is easy to add iterator behavior to your classes. Define an `iter\(\)` method which returns an object with a `next\(\)` method. If the class defines `\_\_next\_\_\(\)`, then `iter\(\)` can just return `self`:

```

class Reverse:
    """Iterator for looping over a sequence backwards."""
    def __init__(self, data):
        self.data = data
        self.index = len(data) - 1

```

# Page 68

Saturday, February 4, 2017 1:16 AM

```
def __iter__(self):
    return self
def __next__(self):
    if self.index == 0:
        raise StopIteration
    self.index = self.index - 1
    return self.data[self.index]

>>> rev = Reverse('spam')
>>> iter(rev)
<__main__.Reverse object at 0x00A1DB50>
>>> for char in rev:
...     print(char)
...
m
a
p
s
```

## 9.10. Generators

[Generators](#) are a simple and powerful tool for creating iterators. They are written like regular functions but use the `yield` statement whenever they want to return data. Each time `next()` is called on it, the generator resumes where it left-off (it remembers all the data values and which statement was last executed). An example shows that generators can be trivially easy to create:

```
def reverse(data):
    for index in range(len(data)-1, -1, -1):
        yield data[index]

>>> for char in reverse('golf'):
...     print(char)
...
f
l
o
g
```

Anything that can be done with generators can also be done with class based iterators as described in the previous section. What makes generators so compact is that the `__iter__()` and `__next__()` methods are created automatically.

Another key feature is that the local variables and execution state are automatically saved between calls. This made the function easier to write and much more clear than an approach using instance variables like `self.index` and `self.data`.

In addition to automatic method creation and saving program state, when generators terminate, they automatically raise `StopIteration`. In combination, these features make it easy to create iterators with no more effort than writing a regular function.

## 9.11. Generator Expressions

Some simple generators can be coded succinctly as expressions using a syntax similar to list comprehensions but with parentheses instead of brackets. These expressions are designed for situations where the generator is used right away by an enclosing function. Generator expressions are more compact but less versatile than full generator definitions and tend to be more memory friendly than equivalent list comprehensions.

Examples:

Page 69

Saturday, February 4, 2017 1:16 AM

```
>>> sum(i*i for i in range(10))          # sum of squares
285

>>> xvec = [10, 20, 30]
>>> yvec = [7, 5, 3]
>>> sum(x*y for x,y in zip(xvec, yvec))      # dot product
260

>>> from math import pi, sin
>>> sine_table = {x: sin(x*pi/180) for x in range(0, 91)}

>>> unique_words = set(word for line in page for word in line.split())

>>> valedictorian = max((student.gpa, student.name) for student in graduates)

>>> data = 'golf'
>>> list(data[i] for i in range(len(data)-1, -1, -1))
['f', 'l', 'o', 'g']
```

## Footnotes

[1] Except for one thing. Module objects have a secret read-only attribute called `__dict__` which returns the dictionary used to implement the module's namespace; the name `__dict__` is an attribute but not a global name. Obviously, using this violates the abstraction of namespace implementation, and should be restricted to things like post-mortem debuggers.

## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

# 10. Brief Tour of the Standard Library

## 10.1. Operating System Interface

# Page 70

Saturday, February 4, 2017 1:16 AM

The [os](#) module provides dozens of functions for interacting with the operating system:

```
>>> import os
>>> os.getcwd()      # Return the current working directory
'C:\\\\Python34'
>>> os.chdir('/server/accesslogs')  # Change current working directory
>>> os.system('mkdir today')    # Run the command mkdir in the system shell
0
```

Be sure to use the `import os` style instead of `from os import *`. This will keep [os.open\(\)](#) from shadowing the built-in [open\(\)](#) function which operates much differently.

The built-in [dir\(\)](#) and [help\(\)](#) functions are useful as interactive aids for working with large modules like [os](#):

```
>>> import os
>>> dir(os)
<returns a list of all module functions>
>>> help(os)
<returns an extensive manual page created from the module's docstrings>
```

For daily file and directory management tasks, the [shutil](#) module provides a higher level interface that is easier to use:

```
>>> import shutil
>>> shutil.copyfile('data.db', 'archive.db')
'archive.db'
>>> shutil.move('/build/executables', 'installdir')
'installdir'
```

## 10.2. File Wildcards

The [glob](#) module provides a function for making file lists from directory wildcard searches:

```
>>> import glob
>>> glob.glob('*.*')
['primes.py', 'random.py', 'quote.py']
```

## 10.3. Command Line Arguments

Common utility scripts often need to process command line arguments. These arguments are stored in the [sys](#) module's `argv` attribute as a list. For instance the following output results from running `python demo.py one two three` at the command line:

```
>>> import sys
>>> print(sys.argv)
['demo.py', 'one', 'two', 'three']
```

The  [getopt](#) module processes `sys.argv` using the conventions of the Unix [getopt\(\)](#) function. More powerful and flexible command line processing is provided by the [argparse](#) module.

## 10.4. Error Output Redirection and Program Termination

The [sys](#) module also has attributes for `stdin`, `stdout`, and `stderr`. The latter is useful for emitting warnings and error messages to make them visible even when `stdout` has been redirected:

```
>>> sys.stderr.write('Warning, log file not found starting a new one\\n')
Warning, log file not found starting a new one
```

Page 71

Saturday, February 4, 2017 1:16 AM

The most direct way to terminate a script is to use `sys.exit()`.

## 10.5. String Pattern Matching

The [re](#) module provides regular expression tools for advanced string processing. For complex matching and manipulation, regular expressions offer succinct, optimized solutions:

```
>>> import re
>>> re.findall(r'\bf[a-z]*', 'which foot or hand fell fastest')
['foot', 'fell', 'fastest']
>>> re.sub(r'(\b[a-z]+\b)', r'\1', 'cat in the the hat')
'cat in the hat'
```

When only simple capabilities are needed, string methods are preferred because they are easier to read and debug:

```
>>> 'tea for too'.replace('too', 'two')
'tea for two'
```

## 10.6. Mathematics

The [math](#) module gives access to the underlying C library functions for floating point math:

```
>>> import math
>>> math.cos(math.pi / 4)
0.70710678118654757
>>> math.log(1024, 2)
10.0
```

The [random](#) module provides tools for making random selections:

```
>>> import random
>>> random.choice(['apple', 'pear', 'banana'])
'apple'
>>> random.sample(range(100), 10)    # sampling without replacement
[30, 83, 16, 4, 8, 81, 41, 50, 18, 33]
>>> random.random()      # random float
0.17970987693706186
>>> random.randrange(6)    # random integer chosen from range(6)
4
```

The SciPy project <<http://scipy.org>> has many other modules for numerical computations.

## 10.7. Internet Access

There are a number of modules for accessing the internet and processing internet protocols. Two of the simplest are [urllib.request](#) for retrieving data from URLs and [smtplib](#) for sending mail:

```
>>> from urllib.request import urlopen
>>> for line in urlopen('http://tycho.usno.navy.mil/cgi-bin/timer.pl'):
...     line = line.decode('utf-8')    # Decoding the binary data to text.
...     if 'EST' in line or 'EDT' in line:    # look for Eastern Time
...         print(line)

<BR>Nov. 25, 09:43:32 PM EST

>>> import smtplib
>>> server = smtplib.SMTP('localhost')
>>> server.sendmail('soothsayer@example.org', 'jcaesar@example.org',
... """To: jcaesar@example.org
```

Page 72

Saturday, February 4, 2017 1:16 AM

```
... From: soothsayer@example.org
...
... Beware the Ides of March.
... """
>>> server.quit()
```

(Note that the second example needs a mailserver running on localhost.)

## 10.8. Dates and Times

The [datetime](#) module supplies classes for manipulating dates and times in both simple and complex ways. While date and time arithmetic is supported, the focus of the implementation is on efficient member extraction for output formatting and manipulation. The module also supports objects that are timezone aware.

```
>>> # dates are easily constructed and formatted
>>> from datetime import date
>>> now = date.today()
>>> now
datetime.date(2003, 12, 2)
>>> now.strftime("%m-%d-%Y. %d %b %Y is a %A on the %d day of %B.")
'12-02-03. 02 Dec 2003 is a Tuesday on the 02 day of December.'

>>> # dates support calendar arithmetic
>>> birthday = date(1964, 7, 31)
>>> age = now - birthday
>>> age.days
14368
```

## 10.9. Data Compression

Common data archiving and compression formats are directly supported by modules including: [zlib](#), [gzip](#), [bz2](#), [lzma](#), [zipfile](#) and [tarfile](#).

```
>>> import zlib
>>> s = b'witch which has which witches wrist watch'
>>> len(s)
41
>>> t = zlib.compress(s)
>>> len(t)
37
>>> zlib.decompress(t)
b'witch which has which witches wrist watch'
>>> zlib.crc32(s)
226805979
```

## 10.10. Performance Measurement

Some Python users develop a deep interest in knowing the relative performance of different approaches to the same problem. Python provides a measurement tool that answers those questions immediately.

For example, it may be tempting to use the tuple packing and unpacking feature instead of the traditional approach to swapping arguments. The [timeit](#) module quickly demonstrates a modest performance advantage:

```
>>> from timeit import Timer
>>> Timer('t=a; a=b; b=t', 'a=1; b=2').timeit()
0.57535828626024577
>>> Timer('a,b = b,a', 'a=1; b=2').timeit()
0.54962537085770791
```

Page 73

Saturday, February 4, 2017 1:16 AM

In contrast to `timeit`'s fine level of granularity, the `profile` and `pstats` modules provide tools for identifying time critical sections in larger blocks of code.

## 10.11. Quality Control

One approach for developing high quality software is to write tests for each function as it is developed and to run those tests frequently during the development process.

The `doctest` module provides a tool for scanning a module and validating tests embedded in a program's docstrings. Test construction is as simple as cutting-and-pasting a typical call along with its results into the docstring. This improves the documentation by providing the user with an example and it allows the doctest module to make sure the code remains true to the documentation:

```
def average(values):
    """Computes the arithmetic mean of a list of numbers.

    >>> print(average([20, 30, 70]))
    40.0
    """
    return sum(values) / len(values)

import doctest
doctest.testmod()  # automatically validate the embedded tests
```

The `unittest` module is not as effortless as the `doctest` module, but it allows a more comprehensive set of tests to be maintained in a separate file:

```
import unittest

class TestStatisticalFunctions(unittest.TestCase):

    def test_average(self):
        self.assertEqual(average([20, 30, 70]), 40.0)
        self.assertEqual(round(average([1, 5, 7]), 1), 4.3)
        with self.assertRaises(ZeroDivisionError):
            average([])
        with self.assertRaises(TypeError):
            average(20, 30, 70)

unittest.main() # Calling from the command line invokes all tests
```

## 10.12. Batteries Included

Python has a “batteries included” philosophy. This is best seen through the sophisticated and robust capabilities of its larger packages. For example:

- The `xmlrpc.client` and `xmlrpc.server` modules make implementing remote procedure calls into an almost trivial task. Despite the modules names, no direct knowledge or handling of XML is needed.
- The `email` package is a library for managing email messages, including MIME and other RFC 2822-based message documents. Unlike `smtplib` and `poplib` which actually send and receive messages, the `email` package has a complete toolset for building or decoding complex message structures (including attachments) and for implementing internet encoding and header protocols.
- The `xml.dom` and `xml.sax` packages provide robust support for parsing this popular data interchange format. Likewise, the `csv` module supports direct reads and writes in a common database format. Together, these modules and packages greatly simplify data interchange between Python applications and other tools.
- Internationalization is supported by a number of modules including `gettext`, `locale`, and the `codecs` package.

Page 74

Saturday, February 4, 2017 1:16 AM

## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

# 11. Brief Tour of the Standard Library – Part II

This second tour covers more advanced modules that support professional programming needs. These modules rarely occur in small scripts.

## 11.1. Output Formatting

The [reprlib](#) module provides a version of [repr\(\)](#) customized for abbreviated displays of large or deeply nested containers:

```
>>> import reprlib
>>> reprlib.repr(set('supercalifragilisticexpialidocious'))
"set(['a', 'c', 'd', 'e', 'f', 'g', ...])"
```

The [pprint](#) module offers more sophisticated control over printing both built-in and user defined objects in a way that is readable by the interpreter. When the result is longer than one line, the “pretty printer” adds line breaks and indentation to more clearly reveal data structure:

```
>>> import pprint
>>> t = [[['black', 'cyan'], 'white', ['green', 'red']], [['magenta',
...     'yellow'], 'blue']]
...
>>> pprint.pprint(t, width=30)
[[['black', 'cyan'],
  'white',
  ['green', 'red']],
 [['magenta', 'yellow'],
  'blue']]
```

Page 75

Saturday, February 4, 2017 1:16 AM

The [textwrap](#) module formats paragraphs of text to fit a given screen width:

```
>>> import textwrap
>>> doc = """The wrap() method is just like fill() except that it returns
... a list of strings instead of one big string with newlines to separate
... the wrapped lines."""
...
>>> print(textwrap.fill(doc, width=40))
The wrap() method is just like fill()
except that it returns a list of strings
instead of one big string with newlines
to separate the wrapped lines.
```

The [locale](#) module accesses a database of culture specific data formats. The grouping attribute of locale's format function provides a direct way of formatting numbers with group separators:

```
>>> import locale
>>> locale.setlocale(locale.LC_ALL, 'English_United States.1252')
'English_United States.1252'
>>> conv = locale.localeconv()           # get a mapping of conventions
>>> x = 1234567.8
>>> locale.format("%d", x, grouping=True)
'1,234,567'
>>> locale.format_string("%s.%f", (conv['currency_symbol'],
...                                 conv['frac_digits'], x), grouping=True)
'$1,234,567.80'
```

## 11.2. Templating

The [string](#) module includes a versatile [Template](#) class with a simplified syntax suitable for editing by end-users. This allows users to customize their applications without having to alter the application.

The format uses placeholder names formed by \$ with valid Python identifiers (alphanumeric characters and underscores). Surrounding the placeholder with braces allows it to be followed by more alphanumeric letters with no intervening spaces. Writing \$\$ creates a single escaped \$:

```
>>> from string import Template
>>> t = Template('${village}folk send $$10 to $cause.')
>>> t.substitute(village='Nottingham', cause='the ditch fund')
'Nottinghamfolk send $10 to the ditch fund.'
```

The [substitute\(\)](#) method raises a [KeyError](#) when a placeholder is not supplied in a dictionary or a keyword argument. For mail-merge style applications, user supplied data may be incomplete and the [safe\\_substitute\(\)](#) method may be more appropriate — it will leave placeholders unchanged if data is missing:

```
>>> t = Template('Return the $item to $owner.')
>>> d = dict(item='unladen swallow')
>>> t.substitute(d)
Traceback (most recent call last):
...
KeyError: 'owner'
>>> t.safe_substitute(d)
'Return the unladen swallow to $owner.'
```

Template subclasses can specify a custom delimiter. For example, a batch renaming utility for a photo browser may elect to use percent signs for placeholders such as the current date, image sequence number, or file format:

```
>>> import time, os.path
>>> photofiles = ['img_1074.jpg', 'img_1076.jpg', 'img_1077.jpg']
>>> class BatchRename(Template):
...     delimiter = '%'
```

# Page 76

Saturday, February 4, 2017 1:16 AM

```
>>> fmt = input('Enter rename style (%d-date %n-seqnum %f-format): ')
Enter rename style (%d-date %n-seqnum %f-format): Ashley_%n%f

>>> t = BatchRename(fmt)
>>> date = time.strftime('%d%b%y')
>>> for i, filename in enumerate(photofiles):
...     base, ext = os.path.splitext(filename)
...     newname = t.substitute(d=date, n=i, f=ext)
...     print('{0} --> {1}'.format(filename, newname))

img_1074.jpg --> Ashley_0.jpg
img_1076.jpg --> Ashley_1.jpg
img_1077.jpg --> Ashley_2.jpg
```

Another application for templating is separating program logic from the details of multiple output formats. This makes it possible to substitute custom templates for XML files, plain text reports, and HTML web reports.

## 11.3. Working with Binary Data Record Layouts

The [struct](#) module provides [pack\(\)](#) and [unpack\(\)](#) functions for working with variable length binary record formats. The following example shows how to loop through header information in a ZIP file without using the [zipfile](#) module. Pack codes "H" and "I" represent two and four byte unsigned numbers respectively. The "<" indicates that they are standard size and in little-endian byte order:

```
import struct

with open('myfile.zip', 'rb') as f:
    data = f.read()

start = 0
for i in range(3):                      # show the first 3 file headers
    start += 14
    fields = struct.unpack('<IIIIHH', data[start:start+16])
    crc32, comp_size, uncomp_size, filenamesize, extra_size = fields

    start += 16
    filename = data[start:start+filenamesize]
    start += filenamesize
    extra = data[start:start+extra_size]
    print(filename, hex(crc32), comp_size, uncomp_size)

    start += extra_size + comp_size      # skip to the next header
```

## 11.4. Multi-threading

Threading is a technique for decoupling tasks which are not sequentially dependent. Threads can be used to improve the responsiveness of applications that accept user input while other tasks run in the background. A related use case is running I/O in parallel with computations in another thread.

The following code shows how the high level [threading](#) module can run tasks in background while the main program continues to run:

```
import threading, zipfile

class AsyncZip(threading.Thread):
    def __init__(self, infile, outfile):
        threading.Thread.__init__(self)
        self.infile = infile
        self.outfile = outfile
    def run(self):
        f = zipfile.ZipFile(self.outfile, 'w', zipfile.ZIP_DEFLATED)
```

Page 77

Saturday, February 4, 2017 1:16 AM

```
f.write(self.infile)
f.close()
print('Finished background zip of:', self.infile)

background = AsyncZip('mydata.txt', 'myarchive.zip')
background.start()
print('The main program continues to run in foreground.')

background.join()      # Wait for the background task to finish
print('Main program waited until background was done.')
```

The principal challenge of multi-threaded applications is coordinating threads that share data or other resources. To that end, the `threading` module provides a number of synchronization primitives including locks, events, condition variables, and semaphores.

While those tools are powerful, minor design errors can result in problems that are difficult to reproduce. So, the preferred approach to task coordination is to concentrate all access to a resource in a single thread and then use the `queue` module to feed that thread with requests from other threads. Applications using `Queue` objects for inter-thread communication and coordination are easier to design, more readable, and more reliable.

## 11.5. Logging

The `logging` module offers a full featured and flexible logging system. At its simplest, log messages are sent to a file or to `sys.stderr`:

```
import logging
logging.debug('Debugging information')
logging.info('Informational message')
logging.warning('Warning:config file %s not found', 'server.conf')
logging.error('Error occurred')
logging.critical('Critical error -- shutting down')
```

This produces the following output:

```
WARNING:root:Warning:config file server.conf not found
ERROR:root:Error occurred
CRITICAL:root:Critical error -- shutting down
```

By default, informational and debugging messages are suppressed and the output is sent to standard error. Other output options include routing messages through email, datagrams, sockets, or to an HTTP Server. New filters can select different routing based on message priority: DEBUG, INFO, WARNING, ERROR, and CRITICAL.

The logging system can be configured directly from Python or can be loaded from a user editable configuration file for customized logging without altering the application.

## 11.6. Weak References

Python does automatic memory management (reference counting for most objects and [garbage collection](#) to eliminate cycles). The memory is freed shortly after the last reference to it has been eliminated.

This approach works fine for most applications but occasionally there is a need to track objects only as long as they are being used by something else. Unfortunately, just tracking them creates a reference that makes them permanent. The `weakref` module provides tools for tracking objects without creating a reference. When the object is no longer needed, it is automatically removed from a weakref table and a callback is triggered for weakref objects. Typical applications include caching objects that are expensive to create:

```
>>> import weakref, gc
>>> class A:
```

Page 78

Saturday, February 4, 2017 1:16 AM

```

...
    def __init__(self, value):
...
        self.value = value
...
    def __repr__(self):
...
        return str(self.value)
...
>>> a = A(10)                      # create a reference
>>> d = weakref.WeakValueDictionary()
>>> d['primary'] = a                # does not create a reference
>>> d['primary']                   # fetch the object if it is still alive
10
>>> del a                         # remove the one reference
>>> gc.collect()                   # run garbage collection right away
0
>>> d['primary']                  # entry was automatically removed
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
    d['primary']                   # entry was automatically removed
  File "C:/python34/lib/weakref.py", line 46, in __getitem__
    o = self.data[key]()
KeyError: 'primary'

```

## 11.7. Tools for Working with Lists

Many data structure needs can be met with the built-in list type. However, sometimes there is a need for alternative implementations with different performance trade-offs.

The [array](#) module provides an [array\(\)](#) object that is like a list that stores only homogeneous data and stores it more compactly. The following example shows an array of numbers stored as two byte unsigned binary numbers (typecode "H") rather than the usual 16 bytes per entry for regular lists of Python int objects:

```

>>> from array import array
>>> a = array('H', [4000, 10, 700, 22222])
>>> sum(a)
26932
>>> a[1:3]
array('H', [10, 700])

```

The [collections](#) module provides a [deque\(\)](#) object that is like a list with faster appends and pops from the left side but slower lookups in the middle. These objects are well suited for implementing queues and breadth first tree searches:

```

>>> from collections import deque
>>> d = deque(["task1", "task2", "task3"])
>>> d.append("task4")
>>> print("Handling", d.popleft())
Handling task1

unsearched = deque([starting_node])
def breadth_first_search(unsearched):
    node = unsearched.popleft()
    for m in gen_moves(node):
        if is_goal(m):
            return m
        unsearched.append(m)

```

In addition to alternative list implementations, the library also offers other tools such as the [bisect](#) module with functions for manipulating sorted lists:

```

>>> import bisect
>>> scores = [(100, 'perl'), (200, 'tcl'), (400, 'lua'), (500, 'python')]
>>> bisect.insort(scores, (300, 'ruby'))
>>> scores

```

Page 79

Saturday, February 4, 2017 1:16 AM

```
[100, 'perl'), (200, 'tcl'), (300, 'ruby'), (400, 'lua'), (500, 'python')]
```

The [heappq](#) module provides functions for implementing heaps based on regular lists. The lowest valued entry is always kept at position zero. This is useful for applications which repeatedly access the smallest element but do not want to run a full list sort:

```
>>> from heapq import heapify, heappop, heappush
>>> data = [1, 3, 5, 7, 9, 2, 4, 6, 8, 0]
>>> heapify(data)                      # rearrange the list into heap order
>>> heappush(data, -5)                 # add a new entry
>>> [heappop(data) for i in range(3)]  # fetch the three smallest entries
[-5, 0, 1]
```

## 11.8. Decimal Floating Point Arithmetic

The [decimal](#) module offers a [Decimal](#) datatype for decimal floating point arithmetic. Compared to the built-in [float](#) implementation of binary floating point, the class is especially helpful for

- financial applications and other uses which require exact decimal representation,
- control over precision,
- control over rounding to meet legal or regulatory requirements,
- tracking of significant decimal places, or
- applications where the user expects the results to match calculations done by hand.

For example, calculating a 5% tax on a 70 cent phone charge gives different results in decimal floating point and binary floating point. The difference becomes significant if the results are rounded to the nearest cent:

```
>>> from decimal import *
>>> round(Decimal('0.70') * Decimal('1.05'), 2)
Decimal('0.74')
>>> round(.70 * 1.05, 2)
0.73
```

The [Decimal](#) result keeps a trailing zero, automatically inferring four place significance from multiplicands with two place significance. Decimal reproduces mathematics as done by hand and avoids issues that can arise when binary floating point cannot exactly represent decimal quantities.

Exact representation enables the [Decimal](#) class to perform modulo calculations and equality tests that are unsuitable for binary floating point:

```
>>> Decimal('1.00') % Decimal('.10')
Decimal('0.00')
>>> 1.00 % 0.10
0.09999999999999995

>>> sum([Decimal('0.1')]*10) == Decimal('1.0')
True
>>> sum([0.1]*10) == 1.0
False
```

The [decimal](#) module provides arithmetic with as much precision as needed:

```
>>> getcontext().prec = 36
>>> Decimal(1) / Decimal(7)
Decimal('0.142857142857142857142857142857142857')
```

## Navigation

- [index](#)

# Page 80

Saturday, February 4, 2017 1:16 AM

- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

## 12. What Now?

Reading this tutorial has probably reinforced your interest in using Python — you should be eager to apply Python to solving your real-world problems. Where should you go to learn more?

This tutorial is part of Python’s documentation set. Some other documents in the set are:

- [\*The Python Standard Library\*](#):

You should browse through this manual, which gives complete (though terse) reference material about types, functions, and the modules in the standard library. The standard Python distribution includes a *lot* of additional code. There are modules to read Unix mailboxes, retrieve documents via HTTP, generate random numbers, parse command-line options, write CGI programs, compress data, and many other tasks. Skimming through the Library Reference will give you an idea of what’s available.

- [\*Installing Python Modules\*](#) explains how to install additional modules written by other Python users.
- [\*The Python Language Reference\*](#): A detailed explanation of Python’s syntax and semantics. It’s heavy reading, but is useful as a complete guide to the language itself.

More Python resources:

- <http://www.python.org>: The major Python Web site. It contains code, documentation, and pointers to Python-related pages around the Web. This Web site is mirrored in various places around the world, such as Europe, Japan, and Australia; a mirror may be faster than the main site, depending on your geographical location.
- <http://docs.python.org>: Fast access to Python’s documentation.
- <http://pypi.python.org>: The Python Package Index, previously also nicknamed the Cheese Shop, is an index of user-created Python modules that are available for download. Once you begin releasing code, you can register it here so that others can find it.
- <http://aspn.activestate.com/ASPN/Python/Cookbook/>: The Python Cookbook is a sizable collection of code examples, larger modules, and useful scripts. Particularly notable contributions are collected in a book also

Page 81

Saturday, February 4, 2017 1:16 AM

titled Python Cookbook (O'Reilly & Associates, ISBN 0-596-00797-3.)

- <http://scipy.org>: The Scientific Python project includes modules for fast array computations and manipulations plus a host of packages for such things as linear algebra, Fourier transforms, non-linear solvers, random number distributions, statistical analysis and the like.

For Python-related questions and problem reports, you can post to the newsgroup *comp.lang.python*, or send them to the mailing list at [python-list@python.org](mailto:python-list@python.org). The newsgroup and mailing list are gatewayed, so messages posted to one will automatically be forwarded to the other. There are around 120 postings a day (with peaks up to several hundred), asking (and answering) questions, suggesting new features, and announcing new modules. Before posting, be sure to check the list of [Frequently Asked Questions](#) (also called the FAQ). Mailing list archives are available at <http://mail.python.org/pipermail/>. The FAQ answers many of the questions that come up again and again, and may already contain the solution for your problem.

## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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Created using [Sphinx](#) 1.2.2.

## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

# 13. Interactive Input Editing and History Substitution

Some versions of the Python interpreter support editing of the current input line and history substitution, similar to facilities found in the Korn shell and the GNU Bash shell. This is implemented using the [GNU Readline](#) library, which supports various styles of editing. This library has its own documentation which we won't duplicate here.

## 13.1. Tab Completion and History Editing

Completion of variable and module names is [automatically enabled](#) at interpreter startup so that the Tab key invokes the completion function; it looks at Python statement names, the current local variables, and the available module names. For dotted expressions such as `string.a`, it will evaluate the expression up to the final '.' and then suggest completions from the attributes of the resulting object. Note that this may execute application-defined code if an object with a `__getattr__()` method is part of the expression. The default configuration also saves your history into a file named `.python_history` in your user directory. The history will be available again during the next

Page 82

Saturday, February 4, 2017 1:16 AM

interactive interpreter session.

## 13.2. Alternatives to the Interactive Interpreter

This facility is an enormous step forward compared to earlier versions of the interpreter; however, some wishes are left: It would be nice if the proper indentation were suggested on continuation lines (the parser knows if an indent token is required next). The completion mechanism might use the interpreter's symbol table. A command to check (or even suggest) matching parentheses, quotes, etc., would also be useful.

One alternative enhanced interactive interpreter that has been around for quite some time is [IPython](#), which features tab completion, object exploration and advanced history management. It can also be thoroughly customized and embedded into other applications. Another similar enhanced interactive environment is [bpython](#).

### Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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Created using [Sphinx](#) 1.2.2.

### Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

## 14. Floating Point Arithmetic: Issues and Limitations

Floating-point numbers are represented in computer hardware as base 2 (binary) fractions. For example, the decimal fraction

0.125

has value  $1/10 + 2/100 + 5/1000$ , and in the same way the binary fraction

0.001

has value  $0/2 + 0/4 + 1/8$ . These two fractions have identical values, the only real difference being that the first is written in base 10 fractional notation, and the second in base 2.

Page 83

Saturday, February 4, 2017 1:16 AM

Unfortunately, most decimal fractions cannot be represented exactly as binary fractions. A consequence is that, in general, the decimal floating-point numbers you enter are only approximated by the binary floating-point numbers actually stored in the machine.

The problem is easier to understand at first in base 10. Consider the fraction 1/3. You can approximate that as a base 10 fraction:

0.3

or, better,

0.33

or, better,

0.333

and so on. No matter how many digits you're willing to write down, the result will never be exactly 1/3, but will be an increasingly better approximation of 1/3.

In the same way, no matter how many base 2 digits you're willing to use, the decimal value 0.1 cannot be represented exactly as a base 2 fraction. In base 2, 1/10 is the infinitely repeating fraction

```
0.000110011001100110011001100110011001100110011001100110011...
```

Stop at any finite number of bits, and you get an approximation. On most machines today, floats are approximated using a binary fraction with the numerator using the first 53 bits starting with the most significant bit and with the denominator as a power of two. In the case of 1/10, the binary fraction is 3602879701896397 / 2 \*\* 55 which is close to but not exactly equal to the true value of 1/10.

Many users are not aware of the approximation because of the way values are displayed. Python only prints a decimal approximation to the true decimal value of the binary approximation stored by the machine. On most machines, if Python were to print the true decimal value of the binary approximation stored for 0.1, it would have to display

```
>>> 0.1  
0.100000000000000055511151231257827021181583404541015625
```

That is more digits than most people find useful, so Python keeps the number of digits manageable by displaying a rounded value instead

```
>>> 1 / 10  
0.1
```

Just remember, even though the printed result looks like the exact value of 1/10, the actual stored value is the nearest representable binary fraction.

Interestingly, there are many different decimal numbers that share the same nearest approximate binary fraction. For example, the numbers 0.1 and 0.1000000000000001 and

0.100000000000000055511151231257827021181583404541015625 are all approximated by 3602879701896397 / 2 \*\* 55. Since all of these decimal values share the same approximation, any one of them could be displayed while still preserving the invariant `eval(repr(x)) == x`.

Historically, the Python prompt and built-in `repr()` function would choose the one with 17 significant digits, 0.1000000000000001. Starting with Python 3.1, Python (on most systems) is now able to choose the shortest of these and simply display 0.1.

Page 84

Saturday, February 4, 2017 1:16 AM

Note that this is in the very nature of binary floating-point: this is not a bug in Python, and it is not a bug in your code either. You'll see the same kind of thing in all languages that support your hardware's floating-point arithmetic (although some languages may not *display* the difference by default, or in all output modes).

For more pleasant output, you may wish to use string formatting to produce a limited number of significant digits:

```
>>> format(math.pi, '.12g') # give 12 significant digits  
'3.14159265359'  
  
>>> format(math.pi, '.2f') # give 2 digits after the point  
'3.14'  
  
>>> repr(math.pi)  
'3.141592653589793'
```

It's important to realize that this is, in a real sense, an illusion: you're simply rounding the *display* of the true machine value.

One illusion may beget another. For example, since 0.1 is not exactly 1/10, summing three values of 0.1 may not yield exactly 0.3, either:

```
>>> .1 + .1 + .1 == .3  
False
```

Also, since the 0.1 cannot get any closer to the exact value of 1/10 and 0.3 cannot get any closer to the exact value of 3/10, then pre-rounding with [round\(\)](#) function cannot help:

```
>>> round(.1, 1) + round(.1, 1) + round(.1, 1) == round(.3, 1)  
False
```

Though the numbers cannot be made closer to their intended exact values, the [round\(\)](#) function can be useful for post-rounding so that results with inexact values become comparable to one another:

```
>>> round(.1 + .1 + .1, 10) == round(.3, 10)  
True
```

Binary floating-point arithmetic holds many surprises like this. The problem with “0.1” is explained in precise detail below, in the “Representation Error” section. See [The Perils of Floating Point](#) for a more complete account of other common surprises.

As that says near the end, “there are no easy answers.” Still, don’t be unduly wary of floating-point! The errors in Python float operations are inherited from the floating-point hardware, and on most machines are on the order of no more than 1 part in  $2^{**}53$  per operation. That’s more than adequate for most tasks, but you do need to keep in mind that it’s not decimal arithmetic and that every float operation can suffer a new rounding error.

While pathological cases do exist, for most casual use of floating-point arithmetic you’ll see the result you expect in the end if you simply round the display of your final results to the number of decimal digits you expect. [str\(\)](#) usually suffices, and for finer control see the [str.format\(\)](#) method’s format specifiers in [Format String Syntax](#).

For use cases which require exact decimal representation, try using the [decimal](#) module which implements decimal arithmetic suitable for accounting applications and high-precision applications.

Another form of exact arithmetic is supported by the [fractions](#) module which implements arithmetic based on rational numbers (so the numbers like 1/3 can be represented exactly).

If you are a heavy user of floating point operations you should take a look at the Numerical Python package and many other packages for mathematical and statistical operations supplied by the SciPy project. See [<http://scipy.org>](http://scipy.org).

Page 85

Saturday, February 4, 2017 1:16 AM

Python provides tools that may help on those rare occasions when you really *do* want to know the exact value of a float. The [float.as\\_integer\\_ratio\(\)](#) method expresses the value of a float as a fraction:

```
>>> x = 3.14159
>>> x.as_integer_ratio()
(3537115888337719, 1125899906842624)
```

Since the ratio is exact, it can be used to losslessly recreate the original value:

```
>>> x == 3537115888337719 / 1125899906842624
True
```

The [float.hex\(\)](#) method expresses a float in hexadecimal (base 16), again giving the exact value stored by your computer:

```
>>> x.hex()
'0x1.921f9f01b866ep+1'
```

This precise hexadecimal representation can be used to reconstruct the float value exactly:

```
>>> x == float.fromhex('0x1.921f9f01b866ep+1')
True
```

Since the representation is exact, it is useful for reliably porting values across different versions of Python (platform independence) and exchanging data with other languages that support the same format (such as Java and C99).

Another helpful tool is the [math.fsum\(\)](#) function which helps mitigate loss-of-precision during summation. It tracks “lost digits” as values are added onto a running total. That can make a difference in overall accuracy so that the errors do not accumulate to the point where they affect the final total:

```
>>> sum([0.1] * 10) == 1.0
False
>>> math.fsum([0.1] * 10) == 1.0
True
```

## 14.1. Representation Error

This section explains the “0.1” example in detail, and shows how you can perform an exact analysis of cases like this yourself. Basic familiarity with binary floating-point representation is assumed.

*Representation error* refers to the fact that some (most, actually) decimal fractions cannot be represented exactly as binary (base 2) fractions. This is the chief reason why Python (or Perl, C, C++, Java, Fortran, and many others) often won’t display the exact decimal number you expect.

Why is that?  $1/10$  is not exactly representable as a binary fraction. Almost all machines today (November 2000) use IEEE-754 floating point arithmetic, and almost all platforms map Python floats to IEEE-754 “double precision”. 754 doubles contain 53 bits of precision, so on input the computer strives to convert  $0.1$  to the closest fraction it can of the form  $J/2^{**N}$  where  $J$  is an integer containing exactly 53 bits. Rewriting

$1 / 10 \approx J / (2^{**N})$

as

$J \approx 2^{**N} / 10$

and recalling that  $J$  has exactly 53 bits (is  $\geq 2^{**52}$  but  $< 2^{**53}$ ), the best value for  $N$  is 56:

# Page 86

Saturday, February 4, 2017 1:16 AM

```
>>> 2**52 <= 2**56 // 10 < 2**53
True
```

That is, 56 is the only value for  $N$  that leaves  $J$  with exactly 53 bits. The best possible value for  $J$  is then that quotient rounded:

```
>>> q, r = divmod(2**56, 10)
>>> r
6
```

Since the remainder is more than half of 10, the best approximation is obtained by rounding up:

```
>>> q+1
7205759403792794
```

Therefore the best possible approximation to  $1/10$  in 754 double precision is:

```
7205759403792794 / 2 ** 56
```

Dividing both the numerator and denominator by two reduces the fraction to:

```
3602879701896397 / 2 ** 55
```

Note that since we rounded up, this is actually a little bit larger than  $1/10$ ; if we had not rounded up, the quotient would have been a little bit smaller than  $1/10$ . But in no case can it be *exactly*  $1/10$ !

So the computer never “sees”  $1/10$ : what it sees is the exact fraction given above, the best 754 double approximation it can get:

```
>>> 0.1 * 2 ** 55
3602879701896397.0
```

If we multiply that fraction by  $10^{55}$ , we can see the value out to 55 decimal digits:

```
>>> 3602879701896397 * 10 ** 55 // 2 ** 55
1000000000000000055511151231257827021181583404541015625
```

meaning that the exact number stored in the computer is equal to the decimal value 0.1000000000000000055511151231257827021181583404541015625. Instead of displaying the full decimal value, many languages (including older versions of Python), round the result to 17 significant digits:

```
>>> format(0.1, '.17f')
'0.10000000000000001'
```

The [fractions](#) and [decimal](#) modules make these calculations easy:

```
>>> from decimal import Decimal
>>> from fractions import Fraction

>>> Fraction.from_float(0.1)
Fraction(3602879701896397, 36028797018963968)

>>> (0.1).as_integer_ratio()
(3602879701896397, 36028797018963968)

>>> Decimal.from_float(0.1)
Decimal('0.100000000000000055511151231257827021181583404541015625')

>>> format(Decimal.from_float(0.1), '.17')
'0.10000000000000001'
```

Page 87

Saturday, February 4, 2017 1:16 AM

## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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## Navigation

- [index](#)
- [modules](#) |
- [next](#) |
- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

# 15. Appendix

## 15.1. Interactive Mode

### 15.1.1. Error Handling

When an error occurs, the interpreter prints an error message and a stack trace. In interactive mode, it then returns to the primary prompt; when input came from a file, it exits with a nonzero exit status after printing the stack trace. (Exceptions handled by an `except` clause in a `try` statement are not errors in this context.) Some errors are unconditionally fatal and cause an exit with a nonzero exit; this applies to internal inconsistencies and some cases of running out of memory. All error messages are written to the standard error stream; normal output from executed commands is written to standard output.

Typing the interrupt character (usually Control-C or DEL) to the primary or secondary prompt cancels the input and returns to the primary prompt. [1] Typing an interrupt while a command is executing raises the `KeyboardInterrupt` exception, which may be handled by a `try` statement.

### 15.1.2. Executable Python Scripts

On BSD'ish Unix systems, Python scripts can be made directly executable, like shell scripts, by putting the line

```
#!/usr/bin/env python3.4
```

(assuming that the interpreter is on the user's `PATH`) at the beginning of the script and giving the file an executable mode. The `#!` must be the first two characters of the file. On some platforms, this first line must end with a Unix-style line ending ('`\n`'), not a Windows ('`\r\n`') line ending. Note that the hash, or pound, character, '`#`', is used to start a comment in Python.

# Page 88

Saturday, February 4, 2017 1:16 AM

The script can be given an executable mode, or permission, using the `chmod` command.

```
$ chmod +x myscript.py
```

On Windows systems, there is no notion of an “executable mode”. The Python installer automatically associates `.py` files with `python.exe` so that a double-click on a Python file will run it as a script. The extension can also be `.pyw`, in that case, the console window that normally appears is suppressed.

### 15.1.3. The Interactive Startup File

When you use Python interactively, it is frequently handy to have some standard commands executed every time the interpreter is started. You can do this by setting an environment variable named `PYTHONSTARTUP` to the name of a file containing your start-up commands. This is similar to the `.profile` feature of the Unix shells.

This file is only read in interactive sessions, not when Python reads commands from a script, and not when `/dev/tty` is given as the explicit source of commands (which otherwise behaves like an interactive session). It is executed in the same namespace where interactive commands are executed, so that objects that it defines or imports can be used without qualification in the interactive session. You can also change the prompts `sys.ps1` and `sys.ps2` in this file.

If you want to read an additional start-up file from the current directory, you can program this in the global start-up file using code like `if os.path.isfile('.pythonrc.py'): exec(open('.pythonrc.py').read())`. If you want to use the startup file in a script, you must do this explicitly in the script:

```
import os
filename = os.environ.get('PYTHONSTARTUP')
if filename and os.path.isfile(filename):
    with open(filename) as fobj:
        startup_file = fobj.read()
    exec(startup_file)
```

### 15.1.4. The Customization Modules

Python provides two hooks to let you customize it: `sitemodules` and `usercustomize`. To see how it works, you need first to find the location of your user site-packages directory. Start Python and run this code:

```
>>> import site
>>> site.getusersitepackages()
'/home/user/.local/lib/python3.4/site-packages'
```

Now you can create a file named `usercustomize.py` in that directory and put anything you want in it. It will affect every invocation of Python, unless it is started with the `-s` option to disable the automatic import.

`sitemodules` works in the same way, but is typically created by an administrator of the computer in the global site-packages directory, and is imported before `usercustomize`. See the documentation of the `site` module for more details.

Footnotes

[1] A problem with the GNU Readline package may prevent this.

## Navigation

- [index](#)
- [modules](#) |
- [next](#) |

Page 89

Saturday, February 4, 2017 1:16 AM

- [previous](#) |
- 
- [Python](#) »
- [3.4.2 Documentation](#) »
- [The Python Tutorial](#) »

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# Join and split Method

Tuesday, February 21, 2017 12:05 AM

## String join() Method

### Description

The **join()** method returns a string in which the string elements of sequence have been joined by str separator.

### Syntax

Following is the syntax for join() method-

```
str.join(sequence)
```

- This function is opposite to following 'split' function,  
This method joins using a str, and split() method splits using a separator.

## String split() Method

Previous

### Description

The **split()** method returns a list of all the words in the string, using str as the separator (splits on all whitespace if left unspecified), optionally limiting the number of splits to num.

### Syntax

Following is the syntax for split() method-

```
str.split(str="", num=string.count(str)).
```

### Parameters

- **str** - This is any delimiter, by default it is space.
- **num** - this is number of lines to be made

### Return Value

This method returns a list of lines.

# Introduction

Tuesday, February 21, 2017 10:57 AM

## Introduction to NumPy

"NumPy is the fundamental package for scientific computing with Python" ([www.numpy.org](http://www.numpy.org))

- Python variable are references which points to object in memory, Although it is very flexible and allows heterogeneous data in a container, it is not memory efficient when dealing with lots of values of same type.
- NumPy let us create C type arrays in python.

### The Basics

NumPy's main object is the homogeneous multidimensional array. It is a table of elements (usually numbers), all of the same type, indexed by a tuple of positive integers. In NumPy dimensions are called *axes*. The number of axes is *rank*.

For example, the coordinates of a point in 3D space [1, 2, 1] is an array of rank 1, because it has one axis. That axis has a length of 3. In the example pictured below, the array has rank 2 (it is 2-dimensional). The first dimension (axis) has a length of 2, the second dimension has a length of 3.

```
[[ 1., 0., 0.],  
 [ 0., 1., 2.]]
```

## NumPy Arrays

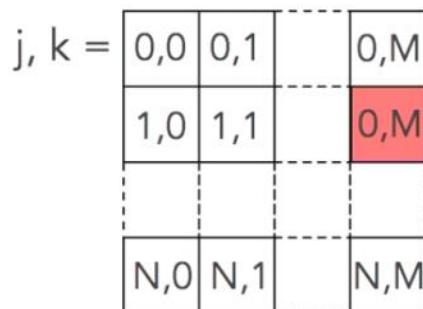


actual data items;  
all have same size

$v[j]$

$\text{ndim} = 1$

$\text{shape} = (N,)$



$A[j,k]$

$\text{ndim} = 2$

$\text{shape} = (N,M)$

## ① NumPy dtypes

- Integers: numpy.int8, numpy.int16, **numpy.int32**, numpy.int64. Unsigned: numpy.uint8, etc.

## ② NumPy dtypes

- Floating-point numbers: numpy.float32, **numpy.float64**, numpy.float128. Complex: numpy.complex64, etc.

# Creating Numpy array

Tuesday, February 21, 2017 11:09 AM

## Creating NumPy Arrays

### Array Creation

There are several ways to create arrays.

For example, you can create an array from a regular Python list or tuple using the `array` function. The type of the resulting array is deduced from the type of the elements in the sequences.

```
>>> import numpy as np  
>>> a = np.array([2,3,4])  
>>> a  
array([2, 3, 4])  
>>> a.dtype  
dtype('int64')  
>>> b = np.array([1.2, 3.5, 5.1])  
>>> b.dtype  
dtype('float64')
```

A frequent error consists in calling `array` with multiple numeric arguments, rather than providing a single list of numbers as an argument.

```
>>> a = np.array(1,2,3,4)      # WRONG  
>>> a = np.array([1,2,3,4])  # RIGHT
```

### Creating Multidimensional Arrays

`array` transforms sequences of sequences into two-dimensional arrays, sequences of sequences of sequences into three-dimensional arrays, and so on.

```
>>> b = np.array([(1.5,2,3), (4,5,6)])  
>>> b  
array([[ 1.5,  2. ,  3. ],  
       [ 4. ,  5. ,  6. ]])
```

### Specifying type for array explicitly

- Python automatically provide type according to values stored in array, but we can explicitly specify them.

### Getting information for arrays

NumPy's array class is called `ndarray`. It is also known by the alias `array`. Note that `numpy.array` is not the same as the Standard Python Library class `array.array`, which only handles one-dimensional arrays and offers less functionality. The more important attributes of an `ndarray` object are:

#### **ndarray.ndim**

the number of axes (dimensions) of the array. In the Python world, the number of dimensions is referred to as *rank*.

#### **ndarray.shape**

the dimensions of the array. This is a tuple of integers indicating the size of the array in each dimension. For a matrix with  $n$  rows and  $m$  columns, `shape` will be  $(n, m)$ . The length of the `shape` tuple is therefore the rank, or number of dimensions, `ndim`.

#### **ndarray.size**

the total number of elements of the array. This is equal to the product of the elements of `shape`.

#### **ndarray.dtype**

an object describing the type of the elements in the array. One can create or specify `dtype`'s using standard Python types. Additionally NumPy provides types of its own. `numpy.int32`, `numpy.int16`, and `numpy.float64` are some examples.

#### **ndarray.itemsize**

the size in bytes of each element of the array. For example, an array of elements of type `float64` has `itemsize` 8 (=64/8), while one of type `complex32` has `itemsize` 4 (=32/8). It is equivalent to `ndarray.dtype.itemsize`.

#### **ndarray.data**

the buffer containing the actual elements of the array. Normally, we won't need to use this attribute because we will access the elements in an array using indexing facilities.

- Here `ndarray` is array object of `numpy`.
- As `numpy` arrays are homogeneous `ndarray.itemsize` will give single value.

## An example

```
>>> import numpy as np
>>> a = np.arange(15).reshape(3, 5)
>>> a
array([[ 0,  1,  2,  3,  4],
       [ 5,  6,  7,  8,  9],
       [10, 11, 12, 13, 14]])
>>> a.shape
(3, 5)
>>> a.ndim
2
>>> a.dtype.name
'int64'
>>> a.itemsize
8
>>> a.size
15
>>> type(a)
<type 'numpy.ndarray'>
>>> b = np.array([6, 7, 8])
>>> b
array([6, 7, 8])
>>> type(b)
<type 'numpy.ndarray'>
```

## Creating array with default values

Often, the elements of an array are originally unknown, but its size is known. Hence, NumPy offers several functions to create arrays with initial placeholder content. These minimize the necessity of growing arrays, an expensive operation.

The function `zeros` creates an array full of zeros, the function `ones` creates an array full of ones, and the function `empty` creates an array whose initial content is random and depends on the state of the memory. By default, the `dtype` of the created array is `float64`.

```
>>> np.zeros( (3,4) )
array([[ 0.,  0.,  0.,  0.],
       [ 0.,  0.,  0.,  0.],
       [ 0.,  0.,  0.,  0.]])
>>> np.ones( (2,3,4), dtype=np.int16 )           # dtype can also be specified
array([[[ 1,  1,  1,  1],
       [ 1,  1,  1,  1],
       [ 1,  1,  1,  1]],
      [[ 1,  1,  1,  1],
       [ 1,  1,  1,  1],
       [ 1,  1,  1,  1]]], dtype=int16)
>>> np.empty( (2,3) )                          # uninitialized, output may vary
array([[ 3.73603959e-262,   6.02658058e-154,   6.55490914e-260],
       [ 5.30498948e-313,   3.14673309e-307,   1.00000000e+000]])
```

- For shape we can pass either tuple( as above ) or list as below

```
In [22]: a=np.zeros([2,2])
In [23]: a
Out[23]: array([[ 0.,  0.],
   [ 0.,  0.]])
In [24]: a=np.zeros([2,2,3])
In [25]: a
Out[25]: array([[[ 0.,  0.,  0.],
   [ 0.,  0.,  0.]],
  [[ 0.,  0.,  0.],
   [ 0.,  0.,  0.]]])
In [ ]:
```

## Creating array with range

To create sequences of numbers, NumPy provides a function analogous to `range` that returns arrays instead of lists.

```
>>> np.arange( 10, 30, 5 )
array([10, 15, 20, 25])
>>> np.arange( 0, 2, 0.3 )           # it accepts float arguments
array([ 0. ,  0.3,  0.6,  0.9,  1.2,  1.5,  1.8])
```

When `arange` is used with floating point arguments, it is generally not possible to predict the number of elements obtained, due to the finite floating point precision. For this reason, it is usually better to use the function `linspace` that receives as an argument the number of elements that we want, instead of the step:

```
>>> from numpy import pi
>>> np.linspace( 0, 2, 9 )          # 9 numbers from 0 to 2
array([ 0. ,  0.25,  0.5 ,  0.75,  1. ,  1.25,  1.5 ,  1.75,  2. ])
>>> x = np.linspace( 0, 2*pi, 100 )    # useful to evaluate function at lots of points
>>> f = np.sin(x)
```

- '`arange(start,end,step)`' create array with `range(start,end,step)` syntax
- '`Linspace(start,end,no_of_element)`' tackle space by it self and gives us desired number of elements.

## Reshaping array

- We can change the shape of arrays according to our need.
- `Reshape(<new_shape_array>)`  
we can pass list,tuple or simple as argument.

```
>>> import numpy as np  
>>> a = np.arange(15).reshape(3, 5)  
>>> a  
array([[ 0,  1,  2,  3,  4],  
       [ 5,  6,  7,  8,  9],  
       [10, 11, 12, 13, 14]])
```

## Random Arrays

```
np.random.standard_normal((2,4))  
  
array([[ 1.23440627, -0.39035196,  0.18185496,  1.56869647],  
       [ 0.74160254,  0.15619149,  0.79453644, -0.65878599]])  
  
a = np.random.standard_normal((2,3))  
b = np.random.standard_normal((2,3))  
  
np.vstack([a,b])  
  
array([[ 1.26328274, -1.90693522,  0.00379105],  
       [-0.37768188, -0.34070629, -1.31688553],  
       [-1.66929909,  0.82002641, -0.45799134],  
       [-0.03446812,  0.11392679,  2.6503177 ]])  
  
np.hstack([a,b])  
  
array([[ 1.26328274, -1.90693522,  0.00379105, -1.66929909,  0.82002641,  
       -0.45799134],  
       [-0.37768188, -0.34070629, -1.31688553, -0.03446812,  0.11392679,  
        2.6503177 ]])  
  
a.transpose()  
  
array([[ 1.26328274, -0.37768188],  
       [-1.90693522, -0.34070629],  
       [ 0.00379105, -1.31688553]])
```

- We can create random array using standard\_normal(<dimension>) function.
- Then we can stack 1 over other to create new using vstack(<list of arrays>) for vertical stacking and hstack(<list of arrays >) for horizontal stacking.

# Loading and Saving arrays

Tuesday, February 21, 2017 11:46 AM

```
a = np.random.standard_normal((2,3))
b = np.random.standard_normal((2,3))

np.vstack([a,b])

array([[ 1.26328274, -1.90693522,  0.00379105],
       [-0.37768188, -0.34070629, -1.31688553],
       [-1.66929909,  0.82002641, -0.45799134],
       [-0.03446812,  0.11392679,  2.6503177 ]])

np.hstack([a,b])

array([[ 1.26328274, -1.90693522,  0.00379105, -1.66929909,  0.82002641,
       -0.45799134],
       [-0.37768188, -0.34070629, -1.31688553, -0.03446812,  0.11392679,
        2.6503177 ]])

a.transpose()

array([[ 1.26328274, -0.37768188],
       [-1.90693522, -0.34070629],
       [ 0.00379105, -1.31688553]])
```

- Now we can save this arrays and then load array in a varible.

```
np.save('example.npy',a)

a1 = np.load('example.npy')

a1

array([[ 1.26328274, -1.90693522,  0.00379105],
       [-0.37768188, -0.34070629, -1.31688553]])
```

## Maths with Numpy Arrays

Tuesday, February 21, 2017 9:10 PM

# Doing Math with Arrays

- We can not apply python functions over numpy arrays as they are different than python lists, so we have to use numpy version of methods.
- 'numpy' functions can take full array as argument and perform operation on each.
- They have nearly same syntax as python's native functions.

```
import numpy as np
import matplotlib.pyplot as pp

%matplotlib inline

x = np.linspace(0,10,40)
x

array([ 0.        ,  0.25641026,  0.51282051,  0.76923077,
       1.02564103,  1.28205128,  1.53846154,  1.79487179,
       2.05128205,  2.30769231,  2.56410256,  2.82051282,
       3.07692308,  3.33333333,  3.58974359,  3.84615385,
       4.1025641 ,  4.35897436,  4.61538462,  4.87179487,
       5.12820513,  5.38461538,  5.64102564,  5.8974359 ,
       6.15384615,  6.41025641,  6.66666667,  6.92307692,
       7.17948718,  7.43589744,  7.69230769,  7.94871795,
       8.20512821,  8.46153846,  8.71794872,  8.97435897,
       9.23076923,  9.48717949,  9.74358974,  10.        ])
```

NOTE - %matplotlib inline tells ipython to plot on notebook itself.

- Now we apply function sin() on array.

```
sinx = np.sin(x)
sinx

array([ 0.        ,  0.25360981,  0.49063689,  0.69558279,  0.85504677,
       0.95860198,  0.99947728,  0.97499996,  0.88677052,  0.740558 ,
       0.54592277,  0.31559139,  0.06462451, -0.19056796, -0.43329981,
      -0.64769957, -0.81974833, -0.93819637, -0.99529876, -0.98732176,
      -0.91478695, -0.78243716, -0.59892631, -0.37625358, -0.12897884,
       0.12672941,  0.37415123,  0.5971085 ,  0.78102277,  0.91386845,
       0.98695921,  0.99551587,  0.93897894,  0.82104518,  0.64942592,
       0.43534277,  0.19279396, -0.06236104, -0.31343844, -0.54402111])
```

## PLOTTING

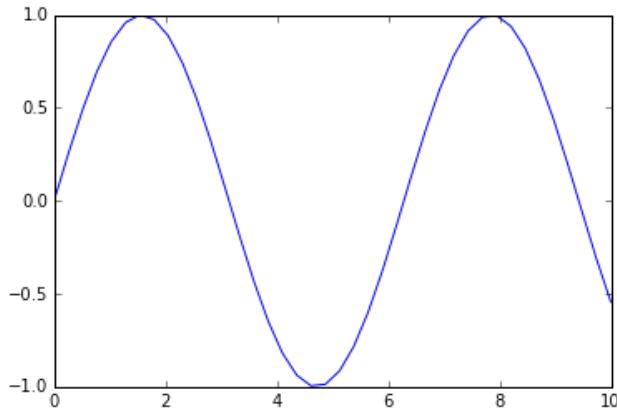
FOR MORE - [file:///D:/Ashish/My%20Websites/matplotlib/matplotlib.org/users/pyplot\\_tutorial.html](file:///D:/Ashish/My%20Websites/matplotlib/matplotlib.org/users/pyplot_tutorial.html)

- We can use plot() function of **matplotlib.pyplot** module.

```
In [6]: sinx = np.sin(x)
```

```
In [7]: pp.plot(x,sinx)
```

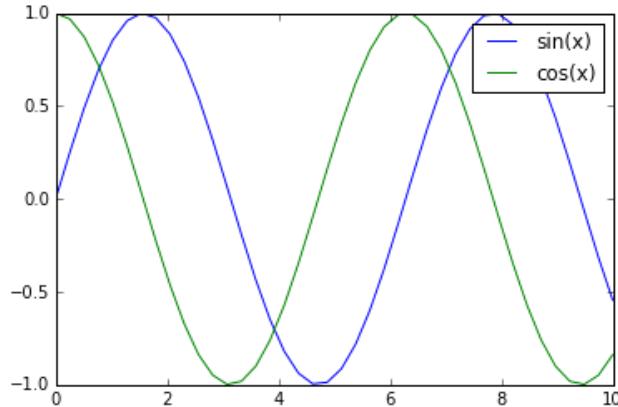
```
Out[7]: <matplotlib.lines.Line2D at 0x108c2f160>
```



```
In [9]: pp.plot(x,sinx)  
pp.plot(x,cosx)
```

```
pp.legend(['sin(x)', 'cos(x)'])
```

```
Out[9]: <matplotlib.legend.Legend at 0x108d1ef28>
```



- All operations between arrays are applied taking 1 element from each array at a time.(element by element)

```
: a=np.array([1,2,3])  
b=np.array([2,3,4])  
print(a,b)
```

```
[1 2 3] [2 3 4]
```

```
: a+b
```

```
: array([3, 5, 7])
```

- We can get the dot product of two arrays using `dot()` function, this will treat arrays as vectors(->) rather than simple arrays.

```
: np.dot(a,b)
```

```
: 20
```

- Numpy is very intelligent so it will try to sense what we wanted to do, so if we add 1 element to numpy array,

it will add it to all elements.

```
a
```

```
array([1, 2, 3])
```

```
a+1
```

```
array([2, 3, 4])
```

# Indexing and Slicing of Numpy arrays

Wednesday, February 22, 2017 1:26 AM

## Indexing and Slicing

- We can index single element as we did in Python, we even get same 'index out of bound Error'

```
In [1]: import numpy as np
```

```
In [2]: v = np.linspace(0,10,5)
```

```
In [3]: v[0]
```

```
Out[3]: 0.0
```

```
In [4]: v[1]
```

```
Out[4]: 2.5
```

```
In [5]: v[-1]
```

```
Out[5]: 10.0
```

```
In [6]: v[5]
```

```
-----  
IndexError Traceback (most recent call last)  
<ipython-input-6-5db8a26c34df> in <module>()  
----> 1 v[5]
```

```
IndexError: index 5 is out of bounds for axis 0 with size 5
```

- Although for multidimensional arrays we need not to use two brackets(`arr[i][j]`), and we can use following syntax `arr[i,j]`

```
In [8]: vv = np.random.random((5,4))
```

```
In [9]: vv
```

```
Out[9]: array([[ 0.09137921,  0.77700747,  0.39884184,  0.30716753],  
               [ 0.61637695,  0.20001582,  0.023984 ,  0.24829491],  
               [ 0.87007385,  0.55486179,  0.52878119,  0.9913901 ],  
               [ 0.40446365,  0.57444187,  0.77248462,  0.2901253 ],  
               [ 0.25235129,  0.1354475 ,  0.68302613,  0.84045052]])
```

```
In [10]: vv[0,0]
```

```
Out[10]: 0.091379213907519685
```

```
In [11]: vv[4,3]
```

```
Out[11]: 0.84045051592923137
```

- Although we can follow python type indexing also.

```
In [12]: vv[0][0]
Out[12]: 0.40223011145310583
```

```
In [13]: vv[4][3]
Out[13]: 0.57126006299840726
```

## SLICING

- Slicing work in same way as Python lists.

```
In [37]: v = np.linspace(0,10,5)
v
Out[37]: array([ 0. ,  2.5,  5. ,  7.5, 10. ])
```

```
In [8]: vv
Out[8]: array([[ 0.40223011,  0.94986098,  0.84117937,  0.42743221],
   [ 0.12510872,  0.00100719,  0.98994283,  0.98700892],
   [ 0.07992307,  0.54100064,  0.85003508,  0.56961448],
   [ 0.00156523,  0.21619877,  0.52156028,  0.51322011],
   [ 0.95877879,  0.70524681,  0.59901052,  0.57126006]])
```

```
In [20]: v[2:4]
Out[20]: array([ 5. ,  7.5])
```

```
In [21]: vv[2:5,1]
Out[21]: array([ 0.54100064,  0.21619877,  0.70524681])
```

- Here vv[2:5,1] means select [2,5) rows and col index 1, the values indicated above will be selected.

## Big difference

- There is a big difference between Python and Numpy array in one sense, that when we assign after slicing. In **python** a new list is created and assigned, so when we change it , it will not affect the original.

```
In [47]: l=[i for i in range(10)]  
l
```

```
Out[47]: [0, 1, 2, 3, 4, 5, 6, 7, 8, 9]
```

```
In [48]: l2=l[2:5]  
l2
```

```
Out[48]: [2, 3, 4]
```

```
In [52]: # now if we change l2 it will not affect l  
l2[0]=10  
l2
```

```
Out[52]: [10, 3, 4]
```

```
In [51]: #as we see l2 has change, but l will be intact  
l
```

```
Out[51]: [0, 1, 2, 3, 4, 5, 6, 7, 8, 9]
```

- But in **NumPy**, Slicing created view over original arrays so it also changes the original.

```
In [37]: v = np.linspace(0,10,5)  
v
```

```
Out[37]: array([ 0. , 2.5, 5. , 7.5, 10. ])
```

```
In [40]: v2 = v[2:4]
```

```
In [26]: v2[0] = 0
```

```
In [27]: v
```

```
Out[27]: array([ 0. , 2.5, 0. , 7.5, 10. ])
```

- Here v2[0] was v[2] and It has been changed as we changed v2.

## Making copy

- But sometimes we really wanted to create copy and not change the original,  
In this case we can use **copy()** method.

```
v3 = v[2:4].copy()
```

```
v3[0] = 1
```

```
v
```

```
array([ 0. , 2.5, 0. , 7.5, 10. ])
```

- As we can see 'v' remain intact, even after changing 'v3'

## ADVANCE INDEXING

- There are two techniques which can be used in Numpy and are called advance indexing.
  - Integer array indexing
  - Boolean indexing

Advanced indexing always returns a *copy* of the data (contrast with basic slicing that returns a *view*).

### Integer array indexing

- We can use list of indexes to select specific elements from array (like mathematica) we can use Numpy array also.

```
In [30]: v
Out[30]: array([ 0.,  2.5,  0.,  7.5, 10.])

In [31]: v[[1,2,3]]
Out[31]: array([ 2.5,  0.,  7.5])
```

### Boolean array indexing

- We can also pass a boolean array (must be NumPy), only indexes which has true will be selected.
- This is useful to modify only carefully selected elements of array.

```
v
array([ 0.,  2.5,  0.,  7.5, 10.])

v[np.array([False,True,False,True,True])]
array([ 2.5,  7.5, 10.])
```

- This type of technique is used for getting element according to some condition some condition.

```
v[bool_index]
```

```
array([ 2.5,  7.5, 10.])
```

- We can also modify the values which passing certain criteria very fast.

```
v[bool_index]=v[bool_index]*2
```

```
v
```

```
array([ 0., 10.,  5., 30., 40.])
```

```
In [34]: vv[vv > 0.5] = vv[vv > 0.5] * 2
```

```
In [35]: vv
```

```
Out[35]: array([[ 4.02230111e-01,  1.89972195e+00,  1.68235874e+00,
   4.27432212e-01],
   [ 1.25108716e-01,  1.80201438e+00,  1.97988566e+00,
   1.97401783e+00],
   [ 7.99230603e-02,  1.08200128e+00,  1.70007015e+00]])
```

```
In [34]: vv[vv > 0.5] = vv[vv > 0.5] * 2
```

```
In [35]: vv
```

```
Out[35]: array([[ 4.02230111e-01,  1.89972195e+00,  1.68235874e+00,
   4.27432212e-01],
   [ 1.25108716e-01,  1.80201438e+00,  1.97988566e+00,
   1.97401783e+00],
   [ 7.99230693e-02,  1.08200128e+00,  1.70007015e+00,
   1.13922895e+00],
   [ 1.56522940e-03,  2.16198769e-01,  1.04312057e+00,
   1.02644021e+00],
   [ 1.91755758e+00,  1.41049361e+00,  1.19802103e+00,
   1.14252013e+00]])
```

## Pandas - introduction

Thursday, February 23, 2017 9:01 PM

# Pandas Overview

- Built on top of **Numpy**, and can be called as **Numpy with Labels**
- **Pandas** provides more general labels to data other than indices only.

Pandas is a flexible and efficient  
tool to analyze real-world,  
heterogeneous data.

## Pandas Enhances NumPy With

1. Data labels and descriptive indices
2. Robust handling of common data formats and missing data
3. Relational-database operations

# Pandas Series objects

Thursday, February 23, 2017 9:05 PM

# Pandas Series

- Pandas is built over Numpy, so we have to import numpy for using pandas
- Pandas' series object can be used as 1D Numpy arrays.
- They also provide additional operations.

## Series

**Series** is a one-dimensional labeled array capable of holding any data type (integers, strings, floating point numbers, Python objects, etc.). The axis labels are collectively referred to as the **index**. The basic method to create a Series is to call:

```
>>> s = pd.Series(data, index=index)
```

Here, **data** can be many different things:

- a Python dict
- an ndarray
- a scalar value (like 5)

The passed **index** is a list of axis labels. Thus, this separates into a few cases depending on what **data** is:

- We have to give **data** and **label** to create a Pandas series, if **label** are not given then index will be used as Python.

### From ndarray

If **data** is an ndarray, **index** must be the same length as **data**. If no index is passed, one will be created having values  $[0, \dots, \text{len}(\text{data}) - 1]$ .

```
In [3]: s = pd.Series(np.random.randn(5), index=['a', 'b', 'c', 'd', 'e'])

In [4]: s
Out[4]:
a    0.2735
b    0.6052
c   -0.1692
d    1.8298
e    0.5432
dtype: float64

In [5]: s.index
Out[5]: Index(['a', 'b', 'c', 'd', 'e'], dtype='object')

In [6]: pd.Series(np.random.randn(5))
Out[6]:
0    0.3674
1   -0.8230
2   -1.0295
3   -1.0523
4   -0.8502
dtype: float64
```

- In last case only data is passed so we get indices as label.

## From dict

If data is a dict, if **index** is passed the values in data corresponding to the labels in the index will be pulled out. Otherwise, an index will be constructed from the sorted keys of the dict, if possible.

```
In [7]: d = {'a' : 0., 'b' : 1., 'c' : 2.}

In [8]: pd.Series(d)
Out[8]:
a    0.0
b    1.0
c    2.0
dtype: float64

In [9]: pd.Series(d, index=['b', 'c', 'd', 'a'])
Out[9]:
b    1.0
c    2.0
d    NaN
a    0.0
dtype: float64
```

**Note:** `NaN` (not a number) is the standard missing data marker used in pandas

- In case of dictionary, if 'labels' is not passed then keys will be used.

**From scalar value** If data is a scalar value, an index must be provided. The value will be repeated to match the length of **index**

```
In [10]: pd.Series(5., index=['a', 'b', 'c', 'd', 'e'])
Out[10]:
a    5.0
b    5.0
c    5.0
d    5.0
e    5.0
dtype: float64
```

## Series is ndarray-like

Series acts very similarly to a ndarray, and is a valid argument to most NumPy functions. However, things like slicing also slice the index.

```
In [11]: s[0]
Out[11]: 0.27348116325673794

In [12]: s[:3]
Out[12]:
a    0.2735
b    0.6052
c   -0.1692
dtype: float64

In [13]: s[s > s.median()]
Out[13]:
b    0.6052
d   1.8298
dtype: float64

In [14]: s[[4, 3, 1]]
Out[14]:
e    0.5432
d   1.8298
b    0.6052
dtype: float64

In [15]: np.exp(s)
Out[15]:
a    1.3145
b    1.8317
c    0.8443
d    6.2327
e    1.7215
dtype: float64
```

- Here we can see data is printed as a pair of label/index and data.( we can see as pair of values)

## Series is dict-like

A Series is like a fixed-size dict in that you can get and set values by index label:

```
In [16]: s['a']
Out[16]: 0.27348116325673794

In [17]: s['e'] = 12.

In [18]: s
Out[18]:
a    0.2735
b    0.6052
c   -0.1692
d    1.8298
e    12.0000
dtype: float64

In [19]: 'e' in s
Out[19]: True

In [20]: 'f' in s
Out[20]: False
```

If a label is not contained, an exception is raised:

```
>>> s['f']
KeyError: 'f'
```

Using the `get` method, a missing label will return `None` or specified default:

```
In [21]: s.get('f')
```

```
In [22]: s.get('f', np.nan)
Out[22]: nan
```

- So we should use `get()` function to avoid exception even when a key/index/label is not found.

## Working with Series

- We can also give name to a series which can be used later.

```
In [2]: s=pd.Series([i**2 for i in range(5)],name='squares')

In [3]: s
Out[3]: 0    0
        1    1
        2    4
        3    9
        4   16
Name: squares, dtype: int64
```

- We can also get `values`, `indexes`, `name` and `dtype` of `Series` with `properties`

```
In [5]: s.values
Out[5]: array([ 0,  1,  4,  9, 16], dtype=int64)
```

```
In [6]: s.index
Out[6]: RangeIndex(start=0, stop=5, step=1)
```

```
In [7]: s.name
Out[7]: 'squares'
```

```
In [8]: s.dtype
```

```
In [5]: s.values  
Out[5]: array([ 0,  1,  4,  9, 16], dtype=int64)
```

```
In [6]: s.index  
Out[6]: RangeIndex(start=0, stop=5, step=1)
```

```
In [7]: s.name  
Out[7]: 'squares'
```

```
In [8]: s.dtype  
Out[8]: dtype('int64')
```

```
In [ ]:
```

- Index will always return label of the Series( if not given than automatically index will become labels)

## Slicing with Series

- Slicing works exactly same as Numpy/Python with indices, but with labels, they break one simplerule of python/Numpy that they also include **end element** in arr[start:end]

### Example - 1 simple operations

```
In [6]: s[0]  
Out[6]: 0
```

```
In [7]: s[2]  
Out[7]: 4
```

```
In [8]: s[2:4]  
Out[8]: 2    4  
       3    9  
      Name: squares, dtype: int64
```

### Example - 2 using label slicing

```
In [9]: pop2014 = pd.Series([100,99.3,95.5,93.5,92.4,84.8,84.5,78.9,74.3,72.8],  
                           index=['Java','C','C++','Python','C#','PHP','JavaScript','Ruby','R','Matlab'])
```

```
In [10]: pop2014  
Out[10]: Java      100.0  
          C        99.3  
          C++      95.5  
          Python    93.5  
          C#        92.4  
          PHP       84.8  
          JavaScript 84.5  
          Ruby      78.9  
          R         74.3  
          Matlab     72.8  
          dtype: float64
```

- Works fine with index slicing

```
In [14]: pop2014[0]
```

```
Out[14]: 100.0
```

```
In [15]: pop2014[0:2]
```

```
Out[15]: Java    100.0
          C      99.3
          dtype: float64
```

- But also include 'last' element with labels.

```
In [16]: pop2014['Python']
```

```
Out[16]: 93.5
```

```
In [17]: pop2014['C++':'C#']
```

```
Out[17]: C++    95.5
          Python  93.5
          C#     92.4
          dtype: float64
```

NOTE - last element will be seen only when label/index given, so if it is using indexes as label then end element will not come.

- Here we can use number of values to index, Pandas will try its best to find out what you want to do, but we can specify explicitly using **loc** and **iloc** property.(not function)
- **loc** for slicing using name, **iloc** for slicing using index.

```
In [18]: pop2014.iloc[0:2]
```

```
Out[18]: Java    100.0
          C      99.3
          dtype: float64
```

```
In [19]: pop2014.loc[:'Ruby']
```

```
Out[19]: Java        100.0
          C         99.3
          C++       95.5
          Python    93.5
          C#        92.4
          PHP       84.8
          JavaScript 84.5
          Ruby      78.9
          dtype: float64
```

# Pandas Dataframes object

Friday, February 24, 2017 1:09 AM

## Pandas DataFrames

- Pandas dataframes object are extention to 2D Numpy arrays.

### DataFrame

**DataFrame** is a 2-dimensional labeled data structure with columns of potentially different types. You can think of it like a spreadsheet or SQL table, or a dict of Series objects. It is generally the most commonly used pandas object. Like Series, DataFrame accepts many different kinds of input:

- Dict of 1D ndarrays, lists, dicts, or Series
- 2-D numpy.ndarray
- Structured or record ndarray
- A Series
- Another DataFrame

Along with the data, you can optionally pass **index** (row labels) and **columns** (column labels) arguments. If you pass an index and / or columns, you are guaranteeing the index and / or columns of the resulting DataFrame. Thus, a dict of Series plus a specific index will discard all data not matching up to the passed index.

If axis labels are not passed, they will be constructed from the input data based on common sense rules.

## From dict of Series or dicts

The result **index** will be the **union** of the indexes of the various Series. If there are any nested dicts, these will be first converted to Series. If no columns are passed, the columns will be the sorted list of dict keys.

```
In [32]: d = {'one' : pd.Series([1., 2., 3.], index=['a', 'b', 'c']),
....:      'two' : pd.Series([1., 2., 3., 4.], index=['a', 'b', 'c', 'd'])}
....:

In [33]: df = pd.DataFrame(d)

In [34]: df
Out[34]:
   one  two
a  1.0  1.0
b  2.0  2.0
c  3.0  3.0
d  NaN  4.0

In [35]: pd.DataFrame(d, index=['d', 'b', 'a'])
Out[35]:
   one  two
d  NaN  4.0
b  2.0  2.0
a  1.0  1.0

In [36]: pd.DataFrame(d, index=['d', 'b', 'a'], columns=['two', 'three'])
Out[36]:
   two  three
d  4.0   NaN
b  2.0   NaN
a  1.0   NaN
```

The row and column labels can be accessed respectively by accessing the **index** and **columns** attributes:

- Pandas automatically try to match the the row/label/index and display as a descriptive tabular representation., key of dictionary will be used as column name.
- If Labels/Indexes are not given labels are fetched from **Series** and if given then only these are used.(NaN used if value is not found) Here we can see in last example, labels are given so only given are used.  
similarly, if Columns are not specified then by common sense they will be generated, if specified then only these will be used.
- Key of Dictionary always give us the Column name, index/label will be get by panda automatically or given by us.

## From dict of ndarrays / lists

The ndarrays must all be the same length. If an index is passed, it must clearly also be the same length as the arrays. If no index is passed, the result will be `range(n)`, where `n` is the array length.

```
In [39]: d = {'one' : [1., 2., 3., 4.],  
....:      'two' : [4., 3., 2., 1.]}  
....:  
  
In [40]: pd.DataFrame(d)  
Out[40]:  
   one  two  
0  1.0  4.0  
1  2.0  3.0  
2  3.0  2.0  
3  4.0  1.0  
  
In [41]: pd.DataFrame(d, index=['a', 'b', 'c', 'd'])  
Out[41]:  
   one  two  
a  1.0  4.0  
b  2.0  3.0  
c  3.0  2.0  
d  4.0  1.0
```

- In last index/labels are passed , so labels are automatically seen as indexes.
- Key of Dictionary always give us the Column name, index/label will be get by panda automatically or given by us.

## From a list of dicts

```
In [47]: data2 = [{‘a’: 1, ‘b’: 2}, {‘a’: 5, ‘b’: 10, ‘c’: 20}]  
  
In [48]: pd.DataFrame(data2)  
Out[48]:  
   a    b    c  
0  1    2    NaN  
1  5   10   20.0  
  
In [49]: pd.DataFrame(data2, index=[‘first’, ‘second’])  
Out[49]:  
   a    b    c  
first  1    2    NaN  
second 5   10   20.0  
  
In [50]: pd.DataFrame(data2, columns=[‘a’, ‘b’])  
Out[50]:  
   a    b  
0  1    2  
1  5   10
```

- Pandas automatically categories all data according to column and make table.
- Key of Dictionary always give us the Column name, index/label will be get by panda automatically or given by us.



# Working with Panda DataFrames

Friday, February 24, 2017 2:19 AM

## Working with Panda DataFrames

### Creating DataFrame

- We can create dataframe using dictionary of series.
- Key of Dictionary always give us the Column name, index/label will be get by panda automatically or given by us.

```
In [2]: pop2014 = pd.Series([100,99.3,95.5,93.5,92.4,84.8,84.5,78.9,74.3,72.8],  
index=['Java','C','C++','Python','C#','PHP','JavaScript','Ruby','R','Matlab'])
```

```
In [3]: pop2015 = pd.Series({'Java': 100,'C': 99.9,'C++': 99.4,'Python': 96.5,'C#': 91.3,  
'R': 84.8,'PHP': 84.5,'JavaScript': 83.0,'Ruby': 76.2,'Matlab': 72.4})
```

```
In [4]: twoyears = pd.DataFrame({'2014': pop2014, '2015': pop2015})
```

```
In [5]: twoyears
```

	2014	2015
<b>C</b>	99.3	99.9
<b>C#</b>	92.4	91.3
<b>C++</b>	95.5	99.4
<b>Java</b>	100.0	100.0
<b>JavaScript</b>	84.5	83.0
<b>Matlab</b>	72.8	72.4
<b>PHP</b>	84.8	84.5
<b>Python</b>	93.5	96.5
<b>R</b>	74.3	84.8
<b>Ruby</b>	78.9	76.2

### Sorting data frames

- We can use `sort(col=any,ascending=bool)` ,any means any type of value can be given

```
In [28]: twoyears = twoyears.sort('2015',ascending=False)
F:\my_folder\Programs\Programs folder complete\anaconda_python\lib\site-pa
columns=....) is deprecated, use sort_values(by=....)
if __name__ == '__main__':
```

```
In [7]: twoyears
```

```
Out[7]:
```

	2014	2015
Java	100.0	100.0
C	99.3	99.9
C++	95.5	99.4
Python	93.5	96.5
C#	92.4	91.3
R	74.3	84.8
PHP	84.8	84.5
JavaScript	84.5	83.0
Ruby	78.9	76.2
Matlab	72.8	72.4

- As we can see it is deprecated, so we have to use `sort_values(by=<col_name:anysize>,ascending=bool)`

```
In [30]: twoyears = twoyears.sort_values(by='2015',ascending=False)
```

```
In [7]: twoyears
```

```
Out[7]:
```

	2014	2015
Java	100.0	100.0
C	99.3	99.9
C++	95.5	99.4
Python	93.5	96.5
C#	92.4	91.3
R	74.3	84.8
PHP	84.8	84.5
JavaScript	84.5	83.0
Ruby	78.9	76.2
Matlab	72.8	72.4

## Extracting Values

- We can extract all type of information from **Dataframe** using properties
  - Values
  - Columns
  - index

```
In [8]: twoyears.values
```

```
Out[8]: array([[ 100. ,  100. ],
   [ 99.3,  99.9],
   [ 95.5,  99.4],
   [ 93.5,  96.5],
   [ 92.4,  91.3],
   [ 74.3,  84.8],
   [ 84.8,  84.5],
   [ 84.5,  83. ],
   [ 78.9,  76.2],
   [ 72.8,  72.4]])
```

```
In [9]: twoyears.index
```

```
Out[9]: Index(['Java', 'C', 'C++', 'Python', 'C#', 'R', 'PHP', 'JavaScript', 'Ruby',
   'Matlab'],
   dtype='object')
```

```
In [10]: twoyears.columns
```

```
Out[10]: Index(['2014', '2015'], dtype='object')
```

- We can also get data for individual column using they like key in **DataFrame** Object  
But in this we can only get data of some Columns.

## Getting data of specific columns

```
In [34]: twoyears['2015']
```

```
Out[34]: Java      100.0
          C        99.9
          C++      99.4
          Python    96.5
          C#       91.3
          R        84.8
          PHP      84.5
          JavaScript 83.0
          Ruby     76.2
          Matlab    72.4
          Name: 2015, dtype: float64
```

- We can also provide list of cols we want to get.

```
twoyears[['2014','2015']]
```

	2014	2015
Java	100.0	100.0
C	99.3	99.9
C++	95.5	99.4
Python	93.5	96.5
C#	92.4	91.3
R	74.3	84.8
PHP	84.8	84.5
JavaScript	84.5	83.0
Ruby	78.9	76.2
Matlab	72.8	72.4

## Slicing data

- We can slice some rows using index or values (same as Series) as we already know for slicing using columns we have to use like above.

```
In [12]: twoyears.iloc[0:2]
```

Out[12]:

	2014	2015
Java	100.0	100.0
C	99.3	99.9

```
In [13]: twoyears.loc['C':'Python']
```

Out[13]:

	2014	2015
C	99.3	99.9
C++	95.5	99.4
Python	93.5	96.5

- Using name will include last row.

## Creating New columns from computation

- We can create new column by just assigning it like we did with dictionaries, as know keys here works like columns.

```
In [14]: twoyears['avg'] = 0.5*(twoyears['2014'] + twoyears['2015'])
```

```
In [15]: twoyears
```

Out[15]:

	2014	2015	avg
<b>Java</b>	100.0	100.0	100.00
<b>C</b>	99.3	99.9	99.60
<b>C++</b>	95.5	99.4	97.45
<b>Python</b>	93.5	96.5	95.00
<b>C#</b>	92.4	91.3	91.85
<b>R</b>	74.3	84.8	79.55
<b>PHP</b>	84.8	84.5	84.65
<b>JavaScript</b>	84.5	83.0	83.75
<b>Ruby</b>	78.9	76.2	77.55
<b>Matlab</b>	72.8	72.4	72.60

## Setting an Index from column

- Some time we create **DataFrame** from list of dictionaries, in this case we may wanted to make some column as index, we can do this by using `set_index(col_name)` function of DataFrame.

```
In [16]: presidents = pd.DataFrame([{'name': 'Barack Obama', 'inauguration': 2009, 'birthyear': 1961},  
                                    {'name': 'George W. Bush', 'inauguration': 2001, 'birthyear': 1946},  
                                    {'name': 'Bill Clinton', 'birthyear': 1946, 'inauguration': 1993},  
                                    {'name': 'George H. W. Bush', 'inauguration': 1989, 'birthyear': 1924}])
```

```
In [17]: presidents
```

Out[17]:

	birthyear	inauguration	name
<b>0</b>	1961	2009	Barack Obama
<b>1</b>	1946	2001	George W. Bush
<b>2</b>	1946	1993	Bill Clinton
<b>3</b>	1924	1989	George H. W. Bush

- Now we can set any column as index.

```
In [18]: presidents_indexes = presidents.set_index('name')
```

```
In [19]: presidents_indexes
```

Out[19]:

	birthyear	inauguration
<b>name</b>		
<b>Barack Obama</b>	1961	2009
<b>George W. Bush</b>	1946	2001
<b>Bill Clinton</b>	1946	1993
<b>George H. W. Bush</b>	1924	1989

## Accessing Value

- For accesing value we can use two syntax
  - With Using loc property
  - With out loc property

```
In [21]: presidents_indexes.loc['Bill Clinton']['inauguration']
```

```
Out[21]: 1993
```

```
In [22]: presidents_indexes['inauguration']['Bill Clinton']
```

```
Out[22]: 1993
```

- As we can see with out using **loc** we have to use reverse order syntax - df[col][row]
- With **loc**
- Syntax** - df[row][col]
- This is because simple df['name'] gives us data of **COL**, from that we want to select row.  
And vice versa for df.loc['row']

## Merging Two dataFrames

- Lets create 2 new DataFrame to merge .

### Frame 1

```
In [52]: presidents = pd.DataFrame([{'name': 'Barack Obama', 'inauguration': 2009, 'birthyear': 1961},  
                                     {'name': 'George W. Bush', 'inauguration': 2001, 'birthyear': 1946},  
                                     {'name': 'Bill Clinton', 'birthyear': 1946, 'inauguration': 1993},  
                                     {'name': 'George H. W. Bush', 'inauguration': 1989, 'birthyear': 1924}])
```

```
In [42]: presidents
```

	birthyear	inauguration	name
0	1961	2009	Barack Obama
1	1946	2001	George W. Bush
2	1946	1993	Bill Clinton
3	1924	1989	George H. W. Bush

### Frame 2

```
In [51]: presidents_fathers = pd.DataFrame([{'son': 'Barack Obama', 'father': 'Barack Obama, Sr.'},  
                                         {'son': 'George W. Bush', 'father': 'George H. W. Bush'},  
                                         {'son': 'George H. W. Bush', 'father': 'Prescott Bush'}])  
presidents_fathers
```

	father	son
0	Barack Obama, Sr.	Barack Obama
1	George H. W. Bush	George W. Bush
2	Prescott Bush	George H. W. Bush

- Now we can merge(join) the two dataframes using some column,
  - Left dataframe's cols will be in **left\_on**
  - Right dataframe's cols will be specified in **right\_on**

```
In [24]: pd.merge(presidents,presidents_fathers, left_on='name',right_on='son')
```

Out[24]:

	birthyear	inauguration	name	father	son
0	1961	2009	Barack Obama	Barack Obama, Sr.	Barack Obama
1	1946	2001	George W. Bush	George H. W. Bush	George W. Bush
2	1924	1989	George H. W. Bush	Prescott Bush	George H. W. Bush

## Dropping an Axis(Row/Column)

- Now we can see we are getting an extra redundant column (as name and son are same), we can drop using `drop(col_name)` function of **DataFrame**.

```
In [25]: pd.merge(presidents,presidents_fathers, left_on='name',right_on='son').drop('son',axis=1)
```

Out[25]:

	birthyear	inauguration	name	father
0	1961	2009	Barack Obama	Barack Obama, Sr.
1	1946	2001	George W. Bush	George H. W. Bush
2	1924	1989	George H. W. Bush	Prescott Bush

- Axis=1 will be used for column, axis=0 for row

```
r
```

	birthyear	inauguration	name	father
0	1961	2009	Barack Obama	Barack Obama, Sr.
1	1946	2001	George W. Bush	George H. W. Bush
2	1946	1993	Bill Clinton	NaN
3	1924	1989	George H. W. Bush	Prescott Bush

```
r.drop(0,axis=0)
```

	birthyear	inauguration	name	father
1	1946	2001	George W. Bush	George H. W. Bush
2	1946	1993	Bill Clinton	NaN
3	1924	1989	George H. W. Bush	Prescott Bush

- BY default Inner Join is done we can also specify type using 'how' attribute.(type same as SQL)

Merge method	SQL Join Name	Description
left	LEFT OUTER JOIN	Use keys from left frame only
right	RIGHT OUTER JOIN	Use keys from right frame only
outer	FULL OUTER JOIN	Use union of keys from both frames
inner	INNER JOIN	Use intersection of keys from both frames

```
pd.merge(presidents,presidents_fathers, left_on='name', right_on='son', how='left').drop('son', axis=1)
```

	birthyear	inauguration	name	father
0	1961	2009	Barack Obama	Barack Obama, Sr.
1	1946	2001	George W. Bush	George H. W. Bush
2	1946	1993	Bill Clinton	NaN
3	1924	1989	George H. W. Bush	Prescott Bush

- We can notice 'NaN' comes as Father's name is not available for **Bill Clinton**

## Multilevel Indexes

Friday, February 24, 2017 3:54 PM

# Using Multilevel Indexes

- We can use complex multilevel indexes in Pandas, we can use compound levels
- First load some data, `seaborn` has some preloaded data which is used for demonstration purpose (same like `iris` dataset in `scikit-learn`)

```
In [1]: import pandas as pd  
import seaborn
```

```
In [2]: flights = seaborn.load_dataset('flights')
```

- We can see first 5 lines of any `DataFrame` using `head()` and last using `tail()`. here we have total 144 data(from 0 - 143 ).

```
In [10]: flights.head()
```

	year	month	passengers
0	1949	January	112
1	1949	February	118
2	1949	March	132
3	1949	April	129
4	1949	May	121

```
In [11]: flights.tail()
```

	year	month	passengers
139	1960	August	606
140	1960	September	508
141	1960	October	461
142	1960	November	390
143	1960	December	432

- For using multilevel indexing, we have to create multiple indexes, so set some indexes.

```
In [4]: flights_indexed = flights.set_index(['year','month'])
flights_indexed.head()
```

Out[4]:

		passengers
year	month	
1949	January	112
	February	118
	March	132
	April	129
	May	121

- As we can see, we have successfully created multilevel indexing.
- As we know with **DataFrames** we use **loc** and **iloc** properties to slice **rows**.

```
In [6]: flights_indexed.loc[1949:1950]
```

Out[6]:

		passengers
year	month	
1949	January	112
	February	118
	March	132
	April	129
	May	121
	June	135
	July	148
	August	148
	September	136
	October	119
	November	104
	December	118

	January	115
	February	126
	March	141
	April	135
	May	125
	June	149
	July	170
	August	170
	September	158
	October	133
	November	114
	December	140

- Now finally we can use multilevel indexing to get result of some specified year and month.

```
In [7]: flights_indexed.loc[1949, 'January']
```

```
Out[7]: passengers    112
Name: (1949, January), dtype: int64
```

- We can also choose slice some **months** inside a **year** by concatenating slicing.

```
In [8]: flights_indexed.loc[1949].loc['January':'June']
```

	passengers
month	
January	112
February	118
March	132
April	129
May	121
June	135

## Applying stack() and unstack()

- Stack()** means to fold into rows, **unstack()** means to unfold and make column.
- Unstack()** method of **DataFrame** will take innermost level and make it column.  
In following example the months of year became columns.

```
In [9]: flights_unstacked = flights_indexed.unstack()
```

```
In [10]: flights_unstacked
```

Out[10]:

	passengers											
month	January	February	March	April	May	June	July	August	September	October	November	December
year												
1949	112	118	132	129	121	135	148	148	136	119	104	118
1950	115	126	141	135	125	149	170	170	158	133	114	140
1951	145	150	178	163	172	178	199	199	184	162	146	166
1952	171	180	193	181	183	218	230	242	209	191	172	194
1953	196	196	236	235	229	243	264	272	237	211	180	201
1954	204	188	235	227	234	264	302	293	259	229	203	229
1955	242	233	267	269	270	315	364	347	312	274	237	278
1956	284	277	317	313	318	374	413	405	355	306	271	306
1957	315	301	356	348	355	422	465	467	404	347	305	336
1958	340	318	362	348	363	435	491	505	404	359	310	337
1959	360	342	406	396	420	472	548	559	463	407	362	405
1960	417	391	419	461	472	535	622	606	508	461	390	432

- We can apply operations on columns using `axis.(axis=1 for col, 0 for rows and so on.)` (we have to tell we are summing using by which axis, here by column)

```
In [11]: flights_unstacked.sum(axis=1)
```

```
Out[11]: year
1949    1520
1950    1676
1951    2042
1952    2364
1953    2700
1954    2867
1955    3408
1956    3939
1957    4421
1958    4572
1959    5140
1960    5714
dtype: int64
```

- We can again **stack** them column back(inner most level from compound columns) using **stack()** method.

```
In [37]: flights_restacked = flights_unstacked.stack()
```

```
In [38]: flights_restacked.head()
```

Out[38]:

		passengers
year	month	
1949	January	112
	February	118
	March	132
	April	129
	May	121

- Now we can also apply **advanced indexing** as we did with Numpy.( we can also do with Series )

```
In [41]: flights_restacked[flights_restacked['passengers'] > 120]
```

Out[41]:

		passengers
year	month	
1949	March	132
	April	129
	May	121
	June	135
	July	148
	August	148
	September	136
	February	126
	March	141
	..	..

## Aggregating data

Friday, February 24, 2017 9:26 PM

# Aggregating Data

## Loading a comma-separated-value (CSV) dataset

- As we know Python can read many types of files.  
so lets start with reading data from CSV(comma separated value) file.

```
In [2]: open('tips.csv','r').readlines()[:10]
```

```
Out[2]: ['total_bill","tip","sex","smoker","day","time","size"\n',
  '16.99,1.01,"Female","No","Sun","Dinner",2\n',
  '10.34,1.66,"Male","No","Sun","Dinner",3\n',
  '21.01,3.5,"Male","No","Sun","Dinner",3\n',
  '23.68,3.31,"Male","No","Sun","Dinner",2\n',
  '24.59,3.61,"Female","No","Sun","Dinner",4\n',
  '25.29,4.71,"Male","No","Sun","Dinner",4\n',
  '8.77,2,"Male","No","Sun","Dinner",2\n',
  '26.88,3.12,"Male","No","Sun","Dinner",4\n',
  '15.04,1.96,"Male","No","Sun","Dinner",2\n']
```

- As we can see the data is not very well presented, first line has 'columns' and other have value.
- Pandas can read the csv file and present data as **DataFrame** using **read\_csv(file\_name)** function.

```
In [3]: tips = pd.read_csv('tips.csv')
```

```
In [4]: tips.head()
```

	total_bill	tip	sex	smoker	day	time	size
0	16.99	1.01	Female	No	Sun	Dinner	2
1	10.34	1.66	Male	No	Sun	Dinner	3
2	21.01	3.5	Male	No	Sun	Dinner	3
3	23.68	3.31	Male	No	Sun	Dinner	2
4	24.59	3.61	Female	No	Sun	Dinner	4

- Now we can index it using some column if we wanted to and also apply operations.

## Computing descriptive statistics

- Pandas is very intelligent , so when we apply any function over whole dataframe it will apply the operation only on column on which it is applicable, so mean() will not applicable on columns which having strings.

```
In [7]: tips.sum()
```

```
Out[7]: total_bill           4827.77
tip                  731.58
sex      FemaleMaleMaleMaleFemaleMaleMaleMaleMaleMaleMaleMale...
smoker    NoNoNoNoNoNoNoNoNoNoNoNoNoNoNoNoNoNoNoNoNoNoNo...
day        SunSunSunSunSunSunSunSunSunSunSunSunSunSunSunSun...
time       DinnerDinnerDinnerDinnerDinnerDinnerDinnerDinn...
size                   627
dtype: object
```

- As '+' operator is applicable on all columns it does that (for string also concatenation), but **mean()** is not applicable on them, so not computed.

```
In [8]: tips.mean()
```

```
Out[8]: total_bill    19.785943
tip          2.998279
size         2.569672
dtype: float64
```

- By default axis=0 is taken, so it is taking mean along the rows (summing all rows and then cal)

```
[12]: tips.mean(axis=0)
```

```
t[12]: total_bill    19.785943
tip          2.998279
size         2.569672
dtype: float64
```

- Pandas have 'describe()' method which can be used to describe the DataFrame.

```
In [6]: tips.describe()
```

```
Out[6]:
```

	total_bill	tip	size
<b>count</b>	244.000000	244.000000	244.000000
<b>mean</b>	19.785943	2.998279	2.569672
<b>std</b>	8.902412	1.383638	0.951100
<b>min</b>	3.070000	1.000000	1.000000
<b>25%</b>	13.347500	2.000000	2.000000
<b>50%</b>	17.795000	2.900000	2.000000
<b>75%</b>	24.127500	3.562500	3.000000
<b>max</b>	50.810000	10.000000	6.000000

(as we can see it has calculated for on axis=0, along the rows, rows are totalcount, mean, std deviation, min value, max value etc.)

## Grouping data by value

- Grouping same as SQL and function is **groupby(col\_name)**
- We can apply aggregate function over the groups, as we do it SQL.

```
In [4]: tips.head()
```

```
Out[4]:
```

	total_bill	tip	sex	smoker	day	time	size
<b>0</b>	16.99	1.01	Female	No	Sun	Dinner	2
<b>1</b>	10.34	1.66	Male	No	Sun	Dinner	3

```
In [4]: tips.head()
```

Out[4]:

	total_bill	tip	sex	smoker	day	time	size
0	16.99	1.01	Female	No	Sun	Dinner	2
1	10.34	1.66	Male	No	Sun	Dinner	3
2	21.01	3.50	Male	No	Sun	Dinner	3
3	23.68	3.31	Male	No	Sun	Dinner	2
4	24.59	3.61	Female	No	Sun	Dinner	4

```
20]: tips.groupby('sex').mean()
```

Out[20]:

	total_bill	tip	size
sex			
Female	18.056897	2.833448	2.459770
Male	20.744076	3.089618	2.630573

- We can also group by multiple value(like SQL)

```
In [8]: tips.groupby(['sex', 'smoker']).mean()
```

Out[8]:

		total_bill	tip	size
sex	smoker			
Female	No	18.105185	2.773519	2.592593
	Yes	17.977879	2.931515	2.242424
Male	No	19.791237	3.113402	2.711340
	Yes	22.284500	3.051167	2.500000

- As we can see we have created a 3 dimensional **data cube**.

## Creating pivot tables

- Pivoting table are table which are made from same data but in different form.

### Pivot tables

The function `pandas.pivot_table` can be used to create spreadsheet-style pivot tables. See the cookbook for some advanced strategies

```
In [5]: df
```

Out[5]:

```
   City Province  Sales
0  Toronto      ON    13
1  Montreal     QC     6
2 Vancouver    BC    16
3  Calgary      AL     8
4 Edmonton     AL     4
5  Winnipeg    MN     3
6   Windsor      ON     1
```

```
pd.pivot_table(df, values=['Sales'], index=['Province'], columns=['City'], aggfunc=np.sum, margins=True)
```

- This is also the default order.
- **Sum** is needed for **value='Sales'** , **rows/label/index** will be 'Province' and **Column** will be 'City' , function is sum and Margin is given.

OUTPUT -

```
In [9]: table
```

```
Out[9]:
```

	Sales								
Province	City	Calgary	Edmonton	Montreal	Toronto	Vancouver	Windsor	Winnipeg	All
AL		8.0	4.0	NaN	NaN	NaN	NaN	NaN	12.0
BC		NaN	NaN	NaN	NaN	16.0	NaN	NaN	16.0
MN		NaN	NaN	NaN	NaN	NaN	NaN	3.0	3.0
ON		NaN	NaN	NaN	13.0	NaN	1.0	NaN	14.0
QC		NaN	NaN	6.0	NaN	NaN	NaN	NaN	6.0
All		8.0	4.0	6.0	13.0	16.0	1.0	3.0	51.0

- **data:** A DataFrame object
- **values:** a column or a list of columns to aggregate
- **index:** a column, Grouper, array which has the same length as data, or list of them. Keys to group by on the pivot table index. If an array is passed, it is being used as the same manner as column values.
- **columns:** a column, Grouper, array which has the same length as data, or list of them. Keys to group by on the pivot table column. If an array is passed, it is being used as the same manner as column values.
- **aggfunc:** function to use for aggregation, defaulting to `numpy.mean`
  - **fill\_value:** provides the value if value is not found.(by default NaN)

- Values are the columns whose value will be printed.

Example - 2

```
In [3]: tips = pd.read_csv('tips.csv')
```

```
In [4]: tips.head()
```

```
Out[4]:
```

	total_bill	tip	sex	smoker	day	time	size
0	16.99	1.01	Female	No	Sun	Dinner	2
1	10.34	1.66	Male	No	Sun	Dinner	3
2	21.01	3.50	Male	No	Sun	Dinner	3
3	23.68	3.31	Male	No	Sun	Dinner	2
4	24.59	3.61	Female	No	Sun	Dinner	4

```
In [25]: pd.pivot_table(tips,'total_bill','sex','smoker')
```

```
Out[25]:
```

smoker	No	Yes
sex		
Female	18.105185	17.977879
Male	19.791237	22.284500

- Value of total\_bill(by default numpy.mean will come), and '**index is sex**' and '**col is smoker flag**' , offcourse we can also provide lists if we want to give more than 1.

```
pd.pivot_table(tips,'total_bill',[ 'sex','smoker'],[ 'day','time'])
```

	day	Fri		Sat	Sun	Thur	
	time	Dinner	Lunch	Dinner	Dinner	Dinner	Lunch
sex	smoker						
Female	No	22.750	15.980000	19.003846	20.824286	18.78	15.899167
	Yes	12.200	13.260000	20.266667	16.540000	NaN	19.218571
Male	No	17.475	NaN	19.929063	20.403256	NaN	18.486500
	Yes	25.892	11.386667	21.837778	26.141333	NaN	19.171000